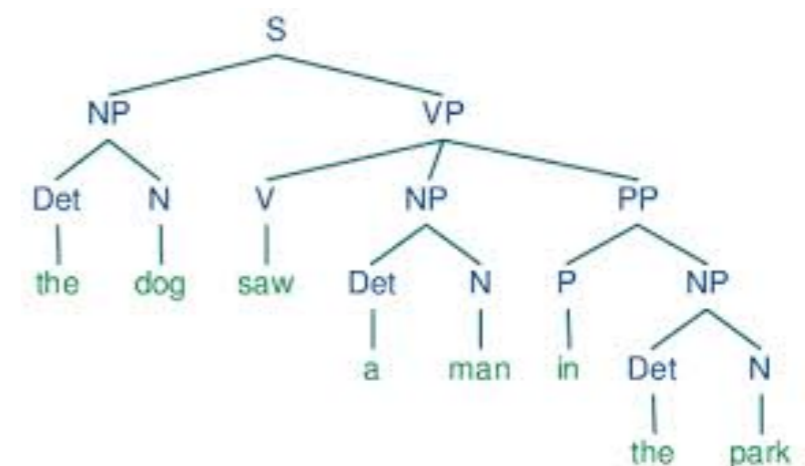


Context-free Grammars

COMP90042 LECTURE 17



THE UNIVERSITY OF
MELBOURNE



Syntactic Constituents

- Sequential models like HMMs (regular grammars, etc) assume a linear structure
- But language clearly isn't like that

[*A man*] [*saw* [*a dog*] [*in* [*the park*]]]

- Words group together to form syntactic constituents
 - * Can be replaced, or moved around *as a unit*
- Grammars allow us to formalize these intuitions
 - * Symbols correspond to syntactic constituents

Testing for constituency

- Various tests for constituency, based on linguistic intuition, e.g.,

- * *Only constituents can answer a question*

Trevor gave a lecture on grammar

Who gave the lecture on grammar?

Trevor

Trevor did what with the lecture on grammar?

*gave (fails)

What topic was Trevor's lecture on?

on grammar

- * *Only constituents can be coordinated with others (of same type)*

Trevor gave a lecture on grammar and on parsing

Trevor gave a lecture on grammar and parsing

Trevor gave a lecture on grammar and a treatise on parsing

Trevor gave a lecture on grammar and ate a tasty pie

#Trevor gave a lecture on grammar and away a tasty pie

#Trevor gave a lecture on and a treatise about grammar

Outline

- The context-free grammar formalism
- Parsing with CFGs
- Representing English with CFGs

Basics of Context-free grammars

- **Symbols**

- * **Terminal:** word such as *book*
- * **Non-terminal:** syntactic label such as NP or NN
- * Convention to use upper and lower-case to distinguish, or else “quotes” for terminals

- **Productions (rules)**

$$W \rightarrow X Y Z$$

- * Exactly one non-terminal on left-hand side (LHS)
- * An ordered list of symbols on right-hand side (RHS)
 - can be **Terminals** or **Non-terminals**

Regular expressions as CFGs

- Regular expressions match simple patterns
 - * E.g., $[A-Z][a-z]^*$ words starting with a capital
- Can rewrite as a grammar (“regular grammar”)
 - * $S \rightarrow U \quad S \rightarrow U LS$
 - * $U \rightarrow \text{“A”} \quad U \rightarrow \text{“B”} \quad \dots \quad U \rightarrow \text{“Z”}$
 - * $LS \rightarrow L \quad LS \rightarrow L LS$
 - * $L \rightarrow \text{“a”} \quad L \rightarrow \text{“b”} \quad \dots \quad L \rightarrow \text{“z”}$
- The class of regular languages is a subset of the **context-free languages**, which are specified using a CFG

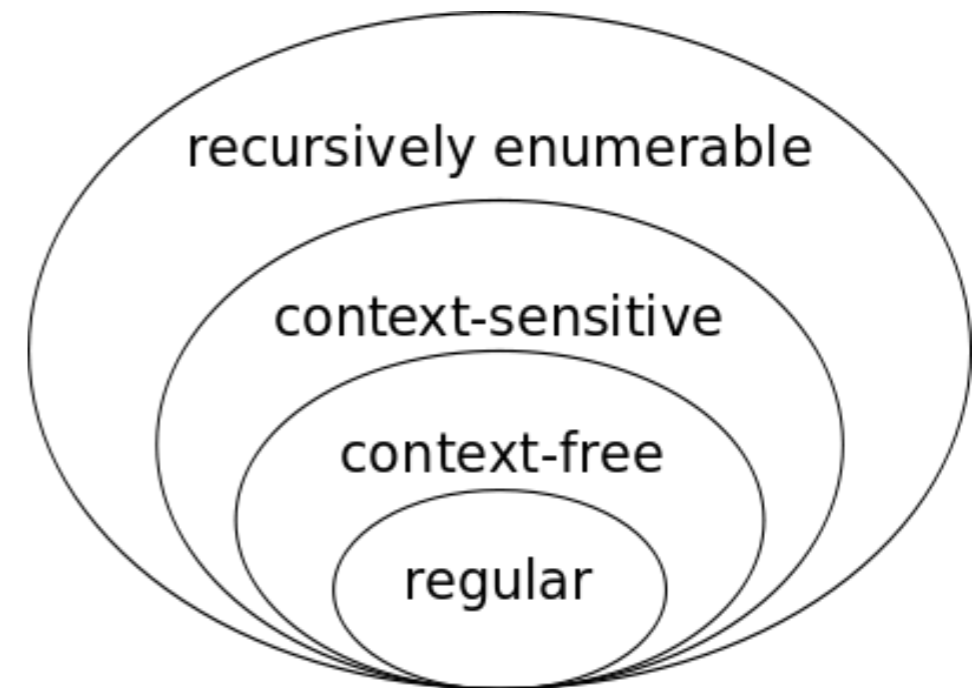
CFGs vs regular grammars

- CFGs (and regexs) used to describe a set of strings, aka a “*language*”
- Regular grammars
 - * describe a smaller class of languages
 - * can be parsed using finite state machines (FSA, FST)
- CFGs
 - * can describe hierarchical groupings
 - * requires more complex automata to parse (PDA)
- Context sensitive grammars are even more expressive (and intractable)

Chomsky hierarchy

- CF languages *more general* than RLs

- * Allows representation of recursive nesting



- Adequate for most constructions in natural language
 - * but **not** e.g., cross-serial dependencies in Swiss-German

Swiss-German:

...de Karl d'Maria em Peter de Hans laat halfe larne schwume

English:

...Charles lets Mary help Peter to teach John to Swim

A simple CF grammar

Terminal symbols: *rat, the, ate, cheese*

Non-terminal symbols: S, NP, VP, DT, VBD, NN

Productions:

$S \rightarrow NP VP$

$NP \rightarrow DT NN$

$VP \rightarrow VBD NP$

$DT \rightarrow the$

$NN \rightarrow rat$

$NN \rightarrow cheese$

$VBD \rightarrow ate$

Generating sentences with CFGs

Always start with S (the sentence/start symbol)

S

Apply a rule with S on LHS ($S \rightarrow NP VP$), i.e substitute RHS

NP VP

Apply a rule with NP on LHS ($NP \rightarrow DT NN$)

DT NN VP

Apply rule with DT on LHS ($DT \rightarrow the$)

***the* NN VP**

Apply rule with NN on LHS ($NN \rightarrow rat$)

***the rat* VP**

In each step we
rewrite the left-most
non-terminal

Generating sentences with CFGs

Apply rule with VP on LHS ($VP \rightarrow VBD\ NP$)

the rat VBD NP

Apply rule with VBD on LHS ($VBD \rightarrow ate$)

the rat ate NP

Apply rule with NP on LHS ($NP \rightarrow DT\ NN$)

the rat ate DT NN


Apply rule with DT on LHS ($DT \rightarrow the$)

the rat ate the NN

Apply rule with NN on LHS ($NN \rightarrow cheese$)

the rat ate the cheese

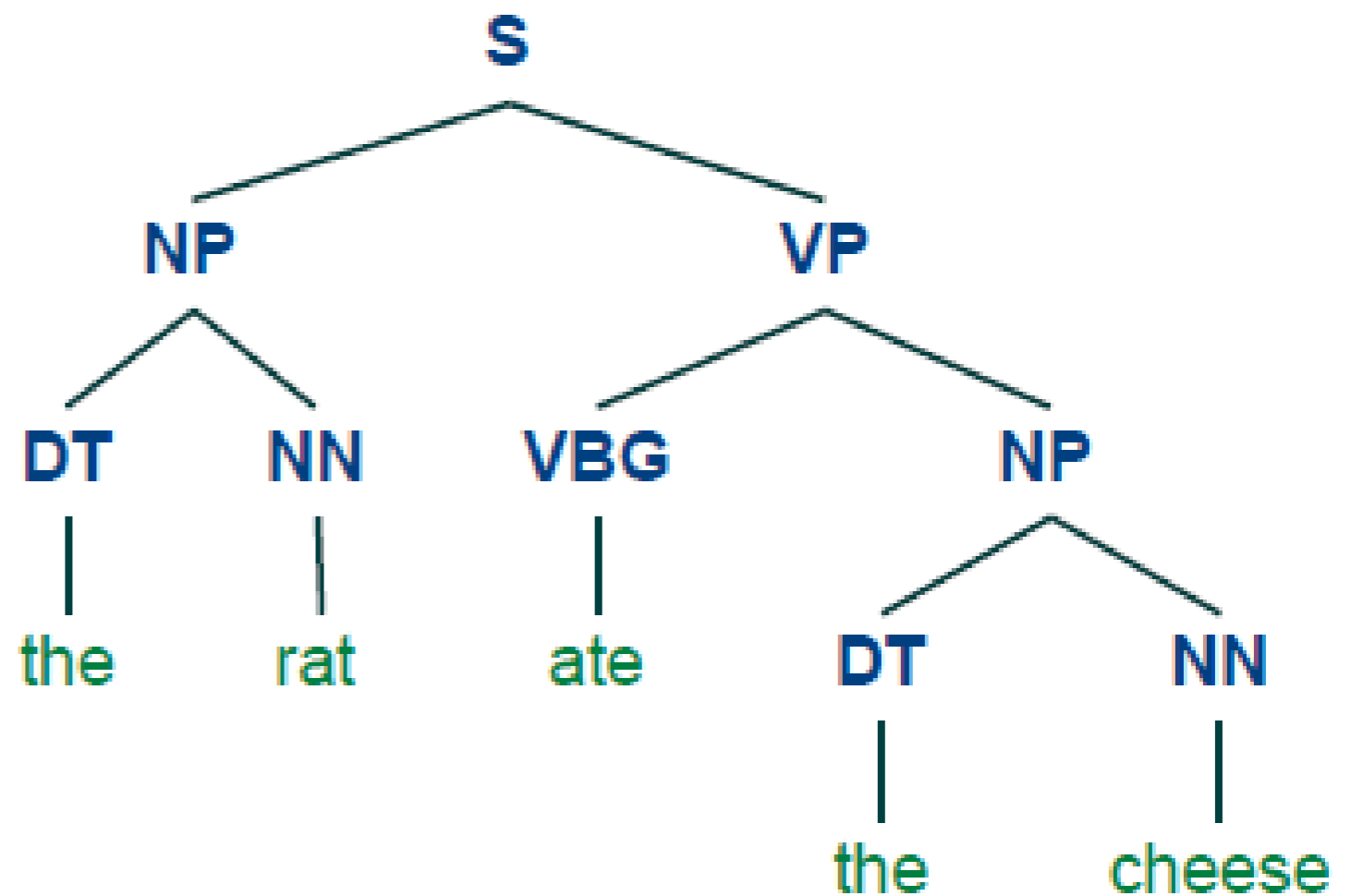
No non-terminals
left, we're done!



CFG trees

- Generation corresponds to a syntactic tree
- Non-terminals are internal nodes
- Terminals are leaves

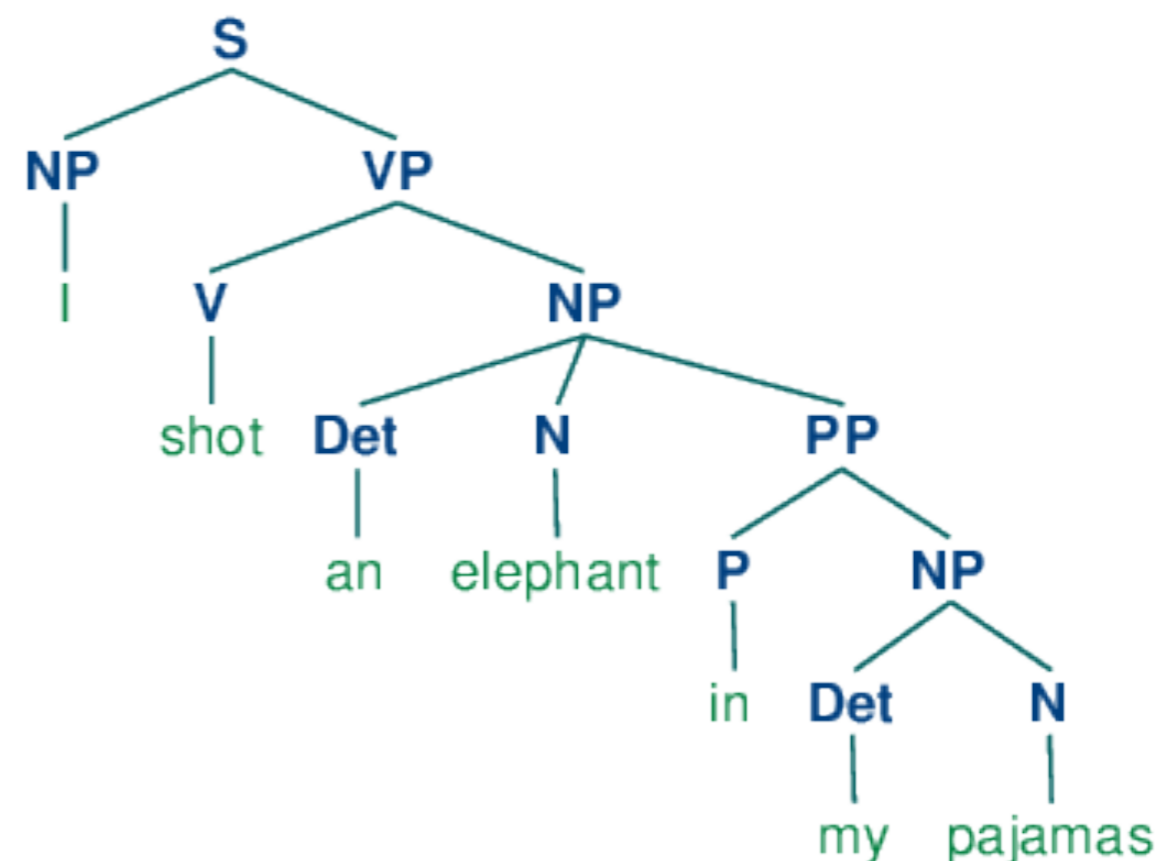
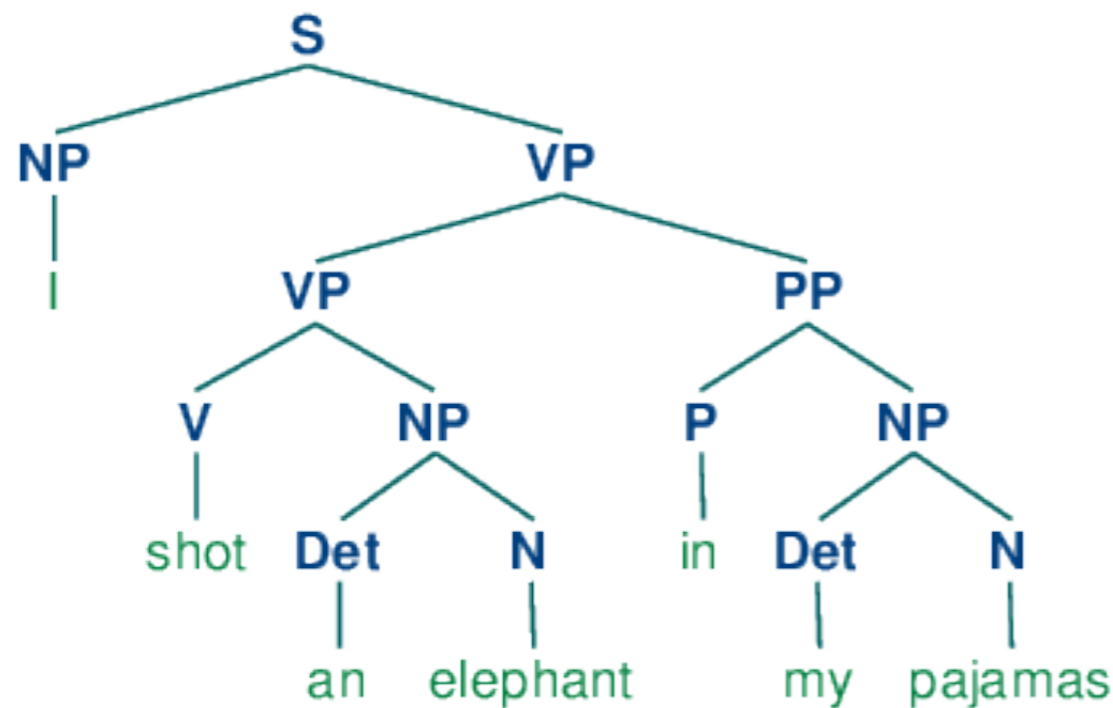
(S (NP (DT the)
 (NN rat))
 (VP (VBG ate)
 (NP (DT the)
 (NN cheese))))))



- Parsing is the *reverse* process

Parse Ambiguity

- Often more than one tree can describe a string
- *“While hunting in Africa, I shot an elephant in my pajamas. How he got into my pajamas, I don't know.”*
Animal Crackers (1930)



Example & figures: <http://www.nltk.org/book/ch08.html>

Parsing CFGs

- Parsing: given string, identify possible structures
- Brute force search is intractable for non-trivial grammars
 - * Good solutions use dynamic programming
- Two general strategies
 - * Bottom-up
 - Start with words, work up towards S
 - CYK parsing
 - * Top-down
 - Start with S, work down towards words
 - Earley parsing (not covered)

The CYK parsing algorithm

- Convert grammar to Chomsky Normal Form (CNF)
- Fill in a parse table
- Use table to derive parse
- Convert result back to original grammar

Convert to Chomsky Normal Form

- Change grammar so all rules of form
$$A \rightarrow B C \text{ or } A \rightarrow a$$
- Step 1: Convert rules of form
$$A \rightarrow B c$$
 into pair of rules $A \rightarrow B X, X \rightarrow c$
 - * Not usually necessary in POS-based grammars
- Step 2: Convert rules $A \rightarrow B C D$ into $A \rightarrow B Y, Y \rightarrow C D$
 - * Usually necessary, but not for our toy grammar
 - * E.g., $VP \rightarrow VP NP NP$
for ditransitive cases, “*sold [her] [the book]*”
- X, Y are new symbols we have introduced

CNF (cont)

- CNF disallows unary rules, $A \rightarrow B$. Why?
- Imagine $NP \rightarrow S$; and $S \rightarrow NP$... leads to infinitely many trees with same yield.
- If no cycles, can transform grammar, e.g.,
 - * if $A \rightarrow B$ and $B \rightarrow c$ and $B \rightarrow d$ then make new non-terminal Z , with rules $Z \rightarrow c$ and $Z \rightarrow d$; all instances of A in RHS of other rules now also support Z .
 - * common occurrence in formal grammars, e.g., $NP \rightarrow NN$, $VP \rightarrow VB$, where NN and VB are pre-terminals (POS tags), and only rewrite as strings

CYK algorithm

```

function CKY-PARSE(words, grammar) returns table

for  $j \leftarrow$  from 1 to LENGTH(words) do
  for all  $\{A \mid A \rightarrow \text{words}[j] \in \text{grammar}\}$ 
     $\text{table}[j-1, j] \leftarrow \text{table}[j-1, j] \cup A$ 
  for  $i \leftarrow$  from  $j-2$  downto 0 do
    for  $k \leftarrow i+1$  to  $j-1$  do
      for all  $\{A \mid A \rightarrow BC \in \text{grammar} \text{ and } B \in \text{table}[i, k] \text{ and } C \in \text{table}[k, j]\}$ 
         $\text{table}[i, j] \leftarrow \text{table}[i, j] \cup A$ 

```

Figure 12.5 The CKY algorithm.

- What role do i , j and k play?
- Why does this need CNF grammar?
- How to use table for checking acceptance? Finding tree?

	<i>the</i>	<i>rat</i>	<i>ate</i>	<i>the</i>	<i>cheese</i>
	DT [0,1]	NP [0,2]	[0,3]	[0,4]	S [0,5]
		NN [1,2]	[1,3]	[1,4]	[1,5]
			VBD [2,3]	[2,4]	VP [2,5]
				DT [3,4]	NP [3,5]
					NN [4,5]

$S \rightarrow NP VP$
 $NP \rightarrow DT NN$
 $VP \rightarrow VBD NP$
 $DT \rightarrow the$
 $NN \rightarrow rat$
 $NN \rightarrow cheese$
 $VBD \rightarrow ate$

CYK by example

CYK: Retrieving The parses

- S in the top-left corner of parse table indicates success
- To get parse(s), follow pointers back for each match
- Convert back from CNF by transforming new non-terminals back to their original values
 - * E.g., if $VP \rightarrow VP NP NP$ was changed to $VP \rightarrow VP NP+NP$; $NP+NP \rightarrow NP NP$
 - * If we have the latter two productions in tree, transform tree back to top production

	<i>the</i>	<i>rat</i>	<i>ate</i>	<i>the</i>	<i>cheese</i>
DT [0,1]	NP Split = 1; NP → DT NN [0,2]				S Split = 2; S → NP VP [0,5]
	NN [1,2]				
		VBD [2,3]			VP Split = 3; VP → VBD NP [2,5]
			DT [3,4]		NP Split = 4; NP → DT NN [3,5]
					NN [4,5]

S → NP VP
 NP → DT NN
 VP → VBD NP
 DT → *the*
 NN → *rat*
 NN → *cheese*
 VBD → *ate*

Parse table with backpointers

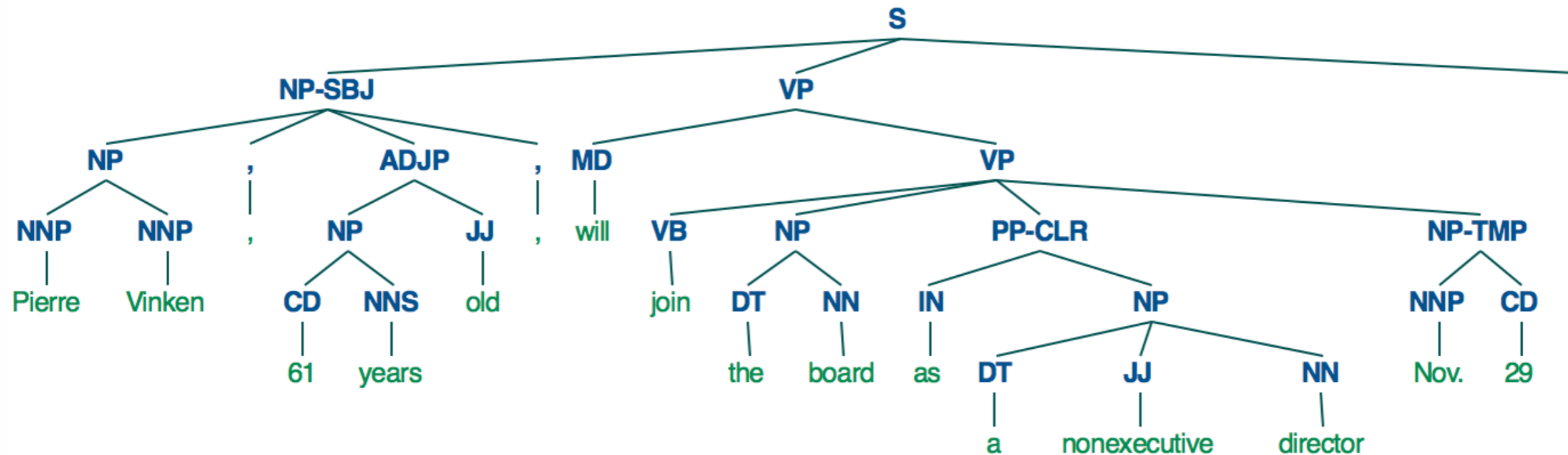
From Toy Grammars to Real Grammars

- Toy grammars with handful of productions good for demonstration or extremely limited domains
- For real texts, we need real grammars
- Many thousands of production rules

Key Constituents in Penn Treebank

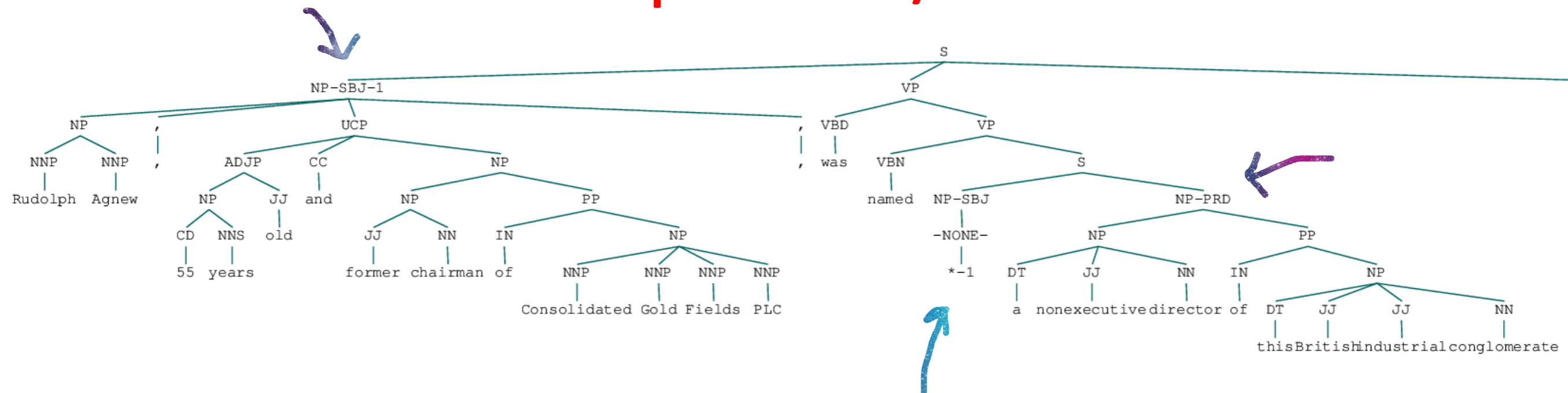
- Sentence (S)
- Noun phrase (NP)
- Verb phrase (VP)
- Prepositional phrase (PP)
- Adjective phrase (AdjP)
- Adverbial phrase (AdvP)
- Subordinate clause (SBAR)

Example PTB/0001



```
( (S
  (NP-SBJ
    (NP (NNP Pierre) (NNP Vinken) )
    ( , , )
    (ADJP
      (NP (CD 61) (NNS years) )
      (JJ old) )
    ( , , ) )
  (VP (MD will)
    (VP (VB join)
      (NP (DT the) (NN board) )
      (PP-CLR (IN as)
        (NP (DT a) (JJ nonexecutive) (NN director) ))
      (NP-TMP (NNP Nov.) (CD 29) )))
  ( . . ) ))
```


Example PTB/0001



- Some parts of PTB trees are often discarded
 - * **grammatical roles:** SBJ = subject, PRD = predicate
 - * **traces:** In NP-SBJ-1, the "1" is an index, referenced from the *-1 terminal — i.e., the "naming" refers to Rudolf Agnew
- And some structure is added to NPs, which are flat

Basic English Sentence structures

- Declarative sentences ($S \rightarrow NP VP$)
 - * *The rat ate the cheese*
- Imperative sentences ($S \rightarrow VP$)
 - * *Eat the cheese!*
- Yes/no questions ($S \rightarrow VB NP VP$)
 - * *Did the rat eat the cheese?*
- *Wh*-subject-questions ($S \rightarrow WH VP$)
 - * *Who ate the cheese?*
- *Wh*-object-questions ($S \rightarrow WH VB NP VP$)
 - * *What did the rat eat?*

English Noun phrases

- Pre-modifiers
 - * DT, CD, ADJP, NNP, NN
 - * E.g. *the two very best Philly cheese steaks*
- Post-modifiers
 - * PP, VP, SBAR
 - * A delivery *from Bob coming today that I don't want to miss*

NP → DT? CD? ADJP? (NN | NNP)+ PP* VP? SBAR?

NP → PRP

Verb Phrases

- Auxiliaries

- * MD, AdvP, VB, TO

- * E.g. *should really have tried to wait*

VP → (MD | VB | TO) AdvP? VP

- Arguments and adjuncts

- * NP, PP, SBAR, VP, AdvP

- * E.g. *told him yesterday that I was ready*

- * E.g. *gave John a gift for his birthday to make amends*

VP → VB NP? NP? PP* AdvP* VP? SBAR?

Other Constituents

- Prepositional phrase
 - * PP \rightarrow IN NP *in the house*
- Adjective phrase
 - * AdjP \rightarrow (AdvP) JJ *really nice*
- Adverb phrase
 - * AdvP \rightarrow (AdvP) RB *not too well*
- Subordinate clause
 - * SBAR \rightarrow (IN) S *since I came here*
- Coordination
 - * NP \rightarrow NP CC NP; VP \rightarrow VP CC VP; etc. *Jack and Jill*
- Complex sentences
 - * S \rightarrow S SBAR; S \rightarrow SBAR , S; etc. *if he goes, I'll go*

A final word

- Context-free grammars can represent linguistic structure
- There are relatively fast dynamic programming algorithms to retrieve this structure
- But what about ambiguity?
 - * Extreme ambiguity will slow down parsing
 - * If multiple possible parses, which is best?

Required Reading

- J&M3 Ch. 10.1-10.3, 10.5, Ch. 11.1-11.2