## Logic-Based Natural Language Processing Winter Semester 2020/21

Lecture Notes

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#### Preface

#### This Document

This document contains the course notes for the course "Logic-Based Natural Language Processing" (Logik-Basierte Sprachverarbeitung) held at FAU Erlangen-Nürnberg in the Winter Semesters 2017/18 ff.

This course is a one-semester introductory course that provides an overview over logic-based semantics of natural language. It follows the "method of fragments" introduced by Richard Montague, and builds a sequence of fragments of English with increasing coverage and a sequence of logics that serve as target representation formats. The course can be seen as both a course on semantics and as a course on applied logics.

As this course is predominantly about modeling natural language and not about the theoretical aspects of the logics themselves, we give the discussion about these as a "suggested readings" section part in . This material can safely be skipped (thus it is in the appendix), but contains the missing parts of the "bridge" from logical forms to truth conditions and textual entailment.

Contents: The document mixes the slides presented in class with comments of the instructor to give students a more complete background reference.

Caveat: This document is made available for the students of this course only. It is still an early draft, and will develop over the course of the course. It will be developed further in coming academic years.

Licensing:

This document is licensed under a Creative Commons license that requires attribution, forbids commercial use, and allows derivative works as long as these are licensed under the same license. Knowledge Representation Experiment:

This document is also an experiment in knowledge representation. Under the hood, it uses the  $ST_EX$  package [Koh08; Koh21], a  $T_EX/IAT_EX$  extension for semantic markup, which allows to export the contents into active documents that adapt to the reader and can be instrumented with services based on the explicitly represented meaning of the documents.

Comments: Comments and extensions are always welcome, please send them to the author.

#### Acknowledgments

Materials: Some of the material in this course is based on a course "Formal Semantics of Natural Language" held by the author jointly with Prof. Mandy Simons at Carnegie Mellon University in 2001.

ComSem Students: The course is based on a series of courses "Computational Natural Language Semantics" held at Jacobs University Bremen and shares a lot of material with these. The following students have submitted corrections and suggestions to this and earlier versions of the notes: Bastian Laubner, Ceorgi Chulkov, Stefan Anca, Elena Digor, Xu He, and Frederik Schäfer.

LBS Students: The following students have submitted corrections and suggestions to this and earlier versions of the notes: Maximilian Lattka, Frederik Schaefer, Navid Roux.

#### Recorded Syllabus for WS 2020/21

In this document, we record the progress of the course in the winter semester 2020/21 in the form of a "recorded syllabus", i.e. a syllabus that is created after the fact rather than before. Recorded Syllabus Winter Semester 2020/21:

#	date	type	what		slide	page
TT	1 1	1 1		41		1 1

Here the syllabus of the Winter Semester 2020/21 for reference, the current year should be similar. Recorded Syllabus Winter Semester 2020/21:

#	date	type	what	slide	page
1	3. Nov	Lec.	Admin, NL Processing		
2	5. Nov	Lec.	Language Philosophy, Examples		
3	Nov 10.	Lec.	Epistemology, Examples		
4	Nov 12.	Lec.	Method of Fragments, Fragment 1		
5	Nov 17.	Lab	GF for Fragment1		
6	Nov. 19.	Lab	Formalizing PLNQ in MMT		
7	Nov. 24.	Lab	Semantics Construction by View		
8	Nov. 26.	Lab	Formalizing ND in MMT		
9	Dec. 1.	Lecture	Fragment 2 and Tableau Reasoning		
10	Dec. 3.	Lecture	Model Generation and Interpretation		
11	Dec. 8.	Lecture	Fragment 2 in FOL		
12	Dec. 10.	Lab	FOL, ND rules in MMT		
13	Dec. 15.	Lab	Derived ND rules, Church Numerals in MMT		
14	Dec. 17.	Lab	Tableau rules in MMT		
15	Dec. 22.	Lab	Fragment 3. (VPs)		
16	Jan. 7.	Lab	Fragment 4. (Type-Raising for NPs)		
17	Jan. 12.	Lecture	Higher-order logic, description, UNA		
18	Jan. 14.	Lecture/Lab	Davidsonian Semantics		
19	Jan. 19.	Lecture	Propositional Attitues & Modal Logics		
20	Jan. 21.	Lecture	Multi-Modal Logics, DRT		
21	Jan. 26.	Lecture	DRT, Tense, Dynamic Program Logic		
22	Jan. 28.	Lecture/Lab	ELPI 4 Mogen		
23	Feb. 2.	Lecture/Lab	Mogen 4 Negation		
24	Feb. 4.	Lecture/Lab	Record Calculus for Complex Objects		
25	Feb. 9.	Lecture/Lab	Record Calculus for Complex Objects		
26	Jeb. 11.	Lecture	Tense		

See also the course notes of last year available for reference at http://kwarc.info/teaching/LBS/notes-WS2021.pdf.

ii

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## Contents

	Preface	i ii
1	Administrativa	1
2	An Introduction to Natural Language Semantics         2.1       Natural Language and its Meaning         2.2       Natural Language Understanding as Engineering         2.3       A Taste of Language Philosophy         2.4       Computational Semantics as a Natural Science         2.5       Looking at Natural Language	<b>5</b> 10 13 20 22
Ι	English as a Formal Language: The Method of Fragments	<b>27</b>
3	Logic as a Tool for Modeling NL Semantics3.1The Method of Fragments3.2What is Logic?3.3Formal Systems3.4Using Logic to Model Meaning of Natural Language	<ul> <li>29</li> <li>29</li> <li>31</li> <li>32</li> <li>38</li> </ul>
4	Fragment 1         4.1       The First Fragment: Setting up the Basics	<b>41</b> 41 46
5	Fragment 1: The Grammatical Logical Framework5.1Implementing Fragment 1 in GF5.2MMT: A Modular Framework for Representing Logics and Domains5.3Implementing Fragment1 in GF and MMT5.4Implementing Natural Deduction in MMT	<b>51</b> 51 54 58 62
6	Adding Context: Pronouns and World Knowledge6.1Fragment 2: Pronouns and Anaphora6.2A Tableau Calculus for PLNQ with Free Variables6.3Tableaux and Model Generation	<b>65</b> 65 67 79
7	Pronouns and World Knowledge in First-Order Logic         7.1       First-Order Logic         7.2       First-Order Inference with Tableaux         7.3       Model Generation with Quantifiers	<b>87</b> 87 96 100

8	Fragment 3: Complex Verb Phrases         8.1       Fragment 3 (Handling Verb Phrases)         8.2       Dealing with Functions in Logic and Language         8.3       Translation for Fragment 3         8.4       Simply Typed λ-Calculus	<b>103</b> 103 104 107 109
9	Fragment 4: Noun Phrases and Quantification         9.1       Overview/Summary so far         9.2       Fragment 4         9.3       Inference for Fragment 4         9.4       Davidsonian Semantics: Treating Verb Modifiers	$\begin{array}{c} 114 \\ 117 \end{array}$
Π	Topics in Semantics	127
10	<b>Dynamic Approaches to NL Semantics</b> 10.1 Discourse Representation Theory         10.2 Dynamic Model Generation	
11	Propositional Attitudes and Modalities         11.1 Introduction	150
12	2 Some Issues in the Semantics of Tense	157
II	I Conclusion	163
II IV		163 $175$
IV		<b>175</b> <b>179</b> 179 180
IV A	V Excursions         Properties of Propositional Tableaux         A.1 Soundness and Termination of Tableaux         A.2 Abstract Consistency and Model Existence	<b>175</b> <b>179</b> 179 180
IV A B	V Excursions         Properties of Propositional Tableaux         A.1 Soundness and Termination of Tableaux         A.2 Abstract Consistency and Model Existence         A.3 A Completeness Proof for Propositional Tableaux	<b>175</b> <b>179</b> 179 180 186
IV A B C	V Excursions         Properties of Propositional Tableaux         A.1 Soundness and Termination of Tableaux         A.2 Abstract Consistency and Model Existence         A.3 A Completeness Proof for Propositional Tableaux         First-Order Unification	175 179 179 180 186 189 195 199 206

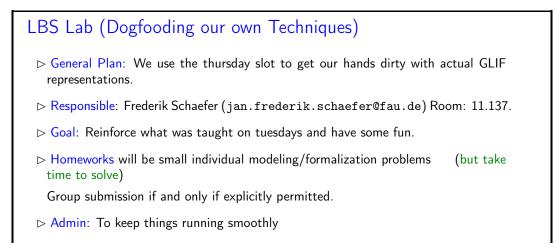
iv

# Chapter 1

## Administrativa

We will now go through the ground rules for the course. This is a kind of a social contract between the instructor and the students. Both have to keep their side of the deal to make the acquaintance with research in natural language semantics as efficient and painless as possible.

Prerequisit	es			
I will presuppose: the mandatory CS courses from Semester 1-4, in particular: (or equivalent)				
	"Grundlagen der Logik in der Informat hms and data structures	ik" (GLOI	N)	
$\triangleright$ The follow	ring will help:		(we recap if necessary)	
⊳ AI-1			(symbolic AI)	
⊳ Ontolo	gies in the Semantic Web		(INF8)	
⊳ Key Ingree	lients: Motivation, interest, curiosity, h	ard work	(LBS is non-trivial)	
⊳ You ca	n do this course if you want!		(and we will help you)	
CO Some frightis reserved	©: MichaelKohlhase	1		



▷ Homeworks will be posted on course forum. (discussed in the lab)			
⊳ No ''submi	ssion", but open development on a git rep	os. (details follow)	
⊳ Homework Di	scipline:		
⊳ start early	(many assignments need more	e than one evening's work)	
⊳ Don't star	t by sitting at a blank screen!		
⊳ Humans w	ill be trying to understand the text/code/	math when grading it.	
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Now we come to a topic that is always interesting to the students: the grading scheme.

Grades			
⊳ Academic Asse	essment: two parts	(Portfoli	o Assessment)
⊳ 20-30 min	oral exam at the end of the semes	ster	(50%)
$\triangleright$ results of the LBS lab		(50%)	
ho If you have a l	better suggestion, then I will prob	ably be happy with t	that as well.
CC Somerichtisteserved	©: MichaelKohlhase	3	

Actually, I do not really care what the grading scheme is, and so it is open to discussion. For all I care we would not have grades at all; but students need them to graduate. Generally, I would like to spend as little time as possible on the grades admin, to the extent that I can give grades without going to jail or blushing too much.

Textbook, Handouts and Information, Forums				
No) Textbook: Course notes at http://kwarc.info/teaching/LBS				
▷ I mostly prepare them as we go along (semantically preloaded ~> research resource)				
▷ Please e-mail me any errors/shortcomings you notice.	(improve for group)			
▷ For GLIF: Frederik's Master's Thesis [Sch20]				
▷ Classical Semantics/Pragmatics:	(in the FAU Library)			
<ul> <li>▷ Primary reference for LBS: [CKG09]</li> <li>▷ also: [HHS07; Bir13; Rie10; ZS13; Sta14; Sae03; Por0 Ari10]</li> </ul>	(in the FAU Library) 4; Kea11; Jac83; Cru11;			
▷ Computational Sematics: [BB05; EU10]				
Course Forum: on StudOn: https://www.studon.fau for	1.de/cat1664468.html			
$\triangleright$ announcements, homeworks, questions				
$\triangleright$ discussion among your fellow students				

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Next we come to a special project that is going on in parallel to teaching the course. I am using the course materials as a research object as well. This gives you an additional resource, but may affect the shape of the course materials (which now serve double purpose). Of course I can use all the help on the research project I can get, so please give me feedback, report errors and shortcomings, and suggest improvements.

Experiment: E-Learning with KWARC Technologies					
ightarrow My research area: deep r	ho My research area: deep representation formats for (mathematical) knowledge				
▷ Application: E-learning s	ystems (repr	esent knowledge	to transport it)		
$\triangleright$ Experiment: Start with t	his course	(Drink my	/ own medicine)		
▷ Re-Represent the slide	e materials in OMDoc (O	pen Math Docur	ments)		
▷ (Eventually) feed it in	to the MathHub system	(http://1	mathhub.info)		
▷ Try it on you all (to get feedback from you)					
▷ Tasks (Unfortunately, I cannot pay you for this; maybe later)			is; maybe later)		
▷ help me complete the material on the slides (what is missing/would help?)					
$\triangleright$ I need to remember "	what I say", examples on	the board.	(take notes)		
$\triangleright$ Benefits for you		(so why sh	iould you help?)		
▷ you will be mentioned in the acknowledgements (for all that is worth)					
⊳ you will help build be	tter course materials	(think of next-	year's students)		
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CHAPTER 1. ADMINISTRATIVA

## Chapter 2

## An Introduction to Natural Language Semantics

In this Chapter we will introduce the topic of this course and situate it in the larger field of natural language understanding. But before we do that, let us briefly step back and marvel at the wonders of natural language, perhaps one of the most human of abilities.

Fascination of (Natural) Language			
Definition A natural language is any form of spoken or signed means communication that has evolved naturally in humans through use and repetition without conscious planning or premeditation.			
$ ho$ In other words: the language you use all day long, e.g. English, German, $\ldots$			
▷ Why Should we care about natural language?:			
⊳ Even more so than thinking, language is a sl	kill that only humans	s have.	
It is a miracle that we can express complex thoughts in a sentence in a matter of seconds.			
It is no less miraculous that a child can learn complex grammar in a matter of a few years		of words and a	
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With this in mind, we will embark on the intellectual journey of building artificial systems that can process (and possibly understand) natural language as well.

#### 2.1 Natural Language and its Meaning

Before we embark on the journey into understanding the meaning of natural language, let us get an overview over what the concept of "semantics" or "meaning" means in various disciplines.

What is Natural Language Semantics? A Difficult Question!
▷ Question: What is "Natural Language Semantics"?
▷ Definition Semantics is the study of reference, meaning, or truth.

7

- ▷ Reference is a relationship between objects in which one object (the name) designates, or acts as a means by which to connect to or link to, another object (the referent).
- Meaning is a relationship between signs and the objects they intend, express, or signify.
- ▷ Truth is the property of being in accord with fact or reality. Truth is typically ascribed to things that aim to represent reality or otherwise correspond to it, such as beliefs, propositions, and declarative sentences.
- ▷ Definition For natural language semantics, the signs are usually utterances and names are usually phrases.
- $\triangleright$  That is all very abstract and general, can we make this more concrete?
- ▷ Different (academic) disciplines find different concretizations.

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What is (NL) Semantics? Answers from various Disciplines!				
<ul> <li>Observation: Different (academic) disciplines specialize the notion of nlssemantics (of natural language) in different ways.</li> </ul>				
$\triangleright$ Philosophy: has a long history of trying to answer it, e.g.				
$ ightarrow$ Platon $\sim$ cave allegory, Aristotle $\sim$ Syllogisms.				
$\succ Frege/Russell \rightsquigarrow sense vs. referent. \tag{Michael Kohlhase vs. Odysseus}$				
<ul> <li>Linguistics/Language Philosophy: We need semantics e.g. in translation</li> <li>Der Geist ist willig aber das Fleisch ist schwach! vs.</li> <li>Der Schnaps ist gut, aber der Braten ist verkocht! (meaning counts)</li> </ul>				
$ ightarrow Psychology/Cognition:$ Semantics $\hat{=}$ "what is in our brains" ( $\sim$ mental models)				
$\triangleright$ Mathematics has driven much of modern logic in the quest for foundations.				
▷ Logic as "foundation of mathematics" solved as far as possible				
▷ In daily practice syntax and semantics are not differentiated (much).				
ho Logic@AI/CS tries to define meaning and compute with them. (applied semantics)				
▷ makes syntax explicit in a formal language (formulae, sentences)				
$\triangleright$ defines truth/validity by mapping sentences into "world" (interpretation)				
▷ gives rules of truth-preserving reasoning (inference)				
Image: State of the s				

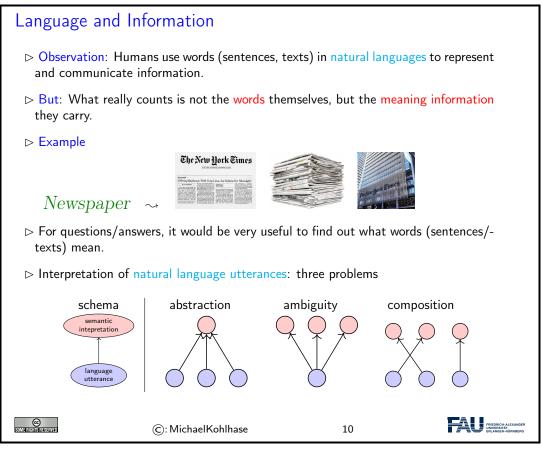
A good probe into the issues involved in natural language understanding is to look at translations between natural language utterances – a task that arguably involves understanding the utterances first.

Meaning of Natural Language; e.g. Machine Translation

#### 2.1. NATURAL LANGUAGE AND ITS MEANING

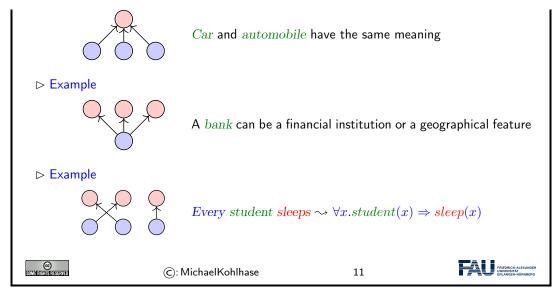
⊳ Idea: Machine Tra	nslation is very simple!	(we ha	ve good lexica)
⊳ Example Peter lie	bt Maria. $\rightsquigarrow$ Peter loves M	ary.	
⊳ \land this only works	for simple examples!		
▷ Example Wirf der the fence.	Kuh das Heu über den Zau (dif	n. ≁Throw the co fering grammar; Go	-
⊳ Example 🛕 Gram	mar is not the only problem		
⊳ Der Geist ist w	villig, aber das Fleisch ist sc	hwach!	
⊳ Der Schnaps is	t gut, aber der Braten ist v	erkocht!	
▷ Assertion We have	e to understand the meaning	for high-quality trai	nslation!
COMPERIMENTS RESERVED	©: MichaelKohlhase	9	FRIEDRICH-ALEXANDER UNIVERTITATO ERLANDER-NORNBERG

If it is indeed the meaning of natural language, we should look further into how the form of the utterances and their meaning interact.

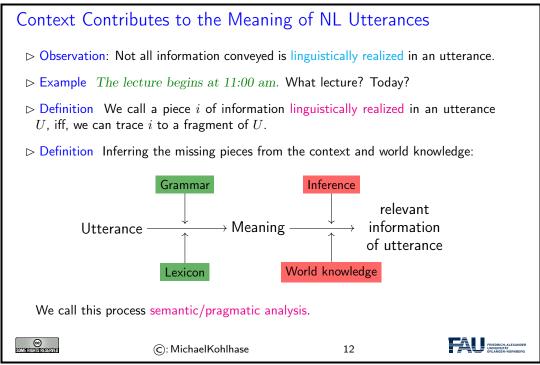


Let us support the last claim a couple of initial examples. We will come back to these phenomena again and again over the course of the course and study them in detail.

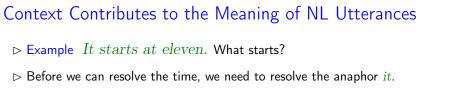
Language and Information (Examples)  $\triangleright$  Example



But there are other phenomena that we need to take into account when compute the meaning of NL utterances.

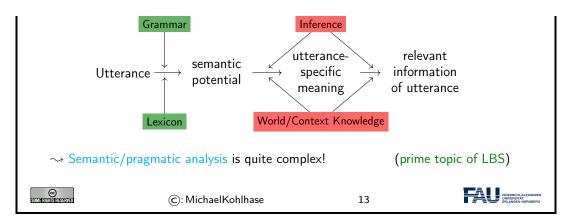


We will look at another example, that shows that the situation with semantic/pragmatic analysis is even more complex than we thought. Understanding this is one of the prime objectives of the LBS lecture.

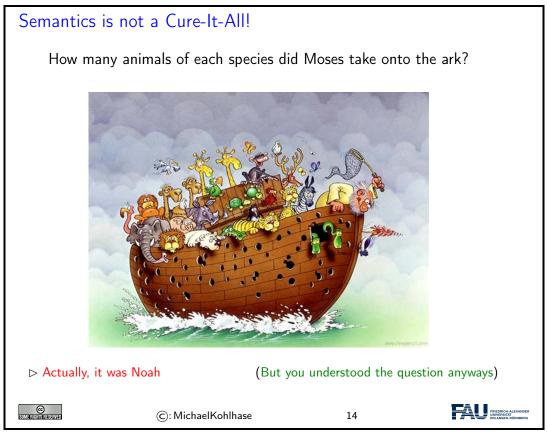


▷ Possible Mechanism: More Inference!

#### 2.1. NATURAL LANGUAGE AND ITS MEANING



is also a very good example for the claim made above that even for high-quality (machine) translation we need semantics. We end this very high-level introduction with a caveat.



#### But Semantics works in some cases

- $\triangleright$  The only thing that currently really helps is a restricted domain:
  - $\triangleright$  I. e. a restricted vocabulary and world model.
- > Demo: DBPedia http://dbpedia.org/snorql/

Query: Soccer players, who are born in a country with more than 10 million inhabitants, who played as goalkeeper for a club that has a stadium with more than 30.000 seats and the club country is different from the birth country

		vorks in some	Cases om a SPARQL Quer		
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	<i>/</i> •	tod by DDDodie fr	AMA COADOL OUAR		
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	(			<i>」</i>	
_					
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	lesults: Browse 🗘 Go!	Reset			
S	PARQL results:				
- 10	soccerplayer	countryOfBirth	team	countryOfTeam	stadiumcapacity
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1	Airton_Moraes_Michellon 🗗	:Brazil 🛃	:FC_Red_Bull_Salzburg	:Austria 🚱	31000
- 1	Alain_Gouaméné 🗗	:lvory_Coast 🚱	:Raja_Casablanca	:Morocco 🖉	67000
- 1	Allan_McGregor 🖉	:United_Kingdom	:Beşiktaş_J.K. 🗗	:Turkey 🗗	41903
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:	Brahim_Zaari 🗗	:Netherlands	:Raja_Casablanca 🗗	:Morocco 🗗	67000
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Even if we can get a perfect grasp of the semantics (aka. meaning) of NL utterances, their structure and context dependency – we will try this in this lecture, but of course fail, since the issues are much too involved and complex for just one lecture – then we still cannot account for all the human mind does with language. But there is hope, for limited and well-understood domains, we can to amazing things. This is what this course tries to show, both in theory as well as in practice.

#### Natural Language Understanding as Engineering 2.2

Even though this course concentrates on computational aspects of natural language semantics, it is useful to see it in the context of the field of natural language processing.

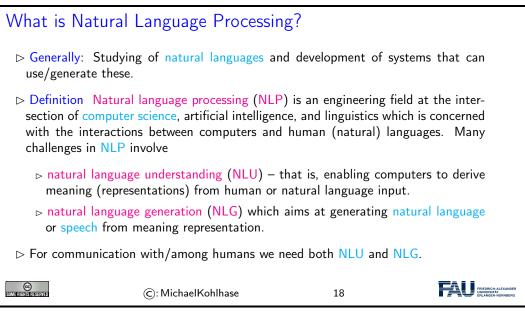
- Language Technology

  Language Assistance:
  written language: Spell/grammar/style-checking,
  - ▷ spoken language: dictation systems and screen readers,

#### 2.2. NATURAL LANGUAGE UNDERSTANDING AS ENGINEERING

⊳ multilingı	ual text: machine-supported text an	d dialog translation, e	eLearning.
$\triangleright$ Information	management:		
	d classification of documents, on extraction, question answering.		Google/Bing) ://ask.com)
⊳ Dialog Syste	ms/Interfaces:		
	on systems: at airport, tele-banking erfaces for computers, robots, cars.		nters, 5. Siri/Alexa)
	The earlier technologies largely re compute the meaning of the input ut n systems.		0
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The general context of LBS is natural language processing (NLP), and in particular natural language understanding (NLU) The dual side of NLU: natural language generation (NLG) requires similar foundations, but different techniques is less relevant for the purposes of this course.

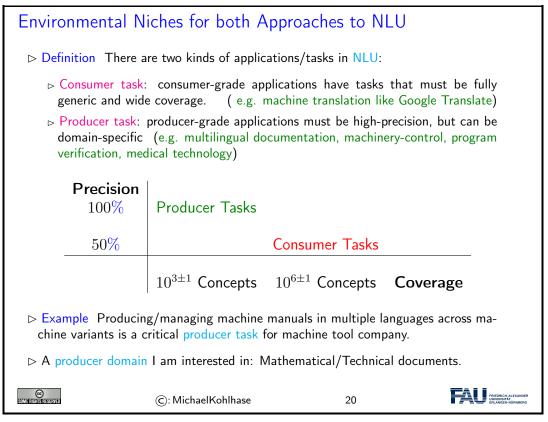


#### What is the State of the Art In NLU?

 $\triangleright$  Two avenues of attack for the problem: knowledge-based and statistical techniques (they are complementary)

Deep	Knowledge-based We are here	Not there yet cooperation?	
Shallow	no-one wants this	Statistical Methods applications	
$igsquiring$ Analysis $\uparrow$ VS. Coverage $ ightarrow$	narrow	wide	-
▷ We will cover foundation of deep and shallow ones		cessing in the course and a	a mixture
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On the last slide we have classified the two main approaches to NLU. In the last 10 years the community has almost entirely concentrated on statistical- and machine-learning based methods, because that has led to applications like google translate, Siri, and the likes. We will now borrow an argument by Aarne Ranta to show that there are (still) interesting applications for knowledge-based methods in NLP, even if they are less visible.



An example of a producer task – indeed this is where the name comes from – is the case of a machine tool manufacturer T, which produces digitally programmed machine tools worth multiple million Euro and sells them into dozens of countries. Thus T must also comprehensive machine operation manuals, a non-trivial undertaking, since no two machines are identical and they must be translated into many languages, leading to hundreds of documents. As those manual share a lot of semantic content, their management should be supported by NLP techniques. It is critical

#### 2.3. A TASTE OF LANGUAGE PHILOSOPHY

that these NLP maintain a high precision, operation errors can easily lead to very costly machine damage and loss of production. On the other hand, the domain of these manuals is quite restricted. A machine tool has a couple of hundred components only that can be described by a comple of thousand attribute only.

Indeed companies like T employ high-precision NLP techniques like the ones we will cover in this course successfully; they are just not so much in the public eye as the consumer tasks.

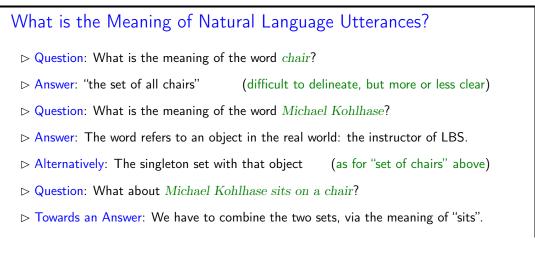
NLP for NLU: The Waterfall Model
The NLU Waterfall: Understanding natural language (but also generation: other way around)
0) speech processing: acoustic signal $\sim$ word hypothesis graph
1) syntactic processing: word sequence $\rightsquigarrow$ phrase structure
2) semantics construction: phrase structure $\rightsquigarrow$ (quasi-)logical form
<ol> <li>semantic pragmatic analysis:</li> <li>(quasi-)logical form → knowledge representation</li> </ol>
4) problem solving: using the generated knowledge (application-specific)
$\triangleright$ In this course: steps 1), 2) and 3).
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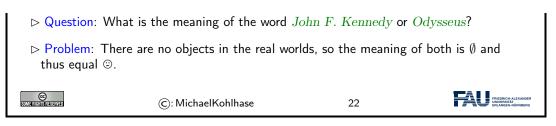
The waterfall model shown above is of course only an engineering-centric model of natural language understanding and not to be confused with a cognitive model; i.e. an account of what happens in human cognition. Indeed, there is a lot of evidence that this simple sequential processing model is not adequate, but it is the simplest one to implement and can therefore serve as a background reference to situating the processes we are interested in.

#### 2.3 A Taste of Language Philosophy

We will now discuss some concerns from language philosophy as they pertain to the LBS course. Note that this discussion is only intended to give our discussion on natural language semantics some perspective; in particular, it is in no way a complete introduction to language philosophy, or does the discussion there full justice.

We start out our tour through language philosophy with some examples - as linguists and philosophers often to - to obtain an intuition of the phenomena we want to understand.





The main intuition we get is that meaning is more complicated than we may hav thought in the beginning.

#### 2.3.1 Epistemology: The Philosphy of Science

We start out by looking at the foundations of epistemology, which sets the basis for modern (empirical) science. Our presentation here is modeled on Karl Popper's work on the theory of science. Naturally, our account here is simplified to fit the occasion, see [Pop34; Pop59] for the full story.

Note that like any foundational account of complex concepts like knowledge, belief, rationality, and their justification, we have to base our philosophy on some concepts we take at face value. Here these are natural and formal languages, worlds, situations, etc. which will stay very general in the current foundational setting.

We will later instantiate these by more concrete notions as we go along in the LBS course.

Epistemology – Propositions & Observations
Definition Epistemology is the branch of philosophy concerned with studying nature of knowledge, its justification, the rationality of belief, and various related issues.
Definition A proposition is a sentence about the actual world or a class of worlds deemed possible in a natural or formal language whose meaning can be expressed as being true or false in a specific world.
$\triangleright$ Definition A belief is a proposition $\varphi$ that an agent $a$ holds true about a class of worlds. This is a characterizing feature of the agent.
▷ Definition Knowledge is justified, true belief.
▷ Problem: How can an agent justify a belief to obtain knowledge.
$\triangleright$ Definition Given a world $w$ , the observed value (or just value, i.e. true or false) of a proposition (in $w$ ) can be determined by observations, that is an agent, the observer, either experiences that $\varphi$ is true in $w$ or conducts a deliberate, systematic experiment that determines $\varphi$ to be true in $w$ .
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The crucial intuition here is that we express belief – and possibly knowledge – about the world using language. But we can only access truth in the word by observation, a possibly flawed operation. So we will never be able to ascertain the "true belief" part, and need to work all the harder on the "justified" part.



#### 2.3. A TASTE OF LANGUAGE PHILOSOPHY

$\triangleright$ Idea: Repeat the o	bservations to raise the pro	bability of getting the	em right.
	servation $\varphi$ is said to be n different situations.	reproducible, iff $arphi$ c	an observed by
Definition A phenotype true in a class of we	omenon $\varphi$ is a proposition to orld.	that is reproducibly o	bservable to be
	d like to <mark>verify</mark> a phenomer es are too large to make th		
$\triangleright$ Definition A situat false in $w$ .	tion $w$ is a counterexample $f$	to a proposition $\varphi$ , if	arphi is observably
Intuition: The absorbed for accepting phenomenants.	ence of counterexamples is mena.	the best we can hop	e for in general
⊳ Intuition: The pher	nomena constitute the the '	'world model'' of an a	agent.
▷ Problem: It is imposed by the problem of the	ossible/inefficient (for an ag	gent) to know all phe	nomena.
Idea: An agent con all phenomena can	uld retain only a small subs be derived.	set of known proposi	tions, from this
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We will pursue this last idea. The (small) subset of propositions from which the phenomena that are relevant to an agent can be derived will become the beliefs of the agent. An agent will make strive to justify these beliefs to succeed in the world. This is where our notion of knowledge comes from.

Epistemology – Explanations & Hypotheses
$\triangleright$ Definition A proposition $\psi$ follows from a proposition $\varphi$ , iff $\psi$ is true in any world where $\varphi$ is.
$\triangleright$ Definition An explanation of a phenomenon $\varphi$ is a set $\Phi$ of propositions, such that $\varphi$ follows from $\Phi$ .
$\triangleright$ Example $\{\varphi\}$ is a (rather useless) explanation for $\varphi$ .
$\triangleright$ Intuition: We prefer explanations $\Phi$ that explain more than just $\varphi$ .
$eq:observation: This often coincides with explanations that are in some sense "simpler" or "more elementary" than \varphi. (\rightsquigarrow Occam's razor)$
▷ Definition A proposition is called falsifiable, iff counterexamples are theoretically possible and the observation of a reproducible series of counterexample is practically feasible.
Definition A hypothesis is a proposed explanation of a phenomenon that is falsifi- able.
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We insist that a hypothesis be falsifiable, because we cannot hope to verify it and indeed the absence of counterexamples is the best we can hope for. But if finding counterexamples is hopeless, it is not even worth bothering with a hypothesis.

This gives rise to a very natural strategy of accumulating propositions to represent (what could) knowledge about the world.

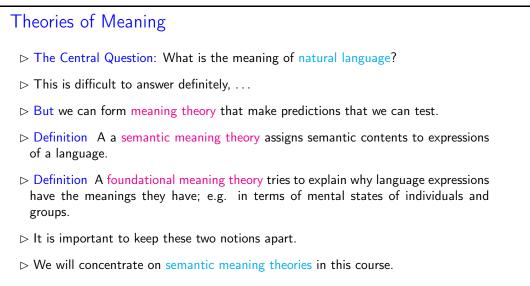
Epistemology – Scientific Theories
▷ Knowledge Strategy: Collect hypotheses about the world, drop those with coun- terexamples and those that can be explained themselves.
$\triangleright$ Definition A hypothesis $\varphi$ can be tested in world/situation $w$ by observing the value of $\varphi$ in $w$ . If the value is true, then we say that the observation $o$ supports $\varphi$ , if it is false then $o$ falsifies $\varphi$ .
$\triangleright$ Definition A (scientific) theory for a set $\Phi$ of phenomena is a set $\Theta$ of hypotheses that
$\triangleright$ has been tested extensively and rigorously without finding counterexamples, and $\triangleright$ is minimal in the sense that no subset of $\Theta$ explains $\Phi$ .
$\triangleright$ Definition We call any proposition $\varphi$ that follows from a theory $\Phi$ a prediction of $\Phi$ .
$\triangleright$ Note: To falsify a theory $\Phi$ , it is sufficient to falsify any prediction. Any observation of a prediction $\varphi$ of $\Phi$ supports $\Phi$ .
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Indeed the epistemological approach described in this Subsection has become the predominant one in modern science.

#### 2.3.2 Meaning Theories

If the meaning of natural language is indeed complicated, then we should really admit to that and instead of directly answering the question, allow for multiple opinions and embark on a regime of testing them against reality. We review some concepts from language philosophy towards that end.

We now specialize the general epistemology for natural language – the "world" we try to model empirically.



#### 2.3. A TASTE OF LANGUAGE PHILOSOPHY

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In [Spe17], an excellent survey on meaning theories, the author likens the difference between semantic and foundational theories of meaning to the differing tasks of an anthropologist trying to fully document the table manner of a distant tribe (semantic meaning theory) or to explain why the table manners evolve (foundational meaning theory).

Let us fortify our intuition about semantic meaning theories by showing one that can deal with the meaning of names we started our Subsection with.

The Meaning of Singular Terms
$\triangleright$ Let's see a semantic meaning theory in action.
Definition A singular term is a phrase that purports to denote or designate a particular individual person, place, or other object.
▷ Example Michael Kohlhase and Odysseus are singular terms.
Definition In [Fre92], Gottlob Frege distinguishes between sense (Sinn) and referent (Bedeutung) of singular terms.
$\triangleright$ Example Even though $Odysseus$ does not have a referent, it has a very real sense. (but what is a sense?)
Example The ancient greeks knew the planets Hesperos (the evening star) and Phosphoros (the morning star). These words have different senses, but the – as we now know – the same referent: the planet Venus.
Remark: Bertrand Russell views singular terms as disguised definite descriptions - Hesperos as "the brightest heavenly body that sometimes rises in the evening". Frege's sense can often be conflated with Russell's descriptions. (there can be more than one definite description)
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We think of Frege's conceptualization as a semantic meaning theory, since it assignms semantic content – the pair of sense and referent, whatever they might concretely be – to singular terms.

Cresswell's "Most Certain Principle" and Truth Conditions
▷ Problem: How can we test meaning theories in practice?
▷ Definition Cresswell's (1982) most certain principle (MCP): [Cre82]
I'm going to begin by telling you what I think is the most certain thing I think about meaning. Perhaps it's the only thing. It is this. If we have two sentences $A$ and $B$ , and $A$ is true and $B$ is false, then $A$ and $B$ do not mean the same.
▷ Definition The truth conditions of a sentence are the conditions of the world under which it is true. These conditions must be such that if all obtain, the sentence is true, and if one doesn't obtain, the sentence is false.
$\triangleright$ Observation: Meaning determines truth conditions and vice versa.

#### CHAPTER 2. AN INTRODUCTION TO NATURAL LANGUAGE SEMANTICS

In Fregean terms truth value).	the sense of a sentence	(a thought) determines its	referent (a
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Compositionality				
$\triangleright$ Definition A meaning theory $T$ is compositional, iff the meaning of an expression is a function of the meanings of its parts. We say that $T$ obeys the compositionality principle or simply compositionality if it is.				
basic expression	In order to compute the meaning of an expression, look up the meanings of the basic expressions forming it and successively compute the meanings of larger parts until a meaning for the whole expression is found.			
	order to compute the value of ( , then compute $x + y$ and $z \cdot u$ , on.			
⊳ Many philoso language too.	phers and linguists hold that co	ompositionality is at w	vork in ordinary	
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	G. Michaeli Koniniase			
	sitionality is Attractive			
Why Compos	<u> </u>			
Why Compositiona ▷ Compositiona ▷ Example [Example]	sitionality is Attractive	heory of meaning:	to [[larger [and	
<ul> <li>Why Compositiona</li> <li>▷ Compositiona</li> <li>▷ Example [Example [Example arger]] subexa</li> <li>▷ Consequences meanings of it</li> </ul>	sitionality is Attractive ality gives a nice building block t	heory of meaning: ds [that [combine [in aning of an expressio	n, look up the	
<ul> <li>Why Compositional</li> <li>▷ Compositional</li> <li>▷ Example [Example [Example]] subex</li> <li>▷ Consequence: meanings of it a meaning for</li> <li>▷ Compositional never heard be</li> </ul>	sitionality is Attractive ality gives a nice building block to pressions [are [built [from [work pressions]]]]]]] In order to compute the me ts words and successively compute	theory of meaning: ands [that [combine [in aning of an expressio ate the meanings of la asily understand sente afinite number of sent	n, look up the arger parts until ences they have	

## Compositionality and the Congruence Principle

- $\triangleright$  Given reasonable assumptions compositionality entails the
- $\triangleright$  Definition The congruence principle states that whenever A is part of B and A' means just the same as A, replacing A by A' in B will lead to a result that means just the same as B.
- ▷ Example Consider the following (complex) sentences:
  - 1. blah blah blah such and such blah blah

#### 2.3. A TASTE OF LANGUAGE PHILOSOPHY

2. blah blah so and so blah blah				
If <i>such and such</i> same too.	and $so and so$ mean the s	ame thing, then 1. ar	d 2. mean the	
▷ Conversely: if 1. and 2. do not mean the same, then <i>such</i> and <i>such</i> and <i>so</i> and <i>so</i> do not either.				
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#### A Test for Synonymity

▷ Suppose we accept the most certain principle (difference in truth conditions implies difference in meaning) and the congruence principle (replacing words by synonyms results in a synonymous utterance). Then we have a diagnostics for synonymity: Replacing utterances by synonyms preserves truth conditions, or equivalently

▷ Definition The following is called the truth conditional synonymy test:

If replacing A by B in some sentence C does not preserve truth conditions, then A and B are not synonymous.

 $\triangleright$  We can use this as a test for the question of individuation: when are the meanings of two words the same – when are they synonymous?

▷ Example The following sentences differ in truth conditions.

1. The cat is on the mat.

2. The dog is on the mat.

Hence cat and dog are not synonymous. The converse holds for

1. John is a Greek.

2. John is a Hellene.

In this case there is no difference in truth conditions.

 $\triangleright$  But there might be another context that does give a difference.

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33

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#### Contentious Cases of Synonymy Test

▷ Example The following sentences differ in truth values:

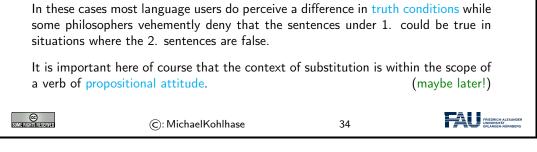
1. Mary believes that John is a Greek

2. Mary believes that John is a Hellene

So *Greek* is not synonymous to *Hellene*. The same holds in the classical example:

1. The Ancients knew that Hesperus was Hesperus

2. The Ancients knew that Hesperus was Phosphorus



A better Synonymy Test				
▷ Definition The following is called the truth conditional synonymy test:				
If replacing $A$ by $B$ in some sentence $C$ does not preserve truth conditions in a compositional part of $C$ , then $A$ and $B$ are not synonymous.				
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#### Testing Truth Conditions with Logic

▷ Definition A logical language model *M* for a natural language *L* consists of a logic *L* and a translation function *φ* from *L* sentences to *L* formulae.
 ▷ Problem: How do we find out whether *M* models *L* faithfully?

 $\triangleright$  Idea: Test truth conditions of sentences against the predictions  $\mathcal{M}$  makes.

 $\rhd$  Problem: The truth conditions for a sentence S in language L can only be formulated and verified by humans that speak L

 $\triangleright$  In practice: Truth conditions are expressed as "stories" that specify salient worlds/situations. Native speakers of L are asked to judge whether they make S true/false.

 $\triangleright$  Idea: To test a logical language model  $\mathcal{M}:=\langle L, \mathcal{L}, \varphi \rangle$ 

▷ Select a sentence S and a situation W that makes S true. (according to humans)
 ▷ Translate S in to a formula S':=φ(S) in L.

 $(\Phi \cong \text{truth conditions})$ 

- $\triangleright$  Express W as a set  $\Phi$  of  $\mathcal{L}$ -formulae.
- $\triangleright \mathcal{M}$  is supported if  $\Phi \models S'$ , falsified if  $\Phi \not\models S'$ .

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36

#### 2.4 Computational Semantics as a Natural Science

#### Overview:

Formal natural language semantics is an approach to the study of meaning in natural language which utilizes the tools of logic and model theory. Computational semantics adds to this the task of representing the role of inference in interpretation. By combining these two different approaches to the study of linguistic interpretation, we hope to expose you (the students) to the best of both worlds.

Computational Semantics as a Natural Science				
▷ In a nutshell: Logic studies formal languages, their relation with the world (in particular the truth condition). Computational logic adds the question about the computational behavior of the relevant functions of the formal languages.				
▷ This is almost the same as the task of natural language semantics!				
It is one of the key ideas that logics are good scientific models for natural languages, since they simplify certain aspects so that they can be studied in isolation. In particular, we can use the general scientific method of				
1. observing				
2. building formal theories for an aspect of reality,				
3. deriving the consequences of the assumptions about the world in the theories				
4. testing the predictions made by the model against the real-world data. If the model predicts the data, then this confirms the model, if not, we refine the model, starting the process again at 2.				
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Excursion: In natural sciences, this is established practice; e.g. astronomers observe the planets, and try to make predictions about the locations of the planets in the future. If you graph the location over time, it appears as a complicated zig-zag line that is difficult to understand. In 1609 Johannes Kepler postulated the model that the planets revolve around the sun in ellipses, where the sun is in one of the focal points. This model made it possible to predict the future whereabouts of the planets with great accuracy by relatively simple mathematical computations. Subsequent observations have confirmed this theory, since the predictions and observations match.

Later, the model was refined by Isaac Newton, by a theory of gravitation; it replaces the Keplerian assumptions about the geometry of planetary orbits by simple assumptions about gravitational forces (gravitation decreases with the inverse square of the distance) which entail the geometry.

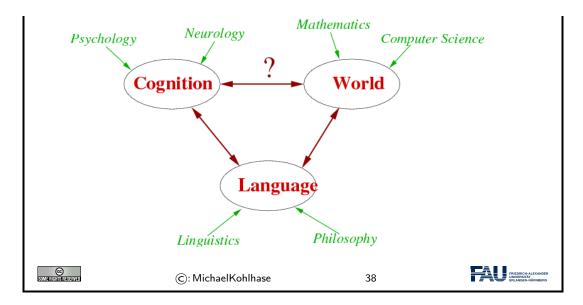
Even later, the Newtonian theory of celestial mechanics was replaced by Einstein's relativity theory, which makes better predictions for great distances and high-speed objects.

All of these theories have in common, that they build a mathematical model of the physical reality, which is simple and precise enough to compute/derive consequences of basic assumptions, that can be tested against observations to validate or falsify the model/theory.

The study of natural language (and of course its meaning) is more complex than natural sciences, where we only observe objects that exist independently of ourselves as observers. Language is an inherently human activity, and deeply interdependent with human cognition (it is arguably one of its motors and means of expression). On the other hand, language is used to communicate about phenomena in the world around us, the world in us, and about hypothetical worlds we only imagine.

Therefore, natural language semantics must necessarily be an intersective discipline and a trans-disciplinary endeavour, combining methods, results and insights from various disciplines.

NL Semantics as an Intersective Discipline



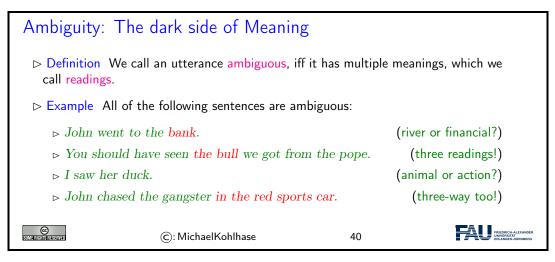
#### 2.5 Looking at Natural Language

The next step will be to make some observations about natural language and its meaning, so that we get and intuition of what problems we will have to overcome on the way to modeling natural language.

Fun with Diamonds (are they real?) [Dav67b]				
▷ Example We study the truth conditions of adjectival complexes:				
$\triangleright$ This is a diamond. ( $\models$ diamond)				
$\triangleright$ This is a	a <mark>blue</mark> diamond.	(⊨ dian	$mond$ , $\models blue$ )	
$\triangleright$ This is a	a <mark>big</mark> diamond.	( $\models$ dia	amond, $\not\models big$ )	
$\triangleright$ This is a	a <mark>fake</mark> diamond.	(	$\models \neg diamond$ )	
$\triangleright$ This is a	a <mark>fake blue</mark> diamond.	( $\models$ blue?,	$\models diamond?)$	
⊳ Mary ki	nows that this is a diamond.		( $\models$ diamond)	
⊳ Mary be	elieves that this is a diamond.		( $\not\models diamond$ )	
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Logical analysis vs. conceptual analysis: These examples — mostly borrowed from Davidson:tam67 — help us to see the difference between "'logical-analysis' and "'conceptual-analysis'.

We observed that from *This is a big diamond*. we cannot conclude *This is big*. Now consider the sentence *Jane is a beautiful dancer*. Similarly, it does not follow from this that Jane is beautiful, but only that she dances beautifully. Now, what it is to be beautiful or to be a beautiful dancer is a complicated matter. To say what these things are is a problem of conceptual analysis. The job of semantics is to uncover the logical form of these sentences. Semantics should tell us that the two sentences have the same logical forms; and ensure that these logical forms make the right predictions about the entailments and truth conditions of the sentences, specifically, that they don't entail that the object is big or that Jane is beautiful. But our semantics should provide a distinct logical form for sentences of the type: *This is a fake diamond*. From which it follows that the thing is fake, but not that it is a diamond.

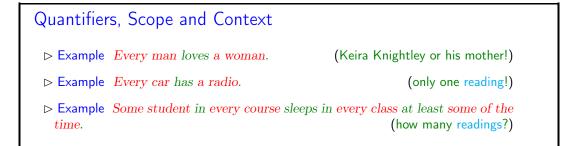


One way to think about the examples of ambiguity on the previous slide is that they illustrate a certain kind of indeterminacy in sentence meaning. But really what is indeterminate here is what sentence is represented by the physical realization (the written sentence or the phonetic string). The symbol *duck* just happens to be associated with two different things, the noun and the verb. Figuring out how to interpret the sentence is a matter of deciding which item to select. Similarly for the syntactic ambiguity represented by PP attachment. Once you, as interpreter, have selected one of the options, the interpretation is actually fixed. (This doesn't mean, by the way, that as an interpreter you necessarily do select a particular one of the options, just that you can.) A brief digression: Notice that this discussion is in part a discussion about compositionality, and gives us an idea of what a non-compositional account of meaning could look like. The Radical Pragmatic View is a non-compositional view: it allows the information content of a sentence to be fixed by something that has no linguistic reflex.

To help clarify what is meant by compositionality, let me just mention a couple of other ways in which a semantic account could fail to be compositional.

- Suppose your syntactic theory tells you that S has the structure [a[bc]] but your semantics computes the meaning of S by first combining the meanings of a and b and then combining the result with the meaning of c. This is non-compositional.
- Recall the difference between:
  - 1. Jane knows that George was late.
  - 2. Jane believes that George was late.

Sentence 1. entails that George was late; sentence 2. doesn't. We might try to account for this by saying that in the environment of the verb *believe*, a clause doesn't mean what it usually means, but something else instead. Then the clause *that George was late* is assumed to contribute different things to the informational content of different sentences. This is a non-compositional account.



▷ Example 2000?)	The president of the US is having a	n affair with an intern.	(2002 or
⊳ Example	Everyone is here.	(who is e	veryone?)
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Observation: If we look at the first sentence, then we see that it has two readings:

- 1. there is one woman who is loved by every man.
- 2. for each man there is one woman whom that man loves.

These correspond to distinct situations (or possible worlds) that make the sentence true.

Observation: For the second example we only get one reading: the analogue of 2. The reason for this lies not in the logical structure of the sentence, but in concepts involved. We interpret the meaning of the word has as the relation "has as physical part", which in our world carries a certain uniqueness condition: If a is a physical part of b, then it cannot be a physical part of c, unless b is a physical part of c or vice versa. This makes the structurally possible analogue to 1. impossible in our world and we discard it.

Observation: In the examples above, we have seen that (in the worst case), we can have one reading for every ordering of the quantificational phrases in the sentence. So, in the third example, we have four of them, we would get 4! = 12 readings. It should be clear from introspection that we (humans) do not entertain 12 readings when we understand and process this sentence. Our models should account for such effects as well.

Context and Interpretation: It appears that the last two sentences have different informational content on different occasions of use. Suppose I say *Everyone is here.* at the beginning of class. Then I mean that everyone who is meant to be in the class is here. Suppose I say it later in the day at a meeting; then I mean that everyone who is meant to be at the meeting is here. What shall we say about this? Here are three different kinds of solution:

- **Radical Semantic View** On every occasion of use, the sentence literally means that everyone in the world is here, and so is strictly speaking false. An interpreter recognizes that the speaker has said something false, and uses general principles to figure out what the speaker actually meant.
- **Radical Pragmatic View** What the semantics provides is in some sense incomplete. What the sentence means is determined in part by the context of utterance and the speaker's intentions. The differences in meaning are entirely due to extra-linguistic facts which have no linguistic reflex.
- The Intermediate View The logical form of sentences with the quantifier every contains a slot for information which is contributed by the context. So extra-linguistic information is required to fix the meaning; but the contribution of this information is mediated by linguistic form.

More Context: Anaphora	
$\triangleright$ John is a bachelor. His wife is very nice.	(Uh, what?, who?)
$\triangleright$ John likes his dog Spiff even though he bites	him sometimes. (who bites?)
$\triangleright$ John likes Spiff. Peter does too.	(what to does Peter do?)
$\triangleright$ John loves his wife. Peter does too.	(whom does Peter love?)
$\triangleright$ John loves golf, and Mary too.	(who does what?)

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Context is I	<sup>D</sup> ersonal and keeps chang	ing		
⊳ The <mark>king o</mark>	f America is rich.		(true or false?)	
$\triangleright$ The king o	f America isn't rich.		(false or true?)	
⊳ If America	had a king, the king of America	would be rich.	(true or false!)	
$\triangleright$ The king o	f <mark>Buganda</mark> is rich.	(Wh	ere is Buganda?)	
▷Joe Smith The CEO of Westinghouse announced budget cuts. (CEO=J.S.!)				
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## Part I

## English as a Formal Language: The Method of Fragments

### Chapter 3

## Logic as a Tool for Modeling NL Semantics

In this Chapter we will briefly introduce formal logic and motivate how we will use it as a tool for developing precise theories about natural language semantics.

We want to build a compositional, semantic meaning theory based on truth conditions, so that we can directly model the truth conditional synonymy test. We will see how this works in detail in after we have recapped the necessary concepts about logic.

#### 3.1 The Method of Fragments

We will proceed by the "method of fragments", introduced by Richard Montague in [Mon70], where he insists on specifying a complete syntax and semantics for a specified subset ("fragment") of a language, rather than writing rules for the a single construction while making implicit assumptions about the rest of the grammar. [Mon70]

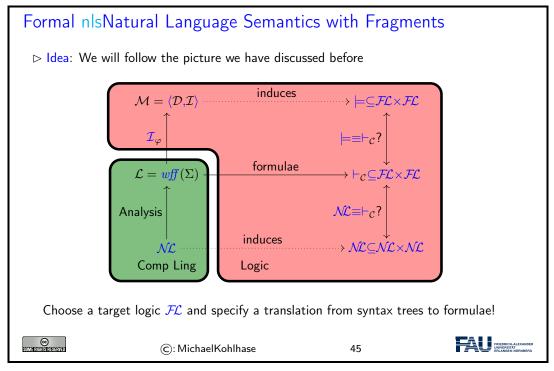
In the present paper I shall accordingly present a precise treatment, culminating in a theory of truth, of a formal language that I believe may be reasonably regarded as a fragment of ordinary English. R. Montague 1970 [Mon70, p.188]

The first step in defining a fragment of natural language is to define which sentences we want to consider. We will do this by means of a context-free grammar. This will do two things: act as an oracle deciding which sentences (of natural language) are OK, and secondly to build up syntax trees, which we will later use for semantics construction.

# Natural Language Fragments ▷ Idea: Formalize a set (NL) sentences we want to study by a grammar. ▷ Definition A natural language fragment is the language of a context free grammar. ▷ Idea: Use non-terminals to classify NL phrases. ▷ Definition We call a non-terminal of a context-free grammar a syntactical category. We distinguish two kinds of rules structural rules: L: H→c1,..., cn with head H, label L, and a sequence of phrase categories ci. lexical rules: L: H→t1 | ... | tn, where the ti are terminals (i.e. NL phrases)



We generically distinguish two parts of a grammar: the structural rules and the lexical rules, because they are guided by differing intuitions. The former set of rules govern how NL phrases can be composed to sentences (and later even to discourses). The latter rules are a simple representation of a lexicon, i.e. a structure which tells us about words (the terminal objects of language): their syntactical categories, their meaning, etc.



#### Semantics by Translation

- $\triangleright$  Idea: We translate sentences by translating their syntax trees via tree node translation rules.
- ▷ Note: This makes the induced meaning theory compositional.
- $\triangleright$  Definition We represent a node  $\alpha$  in a syntax tree with children  $\beta_1, \ldots, \beta_n$  by  $[X_{1\beta_1}, \ldots, X_{n\beta_n}]_{\alpha}$  and write a translation rule as

$$\mathcal{L}: [X_{1\beta_1}, \ldots, X_{n\beta_n}]_{\alpha} \rightsquigarrow \Phi(X_1', \ldots, X_n')$$

if the translation of the node  $\alpha$  can be computed from those of the  $\beta_i$  via a semantical function  $\Phi.$ 

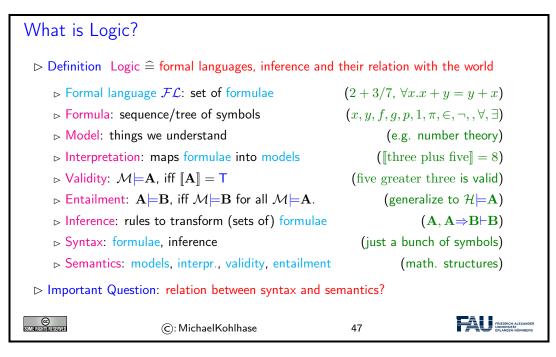
- $\triangleright$  Definition For a natural language utterance A, we will use  $\langle A \rangle$  for the result of translating A.
- $\triangleright$  Definition For every word w in the fragment we assume a constant w' in the logic  $\mathcal{L}$  and the "pseudo-rule"  $t1: w \rightsquigarrow w'$ . (if no other translation rule applies)

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#### 3.2 What is Logic?



So logic is the study of formal representations of objects in the real world, and the formal statements that are true about them. The insistence on a *formal language* for representation is actually something that simplifies life for us. Formal languages are something that is actually easier to understand than e.g. natural languages. For instance it is usually decidable, whether a string is a member of a formal language. For natural language this is much more difficult: there is still no program that can reliably say whether a sentence is a grammatical sentence of the English language.

We have already discussed the meaning mappings (under the monicker "semantics"). Meaning mappings can be used in two ways, they can be used to understand a formal language, when we use a mapping into "something we already understand", or they are the mapping that legitimize a representation in a formal language. We understand a formula (a member of a formal language) **A** to be a representation of an object  $\mathcal{O}$ , iff  $[\mathbf{A}] = \mathcal{O}$ .

However, the game of representation only becomes really interesting, if we can do something with the representations. For this, we give ourselves a set of syntactic rules of how to manipulate the formulae to reach new representations or facts about the world.

Consider, for instance, the case of calculating with numbers, a task that has changed from a difficult job for highly paid specialists in Roman times to a task that is now feasible for young children. What is the cause of this dramatic change? Of course the formalized reasoning procedures for arithmetics that we use nowadays. These *calculi* consist of a set of rules that can be followed purely syntactically, but nevertheless manipulate arithmetic expressions in a correct and fruitful way. An essential prerequisite for syntactic manipulation is that the objects are given in a formal language suitable for the problem. For example, the introduction of the decimal system has been instrumental to the simplification of arithmetic mentioned above. When the arithmetical calculi were sufficiently well-understood and in principle a mechanical procedure, and when the art of clock-making was mature enough to design and build mechanical devices of an appropriate kind, the invention of calculating machines for arithmetic by (1623), (1642), and (1671) was only a natural consequence.

We will see that it is not only possible to calculate with numbers, but also with representations of statements about the world (propositions). For this, we will use an extremely simple example; a fragment of propositional logic (we restrict ourselves to only one connective) and a small calculus that gives us a set of rules how to manipulate formulae.

In computational semantics, the picture is slightly more complicated than in Physics. Where Physics considers mathematical models, we build logical models, which in turn employ the term "model". To sort this out, let us briefly recap the components of logics, we have seen so far.

Logics make good (scientific<sup>1</sup>) models for natural language, since they are mathematically precise and relatively simple.

- **Formal languages** simplify natural languages, in that problems of grammaticality no longer arise. Well-formedness can in general be decided by a simple recursive procedure.
- Semantic models simplify the real world by concentrating on (but not restricting itself to) mathematically well-understood structures like sets or numbers. The induced semantic notions of validity and logical consequence are precisely defined in terms of semantic models and allow us to make predictions about truth conditions of natural language.

The only missing part is that we can conveniently compute the predictions made by the model. The underlying problem is that the semantic notions like validity and semantic consequence are defined with respect to *all* models, which are difficult to handle.

Therefore, logics typically have a third part, an inference system, or a calculus, which is a syntactic counterpart to the semantic notions. Formally, a calculus is just a set of rules (called inference rules) that transform (sets of) formulae (the assumptions) into other (sets of) formulae (the conclusions). A sequence of rule applications that transform the empty set of assumptions into a formula  $\mathbf{T}$ , is called a proof of  $\mathbf{A}$ . To make these assumptions clear, let us look at a very simple example.

## 3.3 Formal Systems

To prepare the ground for the particular developments coming up, let us spend some time on recapitulating the basic concerns of formal systems.

#### 3.3.1 Logical Systems

The notion of a logical system is at the basis of the field of logic. In its most abstract form, a logical system consists of a formal language, a class of models, and a satisfaction relation between models and expressions of the formal language. The satisfaction relation tells us when an expression is deemed true in this model.

#### Logical Systems

 $\triangleright$  Definition A logical system is a triple  $S:=\langle \mathcal{L}, \mathcal{K}, \models \rangle$ , where  $\mathcal{L}$  is a formal language,  $\mathcal{K}$  is a set and  $\models \subseteq \mathcal{K} \times \mathcal{L}$ . Members of  $\mathcal{L}$  are called formulas of S, members of  $\mathcal{K}$  models for S, and  $\models$  the satisfaction relation.

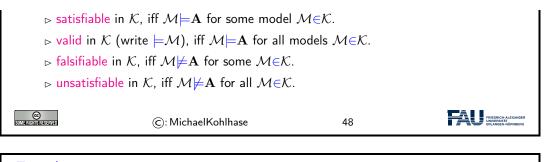
▷ Example

 $\langle wff_o(\mathcal{V}_o), \mathcal{K}, \models \rangle$  is a logical system, if we define  $\mathcal{K}:=(\mathcal{V}_o \rightharpoonup \mathcal{D}_o)$  (the set of variable assignments) and  $\varphi \models \mathbf{A}:\equiv \mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{T}$ .

- $\triangleright$  Definition Let  $S:=\langle \mathcal{L}, \mathcal{K}, \models \rangle$  be a logical system,  $\mathcal{M} \in \mathcal{K}$  be a model and  $\mathbf{A} \in \mathcal{L}$  a formula, then we say that  $\mathbf{A}$  is
  - $\triangleright$  satisfied by  $\mathcal{M}$ , iff  $\mathcal{M} \models \mathbf{A}$ .
  - $\triangleright$  falsified by  $\mathcal{M}$ , iff  $\mathcal{M} \not\models \mathbf{A}$ .

 $<sup>^{1}</sup>$ As we use the word "model" in two ways, we will sometimes explicitly label it by the attribute "scientific" to signify that a whole logic is used to model a <u>natural language</u> phenomenon and with the attribute "semantic" for the mathematical structures that are used to give meaning to <u>eqdefsormal-language</u>?formal-language

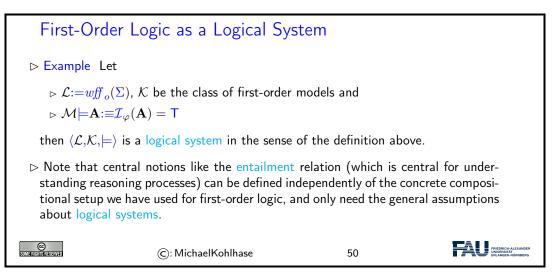
#### 3.3. FORMAL SYSTEMS



### Entailment

- $\begin{array}{l} \triangleright \mbox{ Definition } \mbox{ Let } \mathcal{S}:= \langle \mathcal{L}, \mathcal{K}, \models \rangle \mbox{ be a logical system, then we define the entailment } \\ \mbox{ relation } \models \subseteq \mathcal{P}(\mathcal{L}) \times \mathcal{L}. \mbox{ We say that a set } \mathcal{H} \subseteq \mathcal{L} \mbox{ of formulae entailment } \mathbf{B} \mbox{ (written } \\ \mathcal{H} \models \mathbf{B}), \mbox{ iff we have } \mathcal{M} \models \mathbf{B} \mbox{ for all } \mathbf{A} \in \mathcal{H} \mbox{ and models } \mathcal{M} \in \mathcal{K} \mbox{ with } \mathcal{M} \models \mathbf{A}. \end{array}$
- $\triangleright \text{ Assertion If } \mathbf{A} \models \mathbf{B} \text{ and } \mathcal{M} \models \mathbf{A}, \text{ then } \mathcal{M} \models \mathbf{B}.$
- $\triangleright$  Assertion If  $\mathcal{H}\models\mathbf{B}$  and  $\mathcal{H}\subseteq\mathcal{K}$ , then  $\mathcal{K}\models\mathbf{B}$ .

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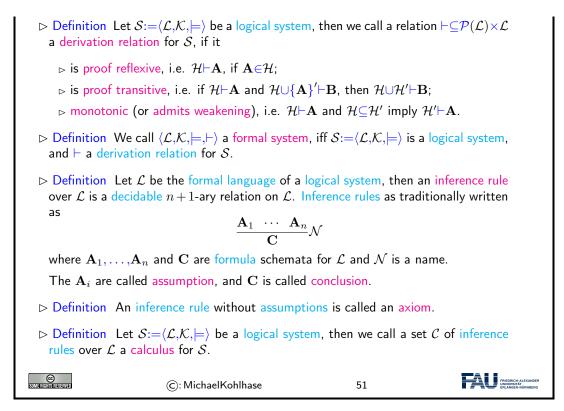


Let us now turn to the syntactical counterpart of the entailment relation: derivability in a calculus. Again, we take care to define the concepts at the general level of logical systems.

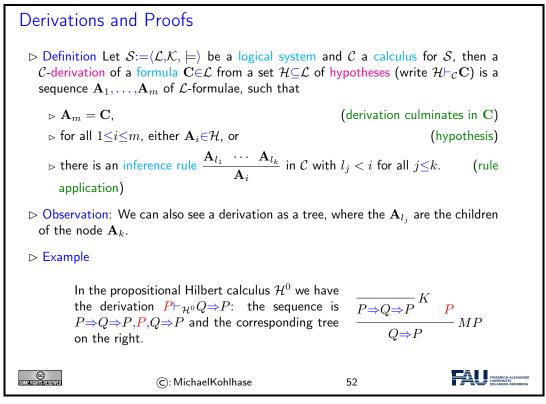
#### 3.3.2 Calculi, Derivations, and Proofs

The intuition of a calculus is that it provides a set of syntactic rules that allow to reason by considering the form of propositions alone. Such rules are called inference rules, and they can be strung together to derivations — which can alternatively be viewed either as sequences of formulae where all formulae are justified by prior formulae or as trees of inference rule applications. But we can also define a calculus in the more general setting of logical systems as an arbitrary relation on formulae with some general properties. That allows us to abstract away from the homomorphic setup of logics and calculi and concentrate on the basics.

Derivation Relations and Inference Rules



With formula schemata we mean representations of sets of formulae, we use boldface uppercase letters as (meta)-variables for formulae, for instance the formula schema  $\mathbf{A} \Rightarrow \mathbf{B}$  represents the set of formulae whose head is  $\Rightarrow$ .



Inference rules are relations on formulae represented by formula schemata (where boldface,

uppercase letters are used as meta-variables for formulae). For instance, in the inference rule  $\frac{\mathbf{A}\Rightarrow\mathbf{B}}{\mathbf{B}}$  was applied in a situation, where the meta-variables  $\mathbf{A}$  and  $\mathbf{B}$  were instantiated by the formulae P and  $Q\Rightarrow P$ .

As axioms do not have assumptions, they can be added to a derivation at any time. This is just what we did with the axioms in .

Formal Systems  $\triangleright$  Assertion Let  $\mathcal{S}:=\langle \mathcal{L}, \mathcal{K}, \models \rangle$  be a logical system and  $\mathcal{C}$  a calculus for  $\mathcal{S}$ , then the C-derivation relation  $\vdash D$  defined above is a derivation relation in the sense of the definition above.  $\triangleright$  Therefore we will sometimes also call  $\langle \mathcal{L}, \mathcal{K}, \models, \mathcal{C} \rangle$  a formal system, iff  $\mathcal{S} := \langle \mathcal{L}, \mathcal{K}, \models \rangle$ is a logical system, and C a calculus for S.  $\triangleright$  Definition Let C be a calculus, then a C-derivation  $\emptyset \vdash_{\mathcal{C}} \mathbf{A}$  is called a proof of  $\mathbf{A}$ and if one exists (write  $\vdash_{\mathcal{C}} \mathbf{A}$ ) then  $\mathbf{A}$  is called a  $\mathcal{C}$ -theorem.  $\triangleright$  Definition An inference rule  $\mathcal{I}$  is called admissible in  $\mathcal{C}$ , if the extension of  $\mathcal{C}$  by  $\mathcal{I}$ does not yield new theorems.  $\triangleright$  Definition An inference rule  $\frac{\mathbf{A}_1 \cdots \mathbf{A}_n}{\mathbf{C}}$  is called derivable in  $\mathcal{C}$ , if there is a  $\mathcal{C}$ -derivation  $\{\mathbf{A}_1, \ldots, \mathbf{A}_n\} \vdash_{\mathcal{C}} \mathbf{C}$ .  $\triangleright$  Assertion Derivable inference rules are admissible, but not the other way around. FRIEDRICH-AL CC Some Rights Reserved (C): MichaelKohlhase 53

The notion of a formal system encapsulates the most general way we can conceptualize a system with a calculus, i.e. a system in which we can do "formal reasoning". We will now fortify our intuitions about formal systems, calculi and models using a very simple example – indeed maybe the smallest example of a full formal system we can imagine. We use ist mostly because it is nice and small – it will easily fit into your pocket to carry around – not because it is an otherwise beautiful or useful formal system.

A Simple Formal System: Prop. Logic with Hilbert-Calculus  $\rhd$  Formulae: built from propositional variables: P,Q,R... and implication:  $\Rightarrow$   $\rhd$  Semantics:  $\mathcal{I}_{\varphi}(P) = \varphi(P)$  and  $\mathcal{I}_{\varphi}(\mathbf{A}\Rightarrow\mathbf{B}) = \mathsf{T}$ , iff  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{F}$  or  $\mathcal{I}_{\varphi}(\mathbf{B}) = \mathsf{T}$ .  $\triangleright$  Definition The Hilbert calculus  $\mathcal{H}^0$  consists of the inference rules:  $\overline{P\Rightarrow Q\Rightarrow P}^{\mathsf{K}}$   $\overline{P\Rightarrow Q\Rightarrow R\Rightarrow P\Rightarrow Q\Rightarrow P\Rightarrow R}^{\mathsf{S}}$   $\frac{\mathsf{A}\Rightarrow\mathsf{B}}{\mathsf{B}} \mathsf{A}_{\mathsf{M}}\mathsf{P}$   $\frac{\mathsf{A}}{[\mathsf{B}/X]\mathsf{A}}\mathsf{Subst}$   $\triangleright$  Example A  $\mathcal{H}^0$  theorem C $\Rightarrow$ C and proof Proof: We show that  $\emptyset \vdash_{\mathcal{H}^0} \mathsf{C}\Rightarrow \mathsf{C}$ 

$\mathbf{P.1} \ \mathbf{C} {\Rightarrow} \mathbf{C} {\Rightarrow} \mathbf{C} {=}$	→C	(K with $[C/$	$P], [\mathbf{C} \Rightarrow \mathbf{C}/Q])$	
$\mathbf{P.1} \ \mathbf{C} {\Rightarrow} \mathbf{C} {\Rightarrow} \mathbf{C} {=}$	$ ightarrow \mathbf{C} \Rightarrow \mathbf{C}$	(MP on P.1 and P.2)		
$P.1 C {\Rightarrow} C {\Rightarrow} C$		(K with	$[\mathbf{C}/P], [\mathbf{C}/Q])$	
P.1 C⇒C	(MP on P.3	3 and P.4)		
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This is indeed a very simple formal system, but it has all the required parts:

- A formal language: expressions built up from variables and implications.
- A semantics: given by the obvious interpretation function
- A calculus: given by the two axioms and the two inference rules.

The calculus gives us a set of rules with which we can derive new formulae from old ones. The axioms are very simple rules, they allow us to derive these two formulae in any situation. The inference rules are slightly more complicated: we read the formulae above the horizontal line as assumptions and the (single) formula below as the conclusion. An inference rule allows us to derive the conclusion, if we have already derived the assumptions.

Now, we can use these inference rules to perform a proof. A proof is a sequence of formulae that can be derived from each other. The representation of the proof in the slide is slightly compactified to fit onto the slide: We will make it more explicit here. We first start out by deriving the formula

$$P \Rightarrow Q \Rightarrow R \Rightarrow P \Rightarrow Q \Rightarrow P \Rightarrow R \tag{3.1}$$

which we can always do, since we have an axiom for this formula, then we apply the rule *subst*, where **A** is this result, **B** is **C**, and X is the variable P to obtain

$$\mathbf{C} \Rightarrow Q \Rightarrow R \Rightarrow \mathbf{C} \Rightarrow Q \Rightarrow \mathbf{C} \Rightarrow R \tag{3.2}$$

Next we apply the rule Subst to this where **B** is  $\mathbf{C} \Rightarrow \mathbf{C}$  and X is the variable Q this time to obtain

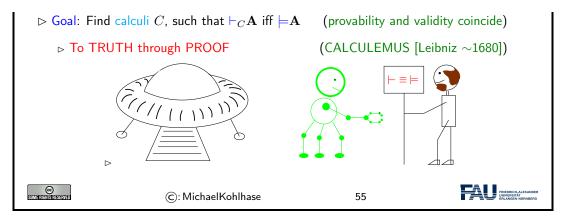
$$\mathbf{C} \Rightarrow \mathbf{C} \Rightarrow$$

And again, we apply the rule *subst* this time, **B** is **C** and X is the variable R yielding the first formula in our proof on the slide. To conserve space, we have combined these three steps into one in the slide. The next steps are done in exactly the same way.

#### 3.3.3 Properties of Calculi

In general formulae can be used to represent facts about the world as propositions; they have a semantics that is a mapping of formulae into the real world (propositions are mapped to truth values.) We have seen two relations on formulae: the entailment relation and the deduction relation. The first one is defined purely in terms of the semantics, the second one is given by a calculus, i.e. purely syntactically. Is there any relation between these relations?

Soundness and Completeness
 ▷ modulesImporting module: http://mathhub.info/smglom/logic?derivation modules-Importing module: http://mathhub.info/smglom/logic?entailment
 Definition Let S:=⟨L,K,⊨⟩ be a logical system, then we call a calculus C for S
 ▷ sound (or correct), iff H⊨A, whenever H⊢<sub>C</sub>A, and
 ▷ complete, iff H⊢<sub>C</sub>A, whenever H⊨A.



Ideally, both relations would be the same, then the <u>calculus</u> would allow us to infer all facts that can be represented in the given formal language and that are true in the real world, and only those. In other words, our representation and inference is faithful to the world.

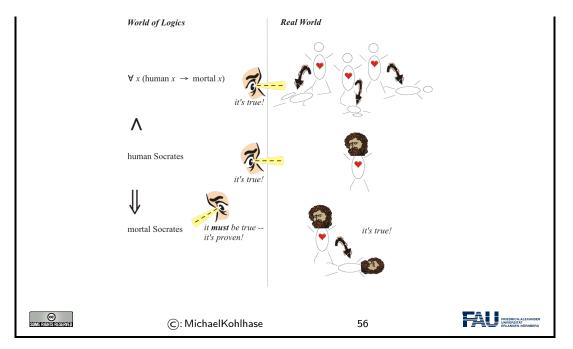
A consequence of this is that we can rely on purely syntactical means to make predictions about the world. Computers rely on formal representations of the world; if we want to solve a problem on our computer, we first represent it in the computer (as data structures, which can be seen as a formal language) and do syntactic manipulations on these structures (a form of calculus). Now, if the provability relation induced by the calculus and the validity relation coincide (this will be quite difficult to establish in general), then the solutions of the program will be correct, and we will find all possible ones. Of course, the logics we have studied so far are very simple, and not able to express interesting facts about the world, but we will study them as a simple example of the fundamental problem of Computer Science: How do the formal representations correlate with the real world.

Within the world of logics, one can derive new propositions (the *conclusions*, here: *Socrates is mortal*) from given ones (the *premises*, here: *Every human is mortal* and *Sokrates is human*). Such derivations are *proofs*.

In particular, logics can describe the internal structure of real-life facts; e.g. individual things, actions, properties. A famous example, which is in fact as old as it appears, is illustrated in the slide below.

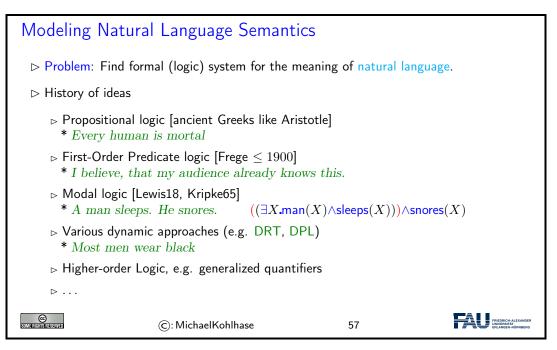
The miracle of logics

> Purely formal derivations are true in the real world!

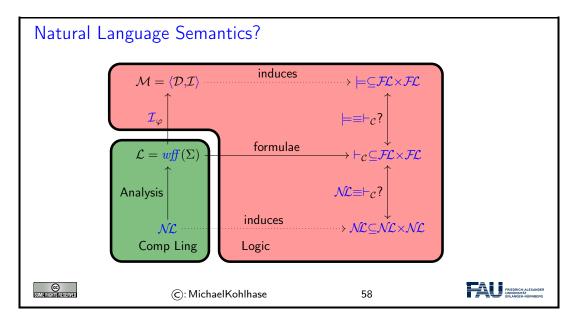


If a logic is correct, the conclusions one can prove are true (= hold in the real world) whenever the premises are true. This is a miraculous fact (think about it!)

## 3.4 Using Logic to Model Meaning of Natural Language



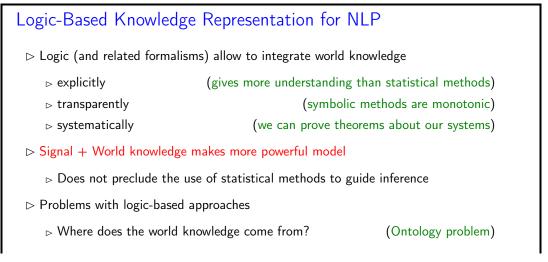
Let us now reconcider the role of all of this for natural language semantics. We have claimed that the goal of the course is to provide you with a set of methods to determine the meaning of natural language. If we look back, all we did was to establish translations from natural languages into formal languages like first-order or higher-order logic (and that is all you will find in most semantics papers and textbooks). Now, we have just tried to convince you that these are actually syntactic entities. So, *where is the semantics*?



As we mentioned, the green area is the one generally covered by natural language semantics. In the analysis process, the nlunatural language utterance (viewed here as formulae of a language  $\mathcal{NL}$ ) are translated to a formal language  $\mathcal{FL}$  (a set  $wff(\Sigma)$  of well-formed formulae). We claim that this is all that is needed to recapture the semantics even if this is not immediately obvious at first: Theoretical Logic gives us the missing pieces.

Since  $\mathcal{FL}$  is a formal language of a logical systems, it comes with a notion of model and an interpretation function  $\mathcal{I}_{\varphi}$  that translates  $\mathcal{FL}$  formulae into objects of that model. This induces a notion of logical consequence<sup>2</sup> as explained in . It also comes with a calculus  $\mathcal{C}$  acting on  $\mathcal{FL}$ -formulae, which (if we are lucky) is correct and complete (then the mappings in the upper rectangle commute).

What we are really interested in in natural language semantics is the truth conditions and natural consequence relations on natural language utterances, which we have denoted by  $\mathcal{NL}$ . If the calculus  $\mathcal{C}$  of the logical system  $\langle \mathcal{FL}, \mathcal{K}, \models \rangle$  is adequate (it might be a bit presumptious to say sound and complete), then it is a model of the relation  $\mathcal{NL}$ . Given that both rectangles in the diagram commute, then we really have a model for truth-conditions and logical consequence for nlunatural lanaugage utterances, if we only specify the analysis mapping (the green part) and the calculus.



<sup>&</sup>lt;sup>2</sup>Relations on a set S are subsets of the cartesian product of S, so we use  $R \in S^*S$  to signify that R is a (n-ary) relation on X.

### CHAPTER 3. LOGIC AS A TOOL FOR MODELING NL SEMANTICS

$\triangleright$ How to	guide search induced by log. calculi	(combir	natorial explosion)
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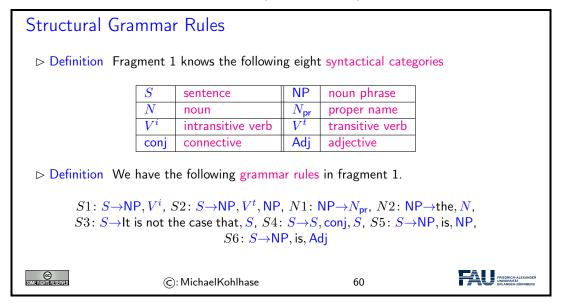
# Chapter 4

# Fragment 1

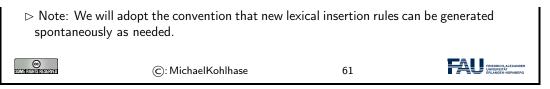
## 4.1 The First Fragment: Setting up the Basics

The first fragment will primarily be used for setting the stage, and introducing the method itself. The coverage of the fragment is too small to do anything useful with it, but it will allow us to discuss the salient features of the method, the particular setup of the grammars and semantics before graduating to more useful fragments.

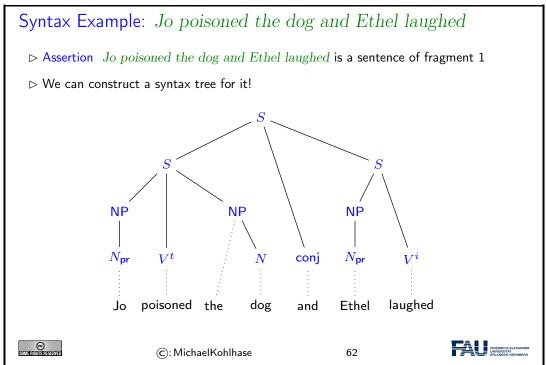
#### 4.1.1 Natural Language Syntax (Fragment 1)



Lexical insertion rules for Fragment 1 ▷ Definition We have the following lexical insertion rules in Fragment 1. L1: N<sub>pr</sub>→Prudence| Ethel| Chester| Jo| Bertie| Fiona, L2: N→book| cake| cat| golfer| dog| lecturer| student| singer, L3: V<sup>i</sup>→ran| laughed| sang| howled| screamed, L4: V<sup>t</sup>→read| poisoned| ate| liked| loathed| kicked, L5: conj→and| or, L6: Adj→happy| crazy| messy| disgusting| wealthy

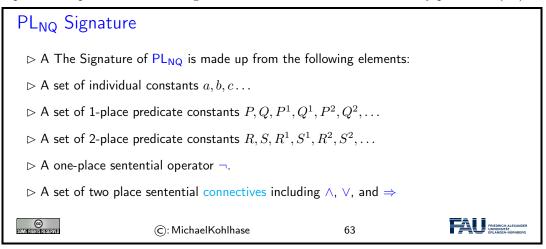


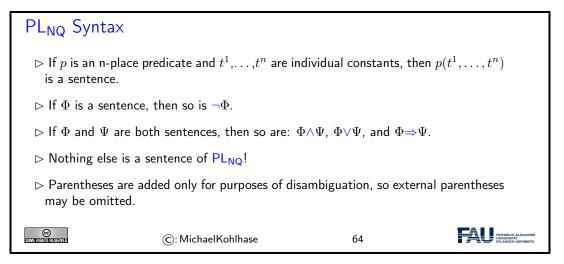
These rules represent a simple lexicon, they specify which words are accepted by the grammar and what their syntactical categories are.



#### 4.1.2 Predicate Logic without Quantifiers

The next step will be to introduce the logical model we will use for Fragment 1: Predicate Logic without Quantifiers. Syntactically, this logic is a fragment of first-order logic, but it's expressivity is equivalent to propositional logic. Therefore, we will introduce the syntax of full first-order logic (with quantifiers since we will need if for Fragment 4 later), but for the semantics stick with a setup without quantifiers. We will go into the semantic difficulties that they pose later (in ).





Semantic Models for PLNQ: What the semantics of  $PL_{NQ}$  will do is allow us to determine, for any given sentence of the language, whether it is true or false. Now, in general, to know whether a sentence in a language is true or false, we need to know what the world is like. The same is true for  $PL_{NQ}$ . But to make life easier, we don't worry about the real world; we define a situation, a little piece of the world, and evaluate our sentences relative to this situation. We do this using a structure called a *model*.

What we need to know about the world is:

- What objects there are in the world.
- Which predicates are true of which objects, and which objects stand in which relations to each other.

Definition: A model for  $PL_{NQ}$  is an ordered pair  $\langle \mathcal{D}, \mathcal{I} \rangle$  where:

- $\mathcal{D}$  is the domain, which specifies what objects there are in the model. (All kinds of things can be objects.)
- $\mathcal{I}$  is an interpretation function. (Can uses the terms "denotation assignment function" and "naming function.")

An interpretation function for a language is a function whose arguments are the non-logical constants of the language, and which give back as value a *denotation* or *reference* for the constant. Specifically:

- To an individual constant, the interpretation function assigns an object from the model. I.e. the interpretation function tells us which objects from the model are named by each of the constants. (Note that the interpretation function can assign the same object to more than one constant; but to each constant, it can assign at most one object as value.)
- To a one-place predicate, the interpretation function assigns a set of objects from the model. Intuitively, these objects are the objects in the model of which the predicate is true.
- To a two-place predicate, the interpretation function assigns a set of *pairs* of objects from the model. Intuitively, these pairs are the pairs of which the predicate is true. (Generalizing: To an n-place predicate, the interpretation function assigns a set of n-tuples of objects from the model.)

Example Let  $L:=\{a,b,c,d,e,P,Q,R,S\}$ , we set the domain  $\mathcal{D}:=\{\clubsuit, \diamondsuit, \heartsuit, \diamondsuit\}$ , and the interpretation function  $\mathcal{I}$  by setting

•  $a \mapsto \clubsuit$ ,  $b \mapsto \diamondsuit$ ,  $c \mapsto \heartsuit$ ,  $d \mapsto \diamondsuit$ , and  $e \mapsto \diamondsuit$  for individual constants,

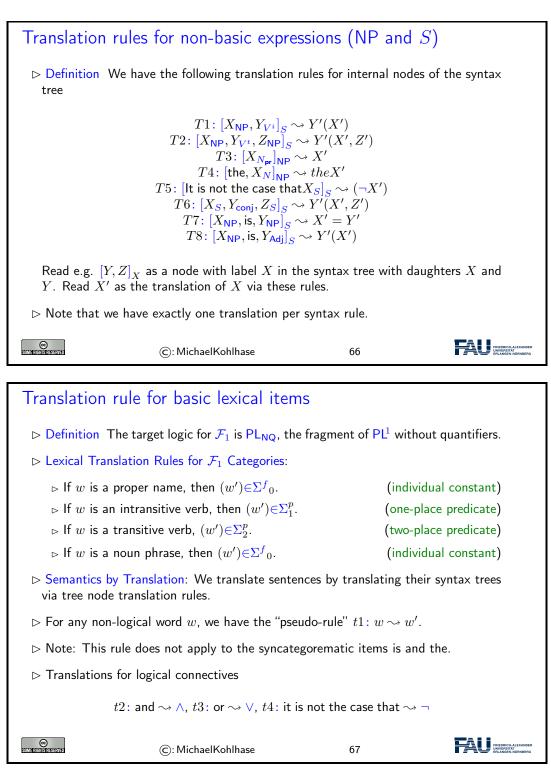
- $P \mapsto \{\clubsuit, \diamondsuit\}$  and  $Q \mapsto \{\diamondsuit, \diamondsuit\}$ , for unary predicate constants.
- $R \mapsto \{ \langle \heartsuit, \diamondsuit \rangle, \langle \diamondsuit, \heartsuit \rangle \}$ , and
- $S \mapsto \{\langle \diamondsuit, \diamondsuit \rangle, \langle \diamondsuit, \diamondsuit \rangle\}$  for binary predicate constants.

The valuation function,  $[[\cdot]]^M$ , fixes the value (for our purposes, the truth value) of sentences of the language relative to a given model. The valuation function, as you'll notice, is not itself part of the model. The valuation function is the same for any model for a language based on PL<sub>NQ</sub>. Definition: Let  $\langle \mathcal{D}, \mathcal{I} \rangle$  be a model for a language  $L \subseteq PL_{NQ}$ .

- 1. For any non-logical constant c of L,  $\mathcal{I}_{\varphi}(c) = \mathcal{I}(c)$ .
- 2. Atomic formulas: Let P be an n-place predicate constant, and  $t_1, \ldots, t_n$  be individual constants. Then  $\mathcal{I}_{\varphi}(P(t_1, \ldots, t_n)) = \mathsf{T}$  iff  $\langle \mathcal{I}_{\varphi}(t_1), \ldots, \mathcal{I}_{\varphi}(t_n) \rangle \in \mathcal{I}(P)$ .
- 3. Complex formulas: Let  $\varphi$  and  $\psi$  be sentences. Then:
  - (a)  $\mathcal{I}_{\varphi}(\neg \mathbf{A}) = \mathsf{T}$  iff  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{F}$ . (b)  $\mathcal{I}_{\varphi}(\mathbf{A} \land \mathbf{B}) = \mathsf{T}$  iff  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{T}$  and  $\mathcal{I}_{\varphi}(\mathbf{B}) = \mathsf{T}$ . (c)  $\mathcal{I}_{\varphi}(\mathbf{A} \lor \mathbf{B}) = \mathsf{T}$  iff  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{T}$  or  $\mathcal{I}_{\varphi}(\mathbf{B}) = \mathsf{T}$ . (d)  $\mathcal{I}_{\varphi}(\mathbf{A} \Rightarrow \mathbf{B}) = \mathsf{T}$  iff  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{F}$  or  $\mathcal{I}_{\varphi}(\mathbf{B}) = \mathsf{T}$ .
- PLNQ: Predicate Logic without variables and functions ▷ Idea: Study the fragment of first-order Logic without quantifiers and function constants.  $\triangleright$  Definition universes  $\mathcal{D}_o = \{\mathsf{T},\mathsf{F}\}$  of truth values and  $\mathcal{D}_i \neq \emptyset$  of individuals  $\triangleright$  Definition interpretation  $\mathcal{I}$  assigns values to constants, e.g.  $\triangleright \mathcal{I}(\neg) : \mathcal{D}_{o} \rightarrow \mathcal{D}_{o}; \mathsf{T} \mapsto \mathsf{F}; \mathsf{F} \mapsto \mathsf{T} \text{ and } \mathcal{I}(\land) = \dots$  $(as in PL^0)$  $\triangleright \mathcal{I} \colon \Sigma^{f}_{0} \to \mathcal{D}_{\iota}$ (interpret individual constants as individuals)  $\triangleright \mathcal{I} \colon \Sigma^p_k \to \mathcal{P}(\mathcal{D}^k_\iota)$ (interpret predicates as arbitrary relations)  $\triangleright$  Definition The value function  $\mathcal{I}_{\varphi}$ :  $wff_{o}(\Sigma) \rightarrow \mathcal{D}_{o}$  assigns values to formulae (recursively)  $\triangleright$  e.g.  $\mathcal{I}(\neg \mathbf{A}) = \mathcal{I}(\neg)(\mathcal{I}(\mathbf{A}))$ (just as in  $PL^0$ )  $\triangleright \mathcal{I}(p(\mathbf{A}^1,\ldots,\mathbf{A}^k)) := \mathsf{T}, \text{ iff } \langle \mathcal{I}(\mathbf{A}^1),\ldots,\mathcal{I}(\mathbf{A}^k) \rangle \in \mathcal{I}(p)$  $\triangleright$  Definition Model:  $\mathcal{M} = \langle \mathcal{D}_{\iota}, \mathcal{I} \rangle$  varies in  $\mathcal{D}_{\iota}$  and  $\mathcal{I}$ .  $\triangleright$  Assertion PL<sub>NQ</sub> is isomorphic to PL<sup>0</sup> (interpret atoms as prop. variables) © (c): MichaelKohlhase 65

Now that we have the target logic we can complete the analysis arrow in slide ??. We do this again, by giving transformation rules.

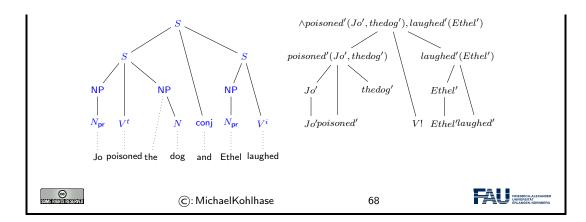
#### 4.1.3 Natural Language Semantics via Translation



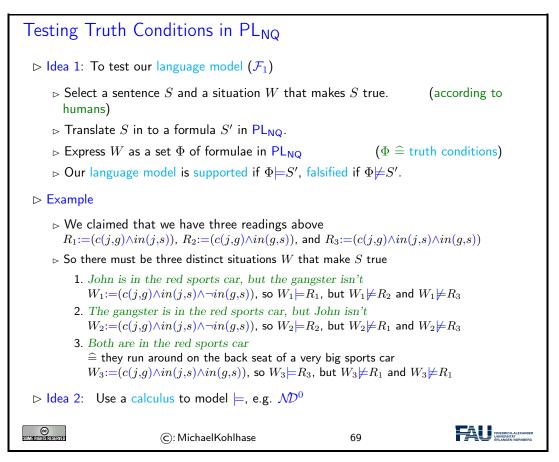
# Translation Example

▷ Assertion Jo poisoned the dog and Ethel laughed is a sentence of fragment 1

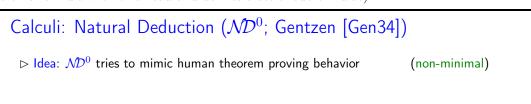
 $\triangleright$  We can construct a syntax tree for it!



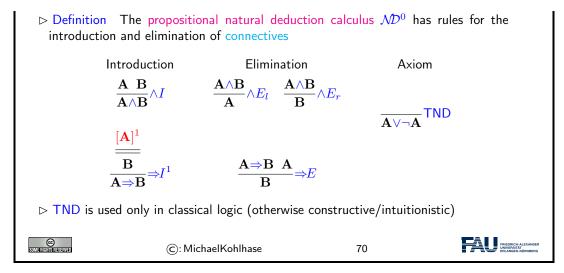
# 4.2 Testing Truth Conditions via Inference



Rather than using a minimal set of inference rules, the natural deduction calculus provides two/three inference rules for every logical constant, one "introduction rule" (an inference rule that derives a formula with that symbol at the head) and one "elimination rule" (an inference rule that acts on a formula with this head and derives a set of subformulae).

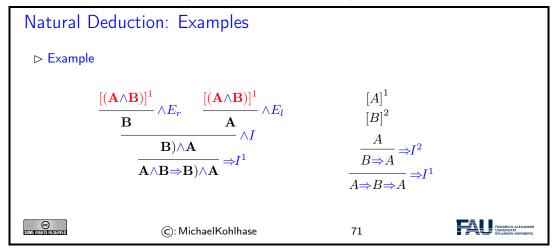


#### 4.2. TESTING TRUTH CONDITIONS VIA INFERENCE



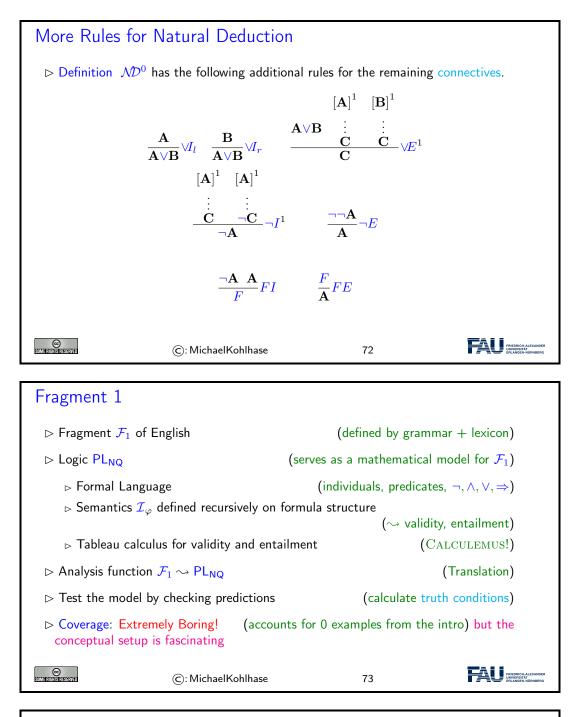
The most characteristic rule in the natural deduction calculus is the  $\Rightarrow I$  rule. It corresponds to the mathematical way of proving an implication  $\mathbf{A}\Rightarrow\mathbf{B}$ : We assume that  $\mathbf{A}$  is true and show  $\mathbf{B}$  from this assumption. When we can do this we discharge (get rid of) the assumption and conclude  $\mathbf{A}\Rightarrow\mathbf{B}$ . This mode of reasoning is called hypothetical reasoning. Note that the local hypothesis is discharged by the rule  $\Rightarrow I$ , i.e. it cannot be used in any other part of the proof. As the  $\Rightarrow I$  rules may be nested, we decorate both the rule and the corresponding assumption with a marker (here the number 1).

Let us now consider an example of hypothetical reasoning in action.



Here we see reasoning with local hypotheses at work. In the left example, we assume the formula  $\mathbf{A} \wedge \mathbf{B}$  and can use it in the proof until it is discharged by the rule  $\wedge E_l$  on the bottom – therefore we decorate the hypothesis and the rule by corresponding numbers (here the label "1"). Note the assumption  $\mathbf{A} \wedge \mathbf{B}$  is *local to the proof fragment* delineated by the corresponding hypothesis and the discharging rule, i.e. even if this proof is only a fragment of a larger proof, then we cannot use its hypothesis anywhere else. Note also that we can use as many copies of the local hypothesis as we need; they are all discharged at the same time.

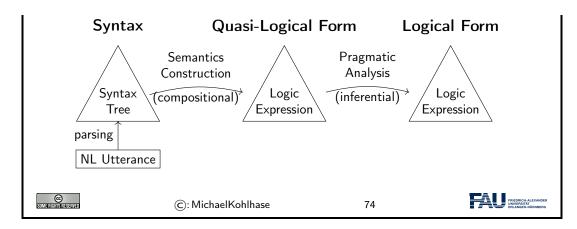
In the right example we see that local hypotheses can be nested as long as hypotheses are kept local. In particular, we may not use the hypothesis **B** after the  $\Rightarrow I^2$ , e.g. to continue with a  $\Rightarrow E$ . Another characteristic of the natural deduction calculus is that it has inference rules (introduction and elimination rules) for all connectives. So we extend the set of rules from for disjunction, negation and falsity.



## Summary: The Interpretation Process

▷ Interpretation Process:

#### 4.2. TESTING TRUTH CONDITIONS VIA INFERENCE



# Chapter 5

# Fragment 1: The Grammatical Logical Framework

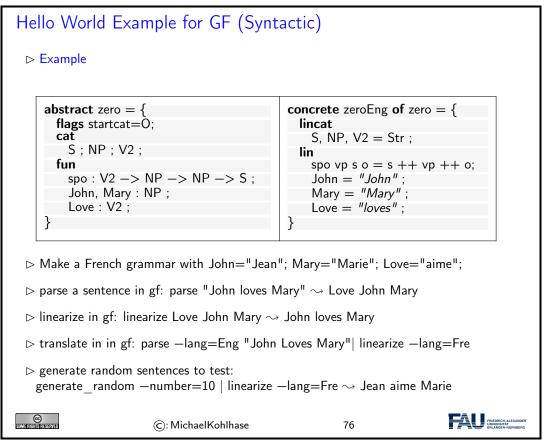
Now that we have introduced the "Method of Fragments" in theory, let see how we can implement it in a contemporary grammatical and logical framework. For the implementation of the semantics construction, we use GF, the "grammatical framework". For the implementation of the logic we will use the MMT system.

In this Chapter we develop and implement a toy/tutorial language fragment chosen mostly for didactical reasons to introduce the two systems. The code for all the examples can be found at https://gl.mathhub.info/Teaching/LBS/tree/master/source/tutorial.

# 5.1 Implementing Fragment 1 in GF

The Grammatical Framework (GF)				
Definition Grammatical Framework (GF [Ran04; Ran11]) is a modular formal framework and functional programming language for writing multilingual grammars of natural languages.				
Definition GF comes with the GF Resource Grammar Library, a reusable library for dealing with the morphology and syntax of a growing number of natural languages. (currently > 30)				
▷ Definition A GF grammar consists of				
$\triangleright$ an abstract grammar that specifies well-formed abstract syntax treess (AST),				
▷ a collection of concrete grammars for natural languages that specify how ASTs can be linearized into (natural language) strings.				
Definition Parsing is the dual to linearization, it transforms NL utterances into abstract syntax trees.				
<ul> <li>Definition The Grammatical Framwork comes with an implementation; the GF system that implements parsing, linearization, and – by combination – NL translation. (download/install from [GF])</li> </ul>				
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To introduce the syntax and operations of the GF system, and the underlying concepts, we will look at a very simple example.



The GF system can be downloaded from [GF] and can be started from the command line or as an inferior process of a text editor. Grammars are loaded via import or short i. Then the gf commands above can be issued to the REPL shell.

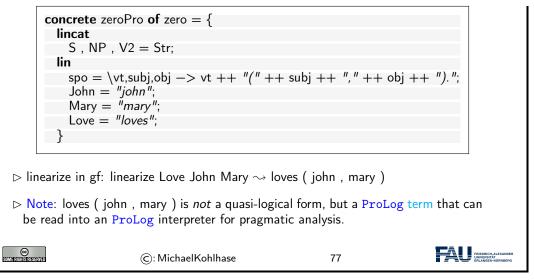
Command sequences can also be combined into an GF script, a text file with one command per line that can be loaded into gf at startup to initialize the interpreter by running it as gf --run script.gfo.

When we introduced the "method of fragments", we anticipated that after parsing the natural language utterances into syntax trees, we would translate them into a logical representation. One way of implementing this is to linearize the syntax trees into the input language of an implementation of a logic and read them into the system for further processing. We will now explore this using a ProLog interpreter, in which it is easy to program inference procedures.

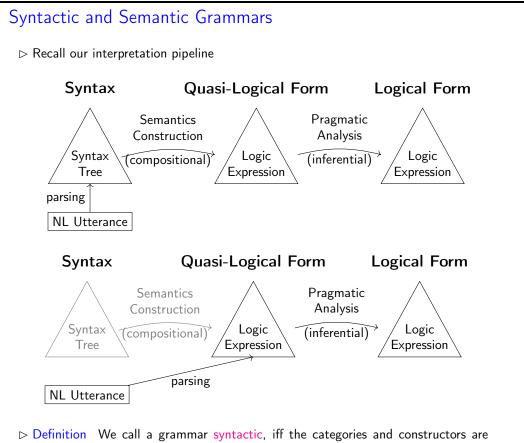
Translation to Logic

- ▷ Idea: Use logic as a "natural language"
- ▷ Example Linearize to ProLog terms:

(to translate into)

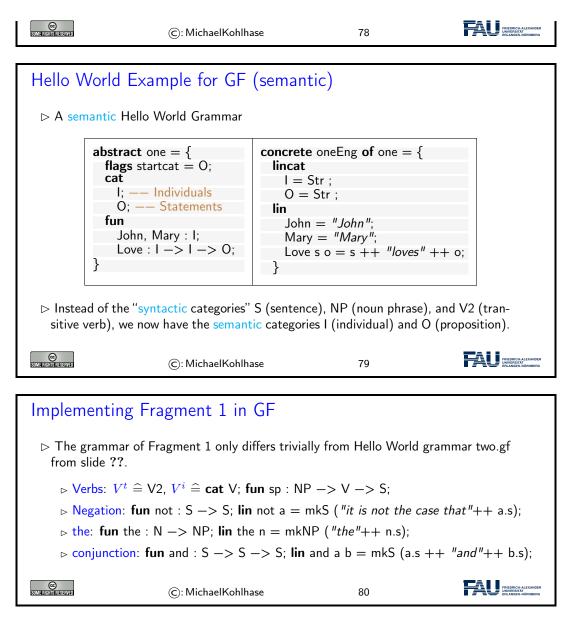


We will now introduce an important conceptual distinction on the intent of grammars.



- Definition We call a grammar syntactic, iff the categories and constructors are motivated by the linguistic structure of the utterance, and semantic, iff they are motivated by the structure of the domain to be modeled.
- $\triangleright$  Grammar zero from is syntactic.

 $\triangleright$  We will look at semantic versions next.



# 5.2 MMT: A Modular Framework for Representing Logics and Domains

We will use the OMDoc/MMT to represent both logical systems and the semantic domains (universes of discourse) of the various fragments. The MMT implements the OMDoc/MMT language, it can be used as

- a Java library that provides data structures and an API of logic-oriented algorithms, and as
- a standalone knowledge-management service provider via web interfaces.

We will make use of both in the LBS course and give a brief overview in this Section. For a (math-themed) tutorial that introduces format and system in more detail see [OMT].

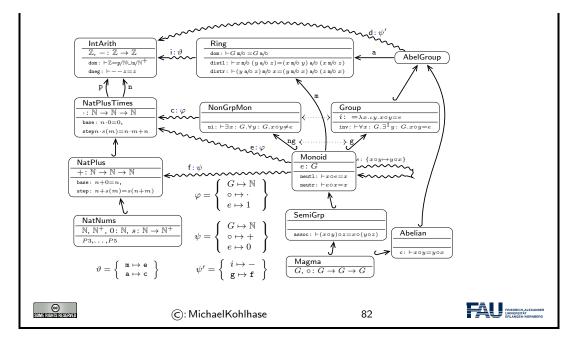
Representation language (MMT)

5.2.	MMT: A MODULAR	FRAMEWORK FOR	REPRESENTING LO	OGICS AND DOMAINS55
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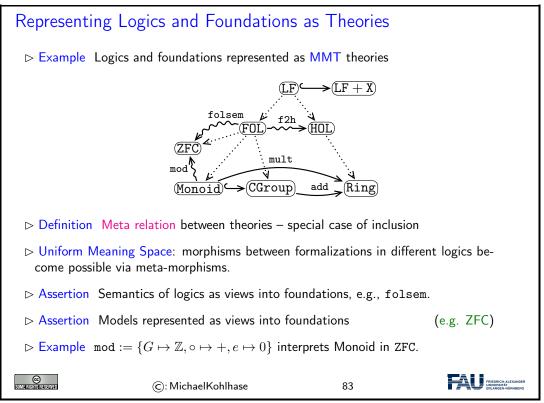
$\triangleright$ Definition MMT = module system for mathematical theories	
▷ Formal syntax and semantics	
$\triangleright$ needed for mathematical interface language	
▷ but how to avoid foundational commitment?	
▷ Foundation-independence	
<ul> <li>identify aspects of underlying language that are necessary for large scale pro- cessing</li> </ul>	
$\triangleright$ formalize exactly those, be parametric in the rest	
$\triangleright$ observation: most large scale operations need the same aspects	
⊳ Module system	
$\triangleright$ preserve mathematical structure wherever possible	
▷ formal semantics for modularity	
⊳ Web-scalable	
▷ build on XML, OpenMath, OMDoc	
URI-based logical identifiers for all declarations	
$\triangleright$ Implemented in the MMT API system.	
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The basic idea of the OMDoc/MMT format is that knowledge (originally mathematical knowledge for which the format is designed, but also world knowledge of the semantic domains in the fragments) can be represented modularly, using strong forms of inheritance to avoid duplicate formalization. This leads to the notion of a theory graph, where the nodes are theories that declare language fragments and axiomatize knowledge about the objects in the domain of discourse. The following theory graph is taken from [OMT].

Modular Representation of Math (MMT	Example)
⊳ Example	



We will use the foundation-independence (bring-your-own logic) in this course, since the models for the different fragments come with differing logics and foundational theories (together referred to as "foundations"). Logics can be represented as theories in OMDoc/MMT – after all they just introduce language fragments and specify their behavior – and are subject to the same modularity and inheritance regime as domain theories. The only difference is that logics form the metalanguage of the domain theories – they provide the language used to talk about the domain – and are thus connected to the domain theories by the meta relation. The next slide gives some details on the construction.



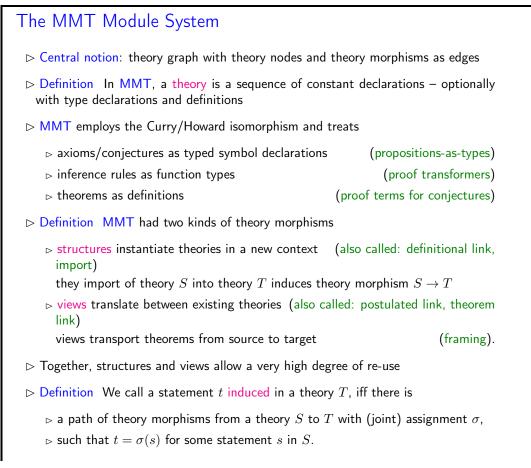
56

#### 5.2. MMT: A MODULAR FRAMEWORK FOR REPRESENTING LOGICS AND DOMAINS57

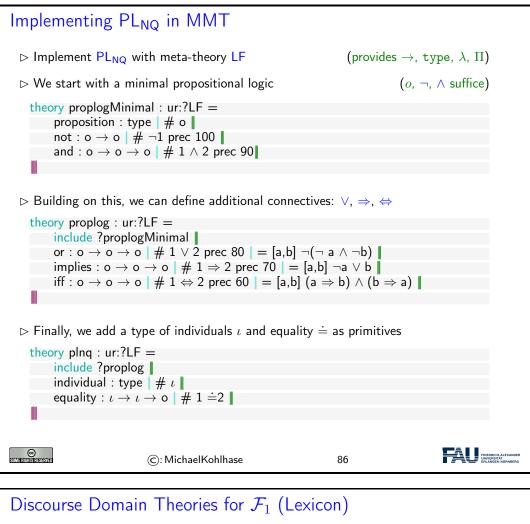
In the next slide we show the MMT surface language which gives a human-oriented syntax to the OMDoc/MMT format.

A MitM Theory in MMT Surface Language				
<ul> <li>▷ Example A theory of Groups</li> <li>▷ Declaration =         name : type [= Def] [# notation]</li> <li>▷ Axioms = Declaration with type ⊢ F</li> <li>▷ ModelsOf makes a record type from a         theory</li> </ul>				
▷ MitM Foundation: optimized for natural math formulation ▷ higher-order logic based on polymorphic $\lambda$ -calculus				
<ul> <li>&gt; judgements-as-types paradigm: ⊢ F = type of proofs of F</li> <li>&gt; dependent types with predicate subtyping, e.g. {n}{'a ∈ mat(n, n) symm(a)'}</li> <li>&gt; (dependent) record types for reflecting theories</li> </ul>				
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Finally, we summarize the concepts and features of the OMDoc/MMT.



# 5.3 Implementing Fragment1 in GF and MMT

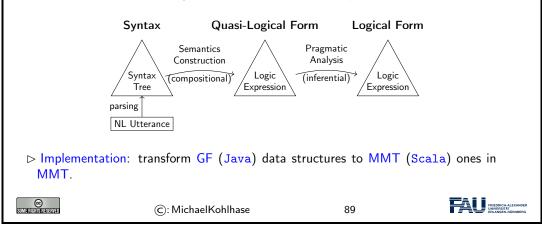


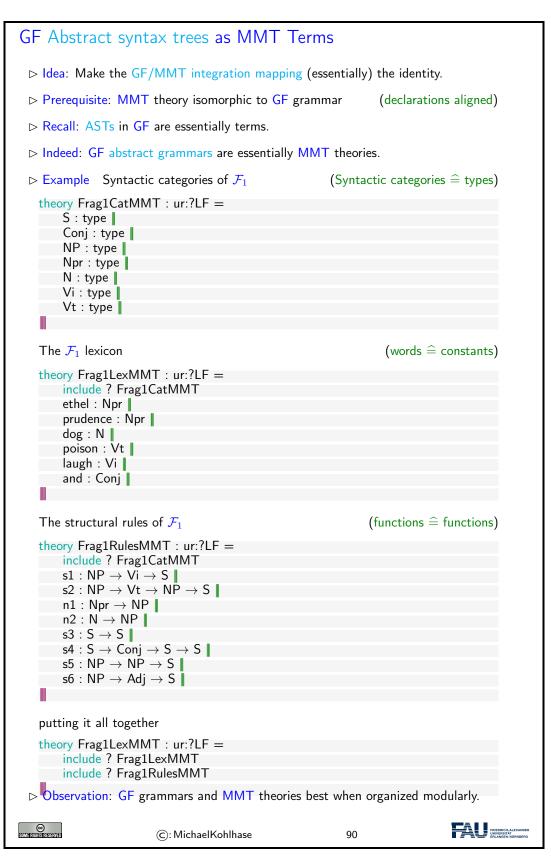
▷ A "lexicon theory" (only selected constants here)
theory plnqFrag1 : ?plnq =
ethel : *i* # ethel'
prudence : *i* # prudence'
dog : *i* # dog'
poison : *i* → *i* → o # poison' 1 2
laugh : *i* → o # laugh' 1
declares one logical constant for each from abstract GF grammar.
▷ Enough to interpret Prudence poisoned the dog and Ethel laughed from above.
ex : | o = poison' prudence' dog' ∧ laugh' ethel'

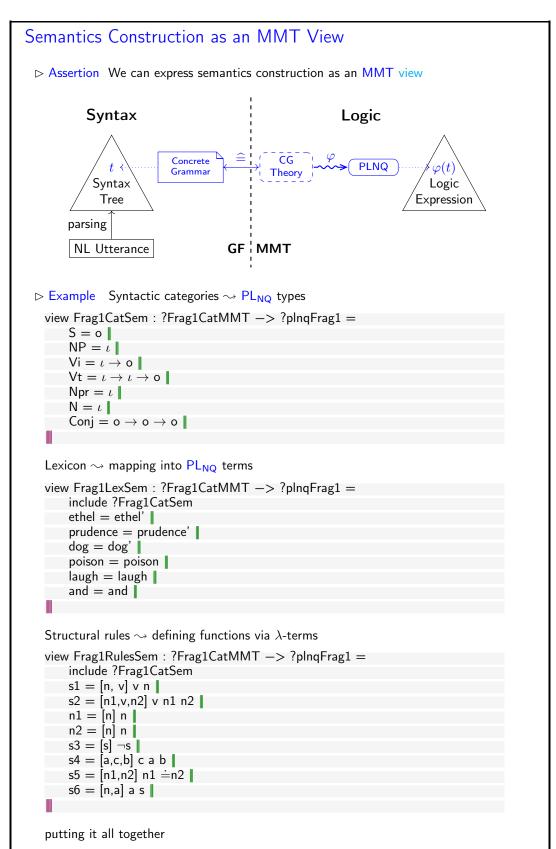
#### 5.3. IMPLEMENTING FRAGMENT1 IN GF AND MMT

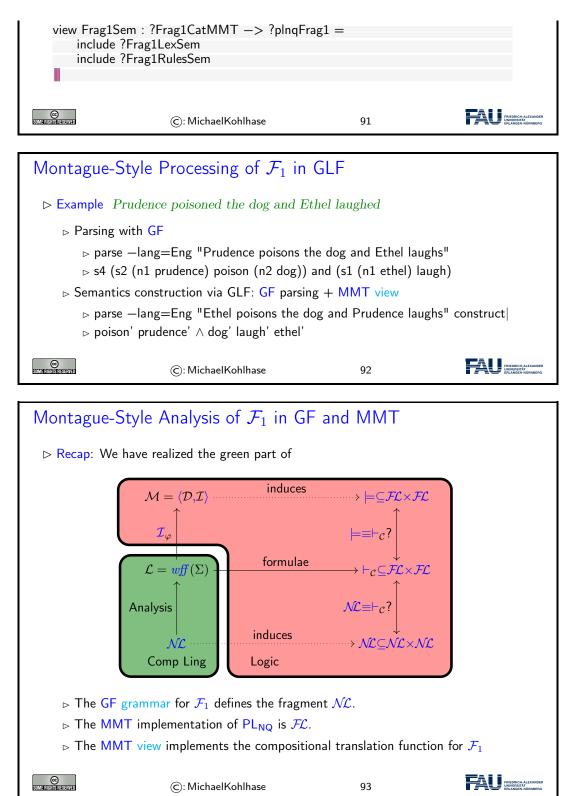
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Roproconti	ng Multiple Readings			
	ven represent the three readings of J from above.	ohn chased the g	angster in the red	
john : chased jcgirs1 jcgirs2	rtscar : ?pInq = $\iota \parallel gangster : \iota \parallel sportscar : \iota \parallel red$ $: \iota \rightarrow \iota \rightarrow o \parallel in : \iota \rightarrow \iota \rightarrow o \parallel$ $: o \parallel = chased john gangster \land in s$ $: o \parallel = chased john gangster \land in s$ $: o \parallel = chased john gangster \land in s$ $: o \parallel = chased john gangster \land in s$	sportscar gangster sportscar john ∧ re sportscar john ∧	ed sportscar	
⊳ Problem:	Can we systematically generate tern	ns like jcgirs1, jcgi	rs2, and jcgirs3?	
⊳ Idea: Use	the ASTs from GF in MMT.			
SOME FRICKING RESERVED	©: MichaelKohlhase	88	FRIEDRICH-ALEXANDER UNIVERSITÄN ERLANGEN-NÜRINBERG	
Embedding	g GF into MMT			
Observation: GF provides Java bindings and MMT is programed in Scala, which compiles into the Java virtual machine.				
ightarrow Idea: Use GF as a sophisticated NL-parser/generator for MMT				
$\sim$ MMT with a natural language front-end. $\sim$ GF with a multi-logic back-end				

- Definition The GF/MMT integration mapping interprets GF abstract syntax trees as MMT terms.
- $\triangleright$  Observation: This fits very well with our interpretation process in LBS



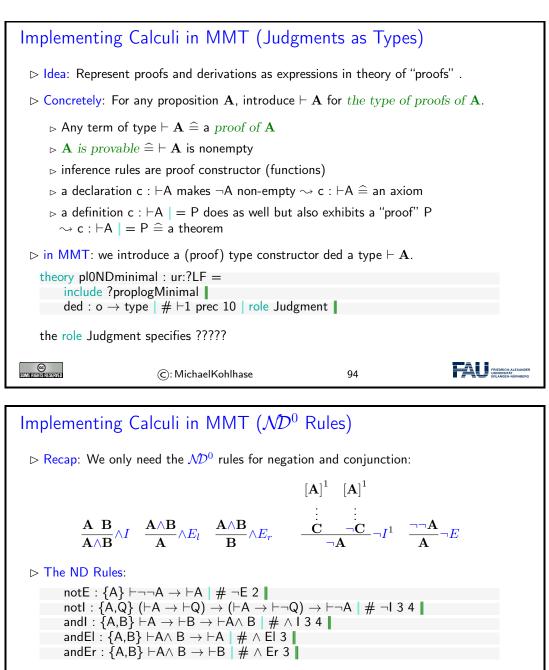






5.4 Implementing Natural Deduction in MMT

62



Inference rules as and hypothetical derivations as proof-to-proof functions.

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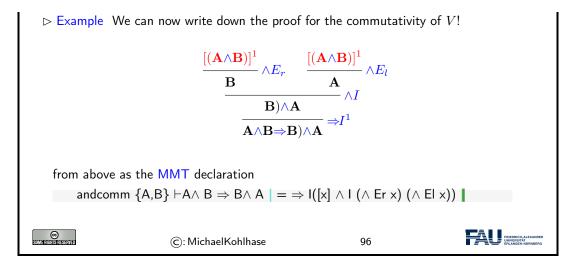
Implementing Calculi in MMT (a proof)

 $\triangleright$  Derived ND Rules: All other inference rules of  $\mathcal{ND}^0$  can be written down similarly. What is more, as they can be they derived from those above, they can become MMT definitions.

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95





# Chapter 6

# Adding Context: Pronouns and World Knowledge

In this Chapter we will extend the model generation system by facilities for dealing with world knowledge and pronouns. We want to cover discourses like *Peter loves Fido. Even though he bites him sometimes.* As we already observed there, we crucially need a notion of context which determines the meaning of the pronoun. Furthermore, the example shows us that we will need to take into account world knowledge as A way to integrate world knowledge to filter out one interpretation, i.e. *Humans don't bite dogs.* 

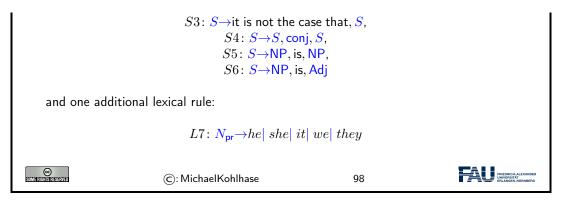
# 6.1 Fragment 2: Pronouns and Anaphora

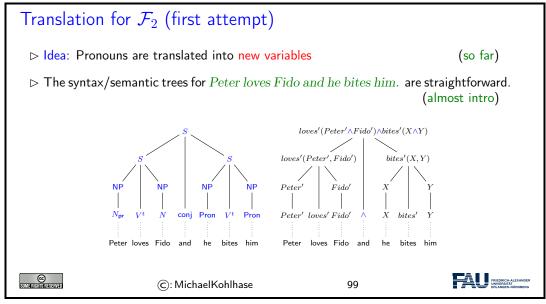
Fragment 2 (J	$\mathcal{F}_2 \cong \mathcal{F}_1 + Pronouns)$		
⊳ Want to cover:	: Peter loves Fido. He bites him	1.	(almost intro)
⊳ We need: T	ranslation and interpretation for	he, she, him,	
	y to integrate world knowledge to on't bite dogs.)	o filter out one interp	pretation (i.e.
⊳ Idea: Integrate	e variables into PL <sub>NQ</sub>	(work backwa	rds from that)
▷ Logical System	$PL_{NQ}^{\ \nu} = PL_{NQ} + variables$	(Translate pronoun	s to variables)
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New Grammar in  $\mathcal{F}_2$  (Pronouns)

 $\rhd$  Definition  $% \mathcal{T}_{2}$  We have the following structural grammar rules in  $\mathcal{F}_{2}$ 

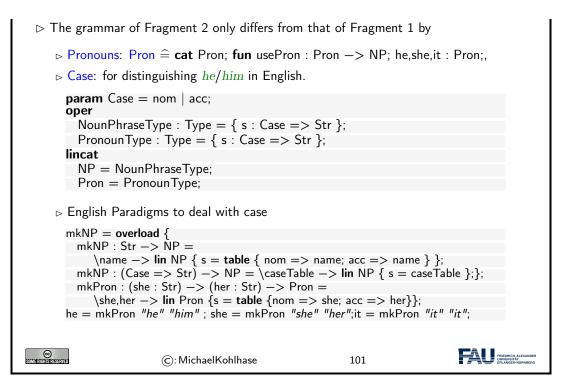
 $S1: S \rightarrow \mathsf{NP}, V^{i},$   $S2: S \rightarrow \mathsf{NP}, V^{t}, \mathsf{NP},$   $N1: \mathsf{NP} \rightarrow N_{\mathsf{pr}},$   $N2: \mathsf{NP} \rightarrow \mathsf{Pron},$  $N3: \mathsf{NP} \rightarrow \mathsf{the}, N,$ 





#### Predicate Logic with Variables (but no Quantifiers) $\triangleright$ Logical System $PL_{NQ}^{\mathcal{V}}$ : $PL_{NQ}^{\mathcal{V}}$ := $PL_{NQ}$ + variables $\triangleright$ Definition category $\mathcal{V} = \{X, Y, Z, X^1, X^2, \ldots\}$ of variables (allow variables wherever individual constants were allowed) $\triangleright$ Definition Model $\mathcal{M} = \langle \mathcal{D}, \mathcal{I} \rangle$ (need to evaluate variables) $\triangleright$ variable assignment: $\varphi : \mathcal{V}_{\iota} \rightarrow \mathcal{D}$ $\triangleright$ evaluation function: $\mathcal{I}_{\varphi}(X) = \varphi(X)$ (defined like $\mathcal{I}$ elsewhere) $\triangleright$ call $\mathbf{A} \in wff_{o}(\Sigma, \mathcal{V}_{\mathcal{T}})$ valid in $\mathcal{M}$ under $\varphi$ , iff $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{T}$ , $\triangleright$ call $\mathbf{A} \in wff_o(\Sigma, \mathcal{V}_T)$ satisfiable in $\mathcal{M}$ , iff there is a variable assignment $\varphi$ , such that $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{T}$ FRIEDRICH-ALE (C): MichaelKohlhase 100

Implementing Fragment 2 in GF



#### 6.2 A Tableau Calculus for PLNQ with Free Variables

The main idea here is to extend the fragment of first-order logic we use as a model for natural language to include free variables, and assume that pronouns like he, she, it, and they are translated to distinct free variables – i.e. every occurrance of a pronoun to a new variable. Note that we do not allow quantifiers yet – that will come in , as quantifiers will pose new problems, and we can already solve some linguistically interesting problems without them.

To allow for world knowledge, we generalize the notion of an initial tableau. Instead of allowing only the initial signed formula at the root node, we allow a linear tree whose nodes are labeled with signed formulae representing the world knowledge. As the world knowledge resides in the initial tableau (intuitively before all input), we will also speak of background knowledge.

We will use free variables for two purposes in our new fragment. Free variables in the input will stand for pronouns, their value will be determined by random instantiation. Free variables in the world knowledge allow us to express schematic knowledge. For instance, if we want to express Humans don't bite dogs., then we can do this by the formula  $\operatorname{human}(X) \wedge \operatorname{dog}(Y) \Rightarrow \neg \operatorname{bites}(X, Y)$ .

Of course we will have to extend our tableau calculus with new inference rules for the new language capabilities.

#### 6.2.1 Calculi for Automated Theorem Proving: Analytical Tableaux

In this section we will introduce tableau calculi for propositional logics. To make the reasoning procedure more interesting, we will use first-order predicate logic without variables, function symbols and quantifiers as a basis. This logic (we will call it  $PL_{NQ}$ ) allows us express simple natural language sentences and to re-use our grammar for experimentation, without introducing the whole complications of first-order inference.

The logic  $PL_{NQ}$  is equivalent to propositional logic in expressivity: atomic formulae take the role of propositional variables.

Instead of deducing new formulae from axioms (and hypotheses) and hoping to arrive at the desired theorem, we try to deduce a contradiction from the negation of the theorem. Indeed, a formula **A** is valid, iff  $\neg$ **A** is unsatisfiable, so if we derive a contradiction from  $\neg$ **A**, then we

have proven **A**. The advantage of such "test-calculi" (also called negative calculi) is easy to see. Instead of finding a proof that ends in **A**, we have to find any of a broad class of contradictions. This makes the calculi that we will discuss now easier to control and therefore more suited for mechanization.

## 6.2.1.1 Analytical Tableaux

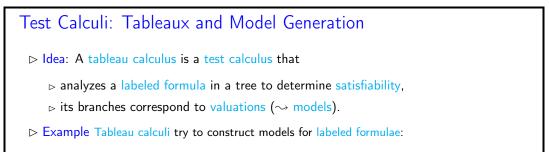
Before we can start, we will need to recap some nomenclature on formulae.

Recap: Ato	ms and Literals		
	We call a formula atomic, or an atom rmula complex, iff it is not atomic.	, iff it does not contain	connectives.
	We call a pair $\mathbf{A}^{\alpha}$ a labeled formula positive if $\alpha = T$ , else negative) litera		ed atom $\mathbf{A}^{lpha}$
	o satisfy a formula, we make it "true the truth value $lpha.$	". To satisfy a labeled	formula $\mathbf{A}^{lpha}$ ,
▷ Definition (or partner	For a literal $\mathbf{A}^{lpha}$ , we call the literal iteral).	$\mathbf{A}^{\beta}$ with $\alpha \neq \beta$ the op	posite literal
▷ Definition	Let $\Phi$ be a set of formulae, then we	use $\Phi^{\alpha} := \{ \mathbf{A}^{\alpha}   \mathbf{A} \in \Phi \}$	
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The idea about literals is that they are atoms (the simplest formulae) that carry around their intended truth value.

Now we will also review some propositional identities that will be useful later on. Some of them we have already seen, and some are new. All of them can be proven by simple truth table arguments.

Alternative Definition: Literals	5		
▷ Note: Literals are often defined without recurring to labeled formulae:			
▷ Definition A literal is an atoms A (positive literal) or negated atoms ¬A (negative literal). A and ¬A are opposite literals			
Note: This notion of literal is equivalent to the labeled formula-notion of literal, but does not generalize as well to logics with more truth values.			
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#### 6.2. A TABLEAU CALCULUS FOR PLNQ WITH FREE VARIABLES

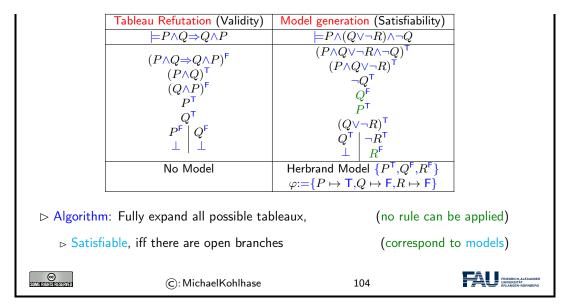
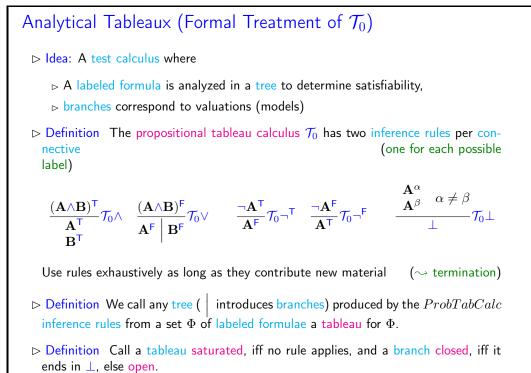


Tableau calculi develop a formula in a tree-shaped arrangement that represents a case analysis on when a formula can be made true (or false). Therefore the formulae are decorated with exponents that hold the intended truth value.

On the left we have a refutation tableau that analyzes a negated formula (it is decorated with the intended truth value F). Both branches contain an elementary contradiction  $\bot$ .

On the right we have a model generation tableau, which analyzes a positive formula (it is decorated with the intended truth value T. This tableau uses the same rules as the refutation tableau, but makes a case analysis of when this formula can be satisfied. In this case we have a closed branch and an open one, which corresponds a model).

Now that we have seen the examples, we can write down the tableau rules formally.



▷ Idea: Open branches in saturated tableaux yield models.					
▷ Definition A is a $\mathcal{T}_0$ -theorem ( $\vdash_{\mathcal{T}_0} A$ ), iff there is a closed tableau with $A^F$ at the root.					
$\Phi \subseteq wff_o(\mathcal{V}_o)$ derivation relation $\mathbf{A}$ in $\mathcal{T}_0$ ( $\Phi \vdash_{\mathcal{T}_0} \mathbf{A}$ ), iff there is a closed tableau starting with $\mathbf{A}^{F}$ and $\Phi^{T}$ .					
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These inference rules act on tableaux have to be read as follows: if the formulae over the line appear in a tableau branch, then the branch can be extended by the formulae or branches below the line. There are two rules for each primary connective, and a branch closing rule that adds the special symbol  $\perp$  (for unsatisfiability) to a branch.

We use the tableau rules with the convention that they are only applied, if they contribute new material to the branch. This ensures termination of the tableau procedure for propositional logic (every rule eliminates one primary connective).

Definition We will call a closed tableau with the signed formula  $\mathbf{A}^{\alpha}$  at the root a tableau refutation for  $\mathcal{A}^{\alpha}$ .

The saturated tableau represents a full case analysis of what is necessary to give  $\mathbf{A}$  the truth value  $\alpha$ ; since all branches are closed (contain contradictions) this is impossible.

Definition We will call a tableau refutation for  $\mathbf{A}^{\mathsf{F}}$  a tableau proof for  $\mathbf{A}$ , since it refutes the possibility of finding a model where  $\mathbf{A}$  evaluates to  $\mathsf{F}$ . Thus  $\mathbf{A}$  must evaluate to  $\mathsf{T}$  in all models, which is just our definition of validity.

Thus the tableau procedure can be used as a calculus for propositional logic. In contrast to the propositional Hilbert calculus it does not prove a theorem  $\mathbf{A}$  by deriving it from a set of axioms, but it proves it by refuting its negation. Such calculi are called <u>negative</u> or <u>test calculi</u>. Generally negative calculi have computational advantages over positive ones, since they have a built-in sense of direction.

We have rules for all the necessary connectives (we restrict ourselves to  $\wedge$  and  $\neg$ , since the others can be expressed in terms of these two via the propositional identities above. For instance, we can write  $\mathbf{A} \vee \mathbf{B}$  as  $\neg (\neg \mathbf{A} \wedge \neg \mathbf{B})$ , and  $\mathbf{A} \Rightarrow \mathbf{B}$  as  $\neg \mathbf{A} \vee \mathbf{B}$ ,....)

We now look at a formulation of propositional logic with fancy variable names. Note that loves (mary, bill) is just a variable name like P or X, which we have used earlier.

A Valid Real-World Example

▷ Example If Mary loves Bill and John loves Mary, then John loves Mary

```
 \begin{array}{c} (\text{loves}(\text{mary},\text{bill})\wedge\text{loves}(\text{john},\text{mary}) \Rightarrow \text{loves}(\text{john},\text{mary}))^{\text{F}} \\ \neg (\neg \neg (\text{loves}(\text{mary},\text{bill})\wedge\text{loves}(\text{john},\text{mary}))\wedge \neg\text{loves}(\text{john},\text{mary}))^{\text{F}} \\ (\neg \neg (\text{loves}(\text{mary},\text{bill})\wedge\text{loves}(\text{john},\text{mary}))\wedge \neg\text{loves}(\text{john},\text{mary}))^{\text{T}} \\ \neg \neg (\text{loves}(\text{mary},\text{bill})\wedge\text{loves}(\text{john},\text{mary}))^{\text{T}} \\ \neg (\text{loves}(\text{mary},\text{bill})\wedge\text{loves}(\text{john},\text{mary}))^{\text{F}} \\ (\text{loves}(\text{mary},\text{bill})\wedge\text{loves}(\text{john},\text{mary}))^{\text{T}} \\ \neg \text{loves}(\text{john},\text{mary})^{\text{T}} \\ \text{loves}(\text{john},\text{mary})^{\text{T}} \\ \text{loves}(\text{john},\text{mary})^{\text{F}} \\ \end{array}
```

This is a closed tableau, so the loves(mary, bill) $\land$ loves(john, mary) $\Rightarrow$ loves(john, mary) is a  $\mathcal{T}_0$ -theorem.

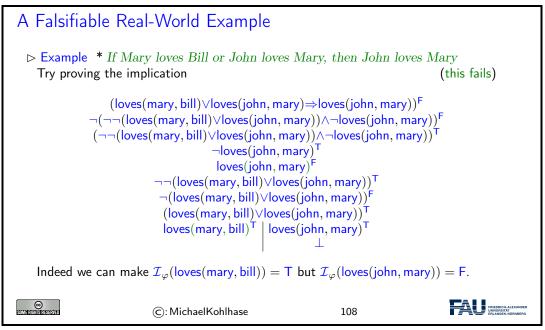
#### 6.2. A TABLEAU CALCULUS FOR PLNQ WITH FREE VARIABLES

As we will see, $\mathcal{T}_0$ is sound and complete, so			
	loves(mary, bill)∧loves(john, ma	ry)⇒loves(john, mar	<b>y</b> )
is valid.			
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We could have used the unsatisfiability theorem () here to show that If Mary loves Bill and John loves Mary entails John loves Mary. But there is a better way to show entailment: we directly use derivability in  $\mathcal{T}_0$ 

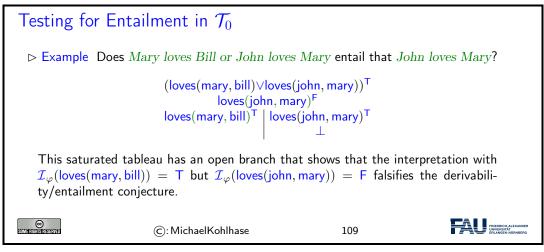
Deriving En	tailment in $\mathcal{T}_0$		
⊳ Example M Mary	Aary loves Bill and John loves M loves(mary,bi loves(john,mai loves(john,mai 	II) <sup>⊤</sup> ry) <sup>⊤</sup>	that John loves
	ed tableau, so the {loves(mary, bill) is sound and complete we have	,loves(john, mary)}⊦	$\tau_{\mathcal{T}_0}$ loves(john, mary),
	{loves(mary, bill),loves(john, mar	y)}⊨loves(john, mar	<b>y</b> )
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Note: We can also use the tableau calculus to try and show entailment (and fail). The nice thing is that the failed proof, we can see what went wrong.

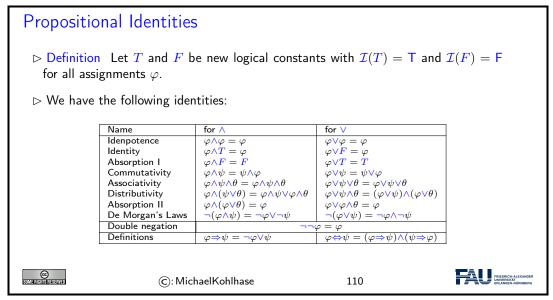


Obviously, the tableau above is saturated, but not closed, so it is not a tableau proof for our initial entailment conjecture. We have marked the literal on the open branch green, since they allow us to read of the conditions of the situation, in which the entailment fails to hold. As we intuitively argued above, this is the situation, where Mary loves Bill. In particular, the open branch gives us a variable assignment (marked in green) that satisfies the initial formula. In this case, *Mary loves Bill*, which is a situation, where the entailment fails.

Again, the derivability version is much simpler:



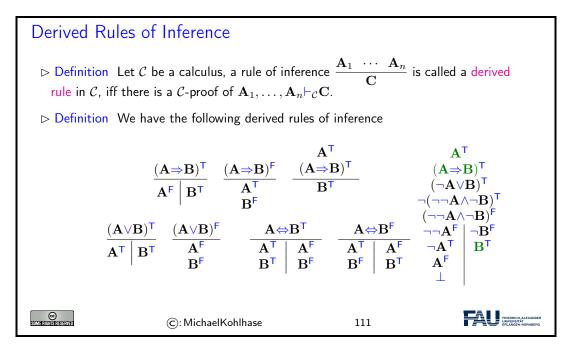
#### 6.2.1.2 Practical Enhancements for Tableaux



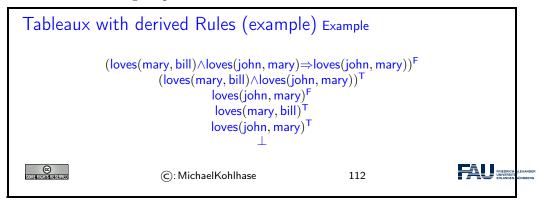
we have seen in the examples above that while it is possible to get by with only the connectives  $\lor$  and  $\neg$ , it is a bit unnatural and tedious, since we need to eliminate the other connectives first. in this section, we will make the calculus less frugal by adding rules for the other connectives, without losing the advantage of dealing with a small calculus, which is good making statements about the calculus.

the main idea is to add the new rules as derived rules, i.e. inference rules that only abbreviate deductions in the original calculus. generally, adding derived inference rules does not change the derivability relation of the calculus, and is therefore a safe thing to do. In particular, we will add the following rules to our tableau system.

We will convince ourselves that the first rule is a derived rule, and leave the other ones as an exercise.



With these derived rules, theorem proving becomes quite efficient. With these rules, the tableau () would have the following simpler form:



Another thing that was awkward in () was that we used a proof for an implication to prove logical consequence. Such tests are necessary for instance, if we want to check consistency or informativity of new sentences. Consider for instance a discourse  $\Delta = \mathbf{D}^1, \ldots, \mathbf{D}^n$ , where *n* is large. To test whether a hypothesis  $\mathcal{H}$  is a consequence of  $\Delta$  ( $\Delta \models \mathbf{H}$ ) we need to show that  $\mathbf{C}:=(\mathbf{D}^1 \land \ldots \land \mathbf{D}^n \Rightarrow \mathbf{H})$  is valid, which is quite tedious, since  $\mathcal{C}$  is a rather large formula, e.g. if  $\Delta$  is a 300 page novel. Moreover, if we want to test entailment of the form ( $\Delta \models \mathbf{H}$ ) often, – for instance to test the informativity and consistency of every new sentence  $\mathbf{H}$ , then successive  $\Delta$ s will overlap quite significantly, and we will be doing the same inferences all over again; the entailment check is not incremental.

Fortunately, it is very simple to get an incremental procedure for entailment checking in the model-generation-based setting: To test whether  $\Delta \models \mathbf{H}$ , where we have interpreted  $\Delta$  in a model generation tableau  $\mathcal{T}$ , just check whether the tableau closes, if we add  $\neg \mathbf{H}$  to the open branches. Indeed, if the tableau closes, then  $\Delta \wedge \neg \mathbf{H}$  is unsatisfiable, so  $\neg(\Delta \wedge \neg \mathbf{H})$  is valid, but this is equivalent to  $\Delta \Rightarrow \mathbf{H}$ , which is what we wanted to show.

#### Example

Consider for instance the following entailment in natural language.

Mary loves Bill. John loves Mary = John loves Mary

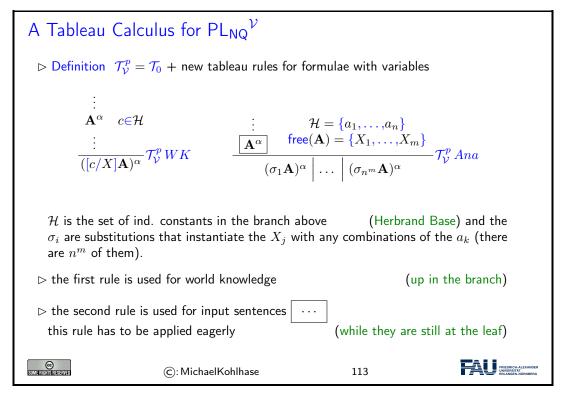
We obtain the tableau

```
\begin{array}{l} \operatorname{loves}(\operatorname{mary},\operatorname{bill})^{\mathsf{T}}\\ \operatorname{loves}(\operatorname{john},\operatorname{mary})^{\mathsf{T}}\\ (\neg \operatorname{loves}(\operatorname{john},\operatorname{mary}))^{\mathsf{T}}\\ \operatorname{loves}(\operatorname{john},\operatorname{mary})^{\mathsf{F}}\\ \bot \end{array}
```

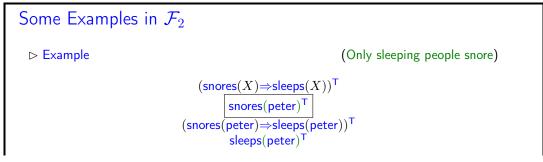
which shows us that the conjectured entailment relation really holds.

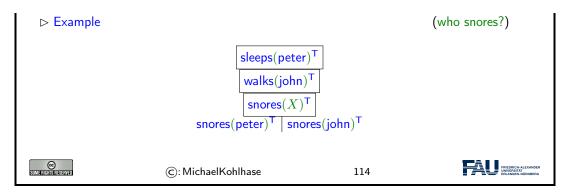
Excursion: We will discuss the properties of propositional tableaux inthe appendix.

## 6.2.2 A Tableau Calculus for PLNQ with Free Variables



Let us look at two examples: To understand the role of background knowledge we interpret Peter snores with respect to the knowledge that Only sleeping people snore.

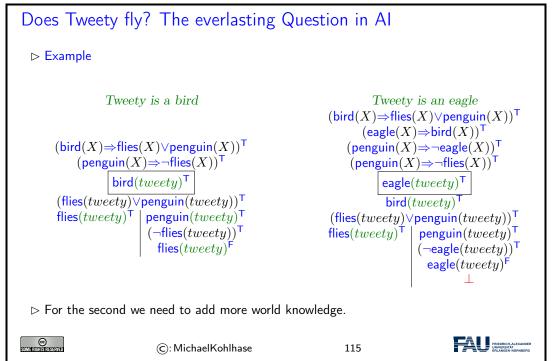




The background knowledge is represented in the schematic formula in the first line of the tableau. Upon receiving the input, the tableau instantiates the schema to line three and uses the chaining rule from the derived tableaux rules to derive the fact that Peter must sleep.

The third input formula contains a free variable, which is instantiated by all constants in the Herbrand base (two in our case). This gives rise to two models that correspond to the two readings of the discourse.

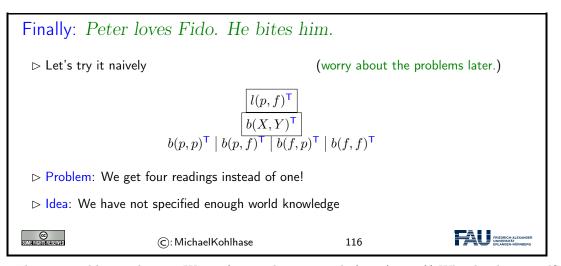
Let us now look at an example with more realistic background knowledge. Say we know that birds fly, if they are not penguins. Furthermore, eagles and penguins are birds, but eagles are not penguins. Then we can answer the classic question *Does Tweety fly?* by the following two tableaux.



# 6.2.3 Case Study: Peter loves Fido, even though he sometimes bites him

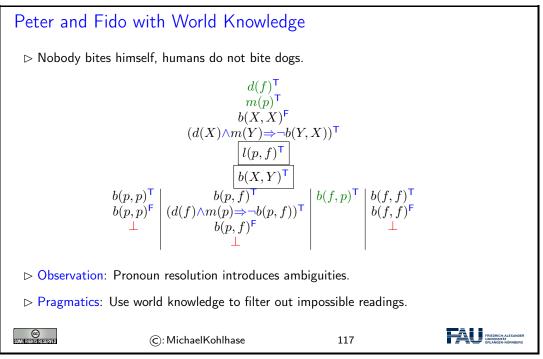
Let us now return to the motivating example from the introduction, and see how our system fares with it (this allows us to test our computational/linguistic theory). We will do this in a completely naive manner and see what comes out.

The first problem we run into immediately is that we do not know how to cope with even though and sometimes, so we simplify the discourse to Peter loves Fido and he bites him.



The next problem is obvious: We get four readings instead of one (or two)! What has happened? If we look at the models, we see that we did not even specify the background knowledge that was supposed filter out the one intended reading.

We try again with the additional knowledge that Nobody bites himself and Humans do not bite dogs.



We observe that our extended tableau calculus was indeed able to handle this example, if we only give it enough background knowledge to act upon.

But the world knowledge we can express in  $PL_{NQ}^{\nu}$  is very limited. We can say that humans do not bite dogs, but we cannot provide the background knowledge to understand a sentence like *Peter was late for class today, the car had a flat tire,* which needs knowledge like *Every car has wheels, which have a tire, and if a tire is flat, the car breaks down, which is outside the realm of*  $PL_{NQ}^{\nu}$ .

# 6.2.4 The Computational Role of Ambiguities

In the case study, we have seen that pronoun resolution introduces ambiguities, and we can use

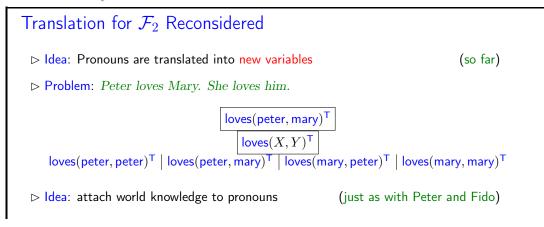
world knowledge to filter out impossible readings. Generally in the traditional waterfall model of language processing – which posits that NL understanding is a process that analyzes the input in stages: syntax, semantics composition, pragmatics – every processing stage introduces ambiguities that need to be resolved in this stage or later.

The computational Role of Ambiguities				
<ul> <li>Observation: (in the traditional waterfall model)</li> <li>Every processing stage introduces ambiguities that need to be resolved.</li> </ul>				
⊳ Syntax: e.g. Peter chased the man in the red sports	ts car (attachment)			
⊳ Semantics: e.g. Peter went to the bank	(lexical)			
▶ <b>Pragmatics: e.g.</b> Two men carried two bags	(collective vs. distributive)			
▷ Question: Where does pronoun-ambiguity belong? (much less clear)				
$\triangleright$ Answer: we have freedom to choose	▷ Answer: we have freedom to choose			
1. resolve the pronouns in the syntax	(generic waterfall model)			
$\rightsquigarrow$ multiple syntactic representations	(pragmatics as filter)			
2. resolve the pronouns in the pragmatics	(our model here)			
$\sim$ need underspecified syntactic representation	ions (e.g. variables)			
ightarrow pragmatics needs ambiguity treatment	(e.g. tableaux)			
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For pronoun ambiguities, this is much less clear. In a way we have the freedom to choose. We can

- 1. resolve the pronouns in the syntax as in the generic waterfall model, then we arrive at multiple syntactic representations, and can use pragmatics as filter to get rid of unwanted readings
- 2. resolve the pronouns in the pragmatics (our model here) then we need underspecified syntactic representations (e.g. variables) and pragmatics needs ambiguity treatment (in our case the tableaux).

We will continue to explore the second alternative in more detail, and refine the approach. One of the advantages of treating the anaphoric ambiguities in the syntax is that syntactic agreement information like gender can be used to disambiguate. Say that we vary the example from section ?? to Peter loves Mary. She loves him..



$\triangleright$ use the wor	$_{ m \vartriangleright}$ use the world knowledge to distinguish (linguistic) gender by predicates masc and fem				
⊳ Idea: attach v	▷ Idea: attach world knowledge to pronouns (just as with Peter and Fido)				
⊳ Problem: pro	perties of				
<ul> <li>proper names are given in the model,</li> <li>pronouns must be given by the syntax/semantics interface</li> </ul>					
$\triangleright$ In particular: How to generate loves $(X, Y) \land masc(X) \land fem(Y)$ compositionally?					
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The tableau (over)-generates the full set of pronoun readings. At first glance it seems that we can fix this just like we did in section ?? by attaching world knowledge to pronouns, just as with Peter and Fido. Then we could use the world knowledge to distinguish gender by predicates, say masc and fem.

But if we look at the whole picture of building a system, we can see that this idea will not work. The problem is that properties of proper names like Fido are given in the background knowledge, whereas the relevant properties of pronouns must be given by the syntax/semantics interface. Concretely, we would need to generate  $loves(X, Y) \land masc(X) \land fem(Y)$  for She loves him. How can we do such a thing compositionally?

Again we basically have two options, we can either design a clever syntax/semantics interface, or we can follow the lead of Montague semantics and extend the logic, so that compositionality becomes simpler to achieve. We will explore the latter option in the next section. The problem we stumbled across in the last section is how to associate certain properties (in this case agreement information) with variables compositionally. Fortunately, there is a ready-made logical theory for it. Sorted first-order logic. Actually there are various sorted first-order logics, but we will only need the simplest one for our application at the moment.

Sorted first-order logic extends the language with a set S of ofsorts  $\mathbb{A}, \mathbb{B}, \mathbb{C}, \ldots$ , which are just special symbols that are attached to all terms in the language.

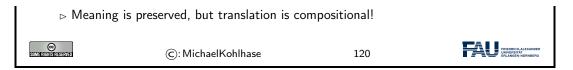
Syntactically, all constants, and variables are assigned sorts, which are annotated in the lower index, if they are not clear from the context. Semantically, the universe  $\mathcal{D}_{\iota}$  is subdivided into subsets  $\mathcal{D}_{\mathbb{A}} \subseteq \mathcal{D}_{\iota}$ , which denote the objects of sort  $\mathbb{A}$ ; furthermore, the interpretation function  $\mathcal{I}$  and variable assignment  $\varphi$  have to be well sorted. Finally, on the calculus level, the only change we have to make is to restrict instantiation to well-sorted substitutions:

# Sorts refine World Categories

- $\triangleright$  Definition (in our case  $PL_{S}^{1}$ ) assume a set of ofsorts  $S:=\{\mathbb{A},\mathbb{B},\mathbb{C},\ldots\}$ , annotate every syntactic and semantic structure with them. Make all constructions and operations well-worted:
  - $\triangleright$  Syntax: variables and constants are sorted  $X_{\mathbb{A}}, Y_{\mathbb{B}}, Z_{\mathbb{C}_1}^1, \ldots, a_{\mathbb{A}}, b_{\mathbb{A}}, \ldots$
  - $\triangleright \text{ Semantics: subdivide the Universe } \mathcal{D}_{\iota} \text{ into subsets } \mathcal{D}_{\mathbb{A}} \subseteq \mathcal{D}_{\iota}$ Interpretation  $\mathcal{I}$  and variable assignment  $\varphi$  have to be well-sorted.  $(\mathcal{I}(a_{\mathbb{A}})), \varphi((X_{\mathbb{A}})) \in \mathcal{D}_{\mathbb{A}}$
  - $\triangleright$  Calculus: substitutions must be well-sorted  $[a_{\mathbb{A}}/X_{\mathbb{A}}]$  OK,  $[a_{\mathbb{A}}/X_{\mathbb{B}}]$  not.

#### ▷ Observation: Sorts do not add expressivity in principle (just practically)

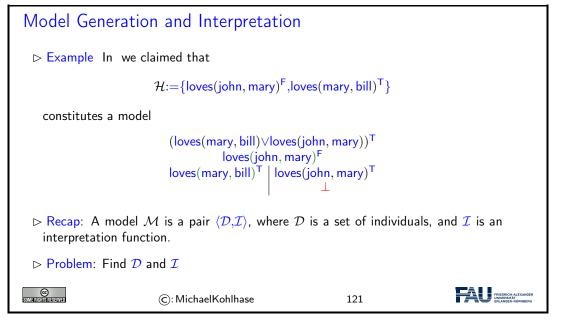
- $\succ \text{ Translate } R(X_{\mathbb{A}}) \land \neg P(Z_{\mathbb{C}}) \text{ to } \mathcal{R}_{\mathbb{A}}(X) \land \mathcal{R}_{\mathbb{C}}(Z) \Rightarrow R(X) \land \neg P(Z) \Rightarrow \text{ in world knowl-edge.}$
- $\vdash \text{Translate } R(X_{\mathbb{A}}) \land \neg P(Z_{\mathbb{C}}) \text{ to } \mathcal{R}_{\mathbb{A}}(X) \land \mathcal{R}_{\mathbb{C}}(Z) \land R(X \land Y) \land \neg P(Z) \text{ in input.}$



# 6.3 Tableaux and Model Generation

## 6.3.1 Tableau Branches and Herbrand Models

We have claimed above that the set of literals in open saturated tableau branches corresponds to a models. To gain an intuition, we will study our example above,



So the first task is to find a domain  $\mathcal{D}$  of interpretation. Our formula mentions Mary, John, and Bill, which we assume to refer to distinct individuals so we need (at least) three individuals in the domain; so let us take  $\mathcal{D}:=\{A,B,C\}$  and fix  $\mathcal{I}(\text{mary}) = A$ ,  $\mathcal{I}(\text{bill}) = B$ ,  $\mathcal{I}(\text{john}) = C$ .

So the only task is to find a suitable interpretation for the predicate loves that makes loves (john, mary) false and loves (mary, bill) true. This is simple: we just take  $\mathcal{I}(\text{loves}) = \{\langle A, B \rangle\}$ . Indeed we have

 $\mathcal{I}_{\varphi}(\text{loves}(\text{mary}, \text{bill}) \lor \text{loves}(\text{john}, \text{mary})) = \mathsf{T}$ 

but  $\mathcal{I}_{\varphi}(\text{loves}(\text{john}, \text{mary})) = \mathsf{F}$  according to the rules in.

# Model Generation and Models

 $\triangleright \text{ Idea: Choose the Universe } \mathcal{D} \text{ as the set } \Sigma_0^f \text{ of constants, choose } \mathcal{I}(=) \text{Id}_{\Sigma_0^f} \text{, interpret} \\ p \in \Sigma_k^p \text{ via } \mathcal{I}(p) := \{ \langle a_1, \dots, a_k \rangle | p(a_1, \dots, a_k) \in \mathcal{H} \}.$ 

 $\triangleright$  Definition We call a model a Herbrand model, iff  $\mathcal{D} = \Sigma_0^f$  and  $\mathcal{I} = \mathsf{Id}_{\Sigma_0^f}$ .

 $\triangleright$  Assertion Let  $\mathcal{H}$  be a set of atomic formulae, then setting

 $\mathcal{I}(p) := \{ \langle a_1, \dots, a_k \rangle | p(a_1, \dots, a_k) \in \mathcal{H} \}$ 

yields a Herbrand Model that satisfies  $\mathcal{H}$ .

(proof trivial)

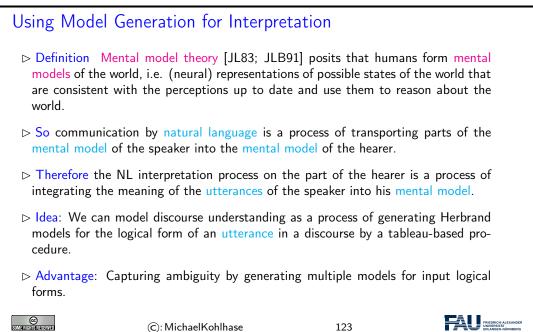
	Let $\mathcal{H}$ be a consistent (i.e. $\nabla_c$ holds nd Model that satisfies $\mathcal{H}$ .	) set of atomic forn	nulae, then there $(take \ \mathcal{H}^{T})$
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In particular, the literals of an open saturated tableau branch  $\mathcal{B}$  are a Herbrand model  $\mathcal{H}$ , as we have convinced ourselves above. By inspection of the inference rules above, we can further convince ourselves, that  $\mathcal{H}$  satisfies all formulae on  $\mathcal{B}$ . We must only check that if  $\mathcal{H}$  satisfies the succedents of the rule, then it satisfies the antecedent (which is immediate from the semantics of the principal connectives).

In particular,  $\mathcal{H}$  is a model for the root formula of the tableau, which is on  $\mathcal{B}$  by construction. So the tableau procedure is also a procedure that generates explicit (Herbrand) models for the root literal of the tableau. Every branch of the tableau corresponds to a (possibly) different Herbrand model. We will use this observation in the next section in an application to natural language semantics.

# 6.3.2 Using Model Generation for Interpretation

We will now use model generation directly as a tool for discourse interpretation.



# Tableau Machine

Definition The tableau machine is an inferential cognitive model for incremental NLUnatural language understanding that implements mental model theory via tableau-based generation.

It iterates the following process for every input sentence staring with the empty tableau:

1. add the logical form of the input sentence  $S_i$  to the selected branch,

- 2. perform tableau inferences below  ${\cal S}_i$  until saturated or some resource criterion is met
- 3. if there are open branches choose a "preferred branch", otherwise backtrack to previous tableau for  $S_j$  with j < i and open branches, then re-process  $S_{i+1}, \ldots, S_i$  if possible, else fail.

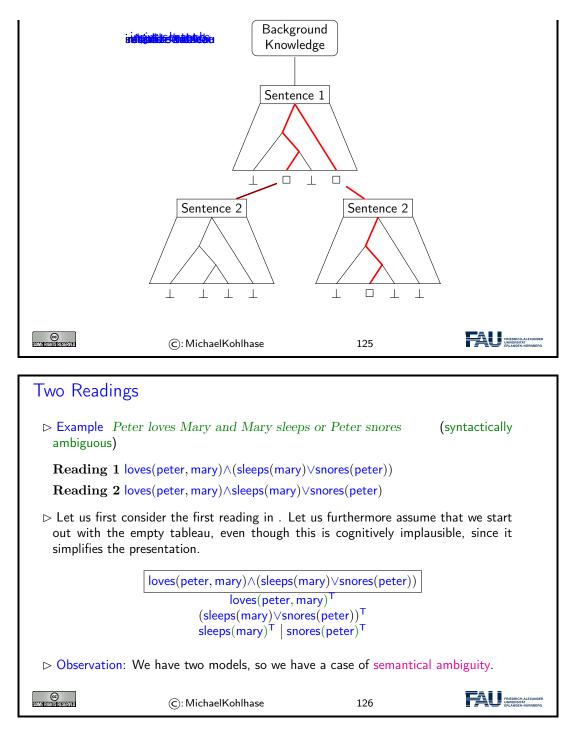
▷ the literals augment (from the discour ▷ machine answers	,	(resource-bound	d was reached) odel ⊨ query?)
▷ machine answers ▷ model generation r		(guided by resources a	
▷ theorem proving mode		( $\Box$ for side conditions; using	tableau rules)
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Concretely, we treat discourse understanding as an online process that receives as input the logical forms of the sentences of the discourse one by one, and maintains a tableau that represents the current set of alternative models for the discourse. Since we are interested in the internal state of the machine (the current tableau), we do not specify the output of the tableau machine. We also assume that the tableau machine has a mechanism for choosing a preferred model from a set of open branches and that it maintains a set of deferred branches that can be re-visited, if extension of the preferred model fails.

Upon input, the tableau machine will append the given logical form as a leaf to the preferred branch. (We will mark input logical forms in our tableaux by enclosing them in a box.) The machine then saturates the current tableau branch, exploring the set of possible models for the sequence of input sentences. If the subtableau generated by this saturation process contains open branches, then the machine chooses one of them as the preferred model, marks some of the other open branches as deferred, and waits for further input. If the saturation yields a closed sub-tableau, then the machine backtracks, i.e. selects a new preferred branch from the deferred ones, appends the input logical form to it, saturates, and tries to choose a preferred branch. Backtracking is repeated until successful, or until some termination criterion is met, in which case discourse processing fails altogether.

# The Tableau Machine in Action

▷ Example The tableau machine in action on two sentences.



We see that model generation gives us two models; in both Peter loves Mary, in the first, Mary sleeps, and in the second one Peter snores. If we get a logically different input, e.g. the second reading in , then we obtain different models.

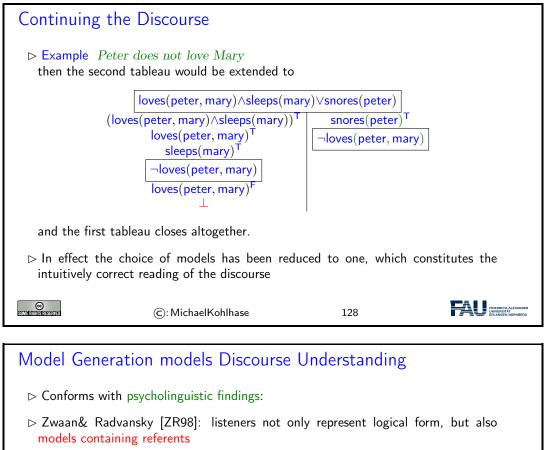
The other Reading

#### 6.3. TABLEAUX AND MODEL GENERATION



In a discourse understanding system, both readings have to considered in parallel, since they pertain to a genuine ambiguity. The strength of our tableau-based procedure is that it keeps the different readings around, so they can be acted upon later.

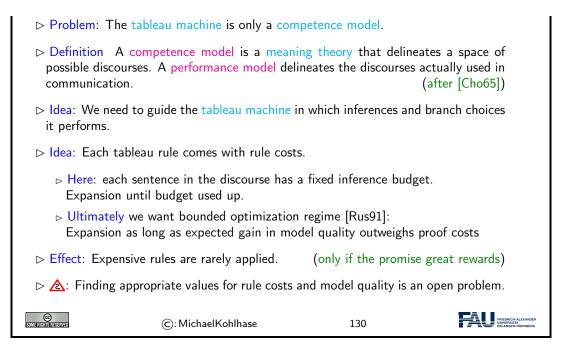
Note furthermore, that the overall (syntactical and semantic ambiguity) is not as bad as it looks: the left models of both readings are identical, so we only have three semantic readings not four.



- ▷ deVega [de 95]: online, incremental process
- ▷ Singer [Sin94]: enriched by background knowledge
- $\rhd$  Glenberg et al. [GML87]: major function is to provide basis for anaphor resolution

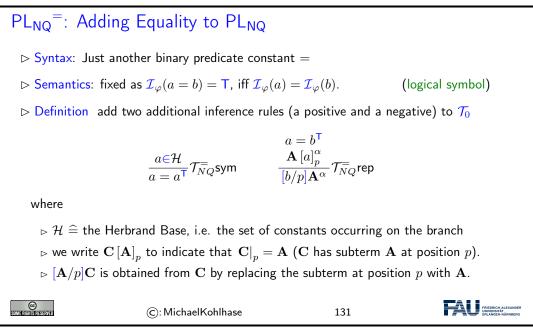
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Towards a Performance Model for NLU



# 6.3.3 Adding Equality to PLNQ or Fragment 1

We will now extend  $PL_{NQ}$  by equality, which is a very important relation in natural language. Generally, extending a logic with a new logical constant – equality is counted as a logical constant, since it semantics is fixed in all models – involves extending all three components of the logical system: the language, semantics, and the calculus.



If we simplify the translation of definite descriptions, so that the phrase the teacher is translates to a concrete individual constant, then we can interpret (??) as (??).

Reading Comprehension Example: Mini TOEFL test

#### 6.3. TABLEAUX AND MODEL GENERATION

▷ Example If you hear/read Mary is the teacher. Peter likes the teacher., do you know whether Peter likes Mary?					
Idea: Interpret via theorem proving me	i tablau machine (interpreta ode.	tion mode) and test er	ntailment in		
to the tableau mac	$\label{eq:product} \begin{split} & \triangleright \mbox{ Interpretation: Feed } \Phi_1:=\mbox{mary} = \mbox{the tableau machine in turn.} \\ & \mbox{ to the tableau machine in turn.} \\ & \mbox{ Model generation tableau} \qquad \qquad$				
	mary = the_teadlikes(peter, the_tead				
⊳ Entailment Test: I	$\triangleright$ Entailment Test: label $\varphi$ :=likes(peter, mary) with F and saturate the tableau.				
$mary = the\_teacher^{T}$ $likes(peter, the\_teacher)^{T}$ $likes(peter, mary)^{F}$ $likes(peter, the\_teacher)^{F}$ $\bot$					
Indeed, it closes, so $\Phi_1, \Phi_2 \models \varphi$ .					
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86

# Chapter 7

# Pronouns and World Knowledge in First-Order Logic

# 7.1 First-Order Logic

First-order logic is the most widely used formal system for modelling knowledge and inference processes. It strikes a very good bargain in the trade-off between expressivity and conceptual and computational complexity. To many people first-order logic is "the logic", i.e. the only logic worth considering, its applications range from the foundations of mathematics to natural language semantics.

First-Order Predicate Logic (PL <sup>1</sup> )			
▷ Coverage: We can talk about	(All humans are mortal)		
▷ individual things and denote them by varial	bles or constants		
▷ properties of individuals,	(e.g. being human or mortal)		
▷ relations of individuals,	(e.g. <i>sibling_of</i> relationship)		
▷ functions on individuals,	(e.g. the $father\_of$ function)		
We can also state the existence of an individual with a certain property, or the universality of a property.			
$\triangleright$ But we cannot state assertions like			
$\triangleright$ There is a surjective function from the nu	atural numbers into the reals.		
First-Order Predicate Logic has many good pr compactness, unitary, linear unification,)	operties (complete calculi,		
ho But too weak for formalizing:	(at least directly)		
▷ natural numbers, torsion groups, calculus, $r$ ▷ generalized quantifiers (most, few,)			
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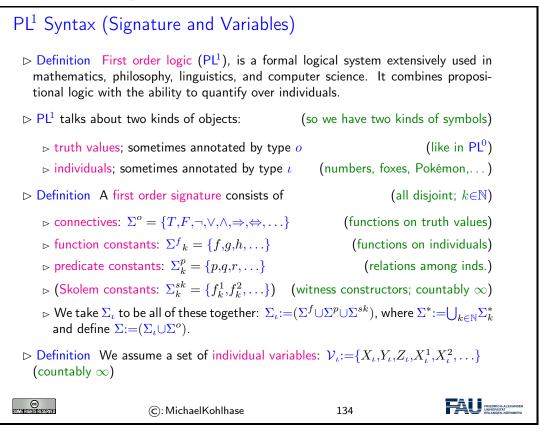
We will now introduce the syntax and semantics of first-order logic. This introduction differs from what we commonly see in undergraduate textbooks on logic in the treatment of substitutions in the presence of bound variables. These treatments are non-syntactic, in that they take the renaming of bound variables ( $\alpha$ -equivalence) as a basic concept and directly introduce captureavoiding substitutions based on this. But there is a conceptual and technical circularity in this approach, since a careful definition of  $\alpha$ -equivalence needs substitutions.

In this Section we follow Peter Andrews' lead from [And02] and break the circularity by introducing syntactic substitutions, show a substitution value lemma with a substitutability condition, use that for a soundness proof of  $\alpha$ -renaming, and only then introduce capture-avoiding substitutions on this basis. This can be done for any logic with bound variables, we go through the details for first-order logic here as an example.

## 7.1.1 First-Order Logic: Syntax and Semantics

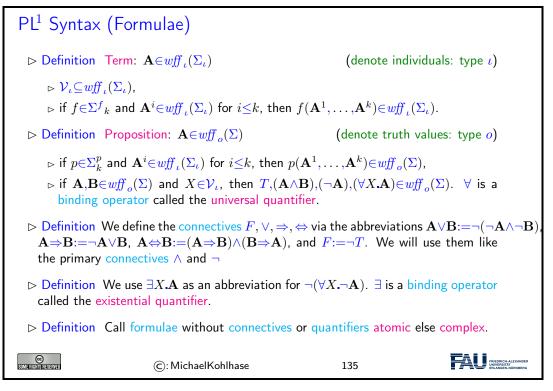
The syntax and semantics of first-order logic is systematically organized in two distinct layers: one for truth values (like in propositional logic) and one for individuals (the new, distinctive feature of first-order logic).

The first step of defining a formal language is to specify the alphabet, here the first-order signatures and their components.



We make the deliberate, but non-standard design choice here to include Skolem constants into the signature from the start. These are used in inference systems to give names to objects and construct witnesses. Other than the fact that they are usually introduced by need, they work exactly like regular constants, which makes the inclusion rather painless. As we can never predict how many Skolem constants we are going to need, we give ourselves countably infinitely many for every arity. Our supply of individual variables is countably infinite for the same reason.

The formulae of first-order logic is built up from the signature and variables as terms (to represent individuals) and propositions (to represent propositions). The latter include the propositional connectives, but also quantifiers.



Note: that we only need e.g. conjunction, negation, and universal quantification, all other logical constants can be defined from them (as we will see when we have fixed their interpretations).

Alternative Notations for Quantifiers				
	Here	Elsewhere		
	$\forall x.\mathbf{A}$	$ \begin{array}{c} \bigwedge x \mathbf{A}  (x) \mathbf{A} \\ \bigvee x \mathbf{A} \end{array} $		
	$\forall x.\mathbf{A} \\ \exists x.\mathbf{A}$	$\bigvee x.\mathbf{A}$		
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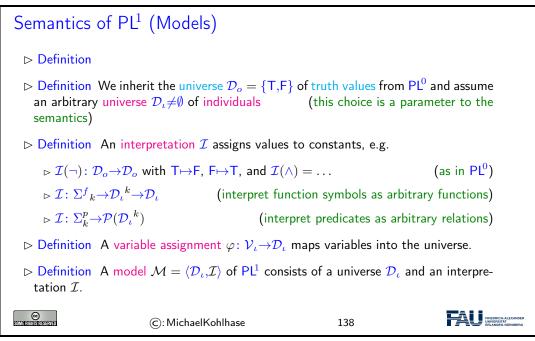
The introduction of quantifiers to first-order logic brings a new phenomenon: variables that are under the scope of a quantifiers will behave very differently from the ones that are not. Therefore we build up a vocabulary that distinguishes the two.

# Free and Bound Variables ▷ Definition We call an occurrence of a variable X bound in a formula A, iff it occurs in a sub-formula ∀X.B of A. We call a variable occurrence free otherwise. For a formula A, we will use BVar(A) (and free(A)) for the set of bound (free) variables of A, i.e. variables that have a free/bound occurrence in A. ▷ Definition We define the set free(A) of frees variable of a formula A:

$\begin{aligned} & free(X) := \{X\} \\ & free(f(\mathbf{A}_1, \dots, \mathbf{A}_n)) := \bigcup_{1 \leq i \leq n} free(\mathbf{A}_i) \\ & free(p(\mathbf{A}_1, \dots, \mathbf{A}_n)) := \bigcup_{1 \leq i \leq n} free(\mathbf{A}_i) \\ & free(\neg \mathbf{A}) := free(\mathbf{A}) \\ & free(\mathbf{A} \land \mathbf{B}) := (free(\mathbf{A}) \cup free(\mathbf{B})) \\ & free(\forall X.\mathbf{A}) := (free(\mathbf{A}) \setminus \{X\}) \end{aligned}$					
▷ Definition We call a formula A closed or ground, iff free(A) = $\emptyset$ . We call a closed proposition a sentence, and denote the set of all ground terms with $cwff_{\iota}(\Sigma_{\iota})$ and the set of sentences with $cwff_{o}(\Sigma_{\iota})$ .					
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We will be mainly interested in (sets of) sentences – i.e. closed propositions – as the representations of meaningful statements about individuals. Indeed, we will see below that free variables do not gives us expressivity, since they behave like constants and could be replaced by them in all situations, except the recursive definition of quantified formulae. Indeed in all situations where variables occur freely, they have the character of meta-variables, i.e. syntactic placeholders that can be instantiated with terms when needed in an inference calculus.

The semantics of first-order logic is a Tarski-style set-theoretic semantics where the atomic syntactic entities are interpreted by mapping them into a well-understood structure, a first-order universe that is just an arbitrary set.

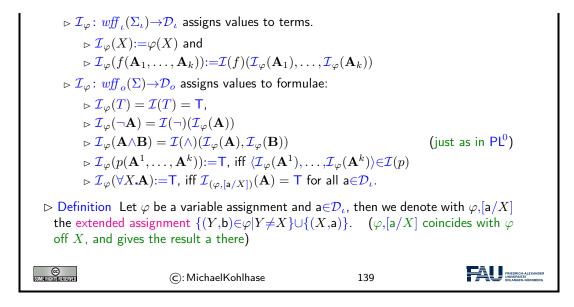


We do not have to make the universe of truth values part of the model, since it is always the same; we determine the model by choosing a universe and an interpretation function.

Given a first-order model, we can define the evaluation function as a homomorphism over the construction of formulae.

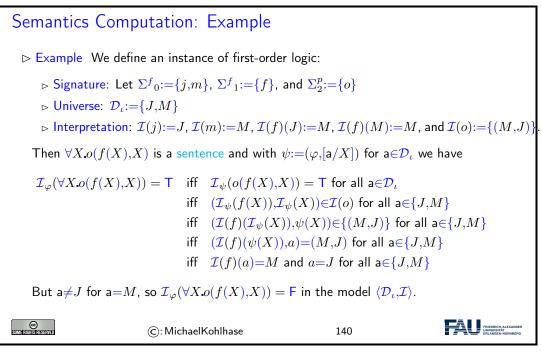
# Semantics of $PL^1$ (Evaluation)

 $\triangleright$  Definition Given a model  $\langle \mathcal{D}, \mathcal{I} \rangle$ , the value function  $\mathcal{I}_{\varphi}$  is recursively defined: (two parts: terms & propositions)



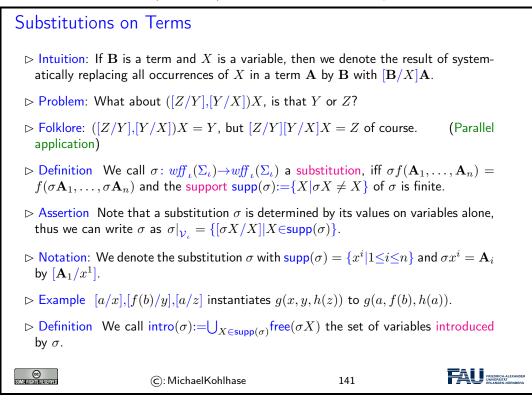
The only new (and interesting) case in this definition is the quantifier case, there we define the value of a quantified formula by the value of its scope – but with an extended variable assignment. Note that by passing to the scope  $\mathbf{A}$  of  $\forall x.\mathbf{A}$ , the occurrences of the variable x in  $\mathbf{A}$  that were bound in  $\forall x.\mathbf{A}$  become free and are amenable to evaluation by the variable assignment  $\psi:=(\varphi,[\mathbf{a}/X])$ . Note that as an extension of  $\varphi$ , the assignment  $\psi$  supplies exactly the right value for x in  $\mathbf{A}$ . This variability of the variable assignment in the definition value function justifies the somewhat complex setup of first-order evaluation, where we have the (static) interpretation function for the symbols from the signature and the (dynamic) variable assignment for the variables.

Note furthermore, that the value  $\mathcal{I}_{\varphi}(\exists x.\mathbf{A})$  of  $\exists x.\mathbf{A}$ , which we have defined to be  $\neg(\forall x.\neg \mathbf{A})$  is true, iff it is not the case that  $\mathcal{I}_{\varphi}(\forall x.\neg \mathbf{A}) = \mathcal{I}_{\psi}(\neg \mathbf{A}) = \mathsf{F}$  for all  $\mathbf{a} \in \mathcal{D}_{\iota}$  and  $\psi := (\varphi, [\mathbf{a}/X])$ . This is the case, iff  $\mathcal{I}_{\psi}(\mathbf{A}) = \mathsf{T}$  for some  $\mathbf{a} \in \mathcal{D}_{\iota}$ . So our definition of the existential quantifier yields the appropriate semantics.



#### 7.1.2 First-Order Substitutions

We will now turn our attention to substitutions, special formula-to-formula mappings that operationalize the intuition that (individual) variables stand for arbitrary terms.



The extension of a substitution is an important operation, which you will run into from time to time. Given a substitution  $\sigma$ , a variable x, and an expression  $\mathbf{A}$ ,  $\sigma$ ,  $[\mathbf{A}/x]$  extends  $\sigma$  with a new value for x. The intuition is that the values right of the comma overwrite the pairs in the substitution on the left, which already has a value for x, even though the representation of  $\sigma$  may not show it.

# Substitution Extension

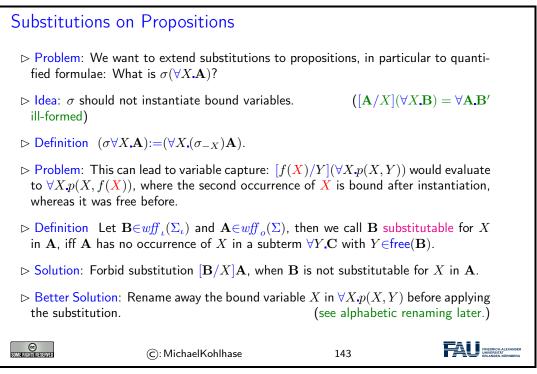
- $\triangleright$  Definition Let  $\sigma$  be a substitution, then we denote with  $\sigma$ ,  $[\mathbf{A}/X]$  the function  $\{(Y,\mathbf{B})\in\sigma|Y\neq X\}\cup\{(X,\mathbf{A})\}$ .  $(\sigma, [\mathbf{A}/X]$  coincides with  $\sigma$  off X, and gives the result  $\mathbf{A}$  there.)
- $\triangleright$  Note: If  $\sigma$  is a substitution, then  $\sigma$ ,  $[\mathbf{A}/X]$  is also a substitution.
- $\triangleright$  Definition If  $\sigma$  is a substitution, then we call  $\sigma$ ,  $[\mathbf{A}/X]$  the extension of  $\sigma$  by  $[\mathbf{A}/X]$ .
- $\triangleright$  We also need the dual operation: removing a variable from the support:
- $\triangleright$  Definition We can discharge a variable X from a substitution  $\sigma$  by  $\sigma_{-X} := \sigma, [X/X]$ .

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Note that the use of the comma notation for substitutions defined in is consistent with substitution extension. We can view a substitution [a/x], [f(b)/y] as the extension of the empty substitution (the identity function on variables) by [f(b)/y] and then by [a/x]. Note furthermore, that substitution extension is not commutative in general.

#### 7.1. FIRST-ORDER LOGIC

For first-order substitutions we need to extend the substitutions defined on terms to act on propositions. This is technically more involved, since we have to take care of bound variables.



Here we come to a conceptual problem of most introductions to first-order logic: they directly define substitutions to be capture-avoiding by stipulating that bound variables are renamed in the to ensure subsitutability. But at this time, we have not even defined alphabetic renaming yet, and cannot formally do that without having a notion of substitution. So we will refrain from introducing capture-avoiding substitutions until we have done our homework.

We now introduce a central tool for reasoning about the semantics of substitutions: the "substitution-value Lemma", which relates the process of instantiation to (semantic) evaluation. This result will be the motor of all soundness proofs on axioms and inference rules acting on variables via substitutions. In fact, any logic with variables and substitutions will have (to have) some form of a substitution-value Lemma to get the meta-theory going, so it is usually the first target in any development of such a logic. We establish the substitution-value Lemma for first-order logic in two steps, first on terms, where it is very simple, and then on propositions, where we have to take special care of substitutability.

Substitution Value Lemma for Terms  $\triangleright \text{ Assertion Let } \mathbf{A} \text{ and } \mathbf{B} \text{ be terms, then } \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) = \mathcal{I}_{\psi}(\mathbf{A}), \text{ where } \psi = \varphi, [\mathcal{I}_{\varphi}(\mathbf{B})/X].$   $\triangleright \text{ Proof: by induction on the depth of } \mathbf{A}:$  P.1.1 depth=0:  $\textbf{P.1.1.1 Then } \mathbf{A} \text{ is a variable (say } Y), \text{ or constant, so we have three cases}$   $\textbf{P.1.1.1 1 } \mathbf{A} = Y = X: \text{ then } \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) = \mathcal{I}_{\varphi}([\mathbf{B}/X]X) = \mathcal{I}_{\varphi}(\mathbf{B}) = \psi(X) = \mathcal{I}_{\psi}(X) = \mathcal{I}_{\psi}(\mathbf{A}).$ 

**P.1.1.1.1**  $\mathbf{A} = Y \neq X$ : then  $\mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) = \mathcal{I}_{\varphi}([\mathbf{B}/X]Y) = \mathcal{I}_{\varphi}(Y) = \varphi(Y) = \varphi(Y)$  $\psi(Y) = \mathcal{I}_{\psi}(Y) = \mathcal{I}_{\psi}(\mathbf{A}).$ **P.1.1.1.1 A** is a constant: analogous to the preceding case  $(Y \neq X)$ **P.1.1.1** This completes the base case (depth = 0). **P.1.1 depth** > 0: then  $\mathbf{A} = f(\mathbf{A}_1, \dots, \mathbf{A}_n)$  and we have  $\mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) = \mathcal{I}(f)(\mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}_1), \dots, \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}_n))$  $= \mathcal{I}(f)(\mathcal{I}_{\psi}(\mathbf{A}_1),\ldots,\mathcal{I}_{\psi}(\mathbf{A}_n))$  $= \mathcal{I}_{\psi}(\mathbf{A}).$ by inductive hypothesis P.1.1.1 This completes the inductive case, and we have proven the assertion 144 (c): MichaelKohlhase

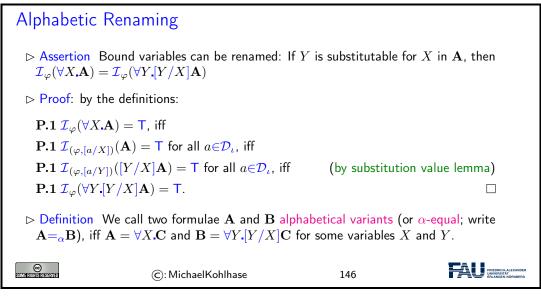
We now come to the case of propositions. Note that we have the additional assumption of substitutability here.

Substitution Value Lemma for Propositions  $\triangleright$  Assertion Let  $\mathbf{B} \in wff_{\iota}(\Sigma_{\iota})$  be substitutable for X in  $\mathbf{A} \in wff_{\rho}(\Sigma)$ , then  $\mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) =$  $\mathcal{I}_{\psi}(\mathbf{A})$ , where  $\psi = \varphi, [\mathcal{I}_{\omega}(\mathbf{B})/X]$ .  $\triangleright$  Proof: by induction on the number n of connectives and quantifiers in A **P.1.1** n = 0: then **A** is an atomic proposition, and we can argue like in the inductive case of the substitution value lemma for terms. **P.1.1** n > 0 and  $\mathbf{A} = \neg \mathbf{B}$  or  $\mathbf{A} = \mathbf{C} \circ \mathbf{D}$ : Here we argue like in the inductive case of the term lemma as well. **P.1.1** n > 0 and  $\mathbf{A} = \forall X.\mathbf{C}$ : then  $\mathcal{I}_{\psi}(\mathbf{A}) = \mathcal{I}_{\psi}(\forall X.\mathbf{C}) = \mathsf{T}$ , iff  $\mathcal{I}_{(\psi,[a/X])}(\mathbf{C}) = \mathcal{I}_{(\varphi,[a/X])}(\mathbf{C}) = \mathsf{T}$ , for all  $a \in \mathcal{D}_{\iota}$ , which is the case, iff  $\mathcal{I}_{\varphi}(\forall X.\mathbf{C}) = \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) = \mathcal{I}_{\varphi}(\mathbf{C})$ **P.1.1** n>0 and  $\mathbf{A} = \forall Y.\mathbf{C}$  where  $X \neq Y$ : then  $\mathcal{I}_{\psi}(\mathbf{A}) = \mathcal{I}_{\psi}(\forall Y.\mathbf{C}) = \mathsf{T}$ , iff  $\begin{array}{l} \mathcal{I}_{(\psi,[a/Y])}(\mathbf{C}) = \mathcal{I}_{(\varphi,[a/Y])}([\mathbf{B}/X]\mathbf{C}) = \mathsf{T}, \text{ by inductive hypothesis.} \\ \mathcal{I}_{\psi}(\mathbf{A}) = \mathcal{I}_{\varphi}(\forall Y.[\mathbf{B}/X]\mathbf{C}) = \mathcal{I}_{\varphi}([\mathbf{B}/X](\forall Y.\mathbf{C})) = \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) \end{array}$ So FRIEDRICH-ALEXA (c): MichaelKohlhase 145

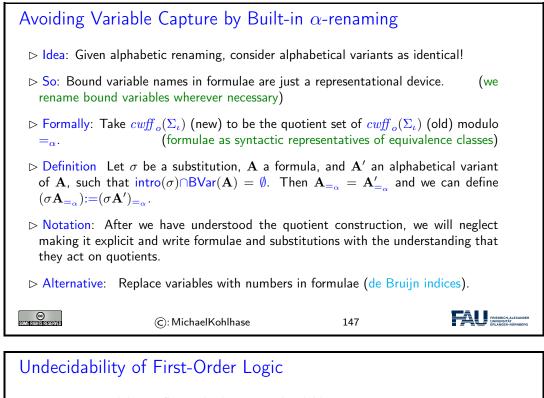
To understand the proof fully, you should look out where the substitutability is actually used. Armed with the substitution value lemma, we can now define alphabetic renaming and show it to be sound with respect to the semantics we defined above. And this soundness result will justify the definition of capture-avoiding substitution we will use in the rest of the course.

## 7.1.3 Alpha-Renaming for First-Order Logic

Armed with the substitution value lemma we can now prove one of the main representational facts for first-order logic: the names of bound variables do not matter; they can be renamed at liberty without changing the meaning of a formula.



We have seen that naive substitutions can lead to variable capture. As a consequence, we always have to presuppose that all instantiations respect a substitutability condition, which is quite tedious. We will now come up with an improved definition of substitution application for first-order logic that does not have this problem.



- $\triangleright$  Assertion Validity in first order logic is undecidable.
- $\triangleright$  **Proof**: We prove this by contradiction



# 7.2 First-Order Inference with Tableaux

We will now extend the propositional tableau techniques to first-order logic. We only have to add two new rules for the universal quantifiers (in positive and negative polarity).

First-Order Standard Tableaux (T<sub>1</sub>)
▷ Definition The standard tableau calculus (T<sub>1</sub>) extends T<sub>0</sub> (propositional tableau calculus) with the following quantifier rules:  $\frac{(\forall X \cdot \mathbf{A})^{\mathsf{T}} \ \mathbf{C} \in cwff_{\iota}(\Sigma_{\iota})}{([\mathbf{C}/X]\mathbf{A})^{\mathsf{T}}} T_1 \forall = \frac{(\forall X \cdot \mathbf{A})^{\mathsf{F}} \ c \in \Sigma_0^{sk} \ \text{new}}{([c/X]\mathbf{A})^{\mathsf{F}}} T_1 \exists$ ▷ Problem: The rule T<sub>1</sub> ∀ displays a case of "don't know indeterminism": to find a refutation we have to guess a formula C from the (usually infinite) set cwff<sub>\iota</sub>(Σ<sub>ι</sub>). For proof search, this means that we have to systematically try all, so T<sub>1</sub> ∀ is infinitely branching in general.

The rule  $\mathcal{T}_1 \forall$  operationalizes the intuition that a universally quantified formula is true, iff all of the instances of the scope are. To understand the  $\mathcal{T}_1 \exists$  rule, we have to keep in mind that  $\exists X.\mathbf{A}$  abbreviates  $\neg(\forall X.\neg \mathbf{A})$ , so that we have to read  $(\forall X.\mathbf{A})^{\mathsf{F}}$  existentially — i.e. as  $(\exists X.\neg \mathbf{A})^{\mathsf{T}}$ , stating that there is an object with property  $\neg \mathbf{A}$ . In this situation, we can simply give this object a name: c, which we take from our (infinite) set of witness constants  $\Sigma_0^{sk}$ , which we have given ourselves expressly for this purpose when we defined first-order syntax. In other words  $([c/X]\neg \mathbf{A})^{\mathsf{T}} = ([c/X]\mathbf{A})^{\mathsf{F}}$  holds, and this is just the conclusion of the  $\mathcal{T}_1 \exists$  rule.

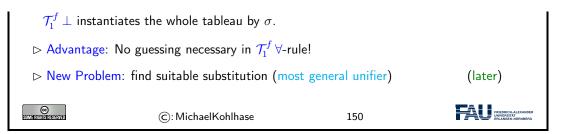
Note that the  $\mathcal{T}_1 \forall$  rule is computationally extremely inefficient: we have to guess an (i.e. in a search setting to systematically consider all) instance  $\mathbf{C} \in wff_{\iota}(\Sigma_{\iota})$  for X. This makes the rule infinitely branching.

## 7.2.1 Free Variable Tableaux

In the next calculus we will try to remedy the computational inefficiency of the  $\mathcal{T}_1 \forall$  rule. We do this by delaying the choice in the universal rule.

Free variable Tableaux  $(\mathcal{T}_{1}^{f})$   $\triangleright$  Definition The free variable tableau calculus  $(\mathcal{T}_{1}^{f})$  extends  $\mathcal{T}_{0}$  (propositional tableau calculus) with the quantifier rules:  $\frac{(\forall X.\mathbf{A})^{\mathsf{T}} \ Y \text{ new}}{([Y/X]\mathbf{A})^{\mathsf{T}}} \mathcal{T}_{1}^{f} \forall \qquad \frac{(\forall X.\mathbf{A})^{\mathsf{F}} \ \text{free}(\forall X.\mathbf{A}) = \{X^{1}, \dots, X^{k}\} \ f \in \Sigma_{k}^{sk} \ \text{new}}{([f(X^{1}, \dots, X^{k})/X]\mathbf{A})^{\mathsf{F}}} \mathcal{T}_{1}^{f} \exists$ and generalizes its cut rule  $\mathcal{T}_{0} \bot$  to:  $\frac{\mathbf{A}^{\alpha}}{\mathbf{B}^{\beta}} \ \alpha \neq \beta \ \sigma \mathbf{A} = \sigma \mathbf{B}$ 

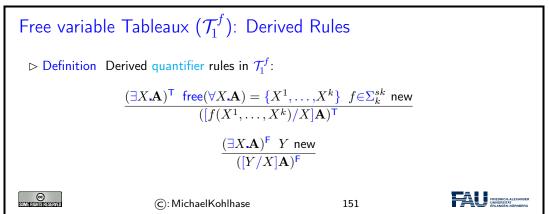
#### 7.2. FIRST-ORDER INFERENCE WITH TABLEAUX



Metavariables: Instead of guessing a concrete instance for the universally quantified variable as in the  $\mathcal{T}_1 \forall$  rule,  $\mathcal{T}_1^f \forall$  instantiates it with a new meta-variable Y, which will be instantiated by need in the course of the derivation.

Skolem terms as witnesses: The introduction of meta-variables makes is necessary to extend the treatment of witnesses in the existential rule. Intuitively, we cannot simply invent a new name, since the meaning of the body **A** may contain meta-variables introduced by the  $\mathcal{T}_1^f \forall$  rule. As we do not know their values yet, the witness for the existential statement in the antecedent of the  $\mathcal{T}_1^f \exists$  rule needs to depend on that. So witness it using a witness term, concretely by applying a Skolem function to the meta-variables in **A**.

Instantiating Metavariables: Finally, the  $\mathcal{T}_1^f \perp$  rule completes the treatment of meta-variables, it allows to instantiate the whole tableau in a way that the current branch closes. This leaves us with the problem of finding substitutions that make two terms equal.



We now come to some issues (and clarifications) pertaining to implementing proof search for free variable tableaux. They all have to do with the – often overlooked – fact that  $\mathcal{T}_1^f \perp$  instantiates the whole tableau.

The first question one may ask for implementation is whether we expect a terminating proof search; after all,  $\mathcal{T}_0$  terminated. We will see that the situation for  $\mathcal{T}_1^f$  is different.

Termination and Multiplicity in Tableaux  $\triangleright$  Recall: In  $\mathcal{T}_0$ , all rules only needed to be applied once.  $\rightsquigarrow \mathcal{T}_0$  terminates and thus induces a decision procedure for PL<sup>0</sup>.  $\triangleright$  Assertion All  $\mathcal{T}_1^f$  rules except  $\mathcal{T}_1^f \forall$  only need to be applied once.  $\triangleright$  Example A tableau proof for  $p(a) \lor p(b) \Rightarrow (\exists x.p(x))$ .

1	Start, close left branch	use $\mathcal{T}_1^f \forall$ again (right branch)				
		$(p(a) \lor p(b) \Rightarrow (\exists x.p(x)))^{F}$	-			
	$ \begin{array}{c} (p(a) \lor p(b) \Rightarrow (\exists x.p(x)))^{F} \\ (p(a) \lor p(b))^{T} \\ (\exists x.p(x))^{F} \end{array} $	$(p(a) \lor p(b))^{T}$				
	$(p(a) \lor p(b))$	$(\exists x.p(x))^{F}\ (\forall x.\neg p(x))^{T}$				
		$\sim - \frac{1}{2}$				
	$\neg n(u)^{T}$	$n(a)^{F}$				
	$\frac{p(g)}{p(u)}$ F	$p(a)^{T} \mid p(b)^{T}$				
	$ \begin{array}{c} (\forall x \neg p(x))^{T} \\ \neg p(y)^{T} \\ p(y)^{F} \\ p(a)^{T} \\ \bot : [a/y] \end{array}   p(b)^{T} $	$ \begin{array}{c c} & & P(0) \\ & \bot : [a/y] & \neg p(z)^{T} \end{array} $				
	$\perp : [a/y]$	$p(z)^{F}$				
		$ \begin{array}{c c} \neg p(a)^{T} \\ p(a)^{F} \\ p(a)^{T} & p(b)^{T} \\ \bot : [a/y] & \neg p(z)^{T} \\ p(z)^{F} \\ \bot : [b/z] \end{array} $				
	After we have used up $p(y)^{F}$ by applying $[a/y]$ in $\mathcal{T}_1^f \perp$ , we have to get a new instance $p(z)^{F}$ via $\mathcal{T}_1^f \forall$ .					
$\triangleright$ Definition Let $\mathcal{T}$ be a tableau for $\mathbf{A}$ , and a positive occurrence of $\forall x.\mathbf{B}$ in $\mathbf{A}$ , then we call the number of applications of $\mathcal{T}_1^f \forall$ to $\forall x.\mathbf{B}$ its multiplicity.						
$ ightarrow$ Assertion Given a prescribed multiplicity for each positive $\forall$ , saturation with $\mathcal{T}_1^f$ terminates.						
$\triangleright$ ProofSketch: All $\mathcal{T}_1^f$ rules reduce the number of connectives and negative $\forall$ or the multiplicity of positive $\forall$ .						
$\triangleright$ Assertion $\mathcal{T}_1^f$ is only complete with unbounded multiplicities.						
$\triangleright$ ProofSketch: Replace $p(a) \lor p(b)$ with $p(a_1) \lor \ldots \lor p(a_n)$ in . $\Box$						
ightarrow Remark: Otherwise validity in PL <sup>1</sup> would be decidable.						
▷ Implementation: We need an iterative multiplicity-deepening process.						
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The other thing we need to realize is that there may be multiple ways we can use  $\mathcal{T}_1^f \perp$  to close a branch in a tableau, and – as  $\mathcal{T}_1^f \perp$  instantiates the whole tableau and not just the branch itself – this choice matters.

Treating  $\mathcal{T}_{1}^{f} \perp$   $\triangleright$  Recall: The  $\mathcal{T}_{1}^{f} \perp$  rule instantiates the whole tableau.  $\triangleright$  Problem: There may be more than one  $\mathcal{T}_{1}^{f} \perp$  opportunity on a branch.  $\triangleright$  Example Choosing which matters – this tableau does not close!  $\begin{array}{c}
(\exists x.(p(a) \land p(b) \Rightarrow p(x)) \land (q(b) \Rightarrow q(x)))^{\mathsf{F}} \\
(p(a) \land p(b) \Rightarrow p(y) \land (q(b) \Rightarrow q(y)))^{\mathsf{F}} \\
(p(a) \Rightarrow p(b) \Rightarrow p(y))^{\mathsf{F}} \\
p(a)^{\mathsf{T}} \\
p(b)^{\mathsf{T}} \\
p(b)^{\mathsf{T}} \\
p(y)^{\mathsf{F}} \\
\perp : [a/y]
\end{array}$ 

#### 7.2. FIRST-ORDER INFERENCE WITH TABLEAUX

choosing the other $\mathcal{T}_1^f \perp$ in the left branch allows closure.					
$ ho$ Idea: Two ways of systematic proof search in $\mathcal{T}_1^f$ :					
$\triangleright$ backtracking search over $\mathcal{T}_1^f \perp$ opportunities					
$ ho$ saturate without $\mathcal{T}_1^f \perp$ and find spanning matings			(next slide)		
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The method of spanning matings follows the intuition that if we do not have good information on how to decide for a pair of opposite literals on a branch to use in  $\mathcal{T}_1^f \perp$ , we delay the choice by initially disregarding the rule altogether during saturation and then - in a later phase-looking for a configuration of cuts that have a joint overall unifier. The big advantage of this is that we only need to know that one exists, we do not need to compute or apply it, which would lead to exponential blow-up as we have seen above.

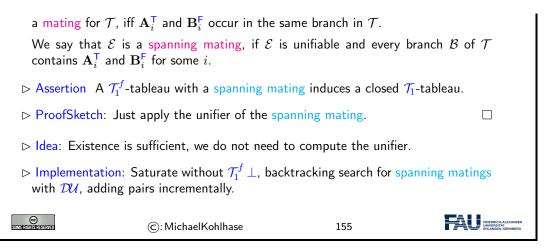
Spanning Matings for $\mathcal{T}_1^f ot$				
$\triangleright$ Assertion $\mathcal{T}_1^f$ without $\mathcal{T}_1^f \perp$ is terminating and confluent for given multiplicities.				
$ ightarrow$ Idea: Saturate without $\mathcal{T}_1^f \perp$ and treat all cuts at the same time (later).				
$\triangleright$ Definition Let $\mathcal{T}$ be a $\mathcal{T}_1^f$ tableau, then we call a unification problem $\mathcal{E}:=(\mathbf{A}_1=^{?}\mathbf{B}_1\wedge\ldots\wedge\mathbf{A}_i)$ a mating for $\mathcal{T}$ , iff $\mathbf{A}_i^{T}$ and $\mathbf{B}_i^{F}$ occur in the same branch in $\mathcal{T}$ .				
We say that $\mathcal{E}$ is a spanning mating, if $\mathcal{E}$ is unifiable and every branch $\mathcal{B}$ of $\mathcal{T}$ contains $\mathbf{A}_i^{T}$ and $\mathbf{B}_i^{F}$ for some <i>i</i> .				
$\triangleright$ Assertion A $\mathcal{T}_1^f$ -tableau with a spanning mating induces a closed $\mathcal{T}_1$ -tableau.				
▷ ProofSketch: Just apply the unifier of the spanning mating.				
ightarrow Idea: Existence is sufficient, we do not need to compute the unifier.				
$\triangleright$ Implementation: Saturate without $\mathcal{T}_1^f \perp$ , backtracking search for spanning matings with $\mathcal{D}\mathcal{U}$ , adding pairs incrementally.				
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Excursion: We will cover first-order unification inthe appendix.

The method of spanning matings follows the intuition that if we do not have good information on how to decide for a pair of opposite literals on a branch to use in  $\mathcal{T}_1^f \perp$ , we delay the choice by initially disregarding the rule altogether during saturation and then – in a later phase– looking for a configuration of cuts that have a joint overall unifier. The big advantage of this is that we only need to know that one exists, we do not need to compute or apply it, which would lead to exponential blow-up as we have seen above.

- Spanning Matings for  $\mathcal{T}_1^f \perp$   $\triangleright$  Assertion  $\mathcal{T}_1^f$  without  $\mathcal{T}_1^f \perp$  is terminating and confluent for given multiplicities.  $\triangleright$  Idea: Saturate without  $\mathcal{T}_1^f \perp$  and treat all cuts at the same time (later).  $\triangleright$  Definition Let  $\mathcal{T}$  be a  $\mathcal{T}_1^f$  tableau, then we call a unification problem  $\mathcal{E}:=(\mathbf{A}_1={}^{?}\mathbf{B}_1 \wedge \ldots \wedge \mathbf{A}_n={}^{?}\mathbf{B}_n)$

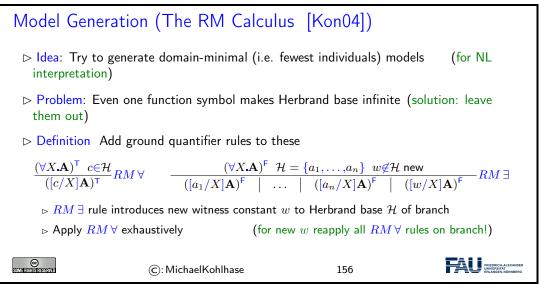
100 CHAPTER 7. PRONOUNS AND WORLD KNOWLEDGE IN FIRST-ORDER LOGIC



Excursion: We discuss soundness and completenss of first-order tableaux intheappendix.

# 7.3 Model Generation with Quantifiers

Since we have introduced new logical constants, we have to extend the model generation calculus by rules for these. To keep the calculus simple, we will treat  $\exists X.\mathbf{A}$  as an abbreviation of  $\neg(\forall X.\neg \mathbf{A})$ . Thus we only have to treat the universal quantifier in the rules.

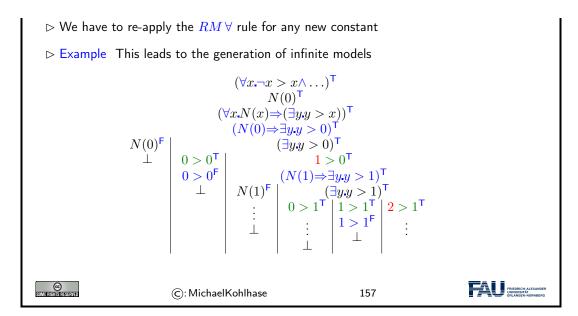


The rule  $RM \forall$  allows to instantiate the scope of the quantifier with all the instances of the Herbrand base, whereas the rule  $RM \exists$  makes a case distinction between the cases that the scope holds for one of the already known individuals (those in the Herbrand base) or a currently unknown one (for which it introduces a witness constant  $w \in \Sigma_0^{sk}$ ).

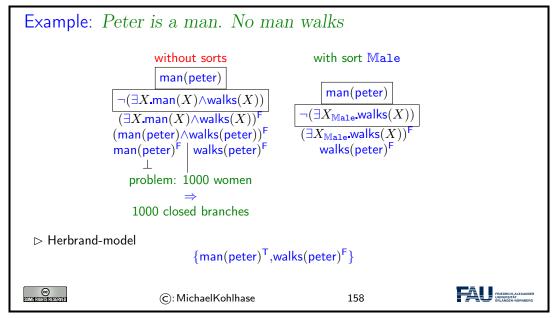
Note that in order to have a complete calculus, it is necessary to apply the  $RM \forall$  rule to all universal formulae in the tree with the new constant w. With this strategy, we arrive at a complete calculus for (finite) satisfiability in first-order logic, i.e. if a formula has a (finite) Model, then this calculus will find it. Note that this calculus (in this simple form) does not necessarily find minimal models.



#### 7.3. MODEL GENERATION WITH QUANTIFIERS

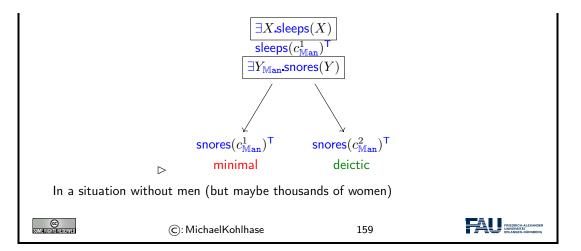


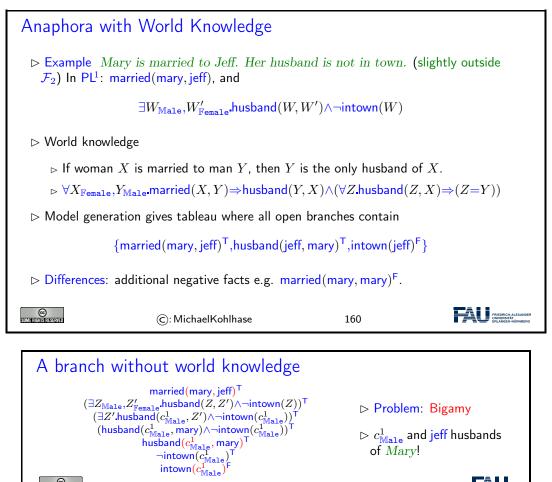
The rules  $RM \forall$  and  $RM \exists$  may remind you of the rules we introduced for  $PL_{NQ}^{\nu}$ . In fact the rules mainly differ in their scoping behavior. We will use  $RM \forall$  as a drop-in replacement for the world-knowledge rule  $\mathcal{T}_{\mathcal{V}}^{p}WK$ , and express world knowledge as universally quantified sentences. The rules  $\mathcal{T}_{\mathcal{V}}^{p}Ana$  and  $RM \exists$  differ in that the first may only be applied to input formulae and does not introduce a witness constant. (It should not, since variables here are anaphoric). We need the rule  $RM \exists$  to deal with rule-like world knowledge.



Anaphor resolution A man sleeps. He snores

101





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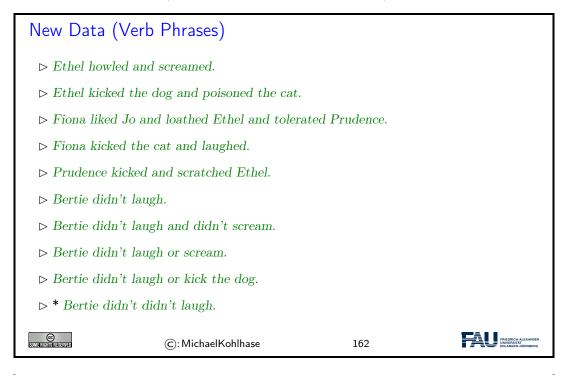
of Mary!

161

# Chapter 8

# Fragment 3: Complex Verb Phrases

# 8.1 Fragment 3 (Handling Verb Phrases)



# New Grammar in Fragment 3 (Verb Phrases)

 $\vartriangleright$  To account for the syntax we come up with the concept of a verb-phrase (VP)

 $\triangleright$  Definition  $\mathcal{F}_3$  has the following rules:

S1.	S	$\rightarrow$	$NPVP_{+fin}$			
S2.	S	$\rightarrow$	Sconj $S$			
V1.	$VP_{\pm fin}$	$\rightarrow$	$V^i_{\pm fin}$			
V2.	$VP_{\pm fin}$	$\rightarrow$	$V_{\pm fin}^{\overline{t}fin}, NP$	L8. $BE_{-} \rightarrow 4$	{is}	
V3.	$VP_{\pm fin}$	$\rightarrow$	$V P_{\pm fin}$ , conj, $V P_{\pm fin}$	L9. $BE_{pred} \rightarrow A$		
V4.	$VP_{+fin}$	$\rightarrow$	$BE_{=}, NP$	L10. $V_{-fin}^{i} \rightarrow +$	run laugh sing }	
V5.			$B\!E_{pred}, Adj.$	$ \begin{array}{ c c c c c c c c c c c c c c c c c c c$	{run, laugh, sing,} {read, poison,eat,}	
V6.			didn't VP_fin			
N1.						
N2.	N2. NP $\rightarrow$ Pron					
N3.	NP	$\rightarrow$	the $N$			
<ul> <li>▷ Limitations of F<sub>3</sub>:</li> <li>▷ The rule for didn't over-generates: * John didn't didn't run (need tense for that)</li> <li>▷ F<sub>3</sub> does not allow coordination of transitive verbs (problematic anyways)</li> </ul>						
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The main extension of the fragment is the introduction of the new category VP, we have to interpret. Intuitively, VPs denote functions that can be applied to the NP meanings (rule 1). Complex VP functions can be constructed from simpler ones by NL connectives acting as functional operators.

Given the discussion above, we have to deal with various kinds of functions in the semantics. NP meanings are individuals, VP meanings are functions from individuals to individuals, and conj meanings are functionals that map functions to functions. It is a tradition in logic to distinguish such objects (individuals and functions of various kinds) by assigning them types.

```
Implementing Fragment 3 in GF
 \triangleright The grammar of Fragment 3 only differs from that of Fragment 2 by
     ▷ Verb phrases: cat VP; VPf; infinite and finite verb phrases – finite verb phrase
     ▷ Verb Form: to distinguish howl and howled in English
          param VForm = VInf | VPast;
          oper VerbType : Type = {s : VForm => Str };
     ▷ English Paradigms to deal with verb forms.
        mkVP = overload {
          \mathsf{mkVP}: (\mathsf{v}:\mathsf{VForm} =>\mathsf{Str}) ->\mathsf{VP} = \backslash \mathsf{v} ->\mathsf{lin} \ \mathsf{VP} \ \{\mathsf{s}=\mathsf{v}\};
          mkVP : (v : VForm => Str) -> Str -> VP =
             v, str \rightarrow lin VP \{s = table \{VInf => v!VInf ++ str; VPast => v!VPast ++ str}\};
          mkVP : (v : VForm => Str) -> Str -> (v : VForm => Str) -> VP =
           v1,str,v2 \rightarrow lin VP {s = table} VInf \Rightarrow v1!VInf ++ str ++ v2!VInf;
                                                   mkVPf: Str \rightarrow VPf = \str \rightarrow lin VPf {s = str};
                                                                                      C
                           C: MichaelKohlhase
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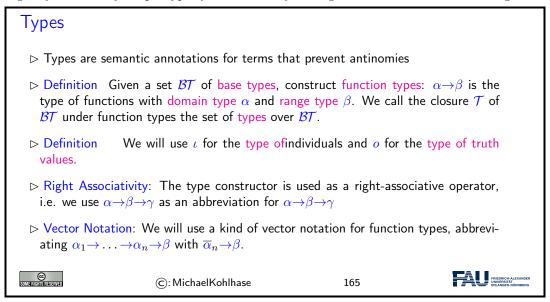
## 8.2 Dealing with Functions in Logic and Language

So we need to have a logic that can deal with functions and functionals (i.e. functions that construct new functions from existing ones) natively. This goes beyond the realm of first-order logic we have studied so far. We need two things from this logic:

- 1. a way of distinguishing the respective individuals, functions and functionals, and
- 2. a way of constructing functions from individuals and other functions.

There are standard ways of achieving both, which we will combine in the following to get the "simply typed lambda calculus" which will be the workhorse logic for  $\mathcal{F}_3$ .

The standard way for distinguishing objects of different levels is by introducing types, here we can get by with a very simple type system that only distinguishes functions from their arguments



#### Syntactical Categories and Types $\triangleright$ Now, we can assign types to syntactical categories. Intuition Cat Туре S0 truth value NP ι individual individuals $N_{pr}$ ι VPproperty $\iota {\rightarrow} o$ $V^i$ $\iota \rightarrow o$ unary predicate $V^t$ $\iota \rightarrow \iota \rightarrow o$ binary relation $\triangleright$ For the category conj, we cannot get by with a single type. Depending on where it is used, we need the types $\triangleright o \rightarrow o \rightarrow o$ for S-coordination in rule S2: S $\rightarrow$ S, conj, S $\triangleright \iota \rightarrow o \rightarrow \iota \rightarrow o \rightarrow \iota \rightarrow o$ for VP-coordination in V3: VP $\rightarrow$ VP, conj, VP. $\triangleright$ Note: Computational Linguistics, often uses a different notation for types: e(entiry) for $\iota$ , t (truth value) for o, and $\langle \alpha, \beta \rangle$ for $\alpha \rightarrow \beta$ (no bracket elision convention). So the type for VP-coordination has the form $\langle \langle e,t \rangle, \langle e,t \rangle, \langle e,t \rangle \rangle \rangle$ © (c): MichaelKohlhase 166

For a logic which can really deal with functions, we have to have two properties, which we can already read off the language of mathematics (as the discipline that deals with functions and functionals professionally): We

- 1. need to be able to construct functions from expressions with variables, as in  $f(x) = 3x^2 + 7x + 5$ , and
- 2. consider two functions the same, iff they return the same values on the same arguments.

In a logical system (let us for the moment assume a first-order logic with types that can quantify over functions) this gives rise to the following axioms:

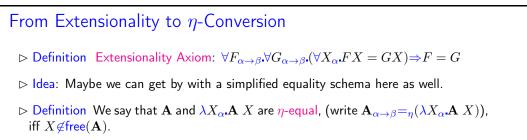
Comprehension  $\exists F_{\alpha \to \beta} \forall X_{\alpha} F X = \mathbf{A}_{\beta}$ 

Extensionality  $\forall F_{\alpha \to \beta} \forall G_{\alpha \to \beta} (\forall X_{\alpha} FX = GX) \Rightarrow F = G$ 

The comprehension axioms are computationally very problematic. First, we observe that they are equality axioms, and thus are needed to show that two objects of  $PL\Omega$  are equal. Second we observe that there are countably infinitely many of them (they are parametric in the term **A**, the type  $\alpha$  and the variable name), which makes dealing with them difficult in practice. Finally, axioms with both existential and universal quantifiers are always difficult to reason with.

Therefore we would like to have a formulation of higher-order logic without comprehension axioms. In the next slide we take a close look at the comprehension axioms and transform them into a form without quantifiers, which will turn out useful.

In a similar way we can treat (functional) extensionality.

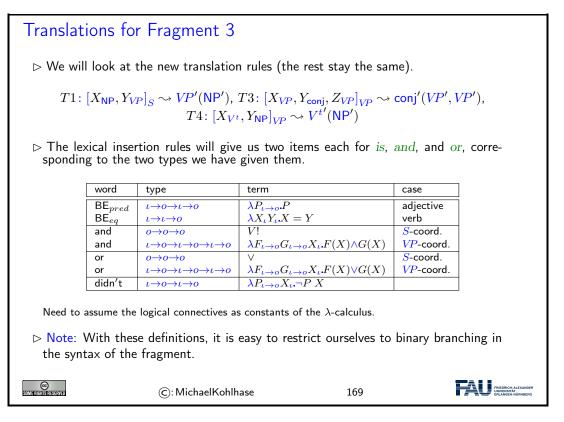


$\triangleright$ Assertion $\eta$ -equality and Extensionality are equivalent				
$\rhd$ Proof: We show that $\eta\text{-equality}$ is special case of extensionality entailment is trivial	y; the converse			
<b>P.1</b> Let $\forall X_{\alpha} \cdot \mathbf{A} X = \mathbf{B} X$ , thus $\mathbf{A} X = \mathbf{B} X$ with $\forall E$				
P.1 $\lambda X_{\alpha} \mathbf{A} X = \lambda X_{\alpha} \mathbf{B} X$ , therefore $\mathbf{A} = \mathbf{B}$ with $\eta$				
<b>P.1</b> Hence $\forall F_{\alpha \to \beta} \forall G_{\alpha \to \beta} (\forall X_{\alpha} FX = GX) \Rightarrow F = G$ by twice $\forall I$				
$\triangleright \text{ Axiom of truth values: } \forall F_o \forall G_o FG \Leftrightarrow F = G \text{ unsolved.}$				
©: MichaelKohlhase 168	FRIEDRICH-ALEXANDER UNVERSITÄT ERLANGEN-NORBERG			

The price to pay is that we need to pay for getting rid of the comprehension and extensionality axioms is that we need a logic that systematically includes the  $\lambda$ -generated names we used in the transformation as (generic) witnesses for the existential quantifier. Alonzo Church did just that with his "simply typed  $\lambda$ -calculus" which we will introduce next.

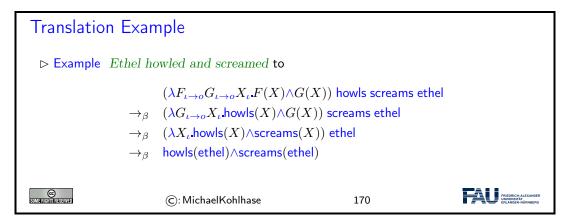
This is all very nice, but what do we actually translate into?

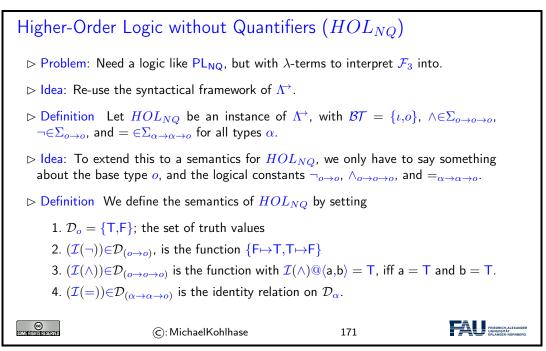
## 8.3 Translation for Fragment 3



- Definition If  $\varphi$  is a non-branching node with daughter  $\psi$ , then the translation  $\varphi'$  of  $\varphi$  is given by the translation  $\psi'$  of  $\psi$ .
- Definition If  $\varphi$  is a branching node with daughters  $\psi$  and  $\theta$ , where  $\psi'$  is an expression of type  $\alpha \rightarrow \beta$  and  $\theta'$  is an expression of type  $\alpha$ , then  $\varphi' = \psi' \theta'$ .

• Note on notation: We now have higher-order constants formed using words from the fragment, which are not (or are not always) translations of the words from which they are formed. We thus need some new notation to represent the translation of an expression from the fragment. We will use the notation introduced above, i.e. *john'* is the translation of the word *John*. We will continue to use primes to indicate that something is an expression (e.g. *john*). Words of the fragment of English should be either underlined or italicized.





You may be worrying that we have changed our assumptions about the denotations of predicates. When we were working with  $PL_{NQ}$  as our translation language, we assumed that one-place predicates denote sets of individuals, that two-place predicates denote sets of pairs of individuals, and so on. Now, we have adopted a new translation language,  $HOL_{NQ}$ , which interprets all predicates as functions of one kind or another.

The reason we can do this is that there is a systematic relation between the functions we now assume as denotations, and the sets we used to assume as denotations. The functions in question are the *characteristic functions* of the old sets, or are curried versions of such functions.

Recall that we have characterized sets extensionally, i.e. by saying what their members are. A characteristic function of a set A is a function which "says" which objects are members of A. It does this by giving one value (for our purposes, the value 1) for any argument which is a member

of A, and another value, (for our purposes, the value 0), for anything which is not a member of the set.

Definition  $f_S$  is the characteristic function of the set S iff  $f_S(a) = \mathsf{T}$  if  $\mathsf{a} \in S$  and  $f_S(a) = \mathsf{F}$  if  $\mathsf{a} \notin S$ .

Thus any function in  $\mathcal{D}_{(\iota \to o)}$  will be the characteristic function of some set of individuals. So, for example, the function we assign as denotation to the predicate *run* will return the value T for some arguments and F for the rest. Those for which it returns T correspond exactly to the individuals which belonged to the set *run* in our old way of doing things.

Now, consider functions in  $\mathcal{D}_{(\iota \to \iota \to o)}$ . Recall that these functions are equivalent to two-place relations, i.e. functions from pairs of entities to truth values. So functions of this kind are characteristic functions of sets of pairs of individuals.

In fact, any function which ultimately maps an argument to  $\mathcal{D}_o$  is a characteristic function of some set. The fact that many of the denotations we are concerned with turn out to be characteristic functions of sets will be very useful for us, as it will allow us to go backwards and forwards between "set talk" and "function talk," depending on which is easier to use for what we want to say.

### 8.4 Simply Typed $\lambda$ -Calculus

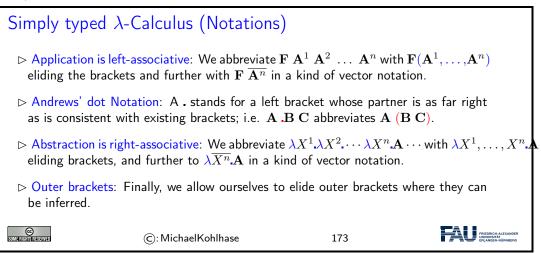
In this section we will present a logic that can deal with functions – the simply typed  $\lambda$ -calculus. It is a typed logic, so everything we write down is typed (even if we do not always write the types down).

Simply typed  $\lambda$ -Calculus (Syntax)  $\triangleright$  Definition Signature  $\Sigma = \bigcup_{\alpha \in \mathcal{T}} \Sigma_{\alpha}$  (includes countably infinite Signatures  $\Sigma_{\alpha}^{Sk}$  of Skolem contants).  $\rhd \mathcal{V}_{\mathcal{T}} = \bigcup_{\alpha \in \mathcal{T}} \mathcal{V}_{\alpha}$ , such that  $\mathcal{V}_{\alpha}$  are countably infinite  $\triangleright$  Definition We call the set  $wff_{\alpha}(\Sigma, \mathcal{V}_{\mathcal{T}})$  defined by the rules  $\triangleright \mathcal{V}_{\alpha} \cup \Sigma_{\alpha} \subseteq wff_{\alpha}(\Sigma, \mathcal{V}_{\mathcal{T}})$  $\triangleright$  If  $\mathbf{C} \in wff_{(\alpha \to \beta)}(\Sigma, \mathcal{V}_{\mathcal{T}})$  and  $\mathbf{A} \in wff_{\alpha}(\Sigma, \mathcal{V}_{\mathcal{T}})$ , then  $(\mathbf{C} \mathbf{A}) \in wff_{\beta}(\Sigma, \mathcal{V}_{\mathcal{T}})$  $\triangleright$  If  $\mathbf{A} \in wff_{\alpha}(\Sigma, \mathcal{V}_{\mathcal{T}})$ , then  $(\lambda X_{\beta} \cdot \mathbf{A}) \in wff_{(\beta \to \alpha)}(\Sigma, \mathcal{V}_{\mathcal{T}})$ the set of well typed formulae of type  $\alpha$  over the signature  $\Sigma$  and use  $wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}}) := \bigcup_{\alpha \in \mathcal{T}} wff_{\alpha}(\Sigma, \mathcal{V}_{\mathcal{T}})$ for the set of all well-typed formulae.  $\triangleright$  Definition We will call all occurrences of the variable X in A bound in  $\lambda X.A.$ Variables that are not bound in B are called free in B.  $\triangleright$  Substitutions are well-typed, i.e.  $(\sigma X_{\alpha}) \in wff_{\alpha}(\Sigma, \mathcal{V}_{\mathcal{T}})$  and capture-avoiding.  $\triangleright$  Definition The simply typed  $\lambda$ -calculus  $\Lambda^{\rightarrow}$  over a signature  $\Sigma$  has the formulae  $wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}})$  (they are called  $\lambda$ -terms) and the following equalities:  $\triangleright \alpha$  conversion:  $(\lambda X \mathbf{A}) =_{\alpha} (\lambda Y [Y / X] \mathbf{A}).$  $\triangleright \beta$  conversion:  $(\lambda X.\mathbf{A}) \mathbf{B} =_{\beta} [\mathbf{B}/X] \mathbf{A}.$  $\triangleright \eta$  conversion:  $(\lambda X \mathbf{A} X) =_{\eta} \mathbf{A}$  if  $X \notin \text{free}(\mathbf{A})$ . CCC Some Fight is reserved (C): MichaelKohlhase 172

The intuitions about functional structure of  $\lambda$ -terms and about free and bound variables are encoded into three transformation rules  $\Lambda^{\rightarrow}$ : The first rule ( $\alpha$ -conversion) just says that we can

rename bound variables as we like.  $\beta$ -conversion codifies the intuition behind function application by replacing bound variables with argument. The equality relation induced by the  $\eta$ -reduction is a special case of the extensionality principle for functions (f = g iff f(a) = g(a) for all possible arguments a): If we apply both sides of the transformation to the same argument – say **B** and then we arrive at the right hand side, since  $(\lambda X_{\alpha} \cdot \mathbf{A} X) \mathbf{B} =_{\beta} \mathbf{A} \mathbf{B}$ .

We will use a set of bracket elision rules that make the syntax of  $\Lambda^{\rightarrow}$  more palatable. This makes  $\Lambda^{\rightarrow}$  expressions look much more like regular mathematical notation, but hides the internal structure. Readers should make sure that they can always reconstruct the brackets to make sense of the syntactic notions below.



Intuitively,  $\lambda X.\mathbf{A}$  is the function f, such that  $f(\mathbf{B})$  will yield  $\mathbf{A}$ , where all occurrences of the formal parameter X are replaced by  $\mathbf{B}$ . In this presentation of the simply typed  $\lambda$ -calculus we build-in  $=_{\alpha}$ -equality and use capture-avoiding substitutions directly. A clean introduction would followed the steps in by introducing substitutions with a substitutability condition like the one in , then establishing the soundness of  $=_{\alpha}$  conversion, and only then postulating defining capture-avoiding substitution application as in . The development for  $\Lambda^{\rightarrow}$  is directly parallel to the one for PL<sup>1</sup>, so we leave it as an exercise to the reader and turn to the computational properties of the  $\lambda$ -calculus.

Computationally, the  $\lambda$ -calculus obtains much of its power from the fact that two of its three equalities can be oriented into a reduction system. Intuitively, we only use the equalities in one direction, i.e. in one that makes the terms "simpler". If this terminates (and is confluent), then we can establish equality of two  $\lambda$ -terms by reducing them to normal forms and comparing them structurally. This gives us a decision procedure for equality. Indeed, we have these properties in  $\Lambda^{\rightarrow}$  as we will see below.

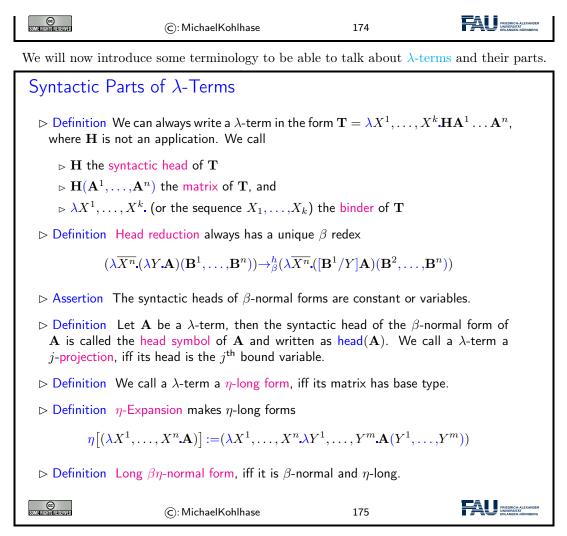
$$=_{\alpha\beta\eta}-\text{Equality (Overview)}$$

$$\triangleright \text{ reduction with } \begin{cases} =_{\beta} : (\lambda X.\mathbf{A}) \mathbf{B} \rightarrow_{\beta} [\mathbf{B}/X] \mathbf{A} \\ =_{\eta} : (\lambda X.\mathbf{A} X) \rightarrow_{\eta} \mathbf{A} \end{cases} \text{ under } =_{\alpha} : \begin{cases} \lambda X.\mathbf{A} \\ =_{\alpha} \\ \lambda Y.[Y/X] \mathbf{A} \end{cases}$$

$$\triangleright \text{ Assertion } \beta \text{-reduction is well-typed, terminating and confluent in the presence of } \alpha \text{-conversion.} \end{cases}$$

$$\triangleright \text{ Definition We call a } \lambda \text{-term } \mathbf{A} \text{ a normal form (in a reduction system } \mathcal{E}), \text{ iff no rule } (\text{from } \mathcal{E}) \text{ can be applied to } \mathbf{A}. \end{cases}$$

 $\triangleright$  Assertion  $=_{\beta\eta}$ -reduction yields unique normal forms (up to  $=_{\alpha}$ -equivalence).



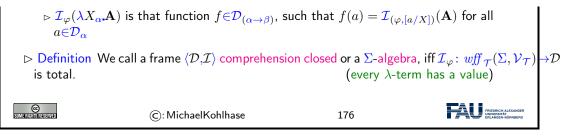
 $\eta$  long forms are structurally convenient since for them, the structure of the term is isomorphic to the structure of its type (argument types correspond to binders): if we have a term **A** of type  $\overline{\alpha}_n \rightarrow \beta$  in  $\eta$ -long form, where  $\beta \in \mathcal{BT}$ , then **A** must be of the form  $\lambda \overline{X}^n_{\alpha} \mathbf{B}$ , where **B** has type  $\beta$ . Furthermore, the set of  $\eta$ -long forms is closed under  $\beta$ -equality, which allows us to treat the two equality theories of  $\Lambda^{\rightarrow}$  separately and thus reduce argumentational complexity.

The semantics of  $\Lambda^{\rightarrow}$  is structured around the types. Like the models we discussed before, a model (we call them "algebras", since we do not have truth values in  $\Lambda^{\rightarrow}$ ) is a pair  $\langle \mathcal{D}, \mathcal{I} \rangle$ , where  $\mathcal{D}$  is the universe of discourse and  $\mathcal{I}$  is the interpretation of constants.

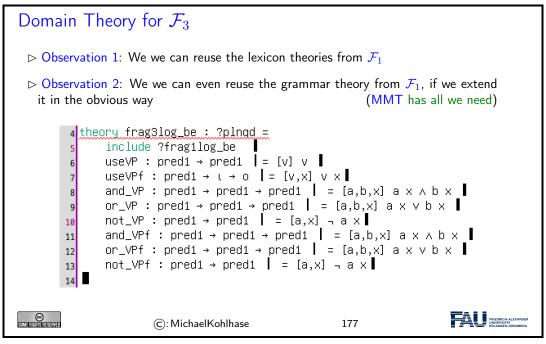
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- $\triangleright$  Definition We call a collection  $\mathcal{D}_{\mathcal{T}} := \{\mathcal{D}_{\alpha} | \alpha \in \mathcal{T}\}$  a typed collection (of sets) and a collection  $f_{\mathcal{T}} : \mathcal{D}_{\mathcal{T}} \to \mathcal{E}_{\mathcal{T}}$ , a typed function, iff  $f_{\alpha} : \mathcal{D}_{\alpha} \to \mathcal{E}_{\alpha}$ .
- $\triangleright$  Definition A typed collection  $\mathcal{D}_{\mathcal{T}}$  is called a frame, iff  $\mathcal{D}_{(\alpha \to \beta)} \subseteq \mathcal{D}_{\alpha} \to \mathcal{D}_{\beta}$
- $\triangleright$  Definition Given a frame  $\mathcal{D}_{\mathcal{T}}$ , and a typed function  $\mathcal{I} \colon \Sigma \to \mathcal{D}$ , then we call  $\mathcal{I}_{\varphi} \colon wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}}) \to \mathcal{D}$ the value function induced by  $\mathcal{I}$ , iff

$$\succ \mathcal{I}_{\varphi}|_{\mathcal{V}_{\mathcal{T}}} = \varphi, \qquad \mathcal{I}_{\varphi}|_{\Sigma} = \mathcal{I}$$
  
$$\succ \mathcal{I}_{\varphi}(\mathbf{A} \mathbf{B}) = \mathcal{I}_{\varphi}(\mathbf{A})(\mathcal{I}_{\varphi}(\mathbf{B}))$$



Excursion: We will discuss the semantics, computational properties, and a more modern presentation of the  $\lambda$  calculus inthe appendix.



## Chapter 9

# Fragment 4: Noun Phrases and Quantification

### 9.1 Overview/Summary so far

Where we started: A VP-less fragment and  $PL_{NQ}$ .:

PL <sub>NQ</sub>	Fragment of English
Syntax: Definition of wffs	Syntax: Definition of allowable sentences
Semantics: Model theory	SEMANTICS BY TRANSLATION

What we did:

- Tested the translation by testing predictions: semantic tests of entailment.
- More testing: syntactic tests of entailment. For this, we introduced the model generation calculus. We can make this move from semantic proofs to syntactic ones safely, because we know that  $PL_{NQ}$  is sound and complete.
- Moving beyond semantics: Used model generation to predict interpretations of semantically under-determined sentence types.

Where we are now: A fragment with a VP and  $HOL_{NQ}$ .: We expanded the fragment and began to consider data which demonstrate the need for a VP in any adequate syntax of English, and the need for connectives which connect VPs and other expression types. At this point, the resources of  $PL_{NQ}$  no longer sufficed to provide adequate compositional translations of the fragment. So we introduced a new translation language,  $HOL_{NQ}$ . However, the general picture of the table above does not change; only the translation language itself changes.

Some discoveries:

- The task of giving a semantics via translation for natural language includes as a subtask the task of finding an adequate translation language.
- Given a typed language, function application is a powerful and very useful tool for modeling the derivation of the interpretation of a complex expression from the interpretations of its parts and their syntactic arrangement. To maintain a transparent interface between syntax and semantics, binary branching is preferable. Happily, this is supported by syntactic evidence.
- Syntax and semantics interact: Syntax forces us to introduce VP. The assumption of compositionality then forces us to translate and interpret this new category.

• We discovered that the "logical operators" of natural language can't always be translated directly by their formal counterparts. Their formal counterparts are all sentence connectives; but English has versions of these connectives for other types of expressions. However, we can use the familiar sentential connectives to derive appropriate translations for the differently-typed variants.

Some issues about translations:  $HOL_{NQ}$  provides multiple syntactically and semantically equivalent versions of many of its expressions. For example:

- 1. Let runs be an  $HOL_{NQ}$  constant of type  $\iota \rightarrow o$ . Then runs  $= \lambda X_{\star} runs(X)$
- 2. Let loves be an  $HOL_{NQ}$  constant of type  $\iota \rightarrow \iota \rightarrow o$ . Then loves  $= \lambda X \lambda Y \text{.loves}(X, Y)$
- 3. Similarly,  $loves(a) = \lambda Y loves(a, Y)$
- 4. And loves(jane, george) =  $(\lambda X \lambda Y \text{loves}(X, Y))$  jane(george)

Logically, both sides of the equations are considered equal, since  $=_{\eta}$ -equality (remember  $(\lambda X.\mathbf{A} X) \rightarrow_{\eta} \mathbf{A}$ , if  $X \notin \text{free}(\mathbf{A})$ ) is built into  $HOL_{NQ}$ . In fact all the right-hand sides are  $=_{\eta}$ -expansions of the left-hand sides. So you can use both, as you choose in principle.

But practically, you like to know which to give when you are asked for a translation? The answer depends on what you are using it for. Let's introduce a distinction between *reduced translations* and *unreduced translations*. An unreduced translation makes completely explicit the type assignment of each expression and the mode of composition of the translations of complex expressions, i.e. how the translation is derived from the translations of the parts. So, for example, if you have just offered a translation for a lexical item (say, and as a  $V^t$  connective), and now want to demonstrate how this lexical item works in a sentence, give the unreduced translation of the sentence in question and then demonstrate that it reduces to the desired reduced version.

The reduced translations have forms to which the deduction rules apply. So always use reduced translations for input in model generation: here, we are assuming that we have got the translation right, and that we know how to get it, and are interested in seeing what further deductions can be performed.

Where we are going: We will continue to enhance the fragment both by introducing additional types of expressions and by improving the syntactic analysis of the sentences we are dealing with. This will require further enrichments of the translation language. Next steps:

- Analysis of NP.
- Treatment of adjectives.
- Quantification

#### 9.2 Fragment 4

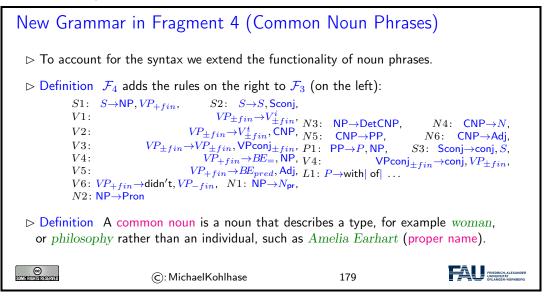
## New Data (more Noun Phrases)

 $\triangleright$  We want to be able to deal with the following sentences (without the "the-NP" trick)

- 1. Peter loved the cat., but not \* Peter loved the the cat.
- 2. John killed a cat with a white tail.
- 3. Peter chased the gangster in the car.
- 4. Peter loves every cat.
- 5. Every man loves a woman.

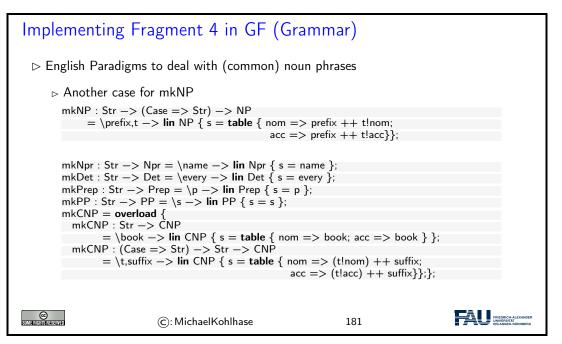
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The first example suggests that we need a full and uniform treatment of determiners like *the*, *a*, and *every*. The second and third introduce a new phenomenon: prepositional phrases like *with a hammer/mouse*; these are essentially nominal phrases that modify the meaning of other phrases via a preposition like *with*, *in*, *on*, *at*. These two show that the prepositional phrase can modify the verb or the object.

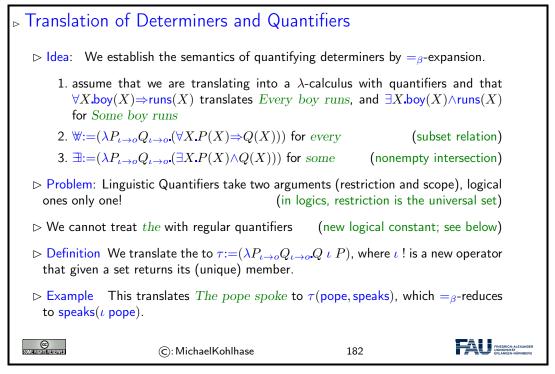


Note: Parentheses indicate optionality of a constituent. We assume appropriate lexical insertion rules without specification.

Implementing Fragment 4 in GF (Grammar)				
⊳ The grammar of Fragment 4 only differ	rs from that of Fragment 4 by			
▷ common noun phrases: cat CNP; N	pr; <b>lincat</b> CNP = NounPhraeTy	/pe;		
▷ prepositional phrases : cat PP; Det;	Prep; lincat Npr, Det, Prep, Pf	P = {s: Str}		
⊳ new grammar rules				
useDet : Det -> CNP -> NP; every book useNpr : Npr -> NP; Bertie useN : N -> CNP; book usePrep : Prep -> NP -> PP; with a book usePP : PP -> CNP -> CNP; teacher with a book ▷ grammar rules for "special" words that might not belong into the lexicon				
Abstract	English			
of_Prep:Prep;  c the_Det:Det;  t every_Det:Det;  c	<pre>with_Prep = mkPrep "with"; of_Prep = mkPrep "of"; the_Det = mkDet "the"; every_Det = mkDet "every"; a_Det = mkDet "a";</pre>			
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If we assume that  $\forall X.boy(X) \Rightarrow runs(X)$  is an adequate translation of Every boy runs, and  $\exists X.boy(X) \land runs(X)$  one for Some boy runs, then we obtain the translations of the determiners by straightforward  $=_{\beta}$ -expansion.



Note that if we interpret objects of type  $\iota \rightarrow o$  as sets, then the denotations of boy and run are sets (of boys and running individuals). Then the denotation of every is a relation between sets; more specifically the subset relation. As a consequence, All boys run is true if the set of boys is a subset of the set of running individuals. For some the relation is the non-empty intersection relation, some boy runs is true if the intersection of set of boys and the set of running individuals is non-empty.

Note that there is a mismatch in the "arity" of linguistic and logical notions of quantifiers here.

Linguistic quantifiers take two arguments, the restriction (in our example *boy*) and the predication (*run*). The logical quantifiers only take one argument, the predication  $\mathbf{A}$  in  $\forall X.\mathbf{A}$ . In a way, the restriction is always the universal set. In our model, we have modeled the linguistic quantifiers by adding the restriction with a connective (implication for the universal quantifier and conjunction for the existential one).

#### 9.3 Inference for Fragment 4

#### 9.3.1 Quantifiers and Equality in Higher-Order Logic

There is a more elegant way to treat quantifiers in  $\text{HOL}^{\rightarrow}$ . It builds on the realization that the  $\lambda$ -abstraction is the only variable binding operator we need, quantifiers are then modeled as second-order logical constants. Note that we do not have to change the syntax of  $\text{HOL}^{\rightarrow}$  to introduce quantifiers; only the "lexicon", i.e. the set of logical constants. Since  $\Pi^{\alpha}$  and  $\sigma^{\alpha}$  are logical constants, we need to fix their semantics.

Higher-Order Abstract Syntax  $\triangleright$  Idea: In HOL<sup> $\rightarrow$ </sup>, we already have variable binder:  $\lambda$ , use that to treat quantification.  $\triangleright$  Definition We assume logical constants  $\Pi^{\alpha}$  and  $\sigma^{\alpha}$  of type  $\alpha \rightarrow o \rightarrow o$ . Regain quantifiers as abbreviations:  $(\forall X_{\alpha} \mathbf{A}) := \Pi^{\alpha} \lambda X_{\alpha} \mathbf{A} \qquad (\exists X_{\alpha} \mathbf{A}) := \sigma^{\alpha} \lambda X_{\alpha} \mathbf{A}$ ▷ Definition We must fix the semantics of logical constants: 1.  $\mathcal{I}(\Pi^{\alpha})(p) = \mathsf{T}$ , iff  $p(a) = \mathsf{T}$  for all  $a \in \mathcal{D}_{\alpha}$ (i.e. if p is the universal set) 2.  $\mathcal{I}(\sigma^{\alpha})(p) = \mathsf{T}$ , iff  $p(a) = \mathsf{T}$  for some  $a \in \mathcal{D}_{\alpha}$ (i.e. iff p is non-empty)  $\triangleright$  With this, we re-obtain the semantics we have given for quantifiers above:  $\mathcal{I}_{\varphi}(\forall X_{\iota} \mathbf{A}) = \mathcal{I}_{\varphi}(\Pi^{\iota} \lambda X_{\iota} \mathbf{A}) = \mathcal{I}(\Pi^{\iota})(\mathcal{I}_{\varphi}(\lambda X_{\iota} \mathbf{A})) = \mathsf{T}$ iff  $\mathcal{I}_{\varphi}(\lambda X_{\iota} \mathbf{A})(a) = \mathcal{I}_{([a/X],\varphi)}(\mathbf{A}) = \mathsf{T}$  for all  $a \in \mathcal{D}_{\alpha}$ SOME FIGHTS RESERVED (C): MichaelKohlhase 183

### Equality

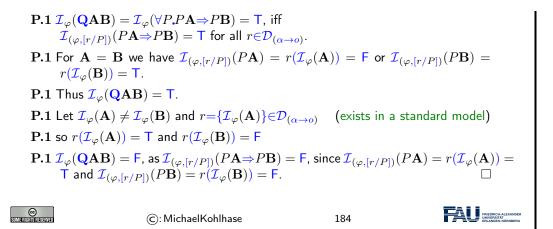
 $\triangleright \text{ Definition } \mathbf{Q}^{\alpha} \mathbf{A}_{\alpha} \mathbf{B}_{\alpha} = \forall P_{\alpha \to o} \mathbf{P} \mathbf{A} \Leftrightarrow P \mathbf{B}$ 

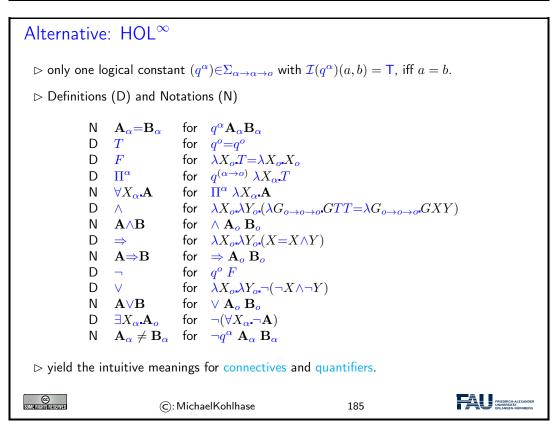
 $\triangleright$  Note:  $\forall P_{\alpha \to o} P \mathbf{A} \Rightarrow P \mathbf{B}$  (get the other direction by instantiating P with Q, where  $QX \Leftrightarrow (\neg PX)$ )

(indiscernability)

- $\triangleright$  Assertion If  $\mathcal{M} = \langle \mathcal{D}, \mathcal{I} \rangle$  is a standard model, then  $\mathcal{I}_{\varphi}(\mathbf{Q}^{\alpha})$  is the identity relation on  $\mathcal{D}_{\alpha}$ .
- $\triangleright$  Notation: We write A = B for QAB(A and B are equal, iff there is no property P that can tell them apart.)

⊳ Proof:





In a way, this development of higher-order logic is more foundational, especially in the context of Henkin semantics. There, does not hold (see [And72] for details). Indeed the proof of needs the existence of "singleton sets", which can be shown to be equivalent to the existence of the identity relation. In other words, Leibniz equality only denotes the equality relation, if we have an equality relation in the models. However, the only way of enforcing this (remember that Henkin models only guarantee functions that can be explicitly written down as  $\lambda$ -terms) is to add a logical constant for equality to the signature.

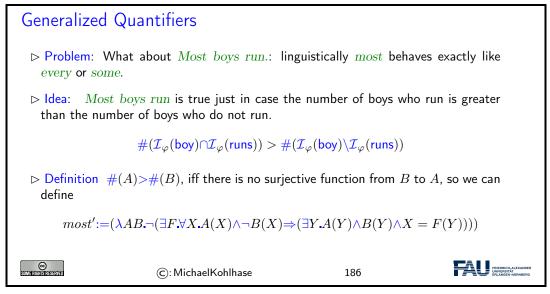
We have managed to deal with the determiners every and some in a compositional fashion, using the familiar first order quantifiers. However, most natural language determiners cannot be treated so straightforwardly. Consider the determiner most, as in:

#### 1. Most boys run.

There is clearly no simple way to translate this using  $\forall$  or  $\exists$  in any way familiar from first order

118

logic. As we have no translation at hand, then, let us consider what the truth conditions of this sentence are.



The NP most boys thus must denote something which, combined with the denotation of a VP, gives this statement. In other words, it is a function from sets (or, equivalently, from functions in  $\mathcal{D}_{(\iota \to o)}$ ) to truth values which gives true just in case the argument stands in the relevant relation to the denotation of boy. This function is itself a characteristic function of a set of sets, namely:

 $\{X | \#(\mathcal{I}_{\varphi}(\mathrm{boy}), X) > \#(\mathcal{I}_{\varphi}(\mathrm{boy}) \setminus X)\}$ 

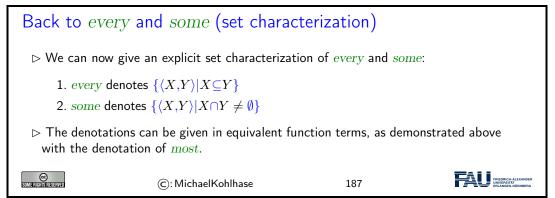
Note that this is just the same kind of object (a set of sets) as we postulated above for the denotation of every boy.

Now we want to go a step further, and determine the contribution of the determiner *most* itself. *most* must denote a function which combines with a CNP denotation (i.e. a set of individuals or, equivalently, its characteristic function) to return a set of sets: just those sets which stand in the appropriate relation to the argument.

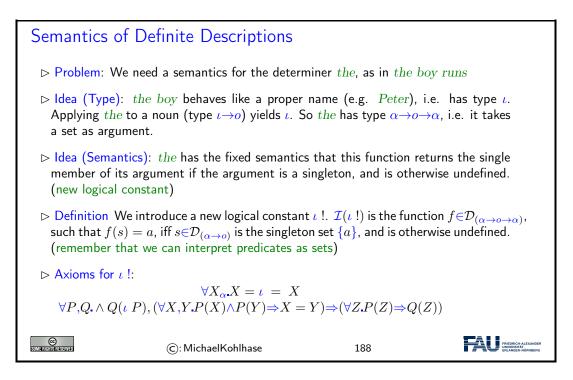
The function most' is the characteristic function of a set of pairs:

 $\{\langle X, Y \rangle | \#(X \cap Y) > \#(X \setminus Y)\}$ 

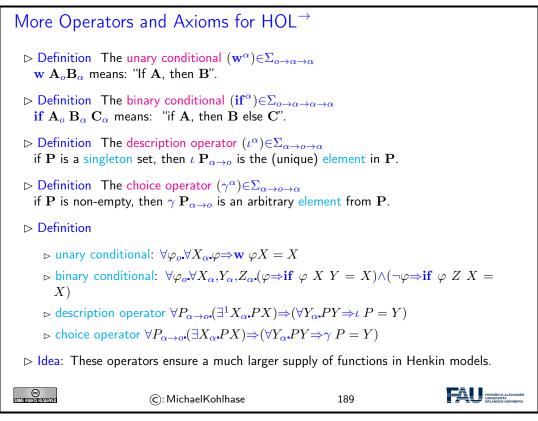
Conclusion: most denotes a relation between sets, just as every and some do. In fact, all natural language determiners have such a denotation. (The treatment of the definite article along these lines raises some issues to which we will return.)

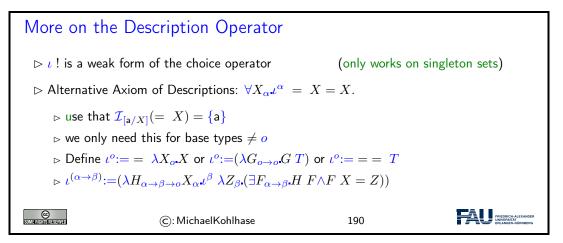


#### 9.3.2 Model Generation with Definite Descriptions

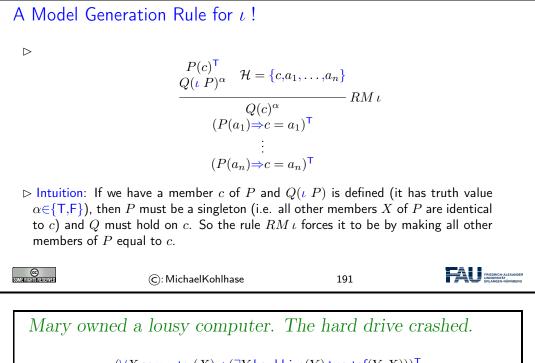


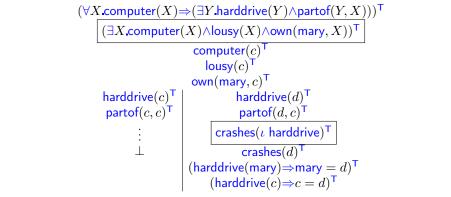
Note: The first axiom is an equational characterization of  $\iota$ !. It uses the fact that the singleton set with member X can be written as = X (or  $\lambda Y = XY$ , which is  $=_{\eta}$ -equivalent). The second axiom says that if we have  $Q \iota P$  and P is a singleton (i.e. all  $X, Y \in P$  are identical), then Q holds on any member of P. Surprisingly, these two axioms are equivalent in HOL<sup> $\rightarrow$ </sup>.

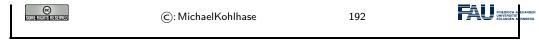




To obtain a model generation calculus for  $HOL_{NQ}$  with descriptions, we could in principle add one of these axioms to the world knowledge, and work with that. It is better to have a dedicated inference rule, which we present here.



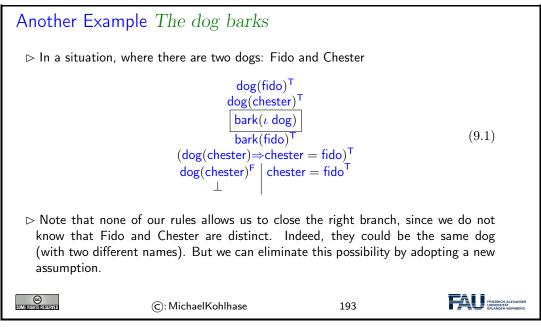




Definition In this example, we have a case of what is called a bridging reference, following H. Clark (1977): intuitively, we build an inferential bridge from the computer whose existence is asserted in the first sentence to the hard drive invoked in the second.

By incorporating world knowledge into the tableau, we are able to model this kind of inference, and provide the antecedent needed for interpreting the definite.

Now let us use the  $RM\iota$  rule for interpreting *The dog barks* in a situation where there are two dogs: Fido and Chester. Intuitively, this should lead to a closed tableau, since the uniqueness presupposition is violated. Applying the rules, we get the following tableau.



#### 9.3.3 Model Generation with Unique Name Assumptions

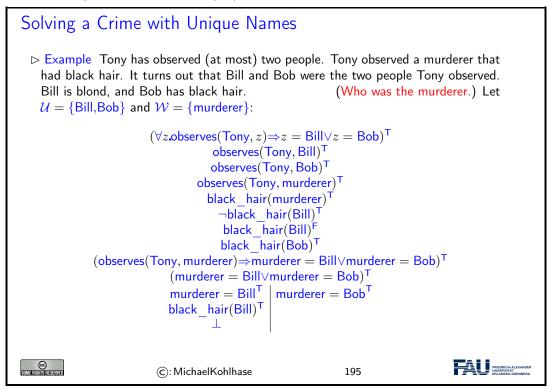
Normally (i.e. in natural languages) we have the default assumption that names are unique. In principle, we could do this by adding axioms of the form  $n = m^{\mathsf{F}}$  to the world knowledge for all pairs of names n and m. Of course the cognitive plausibility of this approach is very questionable. As a remedy, we can build a Unique-Name-Assumption (UNA) into the calculus itself.

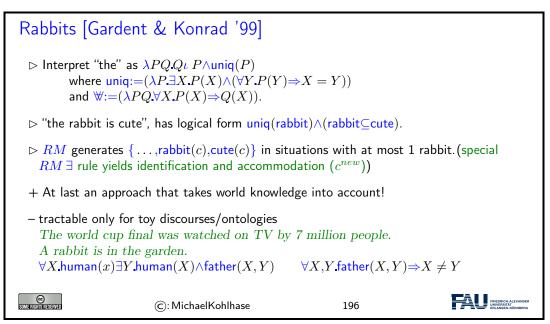
Model Generation with Unique Name Assumption (UNA)				
▷ Problem: Names are unique	(usually in natural language)			
$\triangleright$ Idea: Add background knowledge of the form $n$ =	$= m^{F}$ ( <i>n</i> and <i>m</i> names)			
▷ Better Idea: Build UNA into the calculus: partition into subsets U for constants with a unique name (treat them differently)				
Definition We add the following two rules to the unique name assumption.	he $\underline{RM}$ calculus to deal with the			
$\frac{\begin{array}{c}a=b^{T}\\ \mathbf{A}^{\alpha}\end{array} a\in \mathcal{W} \ b\in \mathcal{H}}{([b/a]\mathbf{A})^{\alpha}}RM \text{ subst}$	$\displaystyle rac{a=b^{T}\ a,b\in \mathcal{U}}{\perp}RM$ una			

122

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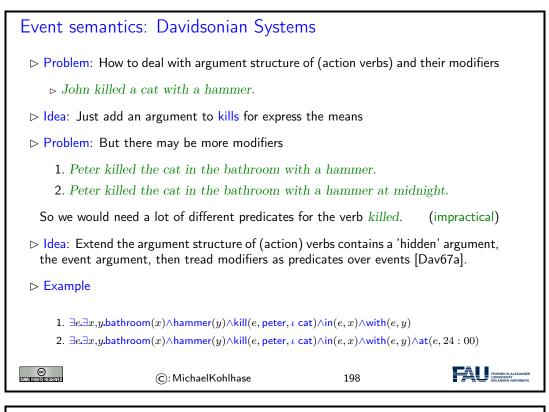
In effect we make the  $\mathcal{T}_0$  subst rule directional; it only allows the substitution for a constant without the unique name assumption. Finally, RM una mechanizes the unique name assumption by allowing a branch to close if two different constants with unique names are claimed to be equal. All the other rules in our model generation calculus stay the same. Note that with RM una, we can close the right branch of tableau (9.1), in accord with our intuition about the discourse.





Nore than one Rabbit				
Problem: What about two rabbits? Bugs and Bunny are rabbits. Bugs is in the hat. Jon removes the rabbit from the hat.				
⊳ Idea: Uniqueness under Scope [Gardent & Konrad '99]:				
▷ refine the to $\lambda PRQ$ -uniq $(P \cap R \land \forall (P \cap R, Q))$ where R is an "identifying property" (identified from the context and passed as an arbument to the)				
ightarrow here $R$ is "being in the hat" (by world knowledge about removing)				
$\triangleright$ makes Bugs unique (in $P \cap R$ ) and the discourse acceptable.				
⊳ Idea [Hobbs & Stickel& ]:				
$\triangleright$ use generic relation rel for "relatedness to context" for $P^2$ .				
?? Is there a general theory of relatedness?				
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## 9.4 Davidsonian Semantics: Treating Verb Modifiers



Event semantics: Neo-Davidsonian Systems

 $\triangleright$  Idea: Take apart the Davidsonian predicates even further, add event participants

#### 9.4. DAVIDSONIAN SEMANTICS: TREATING VERB MODIFIERS

via thematic roles (from [Par90]).

```
\succ \text{ Example Translate John killed a cat with a hammer. as} \\ \exists e. \exists x. hammer(x) \land killing(e) \land ag(e, peter) \land pat(e, \iota cat) \land with(e, x) \end{cases}
```

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- ▷ Further Elaboration: Events can be broken down into sub-events and modifiers can predicate over sub-events.
- ▷ Example The "process" of climbing Mt. Everest starts with the "event" of (optimistically) leaving the base camp and culminates with the "achievement" of reaching the summit (being completely exhausted).
- Note: This system can get by without functions, and only needs unary and binary predicates. (well-suited for model generation)

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199

Event types and properties of events	
Example Some (temporal) modifiers are incompatible with some events, e.g. in English progressive:	
<ol> <li>He is eating a sandwich and He is pushing the cart., but not</li> <li>* He is being tall. or * He is finding a coin.</li> </ol>	
Definition There are different types of events that go with different temporal modifiers. [Ven57] distinguishes	
1. states: e.g. know the answer, stand in the corner	
2. processes: e.g. run, eat, eat apples, eat soup	
3. accomplishments: e.g. run a mile, eat an apple, and	
4. achievements: e.g. reach the summit	
▷ Observations:	
1. processes and accomplishments appear in the progressive (1),	
2. states and achievements do not (2).	
▷ The for/in Test:	
1. states and activities, but not accomplishments and achievements are compat- ible with <i>for</i> -adverbials	
2. whereas the opposite holds for in-adverbials (5).	
▷ Example	
1. run a mile in an hour vs. * run a mile for an hour, but	
2. * reach the summit for an hour $vs$ reach the summit in an hour	
Stuffer States Stuffer 200	ER

# Part II

**Topics in Semantics** 

## Chapter 10

# Dynamic Approaches to NL Semantics

In this Chapter we tackle another level of language, the discourse level, where we look especially at the role of cross-sentential anaphora. This is an aspect of natural language that cannot (compositionally) be modeled in first-order logic, due to the strict scoping behavior of quantifiers. This has led to the developments of dynamic variants of first-order logic: the "file change semantics" [Hei82] by Irene Heim and (independently) "discourse representation theory" (DRT [Kam81]) by Hans Kamp, which solve the problem by re-interpreting indefinites to introduce representational objects – called "discourse referents in DRT" – that are not quantificationally bound variables and can therefore have a different scoping behavior. These approaches have been very influential in the representation of discourse – i.e. multi-sentence – phenomena.

In this Chapter, we will introduce discourse logics taking DRT as a starting point since it was adopted more widely than file change semantics and the later "dynamic predicate logics" (DPL [GS91]). gives an introduction to dynamic language phenomena and how they can be modeled in DRT. relates the linguistically motivated logics to modal logics used for modeling imperative programs and draws conclusions about the role of language in cognition. extends our primary inference system – model generation – to DRT and relates the concept of discourse referents to Skolem constants. Dynamic model generation also establishes a natural system of "direct deduction" for dynamic semantics. Finally discusses how dynamic approaches to NL semantics can be combined with ideas Montague Semantics to arrive at a fully compositional approach to discourse semantics.

#### 10.1 Discourse Representation Theory

In this Section we introduce Discourse Representation Theory as the most influential framework for aproaching dynamic phenomena in natural language. We will only cover the basic ideas here and leave the coverage of larger fragments of natural language to [KR93].

Let us look at some data about effects in natural languages that we cannot really explain with our treatment of indefinite descriptions in fragment 4 (see aboveabove).

Anaphora and Indefinites revisited (Data)				
(normal anaphoric reference)				
(Scope of existential?)				
(even if this worked)				

$\triangleright * Peter h$	as no car <sup>1</sup> . It <sub>1</sub> is parked outside.	(wh	at about negation?)
$\triangleright$ There is a	<b>a</b> book <sup>1</sup> that Peter does <b>not</b> own. It <sub>1</sub> is a	a novel.	(OK)
$\triangleright * Peter d$	oes not own every book <sup>1</sup> . It <sub>1</sub> is a novel.		(equivalent in $PL^1$ )
$\triangleright$ If a farme	$er^1$ owns a donkey <sub>2</sub> , he <sub>1</sub> beats it <sub>2</sub> .	(ev	en inside sentences)
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In the first example, we can pick up the subject Peter of the first sentence with the anaphoric reference He in the second. We gloss the intended anaphoric reference with the labels in upper and lower indices. And indeed, we can resolve the anaphoric reference in the semantic representation by translating He to (the translation of) Peter. Alternatively we can follow the lead of fragment 2 (see ) and introduce variables for anaphora and adding a conjunct that equates the respective variable with the translation of Peter. This is the general idea of anaphora resolution we will adopt in this Section.

Dynamic Effects in Natural Language				
▷ Problem: E.g. Quantifier Scope				
$\triangleright * A$ man sleeps. He snores.				
$\triangleright (\exists X.man(X) \land sleeps(X)) \land snores(X)$				
$\triangleright X$ is bound in the first conjunct, and free in the second.				
▷ Problem: Donkey sentence: If a farmer owns a donkey, he beats it. $\forall X, Y.farmer(X) \land donkey(Y) \land own(X, Y) \Rightarrow beat(X, Y)$				
⊳ Ideas:				
$\triangleright$ Composition of sentences by conjunction inside the scope of existential quantifiers (non-compositional,)				
Extend the scope of quantifiers dynamically		(DPL)		
$\triangleright$ Replace existential quantifiers by something else		(DRT)		
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Intuitively, the second example should work exactly the same – it should not matter, whether the subject NP is given as a proper name or an indefinite description. The problem with the indefinite descriptions is that they are translated into existential quantifiers and we cannot refer to the bound variables – see below. Note that this is not a failure of our envisioned treatment of anaphora, but of our treatment of indefinite descriptions; they just do not generate the objects that can be referred back to by anaphoric references (we will call them "referents"). We will speak of the "anaphoric potential" for this the set of referents that can be anaphorically referred to.

The second pair of examples is peculiar in the sense that if we had a solution for the indefinite description in *Peter has a car*, we would need a solution that accounts for the fact that even though *Peter has a car* puts a car referent into the anaphoric potential *Peter has no car* – which we analyze compositionally as *It is not the case that Peter has a car* does not. The interesting effect is that the negation closes the anaphoric potential and excludes the car referent that *Peter has a car* introduced.

The third pair of sentences shows that we need more than  $PL^1$  to represent the meaning of quantification in natural language while the sentence *There is a book that peter does not own*. induces a book referent in the anaphoric potential, but the sentence *Peter does not own every book* does not,

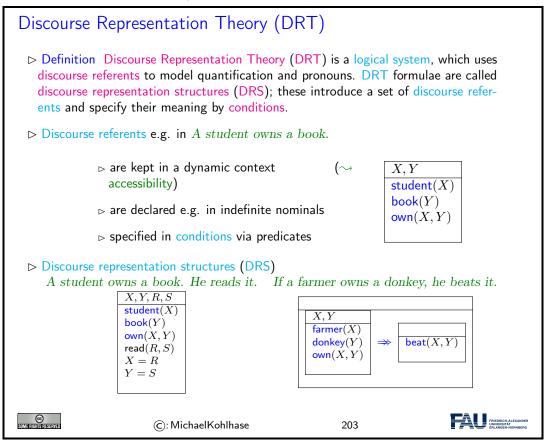
#### 10.1. DISCOURSE REPRESENTATION THEORY

even though their translations  $\exists x \land book(x), \neg own(peter, x) and \neg(\forall x book(x) \Rightarrow own(peter, x))$  are logically equivalent.

The last sentence is the famous "donkey sentence" that shows that the dynamic phenomena we have seen above are not limited to inter-sentential anaphora.

The central idea of Discourse Representation Theory (DRT), is to eschew the first-order quantification and the bound variables it induces altogether and introduce a new representational device: discourse referents, and manage their visibility (called accessibility in DRT) explicitly.

We will introduce the traditional, visual "box notation" by example now before we turn to a systematic definition based on a symbolic notation later.

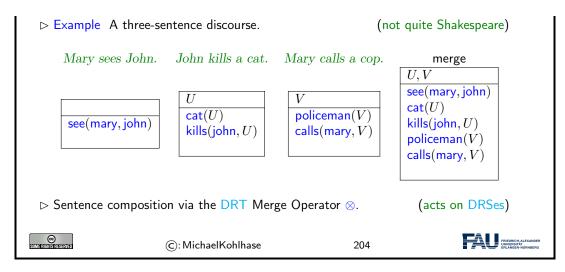


These examples already show that there are three kinds of objects in DRT: The meaning of sentences is given as DRSes, which are denoted as "file cards" that list the discourse referents (the participants in the situation described in the DRS) at the top of the "card" and state a couple of conditions on the discourse referents. The conditions can contain DRSes themselves, e.g. in conditional conditions.

With this representational infrastructure in place we can now look at how we can construct discourse DRSes – i.e. DRSes for whole discourses. The sentence composition problem was – after all – the problem that led to the development of DRT since we could not compositionally solve it in first-order logic.

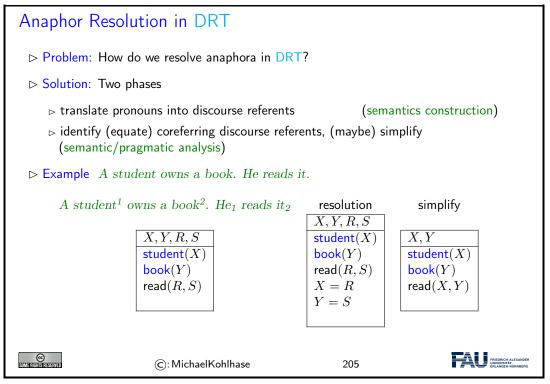
#### Discourse DRS Construction

- ▷ Problem: How do we construct DRSes for multi-sentence discourses?
- Solution: We construct sentence DRSes individually and merge them (DRSes and conditions separately)



Note that – in contrast to the "smuggling-in"-type solutions we would have to dream up for first-order logic – sentence composition in DRT is compositional: We construct sentence  $DRSes^1$  and merge them. We can even introduce a "logic operator" for this: the merge operator  $\otimes$ , which can be thought of as the "full stop" punctuation operator.

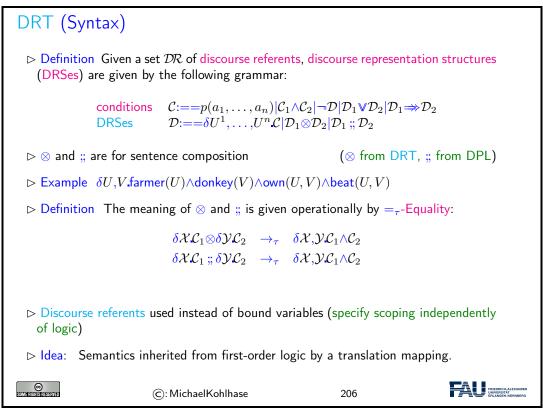
Now we can have a look at anaphor resolution in DRT. This is usually considered as a separate process – part of semantic-pragmatic analysis. As we have seen, anaphora are



We will sometime abbreviate the anaphor resolution process and directly use the simplified version of the DRSes for brevity.

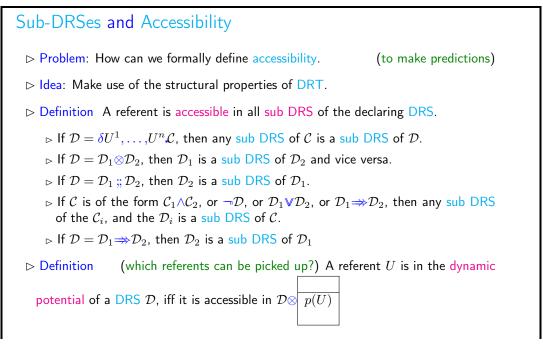
Using these examples, we can now give a more systematic introduction of DRT using a more symbolic notation. Note that the grammar below over-generates, we still need to specify the visibility of discourse referents.

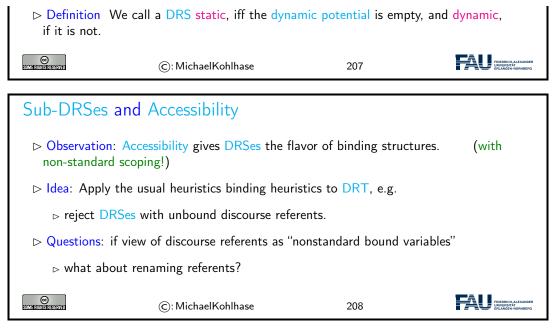
 $<sup>^1\</sup>mathrm{We}$  will not go into the sentence semantics construction process here



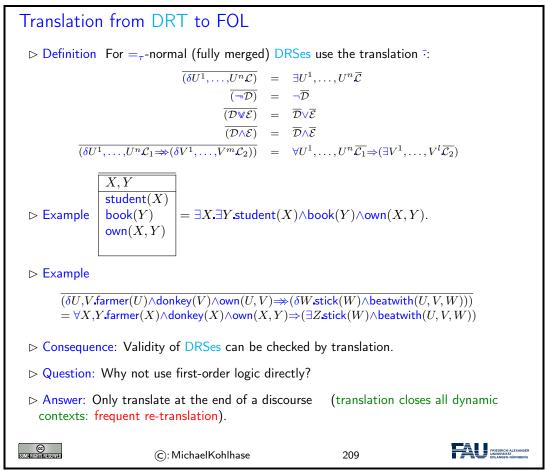
We can now define the notion of accessibility in DRT, which in turn determines the (predicted) dynamic potential of a DRS: A discourse referent has to be accessible in order to be picked up by an anaphoric reference.

We will follow the classical exposition and introduce accessibility as a derived concept induced by a non-structural notion of sub-DRS.

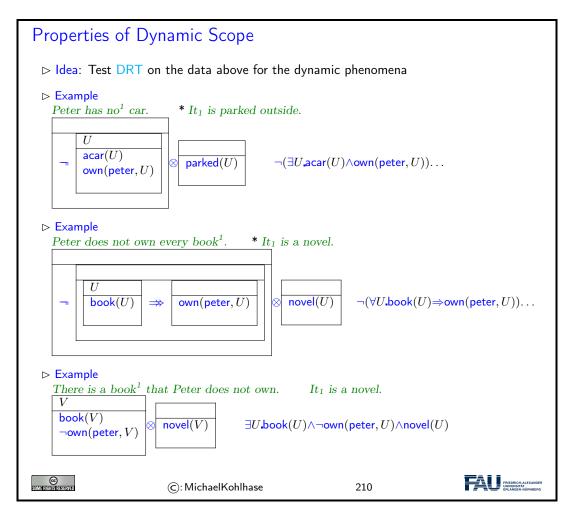




The meaning of DRSes is (initially) given by a translation to PL<sup>1</sup>. This is a convenient way to specify meaning, but as we will see, it has its costs, as we will see.

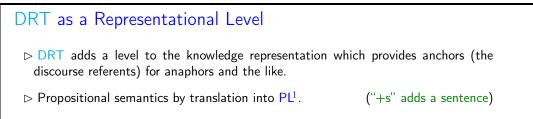


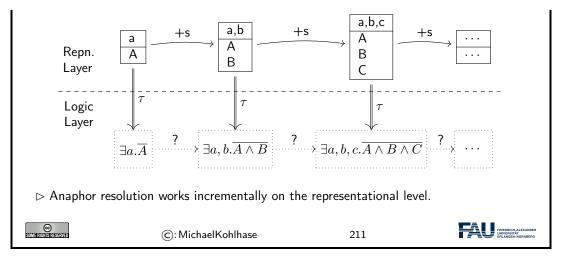
We can now test DRT as a logical system on the data and see whether it makes the right predictions about the dynamic effects identified at the beginning of the Section.



shows that negation closes off the dynamic potential. Indeed, the referent U is not accessible in the second argument of  $\otimes$ . predicts the in-accessibility of U for the same reason. In contrast to that, U is accessible in , since it is not under the scope of a dynamic negation.

The examples above, and in particular the difference between and show that DRT forms a representational level above – recall that we can translate down –  $PL^1$ , which serves as the semantic target language. Indeed DRT@ makes finer distinctions than  $PL^1$ , and supports an incremental process of semantics construction: DRS construction for sentences followed by DRS merging via  $=_{\tau}$ -reduction.



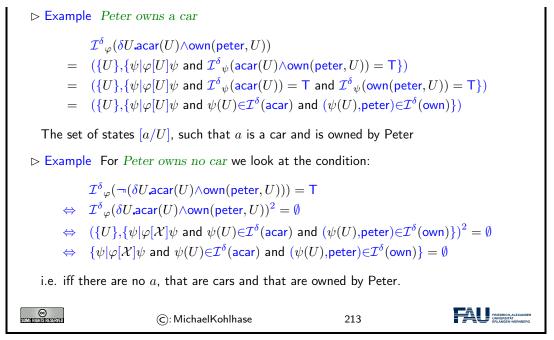


We will now introduce a "direct semantics" for DRT: a notion of "model" and an evaluation mapping that interprets DRSes directly – i.e. not via a translation of first-order logic. The main idea is that atomic conditions and conjunctions are interpreted largely like first-order formulae, while DRSes are interpreted as sets of assignments to discourse referents that satisfy the conditions. A DRS is satisfied by a model, if that set is non-empty.

A Direct Semantics for DRT (Dyn. Interpretation  $\mathcal{I}^{\delta}_{\varphi}()$ )  $\triangleright$  Definition Let  $\mathcal{M} = \langle \mathcal{U}, \mathcal{I} \rangle$  be a first-order model and  $\varphi, \psi \colon \mathcal{DR} \rightarrow \mathcal{U}$  be referent assignments, then we say that  $\psi$  extends  $\varphi$  on  $\mathcal{X} \subset \mathcal{DR}$  (write  $\varphi[\mathcal{X}]\psi$ ), if  $\varphi(U) = \varphi[\mathcal{X}]\psi$  $\psi(U)$  for all  $U \notin \mathcal{X}$ .  $\triangleright$  Idea: Conditions as truth values; DRSes as pairs ( $\mathcal{X},\mathcal{S}$ ) ( $\mathcal{S}$  set of states)  $\triangleright$  Definition  $\triangleright \mathcal{I}^{\delta}_{\omega}(p(a_1,\ldots,a_n)) = \mathsf{T}, \text{ iff } \langle \mathcal{I}^{\delta}_{\omega}(a_1),\ldots,\mathcal{I}^{\delta}_{\omega}(a_n) \rangle \in \mathcal{I}^{\delta}(p).$ (as always)  $\triangleright \mathcal{I}^{\delta}{}_{\omega}(\mathbf{A} \wedge \mathbf{B}) = \mathsf{T}, \text{ iff } \mathcal{I}^{\delta}{}_{\omega}(\mathbf{A}) = \mathsf{T} \text{ and } \mathcal{I}^{\delta}{}_{\omega}(\mathbf{B}) = \mathsf{T}.$ (dito)  $\triangleright \mathcal{I}^{\delta}{}_{\varphi}(\neg \mathcal{D}) = \mathsf{T}, \text{ if } \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{D})^{2} = \emptyset.$  $\triangleright \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{D}\mathbb{V}\mathcal{E}) = \mathsf{T}, \text{ if } \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{D})^{2} \neq \emptyset \text{ or } \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{E})^{2} \neq \emptyset.$  $\triangleright \mathcal{I}^{\delta}{}_{\omega}(\mathcal{D} \twoheadrightarrow \mathcal{E}) = \mathsf{T}, \text{ if for all } \psi \in \mathcal{I}^{\delta}{}_{\omega}(\mathcal{D})^2 \text{ there is a } \tau \in \mathcal{I}^{\delta}{}_{\omega}(\mathcal{E})^2 \text{ with } \psi [\mathcal{I}^{\delta}{}_{\omega}(\mathcal{E})^1]\tau.$  $\triangleright \mathcal{I}^{\delta}{}_{\omega}(\delta \mathcal{X}.\mathbf{C}) = (\mathcal{X}, \{\psi | \varphi[\mathcal{X}]\psi \text{ and } \mathcal{I}^{\delta}{}_{\psi}(\mathbf{C}) = \mathsf{T}\}).$  $\triangleright \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{D}\otimes\mathcal{E}) = \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{D}\,;;\mathcal{E}) = (\mathcal{I}^{\delta}{}_{\varphi}(\mathcal{D})^{1} \cup \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{E})^{1}, \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{D})^{2} \cap \mathcal{I}^{\delta}{}_{\varphi}(\mathcal{E})^{2})$ © (C): MichaelKohlhase 212

We can now fortify our intuition by computing the direct semantics of two sentences, which differ in their dynamic potential. We start out with the simple *Peter owns a car* and then progress to *Peter owns no car*.

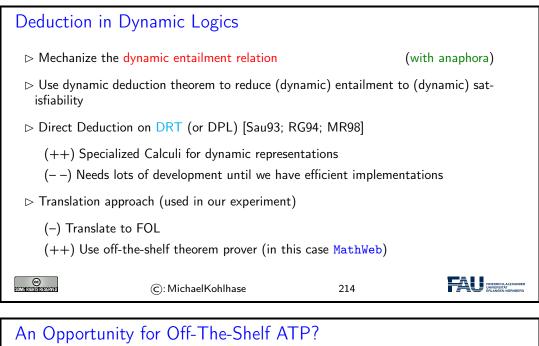




The first thing we see in is that the dynamic potential can directly be read off the direct interpretation of a DRS: it is the domain of the states in the first component. In , the interpretation is of the form  $(\emptyset, \mathcal{I}^{\delta}_{\varphi}(\mathcal{C}))$ , where  $\mathcal{C}$  is the condition we compute the truth value of in .

## 10.2 Dynamic Model Generation

We will now establish a method for direct deduction on DRT, i.e. deduction at the representational level of DRT, without having to translate – and retranslate – before deduction.



 $\triangleright$  Pro: ATP is mature enough to tackle applications

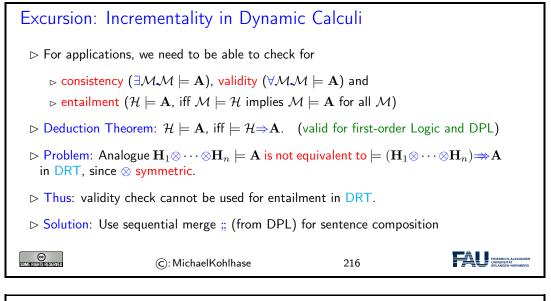
- ▷ Current ATP are highly efficient reasoning tools
- ▷ Full automation is needed for NL processing (ATP as an oracle)
- $_{\triangleright}$  ATP as logic engines is one of the initial promises of the field
- ▷ contra: ATP are general logic systems
  - 1. NLP uses other representation formalisms (DRT, Feature Logic,...)
  - 2. ATP optimized for mathematical (combinatorially complex) proofs
  - 3. ATP (often) do not terminate

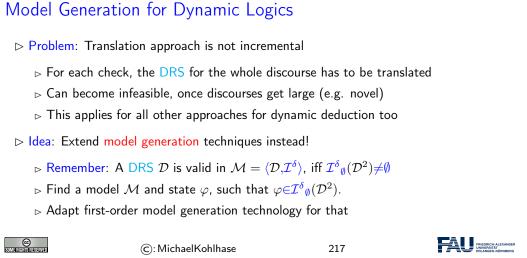
▷ Experiment: Use translation approach for 1. to test 2. and 3. [Bla+01] (Wow, it works!)

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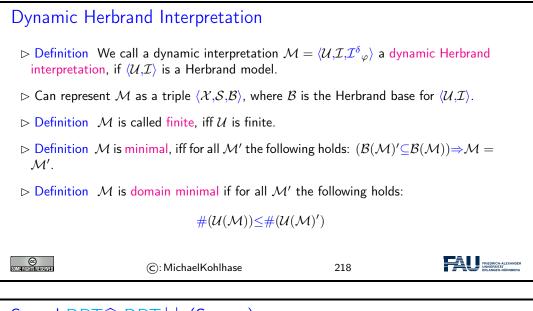


215





138



## Sorted DRT $\stackrel{\frown}{=}$ DRT<sup>++</sup> (Syntax)

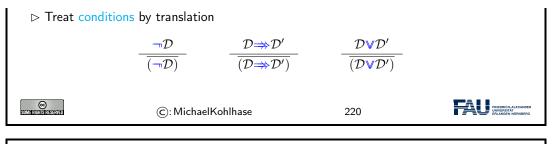
$ \begin{array}{ll} & \succ \text{Two syntactic categories} \\ & \text{Conditions} & \mathcal{C} \rightarrow p(a_1, \dots, a_n)   \mathcal{C}_1 \wedge \mathcal{C}_2   \neg \mathcal{D}   \mathcal{D}_1 \vee \mathcal{D}_2   (\mathcal{D}_1 \Longrightarrow \mathcal{D}_2) \\ & \text{DRSes} & \mathcal{D} \rightarrow (\delta U^1_{\mathbb{A}_1}, \dots, U^n_{\mathbb{A}_n} \mathcal{C})   (\mathcal{D}_1) \mathcal{D}_2   (\mathcal{D}_1) \mathcal{D}_2 \\ \end{array} $			
$\vartriangleright Example \ \ \delta U_{\mathbb{H}}, V_{\mathbb{N}}.farmer(U) \land donkey(V) \land own(U,V) \land beat(U,V)$			
$\triangleright =_{\tau}$ -Equality:			
	$\delta \mathcal{XL}_1 \otimes \delta \mathcal{YL}_2   ightarrow_ au$	$\delta\mathcal{X},\mathcal{YL}_1\wedge\mathcal{C}_2$	
	$\delta \mathcal{X} \mathcal{L}_1 ;; \delta \mathcal{Y} \mathcal{L}_2  \rightarrow_{\tau}$	$\delta\mathcal{X},\mathcal{YC}_1\land\mathcal{C}_2$	
<ul> <li>Discourse Referents used instead of bound variables (specify scoping independently of logic)</li> </ul>			
▷ Idea: Semantics by mapping into sorted first-order Logic			
CC) Sume function as enviro	©: MichaelKohlhase	219	FRIEDRICH-ALEXANDER BRUCKRUTST BRLANGEN-NÜRNBERG

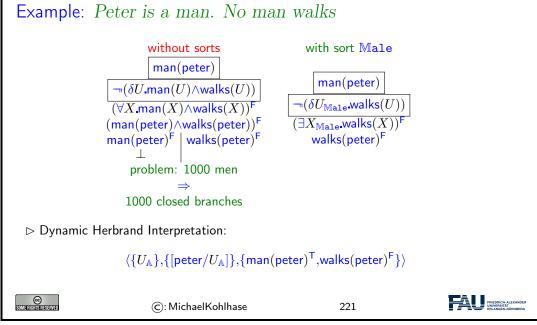
## Dynamic Model Generation Calculus

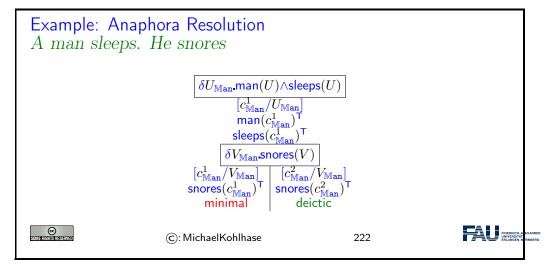
 $\triangleright$  Use a tableau framework, extend by state information and rules for DRSes.

$$\begin{array}{c|c} (\delta U_{\mathbb{A}} \mathbf{A})^{\mathsf{T}} & \mathcal{H} = \{a^{1}, \dots, a^{n}\} & w \notin \mathcal{H} \text{ new} \\ \hline \\ \hline \\ \hline \\ \hline \\ (a_{1}/U] \mathbf{A})^{\mathsf{T}} & | \cdots & | & \begin{bmatrix} a_{n}/U \\ \neg ([a_{n}/U] \mathbf{A})^{\mathsf{T}} & | & \neg ([w/U] \mathbf{A})^{\mathsf{T}} \\ \hline \\ \hline \\ \end{array} \right)^{\mathsf{T}} \\ \end{array}$$

 $\triangleright$  Mechanize ;; by adding representation at all leaves

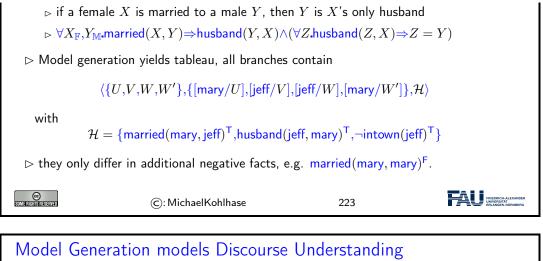


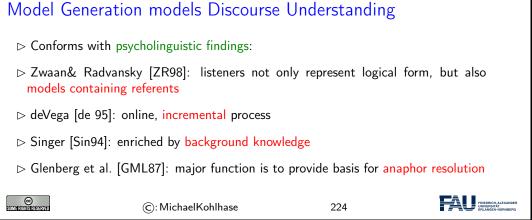




#### Anaphora with World Knowledge

- $\triangleright$  Mary is married to Jeff. Her husband is not in town.
- $\triangleright \ \delta U_{\mathbb{F}}, V_{\mathbb{M}}. U = \mathsf{mary} \land \mathsf{married}(U, V) \land V = \mathsf{jeff} ;; \\ \delta W_{\mathbb{M}}, W'_{\mathbb{F}} \mathsf{husband}(W, W') \land \neg \mathsf{intown}(W) \land \neg \mathsf{i$
- $\triangleright$  World knowledge





The cost we had to pay for being able to deal with discourse phenomena is that we had to abandon the compositional treatment of natural language we worked so hard to establish in fragments 3 and 4. To have this, we would have to have a dynamic  $\lambda$  calculus that would allow us to raise the respective operators to the functional level. Such a logical system is non-trivial, since the interaction of structurally scoped  $\lambda$ -bound variables and dynamically bound discourse referents is non-trivial. Excursion: We will discuss such a dynamic  $\lambda$  calculus inthe appendix.

#### Chapter 11

#### Propositional Attitudes and Modalities

#### 11.1 Introduction

Modalities and Propositional Attitudes			
Definition Modality is a feature of language that allows for communicating things about, or based on, situations which need not be actual.			
Definition Modality is signaled by grammatical expressions (called moods) that express a speaker's general intentions and commitment to how believable, obligatory, desirable, or actual an expressed proposition is.			
⊳ Example D	ata on modalities	(	moods in red)
$\triangleright \mathbf{A} probe$	ably holds,		(possibilistic)
$\triangleright$ it has always been the case that <b>A</b> ,			(temporal)
ightarrow it is well-known that A, (epistemic)			(epistemic)
> A is allowed/prohibited, (deontic)			(deontic)
$\triangleright \mathbf{A}$ is pro-	ovable,		(provability)
$\triangleright \mathbf{A}$ holds	after the program $P$ terminates,		(program)
$\triangleright \mathbf{A}$ hods during the execution of $P$ . (c			(dito)
ightarrow it is necessary that A, (aletic)			
$\triangleright$ it is possible that <b>A</b> , (dito)			
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#### Modeling Modalities and Propositional Attitudes

 $\triangleright$  Example Again, the pattern from above:

- $\triangleright$  it is **necessary** that Peter knows logic
- $\triangleright$  it is **possible** that John loves logic,

 $(\mathbf{A} = Peter knows logic)$  $(\mathbf{A} = John loves logic)$ 

	Observation: All of the red parts above modify the clause/sentence A. We call them modalities.			
▷ Definition A propositiona	Definition A propositional attitude is a mental state held by an agent toward a proposition.			
$\triangleright$ Question: Bu	t how to model this in logic?			
▷ Idea: New sentence-to-sentence operators for necessary and possible. (extend existing logics with them.)			<i>le.</i> (extend	
$\triangleright$ Observation: A is necessary, iff $\neg A$ is impossible.				
Definition A modal logic is a logical system that has logical constants that model modalities.				
SOME FIGHTS RESERVED	©: MichaelKohlhase	226		

Various logicians and philosophers looked at ways to use possible worlds, or similar theoretical entities, to give a semantics for modal sentences (specifically, for a modal logic), including Descartes and Leibniz. In the modern era, Carnap, Montague and Hintikka pursued formal developments of this idea. But the semantics for modal logic which became the basis of all following work on the topic was developed by Kripke 1963. This kind of semantics is often referred to as *Kripke semantics*.

History of Mo	odal Logic		
⊳ Aristoteles stı	idies the logic of necessity and p	oossibility	
⊳ Diodorus: tem	nporal modalities		
⊳ possible: <i>is</i>	s true or will be		
⊳ necessary:	is true and will never be false		
⊳ Clarence Irvin	g Lewis 1918 [Lew18] (Systems	<i>S</i> 1,, <i>S</i> 5)	
⊳ strict impli	cation $I(\mathbf{A} \wedge \mathbf{B})$ ( $I$ for "impossil	ole")	
⊳ Kurt Gödel 19	032: Modal logic of provability (	S4) [Göd32]	
⊳ Saul Kripke 1	959-63: Possible Worlds Semant	ics [Kri63]	
⊳ Vaugham Pratt 1976: Dynamic Logic [Pra76]			
⊳ :			
SOME AIGHTS RESERVED	©: MichaelKohlhase	227	FRIEDRICH-ALEXANDER UNIVERSITÄT ERILANDEN-NÜRINDERG
Basic Modal Logics (ML <sup>0</sup> and ML <sup>1</sup> )			
▷ Definition Propositional modal logic $ML^0$ extends propositional logic with two new logical constants: □ for necessity and ◊ for possibility. $(\diamondsuit A = \neg (\Box \neg A))$			

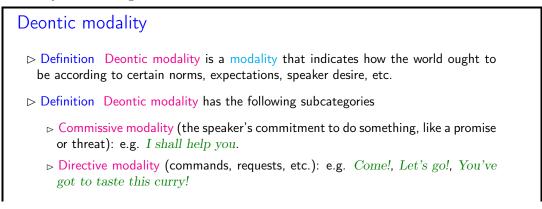
- > Observation: Nothing hinges on the fact that we use propositional logic!
- ▷ Definition First-order modal logic ML<sup>1</sup> extends first-order logic with two new logical

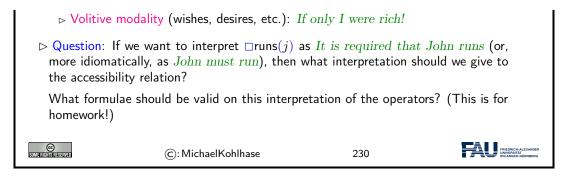
#### 11.1. INTRODUCTION

constants: $\Box$ for necessity and $\diamond$ for possibility.					
⊳ Example	▷ Example We interpret				
	<ol> <li>Necessarily, every mortal will die. as □(∀X.mortal(X)⇒willdie(X))</li> <li>Possibly, something is immortal. as ◊(∃X.¬mortal(X))</li> </ol>				
$\triangleright$ Questions: What do $\square$ and $\diamondsuit$ mean? How do they behave?					
Image: Statistic State         C: MichaelKohlhase         228					

Epistemic and Doxastic Modality			
Definition Modal sentences can convey information about the speaker's state of knowledge (epistemic state) or belief (doxastic state).			
ightarrow Example We might paraphrase sentence (epposs) as (3):			
1. A: Where's John?			
2. B: He might be in the library.			
<b>3</b> . $B'$ : It is consistent with the speaker's knowledge that John is in the library.			
$\triangleright$ Definition We way that a world $w$ is an epistemic possibility for an agent $B$ if it could be consistent with $B$ 's knowledge.			
Definition An epistemic logic is one that models the epistemic state of a speaker. Doxastic logic does the same for the doxastic state.			
$\triangleright$ Definition In deontic modal logic, we interpret the accessibility relation $\mathcal{R}$ as epistemic accessibility:			
$\triangleright$ With this $\mathcal{R}$ , represent B's utterance as $\Diamond$ inlib $(j)$ .			
$\triangleright$ Similarly, represent John must be in the library. as $\Box$ inlib $(j)$ .			
$\triangleright$ Question: If $\mathcal{R}$ is epistemic accessibility, what properties should it have?			
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To determine the properties of epistemic accessibility we ask ourselves, what statements involving  $\Box$  and  $\diamond$  should be valid on the epistemic interpretation of the operators, and how do we fix the accessibility relation to guarantee this?





#### 11.2 Semantics for Modal Logics

Basic Ideas: The fundamental intuition underlying the semantics for modality is that modal statements are statements about how things might be, statements about possible states of affairs. According to this intuition, sentence (.1) in says that in every possible state of affairs – every way that things might be – every mortal will die, while sentence (.2) says that there is some possible state of affairs – some way that things might be – in which something is mortal<sup>1</sup>. What is needed in order to express this intuition in a model theory is some kind of entity which will stand for possible states of affairs, or ways things might be. The entity which serves this purpose is the infamous possible world.

Semantics of ML<sup>0</sup>  $\triangleright \text{ Definition We use a set } \mathcal{W} \text{ of possible worlds, and a accessibility relation } \mathcal{R}\subseteq \mathcal{W} \times \mathcal{W}.$   $\triangleright \text{ Example } \mathcal{W} = \mathbb{N} \text{ with } \mathcal{R} = \{\langle n, n+1 \rangle | n \in \mathbb{N} \}. \qquad (temporal logic)$   $\triangleright \text{ Definition Variable assignment } \varphi \colon \mathcal{V}_o \times \mathcal{W} \rightarrow \mathcal{D}_o \text{ assigns values to propositional variables in a given world.}$   $\triangleright \text{ Definition Value function } \mathcal{I}_{\varphi}^w \colon wff_o(\mathcal{V}_o) \rightarrow \mathcal{D}_o(\text{assigns values to formulae in world})$   $\triangleright \mathcal{I}_{\varphi}^w(\mathcal{V}) = \varphi(w, \mathcal{V})$   $\triangleright \mathcal{I}_{\varphi}^w(\neg \mathbf{A}) = \mathsf{T}, \text{ iff } \mathcal{I}_{\varphi}^w(\mathbf{A}) = \mathsf{F}$   $\triangleright \mathcal{I}_{\varphi}^w(\Box \mathbf{A}) = \mathsf{T}, \text{ iff } \mathcal{I}_{\varphi}^w(\mathbf{A}) = \mathsf{T} \text{ for all } w' \in \mathcal{W} \text{ with } w\mathcal{R}w'.$   $\triangleright \text{ Definition We call a triple } \mathcal{M} := \langle \mathcal{W}, \mathcal{R}, \mathcal{I} \rangle \text{ a Kripke model.}$ 

In Kripke semantics, the intuitions about the truth conditions of modals sentences are expressed as follows:

- A sentence of the form  $\Box \mathbf{A}$ , where  $\mathbf{A}$  is a well-formed formula of type o, is true at w iff  $\mathbf{A}$  is true at every possible world accessible from w.
- A sentence of the form  $\diamond \mathbf{A}$ , where  $\mathbf{A}$  is a well-formed formula of type o, is true at w iff  $\mathbf{A}$  is true at some possible world accessible from w.

You might notice that these truth conditions are parallel in certain ways to the truth conditions for tensed sentence. In fact, the semantics of tense is itself a modal semantics which was developed on analogy to Kripke's modal semantics. Here are the relevant similarities:

 $<sup>^{1}</sup>$ Note the impossibility of avoiding modal language in the paraphrase!

- **Relativization of evaluation** A tensed sentence must be evaluated for truth relative to a given time. A tensed sentence may be true at one time butg false at another. Similarly, we must evaluate modal sentences relative to a possible world, for a modal sentence may be true at one world (i.e. relative to one possible state of affairs) but false at another.
- Truth depends on value of embedded formula at another world The truth of a tensed sentence at a time t depends on the truth of the formula embedded under the tense operator at some relevant time (possibly) different from t. Similarly, the truth of a modal sentence at w depends on the truth of the formula embedded under the modal operator at some world or worlds possibly different from w.
- **Accessibility** You will notice that the world at which the embedded formula is to be evaluated is required to be *accessible* from the world of evaluation. The accessibility relation on possible worlds is a generalization of the ordering relation on times that we introduced in our temporal semantics. (We will return to this momentarily).

It will be helpful to start by thinking again about the ordering relation on times introduced in temporal models. This ordering relation is in fact one sort of accessibility relation.

Why did we need the ordering relation? We needed it in order to ensure that our temporal semantics makes intuitively correct predictions about the truth conditions of tensed sentences and about entailment relations between them. Here are two illustrative examples:

Accessibility Relations. E.g. for Temporal Modalities				
	$ ightarrow$ Example Let $\langle \mathcal{W}, \circ, <, \subseteq \rangle$ an interval time structure, then we can use $\langle \mathcal{W}, < \rangle$ as a Kripke models. Then PAST becomes a modal operator.			
	pose we have $i < j$ and $j < k$ . T Jane laughed should be true at  aughs(j) ).			
<b>r</b> .	only if "<" is transitive.		(which it is!)	
	is a clearly counter-intuitive cl (A)) then $\mathcal{I}^i_{\omega}(PAST(\mathbf{A})).$	aim: For any time <i>i</i>	i and any sentence	
(For example, the truth of Jane is at the finish line at $i$ implies the truth of Jane was at the finish line at $i$ .)				
	get this result if we allowed $< 1$	o be reflexive.	(< is irreflexive)	
$\triangleright$ Treating tense modally, we obtain reasonable truth conditions.				
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Thus, by ordering the times in our model in accord with our intuitions about time, we can ensure correct predictions about truth conditions and entailment relations for tensed sentences.

In the modal domain, we do not have intuitions about how possible worlds should be ordered. But we do have intuitions about truth conditions and entailment relations among modal sentences. So we need to set up an accessibility relation on the set of possible worlds in our model which, in combination with the truth conditions for  $\Box$  and  $\diamondsuit$  given above, will produce intuitively correct claims about entailment.

One of the prime occupations of modal logicians is to look at the sets of validities which are obtained by imposing various different constraints on the accessibility relation. We will here consider just two examples.

What must be, is:

1. It seems intuitively correct that if it is necessarily the case that **A**, then **A** is true, i.e. that

 $w_q(\Box \mathbf{A}) = \mathsf{T}$  implies that  $w_q(\mathbf{A}) = \mathsf{T}$  or, more simply, that the following formula is valid:

 $\Box A \Rightarrow A$ 

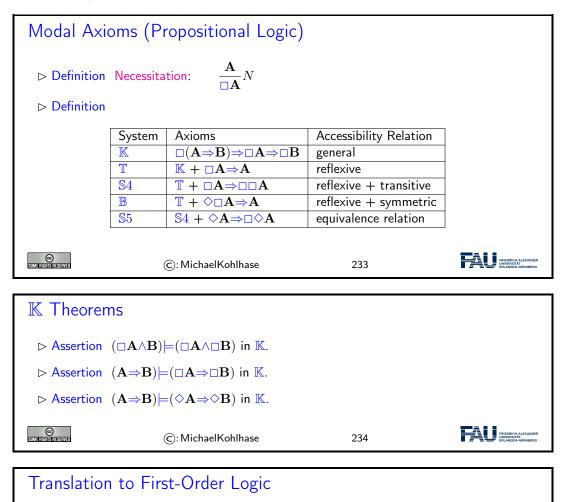
- 2. To guarantee this implication, we must ensure that any world w is among the worlds accessible from w, i.e. we must make  $\mathcal{R}$  reflexive.
- 3. Note that this also guarantees, among other things, that the following is valid:  $\mathbf{A} \implies \diamond \mathbf{A}$

Whatever is, is necessarily possible:

1. This also seems like a reasonable slogan. Hence, we want to guarantee the validity of:

 $\mathbf{A}\implies \square\Diamond\mathbf{A}$ 

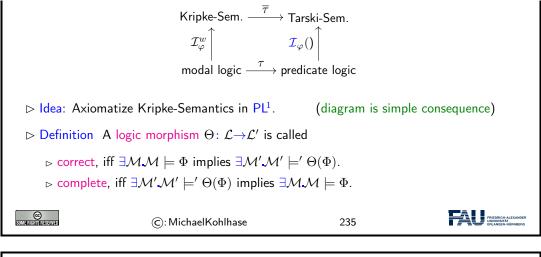
2. To do this, we must guarantee that if **A** is true at a some world w, then for every world w' accessible from w, there is at least one **A** world accessible from w'. To do this, we can guarantee that every world w is accessible from every world which is accessible from it, i.e. make  $\mathcal{R}$  symmetric.

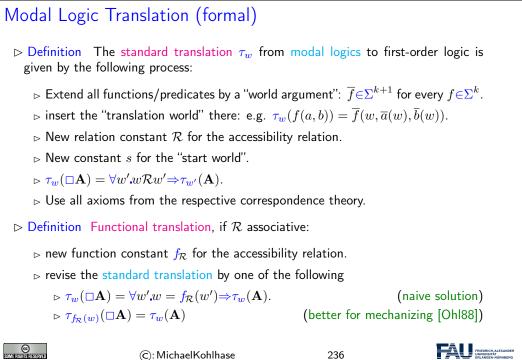


- $\triangleright$  Question: Is modal logic more expressive than predicate logic?
- Answer: Very rarely!
- (usually can be translated)

(so that the diagram commutes)

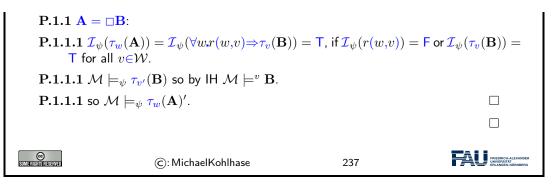
 $\triangleright$  Definition Translation  $\tau$  from ML into PL<sup>1</sup>,





#### Translation (continued)

▷ Assertion  $\tau_s : \mathsf{ML}^0 \to \mathsf{PL}^0$  is correct and complete. ▷ Proof: show that  $\exists \mathcal{M} \mathcal{M} \models \Phi$  iff  $\exists \mathcal{M}' \mathcal{M}' \models (\tau_s(\Phi))$ P.1 Let  $\mathcal{M} = \langle \mathcal{W}, \mathcal{R}, \varphi \rangle$  with  $\mathcal{M} \models \mathbf{A}$ P.1 chose  $\mathcal{M} = \langle \mathcal{W}, \mathcal{I}' \rangle$ , such that  $\mathcal{I}(\overline{p}) = \varphi(p) : \mathcal{W} \to \{\mathsf{T}, \mathsf{F}\}$  and  $\mathcal{I}(r) = \mathcal{R}$ . P.1 we prove  $\mathcal{M} \models_{\psi} \tau_w(\mathbf{A})'$  for  $\psi = \mathsf{Id}_{\mathcal{W}}$  by structural induction over  $\mathbf{A}$ . P.1.1  $\mathbf{A} = P$ :  $\mathcal{I}_{\psi}(\tau_w(\mathbf{A})) = \mathcal{I}_{\psi}(\overline{p}(w)) = \mathcal{I}(\overline{p}(w)) = \varphi(P, w) = \mathsf{T}$ P.1.1  $\mathbf{A} = \neg \mathbf{B}, \mathbf{A} = \mathbf{B} \land \mathbf{C}$ : trivial by IH.

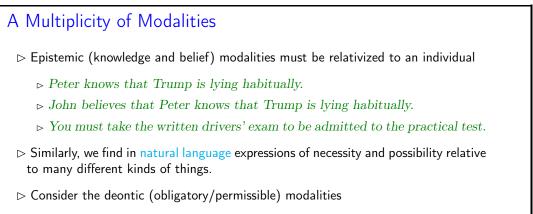


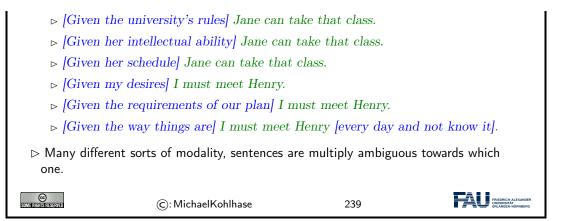
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**Excursion:** We discuss a model existence theorem that can be the basis of completenss of modal logics in the appendix.

#### 11.3 A Multiplicity of Modalities $\sim$ Multimodal Logic

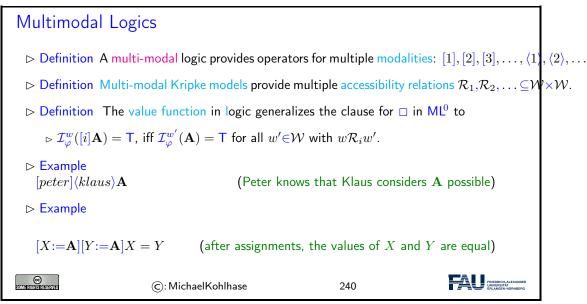
The epistemic and <u>deontic</u> modalities differ from alethic, or logical, modality in that they must be relativized to an individual. Although we can choose to abstract away from this, it is clear that what is possible relative to John's set of beliefs may not be possible relative to Jane's, or that what is obligatory for Jane may not be obligatory for John. A theory of modality for <u>natural</u> <u>language</u> must have a means of representing this relativization.





In a series of papers beginning with her 1978 dissertation (in German), Angelika Kratzer proposed an account of the semantics of natural language which accommodates this ambiguity. (The ambiguity is treated not as a semantic ambiguity, but as context dependency.) Kratzer's account, which is now the standard view in semantics and (well-informed) philosophy of language, adopts central ingredients from Kripke semantics – the basic possible world framework and the notion of an accessibility relation – but puts these together in a novel way. Kratzer's account of modals incorporates an account of natural language conditionals; this account has been influenced by, and been influential for, the accounts of conditionals developed by David Lewis and Robert Stalnaker. These also are now standardly accepted (at least by those who accept the possible worlds framework).

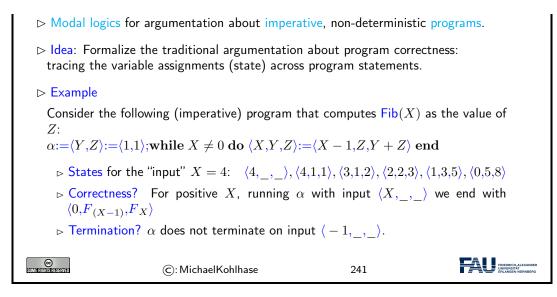
Some references: [Kra12; Lew73; Sta68].

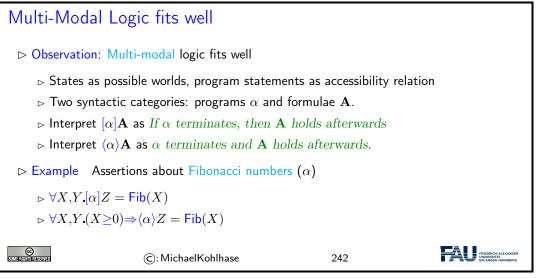


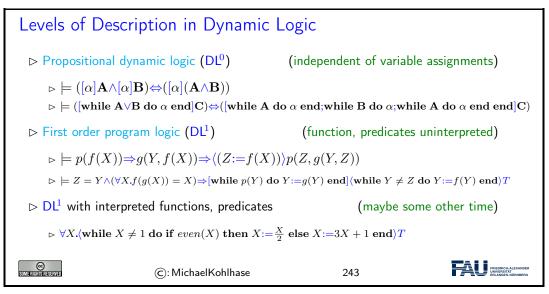
We will now contrast DRT (see ) with a modal logic for modeling imperative programs – incidentally also called "dynamic logic". This will give us new insights into the nature of dynamic phenomena in natural language.

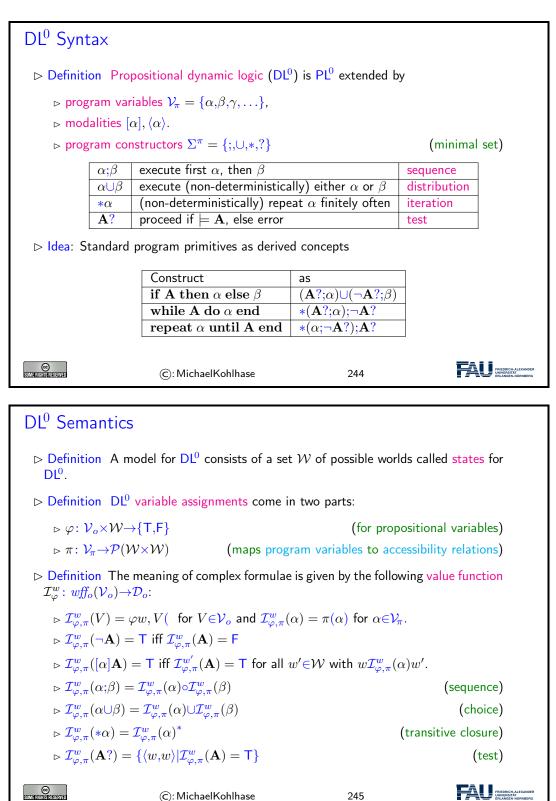
#### 11.4 Dynamic Logic for Imperative Programs

Dynamic Program Logic (DL)

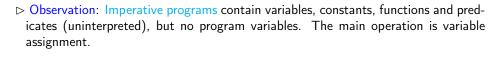








First-Order Program Logic (DL<sup>1</sup>)



- $\triangleright$  Idea: Make a multi modal logic in the spirit of DL<sup>0</sup> that features all of these for a deeper understanding.
- $\triangleright$  Definition First order program logic (DL<sup>1</sup>) combines the features of PL<sup>1</sup>, DL<sup>0</sup> without program variables, with the following two assignment operators:
  - $\triangleright$  nondeterministic assignment X := ?
  - $\triangleright$  deterministic assignment  $X := \mathbf{A}$
- $\triangleright$  Example  $\models p(f(X)) \Rightarrow g(Y, f(X)) \Rightarrow \langle Z := f(X) \rangle p(Z, g(Y, Z))$  in DL<sup>1</sup>.
- $\succ \text{ Example In DL}^1 \text{ we have} \\ \models Z = Y \land (\forall X p(f(g(X)) = X)) \Rightarrow [\text{while } p(Y) \text{ do } Y := g(Y) \text{ end}] \langle \text{while } Y \neq Z \text{ do } Y := f(Y) \text{ end} \rangle T$

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246
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#### DL<sup>1</sup> Semantics

- $\triangleright$  Definition Let  $\mathcal{M} = \langle \mathcal{D}, \mathcal{I} \rangle$  be a first-order model then we take the States (possible worlds) are variable assignments:  $\mathcal{W} = \{\varphi | \varphi : \mathcal{V}_{\iota} \rightarrow \mathcal{D}\}$
- $\triangleright$  Definition For a set  $\mathcal{X}$  of variables, write  $\varphi[\mathcal{X}]\psi$ , iff  $\varphi(X) = \psi(X)$  for all  $X \notin \mathcal{X}$ .
- $\triangleright$  Definition The meaning of complex formulae is given by the following value function  $\mathcal{I}_{\varphi}^{w} \colon wf_{o}(\Sigma) \rightarrow \mathcal{D}_{o}$

$$_{arphi} \mathcal{I}^w_arphi(\mathbf{A}) = \mathcal{I}_arphi(\mathbf{A})$$
 if  $\mathbf{A}$  term or atom

$$\triangleright \mathcal{I}^w_{\varphi}(\neg \mathbf{A}) = \mathsf{T} \text{ iff } \mathcal{I}^w_{\varphi}(\mathbf{A}) = \mathsf{F}$$

 $\triangleright$ :

$$> \mathcal{I}^w_{\varphi}(X := ?) = \{ \langle \varphi, \psi \rangle | \varphi[X] \psi \}$$

 $\succ \mathcal{I}^w_{\varphi}(X := \mathbf{A}) = \{ \langle \varphi, \psi \rangle | \varphi[X] \psi \text{ and } \psi(X) = \mathcal{I}_{\varphi}(\mathbf{A}) \}.$ 

 $\rhd$  Assertion  $% \ensuremath{\mathsf{We}}$  We have

$$\triangleright \mathcal{I}_{\varphi}([X:=\mathbf{A}]\mathbf{B}) = \mathcal{I}_{(\varphi,[\mathcal{I}_{\varphi}(\mathbf{A})/X])}(\mathbf{B})$$

 $\triangleright \forall X.\mathbf{A} = [X:=?]\mathbf{A}.$ 

 $\triangleright$  Thus substitution and quantification are definable in DL<sup>1</sup>.

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247

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#### Natural Language as Programming Langauges

▷ Question: Why is dynamic program logic interesting in a natural langauage course?

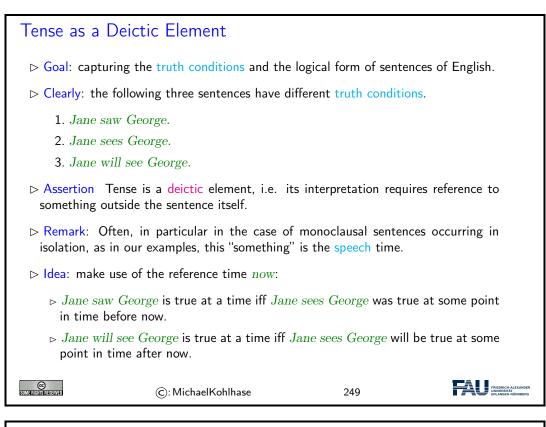
Answer: There are fundamental relations between dynamic (discourse) logics and dynamic program logics

#### 11.4. DYNAMIC LOGIC FOR IMPERATIVE PROGRAMS

⊳ David Israel:	"Natural languages are prograr	nming languages for mi	ind" [Isr93]
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#### Chapter 12

## Some Issues in the Semantics of Tense



#### A Simple Semantics for Tense

▷ Problem: the meaning of Jane saw George and Jane will see George is defined in terms of Jane sees George.

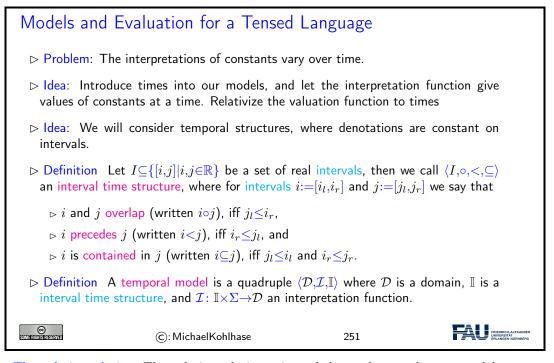
 $\rightsquigarrow$  We need the truth conditions of the present tense sentence.

- $\triangleright$  Idea: Jane sees George is true at a time iff Jane sees George at that time.
- $\triangleright$  Implementation: Postulate tense operators as sentential operators (expressions of type  $o \rightarrow o$ ). Interpret

1. Jan	he saw George as $PAST(see(g, j))$		
2. Jane sees George as $PRES(see(g, j))$			
<b>3</b> . Jan	he wil see George as $FUT(see(g,j))$		
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Some notes:

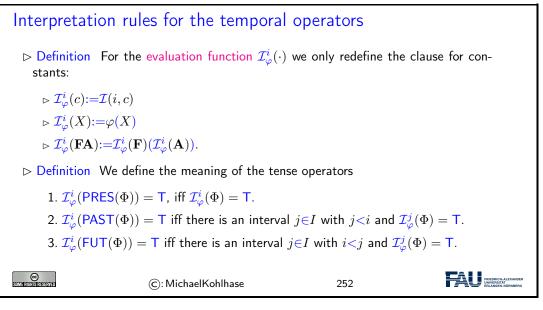
- Most treatments of the semantics of tense invoke some notion of a tenseless proposition/formula for the base case, just like we do. The idea here is that markers of past, present and future all operate on an underlying un-tensed expression, which can be evaluated for truth at a time.
- Note that we have made no attempt to show how these translations would be derived from the natural language syntax. Giving a compositional semantics for tense is a complicated business for one thing, it requires us to first establish the syntax of tense so we set this goal aside in this brief presentation.
- Here, we have implicitly assumed that the English modal *will* is simply a tense marker. This is indeed assumed by some. But others consider that it is no accident that *will* has the syntax of other modals like *can* and *must*, and believe that *will* is also semantically a modal.

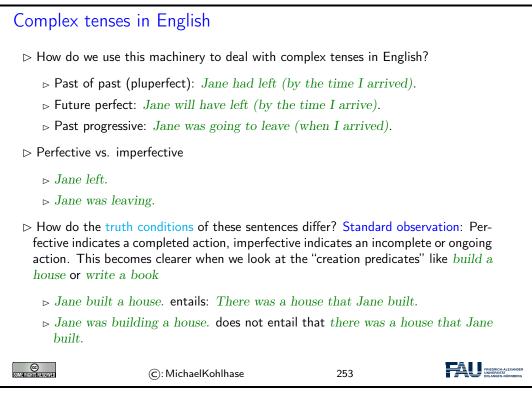


The ordering relation: The ordering relation < is needed to make sure that our models represent temporal relations in an intuitively correct way. Whatever the truth may be about time, as language users we have rather robust intuitions that time goes in one direction along a straight line, so that every moment of time is either before, after or identical to any other moment; and no moment of time is both before and after another moment. If we think of the set of times as the set of natural numbers, then the ordering relation < is just the relation less than on that set.

Intervals: Although intuitively time is given by as a set of moments of time, we will adopt here (following Cann, who follows various others) an *interval semantics*, in which expressions are evaluated relative to intervals of time. Intervals are defined in terms of moments, as a continuous set of moments ordered by <.

The new interpretation function: In models without times, the interpretation function  $\mathcal{I}$  assigned an extension to every constant. Now, we want it to assign an extension to each constant relative to each interval in our interval time structure. I.e. the interpretation function associates each constant with a pair consisting of an interval and an appropriate extension, interpreted as the extension at that interval. This set of pairs is, of course, equivalent to a function from intervals to extensions.





254

- ▷ New Data;
  - 1. Jane leaves tomorrow.
  - 2. Jane is leaving tomorrow.
  - 3. ?? It rains tomorrow.
  - 4. ?? It is raining tomorrow.
  - 5. ?? The dog barks tomorrow.
  - 6. ?? The dog is barking tomorrow.

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▷ Future readings of present tense appear to arise only when the event described is planned, or planable, either by the subject of the sentence, the speaker, or a third party.

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#### Sequence of Tense $\triangleright$ George said that Jane was laughing. ▷ Reading 1: George said "Jane is laughing." I.e. saying and laughing co-occur. So past tense in subordinate clause is past of utterance time, but not of main clause reference time. ▷ Reading 2: George said "Jane was laughing." I.e. laughing precedes saying. So past tense in subordinate clause is past of utterance time and of main clause reference time. $\triangleright$ George saw the woman who was laughing. ⊳ How many readings? $\triangleright$ George will say that Jane is laughing. ▷ Reading 1: George will say "Jane is laughing." Saying and laughing co-occur, but both saying and laughing are future of utterance time. So present tense in subordinate clause indicates futurity relative to utterance time, but not to main clause reference time. ▷ Reading 2: Laughing overlaps utterance time and saying (by George). So present tense in subordinate clause is present relative to utterance time and main clause reference time. (c): MichaelKohlhase 255

#### Sequence of Tense

- $\triangleright$  George will see the woman who is laughing.
  - ⊳ How many readings?
- ▷ Note that in all of the above cases, the predicate in the subordinate clause describes an event that is extensive in time. Consider readings when subordinate event is punctual.

$\triangleright$ George said	that Mary fell.		
⊳ Falling m	ust precede George's saying.		
$\triangleright$ George saw	the woman who fell.		
	ee readings as before: falling must resent or future relative to seeing	•	
⊳ And just for Bill.	fun, consider past under present.	George will clair	n that Mary hit
⊳ Reading reference	<ol> <li>hitting is past of utterance t time).</li> </ol>	ime (therefore past	of main clause
⊳ Reading 2 time.	Reading 2: hitting is future of utterance time, but past of main clause reference time.		
⊳ And finally			
	ago, John decided that in ten o that they were having their last	•	
	id a week ago that in ten days gihara 1996	he would buy a fis	sh that was still
Sourie Algeria Massaviad	©: MichaelKohlhase	256	
Interpreting	tense in discourse		
	man walked into the bar. He sat ce jacket and expensive shoes, l		
⊳ Example			
1. Said wh	ile driving down the NJ turnpike:	I forgot to turn of	f the stove.

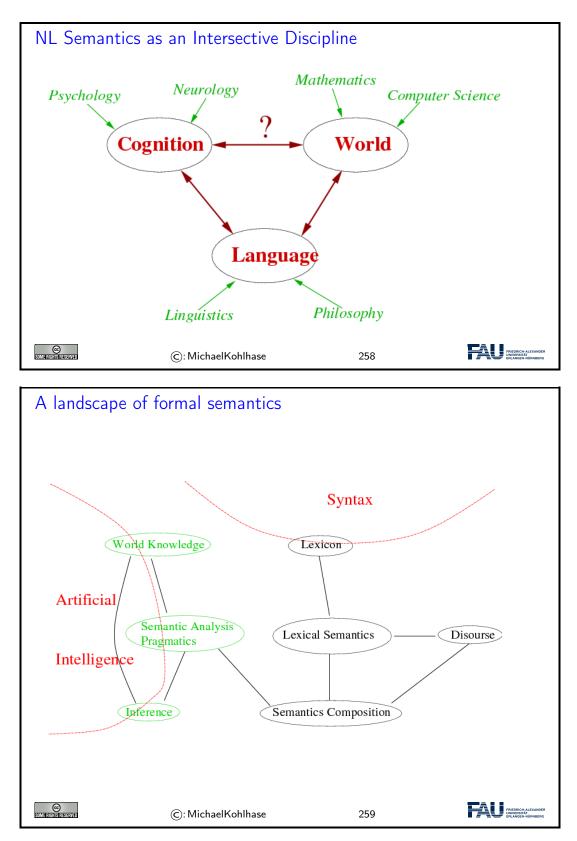
2. I didn't turn off the stove.

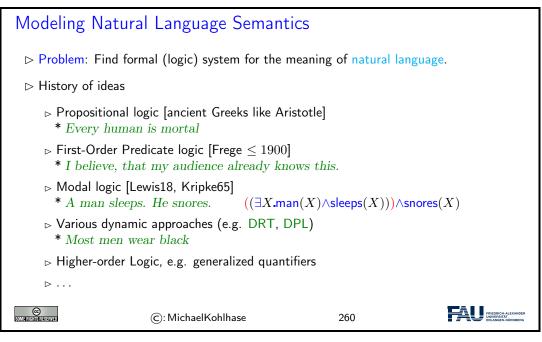
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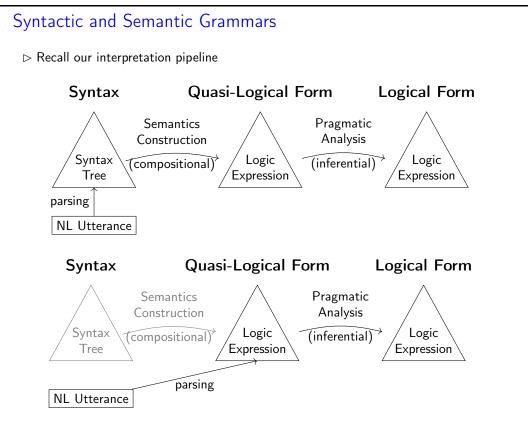
257

FRIEDRICH-ALEXANDER UNIVERSITÄT ERLANGEN-NÜRNBERG Part III Conclusion

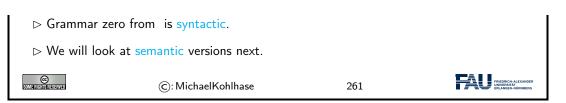




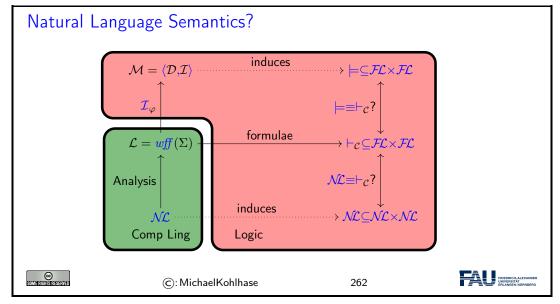
We will now introduce an important conceptual distinction on the intent of grammars.



▷ Definition We call a grammar syntactic, iff the categories and constructors are motivated by the linguistic structure of the utterance, and semantic, iff they are motivated by the structure of the domain to be modeled.



Let us now reconcider the role of all of this for natural language semantics. We have claimed that the goal of the course is to provide you with a set of methods to determine the meaning of natural language. If we look back, all we did was to establish translations from natural languages into formal languages like first-order or higher-order logic (and that is all you will find in most semantics papers and textbooks). Now, we have just tried to convince you that these are actually syntactic entities. So, where is the semantics?



As we mentioned, the green area is the one generally covered by natural language semantics. In the analysis process, the nlunatural language utterance (viewed here as formulae of a language  $\mathcal{NL}$ ) are translated to a formal language  $\mathcal{FL}$  (a set  $wff(\Sigma)$  of well-formed formulae). We claim that this is all that is needed to recapture the semantics even if this is not immediately obvious at first: Theoretical Logic gives us the missing pieces.

Since  $\mathcal{FL}$  is a formal language of a logical systems, it comes with a notion of model and an interpretation function  $\mathcal{I}_{\varphi}$  that translates  $\mathcal{FL}$  formulae into objects of that model. This induces a notion of logical consequence<sup>1</sup> as explained in . It also comes with a calculus  $\mathcal{C}$  acting on  $\mathcal{FL}$ -formulae, which (if we are lucky) is correct and complete (then the mappings in the upper rectangle commute).

What we are really interested in in natural language semantics is the truth conditions and natural consequence relations on natural language utterances, which we have denoted by  $\mathcal{NL}$ . If the calculus  $\mathcal{C}$  of the logical system  $\langle \mathcal{FL}, \mathcal{K}, \models \rangle$  is adequate (it might be a bit presumptious to say sound and complete), then it is a model of the relation  $\mathcal{NL}$ . Given that both rectangles in the diagram commute, then we really have a model for truth-conditions and logical consequence for nlunatural lanaugage utterances, if we only specify the analysis mapping (the green part) and the calculus.

Where to from here?

<sup>&</sup>lt;sup>1</sup>Relations on a set S are subsets of the cartesian product of S, so we use  $R \in S^*S$  to signify that R is a (n-ary) relation on X.

$\triangleright$ We can continue the exploration of semantics in two different ways:				
<ul> <li>Look around for additional logical systems and see how they can be applied to various linguistic problems. (The logician's approach)</li> </ul>				
	dditional linguistic forms forms, and how to repres		their truth condi- (The linguist's	
ho Here are some possib	ilities			
	C): MichaelKohlhase	263		
Semantics of Plura	als			
1. The dogs were bar	king.			
<ol> <li>Fido and Chester were barking. (What kind of an object do the subject NPs denote?)</li> </ol>				
<b>3</b> . Fido and Chester	3. Fido and Chester were barking. They were hungry.			
4. Jane and George came to see me. She was upset. (Sometimes we need to look inside a plural!)				
5. Jane and George have two children. (Each? Or together?)				
6. Jane and George got married. (To each other? Or to other people?)				
7. Jane and George met. (The predicate makes a difference to how we interpret the plural)				
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#### Reciprocals

 $\triangleright$  What's required to make these true?

- 1. The men all shook hands with one another.
- 2. The boys are all sitting next to one another on the fence.
- 3. The students all learn from each other.

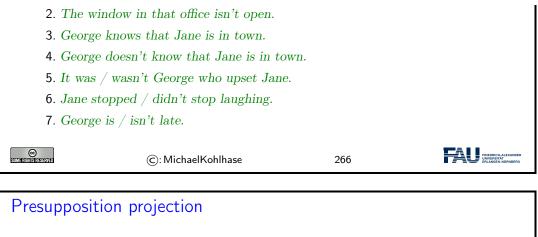
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265

#### Presuppositional expressions

- $\triangleright$  What are presuppositions?
- $\triangleright$  What expressions give rise to presuppositions?
- $\rhd$  Are all apparent presuppositions really the same thing?
  - 1. The window in that office is open.



- 1. George doesn't know that Jane is in town.
- 2. Either Jane isn't in town or George doesn't know that she is.
- 3. If Jane is in town, then George doesn't know that she is.
- 4. Henry believes that George knows that Jane is in town.

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# Conditionals What are the truth conditions of conditionals? 1. If Jane goes to the game, George will go. Intuitively, not made true by falsity of the antecedent or truth of consequent independent of antecedent. 2. If John is late, he must have missed the bus. Cenerally agreed that conditionals are modal in nature. Note presence of modal in consequent of each conditional above.

#### Counterfactual conditionals

▷ And what about these??

- 1. If kangaroos didn't have tails, they'd topple over. (David Lewis)
- 2. If Woodward and Bernstein hadn't got on the Watergate trail, Nixon might never have been caught.
- **3**. If Woodward and Bernstein hadn't got on the Watergate trail, Nixon would have been caught by someone else.
- $\rhd$  Counterfactuals undoubtedly modal, as their evaluation depends on which alternative world you put yourself in.

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Before and after			
▷ These seem easy. But modality creeps in again			
<ol> <li>Jane gave up linguistics after she finished her dissertation. finish?)</li> </ol>			(Did she
<ol> <li>Jane gave up linguistics before she finished her dissertation. finish? Did she start?)</li> </ol>			(Did she
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### Part IV

#### Excursions

As this course is predominantly about modeling natural language and not about the theoretical aspects of the logics themselves, we give the discussion about these as a "suggested readings" section part here.

### Appendix A

## **Properties of Propositional Tableaux**

### A.1 Soundness and Termination of Tableaux

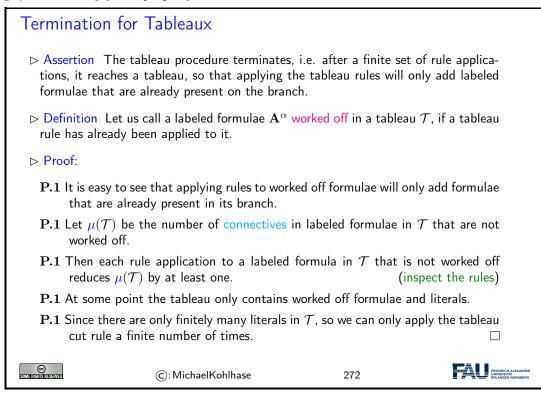
As always we need to convince ourselves that the calculus is sound, otherwise, tableau proofs do not guarantee validity, which we are after. Since we are now in a refutation setting we cannot just show that the inference rules preserve validity: we care about unsatisfiability (which is the dual notion to validity), as we want to show the initial labeled formula to be unsatisfiable. Before we can do this, we have to ask ourselves, what it means to be (un)-satisfiable for a labeled formula or a tableau.

Soundness (Tableau)

- $\triangleright$  Idea: A test calculus is sound, iff it preserves satisfiability and the goal formulae are unsatisfiable.
- $\triangleright$  Definition A labeled formula  $\mathbf{A}^{\alpha}$  is valid under  $\varphi$ , iff  $\mathcal{I}_{\varphi}(\mathbf{A}) = \alpha$ .
- $\triangleright$  Definition A tableau  $\mathcal{T}$  is satisfiable, iff there is a satisfiable branch  $\mathcal{P}$  in  $\mathcal{T}$ , i.e. if the set of formulae in  $\mathcal{P}$  is satisfiable.
- > Assertion Tableau rules transform satisfiable tableaux into satisfiable ones.
- $\triangleright$  Assertion A set  $\Phi$  of propositional formulae is valid, if there is a closed tableau  $\mathcal{T}$  for  $\Phi^{\mathsf{F}}$ .
- ▷ Proof: by contradiction: Suppose  $\Phi$  is not valid. P.1 then the initial tableau is satisfiable P.1 so T is satisfiable, by our Lemma. P.1 there is a satisfiable branch P.1 but all branches are closed (T closed) ©: MichaelKohlhase 271

Thus we only have to prove, this is relatively easy to do. For instance for the first rule: if we have a tableau that contains  $(\mathbf{A} \wedge \mathbf{B})^{\mathsf{T}}$  and is satisfiable, then it must have a satisfiable branch. If  $(\mathbf{A} \wedge \mathbf{B})^{\mathsf{T}}$  is not on this branch, the tableau extension will not change satisfiability, so we can assume that it is on the satisfiable branch and thus  $\mathcal{I}_{\varphi}(\mathbf{A} \wedge \mathbf{B}) = \mathsf{T}$  for some variable assignment  $\varphi$ . Thus  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{T}$  and  $\mathcal{I}_{\varphi}(\mathbf{B}) = \mathsf{T}$ , so after the extension (which adds the formulae  $\mathbf{A}^{\mathsf{T}}$  and  $\mathbf{B}^{\mathsf{T}}$  to the branch), the branch is still satisfiable. The cases for the other rules are similar.

The next result is a very important one, it shows that there is a procedure (the tableau procedure) that will always terminate and answer the question whether a given propositional formula is valid or not. This is very important, since other logics (like the often-studied first-order logic) does not enjoy this property.



The tableau calculus basically computes the disjunctive normal form: every branch is a disjunct that is a conjunct of literals. The method relies on the fact that a DNF is unsatisfiable, iff each literal is, i.e. iff each branch contains a contradiction in form of a pair of opposite literals. For proving completeness of tableaux we will use the abstract consistency method introduced by Raymond Smullyan — a famous logician who also wrote many books on recreational mathematics and logic (most notably one is titled "What is the name of this book?") which you may like.

### A.2 Abstract Consistency and Model Existence

We will now come to an important tool in the theoretical study of reasoning calculi: the "abstract consistency"/"model existence" method. This method for analyzing calculi was developed by Jaako Hintikka, Raymond Smullyan, and Peter Andrews in 1950-1970 as an encapsulation of similar constructions that were used in completeness arguments in the decades before. The basis for this method is Smullyan's Observation [Smu63] that completeness proofs based on Hintikka sets only certain properties of consistency and that with little effort one can obtain a generalization "Smullyan's Unifying Principle".

The basic intuition for this method is the following: typically, a logical system  $S = \langle \mathcal{L}, \mathcal{K}, \models \rangle$  has multiple calculi, human-oriented ones like the natural deduction calculi and machine-oriented ones like the automated theorem proving calculi. All of these need to be analyzed for completeness (as a basic quality assurance measure).

A completeness proof for a calculus C for S typically comes in two parts: one analyzes C-consistency (sets that cannot be refuted in C), and the other construct K-models for C-consistent sets.

In this situtation the "abstract consistency"/"model existence" method encapsulates the model

construction process into a meta-theorem: the "model existence" theorem. This provides a set of syntactic ("abstract consistency") conditions for calculi that are sufficient to construct models.

With the model existence theorem it suffices to show that C-consistency is an abstract consistency property (a purely syntactic task that can be done by a C-proof transformation argument) to obtain a completeness result for C.

Model Existence (Overview)			
▷ Definition: Abstract consistency			
Definition: Hintikka set (maximally abstract consistent)			
▷ Theorem: Hintikka sets are satisfiable			
$ ho$ Theorem: If $\Phi$ is abstract consistent, then $\Phi$ can be extended to a Hintikka set.			
$ ho$ Corollary: If $\Phi$ is abstract consistent, then $\Phi$ is satisfiable			
$\triangleright$ Application: Let $C$ be a calculus, if $\Phi$ is $C$ -consistent, then $\Phi$ is abstract consistent.			
$\triangleright$ Corollary: $C$ is complete.			
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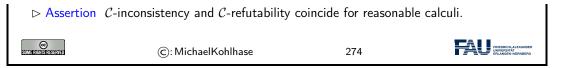
The proof of the model existence theorem goes via the notion of a Hintikka set, a set of formulae with very strong syntactic closure properties, which allow to read off models. Jaako Hintikka's original idea for completeness proofs was that for every complete calculus C and every C-consistent set one can induce a Hintikka set, from which a model can be constructed. This can be considered as a first model existence theorem. However, the process of obtaining a Hintikka set for a set C-consistent set  $\Phi$  of sentences usually involves complicated calculus-dependent constructions.

In this situation, Raymond Smullyan was able to formulate the sufficient conditions for the existence of Hintikka sets in the form of "abstract consistency properties" by isolating the calculusindependent parts of the Hintikka set construction. His technique allows to reformulate Hintikka sets as maximal elements of abstract consistency classes and interpret the Hintikka set construction as a maximizing limit process. To carry out the "model-existence"/"abstract consistency" method, we will first have to look at the notion of consistency.

Consistency and refutability are very important notions when studying the completeness for calculi; they form syntactic counterparts of satisfiability.

### Consistency

- $\triangleright$  Let  $\mathcal C$  be a calculus
- $\triangleright$  Definition  $\Phi$  is called *C*-refutable, if there is a formula **B**, such that  $\Phi \vdash_{\mathcal{C}} \mathbf{B}$  and  $\Phi \vdash_{\mathcal{C}} \neg \mathbf{B}$ .
- $\triangleright$  Definition We call a pair of formulae A and  $\neg A$  a contradiction.
- $\triangleright$  So a set  $\Phi$  is C-refutable, if C can derive a contradiction from it.
- $\triangleright$  Definition  $\Phi$  is called *C*-consistent, iff there is a formula **B**, that is not derivable from  $\Phi$  in *C*.
- $\triangleright$  Definition We call a calculus C reasonable, iff implication elimination and conjunction introduction are admissible in C and  $A \land \neg A \Rightarrow B$  is a C-theorem.



It is very important to distinguish the syntactic C-refutability and C-consistency from satisfiability, which is a property of formulae that is at the heart of semantics. Note that the former specify the calculus (a syntactic device) while the latter does not. In fact we should actually say S-satisfiability, where  $S = \langle \mathcal{L}, \mathcal{K}, \models \rangle$  is the current logical system.

Even the word "contradiction" has a syntactical flavor to it, it translates to "saying against each other" from its latin root.

Abstract Consistency			
$\triangleright$ Definition Let $\nabla$ be a family of sets. We call $\nabla$ closed under subsets, iff for each $\Phi \in \nabla$ , all subsets $\Psi \subseteq \Phi$ are elements of $\nabla$ .			
$\triangleright$ Notation: We will use $\Phi * \mathbf{A}$ for $\Phi \cup \{\mathbf{A}\}$ .			
$\triangleright$ Definition A family $\nabla$ of sets of propositional formulae is called an abstract con- sistency class, iff it is closed under subsets, and for each $\Phi \in \nabla$			
$\nabla_c$ ) $P \not\in \Phi$ or $(\neg P) \not\in \Phi$ for $P \in \mathcal{V}_o$			
$\nabla_{\neg}$ ) $(\neg \neg \mathbf{A}) \in \Phi$ implies $(\Phi * \mathbf{A}) \in \nabla$			
$\nabla_{\!$			
$\nabla_{\!\!\wedge}$ ) $(\neg \mathbf{A} \lor \mathbf{B}) \in \Phi$ implies $(\Phi \cup \{\neg \mathbf{A}, \neg \mathbf{B}\}) \in \nabla$			
$\triangleright$ Example The empty set is an abstract consistency class			
$ ho$ Example The set $\{\emptyset, \{Q\}, \{P \lor Q\}, \{P \lor Q, Q\}\}$ is an abstract consistency class			
ightarrow Example The family of satisfiable sets is an abstract consistency class.			
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So a family of sets (we call it a family, so that we do not have to say "set of sets" and we can distinguish the levels) is an abstract consistency class, iff if fulfills five simple conditions, of which the last three are closure conditions.

Think of an abstract consistency class as a family of "consistent" sets (e.g. C-consistent for some calculus C), then the properties make perfect sense: They are naturally closed under subsets — if we cannot derive a contradiction from a large set, we certainly cannot from a subset, furthermore,

- $\nabla_c$ ) If both  $P \in \Phi$  and  $(\neg P) \in \Phi$ , then  $\Phi$  cannot be "consistent".
- $\nabla_{\neg}$ ) If we cannot derive a contradiction from  $\Phi$  with  $(\neg \neg \mathbf{A}) \in \Phi$  then we cannot from  $\Phi * \mathbf{A}$ , since they are logically equivalent.

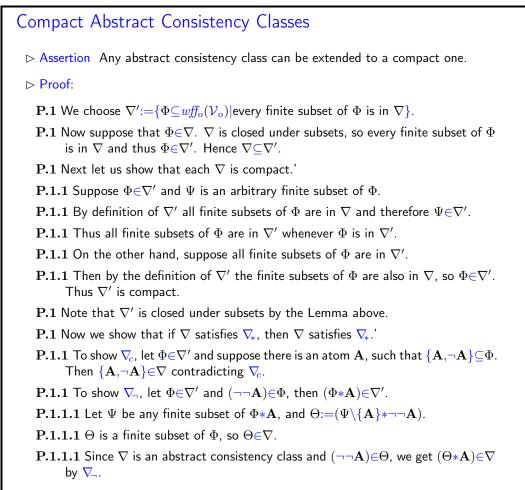
The other two conditions are motivated similarly. We will carry out the proof here, since it gives us practice in dealing with the abstract consistency properties.

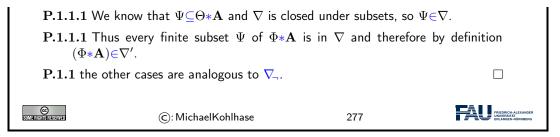
The main result here is that abstract consistency classes can be extended to compact ones. The proof is quite tedious, but relatively straightforward. It allows us to assume that all abstract consistency classes are compact in the first place (otherwise we pass to the compact extension).

Actually we are after abstract consistency classes that have an even stronger property than just being closed under subsets. This will allow us to carry out a limit construction in the Hintikka set extension argument later.

Compact Collec	tions		
	all a collection $ abla$ of sets con or every finite subset $\Psi$ of $\Phi$ .	•	e we have
ho Assertion If $ abla$ is	s compact, then $ abla$ is closed	under subsets.	
⊳ Proof:			
<b>P.1</b> Suppose $S \subseteq T$ and $T \in \nabla$ .			
<b>P.1</b> Every finite subset $A$ of $S$ is a finite subset of $T$ .			
<b>P.1</b> As $\nabla$ is compact, we know that $A \in \nabla$ .			
<b>P.1</b> Thus $S \in \nabla$ .			
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The property of being closed under subsets is a "downwards-oriented" property: We go from large sets to small sets, compactness (the interesting direction anyways) is also an "upwards-oriented" property. We can go from small (finite) sets to large (infinite) sets. The main application for the compactness condition will be to show that infinite sets of formulae are in a family  $\nabla$  by testing all their finite subsets (which is much simpler).





Hintikka sets are sets of sentences with very strong analytic closure conditions. These are motivated as maximally consistent sets i.e. sets that already contain everything that can be consistently added to them.



- $\triangleright$  Definition Let  $\nabla$  be an abstract consistency class, then we call a set  $\mathcal{H} \in \nabla$  a  $\nabla$ -Hintikka Set, iff  $\mathcal{H}$  is maximal in  $\nabla$ , i.e. for all  $\mathbf{A}$  with  $(\mathcal{H} * \mathbf{A}) \in \nabla$  we already have  $\mathbf{A} \in \mathcal{H}$ .
- $\rhd$  Assertion Let  $\nabla$  be an abstract consistency class and  ${\cal H}$  be a  $\nabla\mbox{-Hintikka}$  set, then

 $(\mathcal{H}_c)$  For all  $\mathbf{A} \in wff_o(\mathcal{V}_o)$  we have  $\mathbf{A} \notin \mathcal{H}$  or  $(\neg \mathbf{A}) \notin \mathcal{H}$ 

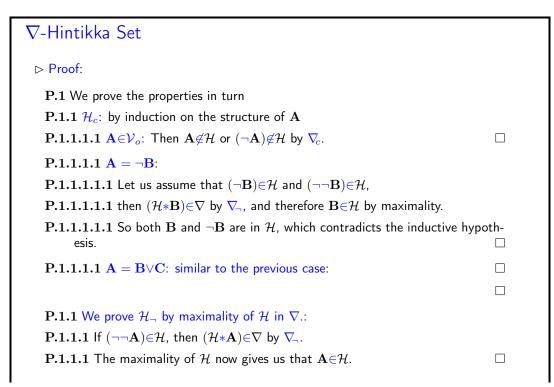
 $\mathcal{H}_\neg)$  If  $(\neg\neg\mathbf{A}){\in}\mathcal{H}$  then  $\mathbf{A}{\in}\mathcal{H}$ 

 $\mathcal{H}_{\vee}$ ) If  $(\mathbf{A} \lor \mathbf{B}) \in \mathcal{H}$  then  $\mathbf{A} \in \mathcal{H}$  or  $\mathbf{B} \in \mathcal{H}$ 

 $\mathcal{H}_{\wedge}) \text{ If } (\neg \mathbf{A} \lor \mathbf{B}) {\in} \mathcal{H} \text{ then } (\neg \mathbf{A}), (\neg \mathbf{B}) {\in} \mathcal{H}$ 

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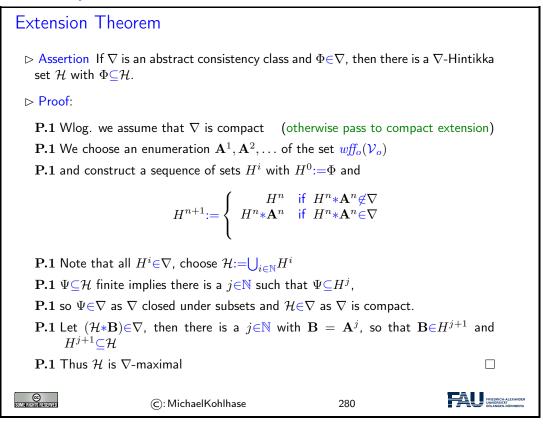
278



#### A.2. ABSTRACT CONSISTENCY AND MODEL EXISTENCE

<b>P.1.1</b> other $\mathcal{H}_*$ are similar:			
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The following theorem is one of the main results in the "abstract consistency"/"model existence" method. For any abstract consistent set  $\Phi$  it allows us to construct a Hintikka set  $\mathcal{H}$  with  $\Phi \in \mathcal{H}$ .



Note that the construction in the proof above is non-trivial in two respects. First, the limit construction for  $\mathcal{H}$  is not executed in our original abstract consistency class  $\nabla$ , but in a suitably extended one to make it compact — the original would not have contained  $\mathcal{H}$  in general. Second, the set  $\mathcal{H}$  is not unique for  $\Phi$ , but depends on the choice of the enumeration of  $wff_o(\mathcal{V}_o)$ . If we pick a different enumeration, we will end up with a different  $\mathcal{H}$ . Say if  $\mathbf{A}$  and  $\neg \mathbf{A}$  are both  $\nabla$ -consistent with  $\Phi$ , then depending on which one is first in the enumeration  $\mathcal{H}$ , will contain that one; with all the consequences for subsequent choices in the construction process.

## Valuation

- $\triangleright$  Definition A function  $\nu : wff_o(\mathcal{V}_o) \rightarrow \mathcal{D}_o$  is called a valuation, iff
  - $\triangleright \nu(\neg \mathbf{A}) = \mathsf{T}$ , iff  $\nu(\mathbf{A}) = \mathsf{F}$

 $\triangleright \nu(\mathbf{A} \lor \mathbf{B}) = \mathsf{T}$ , iff  $\nu(\mathbf{A}) = \mathsf{T}$  or  $\nu(\mathbf{B}) = \mathsf{T}$ 

 $\triangleright$  Assertion If  $\nu : wff_o(\mathcal{V}_o) \rightarrow \mathcal{D}_o$  is a valuation and  $\Phi \subseteq wff_o(\mathcal{V}_o)$  with  $\nu(\Phi) = \{\mathsf{T}\}$ , then  $\Phi$  is satisfiable.

 $\triangleright$  ProofSketch:  $\nu|_{\mathcal{V}_o} : \mathcal{V}_o \rightarrow \mathcal{D}_o$  is a satisfying variable assignment.

▷ Assertion valuation.	If $\varphi \colon \mathcal{V}_o {\rightarrow} \mathcal{D}_o$ is a variable assignment of the second secon	nent, then ${\mathcal I}_arphi \colon w_j$	$f\!\!f_o({\mathcal V}_o){ ightarrow}{\mathcal D}_o$ is a
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Now, we only have to put the pieces together to obtain the model existence theorem we are after.

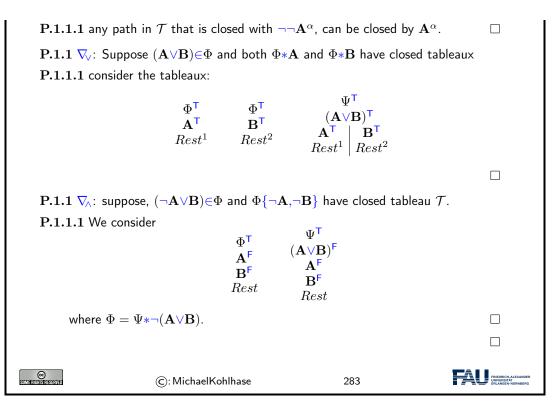
Model Exist	ence			
▷ Assertion If satisfiable.	$\nabla$ is an abstract consistency class a	and ${\mathcal H}$ a $ abla$ -Hintik	ka set, then ${\mathcal H}$ is	
⊳ Proof:				
$\mathbf{P.1}$ We defin	ne $ u(\mathbf{A}){:=}T$ , iff $\mathbf{A}{\in}\mathcal{H}$			
$\mathbf{P.1}$ then $ u$ is	a valuation by the Hintikka proper	ties		
$\mathbf{P.1}$ and thus	$\left  \left  \mathcal{V}_{o} \right   ight _{\mathcal{V}_{o}}$ is a satisfying assignment.			
$ ightarrow$ Assertion If $\nabla$ is an abstract consistency class and $\Phi \in \nabla$ , then $\Phi$ is satisfiable.				
⊳ Proof:				
$\mathbf{P.1}$ There is	a $ abla$ -Hintikka set $\mathcal H$ with $\Phi \subseteq \mathcal H$	(Ext	ension Theorem)	
P.1 We know that $\mathcal{H}$ is satisfiable. (Hintikka-Lemma)				
$\mathbf{P.1}$ In partic	ular, $\Phi \subseteq \mathcal{H}$ is satisfiable.			
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### A.3 A Completeness Proof for Propositional Tableaux

With the model existence proof we have introduced in the last section, the completeness proof for first-order natural deduction is rather simple, we only have to check that Tableaux-consistency is an abstract consistency property.

We encapsulate all of the technical difficulties of the problem in a technical Lemma. From that, the completeness proof is just an application of the high-level theorems we have just proven.

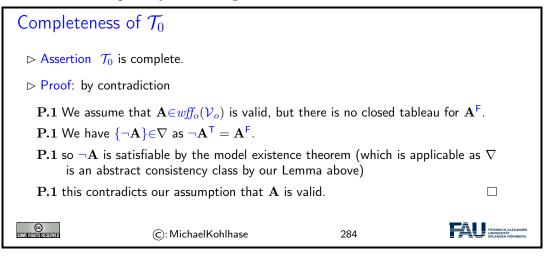
Abstract Completeness for $\mathcal{T}_0$	
$\triangleright$ Assertion { $\Phi   \Phi^{T}$ has no closed Tableau} is an abstract consistency class.	
ho Proof: Let's call the set above $ abla$	
${f P.1}$ We have to convince ourselves of the abstract consistency properties	
<b>P.1.1</b> $\nabla_c$ : $P, (\neg P) \in \Phi$ implies $(P^{F}), (P^{T}) \in \Phi^{T}$ .	
<b>P.1.1</b> $\nabla_{\neg}$ : Let $(\neg \neg \mathbf{A}) \in \Phi$ .	
<b>P.1.1.1</b> For the proof of the contrapositive we assume that $\Phi * \mathbf{A}$ has a closed tableau $\mathcal{T}$ and show that already $\Phi$ has one:	
<b>P.1.1.1</b> applying each of $\mathcal{T}_0 \neg^{T}$ and $\mathcal{T}_0 \neg^{F}$ once allows to extend any tableau with $\neg \neg \mathbf{B}^{\alpha}$ by $\mathbf{B}^{\alpha}$ .	



Observation: If we look at the completeness proof below, we see that the Lemma above is the only place where we had to deal with specific properties of the tableau calculus.

So if we want to prove completeness of any other calculus with respect to propositional logic, then we only need to prove an analogon to this lemma and can use the rest of the machinery we have already established "off the shelf".

This is one great advantage of the "abstract consistency method"; the other is that the method can be extended transparently to other logics.



187

# Appendix B First-Order Unification

We will now look into the problem of finding a substitution  $\sigma$  that make two terms equal (we say it unifies them) in more detail. The presentation of the unification algorithm we give here "transformation-based" this has been a very influential way to treat certain algorithms in theoretical computer science.

A transformation-based view of algorithms: The "transformation-based" view of algorithms divides two concerns in presenting and reasoning about algorithms according to Kowalski's slogan

computation = logic + control

The computational paradigm highlighted by this quote is that (many) algorithms can be thought of as manipulating representations of the problem at hand and transforming them into a form that makes it simple to read off solutions. Given this, we can simplify thinking and reasoning about such algorithms by separating out their "logical" part, which deals with is concerned with how the problem representations can be manipulated in principle from the "control" part, which is concerned with questions about when to apply which transformations.

It turns out that many questions about the algorithms can already be answered on the "logic" level, and that the "logical" analysis of the algorithm can already give strong hints as to how to optimize control.

In fact we will only concern ourselves with the "logical" analysis of unification here.

The first step towards a theory of unification is to take a closer look at the problem itself. A first set of examples show that we have multiple solutions to the problem of finding substitutions that make two terms equal. But we also see that these are related in a systematic way.

### Unification (Definitions)

- $\triangleright$  Definition For given terms A and B, unification is the problem of finding a substitution  $\sigma$  find, such that  $\sigma A = \sigma B$ .
- $\triangleright$  Notation: We write term pairs as  $\mathbf{A}=^{\mathbf{B}}\mathbf{B}$  e.g.  $f(X)=^{\mathbf{P}}f(g(Y))$ .
- $\triangleright \text{ Definition Solutions (e.g. } [g(a)/X], [a/Y], [g(g(a))/X], [g(a)/Y], \text{ or } [g(Z)/X], [Z/Y])$ are called unifiers,  $\mathbf{U}(\mathbf{A}={}^{?}\mathbf{B}):=\{\sigma|\sigma\mathbf{A}=\sigma\mathbf{B}\}.$
- $\triangleright$  Idea: Find representatives in **U**(**A**=<sup>?</sup>**B**), that generate the set of solutions.
- $\triangleright$  Definition Let  $\sigma$  and  $\theta$  be substitutions and  $W \subseteq \mathcal{V}_{\iota}$ , we say that a substitution  $\sigma$  is more general than  $\theta$  (on W; write  $\sigma \leq \theta[W]$ ), iff there is a substitution  $\rho$ , such that  $\theta = (\rho \circ \sigma)[W]$ , where  $\sigma = \rho[W]$ , iff  $\sigma X = \rho X$  for all  $X \in W$ .

	$\sigma$ is called a most general unified wrt. $\leq [(\text{free}(\mathbf{A}) \cup \text{free}(\mathbf{B}))].$	er of ${f A}$ and ${f B}$ , iff i	t is minimal in
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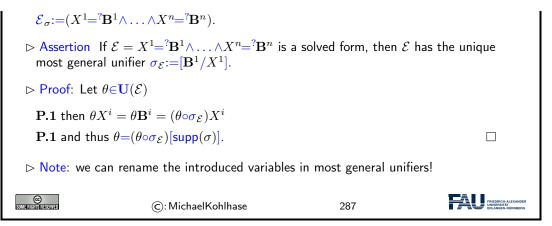
The idea behind a most general unifier is that all other unifiers can be obtained from it by (further) instantiation. In an automated theorem proving setting, this means that using most general unifiers is the least committed choice — any other choice of unifiers (that would be necessary for completeness) can later be obtained by other substitutions.

Note that there is a subtlety in the definition of the ordering on substitutions: we only compare on a subset of the variables. The reason for this is that we have defined substitutions to be total on (the infinite set of) variables for flexibility, but in the applications (see the definition of a most general unifiers), we are only interested in a subset of variables: the ones that occur in the initial problem formulation. Intuitively, we do not care what the unifiers do off that set. If we did not have the restriction to the set W of variables, the ordering relation on substitutions would become much too fine-grained to be useful (i.e. to guarantee unique most general unifiers in our case). Now that we have defined the problem, we can turn to the unification algorithm itself. We will define it in a way that is very similar to logic programming: we first define a calculus that generates "solved forms" (formulae from which we can read off the solution) and reason about control later. In this case we will reason that control does not matter.

Unification	(Equational Systems)		
⊳ Idea: Unifi	cation is equation solving.		
$\triangleright$ Definition We call a formula $\mathbf{A}^1 = \mathbf{B}^1 \wedge \ldots \wedge \mathbf{A}^n = \mathbf{B}^n$ an equational system iff $\mathbf{A}^i, \mathbf{B}^i \in wff_{\iota}(\Sigma_{\iota}, \mathcal{V}_{\iota}).$			
▷ We consider equational systems as sets of equations (∧ is ACI), and equations as two-element multisets (= <sup>?</sup> is C).			
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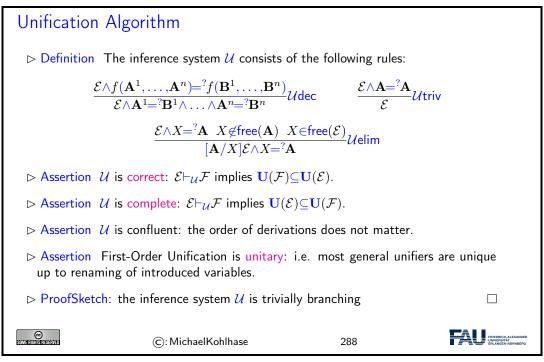
In principle, unification problems are sets of equations, which we write as conjunctions, since all of them have to be solved for finding a unifier. Note that it is not a problem for the "logical view" that the representation as conjunctions induces an order, since we know that conjunction is associative, commutative and idempotent, i.e. that conjuncts do not have an intrinsic order or multiplicity, if we consider two equational problems as equal, if they are equivalent as propositional formulae. In the same way, we will abstract from the order in equations, since we know that the equality relation is symmetric. Of course we would have to deal with this somehow in the implementation (typically, we would implement equational problems as lists of pairs), but that belongs into the "control" aspect of the algorithm, which we are abstracting from at the moment.

Solved forms and Most General Unifiers
▷ Definition We call a pair A=<sup>?</sup>B solved in a unification problem *E*, iff A = X, *E* = X=<sup>?</sup>A∧*E*, and X∉(free(A)∪free(*E*)). We call an unification problem *E* a solved form, iff all its pairs are solved.
▷ Assertion Solved forms are of the form X<sup>1</sup>=<sup>?</sup>B<sup>1</sup>∧...∧X<sup>n</sup>=<sup>?</sup>B<sup>n</sup> where the X<sup>i</sup> are distinct and X<sup>i</sup>∉free(B<sup>j</sup>).
▷ Definition Any substitution σ = [B<sup>1</sup>/X<sup>1</sup>] induces a solved unification problem



It is essential to our "logical" analysis of the unification algorithm that we arrive at equational problems whose unifiers we can read off easily. Solved forms serve that need perfectly as shows.

Given the idea that unification problems can be expressed as formulae, we can express the algorithm in three simple rules that transform unification problems into solved forms (or unsolvable ones).



The decomposition rule  $\mathcal{U}$ dec is completely straightforward, but note that it transforms one unification pair into multiple argument pairs; this is the reason, why we have to directly use unification problems with multiple pairs in  $\mathcal{U}$ .

Note furthermore, that we could have restricted the  $\mathcal{U}$ triv rule to variable-variable pairs, since for any other pair, we can decompose until only variables are left. Here we observe, that constantconstant pairs can be decomposed with the  $\mathcal{U}$ dec rule in the somewhat degenerate case without arguments.

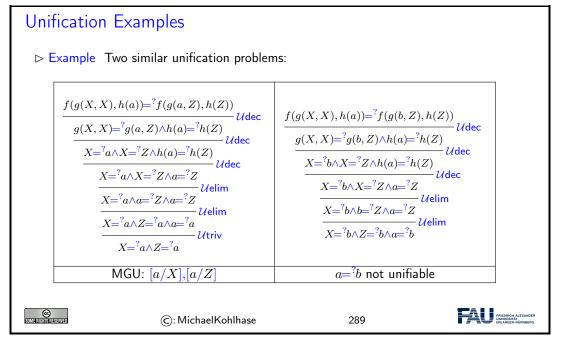
Finally, we observe that the first of the two variable conditions in  $\mathcal{U}$ elim (the "occurs-in-check") makes sure that we only apply the transformation to unifiable unification problems, whereas the second one is a termination condition that prevents the rule to be applied twice.

The notion of completeness and correctness is a bit different than that for calculi that we compare to the entailment relation. We can think of the "logical system of unifiability" with the model class of sets of substitutions, where a set satisfies an equational problem  $\mathcal{E}$ , iff all of

its members are unifiers. This view induces the soundness and completeness notions presented above.

The three meta-properties above are relatively trivial, but somewhat tedious to prove, so we leave the proofs as an exercise to the reader.

We now fortify our intuition about the unification calculus by two examples. Note that we only need to pursue one possible  $\mathcal{U}$  derivation since we have confluence.



We will now convince ourselves that there cannot be any infinite sequences of transformations in  $\mathcal{U}$ . Termination is an important property for an algorithm.

The proof we present here is very typical for termination proofs. We map unification problems into a partially ordered set  $\langle S, \prec \rangle$  where we know that there cannot be any infinitely descending sequences (we think of this as measuring the unification problems). Then we show that all transformations in  $\mathcal{U}$  strictly decrease the measure of the unification problems and argue that if there were an infinite transformation in  $\mathcal{U}$ , then there would be an infinite descending chain in S, which contradicts our choice of  $\langle S, \prec \rangle$ .

The crucial step in in coming up with such proofs is finding the right partially ordered set. Fortunately, there are some tools we can make use of. We know that  $\langle \mathbb{N}, < \rangle$  is terminating, and there are some ways of lifting component orderings to complex structures. For instance it is well-known that the lexicographic ordering lifts a terminating ordering to a terminating ordering on finite-dimensional Cartesian spaces. We show a similar, but less known construction with multisets for our proof.

Unification (Termination)
▷ Definition Let S and T be multisets and ≺ a partial ordering on S∪T. Then we define S ≺<sup>m</sup> S, iff S = C⊎T' and T = C⊎{t}, where s ≺t for all s∈S'. We call ≺<sup>m</sup> the multiset ordering induced by ≺.
▷ Assertion If ≺ is linear/terminating on S, then ≺<sup>m</sup> is linear/terminating on P(S).
▷ Assertion U is terminating. (any U-derivation is finite)
▷ Proof: We prove termination by mapping U transformation into a Noetherian space.

<b>P.1</b> Let $\mu(\mathcal{E}):=\langle n,\mathcal{N} \rangle$ , where			
$\rhd n$ is the number of unsolved variables in $\mathcal E$ $\rhd \ \mathcal N$ is the multiset of term depths in $\mathcal E$			
${f P.1}$ The lexicographic order $\prec$ on pairs $\mu({\cal E})$ is decreased by all inference rules.			
P.1.1 Udec and Utriv decrease the multiset of term depths without increasing the unsolved variables			
P.1.1 Uelim decreases the number of unsolved variables (by one), but may increase term depths.			
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But it is very simple to create terminating calculi, e.g. by having no inference rules. So there is one more step to go to turn the termination result into a decidability result: we must make sure that we have enough inference rules so that any unification problem is transformed into solved form if it is unifiable.

First-Order Unification is Decidable			
$\triangleright$ Definition We call an equational problem $\mathcal{E} \ \mathcal{U}$ -reducible, iff there is a $\mathcal{U}$ -step $\mathcal{E}\vdash_{\mathcal{U}} \mathcal{F}$ from $\mathcal{E}$ .			
$\triangleright$ Assertion If $\mathcal{E}$ is unifiable but not solved, then it is $\mathcal{U}$ -reducible.			
$ ho$ Proof: We assume that ${\cal E}$ is unifiable but unsolved and show the ${\cal U}$ rule that applies.			
<b>P.1</b> There is an unsolved pair $A=^{?}B$ in $\mathcal{E}=\mathcal{E}\wedge A=^{?}B'$ .			
P.1 we have two cases			
<b>P.1.1</b> A, $\mathbf{B} \notin \mathcal{V}_{\iota}$ : then $\mathbf{A} = f(\mathbf{A}^1 \dots \mathbf{A}^n)$ and $\mathbf{B} = f(\mathbf{B}^1 \dots \mathbf{B}^n)$ , and thus $\mathcal{U}$ dec is applicable			
<b>P.1.1</b> $\mathbf{A} = X \in free(\mathcal{E})$ : then $\mathcal{U}elim$ (if $\mathbf{B} \neq X$ ) or $\mathcal{U}triv$ (if $\mathbf{B} = X$ ) is applicable.			
$\triangleright$ Assertion First-order unification is decidable in PL <sup>1</sup> .			
⊳ Proof:			
${f P.1}~{\cal U}$ -irreducible sets of equations can be obtained in finite time by termination.			
$\mathbf{P.1}$ They are either solved or unsolvable by , so they provide the answer. $\Box$			
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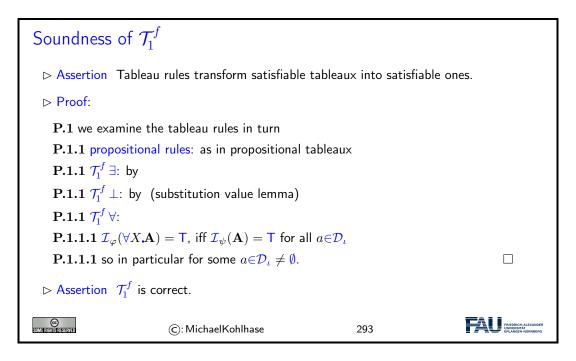
## Appendix C

## Soundness and Completeness of First-Order Tableaux

For the soundness result, we recap the definition of soundness for test calculi from the propositional case.

Soundness (T	ableau)			
	Idea: A test calculus is sound, iff it preserves satisfiability and the goal formulae are unsatisfiable.			
▷ Definition A I	abeled formula $\mathbf{A}^lpha$ is valid u	nder $\varphi$ , iff $\mathcal{I}_{\varphi}(\mathbf{A}) = c$	χ.	
	ableau ${\mathcal T}$ is satisfiable, iff the ulae in ${\mathcal P}$ is satisfiable.	ere is a satisfiable brar	nch ${\mathcal P}$ in ${\mathcal T}$ , i.e. if	
▷ Assertion Tab	leau rules transform satisfiab	le tableaux into satisf	iable ones.	
$ ightarrow$ Assertion A set $\Phi$ of propositional formulae is valid, if there is a closed tableau $\mathcal{T}$ for $\Phi^{F}$ .				
⊳ Proof: by cont	tradiction: Suppose $\Phi$ is not	valid.		
<b>P.1</b> then the initial tableau is satisfiable $(\Phi^{F} \text{ satisfiable})$				
${f P.1}$ so ${\cal T}$ is satisfiable, by our Lemma.				
P.1 there is a satisfiable branch (by definition)				
P.1 but all branches are closed $(\mathcal{T} \text{ closed})$				
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Thus we only have to prove , this is relatively easy to do. For instance for the first rule: if we have a tableau that contains  $(\mathbf{A}\wedge\mathbf{B})^{\mathsf{T}}$  and is satisfiable, then it must have a satisfiable branch. If  $(\mathbf{A}\wedge\mathbf{B})^{\mathsf{T}}$  is not on this branch, the tableau extension will not change satisfiability, so we can assume that it is on the satisfiable branch and thus  $\mathcal{I}_{\varphi}(\mathbf{A}\wedge\mathbf{B}) = \mathsf{T}$  for some variable assignment  $\varphi$ . Thus  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathsf{T}$  and  $\mathcal{I}_{\varphi}(\mathbf{B}) = \mathsf{T}$ , so after the extension (which adds the formulae  $\mathbf{A}^{\mathsf{T}}$  and  $\mathbf{B}^{\mathsf{T}}$  to the branch), the branch is still satisfiable. The cases for the other rules are similar. The soundness of the first-order free-variable tableaux calculus can be established a simple induction over the size of the tableau.

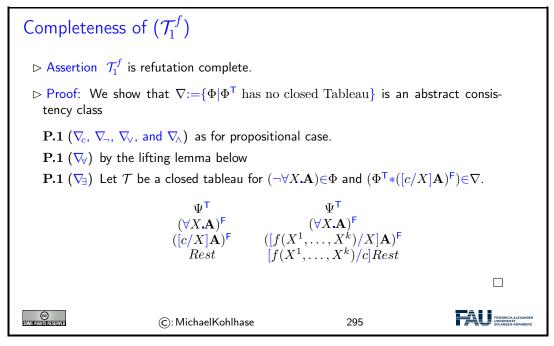


The only interesting steps are the cut rule, which can be directly handled by the substitution value lemma, and the rule for the existential quantifier, which we do in a separate lemma.

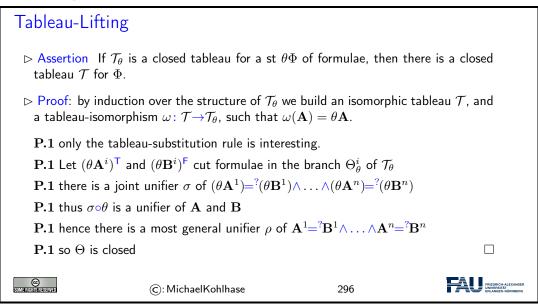
Soundness of  $\mathcal{T}_1^f \exists$  $\triangleright$  Assertion  $\mathcal{T}_1^f \exists$  transforms satisfiable tableaux into satisfiable ones.  $\triangleright$  Proof: Let  $\mathcal{T}'$  be obtained by applying  $\mathcal{T}_1^f \exists$  to  $(\forall X.\mathbf{A})^{\mathsf{F}}$  in  $\mathcal{T}$ , extending it with  $([f(X^1, \ldots, X^n)/X]\mathbf{A})^{\mathsf{F}}$ , where W:=free $(\forall X.\mathbf{A}) = \{X^1, \ldots, X^k\}$ **P.1** Let  $\mathcal{T}$  be satisfiable in  $\mathcal{M}:=\langle \mathcal{D}, \mathcal{I} \rangle$ , then  $\mathcal{I}_{\varphi}(\forall X.\mathbf{A}) = \mathbf{F}$ . **P.1** We need to find a model  $\mathcal{M}'$  that satisfies  $\mathcal{T}'$  (find interpretation for f) **P.1** By definition  $\mathcal{I}_{(\varphi, [a/X])}(\mathbf{A}) = \mathsf{F}$  for some  $a \in \mathcal{D}$ (depends on  $\varphi|_W$ ) **P.1** Let  $g: \mathcal{D}^k \to \mathcal{D}$  be defined by  $g(a_1, \ldots, a_k) := a_i$  if  $\varphi(X^i) = a_i$ **P.1** choose  $\mathcal{M} = \langle \mathcal{D}, \mathcal{I}' \rangle'$  with  $\mathcal{I}' := (\mathcal{I}, [q/f])$ , then by subst. value lemma  $\mathcal{I}'_{\varphi}([f(X^1,\ldots,X^k)/X]\mathbf{A}) = \mathcal{I}'_{(\varphi,[\mathcal{I}'_{\varphi}(f(X^1,\ldots,X^k))/X])}(\mathbf{A})$  $= \mathcal{I}'_{(\omega, [a/X])}(\mathbf{A}) = \mathbf{F}$ **P.1** So  $([f(X^1, \ldots, X^k)/X]\mathbf{A})^{\mathsf{F}}$  satisfiable in  $\mathcal{M}'$ (C) (C): MichaelKohlhase 294

This proof is paradigmatic for soundness proofs for calculi with Skolemization. We use the axiom of choice at the meta-level to choose a meaning for the Skolem function symbol.

Armed with the Model Existence Theorem for first-order logic (), the completeness of firstorder tableaux is similarly straightforward. We just have to show that the collection of tableauirrefutable sentences is an abstract consistency class, which is a simple proof-transformation exercise in all but the universal quantifier case, which we postpone to its own Lemma ().



So we only have to treat the case for the universal quantifier. This is what we usually call a "lifting argument", since we have to transform ("lift") a proof for a formula  $\theta \mathbf{A}$  to one for  $\mathbf{A}$ . In the case of tableaux we do that by an induction on the tableau refutation for  $\theta \mathbf{A}$  which creates a tableau-isomorphism to a tableau refutation for  $\mathbf{A}$ .



Again, the "lifting lemma for tableaux" is paradigmatic for lifting lemmata for other refutation calculi.

198 APPENDIX C. SOUNDNESS AND COMPLETENESS OF FIRST-ORDER TABLEAUX

### Appendix D

## Properties of the Simply Typed $\lambda$ Calculus

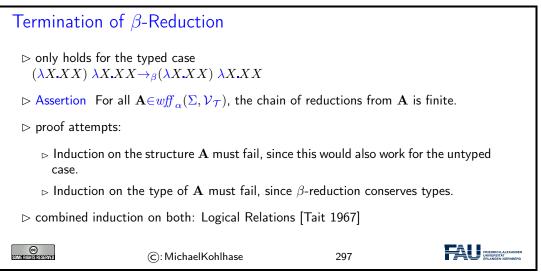
### D.1 Computational Properties of $\lambda$ -Calculus

As we have seen above, the main contribution of the  $\lambda$ -calculus is that it casts the comprehension and (functional) extensionality axioms in a way that is more amenable to automation in reasoning systems, since they can be oriented into a confluent and terminating reduction system. In this Section we prove the respective properties. We start out with termination, since we will need it later in the proof of confluence.

### **D.1.1** Termination of $\beta$ -reduction

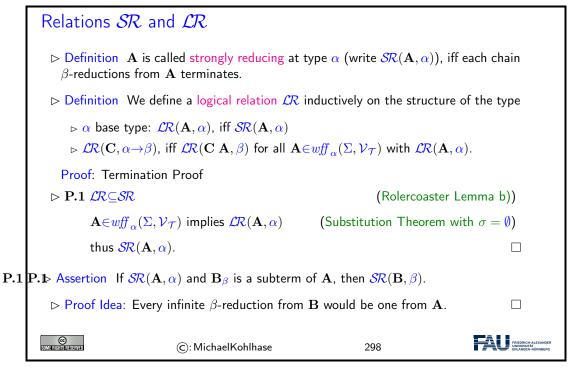
We will use the termination of  $=_{\beta}$  reduction to present a very powerful proof method, called the "logical relations method", which is one of the basic proof methods in the repertoire of a proof theorist, since it can be extended to many situations, where other proof methods have no chance of succeeding.

Before we start into the termination proof, we convince ourselves that a straightforward induction over the structure of expressions will not work, and we need something more powerful.



The overall shape of the proof is that we reason about two relations: SR and LR between  $\lambda$ -terms and their types. The first is the one that we are interested in,  $LR(\mathbf{A}, \alpha)$  essentially states the property that  $=_{\beta\eta}$  reduction terminates at  $\mathbf{A}$ . Whenever the proof needs to argue by induction

on types it uses the "logical relation"  $\mathcal{LR}$ , which is more "semantic" in flavor. It coincides with  $\mathcal{SR}$  on base types, but is defined via a functionality property.

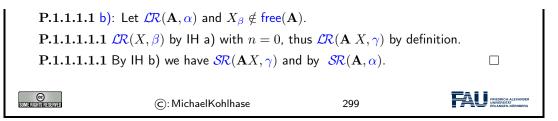


The termination proof proceeds in two steps, the first one shows that  $\mathcal{LR}$  is a sub-relation of  $\mathcal{SR}$ , and the second that  $\mathcal{LR}$  is total on  $\lambda$ -terms. Together they give the termination result.

The next result proves two important technical side results for the termination proofs in a joint induction over the structure of the types involved. The name "rollercoaster lemma" alludes to the fact that the argument starts with base type, where things are simple, and iterates through the two parts each leveraging the proof of the other to higher and higher types.

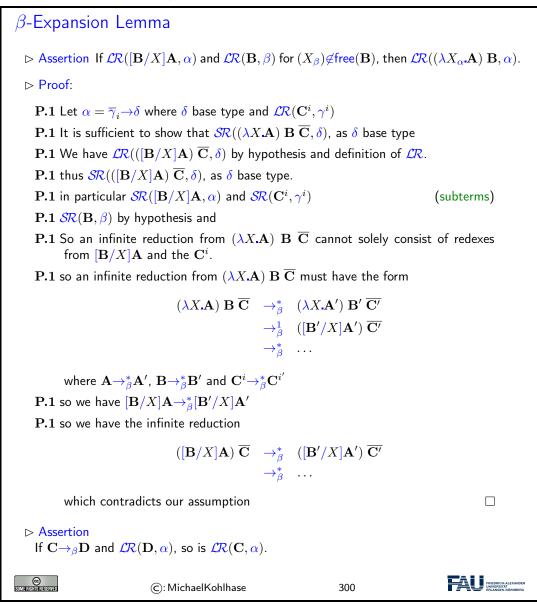
 $\mathcal{LR} \subseteq \mathcal{SR}$  (Rollercoaster Lemma)  $\triangleright$  Assertion a) If h is a constant or variable of type  $\overline{\alpha}_n \to \alpha$  and  $\mathcal{SR}(\mathbf{A}^i, \alpha^i)$ , then  $\mathcal{LR}(h \ \overline{\mathbf{A}^n}, \alpha)$ . b)  $\mathcal{LR}(\mathbf{A}, \alpha)$  implies  $\mathcal{SR}(\mathbf{A}, \alpha)$ . **Proof**: we prove both assertions by simultaneous induction on  $\alpha$  $\triangleright$  **P.1.1**  $\alpha$  base type: **P.1.1.1.1** a):  $h \overline{\mathbf{A}^n}$  is strongly reducing, since the  $\mathbf{A}^i$  are (brackets!) **P.1.1.1.1.1** so  $\mathcal{LR}(h \ \overline{\mathbf{A}^n}, \alpha)$  as  $\alpha$  is a base type ( $\mathcal{SR} = \mathcal{LR}$ ) P.1.1.1.1 b): by definition  $\alpha = \beta \rightarrow \gamma$ : **PP1111.1.1** a): Let  $\mathcal{LR}(\mathbf{B}, \beta)$ . **P.1.1.1.1.1** by IH b) we have  $\mathcal{SR}(\mathbf{B},\beta)$ , and  $\mathcal{LR}((h \ \overline{\mathbf{A}^n}) \ \mathbf{B},\gamma)$  by IH a) **P.1.1.1.1.1** so  $\mathcal{L}(h \ \overline{\mathbf{A}^n}, \alpha)$  by definition. 

#### D.1. COMPUTATIONAL PROPERTIES OF $\lambda$ -CALCULUS



The part of the rollercoaster lemma we are really interested in is part b). But part a) will become very important for the case where n = 0; here it states that constants and variables are  $\mathcal{LR}$ .

The next step in the proof is to show that all well-formed formulae are  $\mathcal{LR}$ . For that we need to prove closure of  $\mathcal{LR}$  under  $=_{\beta}$  expansion



Note that this Lemma is one of the few places in the termination proof, where we actually look at the properties of  $\beta$  reduction.

We now prove that every well-formed formula is related to its type by  $\mathcal{LR}$ . But we cannot prove this by a direct induction. In this case we have to strengthen the statement of the theorem – and thus the inductive hypothesis, so that we can make the step cases go through. This is common for non-trivial induction proofs. Here we show instead that *every instance* of a well-formed formula is related to its type by  $\mathcal{LR}$ ; we will later only use this result for the cases of the empty substitution, but the stronger assertion allows a direct induction proof.

 $\mathbf{A} \in wff_{\alpha}(\Sigma, \mathcal{V}_{\mathcal{T}})$  implies  $\mathcal{LR}(\mathbf{A}, \alpha)$  $\triangleright$  Definition We write  $\mathcal{LR}(\sigma)$  if  $\mathcal{LR}(\sigma X_{\alpha}, \alpha)$  for all  $X \in \text{supp}(\sigma)$ .  $\triangleright$  Assertion If  $\mathbf{A} \in wff_{\alpha}(\Sigma, \mathcal{V}_{\mathcal{T}})$ , then  $\mathcal{LR}(\sigma \mathbf{A}, \alpha)$  for any substitution  $\sigma$  with  $\mathcal{LR}(\sigma)$ .  $\triangleright$  **Proof**: by induction on the structure of **A P.1.1**  $\mathbf{A} = X_{\alpha} \in \operatorname{supp}(\sigma)$ : then  $\mathcal{LR}(\sigma \mathbf{A}, \alpha)$  by assumption **P.1.1**  $\mathbf{A} = X \notin \operatorname{supp}(\sigma)$ : then  $\sigma \mathbf{A} = \mathbf{A}$  and  $\mathcal{LR}(\mathbf{A}, \alpha)$  by with n = 0.  $\square$ **P.1.1**  $\mathbf{A} \in \Sigma$ : then  $\sigma \mathbf{A} = \mathbf{A}$  as above **P.1.1** A = BC: by IH  $\mathcal{LR}(\sigma B, (\gamma \rightarrow \alpha))$  and  $\mathcal{LR}(\sigma C, \gamma)$ **P.1.1.1** so  $\mathcal{LR}((\sigma \mathbf{B}) \sigma \mathbf{C}, \alpha)$  by definition of  $\mathcal{LR}$ . **P.1.1**  $\mathbf{A} = \lambda X_{\beta} \mathbf{C}_{\gamma}$ : Let  $\mathcal{L}(\mathbf{B}, \beta)$  and  $\theta := (\sigma, [\mathbf{B}/X])$ , then  $\theta$  meets the conditions of the IH. **P.1.1.1** Moreover  $(\sigma \lambda X_{\beta} \mathbf{C}_{\gamma}) \mathbf{B} \rightarrow_{\beta} (\sigma, [\mathbf{B}/X]) \mathbf{C} = \theta \mathbf{C}.$ **P.1.1.1** Now,  $\mathcal{LR}(\theta \mathbf{C}, \gamma)$  by IH and thus  $\mathcal{LR}((\sigma \mathbf{A}) \mathbf{B}, \gamma)$  by . **P.1.1.1** So  $\mathcal{LR}(\sigma \mathbf{A}, \alpha)$  by definition of  $\mathcal{LR}$ . C: MichaelKohlhase 301

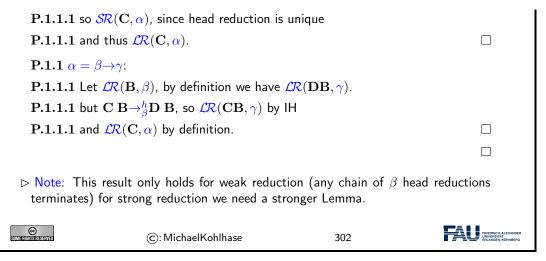
In contrast to the proof of the roller coaster Lemma above, we prove the assertion here by an induction on the structure of the  $\lambda$ -terms involved. For the base cases, we can directly argue with the first assertion from , and the application case is immediate from the definition of  $\mathcal{LR}$ . Indeed, we defined the auxiliary relation  $\mathcal{LR}$  exclusively that the application case – which cannot be proven by a direct structural induction; remember that we needed induction on types in – becomes easy.

The last case on  $\lambda$ -abstraction reveals why we had to strengthen the inductive hypothesis:  $\beta$  reduction introduces a substitution which may increase the size of the subterm, which in turn keeps us from applying the inductive hypothesis. Formulating the assertion directly under all possible  $\mathcal{LR}$  substitutions unblocks us here.

This was the last result we needed to complete the proof of termiation of  $=_{\beta}$ -reduction. Remark:

If we are only interested in the termination of head reductions, we can get by with a much simpler version of this lemma, that basically relies on the uniqueness of head  $=_{\beta}$  reduction.

Closure under Head  $\beta$ -Expansion (weakly reducing)  $\triangleright$  Assertion If  $\mathbf{C} \rightarrow^{h}_{\beta} \mathbf{D}$  and  $\mathcal{LR}(\mathbf{D}, \alpha)$ , so is  $\mathcal{LR}(\mathbf{C}, \alpha)$ .  $\triangleright$  Proof: by induction over the structure of  $\alpha$ P.1.1  $\alpha$  base type: P.1.1.1 we have  $\mathcal{SR}(\mathbf{D}, \alpha)$  by definition

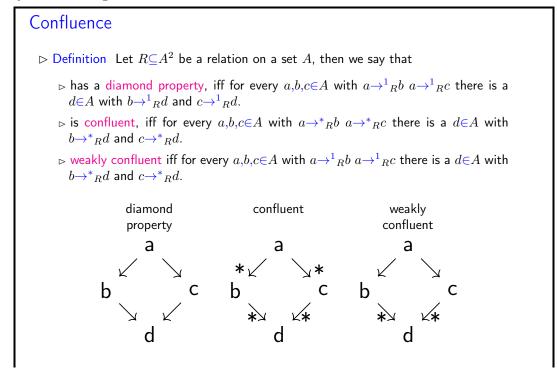


For the termination proof of head  $=_{\beta}$ -reduction we would just use the same proof as above, just for a variant of SR, where  $SR(\mathbf{A}, \alpha)$  that only requires that the head reduction sequence out of  $\mathbf{A}$  terminates. Note that almost all of the proof except (which holds by the same argument) is invariant under this change. Indeed Rick Statman uses this observation in [Sta85] to give a set of conditions when logical relations proofs work.

### **D.1.2** Confluence of $\beta \eta$ Conversion

We now turn to the confluence for  $=_{\beta\eta}$ , i.e. that the order of reductions is irrelevant. This entails the uniqueness of  $=_{\beta\eta}$  normal forms, which is very useful.

Intuitively confluence of a relation R means that "anything that flows apart will come together again." – and as a consequence normal forms are unique if they exist. But there is more than one way of formalizing that intuition.



APPENDIX D. PROPERTIES OF THE SIMPLY TYPED  $\lambda$  CALCULUS

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The diamond property is very simple, but not many reduction relations enjoy it. Confluence is the notion that that directly gives us unique normal forms, but is difficult to prove via a digram chase, while weak confluence is amenable to this, does not directly give us confluence.

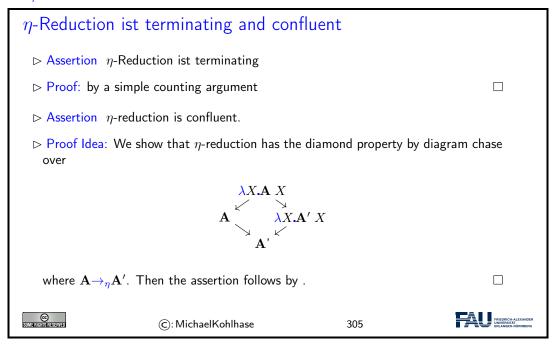
We will now relate the three notions of confluence with each other: the diamond property (sometimes also called strong confluence) is stronger than confluence, which is stronger than weak confluence

Relating the no	tions of confluence			
$\triangleright$ Assertion If a re	write relation has a diamond p	property, then it is w	eakly confluent.	
$\triangleright$ Assertion If a rewrite relation has a diamond property, then it is confluent.				
$\triangleright$ Proof Idea: by a	tiling argument, composing $1$	imes 1 diamonds to an	$n \times m$ diamond.	
Assertion If a rewrite relation is terminating and weakly confluent, then it is also confluent.				
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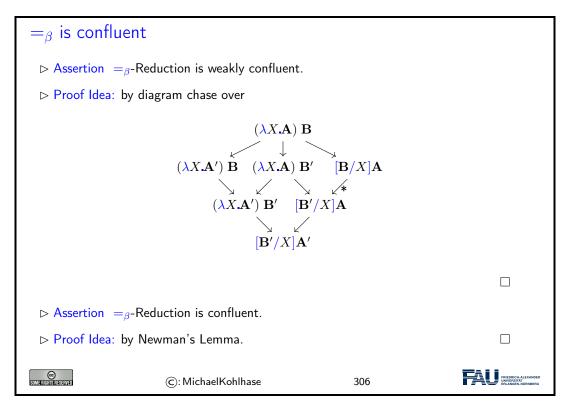
Note that Newman's Lemma cannot be proven by a tiling argument since we cannot control the growth of the tiles. There is a nifty proof by Gérard Huet [Hue80] that is worth looking at.

After this excursion into the general theory of reduction relations, we come back to the case at hand: showing the confluence of  $=_{\beta\eta}$ -reduction.

 $\rightarrow_n^*$  is very well-behaved – i.e. confluent and terminating

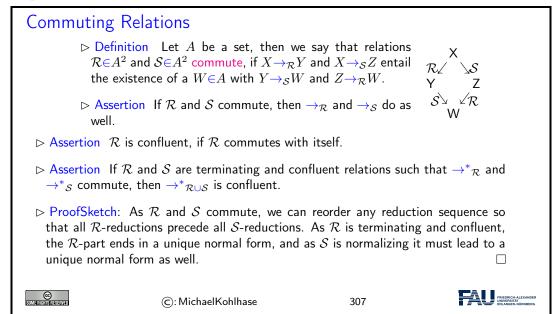


For  $=_{\beta}$ -reduction the situation is a bit more involved, but a simple diagram chase is still sufficient to prove weak confluence, which gives us confluence via

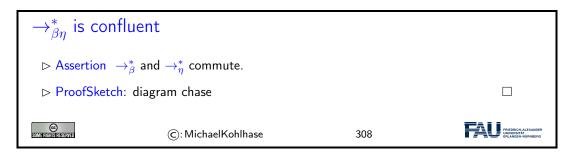


There is one reduction in the diagram in the proof of which (note that **B** can occur multiple times in  $[\mathbf{B}/X]\mathbf{A}$ ) is not necessary single-step. The diamond property is broken by the outer two reductions in the diagram as well.

We have shown that the  $=_{\beta}$  and  $=_{\eta}$  reduction relations are terminating and confluent and terminating individually, now, we have to show that  $=_{\beta\eta}$  is a well. For that we introduce a new concept.

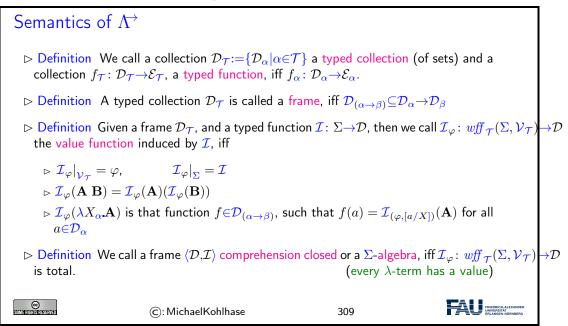


This directly gives us our goal.



### D.2 The Semantics of the Simply Typed $\lambda$ -Calculus

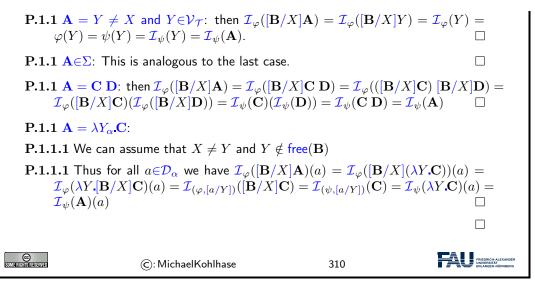
The semantics of  $\Lambda^{\rightarrow}$  is structured around the types. Like the models we discussed before, a model (we call them "algebras", since we do not have truth values in  $\Lambda^{\rightarrow}$ ) is a pair  $\langle \mathcal{D}, \mathcal{I} \rangle$ , where  $\mathcal{D}$  is the universe of discourse and  $\mathcal{I}$  is the interpretation of constants.



### D.2.1 Soundness of the Simply Typed $\lambda$ -Calculus

We will now show is that  $=_{\alpha\beta\eta}$ -reduction does not change the value of formulae, i.e. if  $\mathbf{A}=_{\alpha\beta\eta}\mathbf{B}$ , then  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathcal{I}_{\varphi}(\mathbf{B})$ , for all  $\mathcal{D}$  and  $\varphi$ . We say that the reductions are sound. As always, the main tool for proving soundess is a substitution value lemma. It works just as always and verifies that we the definitions are in our semantics plausible.

Substitution Value Lemma for  $\lambda$ -Terms  $\triangleright \text{ Assertion Let } \mathbf{A} \text{ and } \mathbf{B} \text{ be terms, then } \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) = \mathcal{I}_{\psi}(\mathbf{A}), \text{ where } \psi = \varphi, [\mathcal{I}_{\varphi}(\mathbf{B})/X]$   $\triangleright \text{ Proof: by induction on the depth of } \mathbf{A}$ P.1 we have five cases
P.1.1  $\mathbf{A} = X$ : Then  $\mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}) = \mathcal{I}_{\varphi}([\mathbf{B}/X]X) = \mathcal{I}_{\varphi}(\mathbf{B}) = \psi(X) = \mathcal{I}_{\psi}(X) = \mathcal{I}_{\psi}(\mathbf{A}).$ 



Soundness of  $\alpha\beta\eta$ -Equality  $\geq \text{Assertion Let } \mathcal{A}:=\langle \mathcal{D},\mathcal{I} \rangle \text{ be a } \Sigma\text{-algebra and } Y \notin \text{free}(\mathbf{A}), \text{ then } \mathcal{I}_{\varphi}(\lambda X.\mathbf{A}) = \mathcal{I}_{\varphi}(\lambda Y.[Y/X]\mathbf{A}) \text{ for all assignments } \varphi.$   $\geq \text{Proof: by substitution value lemma}$   $\mathcal{I}_{\varphi}(\lambda Y.[Y/X]\mathbf{A})@a = \mathcal{I}_{(\varphi,[a/Y])}([Y/X]\mathbf{A}) = \mathcal{I}_{(\varphi,[a/X])}(\mathbf{A}) = \mathcal{I}_{(\varphi,[a/X])}(\mathbf{A}) = \mathcal{I}_{\varphi}(\lambda X.\mathbf{A})@a$   $\geq \text{Assertion If } \mathcal{A}:=\langle \mathcal{D},\mathcal{I} \rangle \text{ is a } \Sigma\text{-algebra and } X \text{ not bound in } \mathbf{A}, \text{ then } \mathcal{I}_{\varphi}((\lambda X.\mathbf{A}) \mathbf{B}) = \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A}).$   $\geq \text{Proof: by substitution value lemma again}$   $\mathcal{I}_{\varphi}((\lambda X.\mathbf{A}) \mathbf{B}) = \mathcal{I}_{\varphi}(\lambda X.\mathbf{A})@\mathcal{I}_{\varphi}(\mathbf{B}) = \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A})$   $= \mathcal{I}_{\varphi}([\mathbf{B}/X]\mathbf{A})$ 

### Soundness of $\alpha\beta\eta$ (continued) $\triangleright$ Assertion If $X \notin \text{free}(\mathbf{A})$ , then $\mathcal{I}_{\varphi}(\lambda X \cdot \mathbf{A} X) = \mathcal{I}_{\varphi}(\mathbf{A})$ for all $\varphi$ .

 $\triangleright$  **Proof**: by calculation

$$\begin{split} \mathcal{I}_{\varphi}(\lambda X.\mathbf{A} \ X) @\mathbf{a} &= \mathcal{I}_{(\varphi, [\mathbf{a}/X])}(\mathbf{A} \ X) \\ &= \mathcal{I}_{(\varphi, [\mathbf{a}/X])}(\mathbf{A}) @\mathcal{I}_{(\varphi, [\mathbf{a}/X])}(X) \\ &= \mathcal{I}_{\varphi}(\mathbf{A}) @\mathcal{I}_{(\varphi, [\mathbf{a}/X])}(X) \quad \text{ as } X \notin \mathsf{free}(\mathbf{A}). \\ &= \mathcal{I}_{\varphi}(\mathbf{A}) @\mathbf{a} \end{split}$$

 $\succ \text{Assertion } \alpha\beta\eta \text{-equality is sound wrt. } \Sigma \text{-algebras. (if } \mathbf{A} =_{\alpha\beta\eta} \mathbf{B} \text{, then } \mathcal{I}_{\varphi}(\mathbf{A}) = \mathcal{I}_{\varphi}(\mathbf{B}) \text{ for all assignments } \varphi)$   $\boxed{\mathbf{C}: \text{MichaelKohlhase}} \qquad 312$ 

### **D.2.2** Completeness of $\alpha\beta\eta$ -Equality

We will now show is that  $=_{\alpha\beta\eta}$ -equality is complete for the semantics we defined, i.e. that whenever  $\mathcal{I}_{\varphi}(\mathbf{A}) = \mathcal{I}_{\varphi}(\mathbf{B})$  for all variable assignments  $\varphi$ , then  $\mathbf{A}=_{\alpha\beta\eta}\mathbf{B}$ . We will prove this by a model existence argument: we will construct a model  $\mathcal{M}:=\langle \mathcal{D},\mathcal{I}\rangle$  such that if  $\mathbf{A}\neq_{\alpha\beta\eta}\mathbf{B}$  then  $\mathcal{I}_{\varphi}(\mathbf{A})\neq \mathcal{I}_{\varphi}(\mathbf{B})$  for some  $\varphi$ .

As in other completeness proofs, the model we will construct is a "ground term model", i.e. a model where the carrier (the frame in our case) consists of ground terms. But in the  $\lambda$ -calculus, we have to do more work, as we have a non-trivial built-in equality theory; we will construct the "ground term model" from sets of normal forms. So we first fix some notations for them.

Normal Forms in the simply typed  $\lambda$ -calculus  $\triangleright \text{ Definition We call a term } \mathbf{A} \in wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}}) \text{ a } \beta \text{ normal form iff there is no} \\ \mathbf{B} \in wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}}) \text{ with } \mathbf{A} \rightarrow_{\beta} \mathbf{B}.$ We call  $\mathbf{N}$  a  $\beta$  normal form of  $\mathbf{A}$ , iff  $\mathbf{N}$  is a  $\beta$ -normal form and  $\mathbf{A} \rightarrow_{\beta} \mathbf{N}$ . We denote the set of  $\beta$ -normal forms with  $wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}})\downarrow_{\beta\eta}$ .  $\triangleright \text{ We have just proved that } \beta\eta\text{-reduction is terminating and confluent, so we have}$   $\triangleright \text{ Assertion Every } \mathbf{A} \in wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}}) \text{ has a unique } \beta \text{ normal form } (\beta\eta, \log \beta\eta \text{ normal form), which we denote by } \mathbf{A}\downarrow_{\beta} (\mathbf{A}\downarrow_{\beta\eta}, \mathbf{A}\downarrow_{\beta\eta}^{l})$ 

The term frames will be a quotient spaces over the equality relations of the  $\lambda$ -calculus, so we introduce this construction generally.

### Frames and Quotients

- $\triangleright$  Definition Let  $\mathcal{D}$  be a frame and  $\sim$  a typed equivalence relation on  $\mathcal{D}$ , then we call  $\sim$  a congruence on  $\mathcal{D}$ , iff  $f \sim f'$  and  $g \sim g'$  imply  $f(g) \sim f'(g')$ .
- $\triangleright$  Definition We call a congruence  $\sim$  functional, iff for all  $f,g\in \mathcal{D}_{(\alpha\to\beta)}$  the fact that  $f(a) \sim g(a)$  holds for all  $a\in \mathcal{D}_{\alpha}$  implies that  $f \sim g$ .

 $\triangleright$  Example  $=_{\beta} (=_{\beta\eta})$  is a (functional) congruence on  $cwff_{\mathcal{T}}(\Sigma)$  by definition.

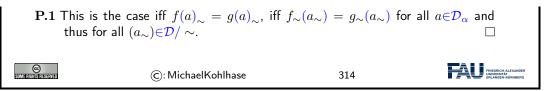
 $\triangleright$  Assertion Let  $\mathcal{D}$  be a  $\Sigma$ -frame and  $\sim$  a functional congruence on  $\mathcal{D}$ , then the quotient space  $\mathcal{D}/\sim$  is a  $\Sigma$ -frame.

 $\triangleright$  **Proof**:

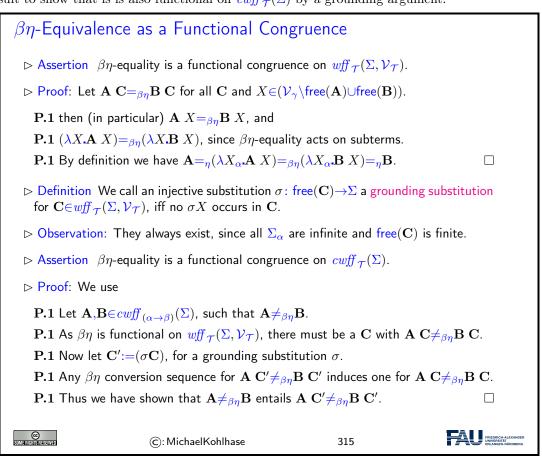
**P.1**  $\mathcal{D}/\sim = \{f_{\sim} | f \in \mathcal{D}\}$ , define  $f_{\sim}(a_{\sim}) := f(a)_{\sim}$ .

- **P.1** This only depends on equivalence classes: Let  $f' \in f_{\sim}$  and  $a' \in a_{\sim}$ .
- **P.1** Then  $f(a)_{\sim} = f'(a)_{\sim} = f'(a')_{\sim} = f(a')_{\sim}$
- **P.1** To see that we have  $f_{\sim} = g_{\sim}$ , iff  $f \sim g$ , iff f(a) = g(a) since  $\sim$  is functional.

#### D.2. THE SEMANTICS OF THE SIMPLY TYPED $\lambda$ -CALCULUS



To apply this result, we have to establish that  $=_{\beta\eta}$ -equality is a functional congruence. We first establish  $=_{\beta\eta}$  as a functional congruence on  $wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}})$  and then specialize this result to show that is also functional on  $cwff_{\mathcal{T}}(\Sigma)$  by a grounding argument.



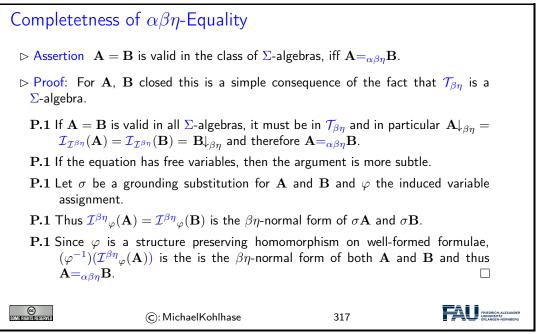
Note that: the result for  $cwff_{\mathcal{T}}(\Sigma)$  is sharp. For instance, if  $\Sigma = \{c_{\iota}\}$ , then  $(\lambda X.X) \neq_{\beta\eta}(\lambda X.c)$ , but  $(\lambda X.X) \ c =_{\beta\eta} c =_{\beta\eta}(\lambda X.c) \ c$ , as  $\{c\} = cwff_{\iota}(\Sigma)$  (it is a relatively simple exercise to extend this problem to more than one constant). The problem here is that we do not have a constant  $d_{\iota}$  that would help distinguish the two functions. In  $wff_{\mathcal{T}}(\Sigma, \mathcal{V}_{\mathcal{T}})$  we could always have used a variable. This completes the preparation and we can define the notion of a term algebra, i.e. a  $\Sigma$ -algebra whose frame is made of  $=_{\beta\eta}$ -normal  $\lambda$ -terms.

- A Herbrand Model for  $\Lambda^{\rightarrow}$   $\triangleright$  Definition We call  $\mathcal{T}_{\beta\eta} := \langle cwff_{\mathcal{T}}(\Sigma) \downarrow_{\beta\eta}, \mathcal{I}^{\beta\eta} \rangle$  the  $\Sigma$  term algebra, if  $\mathcal{I}^{\beta\eta} = Id_{\Sigma}$ .  $\triangleright$  The name "term algebra" in the previous definition is justified by the following  $\triangleright$  Assertion  $\mathcal{T}_{\beta\eta}$  is a  $\Sigma$ -algebra
  - $\triangleright$  **Proof**: We use the work we did above

209

P.1 Note that  $cwff_{\mathcal{T}}(\Sigma) \downarrow_{\beta\eta} = cwff_{\mathcal{T}}(\Sigma)/=_{\beta\eta}$  and thus a  $\Sigma$ -frame by and . P.1 So we only have to show that the value function  $\mathcal{I}^{\beta\eta} = \mathrm{Id}_{\Sigma}$  is total. P.1 Let  $\varphi$  be an assignment into  $cwff_{\mathcal{T}}(\Sigma) \downarrow_{\beta\eta}$ . P.1 Note that  $\sigma := (\varphi|_{\mathrm{free}(\mathbf{A})})$  is a substitution, since free(A) is finite. P.1 A simple induction on the structure of A shows that  $\mathcal{I}^{\beta\eta\varphi}(\mathbf{A}) = (\sigma \mathbf{A}) \downarrow_{\beta\eta}$ . P.1 So the value function is total since substitution application is.

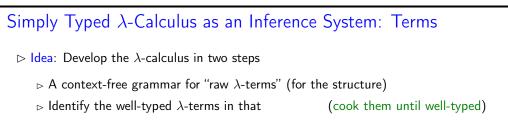
And as always, once we have a term model, showing completeness is a rather simple exercise. We can see that  $\alpha\beta\eta$ -equality is complete for the class of  $\Sigma$ -algebras, i.e. if the equation  $\mathbf{A} = \mathbf{B}$  is valid, then  $\mathbf{A} = _{\alpha\beta\eta} \mathbf{B}$ . Thus  $\alpha\beta\eta$  equivalence fully characterizes equality in the class of all  $\Sigma$ -algebras.



complete our study of the sematnics of the simply-typed  $\lambda$ -calculus by showing that it is an adequate logic for modeling (the equality) of functions and their applications.

### D.3 Simply Typed $\lambda$ -Calculus via Inference Systems

Now, we will look at the simply typed  $\lambda$ -calculus again, but this time, we will present it as an inference system for well-typedness jugdments. This more modern way of developing type theories is known to scale better to new concepts.



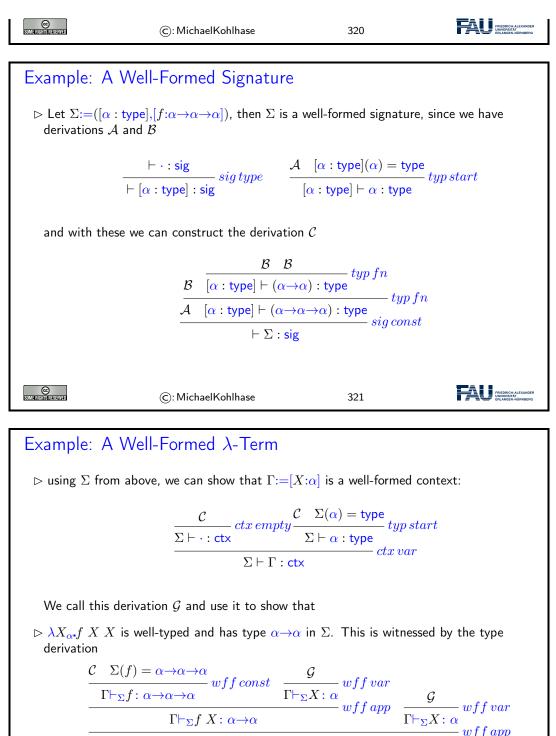
 $\triangleright$  Definition A grammar for the raw terms of the simply typed  $\lambda$ -calculus:

 $\triangleright$  Then: Define all the operations that are possible at the "raw terms level", e.g. realize that signatures and contexts are partial functions to types.

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Simply Typed  $\lambda$ -Calculus as an Inference System: Judgments ▷ Definition Judgments make statements about complex properties of the syntactic entities defined by the grammar.  $\triangleright$  Definition Judgments for the simply typed  $\lambda$ -calculus  $\vdash \Sigma : sig$  $\Sigma$  is a well-formed signature  $\Sigma \vdash \alpha : \mathsf{type}$  $\alpha$  is a well-formed type given the type assumptions in  $\Sigma$  $\Gamma$  is a well-formed context given the type assumptions in  $\Sigma$  $\Sigma \vdash \Gamma : \mathsf{ctx}$ A has type  $\alpha$  given the type assumptions in  $\Sigma$  and  $\Gamma$  $\Gamma \vdash_{\Sigma} \mathbf{A} : \boldsymbol{\alpha}$ © 319 (C): MichaelKohlhase

Simply Typed  $\lambda$ -Calculus as an Inference System: Rules  $\geq \mathbf{A} \in wff_{\alpha}(\Sigma, \mathcal{V}_{T}), \text{ iff } \Gamma \vdash_{\Sigma} \mathbf{A} : \alpha \text{ derivable in}$   $\frac{\Sigma \vdash \Gamma : \mathsf{ctx} \ \Gamma(X) = \alpha}{\Gamma \vdash_{\Sigma} X : \alpha} wff var \qquad \frac{\Sigma \vdash \Gamma : \mathsf{ctx} \ \Sigma(c) = \alpha}{\Gamma \vdash_{\Sigma} c : \alpha} wff const}{\Gamma \vdash_{\Sigma} A : \beta \to \alpha} \Gamma \vdash_{\Sigma} \mathbf{B} : \beta} wff app \qquad \frac{\Gamma, [X:\beta] \vdash_{\Sigma} A : \alpha}{\Gamma \vdash_{\Sigma} \lambda X_{\beta} \cdot \mathbf{A} : \beta \to \alpha} wff abs}$   $\geq \text{ Oops: this looks surprisingly like a natural deduction calculus. ($\sim$ Curry Howard Isomorphism)}$   $\geq \text{ To be complete, we need rules for well-formed signatures, types and contexts}$   $\frac{\vdash \Sigma : \operatorname{sig} sig empty}{\vdash (\Sigma, [c:\alpha]) : \operatorname{sig}} sig type$   $\frac{\vdash \Sigma : \operatorname{sig} \Sigma \vdash \alpha : type}{\vdash (\Sigma, [c:\alpha]) : \operatorname{sig}} sig type$   $\frac{\vdash \Sigma : \operatorname{sig} \Sigma \vdash \alpha : type}{\Sigma \vdash (\alpha \to \beta) : type} typ fn \qquad \frac{\vdash \Sigma : \operatorname{sig} \Sigma(\alpha) = type}{\Sigma \vdash \alpha : type} typ start$   $\frac{\vdash \Sigma : \operatorname{sig} ctx \ empty}{\Sigma \vdash (\Gamma, [X:\alpha]) : \operatorname{ctx}} ctx \ var$ 

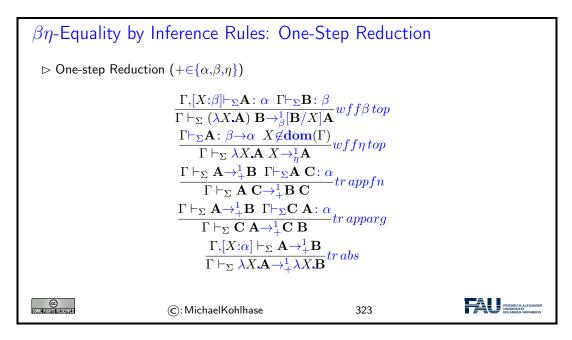


 $\frac{\Gamma \vdash_{\Sigma} f \ X \ X : \alpha}{ \vdash_{\Sigma} \lambda X_{\alpha} \cdot f \ X \ X : \alpha \to \alpha} wff \ abs$ 

322

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 $\beta\eta\text{-Equality by Inference Rules: Multi-Step Reduction}$   $\triangleright \text{ Multi-Step-Reduction } (+ \in \{\alpha, \beta, \eta\})$   $\frac{\Gamma \vdash_{\Sigma} \mathbf{A} \rightarrow_{+}^{+} \mathbf{B}}{\Gamma \vdash_{\Sigma} \mathbf{A} \rightarrow_{+}^{*} \mathbf{B}} ms start \qquad \frac{\Gamma \vdash_{\Sigma} \mathbf{A} : \alpha}{\Gamma \vdash_{\Sigma} \mathbf{A} \rightarrow_{+}^{*} \mathbf{A}} ms ref$   $\frac{\Gamma \vdash_{\Sigma} \mathbf{A} \rightarrow_{+}^{*} \mathbf{B}}{\Gamma \vdash_{\Sigma} \mathbf{A} \rightarrow_{+}^{*} \mathbf{C}} ms trans$   $\triangleright \text{ Congruence Relation}$   $\frac{\Gamma \vdash_{\Sigma} \mathbf{A} \rightarrow_{+}^{*} \mathbf{B}}{\Gamma \vdash_{\Sigma} \mathbf{A} =_{+} \mathbf{B}} eq start$   $\frac{\Gamma \vdash_{\Sigma} \mathbf{A} =_{+} \mathbf{B}}{\Gamma \vdash_{\Sigma} \mathbf{B} =_{+} \mathbf{A}} eq sym \qquad \frac{\Gamma \vdash_{\Sigma} \mathbf{A} =_{+} \mathbf{B} \Gamma \vdash_{\Sigma} \mathbf{B} =_{+} \mathbf{C}}{\Gamma \vdash_{\Sigma} \mathbf{A} =_{+} \mathbf{C}} eq trans$   $\mathbb{O}: \text{ MichaelKohlhase} \qquad 324$ 

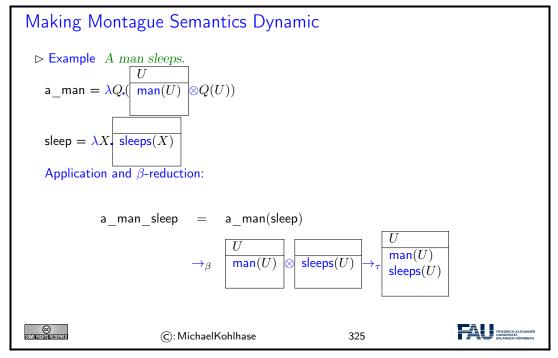
## Appendix E

# **Higher-Order Dynamics**

In this Chapter we will develop a typed  $\lambda$  calculus that extend DRT-like dynamic logics like the simply typed  $\lambda$  calculus extends first-order logic.

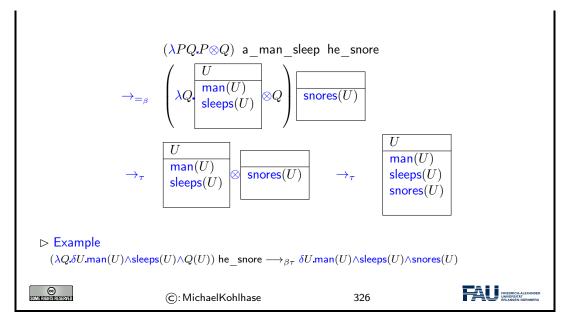
#### E.1 Introduction

We start out our development of a Montague-like compositional treatment of dynamic semantics construction by naively "adding  $\lambda$ s" to DRT and deriving requirements from that.



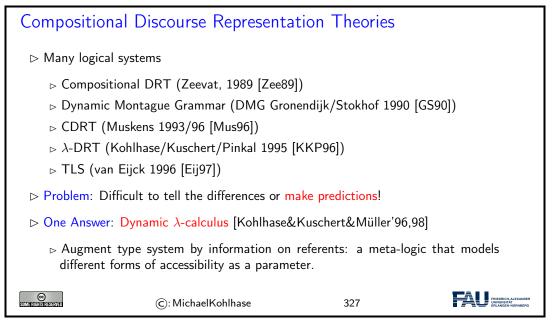
At the sentence level we just disregard that we have no idea how to interpret  $\lambda$ -abstractions over DRSes and just proceed as in the static (first-order) case. Somewhat surprisingly, this works rather well, so we just continue at the discourse level.

Coherent Text (Capturing Discourse Referents) ▷ Example A man<sup>1</sup> sleeps. He<sub>1</sub> snores.



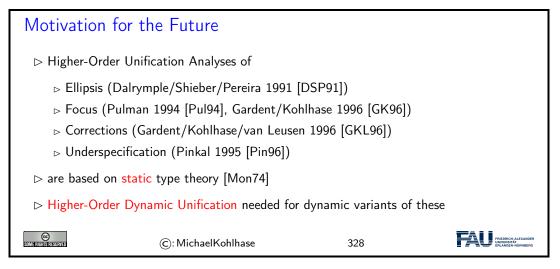
Here we have our first surprise: the second  $=_{\beta}$  reduction seems to capture the discourse referent U: intuitively it is "free" in  $\delta U$  snores(U) and after  $=_{\beta}$  reduction it is under the influence of a  $\delta$  declaration. In the  $\lambda$ -calculus tradition variable capture is the great taboo, whereas in our example, it seems to drive/enable anaphor resolution.

Considerations like the ones above have driven the development of many logical systems attempting the compositional treatment of dynamic logics. All were more or less severely flawed.



Here we will look at a system that makes the referent capture the central mechanism using an elaborate type system to describe referent visibility and thus accessibility. This generalization allows to understand and model the interplay of  $\lambda$ -bound variables and discourse referents without being distracted by linguistic modeling questions (which are relegated to giving appropriate types to the operators).

Another strong motivation for a higher-order treatment of dynamic logics is that maybe the computational semantic analysis methods based on higher-order features (mostly higher-order unification) can be analogously transferred to the dynamic setting.



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To set the stage for the development of a higher-order system for dynamic logic, let us remind
ourselves of the setup of the static system
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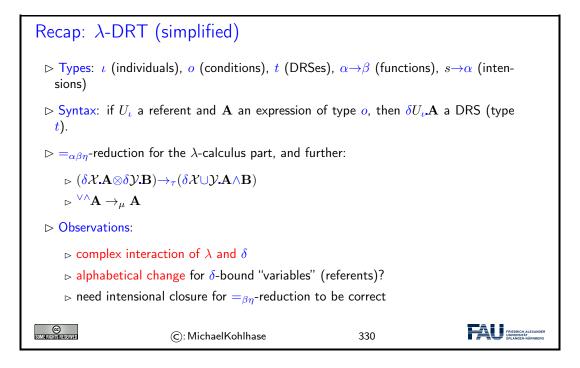
Recap: Simple Type Theory
$\triangleright$ Structural layer: simply typed $\lambda$ -calculus
$_{ m \vartriangleright}$ types, well-formed formulae, $\lambda$ -abstraction
$\triangleright$ Theory: $\alpha\beta\eta$ -conversion, Operational: Higher-Order Unification
⊳ Logical layer: higher-order logic
$\triangleright$ special types $\iota, o$
$\triangleright$ logical constants $\land_{o \to o \to o}$ , $\Rightarrow$ , $\forall$ , with fixed semantics
Description Theory: logical theory, Operational: higher-order theorem proving
▷ Goal: Develop two-layered approach to compositional discourse theories.
▷ Application: Dynamic Higher-Order Unification (DHOU) with structural layer only.
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This separation of concerns: structural properties of functions vs. a propositional reasoning level has been very influential in modeling static, intra-sentential properties of natural language, therefore we want to have a similar system for dynamic logics as well. We will use this as a guiding intuition below.

### E.2 Setting Up Higher-Order Dynamics

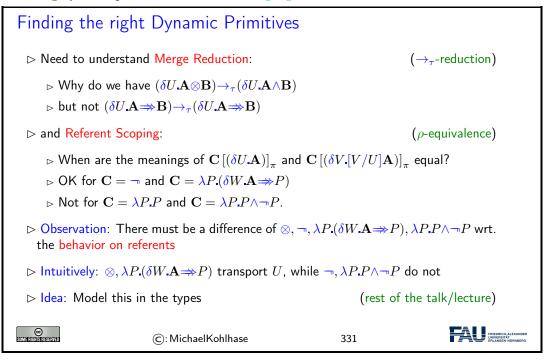
To understand what primitives a language for higher-order dynamics should provide, we will analyze one of the attempts –  $\lambda$ -DRT – to higher-order dynamics

 $\lambda$ -DRT is a relatively straightforward (and naive) attempt to "sprinkle  $\lambda$ s over DRT" and give that a semantics. This is mirrored in the type system, which had a primitive types for DRSes and "intensions" (mappings from states to objects). To make this work we had to introduce "intensional closure", a semantic device akin to type raising that had been in the folklore for some time. We will not go into intensions and closure here, since this did not lead to a solution and refer the reader to [KKP96] and the references there.

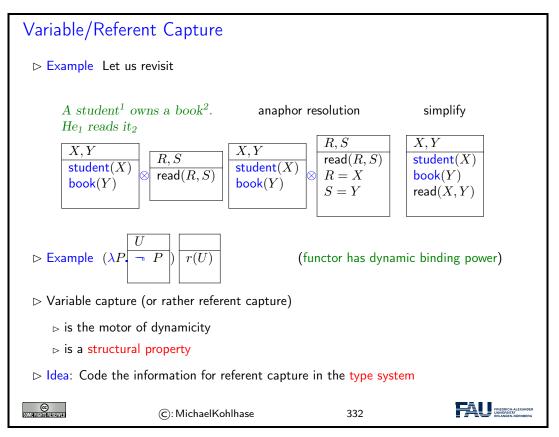


In hindsight, the contribution of  $\lambda$ -DRT was less the proposed semantics – this never quite worked beyond correctness of  $=_{\alpha\beta\eta}$  equality – but the logical questions about types, reductions, and the role of states it raised, and which led to further investigations.

We will now look at the general framework of "a  $\lambda$ -calculus with discourse referents and  $\delta$ binding" from a logic-first perspective and try to answer the questions this raises. The questions of modeling dynamic phenomena of natural language take a back-seat for the moment.



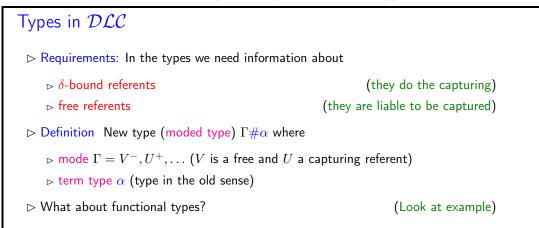
A particularly interesting phenomenon is that of referent capture as the motor or anaphor resolution, which have already encountered aboveabove.



In we see that with the act of anaphor resolution, the discourse referents induced by the anaphoric pronouns get placed under the influence of the dynamic binding in the first DRS – which is OK from an accessibility point of view, but from a  $\lambda$ -calculus perspective this constitutes a capturing event, since the binding relation changes. This becomes especially obvious, if we look at the simplified form, where the discourse referents introduced in the translation of the pronouns have been eliminated altogether.

In we see that a capturing situation can occur even more explicitly, if we allow  $\lambda s - and =_{\alpha\beta\eta}$  equality – in the logic. We have to deal with this, and again, we choose to model it in the type system.

With the intuitions sharpened by the examples above, we will now start to design a type system that can take information about referents into account. In particular we are interested in the capturing behavior identified above. Therefore we introduce information about the "capturing status" of discourse referents in the respective expressions into the types.



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To see how our type system for  $\mathcal{DLC}$  fares in real life, we see whether we can capture the referent dynamics of  $\lambda$ -DRT. Maybe this also tells us what we still need to improve.

Rational Reconstruction of $\lambda$ -DRT (First Version)
⊳ Two-level approach
<ul> <li>model structural properties (e.g. accessibility relation) in the types</li> <li>leave logical properties (e.g. negation flips truth values) for later</li> </ul>
$\triangleright$ Types: $\iota, o, \alpha \rightarrow \beta$ only. $\Gamma \# o$ is a DRS.
$\vartriangleright$ Idea: Use mode constructors $\downarrow$ and $\uplus$ to describe the accessibility relation.
$ ightarrow$ Definition $\downarrow$ closes off the anaphoric potential and makes the referents classically bound $(U^+, V^+ = U^\circ, V^\circ)$
▷ Definition The prioritized union operator combines two modes by letting + over- write $(U^+, V^- \uplus U^-, V^+ = U^+, V^+)$
$\triangleright$ Example Types of DRT connectives (indexed by $\Gamma, \Delta$ ):
$ \neg \text{ has type } \Gamma \# o \rightarrow \mathbb{F} \# o \qquad (\text{intuitively like } t \rightarrow o) $
$ > \otimes \text{ has type } \Gamma \# o \to \Delta \# o \to \Gamma \oplus \Delta \# o \qquad (\text{intuitively like } t \to t \to t) $
▷ V has type $\Gamma \# o \rightarrow \Delta \# o \rightarrow \Gamma \uplus \Delta \# o$
$ ightarrow \Rightarrow$ has type $\Gamma \# o \rightarrow \Delta \# o \rightarrow (\Gamma \uplus \Delta) \# o$
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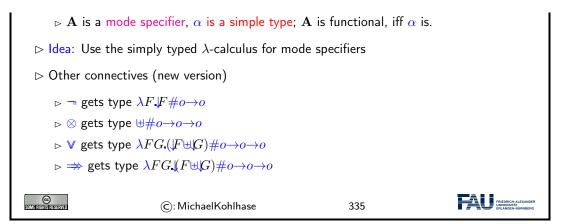
We can already see with the experiment of modeling the DRT operators that the envisioned type system gives us a way of specifying accessibility and how the dynamic operators handle discourse referents. So we indeed have the beginning of a structural level for higher-order dynamics, and at the same time a meta-logic flavor, since we can specify other dynamic logics in a  $\lambda$ -calculus.

#### E.3 A Type System for Referent Dynamics

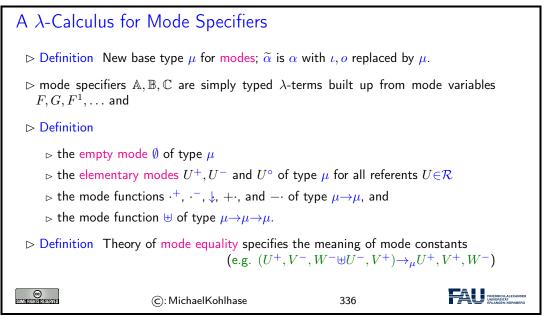
We will now take the ideas above as the basis for a type system for  $\mathcal{DLC}$ .

The types above have the decided disadvantage that they mix mode information with information about the order of the operators. They also need free mode variables, which turns out to be a problem for designing the semantics. Instead, we will employ two-dimensional types, where the mode part is a function on modes and the other a normal simple type.

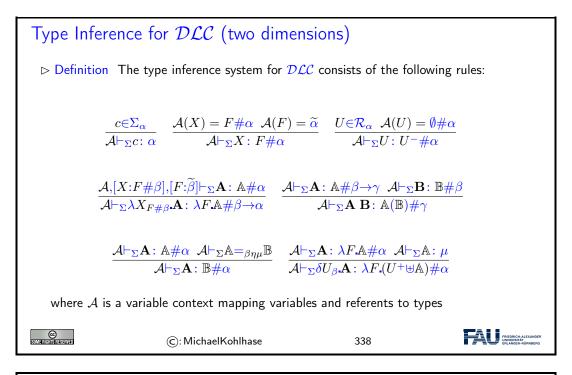
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Types in DLC (Final Version)
▷ Problem: A type like Γ#ο→Γ<sup>-</sup>#ο mixes mode information with simple type information.
▷ Alternative formulation: ↓#ο→ο (use a mode operator for the mode part)
▷ Definition DLC types are pairs A#α, where
```

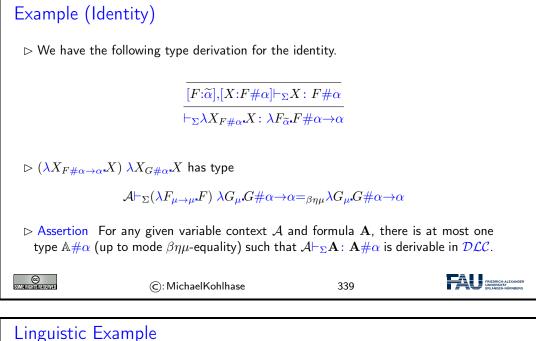


With this idea, we can re-interpret the DRT types from



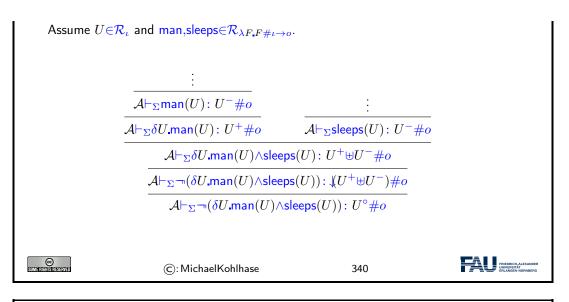
Summary: DLC Grammar			
ho We summarize the setup in the following context-free grammar			
$\gamma:==\mu$ $\mathbb{B}:==\emptyset$ $\mathbb{M}:==\mathbb{B}$ $\tau:==\mathbb{M}$	$p \alpha_{1} \rightarrow \alpha_{2}$ $\gamma_{1} \rightarrow \gamma_{2}$ $U^{+} U^{-} U^{\circ} \mathbb{B}_{1},\mathbb{B}_{2} \mathbb{B}_{1}\oplus\mathbb{B}_{2} \mathbb{B}$ $\mathbb{B} \mathbb{M}_{1}\mathbb{M}_{2} \lambda F_{\gamma}.\mathbb{M}$ $\#\alpha$ $U c \mathbf{M}_{1}\mathbb{M}_{2} \lambda X_{\tau}.\mathbf{M} \delta U.\mathbf{M}$	simple types mode types basic modes modes (typed via mode type DLC types DLC terms (typed via DLC t	
	of these raw terms can be give be well-typed.	en a meaning $\sim$ only use th	ose that can (up next)
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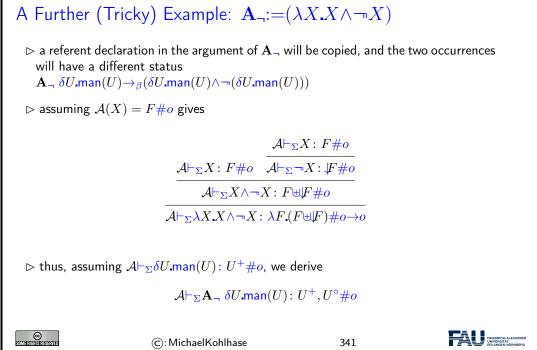




 $\triangleright$  Example No man sleeps.

#### E.3. A TYPE SYSTEM FOR REFERENT DYNAMICS



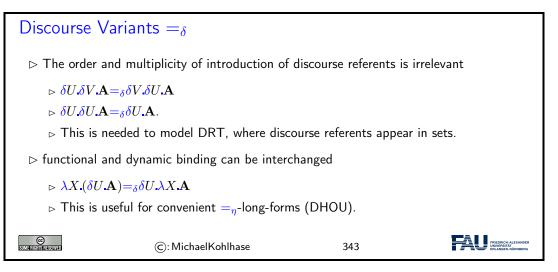


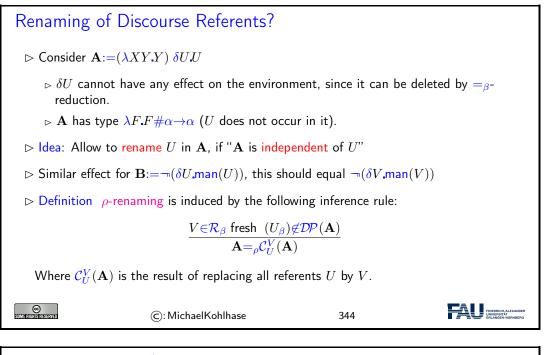
# A Further Example: Generalized Coordination

$$\begin{split} & \triangleright \text{ We may define a generalised } and: \\ & \lambda R^1 \dots R^n \cdot \lambda X^1 \dots X^m \cdot (R^1 \ X^1 \ \dots \ X^m \otimes \dots \otimes R^n \ X^1 \ \dots \ X^m) \\ & \text{with type} \\ & \lambda F^1 \dots F^n \cdot (F^1 \uplus \dots \uplus F^n) \# \overline{\beta}_m \to o \to \overline{\beta}_m \to o \\ & \triangleright \text{ thus from john}:= (\lambda P \cdot \delta U \cdot U = j \otimes P(U)) \\ & \text{ and mary}:= (\lambda P \cdot \delta V \cdot V = m \otimes P(V)) \\ & \triangleright \text{ we get johnandmary} = \lambda P \cdot (\delta U \cdot U = j \otimes P(U) \otimes \delta V \cdot V = m \otimes P(V)) \end{split}$$



#### E.4 Modeling Higher-Order Dynamics



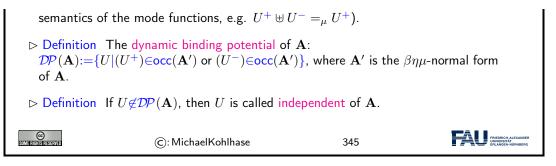


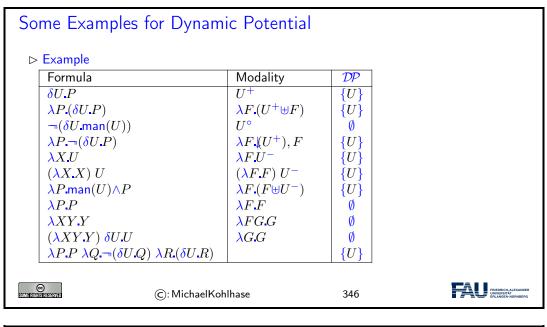
#### Dynamic Potential

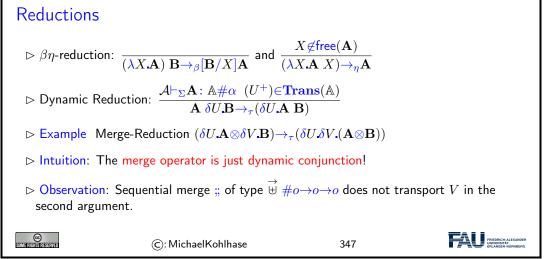
 $\rhd$  The binding effect of an expression  ${\bf A}$  can be read off its modality  ${\bf A}$ 

 $\triangleright$  A modality **A** may be simplified by  $\beta\eta\mu$ -reduction (where  $\mu$ -equality reflects the

#### E.5. DIRECT SEMANTICS FOR DYNAMIC $\lambda$ CALCULUS



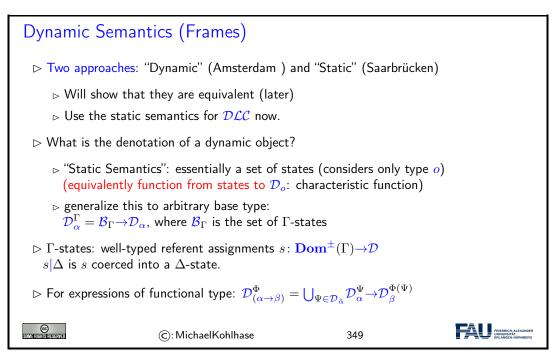




#### E.5 Direct Semantics for Dynamic $\lambda$ Calculus

Higher-Order Dynamic Semantics (Static Model)

 $\triangleright \operatorname{Frame} \mathcal{D} = \{\mathcal{D}_{\alpha} | \alpha \in \mathcal{T}\}$   $\triangleright \mathcal{D}_{\mu} \text{ is the set of modes (mappings from variables to signs)}$   $\triangleright \mathcal{D}_{\rho} \text{ is the set of truth values } \{\mathsf{T},\mathsf{F}\}.$   $\triangleright \mathcal{D}_{\iota} \text{ is an arbitrary universe of individuals.}$   $\triangleright \mathcal{D}_{(\alpha \to \beta)} \subseteq \mathcal{D}_{\alpha} \to \mathcal{D}_{\beta}$   $\triangleright \operatorname{Interpretation} \mathcal{I} \text{ of constants, assignment } \varphi \text{ of variables.}$   $\triangleright \mathcal{I}_{\varphi}(c) = \mathcal{I}(c), \text{ for a constant } c$   $\triangleright \mathcal{I}_{\varphi}(X) = \varphi(X), \text{ for a variable } X$   $\triangleright \mathcal{I}_{\varphi}(\mathbf{A} \cdot \mathbf{B}) = \mathcal{I}_{\varphi}(\mathbf{A})(\mathcal{I}_{\varphi}(\mathbf{B})))$   $\triangleright \mathcal{I}_{\varphi}(\lambda X \cdot \mathbf{B})(\mathbf{a}) = \mathcal{I}_{(\varphi, [\mathbf{a}/X])}(\mathbf{B}).$ 

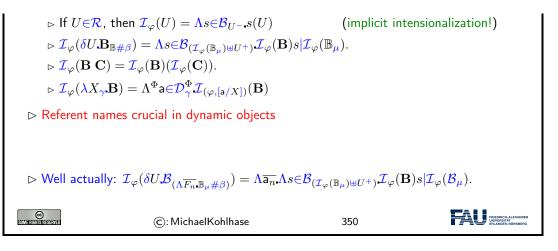


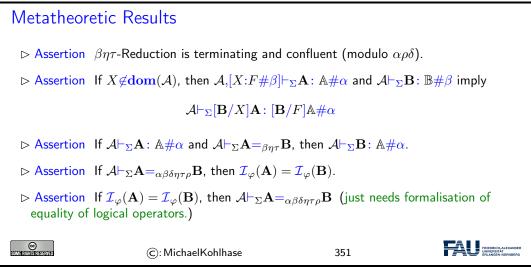
#### Dynamic Semantics (Evaluation)

- Standard Tool: Intensionalization (guards variables by delaying evaluation of current state)
   Idea: Ideal for semantics of variable capture
  - ⊳ guard all referents
  - ▷ make this part of the semantics (thus implicit in syntax)
- $\triangleright$  Evaluation of variables and referents

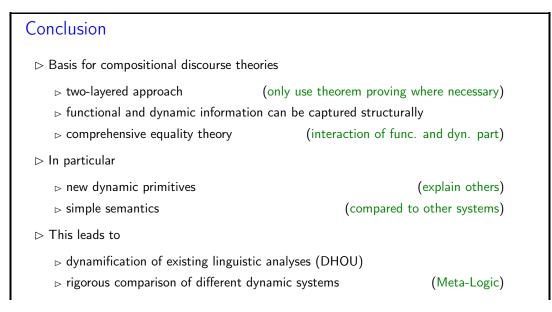
 $\triangleright \text{ If } X \in \mathcal{V}, \text{ then } \mathcal{I}_{\varphi}(X) = \varphi(X)$ 

226





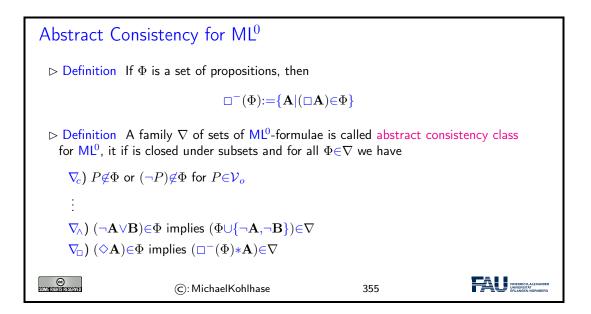
## E.6 Dynamic $\lambda$ Calculus outside Linguistics



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Future Dire	ections			
⊳ Generalize	$\mathcal{DLC}$ to a true mode calculus:			
$ ho$ turn $\delta$ i	into a logical constant $\delta_U$ : (1)	use type declaration	and application)	
$\frac{\mathcal{A}\vdash_{\Sigma}\mathbf{A}: \mathbb{A}\#\alpha}{\mathcal{A}\vdash_{\Sigma}\delta U_{\beta}\mathbf{A}: U^{+} \uplus \mathbb{A}_{\mu}\#\alpha} \qquad \frac{\vdash_{\Sigma}\delta_{U}: \lambda F.(U^{+} \uplus F)\#\alpha \to \alpha  \mathcal{A}\vdash_{\Sigma}\mathbf{A}: \mathbb{A}\#\alpha}{\mathcal{A}\vdash_{\Sigma}\delta_{U}  \mathbf{A}: U^{+} \uplus \mathbb{A}_{\mu}\#\alpha}$				
⊳ this allo	ows for more than one $\delta$ -like operat	or		
⊳ Better still	(?) go for a dependent type discip	line (in	plement in LF?)	
$\triangleright \ \delta \text{ of type } \lambda UF.(U^+ \uplus F) \# \alpha \to \alpha \text{ yields } \delta(U) \cong \delta_U$				
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Use $\mathcal{DLC}$ as a model for Programming				
▷ Remember dynamic binding in Lisp? ((lambda (F) (let ((U 1)) (F 1)))(lambda (X) (+ X U)) 2 ((lambda (F) (let ((U 0)) (F 1)))(lambda (X) (+ X U)) → 1				
Ever wanted to determine the \\$PRINTERenvironment variable in a Java applet? (sorry forbidden, since the semantics of dynamic binding are unclear.)				
$\triangleright \mathcal{DLC}$ is ide	al for that	(	about time too!)	
$\triangleright$ Example give let <sub>U</sub> the type $\lambda F \cdot F \uparrow_U^\circ$ , where $(\mathbb{A}, U^-) \uparrow_U^\circ = \mathbb{A}, U^\circ$ . (no need for $U^+$ in Lisp)				
$\triangleright$ Example If you want to keep your \$EDITOR variable private(pirated?) only allow applets of type $\mathbb{A} \# \alpha$ , where \$EDITOR $\notin DP(\mathbb{A})$ .				
⊳ It is going	to be a lot of fun!			
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## Appendix F

# Model Existence and Completeness for Modal Logic



### abla-Hintikka Set

- $\triangleright$  Definition If  $\nabla$  abstract consistency class for  $ML^0$ , then we call  $\mathcal{H}$  a  $\nabla$ -Hintikka set, if  $\mathcal{H}$  maximal in  $\nabla$ , i.e. for all  $\mathbf{A}$  with  $(\mathcal{H}*\mathbf{A})\in\nabla$  we already have  $\mathbf{A}\in\mathcal{H}$ .
- $\triangleright$  Assertion If  $\nabla$  is an abstract consistency class for ML and  $\Phi \in \nabla$ , then there is a  $\nabla$ -Hintikka set  $\mathcal{H}$  with  $\Phi \subseteq \mathcal{H}$ .

Proof:

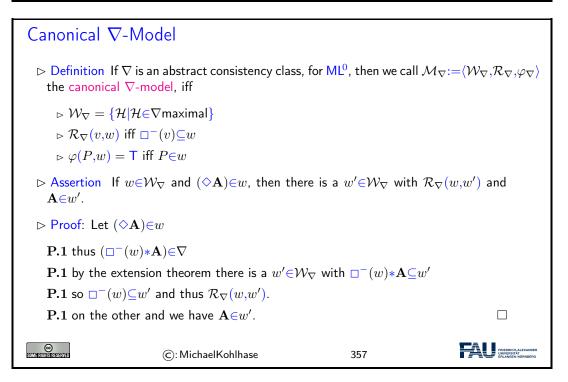
**P.1** chose an enumeration  $\mathbf{A}^1, \mathbf{A}^2, \ldots$  of  $wff_o(\mathcal{V}_o)$ 

 $\mathbf{P.1}$  construct sequence of sets  $H^i$  with  $H^0{:=}\Phi$  and

$$\succ H^{n+1} := H^n, \text{ if } (H^n * \mathbf{A}^n) \notin \nabla$$
  
$$\succ H^{n+1} := (H^n * \mathbf{A}^n), \text{ if } (H^n * \mathbf{A}^n) \in \nabla$$

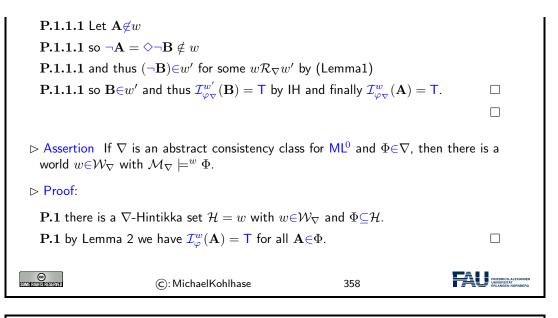
**P.1** All  $H^i \in \nabla$ , so choose  $\mathcal{H} := \bigcup_{i \in \mathbb{N}} H^i$ 

P.1 Ψ⊆H finite implies that there is a j∈N with Ψ⊆H<sup>j</sup>, so Ψ∈∇ as ∇ closed under subsets.
P.1 H∈∇ since ∇ compact.
P.1 let (H\*B)∈∇, then there is a j∈N with B = A<sup>j</sup>
P.1 B∈H<sup>j+1</sup> ⊆ H, so H ∇-maximal.



#### Model existence for $ML^0$

▷ Assertion If  $w \in W_{\nabla}$ , then  $\mathcal{I}_{\varphi_{\nabla}}^{w}(\mathbf{A}) = \mathsf{T}$  iff  $\mathbf{A} \in w$ . ▷ Proof: Induction on the structure of  $\mathbf{A}$ P.1.1 If  $\mathbf{A}$  is a variable: then we get the assertion by the definition of  $\varphi_{\nabla}$ . P.1.1 If  $\mathbf{A} = \neg \mathbf{B}$  and  $\mathbf{A} \in w$ : then  $\mathbf{B} \notin w$ , thus  $\mathcal{I}_{\varphi_{\nabla}}^{w}(\mathbf{B}) = \mathsf{F}$ , and thus  $\mathcal{I}_{\varphi_{\nabla}}^{w}(\mathbf{A}) = \mathsf{T}$ . P.1.1  $\mathbf{A} = \mathsf{B} \wedge \mathsf{C}$ : analog P.1.1  $\mathbf{A} = \mathsf{B} \mathsf{B}$ : P.1.1.1 Let  $\mathbf{A} \in w$  and  $w \mathcal{R}_{\nabla} w'$ P.1.1.1 thus  $\Box^{-}(w) \subseteq w'$  and thus  $\mathbf{B} \in w'$ P.1.1.1 so (IH)  $\mathcal{I}_{\varphi_{\nabla}}^{w'}(\mathbf{B}) = \mathsf{T}$  for any such w'. P.1.1.1 and finally  $\mathcal{I}_{\varphi_{\nabla}}^{w}(\mathbf{A}) = \mathsf{T}$ P.1.1  $\mathbf{A} = \diamondsuit \mathbf{B}$ :



#### Completeness

$ ho$ Assertion $\mathbb{K}$ -consistency is an abstrac	ct consistency class for $ML^0$	
$ ho$ Proof: Let $(\Diamond \mathbf{A}) \in \Phi$		
<b>P.1</b> To show: □ $^{-}(\Phi)*\mathbf{A}$ is K-consistent	ent if $\Phi$ is ${\mathbb K}$ -consistent	
$\mathbf{P.1}$ converse: $\Phi$ is $\mathbb{K} ext{-inconsistent}$ if $\square$	$\Phi^{-}(\Phi) * \mathbf{A} \mathbb{K}$ -inconsistent.	
<b>P.1</b> There is a finite subset $\Psi \subseteq \Box^-(\Phi)$	) with $\Psi \vdash_{\mathbb{K}} (\neg \mathbf{A})$	
P.1 $(\Box \Psi) \vdash_{\mathbb{K}} (\Box \neg \mathbf{A})$ (distributivity of	□)	
$\mathbf{P.1} \ \Phi \vdash_{\mathbb{K}} (\Box \neg \mathbf{A}) = \neg (\diamondsuit \mathbf{A}) \text{ since } \Box \Psi \subseteq$	$\Phi$	
${f P.1}$ thus $\Phi$ is ${f K}$ -inconsistent.		
$ ho$ Assertion $\mathbb K$ is complete wrt. Kripke	models	
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## Further Completeness Theorems

 $\triangleright$  Assertion  $\mathbb{T}$ -consistency is an abstract consistency class for  $\mathsf{ML}^0$  and  $\mathcal{R}_{\mathbb{T}}$  is reflexive.

 $\triangleright$  Proof: Let  $\mathbf{A} \in \Box^{-}(w)$ 

 $\mathbf{P.1}$  then  $(\Box \mathbf{A}){\in}w$  by definition

**P.1** with  $\mathbb{T} (\Box \mathbf{A} \Rightarrow \mathbf{A})$  and Modus Ponens we have  $\mathbf{A} \in w$ .

**P.1** Thus  $\Box^-(w) \subseteq w$  and  $w \mathcal{R}_{\mathbb{T}} w$  for all  $w \in \mathcal{W}_{\mathbb{T}}$ .

 $\rhd$  Assertion §4-consistency is an abstract consistency class for  $ML^0$  and  $\mathcal{R}_{\mathbb{S}4}$  is transitive.

 $\triangleright$  Proof: Let  $w_1 \mathcal{R}_{\mathbb{S}4} w_2 \mathcal{R}_{\mathbb{S}4} w_3$  and  $(\Box \mathbf{A}) \in w$ .

#### 232 APPENDIX F. MODEL EXISTENCE AND COMPLETENESS FOR MODAL LOGIC

