

# Extensible Dependency Grammar: A Modular Grammar Formalism Based On Multigraph Description

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## What the thesis is about

- Extensible Dependency Grammar (XDG)
- new grammar formalism for natural language
- explores the combination of:
  - 1 dependency grammar
  - 2 model theory
  - 3 parallel architecture
- results:
  - 1 modularity: grammars can be extended by any linguistic aspect, each modeled independently
  - 2 emergence: complex linguistic phenomena emerge as the intersection of the linguistic aspects

# Overview

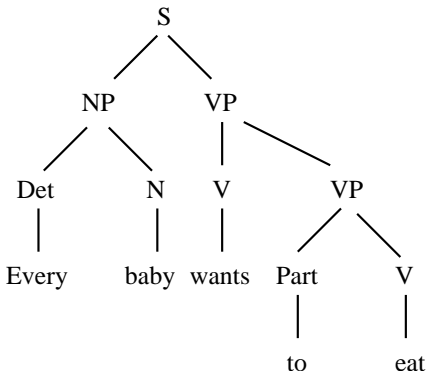
- 1 Introduction
- 2 Formalization
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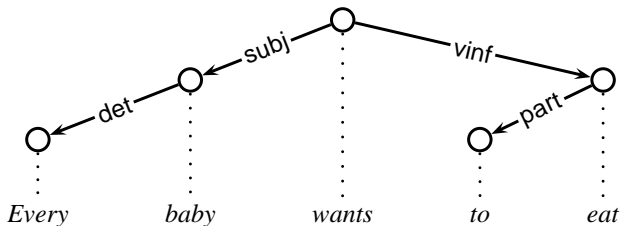
# Dependency Grammar

- traditional (Chomsky 1957): syntax of natural language analyzed in terms of phrase structure grammar:
  - hierarchically arranges substrings called phrases
  - nodes labeled by syntactic categories



# Dependency Grammar

- dependency grammar (Tesnière 1959):
  - hierarchically arranges words
  - edges labeled by grammatical functions
  - mothers: heads, daughters: dependents

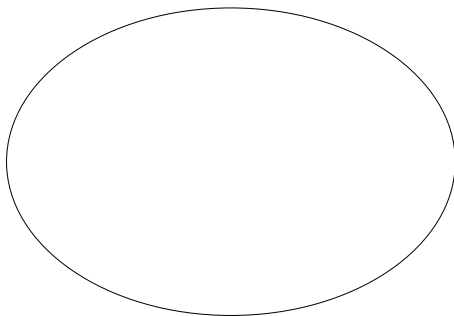


# Advantages

- flexibility: dependency analyses need not be trees but can be arbitrary graphs
- need not be ordered
- perfectly suited for modeling linguistic aspects other than syntax, e.g. predicate-argument structure, where the models are unordered DAGs

# Model Theory

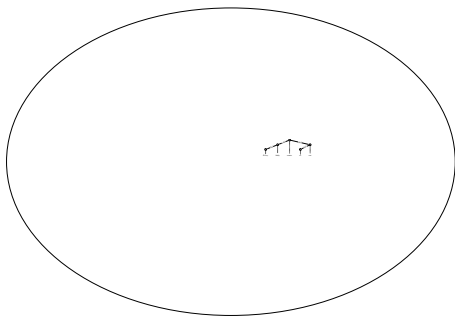
- traditional: generative perspective on grammar (Chomsky 1957):
  - 1 start with the empty set
  - 2 use production rules to generate the well-formed models





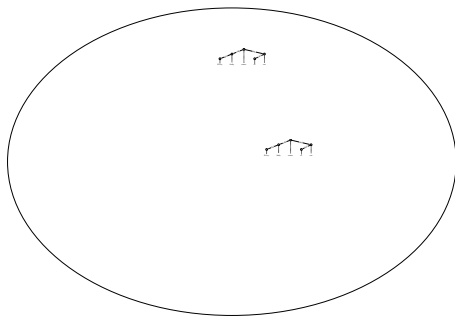
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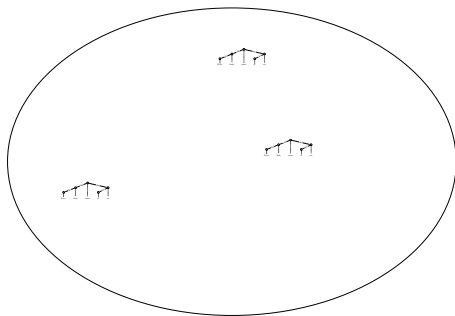
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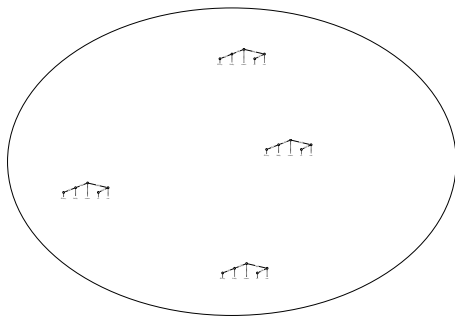
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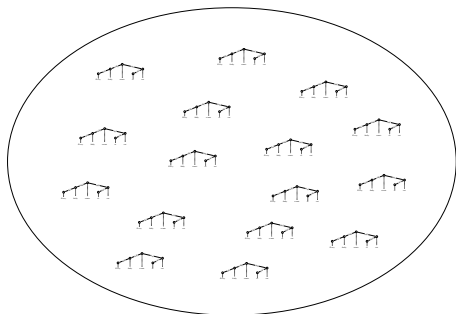
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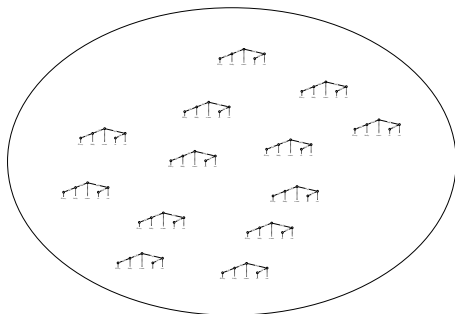
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  - 2 use well-formedness conditions to eliminate all non-well-formed models



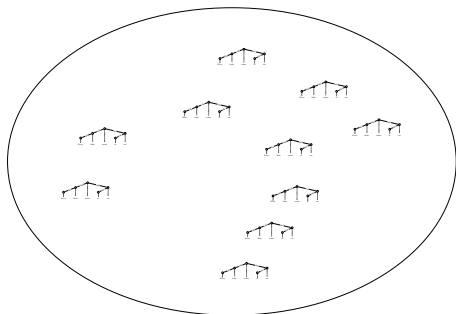
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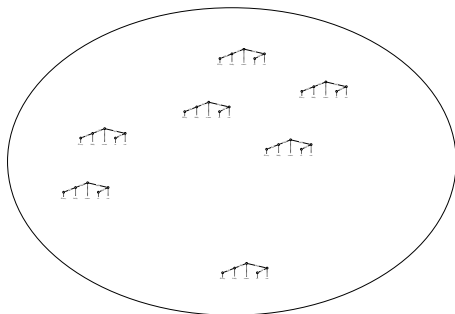
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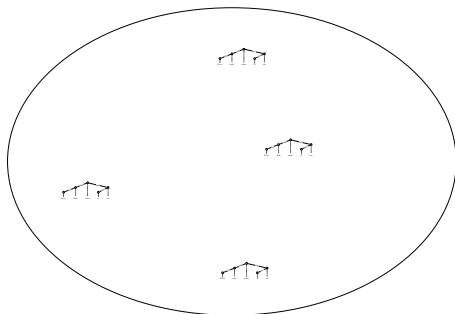
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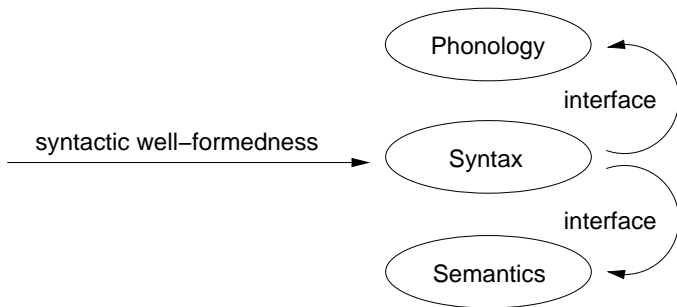


# Advantage

- declarativity: constraints describe the well-formed models independently of any underlying mechanisms

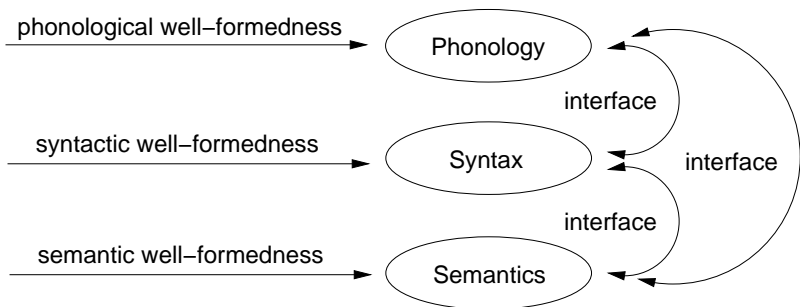
# Parallel Architecture

- traditional: syntacto-centric architecture (Chomsky 1965):
  - only syntax modeled independently
  - other linguistic aspects obtained by functional interfaces



# Parallel Architecture

- parallel architecture (Jackendoff 2002), (Sadock 1991):
  - all linguistic aspects modeled independently
  - relational interfaces



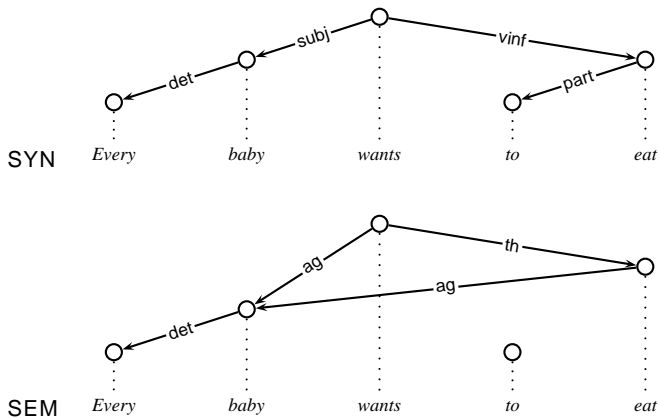
# Advantages

- modularity: linguistic aspects can be modeled largely independently of each other
- emergence: complex phenomena emerge as the intersection of the linguistic aspects

# Extensible Dependency Grammar (XDG)

- combines:
  - 1 flexibility from dependency grammar
  - 2 declarativity from model theory
  - 3 modularity and emergence from the parallel architecture
- models: dependency multigraphs, i.e. tuples of dependency graphs
- share the same set of nodes
- arbitrary many components called dimensions

# Example Multigraph



# Related Work

- phrase structure grammar:
  - Generative Grammar (Chomsky 1957, 1965, 1981, 1995)
  - Tree Adjoining Grammar (Joshi 1987)
  - Combinatory Categorical Grammar (Steedman 2000)
  - Head-driven Phrase Structure Grammar (Pollard/Sag 1994)
  - Lexical-Functional Grammar (Bresnan 2001)
- dependency grammar:
  - Functional Generative Description (Sgall et al. 1986)
  - Meaning Text Theory (Mel'čuk 1988)
  - Constraint Dependency Grammar (Menzel/Schröder 1998)
  - Topological Dependency Grammar (Duchier/Debusmann 2001)

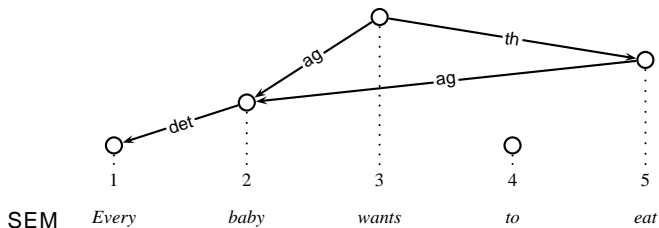
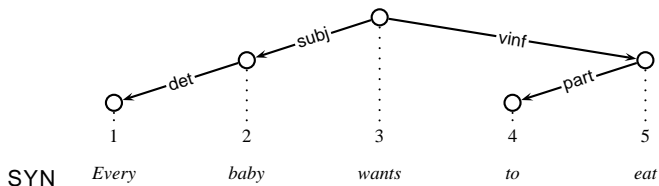


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# Dependency Multigraphs

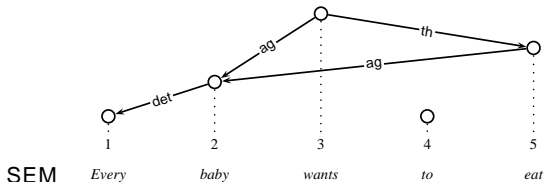
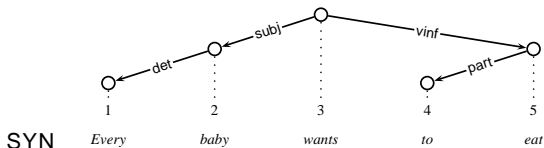
- tuples  $(V, D, W, w, L, E, A, a)$



# Relations

- 3 relations:

- 1 labeled edge
- 2 strict dominance
- 3 precedence



# Grammar

- $G = (MT, P)$ , characterizes set of multigraphs:
  - 1  $MT$ : multigraph type determining dimensions, words, edge labels
  - 2  $P$ : set of principles constraining the set of well-formed multigraphs of type  $MT$
- principles  $P$  formulated in a higher order logic
- signature determined by  $MT$

# Models and String Language

- the models of  $G = (MT, P)$  are all multigraphs which:
  - 1 have multigraph type  $MT$
  - 2 satisfy all principles  $P$
- the string language of a grammar  $G$  are all strings  $s$  such that:
  - 1 there is a model of  $G$  with as many nodes as words in  $s$
  - 2 concatenation of the words of the nodes yields  $s$

# Principles

- formulas in higher order logic
- characterize the well-formed multigraphs of a specific multigraph type
- predefined principle library from which grammars can be built like with lego bricks (Debusmann et al. 2005 FGMOL), e.g.:
  - tree principle
  - valency principle
  - order principle

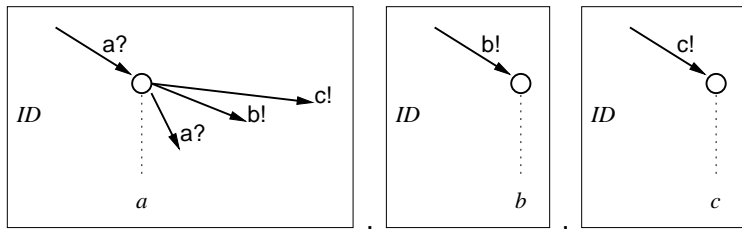
# Tree Principle

- given a dimension  $d$ , there must be:
  - 1 no cycles
  - 2 precisely one node without an incoming edge (the root)
  - 3 each node must have at most one incoming edge

$$\begin{aligned}
 \forall v : \neg(v \rightarrow_d^+ v) & \quad \wedge \\
 \exists^1 v : \neg \exists v' : v' \rightarrow_d v & \quad \wedge \\
 \forall v : \neg \exists v' : v' \rightarrow_d v \vee \exists^1 v' : v' \rightarrow_d v &
 \end{aligned}$$

# Valency Principle

- lexically constrains the incoming and outgoing edges of the nodes
- characterized by fragments, e.g.:



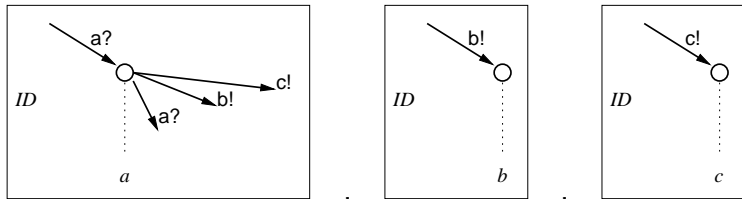


# Grammar 1

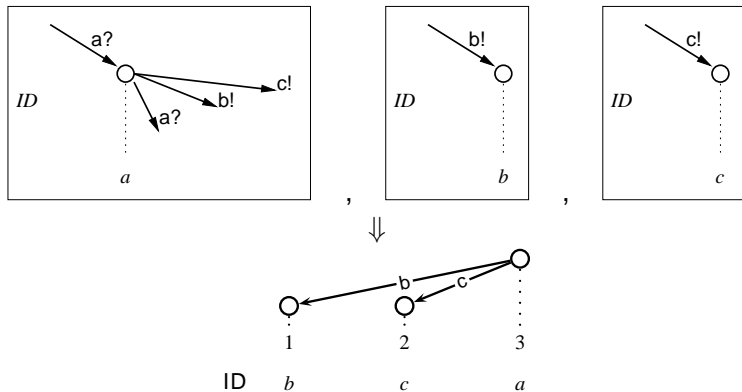
- together with the tree principle, the fragments yield our first grammar
- string language: equally many *as*, *bs* and *cs* in any order:

$$L_1 = \{w \in (a \cup b \cup c)^+ \mid |w|_a = |w|_b = |w|_c\}$$

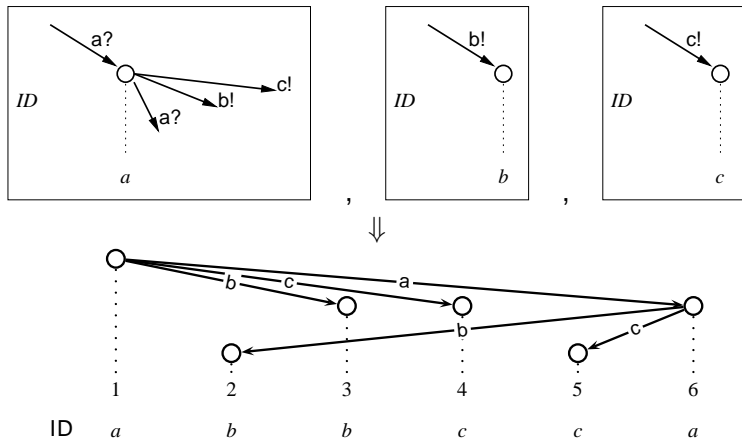
- why? *as* arranged in a chain, each *a* has precisely one outgoing edge to *b* and one to *c*:



# Example Analyses

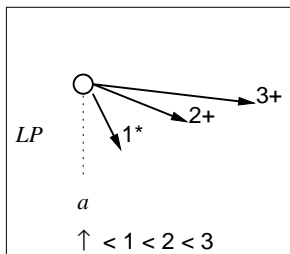


# Example Analyses



# Order Principle

- lexically constrains:
  - the order of the outgoing edges of the nodes depending on their edge labels
  - the order of the mother with respect to the outgoing edges, also depending on their edge labels
- characterized by ordered fragments, e.g.:

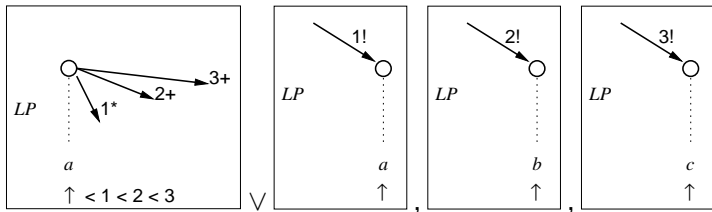


# Grammar 2

- string language: one or more  $a$  followed by one or more  $bs$  followed by one or more  $cs$ :

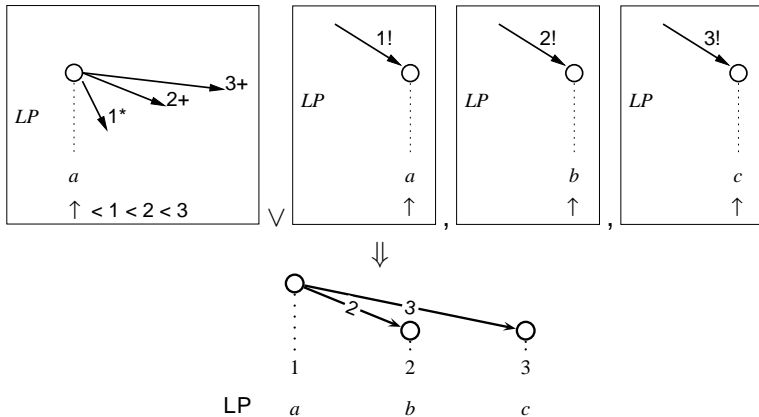
$$L_2 = \{w \in a^+b^+c^+\}$$

- tree, valency and order principles and the fragments below:

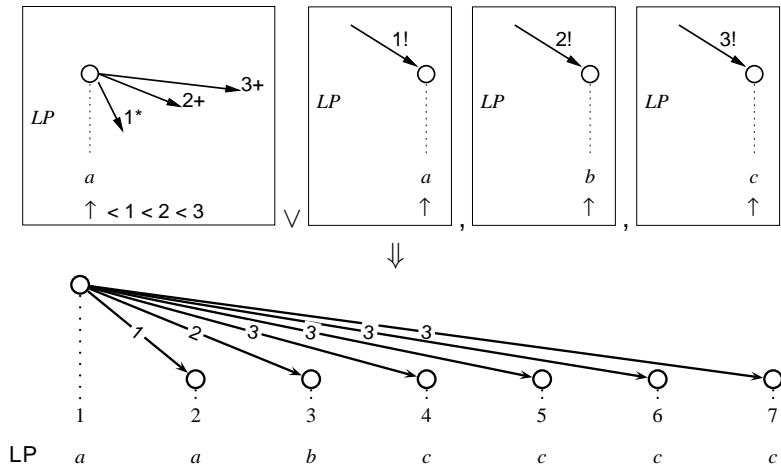


- idea:  $a$  is always root, licensing zero or more outgoing edges labeled 1 to  $as$ , and one or more labeled 2 to  $bs$  and 3 to  $cs$ , where the  $as$  precede the  $bs$  precede the  $cs$ :

# Example Analyses



# Example Analyses



# Intersection of Dimensions

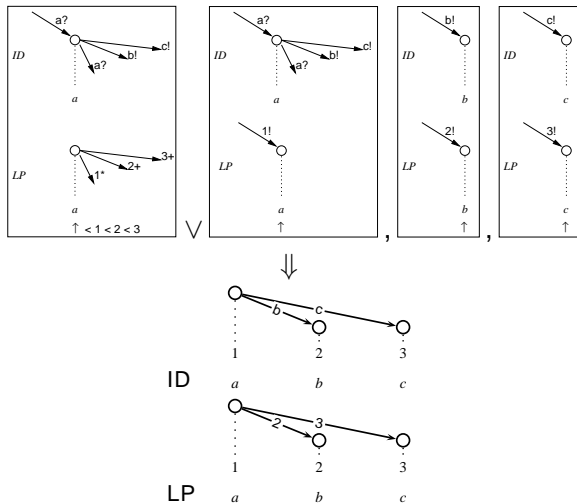
- intersection of the two languages  $L_1$  and  $L_2$  yields the string language of  $n$  *as* followed by  $n$  *bs* followed by  $n$  *cs*:

$$L_1 \cap L_2 = \{w \in a^n b^n c^n \mid n \geq 1\}$$

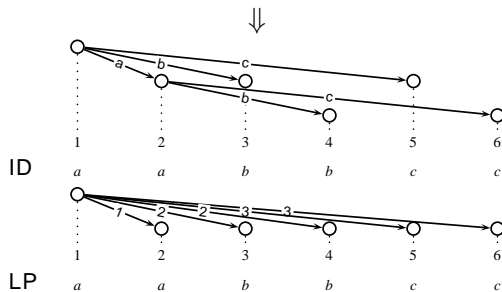
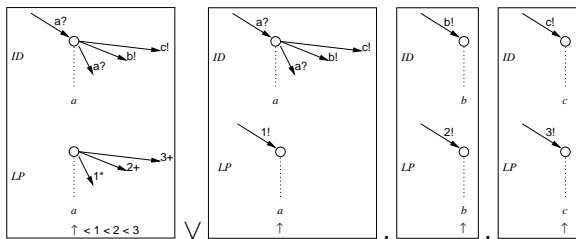
- modeled by intersecting dimensions:
  - 1 ID dimension of grammar 1 ensures that there are equally many *as*, *bs* and *cs*
  - 2 LP dimension of grammar 2 orders the *as* before the *bs* before the *cs*



# Example Analyses



# Example Analyses



# Scrambling

- German subordinate clauses: nouns followed by the verbs:

*(dass) ein Mann Cecilia die Nilpferde füttern sah*  
*(that) a man Cecilia the hippos feed saw*  
*“(that) a man saw Cecilia feed the hippos”*

- all permutations of the nouns grammatical, i.e., also:

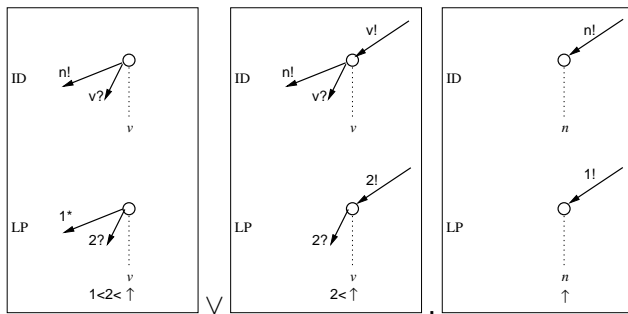
*(dass) ein Mann die Nilpferde Cecilia füttern sah*  
*(dass) die Nilpferde ein Mann Cecilia füttern sah*  
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*(dass) Cecilia ein Mann die Nilpferde füttern sah*  
*(dass) Cecilia die Nilpferde ein Mann füttern sah*

# Idealization

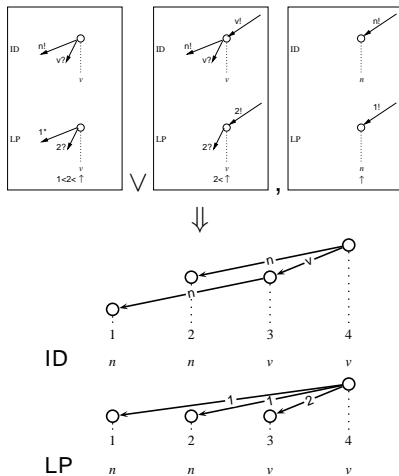
- idealized language:

$$\text{SCR} = \{ \sigma(n^{[1]}, \dots, n^{[k]})v^{[k]} \dots v^{[1]} \mid k \geq 1 \text{ and } \sigma \text{ a permutation} \}$$

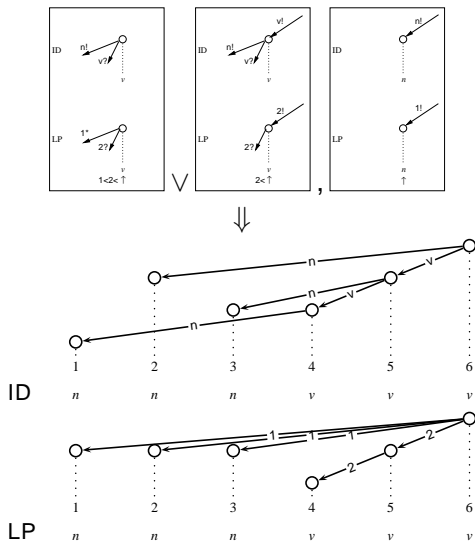
- grammar: ID dimension pairs verbs and nouns, LP dimension orders nouns before verbs



# Example Analyses



# Example Analyses



# Expressivity

- can model lexicalized context-free grammar (constructive proof in thesis)
- can go far beyond context-free grammar:
  - $a^n b^n c^n$  already non-context free
  - can model TAG (Debusmann et al. 2004 TAG+7): mildly context-sensitive
  - cross-serial dependencies (thesis): also mildly context-sensitive
  - scrambling: beyond the mildly context-sensitive Linear Context-Free Rewriting Systems (LCFRS) (Becker et al. 1992)
- put to use in an elegant account of German word order phenomena in (Duchier/Debusmann 2001), (Debusmann 2001), (Bader et al. 2004)

# Complexity

- recognition problem: NP-hard (reduction to SAT in thesis) (Debusmann/Smolka 2006)
- restrictions on principles:
  - first-order: upper bound in PSPACE
  - polynomially testable: upper bound in NP
- all principles written so far first-order
- all principles implemented as polynomially testable constraints in Mozart/Oz
- i.e., practical upper bound: in NP



# Overview

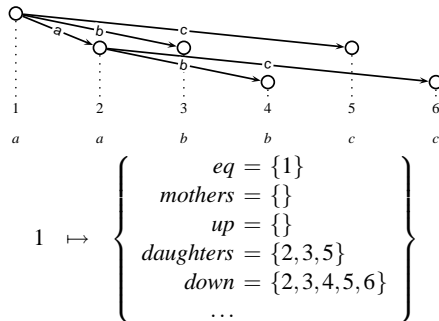
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# Implementation

- how to process an NP-hard problem?
- constraint programming (Schulte 2002), (Apt 2003): solving of constraint satisfaction problems (CSPs)
- CSPs stated in terms of:
  - 1 constraint variables, here on finite sets of integers
  - 2 constraints on them
- solutions of a CSP determined by two interleaving processes:
  - 1 propagation: application of deterministic inference rules
  - 2 distribution: non-deterministic choice
- XDG parsing regarded as a CSP in Mozart/Oz (Smolka 1995), based on techniques developed in (Duchier 1999, 2003)

# Modeling Dependency Multigraphs

- dependency graphs: nodes identified with integers, each node associated with a finite set of integer variables, e.g.:



- dependency multigraphs: variables duplicated for each dimension

# Modeling Principles

- principles can now be transformed into constraints on finite sets of integers
- e.g. the tree principle:

```
for Node in Nodes do
  %% no cycles
  {FS.disjoint Node.eq Node.down}

  %% one root
  {FS.card Roots}=:1

  %% at most one incoming edge
  {FS.card Node.mothers}<=:1
end
```

# Features

- concurrent: all dimensions processed in parallel
- reversible: can be used for parsing and generation (Koller/Striegnitz 2002), (Debusmann 2004)
- supports underspecification: e.g. of quantifier scope, PP attachment (Debusmann et al. 2004 COLING)
- efficient for handcrafted grammars
- first successful experiments in large-scale parsing with the XTAG grammar (> 100.000 lexical entries) after thesis submission

# Grammar Development Kit

- extensive grammar development kit built around the constraint parser (35000 code lines): XDG Development Kit (XDK) (Debusmann et al. 2004 MOZ)
- example grammars (24000 additional lines):
  - German grammar developed in (Debusmann 2001)
  - Arabic grammar developed in (Odeh 2004)
  - toy grammars for Czech, Dutch and French
  - implementations of all example grammars in the thesis
- graphical user interface
- complete documentation (200+ pages)
- application:
  - successfully used for teaching (ESSLLI 2004, FoPra)
  - module in an engine for interactive fiction (Koller et al. 2004)

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# Application to Natural Language

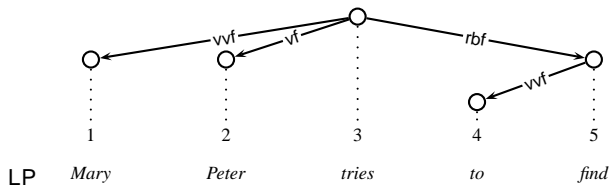
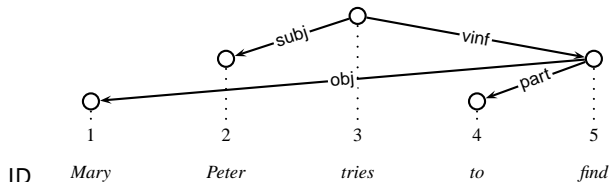
- English example grammar developed in the thesis models fragments of:
  - syntax
  - semantics
  - phonology
  - information structure
- interfaces:
  - relational syntax-semantics interface (Korthals/Debusmann 2002), (Debusmann et al. 2004 COLING)
  - relational phonology-information structure interface (Debusmann et al. 2005 CICLING)



# Syntax

- based on topological analysis of German (Duchier/Debusmann 2001)
- ID dimension: models grammatical functions
- LP dimension: models word order using topological fields
- intersection of ID/LP leads to the emergence of complex English word order phenomena:
  - topicalization
  - wh-questions
  - pied piping

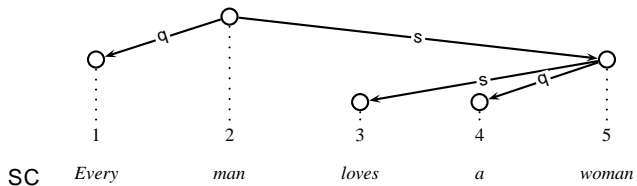
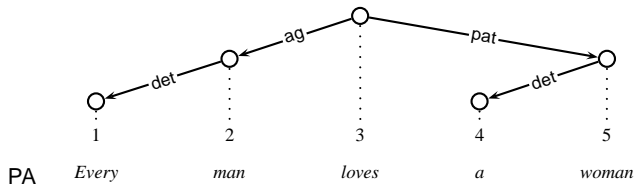
# Topicalization



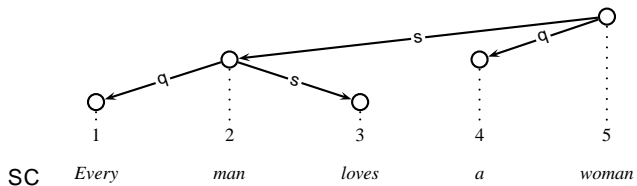
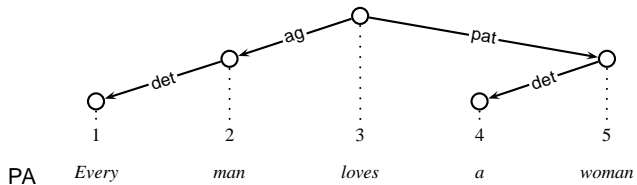
# Semantics

- PA dimension: models predicate-argument structure
- SC dimension: models quantifier scope
- supports scope underspecification
- interface to the Constraint Language for Lambda Structures (CLLS) (Egg et al. 2001)

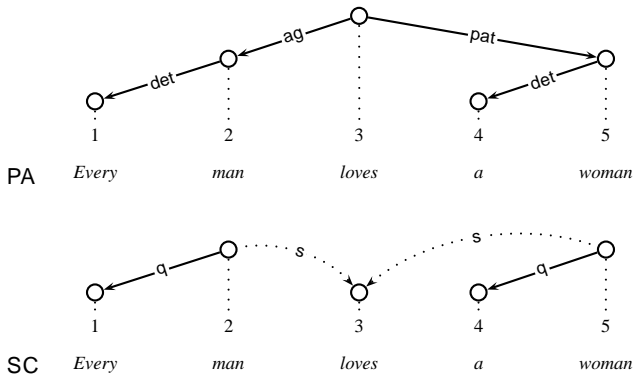
## Example (Weak Reading)



## Example (Strong Reading)



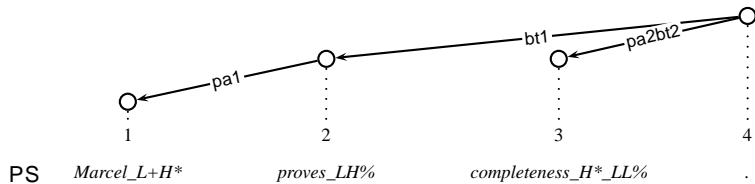
# Example (Underspecification)



# Phonology

- PS dimension: models prosody
- sentence divided into prosodic constituents marked by boundary tones
- prosodic constituents headed by pitch accents

# Example

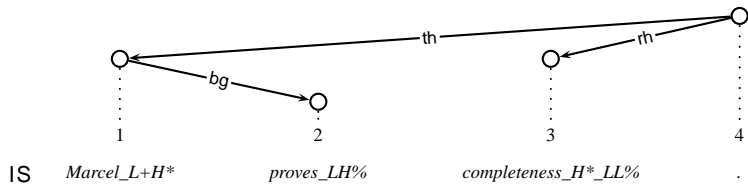




# Information Structure

- IS dimension
- sentence divided into information structural constituents using the theme/rheme dichotomy
- information structural constituents: divided into focus and background

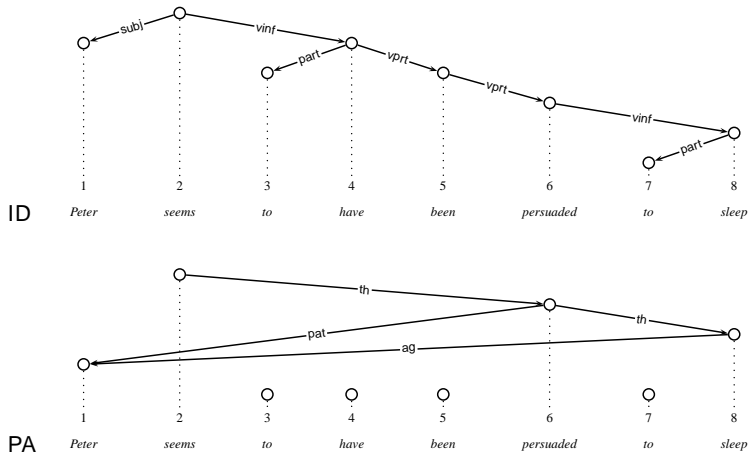
# Example



# Syntax-Semantics Interface

- relational interface between ID and PA dimensions
- modular modeling: independent of word order (LP) and quantifier scope (SC)
- intersection of ID/PA leads to the emergence of:
  - control/raising
  - auxiliary constructions (e.g. passives)
- supports underspecification of PP-attachment

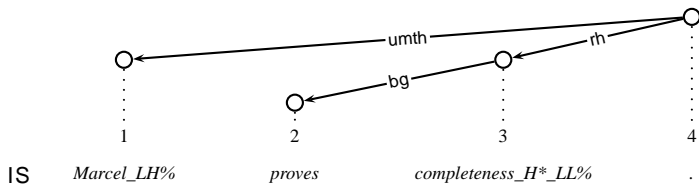
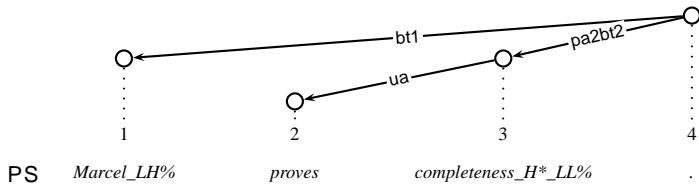
## Control/Raising and Passive Example



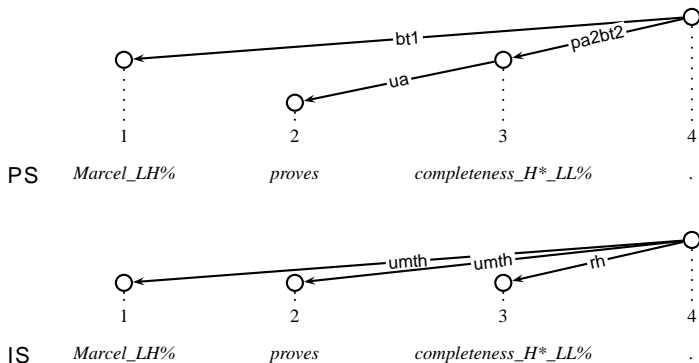
# Phonology-Semantics Interface

- relational interface between PS and IS dimensions
- modular modeling: independent of any other linguistic aspect
- based on the prosodic account of information structure developed in (Steedman 2000)
- intersection of PS and IS dimensions leads e.g. to the emergence of the unmarked theme ambiguity phenomenon

# Unmarked Theme Example



# Unmarked Theme Example



# Overview

- 1 Introduction
- 2 Formalization
- 3 Implementation
- 4 Application
- 5 Conclusions**



# Summary

- with XDG, explored combination of dependency grammar, model theory and parallel architecture
- formalization:
  - higher order logic
  - expressivity: far beyond context-free grammar
  - practical complexity: NP-complete
- implementation:
  - parser based on constraint programming in Mozart/Oz
  - comprehensive grammar development kit (XDK)
- application:
  - example grammar modeling fragments of natural language syntax, semantics, phonology and information structure
- main results:
  - 1 new degree of modularity
  - 2 phenomena emerge by the intersection of individual dimensions, without further stipulation

# Selected Publications I



Ralph Debusmann, Denys Duchier, Alexander Koller, Marco Kuhlmann, Gert Smolka, and Stefan Thater.

A relational syntax-semantics interface based on dependency grammar.

*In Proceedings of COLING 2004, Geneva/CH, 2004.*



Ralph Debusmann, Denys Duchier, Marco Kuhlmann, and Stefan Thater.

TAG as dependency grammar.

*In Proceedings of TAG+7, Vancouver/CA, 2004.*

## Selected Publications II



Ralph Debusmann, Denys Duchier, and Joachim Niehren.  
The XDG grammar development kit.

*In Proceedings of the MOZ04 Conference*, volume 3389 of *Lecture Notes in Computer Science*, pages 190–201, Charleroi/BE, 2004. Springer.



Ralph Debusmann, Denys Duchier, and Andreas Rossberg.  
Modular grammar design with typed parametric principles.

*In Proceedings of FG-MOL 2005*, Edinburgh/UK, 2005.



Ralph Debusmann, Oana Postolache, and Maarika Traat.  
A modular account of information structure in Extensible  
Dependency Grammar.

*In Proceedings of the CICLING 2005 Conference*, Mexico City/MX, 2005. Springer.

## Selected Publications III



Ralph Debusmann and Gert Smolka.

Multi-dimensional dependency grammar as multigraph description.

*In Proceedings of FLAIRS-19, Melbourne Beach/US, 2006. AAAI.*



Alexander Koller, Ralph Debusmann, Malte Gabsdil, and Kristina Striegnitz.

Put my galakmid coin into the dispenser and kick it:  
Computational linguistics and theorem proving in a computer game.

*Journal of Logic, Language and Information*, 13(2):187–206, 2004.

## Selected Publications IV



Christian Korthals and Ralph Debusmann.

Linking syntactic and semantic arguments in a  
dependency-based formalism.

*In Proceedings of COLING 2002, Taipei/TW, 2002.*

## Selected Publications by Other Authors I



Ondrej Bojar.

Problems of inducing large coverage constraint-based dependency grammar.

*In Proceedings of the International Workshop on Constraint Solving and Language Processing, Roskilde/DK, 2004.*



Peter Dienes, Alexander Koller, and Marco Kuhlmann.

Statistical A\* dependency parsing.

*In Prospects and Advances in the Syntax/Semantics Interface, Nancy/FR, 2003.*



Alexander Koller and Kristina Striegnitz.

Generation as dependency parsing.

*In Proceedings of ACL 2002, Philadelphia/US, 2002.*

## Selected Publications by Other Authors II



Christian Korthals.

Unsupervised learning of word order rules, 2003.

Diploma thesis.



Pierre Lison.

Implémentation d'une interface sémantique-syntaxe basée sur des grammaires d'unification polarisées.

Master's thesis, Université Catholique de Louvain, 2006.



Jorge Pelizzoni and Maria das Gracas Volpe Nunes.

N:M mapping in XDG - the case for upgrading groups.

*In Proceedings of the International Workshop on Constraint Solving and Language Processing, Sitges/ES, 2005.*

# Future Work

- formalization:
  - strengthen relation to other grammar formalisms
  - formalize XDG in a weaker logic than HOL, e.g. MSO
- implementation:
  - make use of new constraint technology, e.g. Gecode (Schulte/Tack 2005)
  - automatically generate principle propagators from EMSO-specifications (Tack et al. 2006)



Thank you!

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