Introduction to Syntax

CS 585, Fall 2018 Introduction to Natural Language Processing <u>http://people.cs.umass.edu/~miyyer/cs585/</u>

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(Slides and Lecture by Tu Vu)

some slides adapted from Michael Collins, Marine Carpuat, Wei Xu, and Rebecca Hwa 10/16/18

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A Reminder!

- Project proposal
 - due on October 19, 2018 (this Friday) at 11:59 PM
- Midterm
 - will be held in this room on October 25, 2018 (next Thursday)
 - will cover text classification, word representations, language modeling, sequence labeling, and machine translation
 - will **not** cover today's lecture and next lectures
 - 20% multiple choice, 80% short answer/computational questions
 - 1-page "cheat sheet" allowed, must be hand-written
- Reading for the next lecture
 - JM 12

Overview

- > An Introduction to Syntax
- Constituency
- Context-Free Grammars (CFGs)
- English Grammar in a Nutshell

Overview

> An Introduction to Syntax

- Syntax
- Syntax and Grammar
- Syntax vs. Semantics
- Syntax in NLP applications
- Syntactic Structure
- Constituency
- Context-Free Grammars (CFGs)
- English Grammar in a Nutshell

Syntax

- Sýntaxis (setting out together or arrangement)
 - The ordering of words and how they group into phrases



Syntax

- Sýntaxis (setting out together or arrangement)
 - The ordering of words and how they group into phrases



- [[students][[cook and serve][grandparents]]]
- [[students][[cook][and][serve grandparents]]]

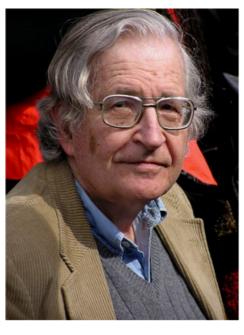
Syntax and Grammar

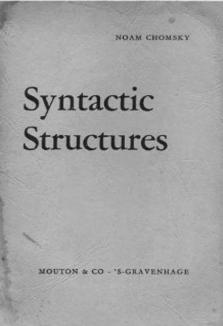
- Goal of syntactic theory
 - "explain how people combine words to form sentences and how children attain knowledge of sentence structure"
- Grammar
 - implicit knowledge of a native speaker
 - acquired without explicit instruction
 - minimally able to generate all and only the possible sentences of the language

Syntax vs. Semantics

"Colorless green ideas sleep furiously." — Noam Chomsky (1957)

Contrast with: "sleep green furiously ideas colorless"





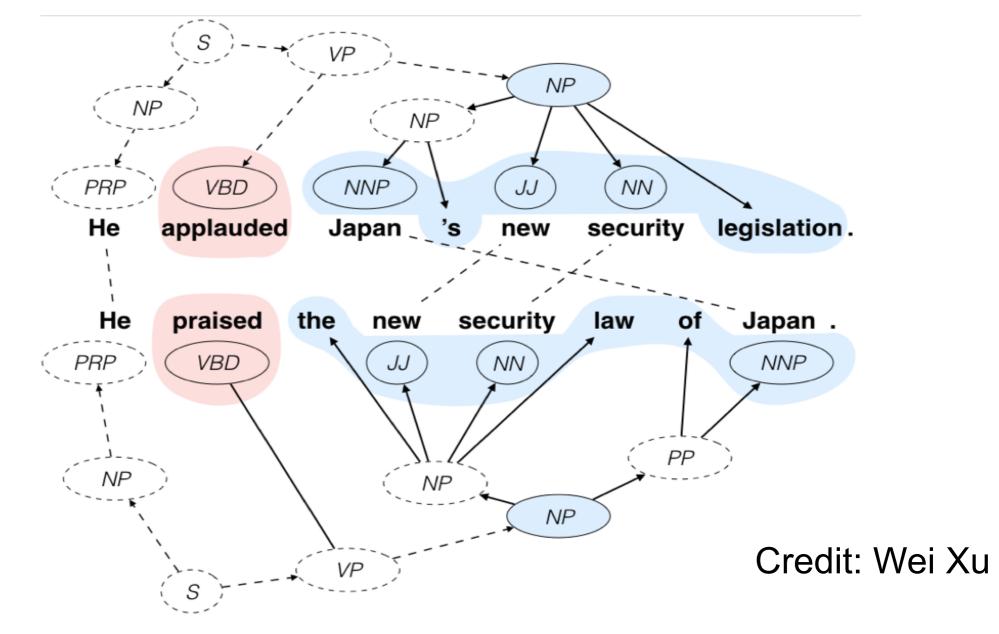
Syntax in NLP application

- Syntactic analysis is often a key component in many applications
 - Grammar checkers
 - Dialogue systems
 - Question answering
 - Information extraction
 - Machine translation
 - •

An Example: Machine Translation

- English word order is
 - subject verb object
- Japanese word order is
 - *subject object verb*
 - English: IBM bought Lotus
 - Japanese: IBM Lotus bought
 - English:Sources said that IBM bought Lotus yesterdayJapanese:Sources yesterday IBM Lotus bought that said

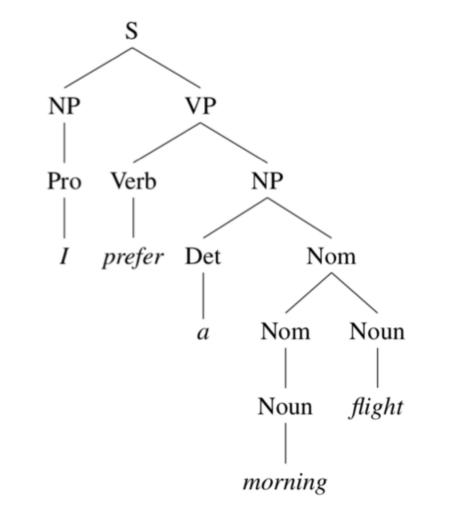
Another Example: Paraphrasing



Lexical	[VBD]	$applauded \rightarrow praised$
Syntactic	[NP]	NNP 's JJ legislation \rightarrow the JJ law of NNP

Syntactic Structure

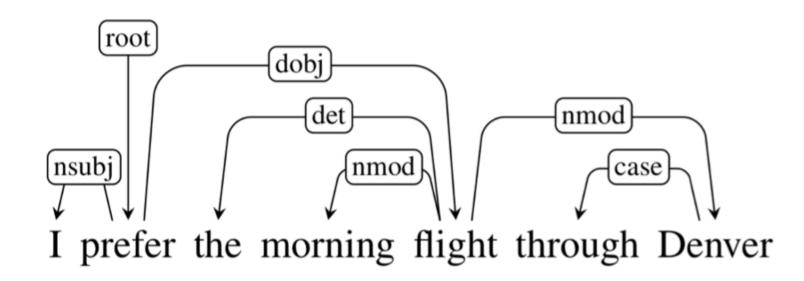
- Constituency (phrase structure)
 - Phrase structure organizes words in nested constituents



[S [NP [Pro I]] [VP [V prefer] [NP [Det a] [Nom [N morning] [Nom [N flight]]]]]

Syntactic Structure (cont.)

- Dependency structure
 - Shows which words depend on (modify or are arguments of) which on other words



Overview

An Introduction to Syntax

Constituency

- Constituency
- Grammars and Constituency

Context-Free Grammars (CFGs)
 English Grammar in a Nutshell

Constituency

- Basic idea
 - Groups of words behaving as single units, or constituents
- Constituents form coherent classes that behave similarly
 - With respect to their internal structure: e.g., at the core of a noun phrase is a noun
 - With respect to other constituents: e.g., noun phrases generally occur before verbs

- Examples
 - Noun phrases

Harry the Horse	a high-class spot such as Mindy's
the Broadway coppers	the reason he comes into the Hot Box
they	three parties from Brooklyn

• Prepositional phrases on September seventeenth

- Examples
 - Noun phrases

Harry the Horse	a high-class spot such as Mindy's
the Broadway coppers	the reason he comes into the Hot Box
they	three parties from Brooklyn

• Prepositional phrases on September seventeenth

What evidence do we have that these groups of words behave as single units (or "form constituents")?

- One piece of evidence
 - They can all appear in similar syntactic environments, e.g., before a verb

three parties from Brooklyn *arrive*... a high-class spot such as Mindy's *attracts*... the Broadway coppers *love*... they *sit*

- One piece of evidence
 - They can all appear in similar syntactic environments, e.g., before a verb

three parties from Brooklyn *arrive*... a high-class spot such as Mindy's *attracts*... the Broadway coppers *love*... they *sit*

• This is true for the entire phrase but not true of each of the individual words that make up the phrase

*from arrive... *as attracts...
*the is... *spot sat...

(*) marks fragments that are not grammatical English sentences

- Another piece of evidence
 - They can be placed in a number of different locations, e.g., at the beginning (preposed) or at the end (postposed) of a sentence

On September seventeenth, I'd like to fly from Atlanta to Denver I'd like to fly *on September seventeenth* from Atlanta to Denver I'd like to fly from Atlanta to Denver *on September seventeenth*

- Another piece of evidence
 - They can be placed in a number of different locations, e.g., at the beginning (preposed) or at the end (postposed) of a sentence

On September seventeenth, I'd like to fly from Atlanta to Denver I'd like to fly *on September seventeenth* from Atlanta to Denver I'd like to fly from Atlanta to Denver *on September seventeenth*

 Again, the entire phrase can be placed differently, but the individual words that make up the phrase cannot be

*On September, I'd like to fly <u>seventeenth</u> from Atlanta to Denver *On I'd like to fly <u>September seventeenth</u> from Atlanta to Denver *I'd like to fly on September from Atlanta to Denver <u>seventeenth</u>

Grammars and Constituency

- For a particular language:
 - What are the "right" set of constituents?
 - What rules govern how they combine?

Grammars and Constituency (cont.)

- For a particular language:
 - What are the "right" set of constituents?
 - What rules govern how they combine?
- Answer: not obvious and difficult
 - A significant part of developing a grammar involves discovering the inventory of constituents present in the language
 - That's why there are many different theories of grammar and competing analyses of the same data!

Grammars and Constituency (cont.)

- Some standard grammar formalisms:
 - Context-Free Grammar (CFG)
 - Lexical-Functional Grammar (LFG)
 - Head-Driven Phrase Structure Grammar (HPSG),
 - Tree-Adjoining Grammar (TAG),
 - Combinatory Categorial Grammar (CCG)
- While CFG emphasizes phrase-structure rules, the other approaches share the common theme of making better use of the lexicon

Overview

> An Introduction to Syntax

Constituency

- Context-Free Grammars (CFGs)
 - The Chomsky Hierarchy
 - Context-Free Grammars (CFGs)
 - Formal Definition of Context-Free Grammar
 - Syntactic Parsing
 - Examples of ambiguous structures

English Grammar in a Nutshell

The Chomsky Hierarchy

- You've already seen one class of grammars: regular expressions
 - A pattern like ^[a-z][0-9]\$ corresponds to a grammar which accepts (matches) some strings but not others.
- **Q**: Can regular languages define infinite languages?

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 - A pattern like ^[a-z][0-9]\$ corresponds to a grammar which accepts (matches) some strings but not others.
- Q: Can regular languages define infinite languages?
 Yes, e.g. a*

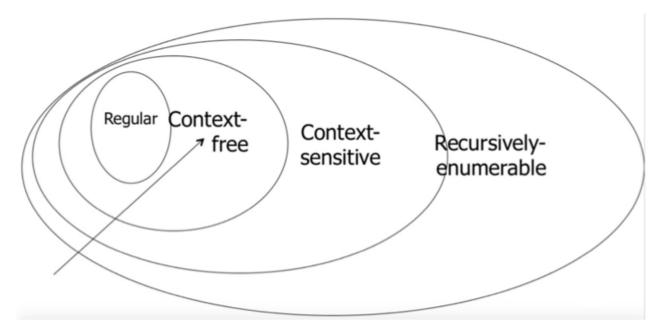
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- **Q**: Can regular languages define arbitrarily complex languages?

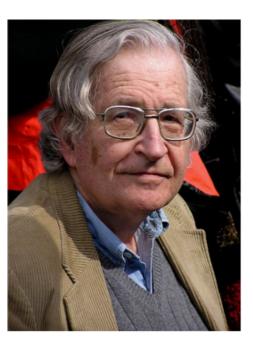
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- Q: Can regular languages define infinite languages?
 Yes, e.g. a*
- **Q**: Can regular languages define arbitrarily complex languages?

No. Cannot match all strings with matched parentheses or in aⁿbⁿ forms in general (recursion/arbitrary nesting).

https://en.wikipedia.org/wiki/Pumping_lemma_for_regular_languages

- Hierarchy of classes of formal languages
 - One grammar is of greater generative power or complexity than another if it can define a language that other cannot define.





• Context-free grammars are more powerful than regular grammars, and can account for much of the syntactic structure of English.

Context-Free Grammars

- Context-Free Grammars (CFGs)
 - Aka Phrase Structure Grammars
 - Aka Backus-Naur Form (BNF)
 - The most widely used formal system for modeling constituent structure in English and other natural languages
 - Good enough for most NLP applications!

The idea of basing a grammar on constituent structure dates back to Wilhelm Wundt (1900) but was not formalized until Chomsky (1956) and, independently, Backus (1959)

- Consist of
 - Rules or productions
 - Terminals
 - Non-terminals

Rules or productions

each rule can express

the ways that symbols of the language can be grouped and ordered together

 $NP \rightarrow Det Nominal$ $NP \rightarrow ProperNoun$ $Nominal \rightarrow Noun \mid Nominal Noun$

• a **lexicon** of words and symbols

$$egin{array}{rcl} Det &
ightarrow a \ Det &
ightarrow the \ Noun &
ightarrow flight \end{array}$$

• Terminals

Words in the language, e.g., "the", "flight"

• Non-terminals

- The constituents in the language, e.g., noun phrases (NP), verb phrases (VP)
- Express abstractions over terminals

• A grammar with examples for each rule

Grammar Rules	Examples
$S \rightarrow NP VP$	I + want a morning flight
$egin{array}{cccc} NP & ightarrow Pronoun \ & & Proper-Noun \ & & Det Nominal \ Nominal & ightarrow Nominal Noun \end{array}$	I Los Angeles a + flight morning + flight
Noun	flights
VP → Verb Verb NP Verb NP PP Verb PP	do want + a flight leave + Boston + in the morning leaving + on Thursday
$PP \rightarrow Preposition NP$	from + Los Angeles

"|" indicates that a non-terminal has alternate possible expansions

• A lexicon

"|" indicates that a non-terminal has alternate possible expansions

- The form of a context-free rule $A \rightarrow \beta$
 - β is an ordered list of one or more terminals and nonterminals
 - A is a single non-terminal symbol expressing some cluster or generalization.
 - In the lexicon, β is a word and A is its lexical category, or POS
- Two view of a CFG
 - As a device for generating sentences
 - As a device for assigning a structure to a given sentence

Context-Free Grammars (cont.)

- CFG as a generator
 - We can read the rule $A \rightarrow \beta$ as "rewrite the symbol A on the left with string of symbols in β on the right".

An example

Rule expansions Rules used

Grammar Rules $S \rightarrow NP VP$ $NP \rightarrow Pronoun$ $\mid Proper-Noun$ $\mid Det Nominal$ $\mid Det Nominal$ $Nominal \rightarrow Nominal Noun$ $\mid Noun$ $VP \rightarrow Verb$ $\mid Verb NP$ $\mid Verb NP$ $\mid Verb NP PP$ $\mid Verb PP$ $PP \rightarrow Preposition NP$

$Noun \rightarrow$	flight breeze trip morning
$Verb \rightarrow$	is prefer like need want fly
$Adjective \rightarrow$	cheapest non-stop first latest
	other direct
$Pronoun \rightarrow$	$me \mid I \mid you \mid it$
$\textit{Proper-Noun} \rightarrow$	Alaska Baltimore Los Angeles
	Chicago United American
Determiner ightarrow	the $ a an $ this $ $ these $ $ that
$Preposition \rightarrow$	from to on near
Conjunction \rightarrow	and or but

S

 $S \rightarrow NP VP$

Rule expansions Rules used

Grammar Rules $S \rightarrow NP VP$ $NP \rightarrow Pronoun$ |Proper-Noun|Proper-Noun|Det Nominal $Nominal \rightarrow Nominal Noun$ |Noun $VP \rightarrow Verb$ | $VP \rightarrow Verb$ |Verb NP|Verb NP|Verb PP|Verb PP

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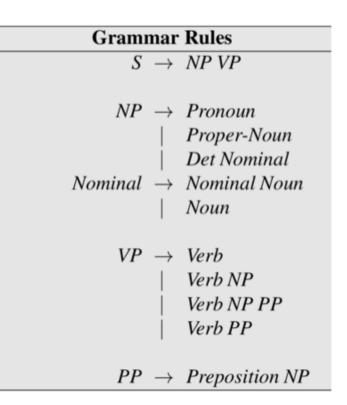
S

Rule expansions Rules used

 $S \rightarrow NP VP$

NP VP

S



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Rule expansions Rules used

Grammar Rules		
$S \rightarrow$	NP VP	
$NP \rightarrow$	Pronoun	
	Proper-Noun	
ĺ	Det Nominal	
Nominal \rightarrow	Nominal Noun	
	Noun	
$VP \rightarrow$	Verb	
	Verb NP	
	Verb NP PP	
	Verb PP	
$PP \rightarrow$	Preposition NP	

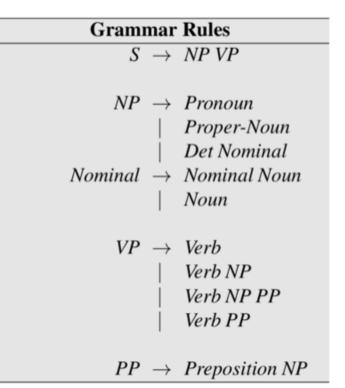
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Rules used Rule expansions

S	$S \rightarrow NP VP$
NP VP	$NP \rightarrow Pro$

NP VP

Pro VP



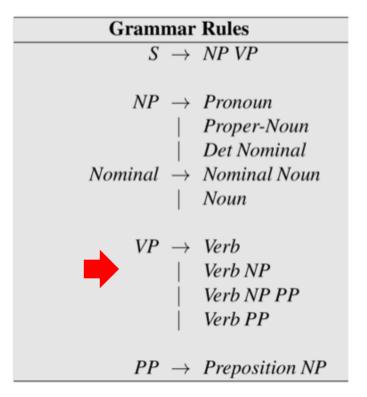
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$Preposition \rightarrow$	from to on near
Conjunction \rightarrow	and or but

Rule expansions Rules used

S	$S \rightarrow NP VP$
NP VP	$NP \rightarrow Pro$

Pro VP

 $VP \rightarrow Verb NP$



Noun $\rightarrow j$	flight breeze trip morning
$Verb \rightarrow r$	is prefer like need want fly
$Adjective \rightarrow d$	cheapest non-stop first latest
	other direct
$Pronoun \rightarrow r$	$me \mid I \mid you \mid it$
Proper-Noun \rightarrow .	Alaska Baltimore Los Angeles
	Chicago United American
$Determiner \rightarrow r$	the $ a an $ this $ $ these $ $ that
Preposition $\rightarrow j$	from to on near
Conjunction \rightarrow	and or but

Rules used Rule expansions

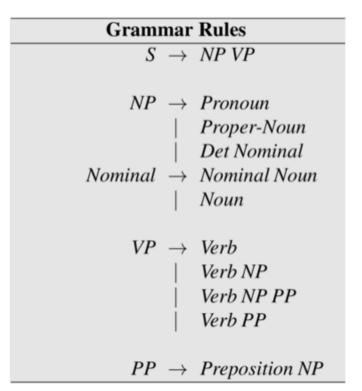
S	$S \rightarrow NP$

NP VP

Pro VP

Pro Verb NP

- VP $NP \rightarrow Pro$
- $VP \rightarrow Verb NP$



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Conjunction \rightarrow	and or but

$S \rightarrow NP VP$
$NP \rightarrow Pro$
$VP \to Verb \ NP$
$Pro \rightarrow I$

$S \rightarrow NP VP$ $NP \rightarrow Pronoun$ Proper-Noun Det Nominal $Nominal \rightarrow Nominal Noun$
Proper-Noun Det Nominal
Proper-Noun Det Nominal
Det Nominal
Nominal \rightarrow Nominal Noun
Noun
$VP \rightarrow Verb$
Verb NP
Verb NP PP
Verb PP
$PP \rightarrow Preposition NP$

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S	$S \rightarrow NP VP$
NP VP	$NP \rightarrow Pro$
Pro VP	$VP \to Verb\;NP$
Pro Verb NP	$Pro \rightarrow I$
/ Verb NP	

Grammar Rules		
S	\rightarrow	NP VP
NP	\rightarrow	Pronoun
		Proper-Noun
		Det Nominal
Nominal	\rightarrow	Nominal Noun
		Noun
VP	\rightarrow	Verb
		Verb NP
		Verb NP PP
		Verb PP
PP	\rightarrow	Preposition NP

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S	$S \rightarrow NP VP$
NP VP	$NP \rightarrow Pro$
Pro VP	$VP \rightarrow Verb NP$
Pro Verb NP	$Pro \to I$
/ Verb NP	$Verb \to prefer$

Grammar Rules			
S	\rightarrow	NP VP	
NP	\rightarrow	Pronoun	
		Proper-Noun	
	ĺ.	Det Nominal	
Nominal	\rightarrow	Nominal Noun	
		Noun	
VP	\rightarrow	Verb	
		Verb NP	
	i	Verb NP PP	
	i	Verb PP	
	'		
PP	\rightarrow	Preposition NP	
		_	

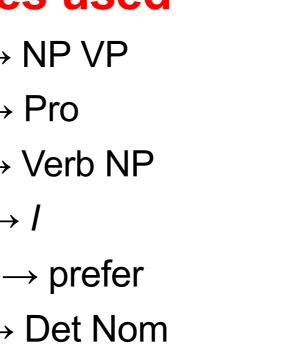
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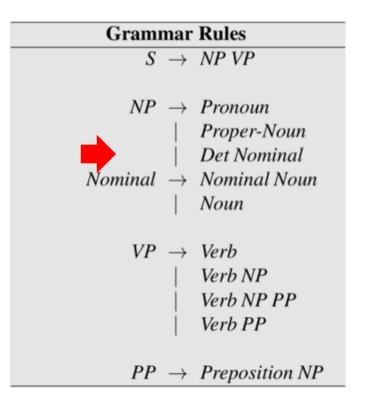
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$NP \rightarrow Pro$
$VP \to Verb\;NP$
$Pro \to I$
$Verb \to prefer$

Gram	mar	Rules
S	\rightarrow	NP VP
NP	\rightarrow	Pronoun
		Proper-Noun
		Det Nominal
Nominal	\rightarrow	Nominal Noun
		Noun
VP	\rightarrow	Verb
		Verb NP
	i	Verb NP PP
	İ	Verb PP
PP	\rightarrow	Preposition NP

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$Conjunction \rightarrow$	and or but

S	$S \rightarrow NPV$
NP VP	$NP \rightarrow Pro$
Pro VP	$VP \to Verb$
Pro Verb NP	$Pro \to I$
/ Verb NP	$Verb \to pre$
<i>I prefer</i> NP	$NP \rightarrow Det N$





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S	$S \rightarrow NP VP$
NP VP	$NP \rightarrow Pro$
Pro VP	$VP \to Verb \; NP$
Pro Verb NP	$Pro \rightarrow I$
/ Verb NP	$Verb \to prefer$
<i>I prefer</i> NP	$NP \to DetNom$

I prefer Det	Nom

Gram	mar Rules
S	$\rightarrow NPVP$
NP	\rightarrow Pronoun
	Proper-Noun
	Det Nominal
Nominal	$\rightarrow Nominal Noun$
	Noun
VP	\rightarrow Verb
	Verb NP
	Verb NP PP
	Verb PP
PP	\rightarrow Preposition NP

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$Determiner \rightarrow$	the $ a $ an $ $ this $ $ these $ $ that
$Preposition \rightarrow$	from to on near
$\textit{Conjunction} \rightarrow$	and or but

S	$S \rightarrow NP VP$
NP VP	$NP \rightarrow Pro$
Pro VP	$VP \to Verb \; NP$
Pro Verb NP	$Pro \to I$
/ Verb NP	$Verb \to prefer$
<i>l prefer</i> NP	$NP \to Det\ Nom$
I prefer Det Nom	$\text{Det} \rightarrow a$

Grammar Rules		
S	\rightarrow	NP VP
NP	\rightarrow	Pronoun
		Proper-Noun
		Det Nominal
Nominal	\rightarrow	Nominal Noun
		Noun
VP	\rightarrow	Verb
		Verb NP
	İ	Verb NP PP
	i	Verb PP
PP	\rightarrow	Preposition NP

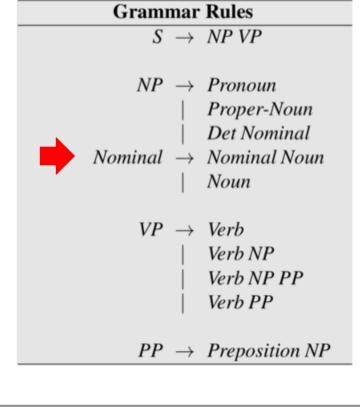
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NP VP	$NP \rightarrow Pro$
Pro VP	$VP \to Verb \; NP$
Pro Verb NP	$Pro \rightarrow I$
/ Verb NP	$Verb \to prefer$
<i>I prefer</i> NP	$NP \to Det \ Nom$
I prefer Det Nom	$Det \rightarrow a$
<i>l prefer a</i> Nom	

Grammar Rules	
$S \rightarrow$	NP VP
$NP \rightarrow$	Pronoun
	Proper-Noun
	Det Nominal
Nominal \rightarrow	Nominal Noun
	Noun
$V\!P \rightarrow$	Verb
	Verb NP
Í	Verb NP PP
i	Verb PP
$PP \rightarrow$	Preposition NP

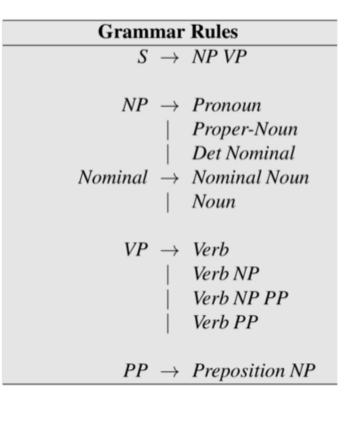
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$Preposition \rightarrow$	from to on near
$\textit{Conjunction} \rightarrow$	and or but

S	$S \rightarrow NP VP$
NP VP	$NP \rightarrow Pro$
Pro VP	$VP \to Verb \ NP$
Pro Verb NP	$Pro \to I$
/ Verb NP	$Verb \to prefer$
<i>l prefer</i> NP	$NP \rightarrow Det Nom$
<i>I prefer</i> Det Nom	$Det \rightarrow a$
<i>l prefer a</i> Nom	Nom \rightarrow Nom Noun



$Noun \rightarrow$	flight breeze trip morning
$Verb \rightarrow$	is prefer like need want fly
$Adjective \rightarrow$	cheapest non-stop first latest
	other direct
$Pronoun \rightarrow$	$me \mid I \mid you \mid it$
$\textit{Proper-Noun} \rightarrow$	Alaska Baltimore Los Angeles
	Chicago United American
$Determiner \rightarrow$	the $ a an $ this $ $ these $ $ that
$Preposition \rightarrow$	from to on near
Conjunction \rightarrow	and or but

S	$S \rightarrow NP VP$
NP VP	$NP \rightarrow Pro$
Pro VP	$VP \rightarrow Verb NP$
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<i>l prefer</i> NP	$NP \rightarrow Det Nom$
<i>I prefer</i> Det Nom	$\text{Det} \rightarrow a$
<i>l prefer a</i> Nom	Nom \rightarrow Nom Noun
<i>l prefer a</i> Nom Noun	

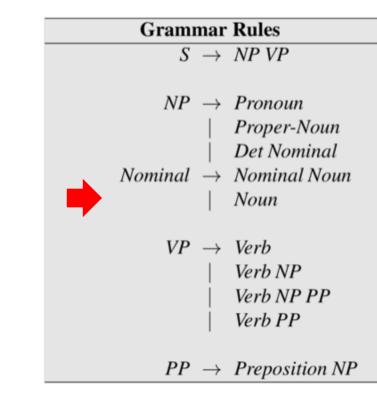


flight breeze trip morning
is prefer like need want fly
cheapest non-stop first latest
other direct
$me \mid I \mid you \mid it$
Alaska Baltimore Los Angeles
Chicago United American
the $ a $ an $ $ this $ $ these $ $ that
from to on near
and or but

Rule expansions F

sions Rules used

 $S \rightarrow NP VP$ S $NP \rightarrow Pro$ NP VP $VP \rightarrow Verb NP$ Pro VP $Pro \rightarrow I$ Pro Verb NP Verb \rightarrow prefer / Verb NP $NP \rightarrow Det Nom$ *I prefer* NP *I prefer* Det Nom $Det \rightarrow a$ Nom \rightarrow Nom Noun I prefer a Nom I prefer a Nom Noun Nom \rightarrow Noun



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Rule expansions R

Rules used

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Grammar Rules	
$S \rightarrow$	NP VP
$NP \rightarrow$	Pronoun
1	Proper-Noun
i i	Det Nominal
Nominal \rightarrow	Nominal Noun
1	Noun
$V\!P \rightarrow$	Verb
1	Verb NP
i	Verb NP PP
i	Verb PP
$PP \rightarrow$	Preposition NP

$Noun \rightarrow$	flight breeze trip morning
$Verb \rightarrow$	is prefer like need want fly
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Determiner ightarrow	the $ a $ an $ $ this $ $ these $ $ that
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Rule expansions

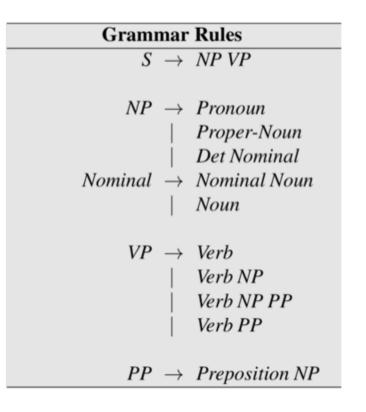
ons Rules used

NP VP

S

- Pro VP
- Pro Verb NP
- / Verb NP
- I prefer NP
- I prefer Det Nom
- I prefer a Nom
- I prefer a Nom Noun
- I prefer a Noun Noun

 $S \rightarrow NP VP$ $NP \rightarrow Pro$ $VP \rightarrow Verb NP$ $Pro \rightarrow I$ Verb \rightarrow prefer $NP \rightarrow Det Nom$ $Det \rightarrow a$ Nom \rightarrow Nom Noun Nom \rightarrow Noun Noun \rightarrow *flight*



	flight breeze trip morning
Verb ightarrow	<i>is</i> <i>prefer</i> <i>like</i> <i>need</i> <i>want</i> <i>fly</i>
Adjective \rightarrow	cheapest non-stop first latest
	other direct
$Pronoun \rightarrow$	$me \mid I \mid you \mid it$
$\textit{Proper-Noun} \rightarrow$	Alaska Baltimore Los Angeles
	Chicago United American
Determiner $ ightarrow$	the $ a an $ this $ $ these $ $ that
$Preposition \rightarrow$	from to on near
$Conjunction \rightarrow$	and or but

Rule expansions F

ns Rules used

S NP VP Pro VP Pro Verb NP **/Verb NP** *I prefer* NP *I prefer* Det Nom *I prefer a* Nom *I prefer a* Nom Noun I prefer a Noun Noun *I prefer a* Noun *flight*

 $S \rightarrow NP VP$ $NP \rightarrow Pro$ $VP \rightarrow Verb NP$ $Pro \rightarrow I$ Verb \rightarrow prefer $NP \rightarrow Det Nom$ $Det \rightarrow a$ Nom \rightarrow Nom Noun Nom \rightarrow Noun Noun \rightarrow *flight*

Grammar Rules $S \rightarrow NP VP$ $NP \rightarrow Pronoun$ |Proper-Noun|Det Nominal $Nominal \rightarrow Nominal Noun$ |Nown $VP \rightarrow Verb$ | $VP \rightarrow Verb$ | $VP \rightarrow Verb$ |Verb NP|Verb NP PP|Verb PP $PP \rightarrow Preposition NP$

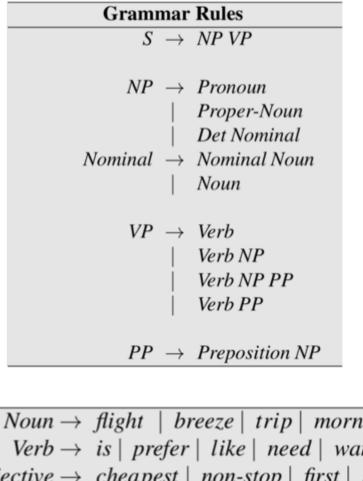
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$Verb \rightarrow$	is prefer like need want fly
$Adjective \rightarrow$	cheapest non-stop first latest
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$Pronoun \rightarrow$	$me \mid I \mid you \mid it$
<i>Proper-Noun</i> \rightarrow	Alaska Baltimore Los Angeles
	Chicago United American
Determiner ightarrow	the $ a $ an $ $ this $ $ these $ $ that
$Preposition \rightarrow$	from to on near
$\textit{Conjunction} \rightarrow$	and or but

Rule expansions

ons Rules used

- S NP VP
- Pro VP
- Pro Verb NP
- / Verb NP
- I prefer NP
- I prefer Det Nom
- *I prefer a* Nom
- I prefer a Nom Noun
- I prefer a Noun Noun
- I prefer a Noun flight

 $S \rightarrow NP VP$ $NP \rightarrow Pro$ $VP \rightarrow Verb NP$ $Pro \rightarrow I$ Verb \rightarrow prefer $NP \rightarrow Det Nom$ $Det \rightarrow a$ Nom \rightarrow Nom Noun Nom \rightarrow Noun Noun \rightarrow flight Noun → *morning*



	flight breeze trip morning
$Verb \rightarrow$	is prefer like need want fly
$Adjective \rightarrow$	cheapest non-stop first latest
	other direct
$Pronoun \rightarrow$	$me \mid I \mid you \mid it$
$\textit{Proper-Noun} \rightarrow$	Alaska Baltimore Los Angeles
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$Determiner \rightarrow$	the $ a an $ this $ $ these $ $ that
$Preposition \rightarrow$	$from \mid to \mid on \mid near$
$\textit{Conjunction} \rightarrow$	and or but

Rule expansions F

s Rules used

S NP VP Pro VP Pro Verb NP **/Verb NP** *I prefer* NP *I prefer* Det Nom *I prefer a* Nom *I prefer a* Nom Noun I prefer a Noun Noun *I prefer a* Noun *flight* I prefer a morning flight

 $S \rightarrow NP VP$ $NP \rightarrow Pro$ $VP \rightarrow Verb NP$ $Pro \rightarrow I$ Verb \rightarrow prefer $NP \rightarrow Det Nom$ $\text{Det} \rightarrow a$ Nom \rightarrow Nom Noun Nom \rightarrow Noun Noun \rightarrow *flight* Noun → *morning*

Grammar	Rules
$S \rightarrow$	NP VP
$NP \rightarrow$	Pronoun
	Proper-Noun
	Det Nominal
Nominal \rightarrow	Nominal Noun
	Noun
$V\!P \rightarrow$	Verb
	Verb NP
i	Verb NP PP
İ	Verb PP
$PP \rightarrow$	Preposition NP
Noun \rightarrow flight br	reeze trip mornin
<i>Verb</i> \rightarrow <i>is</i> <i>prefer</i>	like need want
	non-stop first la

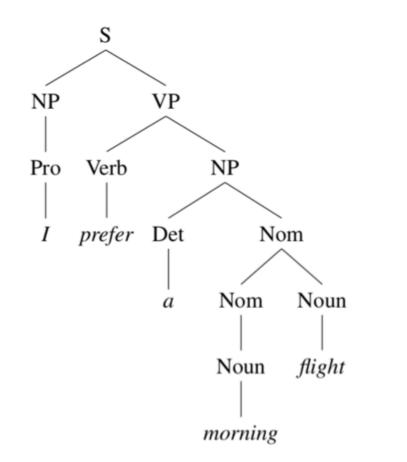
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Some Terminologies

- Each grammar must have one designated start symbol, S
- We say the string "I prefer a morning flight" can be derived from S and the sequence of rule expansions is called a derivation of the string
- A CFG *L* can be used to generate a set of strings. This set of strings is called the formal language defined by *L*
- Sentences that can be derived by *L* are called grammatical sentences in the formal language defined by *L*
- Sentences that cannot be derived by *L* are called ungrammatical sentences in the formal language defined by *L*

Sequence of rule expansions S NP VP Pro VP Pro Verb NP / Verb NP I prefer NP *I prefer* Det Nom I prefer a Nom I prefer a Nom Noun I prefer a Noun Noun I prefer a Noun flight I prefer a morning flight

 We can represent the derivation by a parse tree or in bracketed notation



[S [NP [Pro I]] [VP [V prefer] [NP [Det a] [Nom [N morning] [Nom [N flight]]]]]

Q: What information is conveyed by a parse tree?

Formal Definition of Context-Free Grammar

- A context-free grammar G is defined by four parameters: *N*, *Σ*, *R*, *S*
 - N a set of **non-terminal symbols** (or **variables**)
 - Σ a set of **terminal symbols** (disjoint from *N*)
 - *R* a set of **rules** or productions, each of the form $A \rightarrow \beta$, where *A* is a non-terminal,

 β is a string of symbols from the infinite set of strings $(\Sigma \cup N)$ *

- S a designated start symbol and a member of N
- The Kleene star means "zero or more occurrences of the immediately previous character or regular expression"

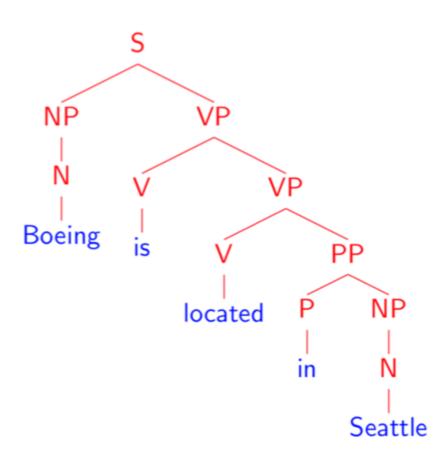
Syntactic Parsing

The problem of mapping from a sentence (a string of words) to its parse tree

INPUT:

Boeing is located in Seattle.

OUTPUT:



Syntactic Parsing (cont.)

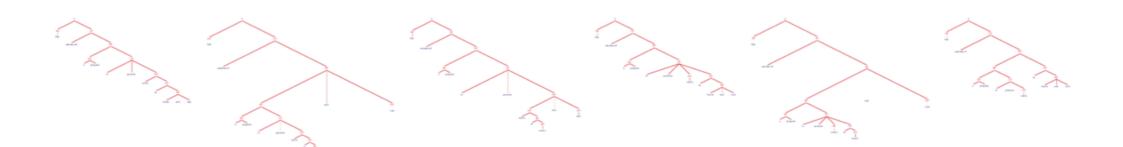
- The problem with parsing: ambiguity
 - Each string in the language defined by a CFG may have more than one derivation ("ambiguity")

INPUT:

She announced a program to promote safety in trucks and vans

 \downarrow

POSSIBLE OUTPUTS:



Syntactic Parsing (cont.)

- Sources of ambiguity
 - Lexical ambiguity, e.g., multiple word senses, multiple parts-of-speech
 - Structural ambiguity

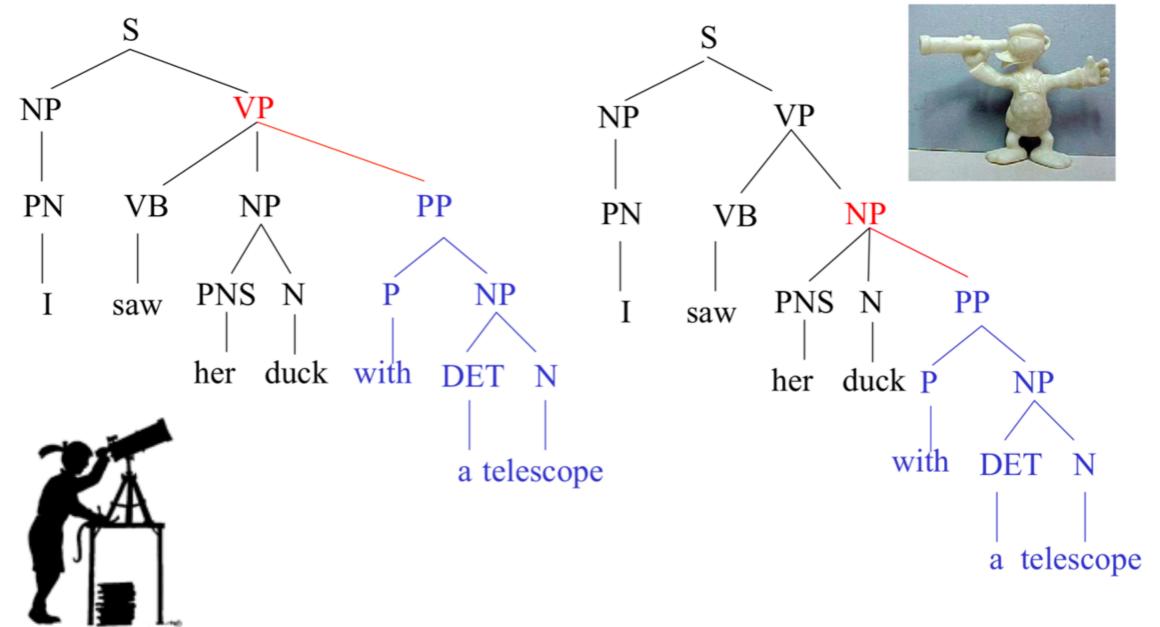
• Example 1:

"I saw her duck with a telescope"

- Example 1:
 - "I saw her duck with a telescope"
 - Part-of-Speech ambiguity
 NN → duck
 Vi → duck

• Example 1:

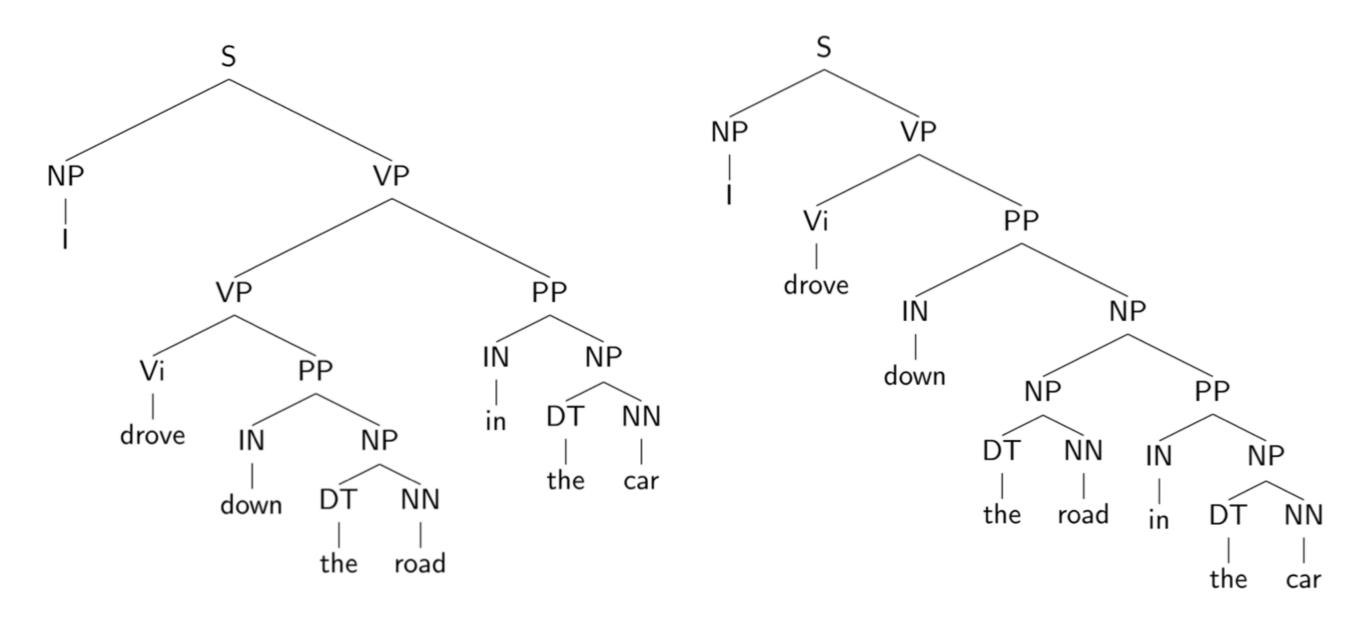
"I saw her duck with a telescope"



• Example 2:

"I drove down the road in the car"

• Example 2:

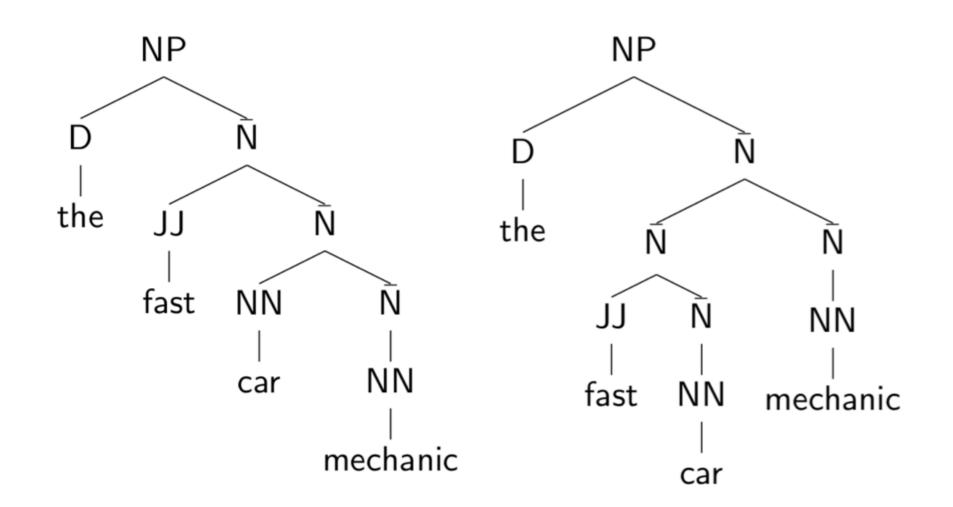


• Example 3:

"the fast car mechanic"

Examples of ambiguous structures (cont.)

- Example 3:
 - Noun premodifiers



Overview

- > An Introduction to Syntax
- Constituency
- Context-Free Grammars (CFGs)
- English Grammar in a Nutshell
 - Some Grammar Rules
 - Treebanks

Some Grammar Rules

- Sentence-level Constructions
 - Declaratives
 - Imperatives
 - Yes-no questions
 - Wh-questions

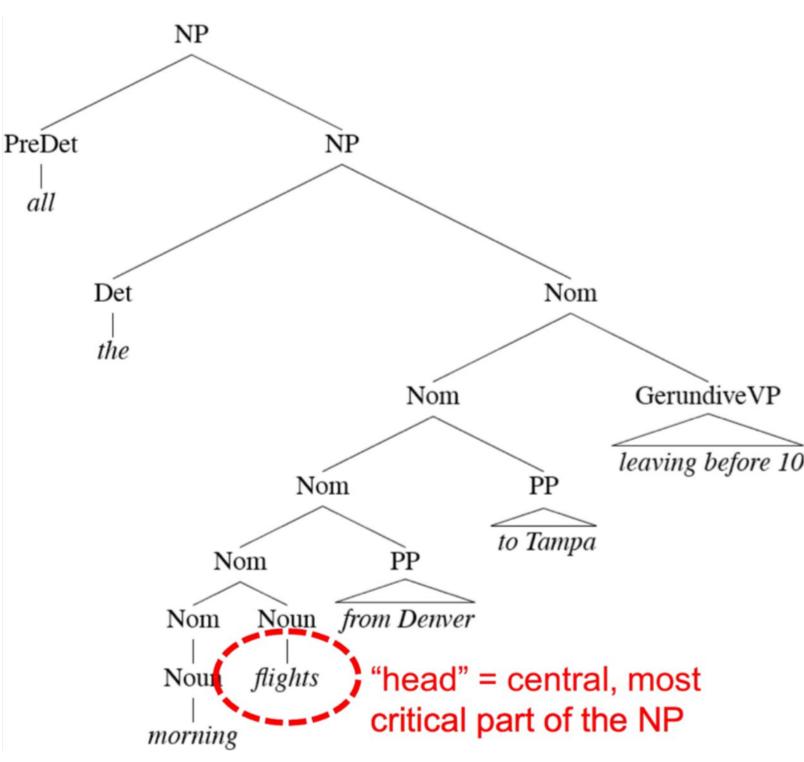
- Declaratives
 - Form: $S \rightarrow NP VP$ I prefer a morning flight
 - Have a great number of uses
- Imperatives
 - Form: $S \rightarrow VP$ Show the lowest fare
 - Used for commands and suggestions

- Yes-no questions
 - Form: $S \rightarrow Aux NP VP$ Do any of these flights have stops?
 - Often used to ask questions
- Wh-questions
 - Wh-subject-questions
 - Form: $S \rightarrow Wh-NP VP$ What airlines fly from Burbank to Denver?
 - Identical to the declarative structure, except that the first NP contains some wh-word
 - Wh-no-subject-questions
 - Form: $S \rightarrow Wh-NP Aux NP VP$

What flights do you have from Burbank to Tacoma Washington?

- Clauses and Sentences
 - The S rules are intended to account for entire sentences that stand alone as fundamental units of discourse
 - **S** can also occur on the right-hand side of grammar rules and can be embedded within larger sentences
 - The S rules are some sense *complete* (i.e., forming a complete thought). They correspond to the notion of clause.

- Noun Phrases
 - Can be complicated
 - Determiners
 - Pre-modifiers
 - Post-modifiers



• Determiners

- Noun phrases can begin with determiners ...
- Determiners can be
 - simple lexical items a, the, this, those, any, some, etc.
 - simple possessives John's car
 - complex recursive versions of that
 John's sister's husband's son's car

• Premodifiers

- Come before the head
- Examples
 - Cardinal numbers one, two, three
 - Ordinal numbers

– Quantifiers

first, next, other many, (a) few, several

- Adjectives first-class, longest, non-stop
- Ordering constraints three large cars vs. large three cars

Postmodifiers

- Come after the head
- Three kinds
 - Prepositional phrases from Seattle
 - Non-finite clauses
 - Relative clauses

arriving before noon

that serve breakfast

- Similar recursive rules to handle these:
 - Nominal \rightarrow Nominal PP
 - Nominal \rightarrow Nominal GerundVP
 - Nominal \rightarrow Nominal RelClause

- Agreement Issues
 - Agreement: constraints that hold among various constituents
 - For example, subjects must agree with their verbs on person and number:

I am cold.	You are cold.	He is cold.
* I are cold.	* You is cold.	* He am cold.

- Requires separate productions for each combination in CFG:
 - S \rightarrow NP1stPersonSing VP1stPersonSing
 - $S \rightarrow NP2ndPersonSing VP2ndPersonSing$
 - NP1stPersonSing $\rightarrow \dots$
 - VP1stPersonSing $\rightarrow \dots$
 - NP2ndPersonSing $\rightarrow \dots$
 - VP2ndPersonSing $\rightarrow \dots$

- Other agreement Issues
 - Pronouns have case (e.g. nominative, accusative) that must agree with their syntactic position.

I gave him the book. He gave me the book.

* I gave he the book.

He gave me the book. * Him gave me the book.

Many languages have gender agreement.
 Los Angeles * Las Angeles
 Las Vegas * Los Vegas

- Verb Phrases
 - English verb phrases consists of
 - Head verb
 - Zero or more following constituents (called arguments)
 - Sample rules
 - $VP \rightarrow Verb$ disappear
 - $VP \rightarrow Verb NP$ prefer a morning flight
 - $VP \rightarrow Verb NP PP$ leave Boston in the morning
 - $VP \rightarrow Verb PP$ leave on Thursday

- Subcategorization Issues
 - Specific verbs take some types of arguments but not others
 - Transitive verb: "found" requires a direct object
 - John found the ring. * John found.
 - Intransitive verb: "disappeared" cannot take one
 - John disappeared. * John disappeared the ring.
 - "gave" takes both a direct and indirect object
 - John gave Mary the ring. * John gave Mary. *John gave the ring
 - "want" takes an NP, or non-finite VP or S

John wants a car. John wants to buy a car. John wants Mary to take the ring. * John wants.

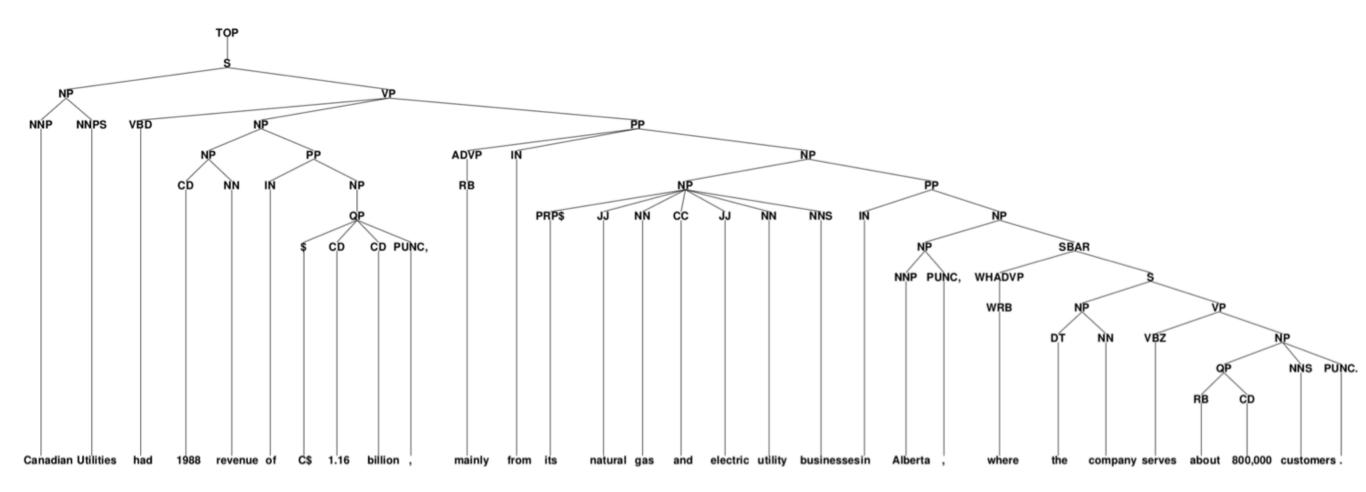
Subcategorization frames

• Specify the range of argument types that a given verb can take.

Frame	Verb	Example
Ø	eat, sleep	I ate
NP	prefer, find, leave	Find [NP the flight from Pittsburgh to Boston]
NP NP	show, give	Show [NP me] [NP airlines with flights from Pittsburgh]
$PP_{\rm from} PP_{\rm to}$	fly, travel	I would like to fly [PP from Boston] [PP to Philadelphia]
NP PP _{with}	help, load	Can you help [NP me] [PP with a flight]
VPto	prefer, want, need	I would prefer [VPto to go by United airlines]
VPbrst	can, would, might	I can [_{VPbrst} go from Boston]
S	mean	Does this mean [$_S$ AA has a hub in Boston]

Treebanks

- Data for parsing experiments
 - Penn WSJ Treebank = 50,000 sentences with associated trees
 - Usual set-up: 40,000 training sentences, 2400 test sentences
 - Example tree



Treebanks (cont.)

- Penn Treebank
 - Treebanks implicitly define a grammar for the language
 - Penn Treebank has 4500 different rules for VPs, including...
 - $VP \rightarrow BD PP$
 - $VP \rightarrow VBD PP PP$
 - $VP \rightarrow VBD PP PP$
 - $VP \rightarrow VBD PP PP PP$

exercise!