# Computational Linguistics II — Grammars, Algorithms, Statistics —

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### **Review: Feature Structure Unification & Copying**

#### **Basic Notions**

- Typed feature structures encoded as *directed acyclic graphs* (DAGs);
- each node bears a *type* and a set of *arcs* (aka feature value pairs);
- feature structure reentrancy (coreference) corresponds to DAG identity;
- unification creates equivalence classes, encoded through forwarding.

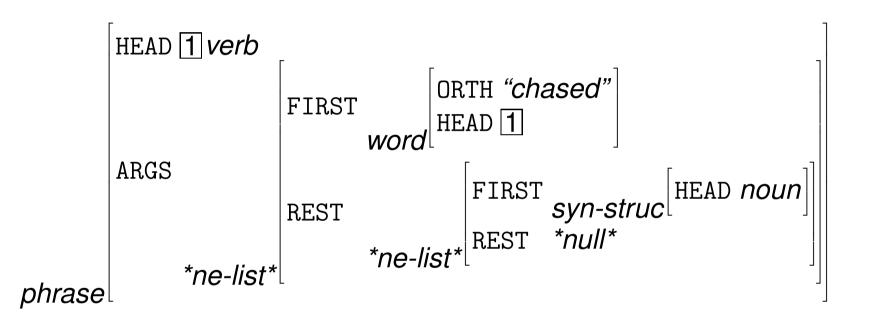
#### **Basic Operations**

- *unify()*—make two DAGs equivalent, check and combine all information;
- $\rightarrow$  at each node, glb() types, forward, recurse over and accumulate arcs;
  - *copy()*—create *structurally equivalent* copy (preserving reentrancies);
- $\rightarrow$  at each node, *copy* slot as short-term memory, reset upon completion.



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### **Feature Structure Reentrancy (AVM)**

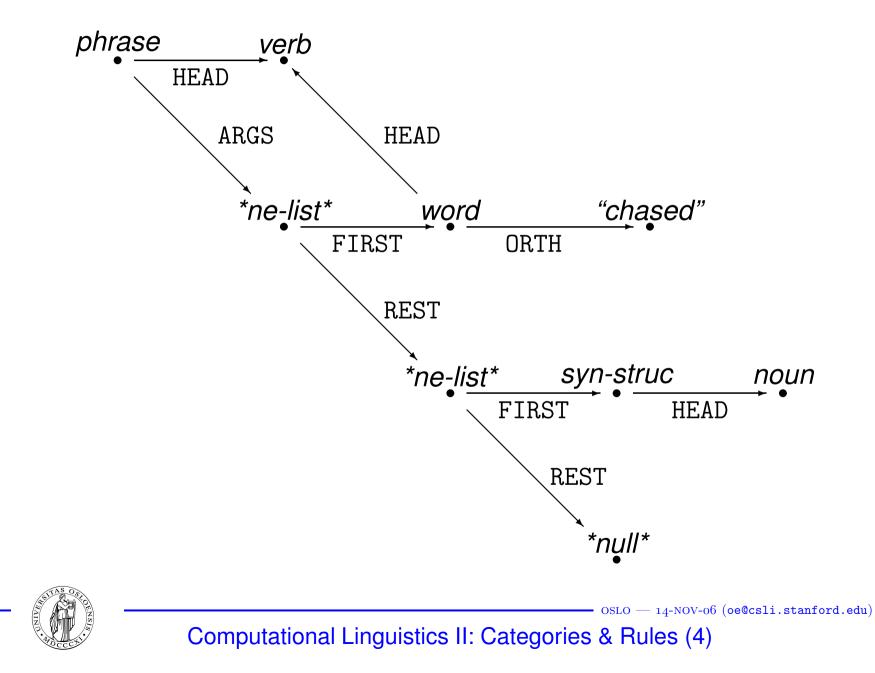




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### **Feature Structure Reentrancy (DAG)**



### The Costs of Feature Structure Manipulation

#### **Basic Cost Measure**

- Visit each DAG node once (node operations 'constant'): *full traversal*;
- *linear* in the number of nodes  $\rightarrow$  upper bound is size of largest DAG.

#### Naïve Complexity Theory

- Prior to each (destructive) unification, make copies of both input DAGs;
- upon completion of each copy, recursively reset copy slot on all nodes.

restore()	copy()	unify()
1	2	5



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### The unify() vs. copy() Trade-Off

#### **Destructive Unification [Boyer & Moore, 1972]**

• Permanently alter both input dags: setf() on *forward*, *type*, and *arcs*;

- $\rightarrow$  over copying two full copies required for only one result structure;
- $\rightarrow$  early copying majority of unifications fail: many unnecessary copies.

#### Non-Destructive Unification [Wroblewski, 1987]

- Incrementally build up result DAG during unification, one node at a time;
- $\rightarrow$  eliminates over copying, reduces early copying more or less effectively.

#### **Quasi-Destructive Unification [Tomabechi, 1991]**

- Alter input DAGs in way that is reversible (at small cost): 'generations';
- $\rightarrow$  copy out result only after unification success, no over or early copying.



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### **Generation Counting**

- Protect DAG slots with *generation* counter  $\rightarrow$  'expiration date' of value;
- access: require valid generation; assignment: set value *and* generation;
- $\rightarrow$  implemented through interaction of global counter and ADT functionality.

```
(defstruct dag
forward type arcs xcopy (generation 0))
(defparameter *generation* 1)
(defun dag-copy (dag)
  (when (= (dag-generation dag) *generation*) (dag-xcopy dag)))
(defsetf dag-copy dag-set-copy)
(defun dag-set-copy (dag value)
  (setf (dag-generation dag) *generation*)
  (setf (dag-xcopy dag) value))
```



### **Unification-Based Parsing**

#### Adaptations to CFG-Based Chart Parser

- Make all elements of  $\Sigma$ , C, and P from the grammar feature structures;
- substitute *unification* and *equivalence test* for category comparison;
- unify category of passive edges with *argument position* of active edges;
- $\rightarrow$  edge structure LHS is DAG, RHS list of paths to argument positions;
- $\rightarrow$  fundamental-rule() result of unification is category for new edge;
- $\rightarrow$  pack-edge() equivalence test: two DAGs contain same information;
  - test spanning passive edges for compatibility against start symbol S.

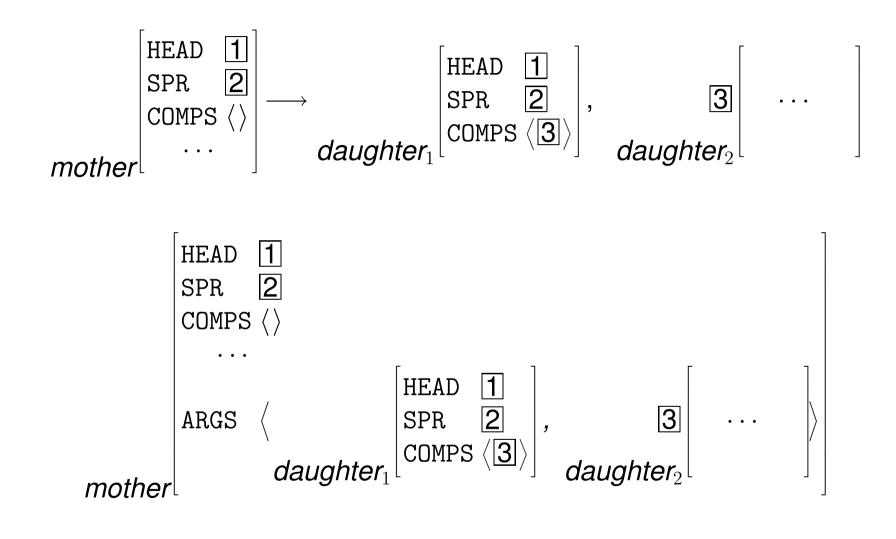
#E[id: (i-j) dag --> edge<sub>1</sub> ... edge<sub>i</sub> . path<sub>i+1</sub> ... path<sub>n</sub> { alternates }\* ]

#E[42: (0-8) head-specifier-rule --> 13 . (ARGS REST FIRST)]



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### **Reminder: The Format of Grammar Rules in the LKB**





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### **Additional DAG Manipulation Functionality**

#### **Unification into Argument Position**

• Additional parameter to unify(): unify dag<sub>2</sub> into dag<sub>1</sub> under path:

(defun unify (dag1 dag2 &optional path)

• empty *path*: regular unification; otherwise find first *path* element in  $dag_1$ , recurse with corresponding *arc* value from  $dag_1$ ,  $dag_2$ , and rest of *path*.

#### Equivalence Test

- Similar to unify(): traverse two dags in parallel, but no modifications;
- reentrancies: for each node, record corresponding node from second dag in *copy* slot; non-empty *copy* values need to match current nodes.



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### **Unification-Based Parsing—Practical Concerns**

#### Observations

- Typical systems: 90<sup>+</sup> per cent of parsing time go to DAG manipulation;
- most unifications fail: predict unification failure cheaply, where possible;
- $\rightarrow$  *rule filter*: rule feeding relations; *quick check*: most likely failure paths;
  - lexicalisation: argument positions in rules may be highly underspecified;
- $\rightarrow$  *head-driven* parsing: instantiate RHS bidirectionally, starting from head;
  - many unifications fail very early: copy() more expensive than unify();
- $\rightarrow$  memory is expensive: redo a couple of unfications instead of one copy.

#### Several orders of magnitude average speed-up by reducing constants



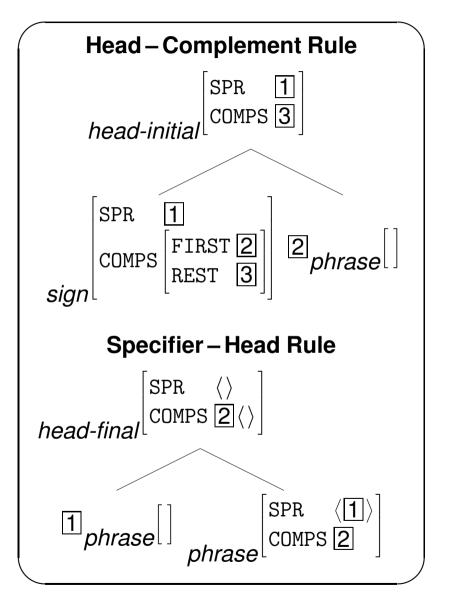
### **Unification-Based Parsing—Optimizations**

#### **Rule Filter**

- 'Specifier-Head' cannot feed into first argument position of 'Head-Complement' (COMPS);
- $\rightarrow$  precompute *rule filter* relation;
  - fundamental rule checks filter before attempting a unification.

#### **Head-Driven Parsing**

- First argument position of 'Specifier-Head' cannot fail: large number of active edges;
- $\rightarrow$  bi-directional rule instantiation: head argument position first.



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