LING 473: Day 14

START THE RECORDING

Deep Processing

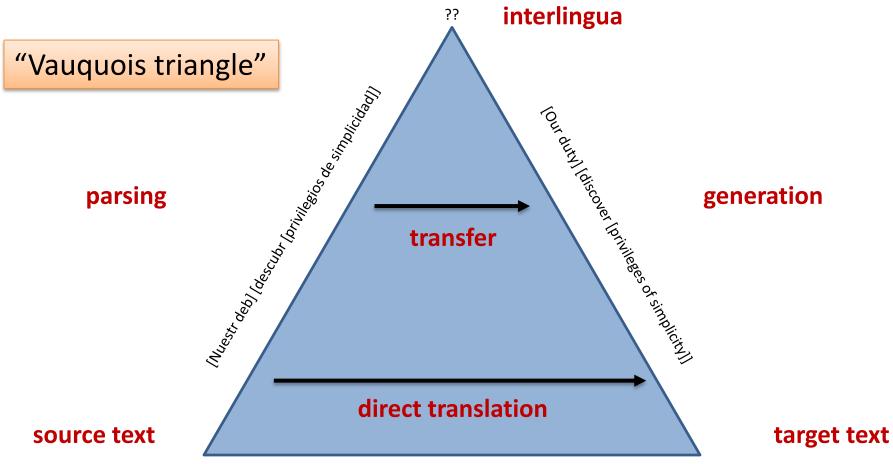
#### Reminders

- Course reviews available (check e-mail)
- Writing assignment is due today
- Project 5 is due Thursday.
- We'll go over the self quiz solutions Thursday
- Course Evaluations

## Deep vs. shallow

- Analytical methods:
  - "deep," rule-based
  - linguistically informed/motivated
  - traditionally rules have been hand-crafted
    - but see Poon and Domingos 2009 <a href="http://www.cs.washington.edu/homes/pedrod/papers/emnlp09.pdf">http://www.cs.washington.edu/homes/pedrod/papers/emnlp09.pdf</a>
  - system development feedback: direct
- Statistical methods
  - "shallow," automatically-extracted
  - development feedback from results: indirect

## Semantic transfer machine translation



Nuestro deber es descubrir los privilegios de la simplicidad.

Our duty is to discover the privileges of simplicity

# HPSG (Head-driven Phrase Structure Grammar)

- Highly consistent and powerful formalism
- Declarative, non-derivational, lexicalist, constraint-based
- Has been used to model many different languages
- Some large-scale implementations

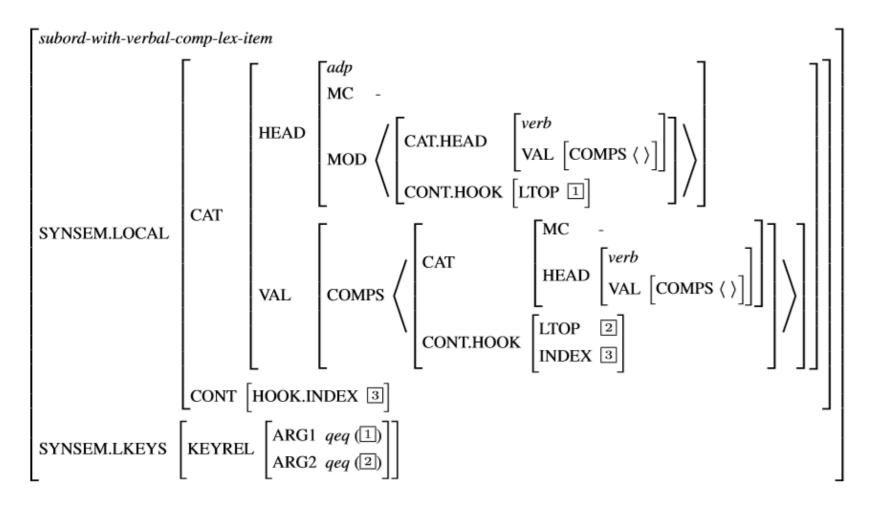
## HPSG foundations: Typed Feature Structures

- Typed Feature Structures
- High expressive power
- Parsing complexity: exponential (to the input length)
- Tractable with efficient parsing algorithms
- Efficiency can be improved with a well designed grammar

# Feature Structures In Unification-Based Grammar Development

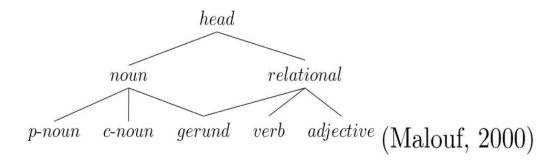
- A feature structure is a set of attribute-value pairs
  - Each attribute (or feature) is an atomic symbol
  - The value of each attribute can be either atomic, or complex (a feature structure, a list, or a set)

## Feature Structure Example



# *Typed* Feature Structure (TFS)

- A typed feature structure is composed of a (possibly empty) set of attribute-value pairs with each value being a TFS
- Each value is typed in some hierarchy (like types in programming languages)



## Properties of TFSes

- Finiteness
  - a typed feature structure has a finite number of nodes
- Unique root and connectedness
  - a typed feature structure has a unique root node; apart from the root, all nodes have at least one parent
- No cycles
  - no node has an arc that points back to the root node or to another node that intervenes between the node itself and the root
- Unique features
  - no node has two features with the same name and different values
- Typing
  - each node has single type which is defined in the hierarchy

# Type hierarchy

- In the DELPH-IN joint reference formalism:
  - A unique most general type: \*top\* T
  - Each non-top type has one or more parent type(s)
  - Two types are compatible if they share at least one offspring type
  - Each non-top type is associated with optional constraints
    - Constraints specified in ancestor types are monotonically inherited
    - Constraints (either inherited, or newly introduced) must be compatible

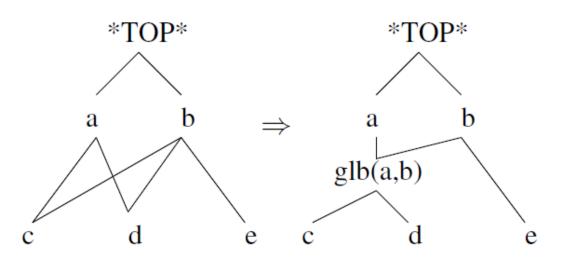
## Unification

The unification result on two TFSes TFS<sub>a</sub> and TFS<sub>b</sub> is:

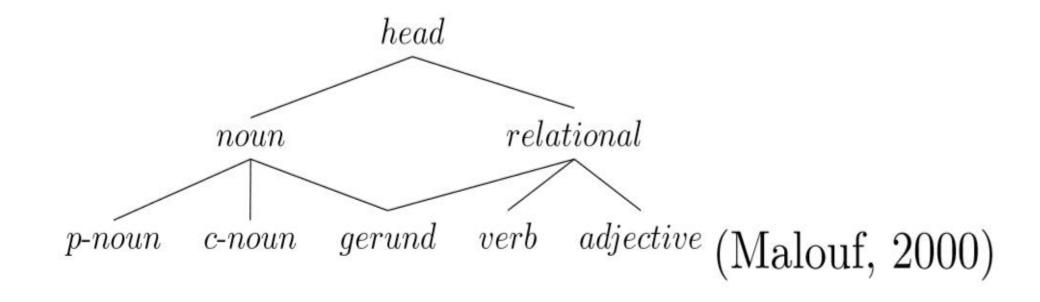
- ⊥, if either one of the following:
  - type a and b are incompatible
  - unification of values for attribute X in  $TFS_a$  and  $TFS_b$  returns  $\bot$
- a new TFS, with:
  - the most general shared subtype of a and b
  - a set of attribute-value pairs being the results of unifications on sub-TFSes of TFS<sub>a</sub> and TFS<sub>b</sub>

## **GLB Types**

- In case of multiple inheritance, two types can have more than one shared subtype that neither is more general than the others
- Non-deterministic unification results
- Type hierarchy can be automatically modified to avoid this



# Type Hierarchy Examples



#### Semantics desiderata

 For each sentence admitted by the grammar, we want to produce a meaning representation suitable for applying rules of inference.

"This fierce dog chased that angry cat."

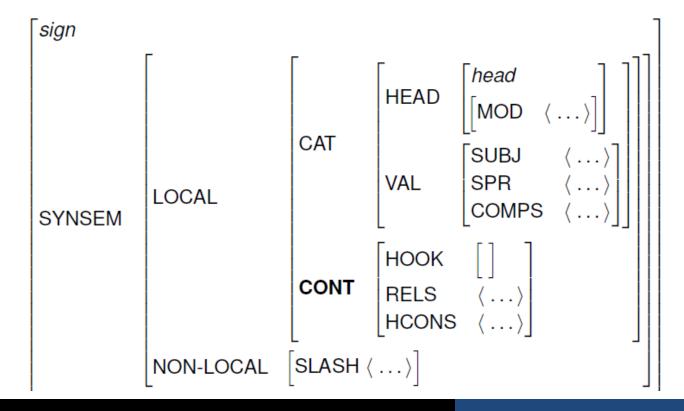
this(x)  $\land$  fierce(x)  $\land$  dog(x)  $\land$  chased(e, x, y)  $\land$  that(y)  $\land$  angry(y)  $\land$  cat(y)

## Semantics desiderata

- Compositionality
  - The meaning of a phrase is composed of the meanings of its parts.
    - (Where is this wrong?)
- Existing machinery
  - Unification is the only mechanism we use for constructing semantics in the grammar.

#### Semantics in feature structures

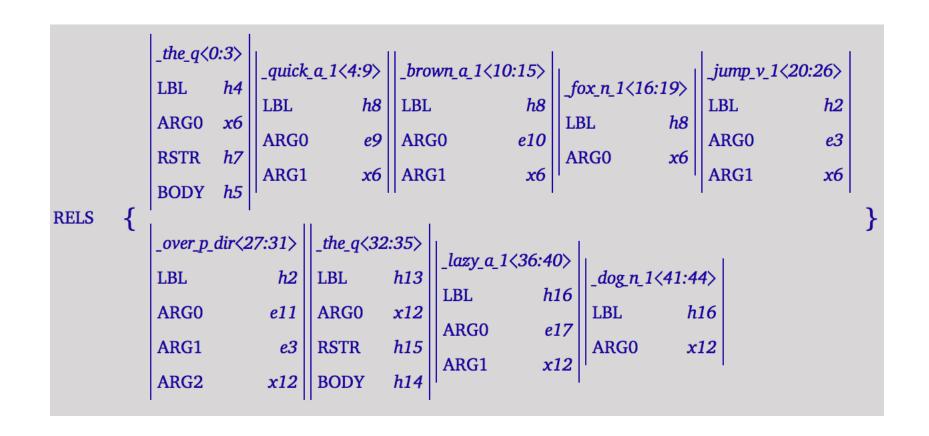
Semantic content in the CONT attribute of every word and phrase



## Semantics formalism: MRS

- Minimal Recursion Semantics
  - Copestake, A., Flickinger, D., Pollard, C. J., and Sag, I. A. (2005). *Minimal recursion semantics: an introduction*. Research on Language and Computation, 3(4):281–332.
- Used across DELPH-IN projects
- The value of CONT for a sentence is essentially a list of relations in the attribute RELS, with the arguments in those relations appropriately linked:
  - Semantic relations are introduced by lexical entries
  - Relations are appended when words are combined with other words or phrases.

# MRS: example



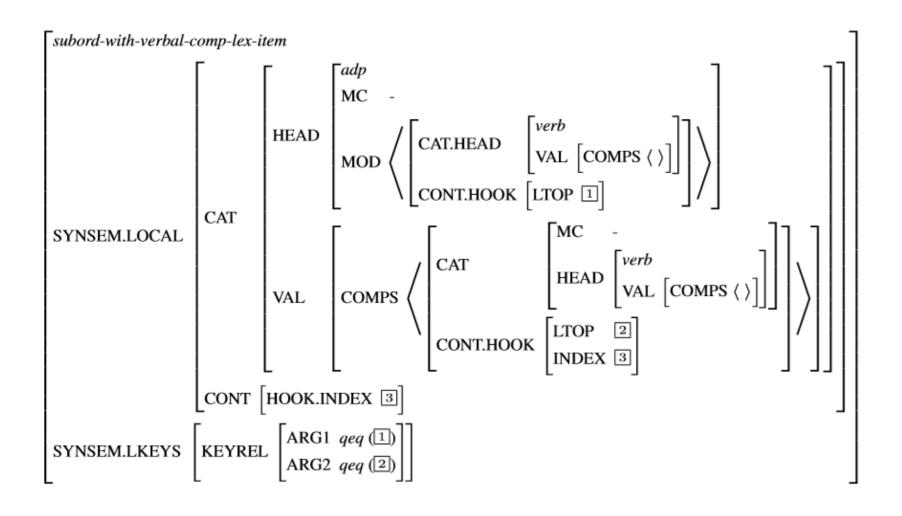
# Linking semantic arguments

- Each word or phrase also 'publishes' an INDEX attribute in CONT.HOOK
- When heads select a complement or specifier, they constrain its INDEX value – an instance variable for nouns, an event variable for verbs.
- Each lexeme also specifies a KEY relation (to allow complex semantics)

# Semantics of phrases

- Every phrase identifies its RELS attribute with the concatenation of its daughters' RELS lists
- Every phrase identifies its semantic INDEX value with the INDEX value of one of its daughters (the semantic head).
- Since we unify the *synsem* of a complement or specifier with the constraints in the head-daughter, unification also takes care of semantic linking.
- Head-modifier structures: the modifier constrains the semantic index of the modified head-daughter, and then rules unify the *synsem* of the head-daughter with the MOD value in the modifier.

## Semantics in the Feature Structure



## Semantic Representation

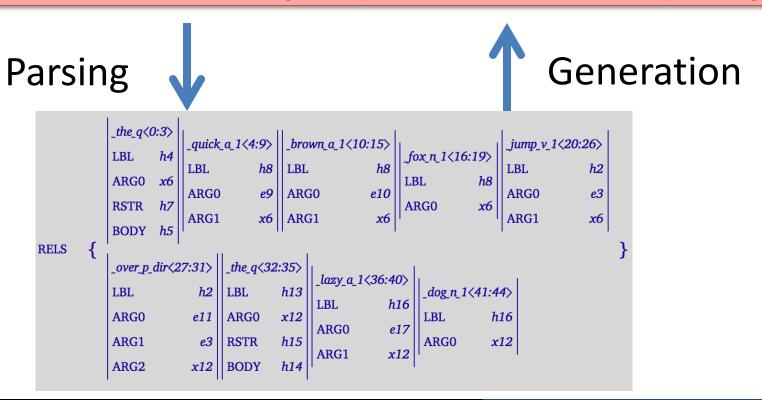
```
Kim left when Pat arrived
```

```
\langle h_1, e_3,
 h_4:proper_q(x_6, h_5, h_7),
  h_8:named(x_6, Kim),
 h_9:_leave_v_1(e_3, x_6, p_{10}),
  h_2:_when_x_subord(e_{11}, h_{12}, h_{13}),
 h_{14}:proper_q(x_{16}, h_{15}, h_{17}),
 h_{18}:named(x_{16}, Pat),
 h_{19}:_arrive_v_1(e_{20}, x_{16})
 \{h_{15} \ qeq \ h_{18}, \ h_{13} \ qeq \ h_{19}, \ h_{12} \ qeq \ h_{9}, \ h_{5} \ qeq \ h_{8}, \ h_{1} \ qeq \ h_{2}\} \}
```

## Parsing and Generation

DELPH-IN computational grammars are bi-directional:

the quick brown fox jumped over the lazy dog



#### **ERG Demo**

http://erg.delph-in.net/logon

## **Next Time**

Review & wrap-up