

Natural Language Processing

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Plan for Today

- Some Grammar Rules for English
- Features and Unification

Aspects of Phrase Structure of English

- Sentences with **declarative** Structure:
 - a **subject noun phrase followed by a verb phrase**
 - I prefer a morning flight.
 - I want a flight from Ontario to Chicago.
 - The flight should be eleven a.m. tomorrow.
 - The return flight should leave at around seven p.m.
- Sentences with **imperative** structure
 - often begin with a verb phrase and have no subject
 - Show the lowest fare.
 - Give me Sunday's flights arriving in Las Vegas from New York City.
 - List all flights between five and seven p.m.

$S \rightarrow VP$

- Sentences with **yes-no question** structure
 - often (though not always) used to ask questions; they begin with an **auxiliary verb**, followed by a subject NP, followed by a VP.
 - Do any of these flights have stops?
 - Does American's flight eighteen twenty five serve dinner?
 - Can you give me the same information for United?
- various **wh-structures**
 - **wh-word** (*who, whose, when, where, what, which, how, why*)
 - What airlines fly from Burbank to Denver?
 - Which flights depart Burbank after noon and arrive in Denver by six p.m?
 - Whose flights serve breakfast?

$S \rightarrow Wh-NP VP$

Features

Constraints & Compactness

- Constraints in grammar
 - $S \rightarrow NP VP$
 - But *They runs, *He run, *He disappeared the flight
 - Violate **agreement** (number), sub categorization
- Enforcing constraints
 - Add categories, rules

Why features?

- Need compact, general constraints
 - $S \rightarrow NP VP$
Only if NP and VP agree
- How can we describe agreement, subcat?
 - Decompose into elementary features that must be consistent
 - E.g. Agreement
 - Number, person, gender, etc

Feature Structure

Feature Structures

- Fundamentally, Attribute-Value pairs
 - Values may be symbols or feature structures
 - Feature path: list of features in structure to value
 - "Reentrant feature structures" : share same struct
- Represented as
 - Attribute-value matrix (**AVM**), or
 - Directed acyclic graph (**DAG**)

- Feature structures are sets of feature-value pairs where:
 - The features are atomic symbols and
 - The values are either atomic symbols or feature structures

$FEATURE_1$	$Value_1$
$FEATURE_2$	$Value_2$
$FEATURE_3$	$Value_3$
\vdots	\vdots
$FEATURE_n$	$Value_n$

Example of Feature Structures, AVM:

- Number Feature

$$\begin{bmatrix} \text{Number} & sg \end{bmatrix}$$
- Number-person features

$$\begin{bmatrix} \text{Number} & sg \\ \text{Person} & 3rd \end{bmatrix}$$
- Number-person-category features

$$\begin{bmatrix} \text{CAT} & NP \\ \text{Number} & sg \\ \text{Person} & 3rd \end{bmatrix}$$

Bundles of Features

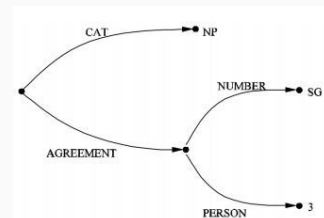
- Feature Values can be feature structures themselves.
- This is useful when certain features commonly co-occur, as number and person.

$$\begin{bmatrix} \text{CAT} & NP \\ \text{AGREEMENT} & \begin{bmatrix} \text{NUMBER} & sg \\ \text{PERSON} & 3rd \end{bmatrix} \end{bmatrix}$$

Feature Structure as DAG

Feature Structure as DAG

$$\begin{bmatrix} \text{CAT} & NP \\ \text{AGREEMENT} & \begin{bmatrix} \text{NUMBER} & sg \\ \text{PERSON} & 3rd \end{bmatrix} \end{bmatrix}$$



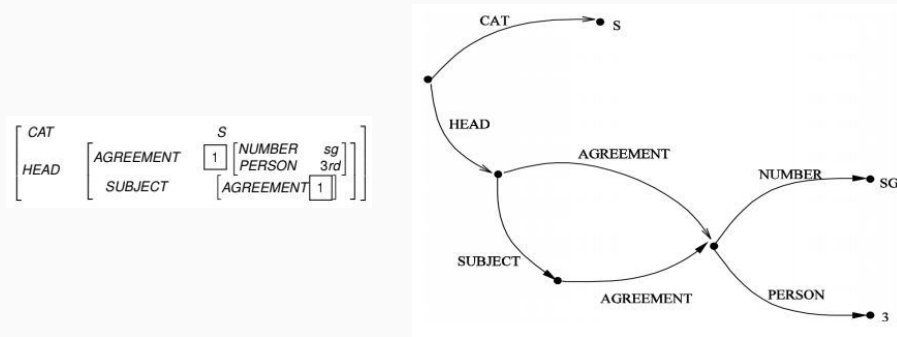
Reentrant Structure

- We'll allow multiple features in a feature structure to share the same values. By this we mean that they share the same structure, not just that they have the same value.
- Numerical indices indicate the shared value.

$$\begin{bmatrix} \text{CAT} & S \\ \text{HEAD} & \begin{bmatrix} \text{AGREEMENT} & \boxed{1} & \begin{bmatrix} \text{NUMBER} & sg \\ \text{PERSON} & 3rd \end{bmatrix} \\ \text{SUBJECT} & \begin{bmatrix} \text{AGREEMENT} & \boxed{1} \end{bmatrix} \end{bmatrix} \end{bmatrix}$$

Reentrant DAGs

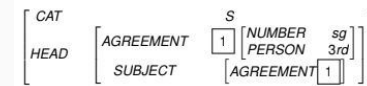
Reentrant DAGs



Reentrant Structure

Reentrant Structure

- It will also be useful to talk about paths through feature structures. As in the paths:
 - <HEAD AGREEMENT NUMBER>
 - <HEAD SUBJECT AGREEMENT>



Unification

Unification

- So what do we want to do with these things...
 - check the compatibility of two structures
 - merge the information in two structures
- We can do both with an operation called Unification.
 - Merging two feature structures produces a new feature structure that is more specific (has more information) than, or is identical to, each of the input feature structures.

Unification Operation

- We say two feature structures can be unified if the component features that make them up are compatible.

$$[NUMBER \ sg] \cup [NUMBER \ sg] = [NUMBER \ sg]$$

$$[NUMBER \ sg] \cup [NUMBER \ pl] = \text{Fail}$$
- Unification is a binary operation (represented as \cup)
- Unification returns the union of all feature/value pairs.

Unification Operation

$$[NUMBER \ sg] \cup [NUMBER \ \square] = [NUMBER \ sg]$$

$$[NUMBER \ sg] \cup [PERSON \ 3rd] = \begin{bmatrix} NUMBER & sg \\ PERSON & 3rd \end{bmatrix}$$

Unification Operation

Examples of Unification for more complex reentrant structure

- Equality check complicated by the presence of a reentrant structure in the first argument.

$$\begin{bmatrix} AGREEMENT & \boxed{1} & \begin{bmatrix} NUMBER & sg \\ PERSON & 3rd \end{bmatrix} \\ SUBJECT & \begin{bmatrix} AGREEMENT & \boxed{1} \end{bmatrix} \end{bmatrix} \cup \begin{bmatrix} SUBJECT & \begin{bmatrix} AGREEMENT & \begin{bmatrix} PERSON & 3rd \\ NUMBER & sg \end{bmatrix} \end{bmatrix} \end{bmatrix} =$$

$$\begin{bmatrix} AGREEMENT & \boxed{1} & \begin{bmatrix} NUMBER & sg \\ PERSON & 3rd \end{bmatrix} \\ SUBJECT & \begin{bmatrix} AGREEMENT & \boxed{1} \end{bmatrix} \end{bmatrix}$$

- Copying capabilities of unification

$$\begin{bmatrix} AGREEMENT & \boxed{1} & \begin{bmatrix} NUMBER & sg \\ PERSON & 3rd \end{bmatrix} \\ SUBJECT & \begin{bmatrix} AGREEMENT & \boxed{1} \end{bmatrix} \end{bmatrix} \cup \begin{bmatrix} SUBJECT & \begin{bmatrix} AGREEMENT & \boxed{1} & \begin{bmatrix} PERSON & 3rd \\ NUMBER & sg \end{bmatrix} \end{bmatrix} \end{bmatrix} =$$

$$\begin{bmatrix} AGREEMENT & \boxed{1} & \begin{bmatrix} NUMBER & sg \\ PERSON & 3rd \end{bmatrix} \\ SUBJECT & \begin{bmatrix} AGREEMENT & \boxed{1} & \begin{bmatrix} PERSON & 3rd \\ NUMBER & sg \end{bmatrix} \end{bmatrix} \end{bmatrix}$$

Features, Unification and Grammar

How do we incorporate feature structures into our grammars?

- Assume that constituents are objects which have feature-structures associated with them.
- Associate sets of unification constraints with grammar rules.
- Constraints must be satisfied for rule to be satisfied.
- For a grammar rule: $\beta \rightarrow \beta_1 \dots \beta_n$
 - $\langle \beta_i \text{ feature path} \rangle = \text{Atomic value}$
 - $\langle \beta_i \text{ feature path} \rangle = \langle \beta_j \text{ feature path} \rangle$

- To enforce subject/verb number agreement
 - $S \rightarrow NP VP$
 $\langle NP \text{ NUMBER} \rangle = \langle VP \text{ NUMBER} \rangle$
 if the number of the NP is equal to the number of the VP
- Agreement
 - This flight serves breakfast.
 $S \rightarrow NP VP$
 $\langle NP \text{ AGREEMENT} \rangle = \langle VP \text{ AGREEMENT} \rangle$
 - Does this flight serve breakfast?
 $S \rightarrow Aux NP VP$
 $\langle Aux \text{ AGREEMENT} \rangle = \langle NP \text{ AGREEMENT} \rangle$

- Det/Nom agreement can be handled similarly
 - This flight, Those flights
 $NP \rightarrow Det \text{ Nominal}$
 $\langle Det \text{ AGREEMENT} \rangle = \langle Nominal \text{ AGREEMENT} \rangle$
 $\langle NP \text{ AGREEMENT} \rangle = \langle Nominal \text{ AGREEMENT} \rangle$
- And so on for other constituents and rules

Head Features

- Features of most grammatical categories are copied from head child to parent (e.g. from Verb to VP, Nominal to NP, N to Nominal, . . .)
- These normally written as head features, e.g.
 - $VP \rightarrow Verb NP$
 $\langle VP \text{ HEAD} \rangle = \langle Verb \text{ Head} \rangle$
 - $NP \rightarrow Det \text{ Nominal}$
 $\langle NP \text{ HEAD} \rangle = \langle Nominal \text{ Head} \rangle$
 - $\langle Det \text{ HEAD AGREEMENT} \rangle = \langle Nominal \text{ Head AGREEMENT} \rangle$
 - $Nominal \rightarrow Noun$
 $\langle Nominal \text{ HEAD} \rangle = \langle Noun \text{ Head} \rangle$
- Lexical entries that introduce this feature now reflect this HEAD notion.
 - $Noun \rightarrow flights$
 $\langle Noun \text{ HEAD AGREEMENT NUMBER} \rangle = pl$
 - $Verb \rightarrow serves$
 $\langle Verb \text{ HEAD AGREEMENT NUMBER} \rangle = sg$
 $\langle Verb \text{ HEAD AGREEMENT PERSON} \rangle = 3rd$

How can we parse with feature structures?

- Unification operator: takes 2 features structures and returns either a **merged feature structure** or **fail**
 - Input structures represented as DAGs
 - Features are labels on edges
 - Values are atomic symbols or DAGs
 - Unification algorithm goes through features in one input
 - DAG1 trying to find corresponding features in DAG2 - **if all match, success, else fail**

Summing Up

- Feature structures encoded rich information about components of grammar rules.
- Unification provides a mechanism for merging structures and for comparing them.
- Unification parsing:
 - Merge or fail.

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Thank You

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