

# CS 544 NLP

## Spring 2011

$S \rightarrow NP VP$

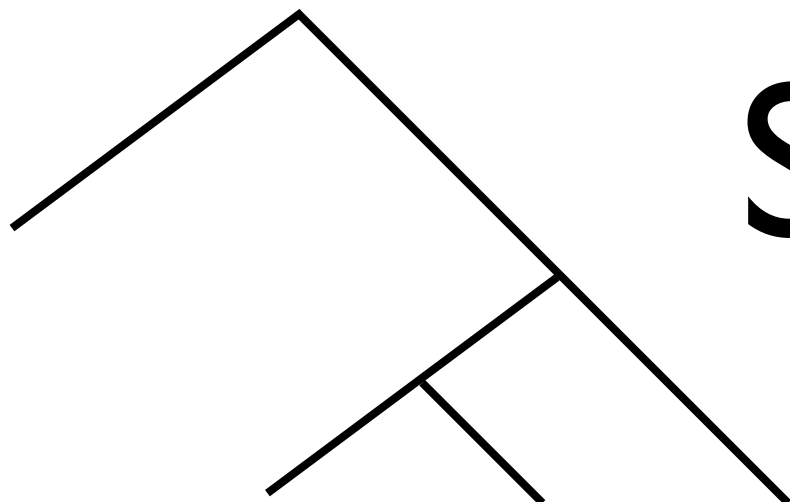
# Syntax and Parsing

Dirk Hovy  
1-13-2011

(some slides from Liang Huang)

# CS 544 NLP

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# Syntax and Parsing

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# What's wrong here?

*hovercraft full my is eels of*

# What's wrong here?

*my hovercraft is full of eels*

# Order, please!

- some orders are grammatical, others not

*\*hovercraft full my is eels of*

vs.

*my hovercraft is full of eels*

# Order, please!

- some orders are grammatical, others not

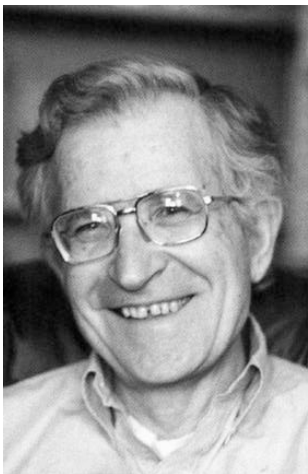
*\*hovercraft full my is eels of*  
vs.

*my hovercraft is full of eels*

*ungrammatical sentences are marked with a \**

# Syntax

- study of word order
- one of fundamental levels of language  
(phonetics/phonology, morphology, syntax, semantics, pragmatics)
- has to do with trees...
- Chomsky says: independent of meaning!  
*Colorless green ideas sleep furiously*





# Sentence elements

- *[my hovercraft] [is full of eels]*  
*[it] [is full of eels]*  
*[my air-powered aquatic vehicle] [is full of eels]*  
*[my hovercraft] [sank]*
- we can exchange certain elements: phrases  
(or constituents)

# How to spot phrases from a large distance

- substitution:  
*it is full of eels {it = my hovercraft}*
- deletion (produces nonsense):  
*\*∅ is full of eels*

# Recurring structures

- substitution shows: many sentences have the same structure
- pick any two to make a sentence:

my hovercraft  
Dennis Moore  
a man with three buttocks

is full of eels  
has a brother  
owns a shack  
is huge

# Recurring structures

- substitution shows: many sentences have the same structure
- pick any two to make a sentence:

a ma      **Noun**      is full of eels  
                 **phrases**      has a brother  
                                      owns a shack  
                                      is huge

# Recurring structures

- substitution shows: many sentences have the same structure
- pick any two to make a sentence:

a ma      Noun      is      Verb      phrases

# Context-Free Grammars

- $S \rightarrow NP VP$
- $NP \rightarrow Det N$
- $NP \rightarrow NP PP$
- $PP \rightarrow P NP$
- $VP \rightarrow V NP$
- $VP \rightarrow VP PP$
- ...
- $N \rightarrow \{ball, garden, house, sushi\}$
- $P \rightarrow \{in, behind, with\}$
- $V \rightarrow \dots$
- $Det \rightarrow \dots$

# Context-Free Grammars

- **$S \rightarrow NP VP$**

- **$NP \rightarrow Det N$**

- **$N \rightarrow \{ball, garden, house, sushi\}$**

most famous rule in linguistics ever...

- **$NP \rightarrow PP$**

- **$V \rightarrow \dots$**

- **$PP \rightarrow P NP$**

- **$Det \rightarrow \dots$**

- **$VP \rightarrow V NP$**

- **$VP \rightarrow VP PP$**

- **$\dots$**

# Context-Free Grammars

**A CFG is a 4-tuple  $\langle N, \Sigma, R, S \rangle$**

**A set of nonterminals  $N$**

(e.g.  $N = \{S, NP, VP, PP, Noun, Verb, \dots\}$ )

**A set of terminals  $\Sigma$**

(e.g.  $\Sigma = \{I, you, he, eat, drink, sushi, ball, \}$ )

**A set of rules  $R$**

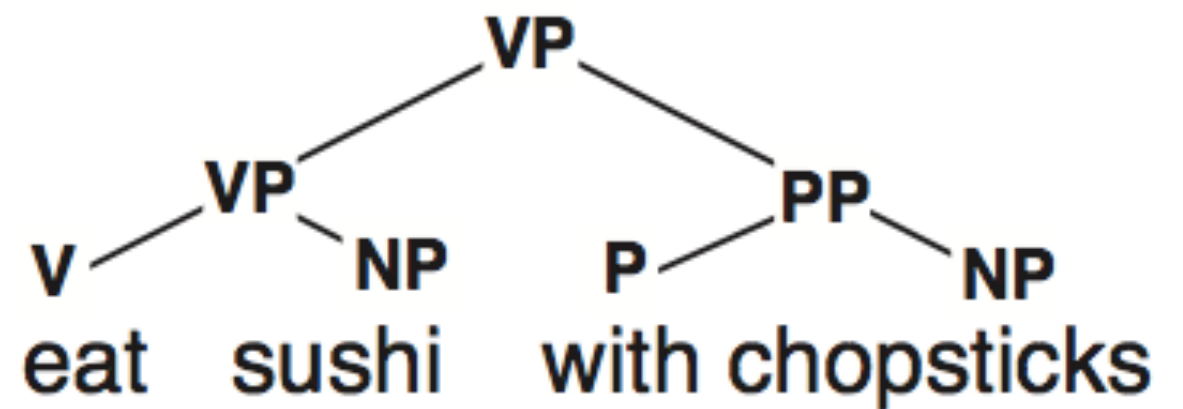
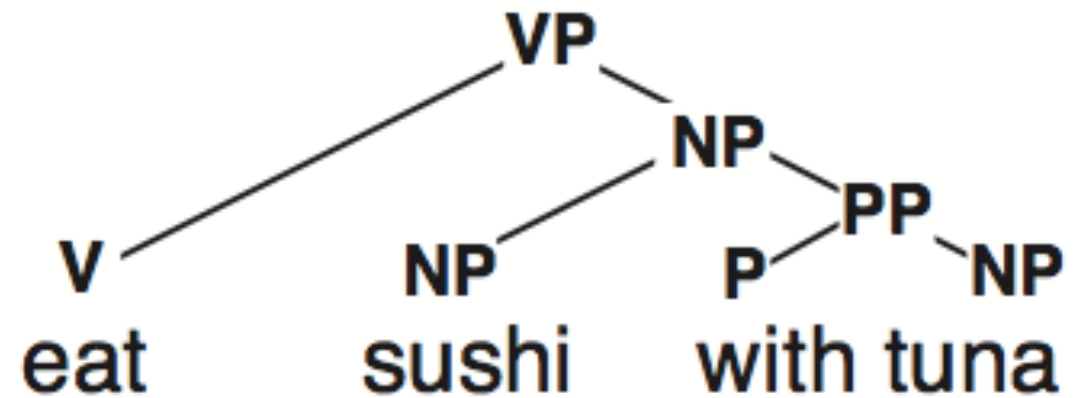
$R \subseteq \{A \rightarrow \beta \text{ with left-hand-side (LHS) } A \in N$   
and right-hand-side (RHS)  $\beta \in (N \cup \Sigma)^* \}$

**A start symbol  $S$  (sentence)**



# Parse Trees

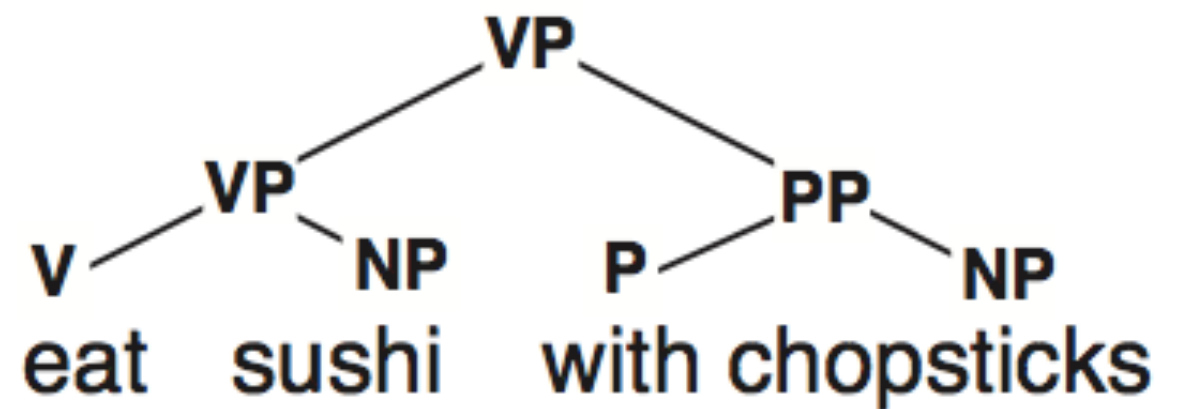
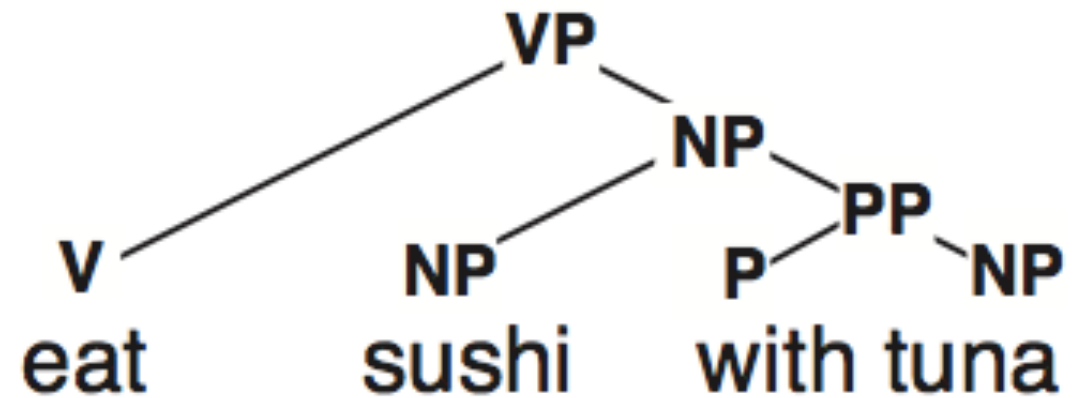
- $N \rightarrow \{sushi, tuna\}$
- $P \rightarrow \{with\}$
- $V \rightarrow \{eat\}$
- $NP \rightarrow N$
- $NP \rightarrow NP PP$
- $PP \rightarrow P NP$
- $VP \rightarrow V NP$
- $VP \rightarrow VP PP$



# Parse Trees

terminals

- $N \rightarrow \{sushi, tuna\}$
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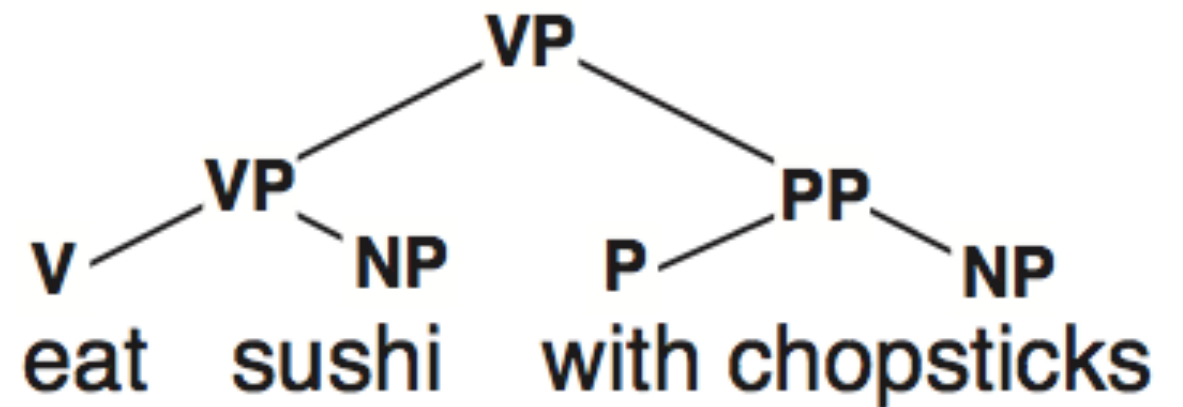
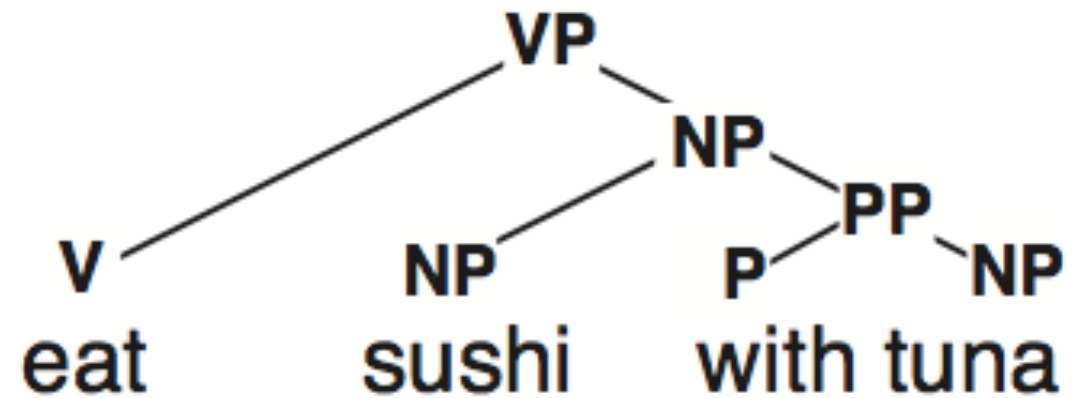


# Parse Trees

pre-terminals

terminals

- **N** → {*sushi*, *tuna*}
- **P** → {*with*}
- **V** → {*eat*}
- **NP** → **N**
- **NP** → **NP PP**
- **PP** → **P NP**
- **VP** → **V NP**
- **VP** → **VP PP**



# Parse Trees

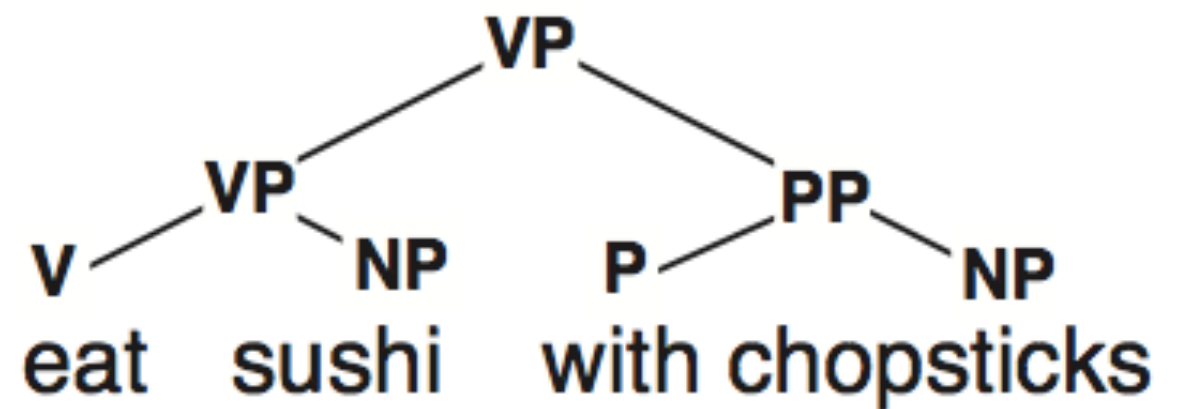
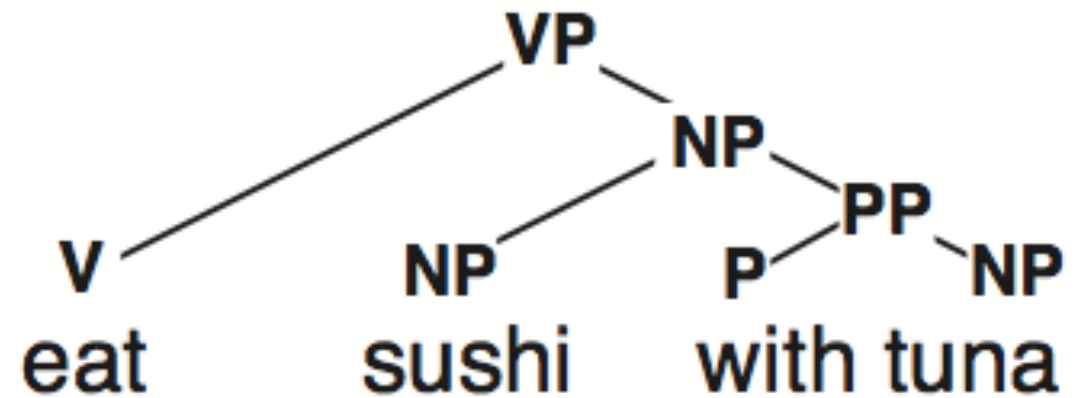
pre-terminals

terminals

- **N**  $\rightarrow$  {*sushi*, *tuna*}
- **P**  $\rightarrow$  {*with*}
- **V**  $\rightarrow$  {*eat*}

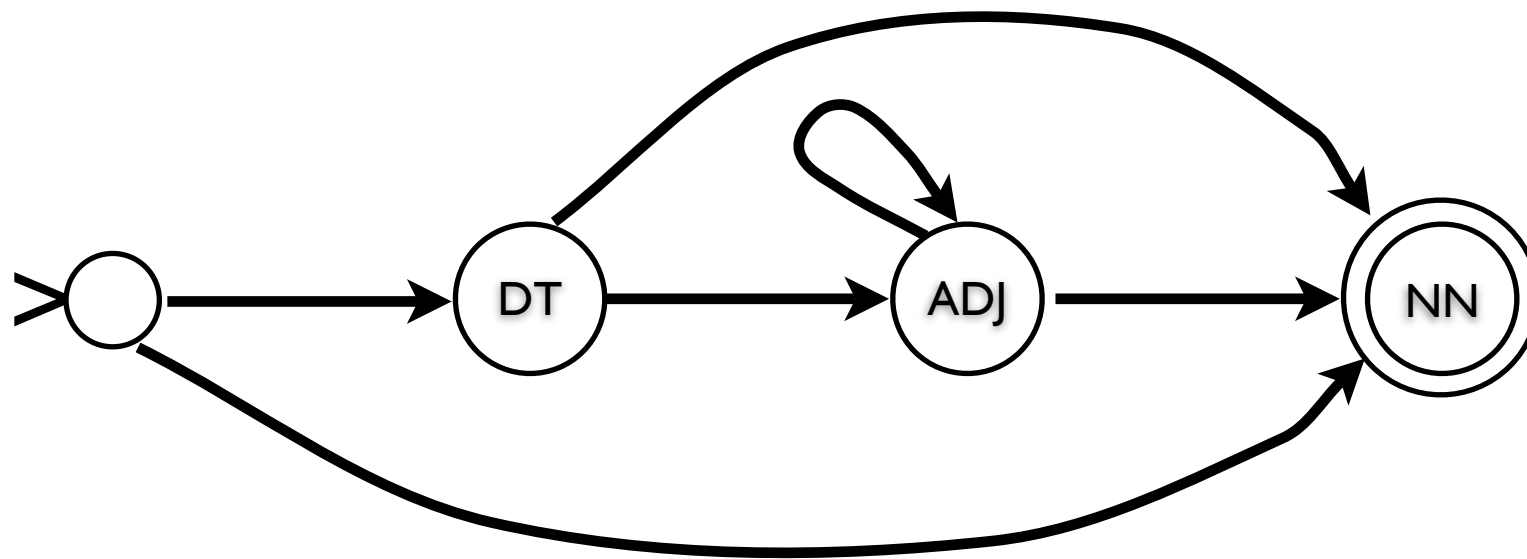
- **NP**  $\rightarrow$  **N**
- **NP**  $\rightarrow$  **NP PP**
- **PP**  $\rightarrow$  **P NP**
- **VP**  $\rightarrow$  **V NP**
- **VP**  $\rightarrow$  **VP PP**

non-terminals



# Grammaticality

- a sentence is grammatical if there is an acceptor for it



# Generate from CFGs

```
initialize stack with S
while stack not empty:
    x = stack.pop()
    if x  $\in$  terminals:
        print x
    else if x  $\in$  rule:
        stack.push(y in RHS for selected x  $\rightarrow$  RHS)
```

# Parsing

- find a path b/w root node S and terminals
- recursively apply CFG rules
- glorified search
- options:
  - direction: top-down, bottom-up
  - expansion: breadth-first, depth-first, bidirectional

# Probabilistic parsing

- some rules are more likely than others:  
N  $\rightarrow$  dog, 0.9  
V  $\rightarrow$  dog, 0.1
- use probabilities to decide best path



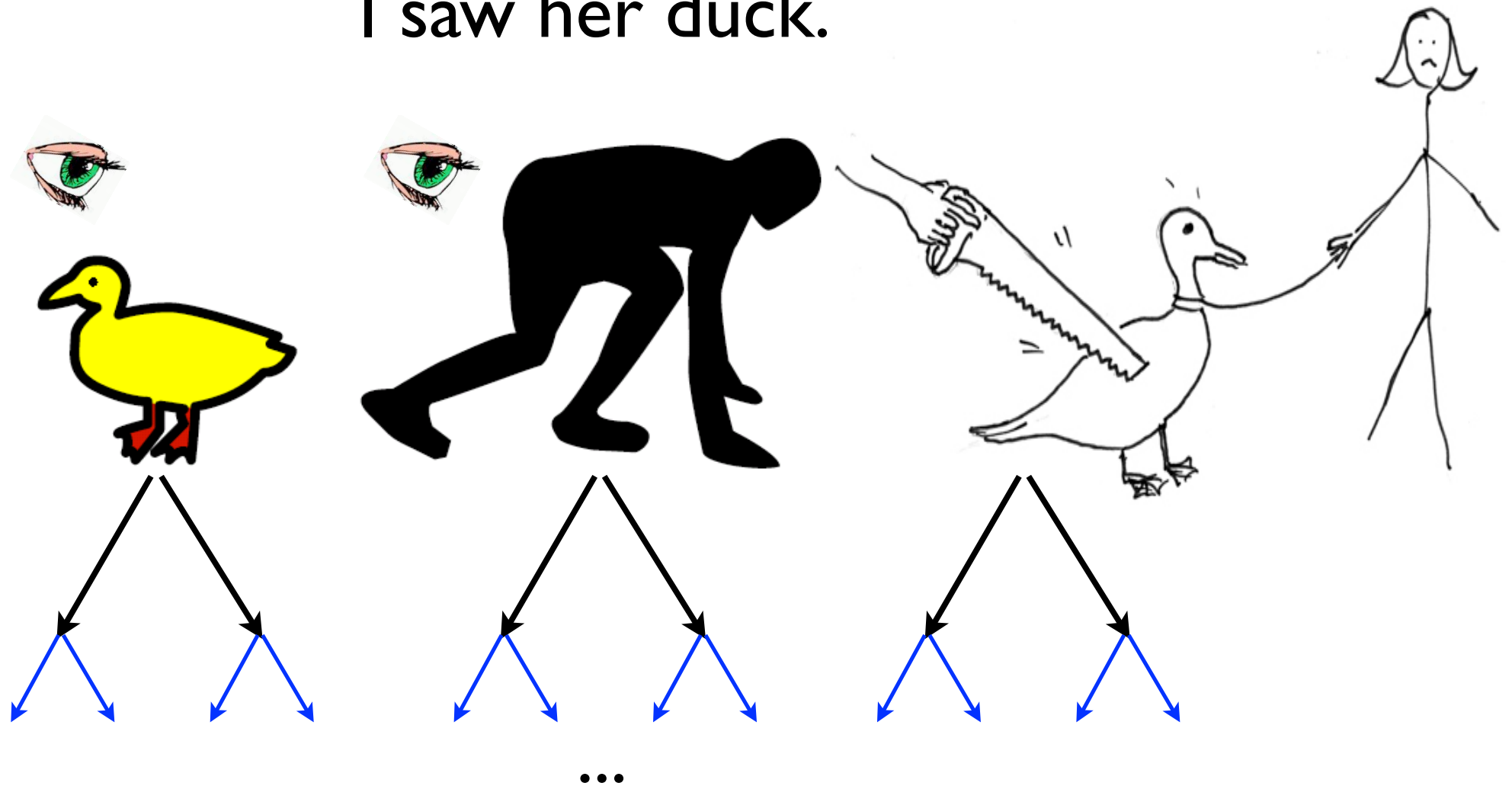
# Playtime

- Given the following CFG, how many parses exists for *the rose rose rose*?

- $S \rightarrow NP$
- $S \rightarrow NP VP$
- $NP \rightarrow DT NP2$
- $NP2 \rightarrow JJ NP2$
- $NP2 \rightarrow N N$
- $NP2 \rightarrow N$
- $VP \rightarrow V$
- $V \rightarrow \text{rose}$
- $N \rightarrow \text{rose}$
- $JJ \rightarrow \text{rose}$

# Ambiguity Explosion by Recursion

I saw her duck.



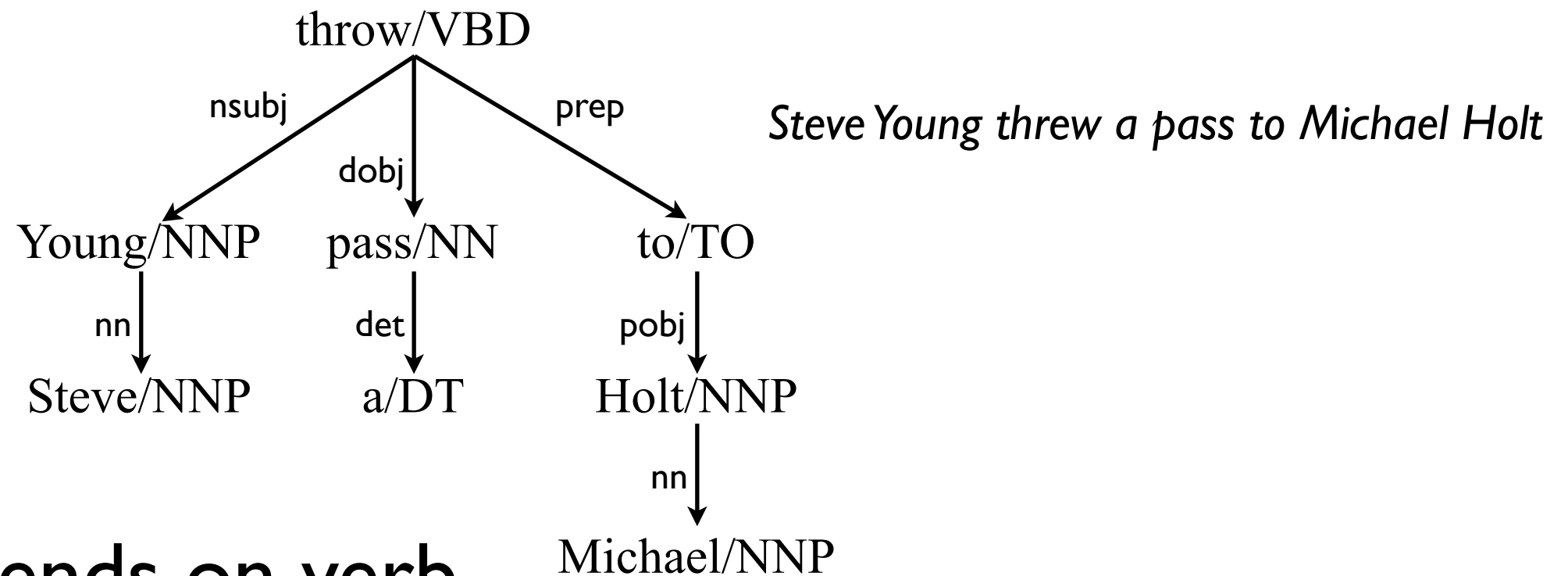
- how about...
  - I saw her duck with a telescope.
  - I saw her duck with a telescope in the garden...

# Why do we care?

- parsing first step for most NLP tasks (MT, IE, IR, etc.)
- disambiguate
- find certain structures (noun phrases = chunking)
- find syntactically related words

# Other parsing

- dependency parsing: instead of constituents, find grammatical relations



- depends on verb
- adds information
- less readable

# Chomsky Hierarchy

	<b>Language</b>	<b>Automata</b>	<b>Parsing complexity</b>	<b>Dependencies</b>
Type 3	Regular	Finite-state	linear	adjacent words
Type 2	Context-Free	Pushdown	cubic	nested
Type 1	Context-sensitive	Linear Bounded	exponential	
Type 0	Recursively Enumerable	Turing machine		

computer science and linguistics share the same mathematical foundations.

# In sum: Syntax

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- syntax = study of word order

*I fart [in your general direction]  
[on Sundays]  
[with pleasure]*

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- sentences consist of phrases (constituents)



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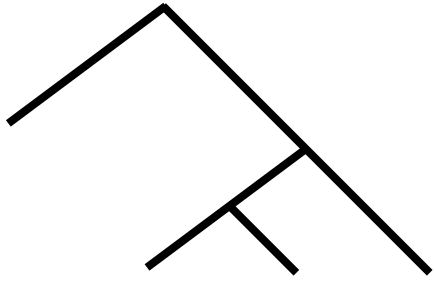
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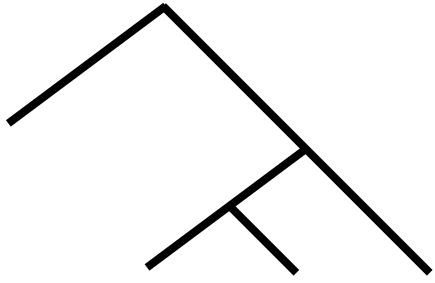
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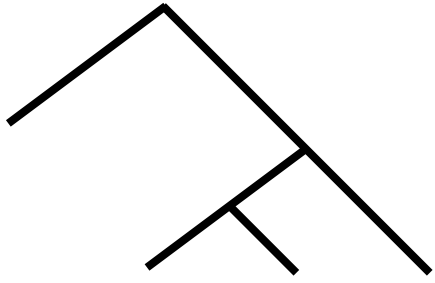
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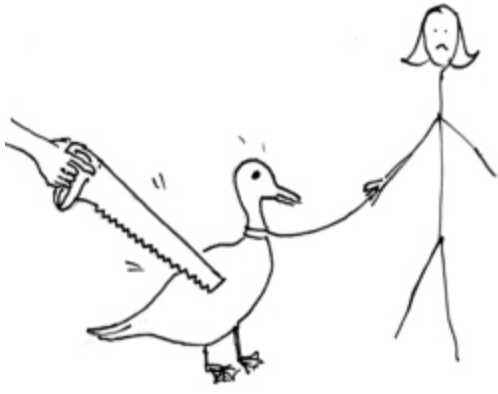
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- different strategies for search



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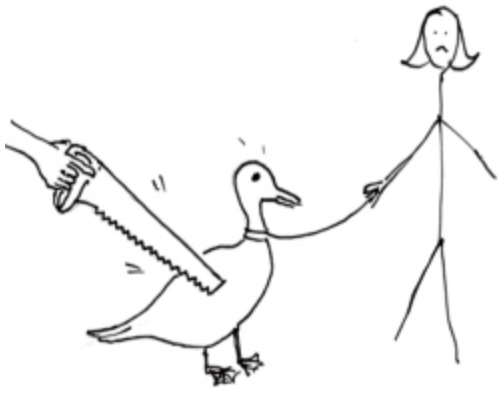
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- different strategies for search
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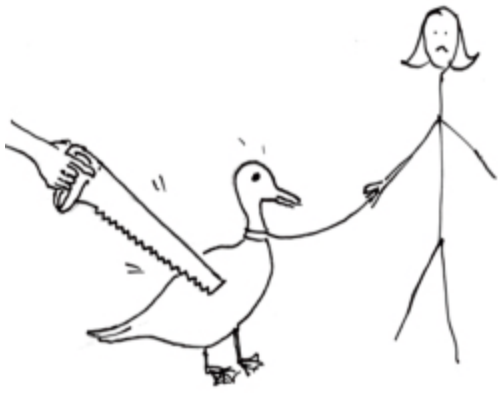
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- language is ambiguous
- parse trees are unambiguous



# In sum: Parsing

- parsers find rule structure of sentence
- different strategies for search
- path b/w root and terminals
- language is ambiguous
- parse trees are unambiguous
- used to find structure, constituents, disambiguate words

# If you learned nothing else:

- $S \rightarrow NP VP$
- parsing is search

**ask now or enjoy your afternoon...**