

Parsing Context-free grammars – Part 1

ICS 482 Natural Language Processing

Lecture 12: Parsing Context-free grammars –
Part 1

Husni Al-Muhtaseb

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Lecture 12: Parsing Context-free grammars –
Part 1

Husni Al-Muhtaseb

NLP Credits and

Acknowledgment

These slides were adapted from presentations of the Authors of the book

SPEECH and LANGUAGE PROCESSING:

An Introduction to Natural Language Processing,
Computational Linguistics, and Speech Recognition

and some modifications from presentations found in the WEB by several scholars including the following

NLP Credits and Acknowledgment

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NLP Credits and Acknowledgment

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Qing Ma

Zeynep Altan

Previous Lectures

- Introduction and Phases of an NLP system
- NLP Applications - Chatting with Alice
- Finite State Automata & Regular Expressions & languages
- Morphology: Inflectional & Derivational
- Parsing and Finite State Transducers
- Stemming & Porter Stemmer
- Statistical NLP – Language Modeling
- N Grams
- Smoothing and NGram: Add-one & Witten-Bell
- Parts of Speech
- Arabic Parts of Speech
- Syntax: Context Free Grammar (CFG): Derivation, Parsing, Recursion, Agreement, Subcategorization

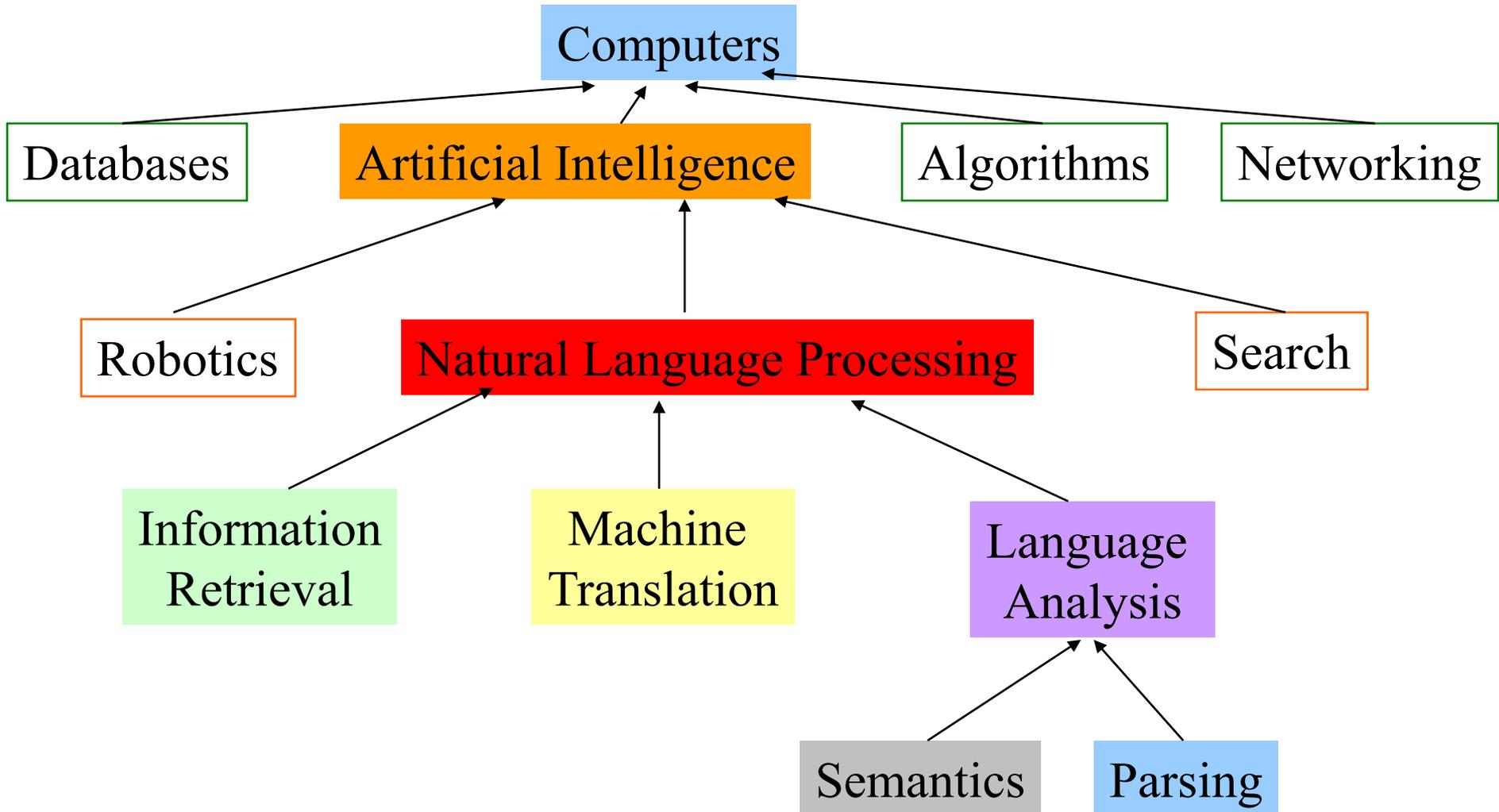
Today's Lecture

- Parsing Context Free Grammars
 - **Top-Down (TD)**
 - **Bottom-Up (BU)**
 - Top-Down Depth-First Left-to-Right (TD DF L2R)
 - Top-down parsing with bottom-up filtering
 - Dynamic
 - Earley's Algorithm

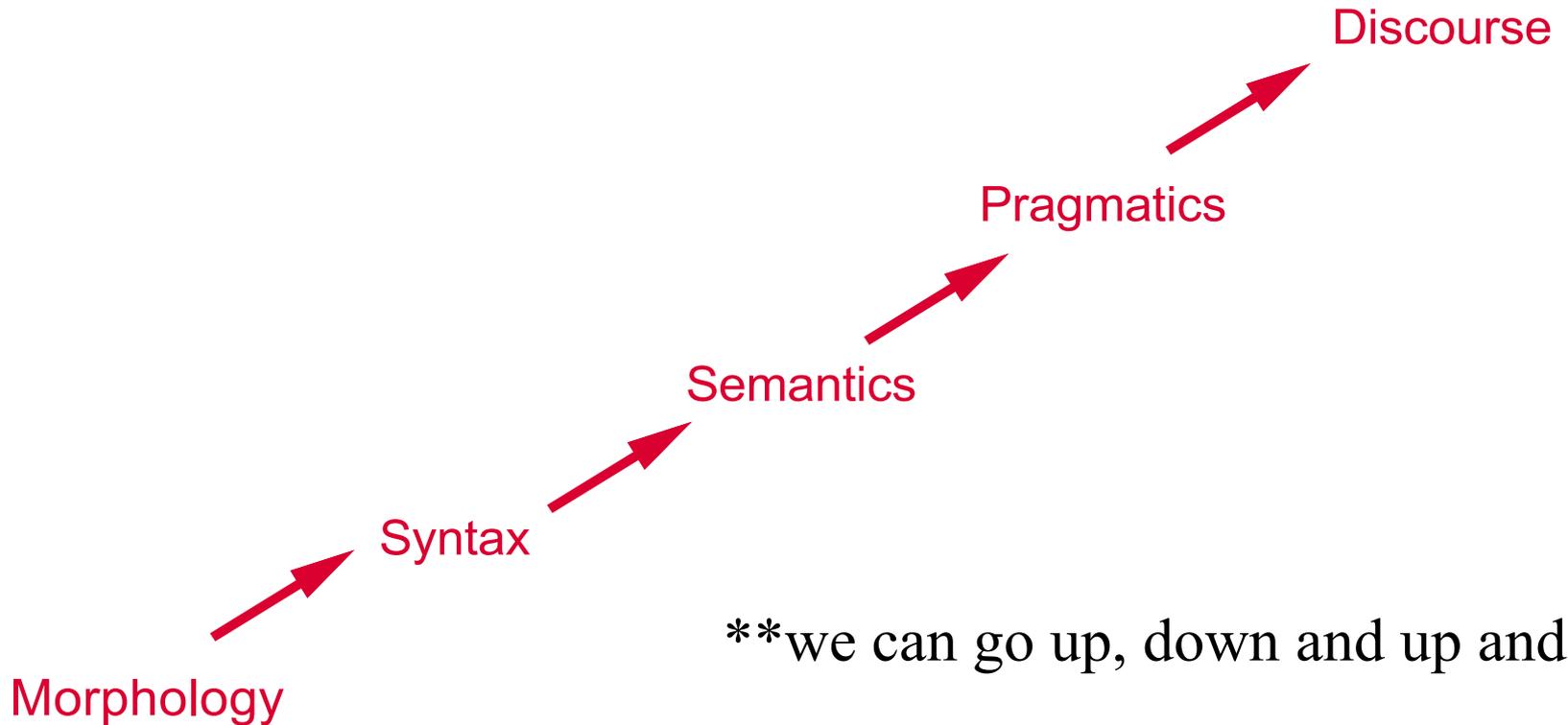
Reminder

- Quiz 2
 - Tuesday 3rd April 2007?
 - Class time
 - Covered material
 - Textbook: Ch 6, 8, 9, covered part of 10
 - We are not covering Speech related material

Where does NLP fit in the CS taxonomy?



The Steps in NLP

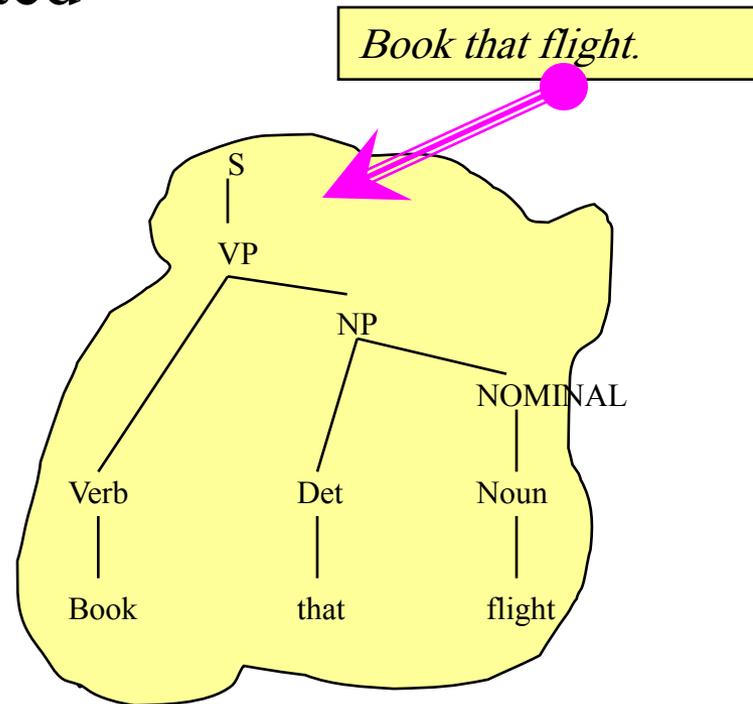


**we can go up, down and up and down and combine steps too!!

**every step is equally complex

Introduction

- Parsing = associating a structure (parse tree) to an input string using a grammar
- CFG are declarative, they don't specify how the parse tree will be constructed
- Parse trees are used in
 - Grammar checking
 - Semantic analysis
 - Machine translation
 - Question answering
 - Information extraction



Parsing

- Parsing with CFGs refers to the task of assigning correct trees to input strings
- Correct here means a tree that covers **all and only the elements of the input** and **has an S at the top**
- It doesn't actually mean that the system can select the correct tree from among the possible trees

Parsing

- Parsing involves a search which involves the making of choices
- Some Parsing techniques:
 - Top-down parsing
 - Bottom-up parsing

For Now

□ Assume...

- You have all the words already in some buffer
- The input isn't POS tagged
- We won't worry about morphological analysis
- All the words are known

Parsing as search

A Grammar to be used in our example

S → NP VP

VP → Verb NP PP

S → Aux NP VP

VP → Verb PP

S → VP

VP → VP PP

NP → Pronoun

PP → Preposition NP

NP → Det NOMINAL

Det → that | this | a

NP → Proper-Noun

Noun → book | flight | meal | money

NOMINAL → Noun

Verb → book | include | prefer

NOMINAL → NOMINAL Noun

Pronoun → I | she | me

NOMINAL → NOMINAL PP

Aux → does

VP → Verb

Proper-Noun → Houston | TWA

VP → Verb NP

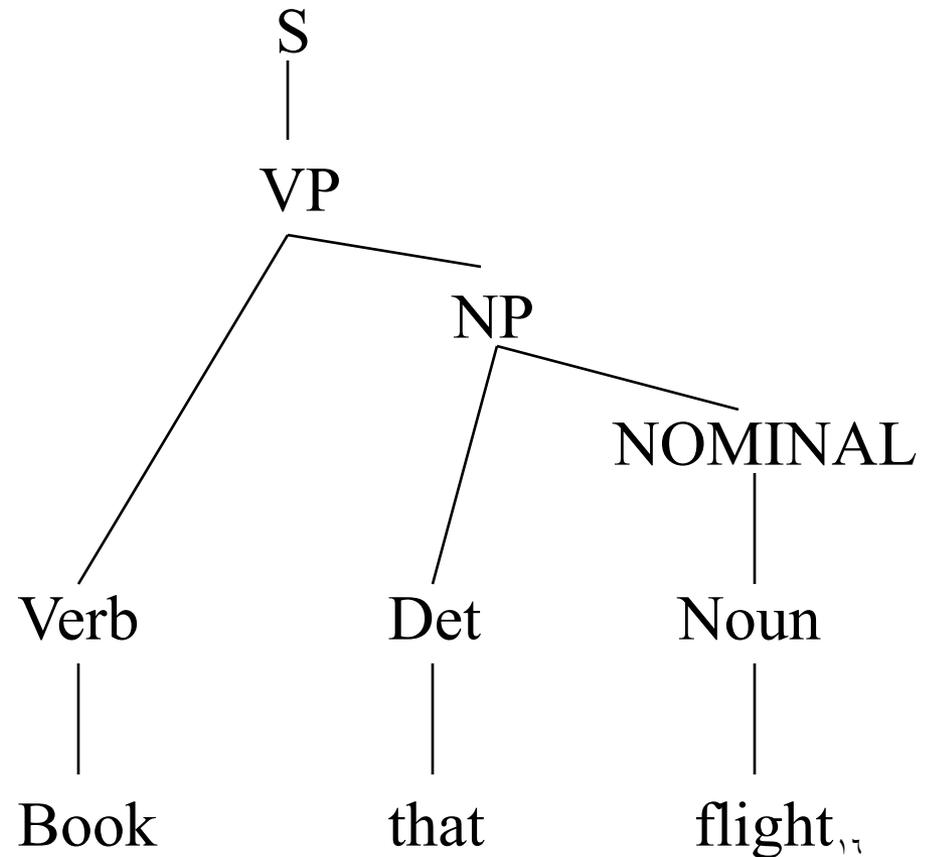
Preposition → from | to | on | near | through

Parsing as search

Book that flight.

- Two types of constraints on the parses:
 1. some that come from the input string
 2. others that come from the grammar

S → NP VP	VP → Verb NP PP
S → Aux NP VP	VP → Verb PP
S → VP	VP → VP PP
NP → Pronoun	PP → Preposition NP
NP → Det NOMINAL	Det → that this a
NP → Proper-Noun	Noun → book flight meal money
NOMINAL → Noun	Verb → book include prefer
NOMINAL → NOMINAL Noun	Pronoun → I she me
NOMINAL → NOMINAL PP	Aux → does
VP → Verb	Proper-Noun → Houston TWA
VP → Verb NP	Preposition → from to on near through



Top-Down Parsing (TD)

- Since we're trying to find trees rooted with an S (Sentences) start with the rules that give us an S
- Then work your way down from there to the words

Bottom-Up Parsing

- Since we want trees that cover the input words start with trees that link up with the words in the right way.
- Then work your way up from there.

Bottom-up parsing (BU)

Book that flight

Noun Det Noun
Book that flight

Verb Det Noun
Book that flight

NOMINAL NOMINAL
Noun Det Noun
Book that flight

NOMINAL
Verb Det Noun
Book that flight

S → NP VP	VP → Verb NP PP
S → Aux NP VP	VP → Verb PP
S → VP	VP → VP PP
NP → Pronoun	PP → Preposition NP
NP → Det NOMINAL	Det → that this a
NP → Proper-Noun	Noun → book flight meal money
NOMINAL → Noun	Verb → book include prefer
NOMINAL → NOMINAL Noun	Pronoun → I she me
NOMINAL → NOMINAL PP	Aux → does
VP → Verb	Proper-Noun → Houston TWA
VP → Verb NP	Preposition → from to on near through

NP
NOMINAL NOMINAL
Noun Det Noun
Book that flight

VP NOMINAL
Verb Det Noun
Book that flight

NP
Verb Det Noun
Book that flight

VP NP
Verb Det Noun
Book that flight

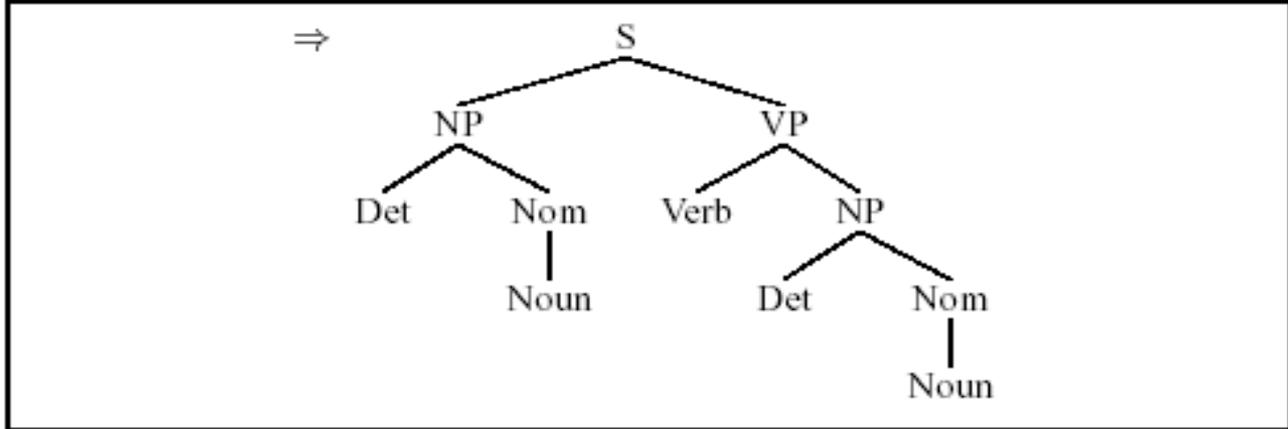
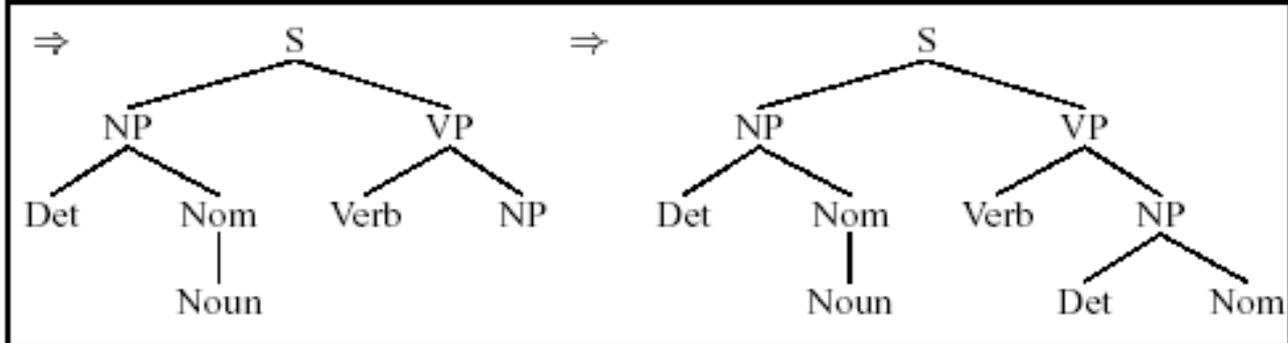
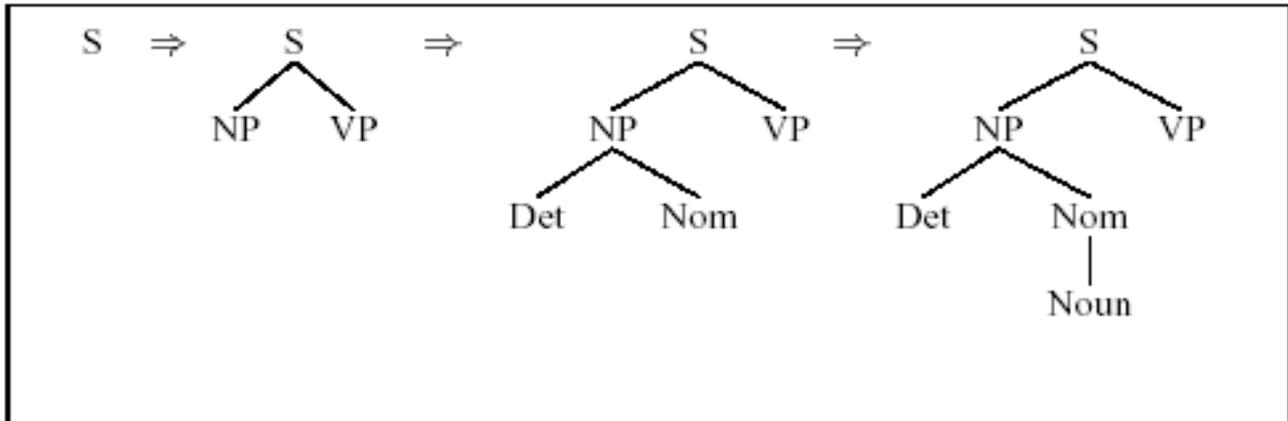
VP
Verb Det Noun
Book that flight

Comparing Top-Down and Bottom-Up

- Top-Down parsers never explore illegal parses (never explore trees that can't form an S) -- but waste time on trees that can never match the input
- Bottom-Up parsers never explore trees inconsistent with input -- but waste time exploring illegal parses (Explore trees with no S root)
- For both: how to explore the search space?
 - Pursuing all parses in parallel or ...?
 - Which rule to apply next?
 - Which node to expand next?
- Needed: some middle ground.

Basic Top-Down (TD) parser

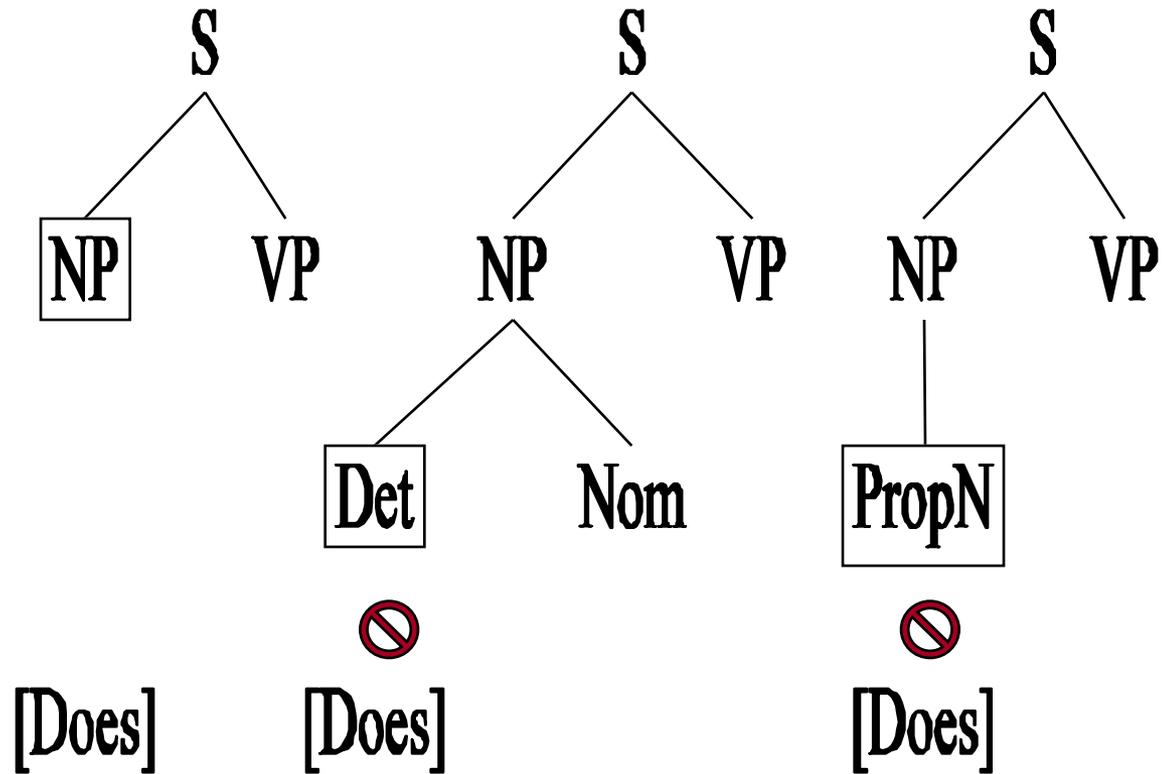
- Practically infeasible to generate all trees in parallel.
- Use depth-first strategy.
- When arriving at a tree that is inconsistent with the input, return to the most recently generated but still unexplored tree.



An example: TD, DF, L2R Search

Does this flight include a meal?

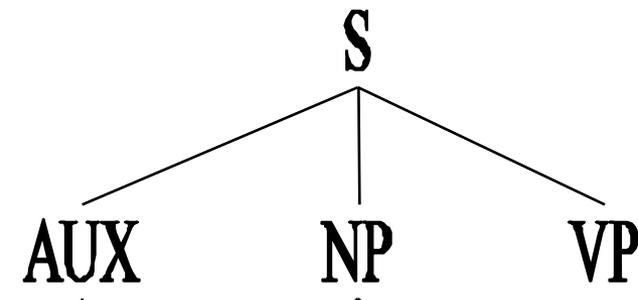
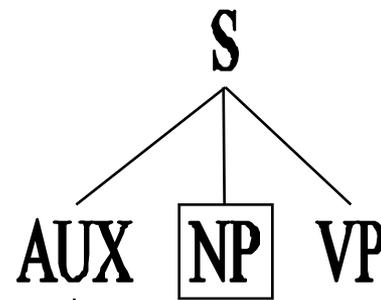
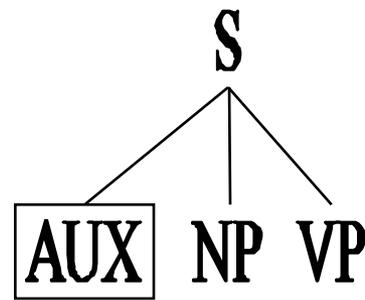
S → NP VP	VP → Verb NP PP	S
S → Aux NP VP	VP → Verb PP	
S → VP	VP → VP PP	
NP → Pronoun	PP → Preposition NP	
NP → Det NOMINAL	Det → that this a	
NP → Proper-Noun	Noun → book flight meal money	
NOMINAL → Noun	Verb → book include prefer	
NOMINAL → NOMINAL Noun	Pronoun → I she me	
NOMINAL → NOMINAL PP	Aux → does	
VP → Verb	Proper-Noun → Houston TWA	
VP → Verb NP	Preposition → from to on near through	[Does]



Example

Does this flight include a meal?

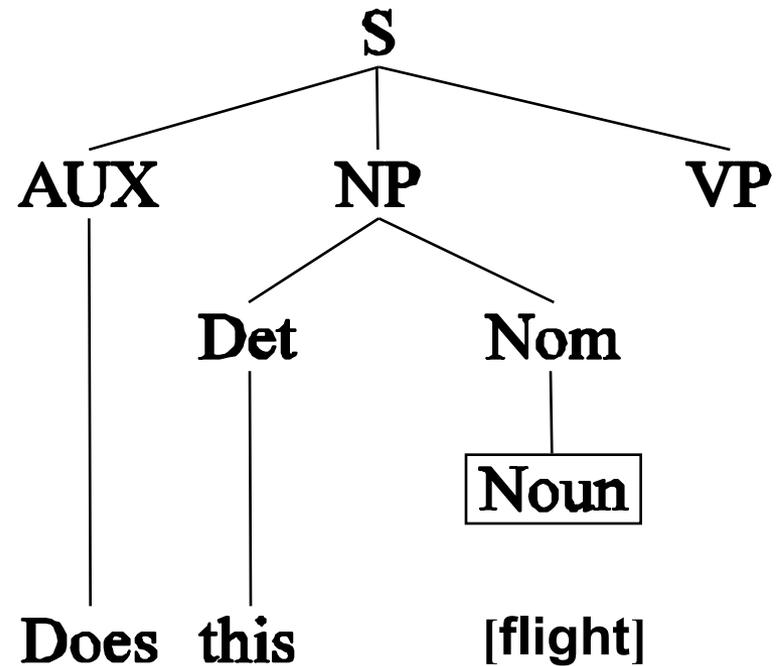
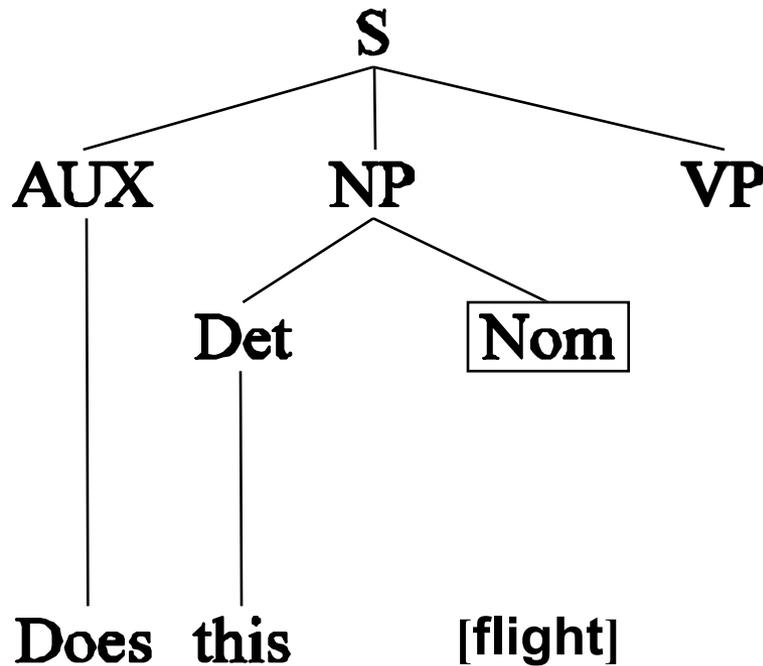
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S → Aux NP VP	VP → Verb PP
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Example

Does this flight include a meal?

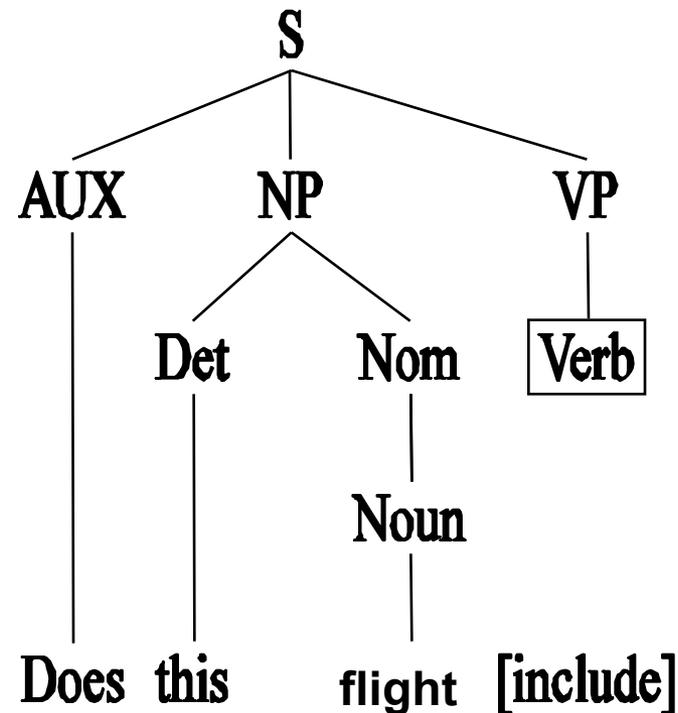
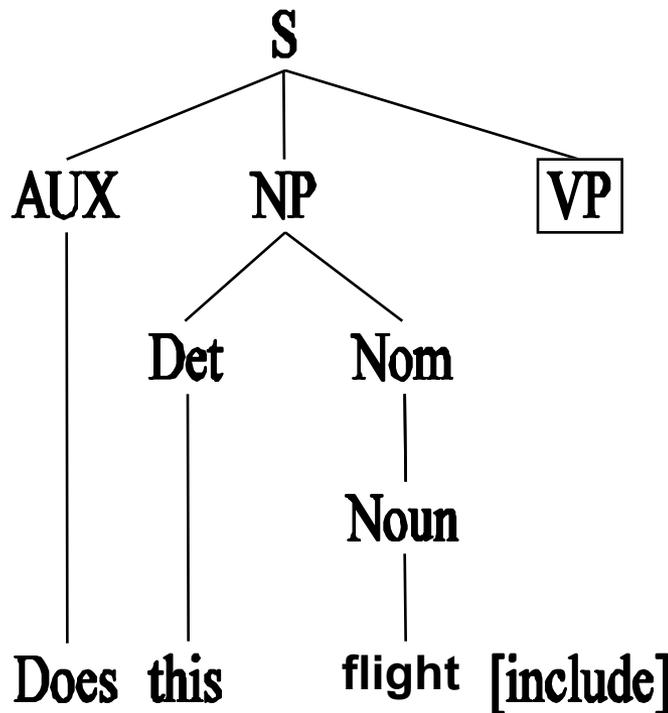
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Example

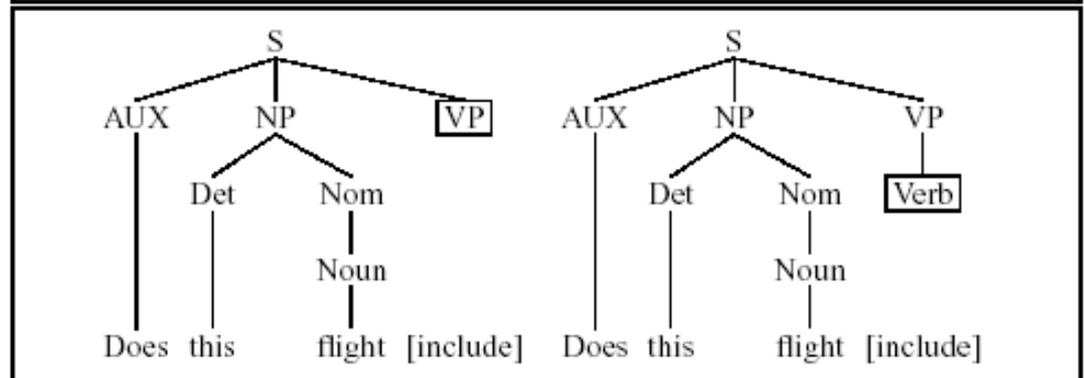
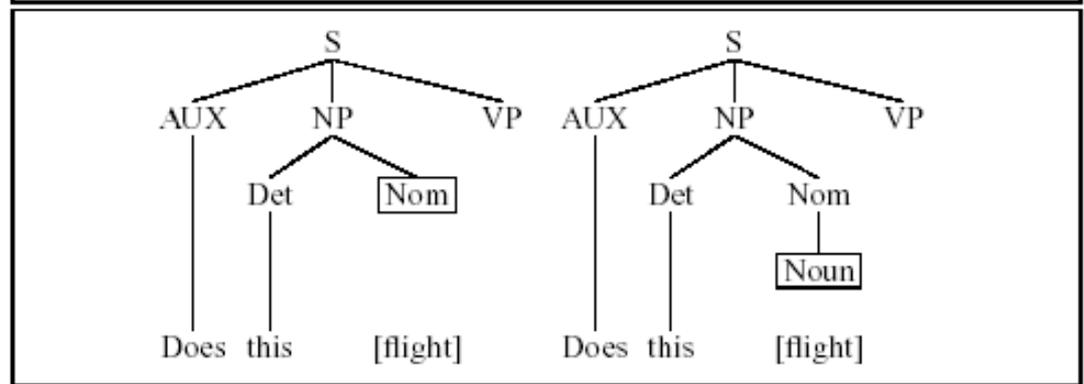
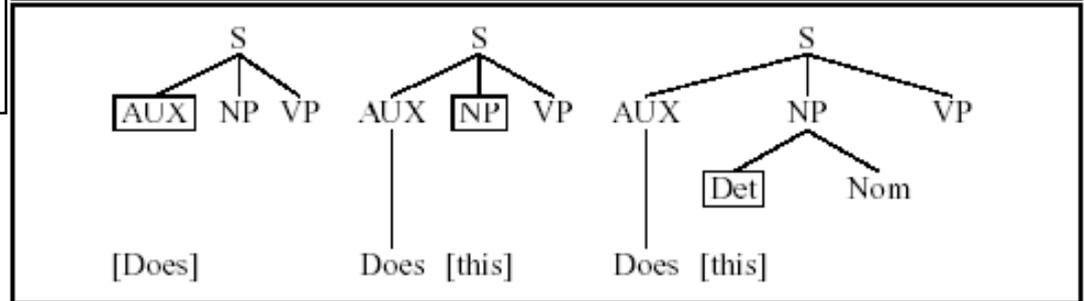
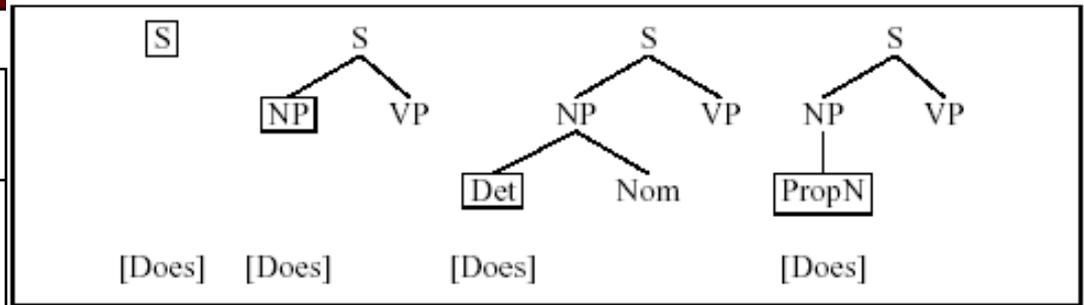
Does this flight include a meal?

S → NP VP	VP → Verb NP PP
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S → VP	VP → VP PP
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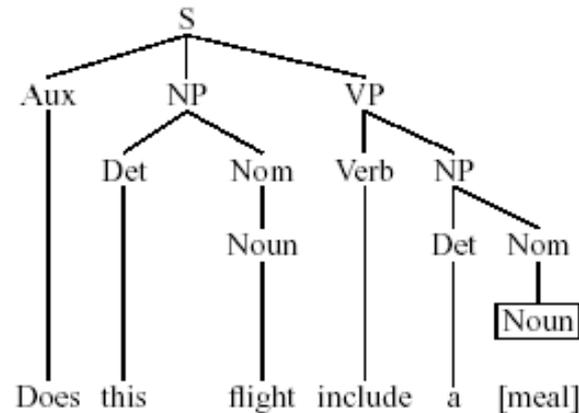
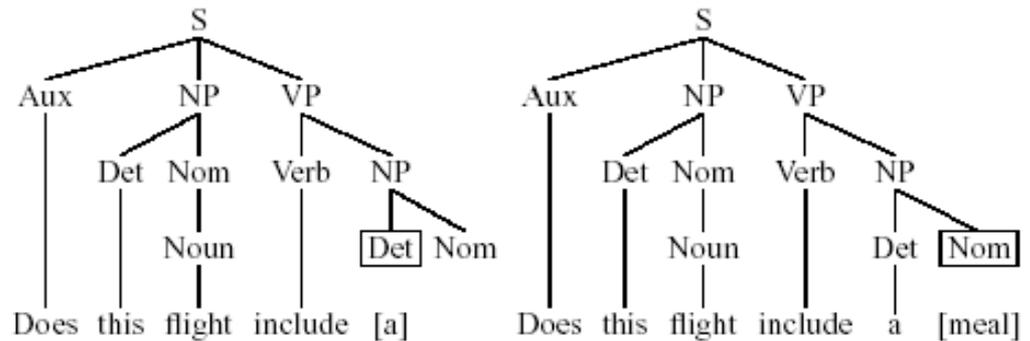
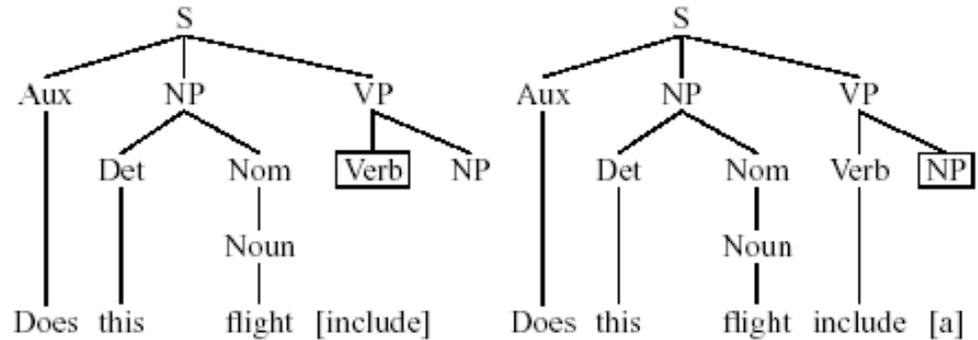
Previous 4 slides

Does this flight
include a meal?



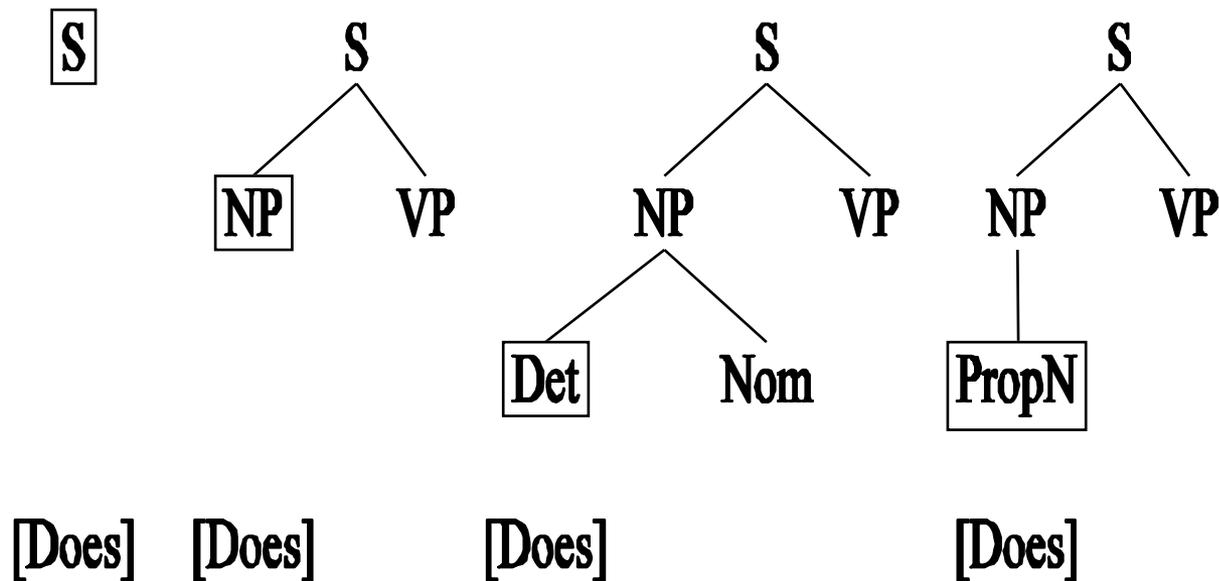
Example: (Cont.)

Does this flight include
a meal?



Control

□ Does this sequence make any sense?



Top-Down and Bottom-Up

□ Top-down

- Only searches for trees that can be answers
- But suggests trees that are not consistent with the words

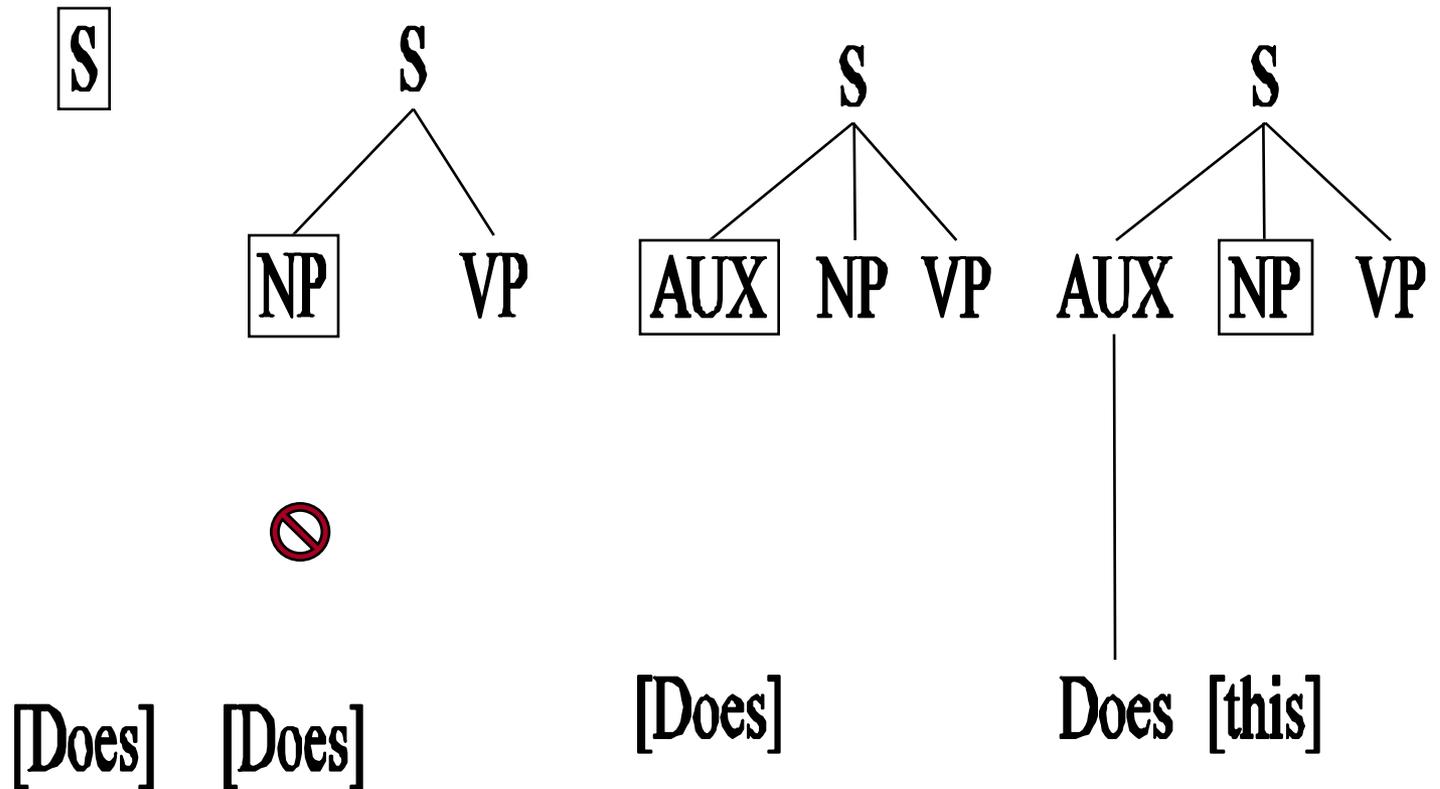
□ Bottom-up

- Only forms trees consistent with the words
- Suggest trees that make no sense globally

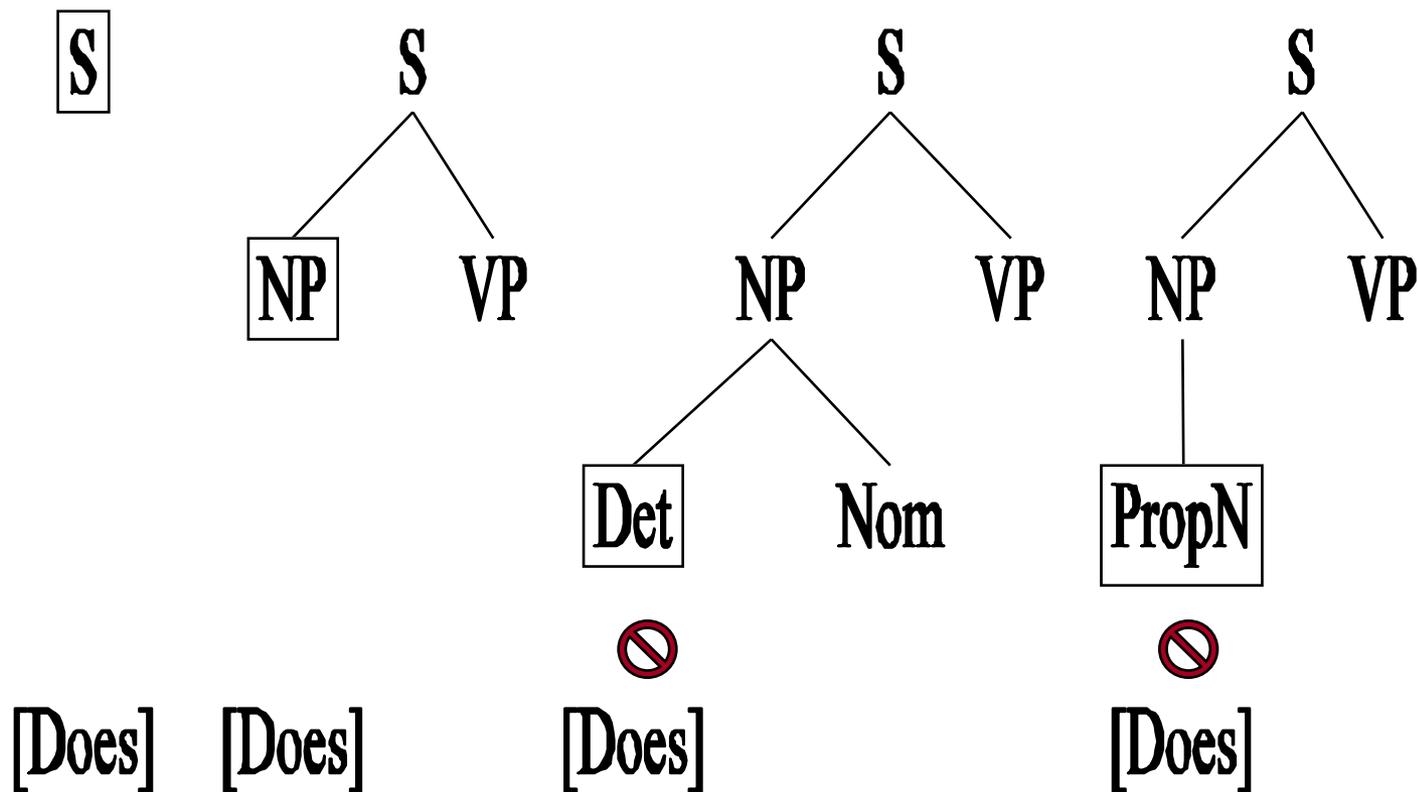
So Combine Them

- How to combine top-down expectations with bottom-up data to get more efficient searches?
- Use one kind as the control and the other as a filter
 - As in top-down parsing with bottom-up filtering

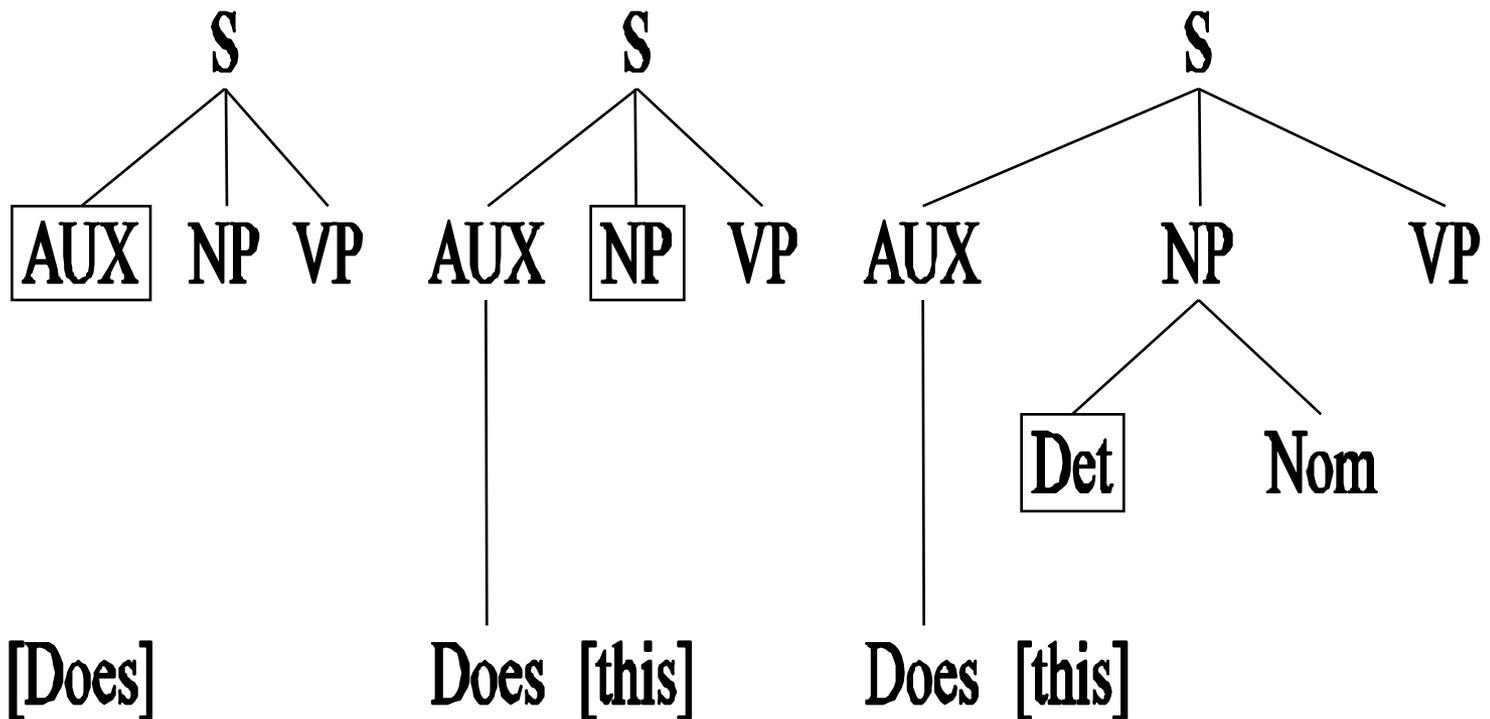
Bottom-Up Filtering



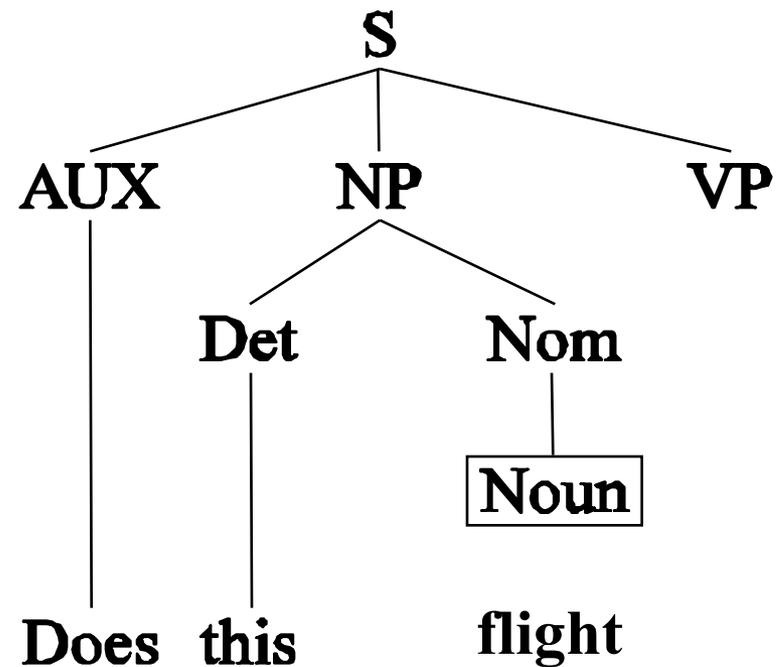
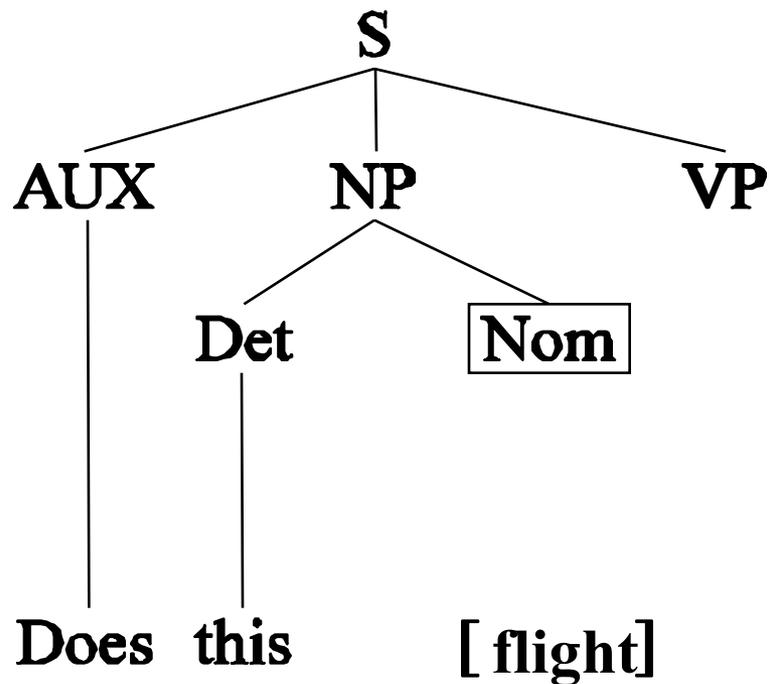
Top-Down, Depth-First, Left-to-Right Search



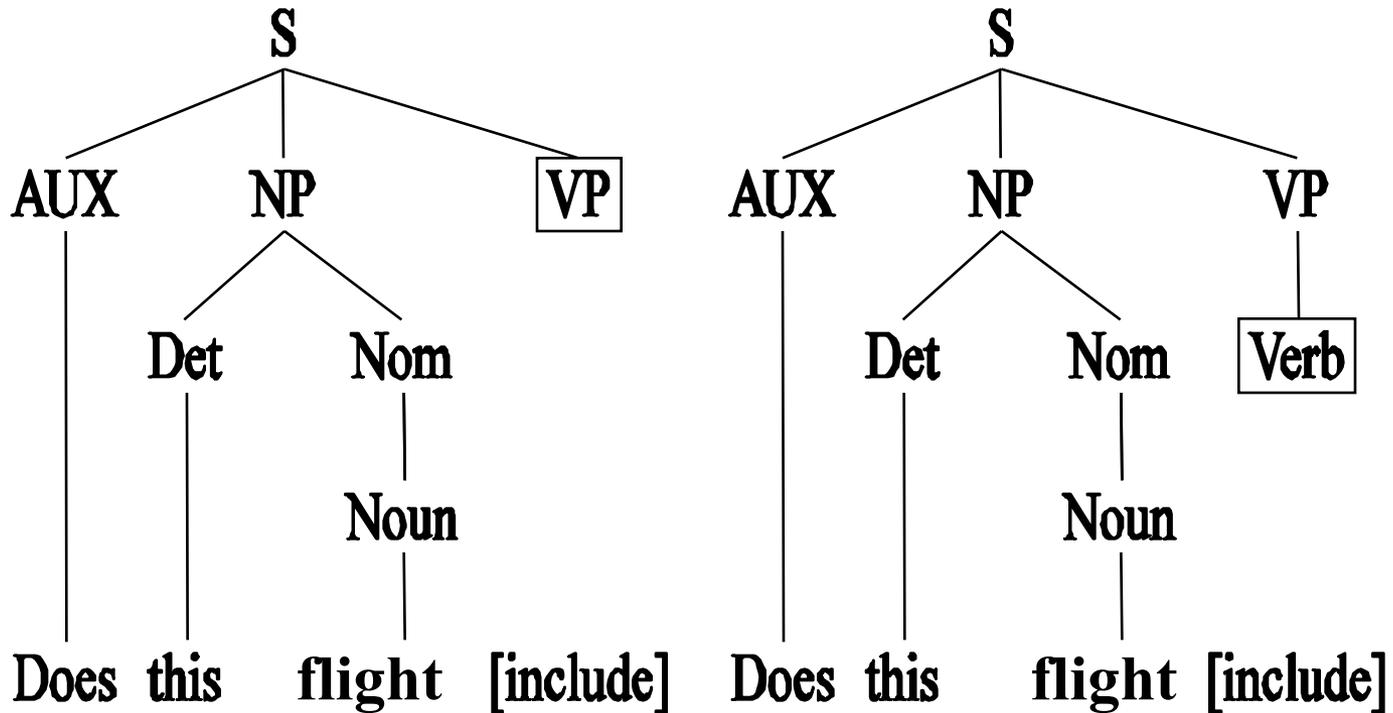
Example



Example



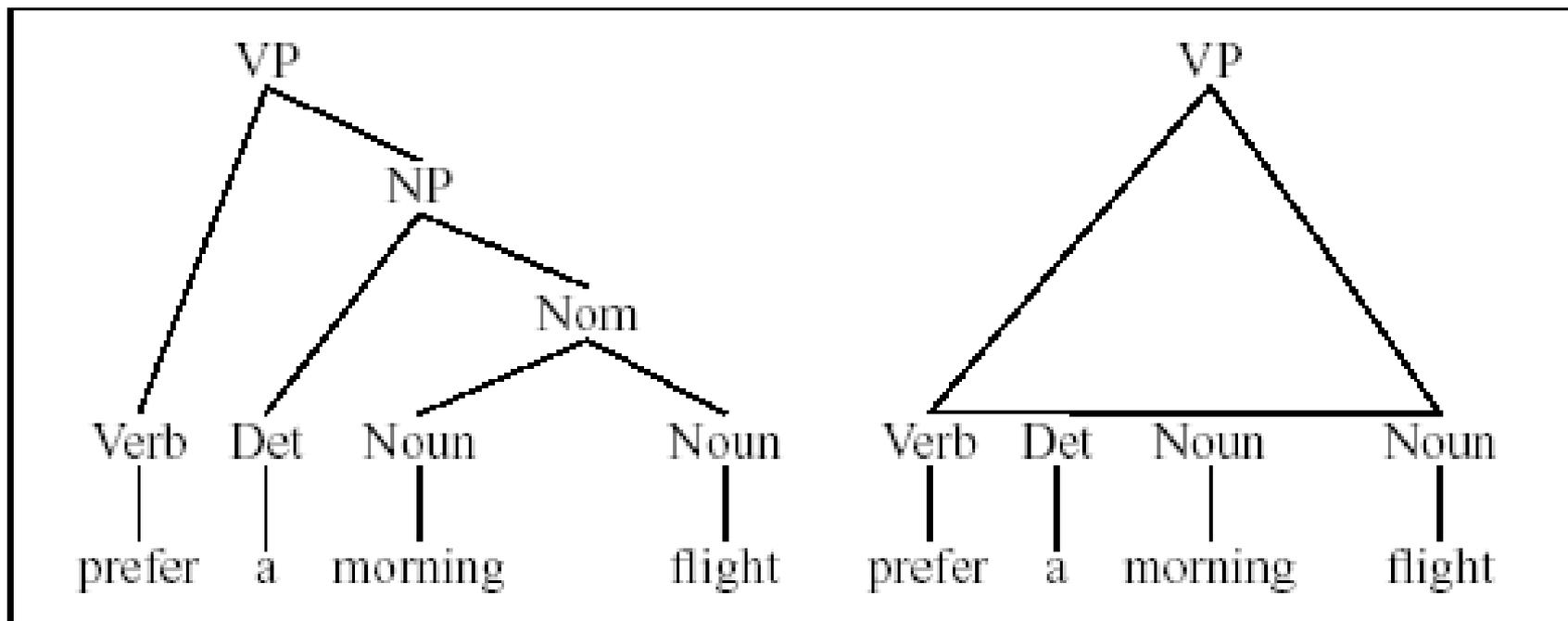
Example



Augmenting Top-Down Parsing with Bottom-Up Filtering

- Top-Down, depth-first, Left to Right (L2R) parsing
 - Expands non-terminals along the tree's left edge down to leftmost leaf of tree
 - Moves on to expand down to next leftmost leaf...
 - In a successful parse, current input word will be the first word in **derivation** of the unexpanded node that the parser is currently processing
 - So....lookahead to **left-corner** of the tree
 - B is a left-corner of A if $A \Rightarrow B\alpha$
 - Build table with left-corners of all non-terminals in grammar and consult before applying rule

Left Corner



Left-Corner Table for CFG

Category	Left Corners
S	Det, PropN, Aux, V
NP	Det, PropN
Nom	N
VP	V

S → NP VP	VP → Verb NP PP
S → Aux NP VP	VP → Verb PP
S → VP	VP → VP PP
NP → Pronoun	PP → Preposition NP
NP → Det NOMINAL	Det → that this a
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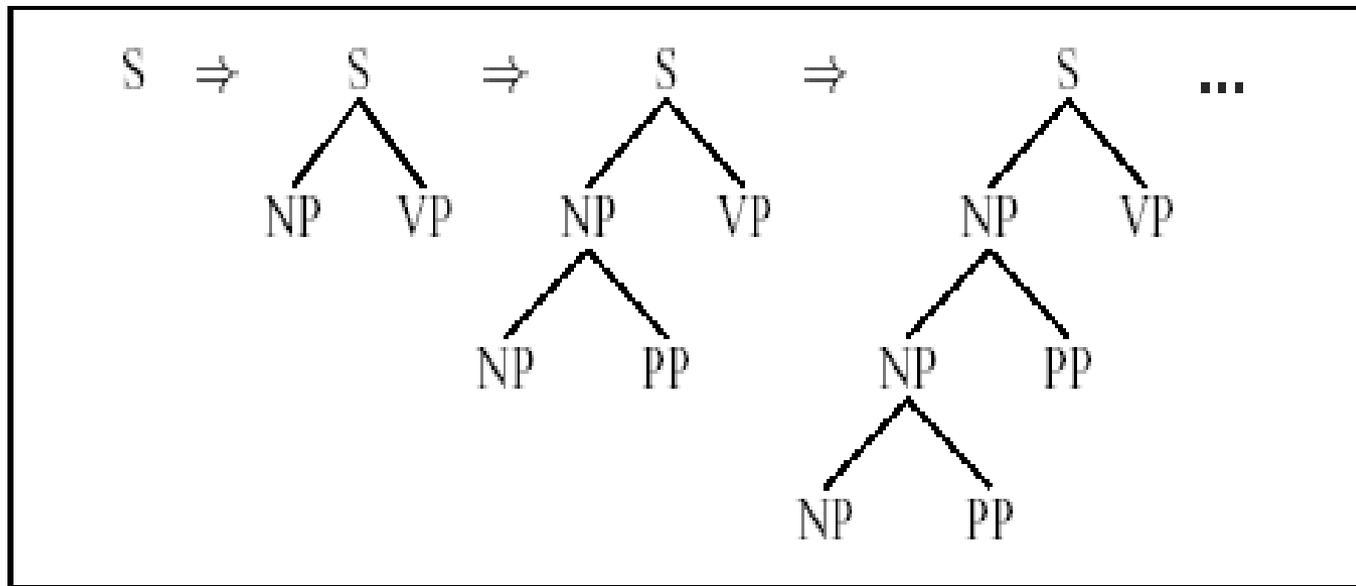
Summing Up

- Parsing is a search problem which may be implemented with many search strategies
- Top-Down vs. Bottom-Up Parsers
 - Both generate too many useless trees
 - Combine the two to avoid over-generation: Top-Down Parsing with Bottom-Up look-ahead
- Left-corner table provides more efficient look-ahead
 - Pre-compute all POS that can serve as the leftmost POS in the derivations of each non-terminal category

Have all the problems been solved?: Left Recursion

- Depth-first search will never terminate if grammar is left recursive (e.g. $NP \rightarrow NP PP$)

$$(A \xrightarrow{*} \alpha AB, \alpha \xrightarrow{*} \varepsilon)$$



Problems with the basic parser

- Left-recursion: rules of the type:

$NP \rightarrow NP PP$

solution: rewrite each rule of the form $A \rightarrow A\beta \mid \alpha$ using a new symbol: A' as

- $A \rightarrow \alpha A' \quad A' \rightarrow \beta A' \mid \varepsilon$

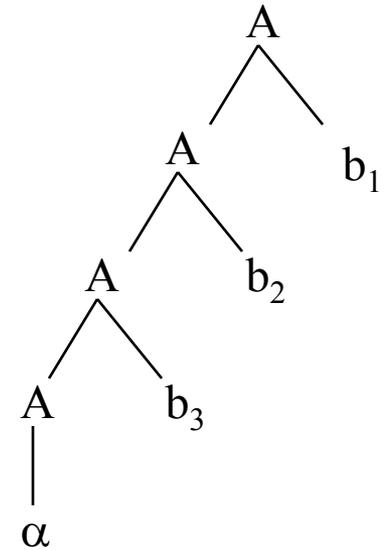
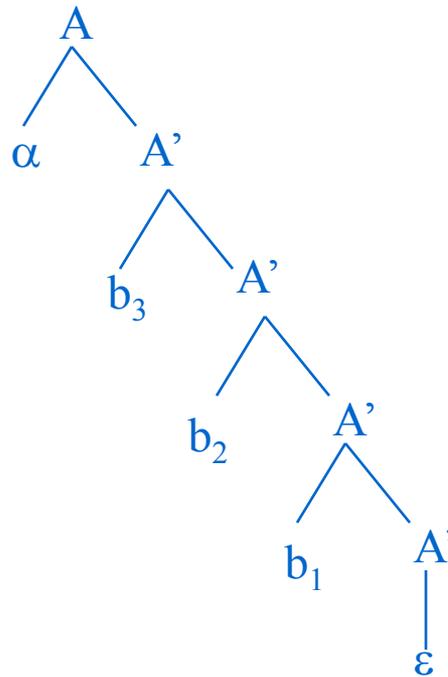
Left-recursion Problem

□ Rewrite

- $A \rightarrow A b_1$
- $A \rightarrow A b_2$
- $A \rightarrow A b_3$
- $A \rightarrow \alpha$

□ as

- $A \rightarrow \alpha A'$
- $A' \rightarrow b_1 A'$
- $A' \rightarrow b_2 A'$
- $A' \rightarrow b_3 A'$
- $A' \rightarrow \varepsilon$



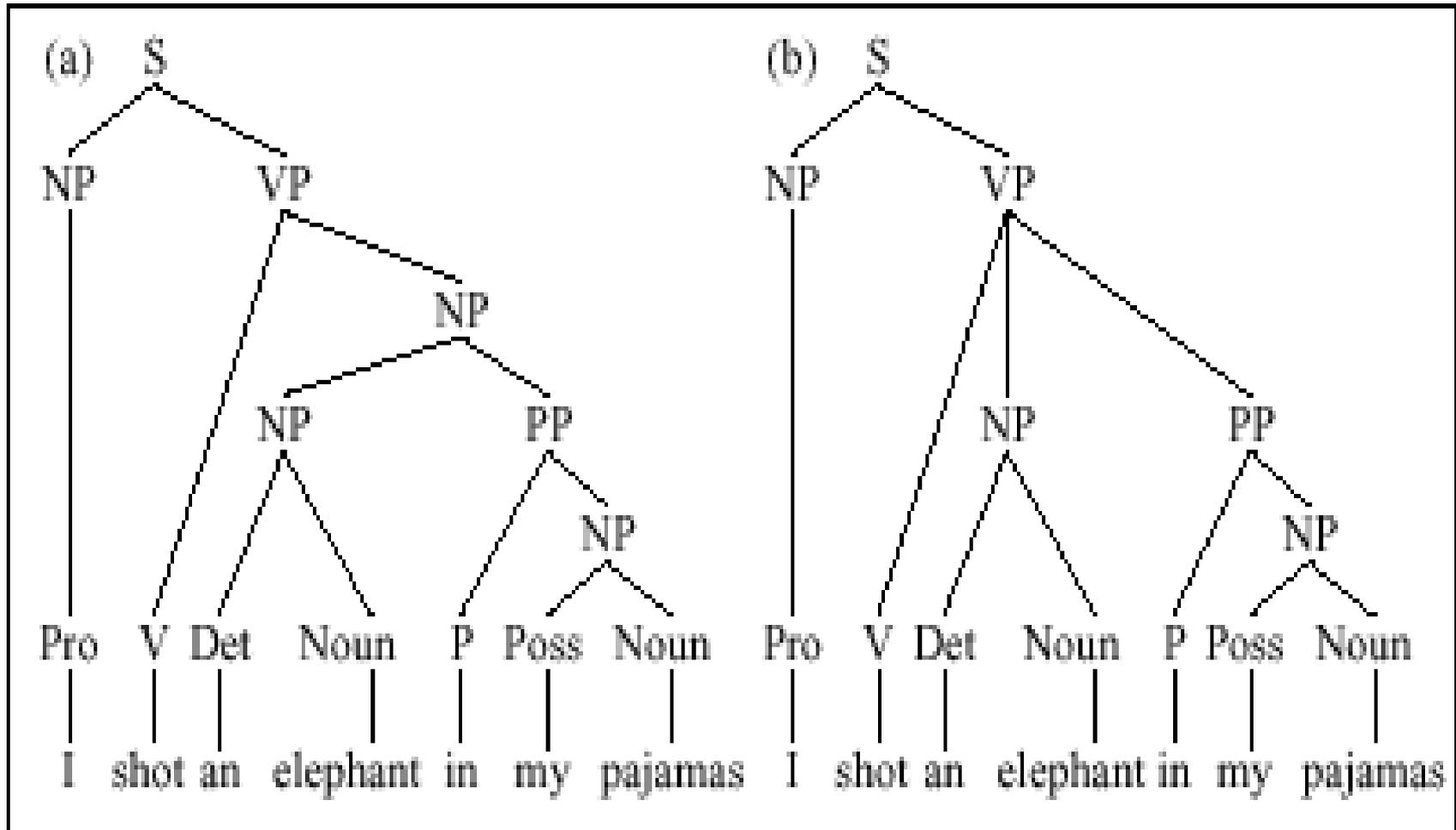
Structural ambiguity:

- Multiple legal structures
 - Attachment (e.g. I saw a man on a hill with a telescope)
 - Coordination (e.g. younger cats and dogs)
 - NP bracketing (e.g. Spanish language teachers)

Ambiguity

- Structural ambiguity occurs when a grammar assigns more than one possible parse trees to a sentence..
- **Attachment ambiguity** is when a particular constituent can be attached to the parse tree in more than one ways. E.g
 - I shot an elephant in my pajamas.
- **Coordination ambiguity** is when there are different sets of phrases that can be joined by a conjunction such as *and*.
 - [old [men and women]] *or* [old men] and [women]
- **Noun phrase bracketing ambiguity.**
 - [Dead [poets' society]] *or* [[Dead poets'] society]

Ambiguity



Ambiguity

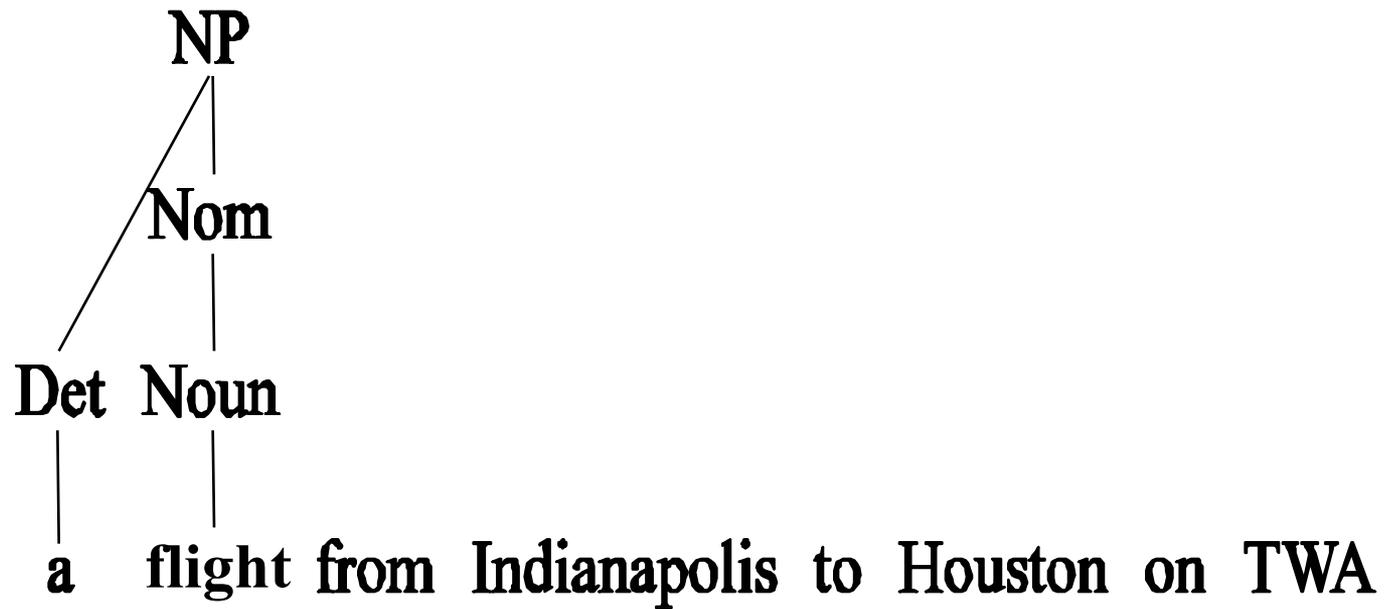
- Choosing the correct parse of a sentence among the possible parses is a task that requires additional semantic and statistical information. A parser without such information should return all possible parses.
- A sentence may lead to a huge number of parses. Sentences with many PP attachments like *Show me the meal on Flight UA 386 from San Francisco to Denver.* lead to an exponential number of parses.

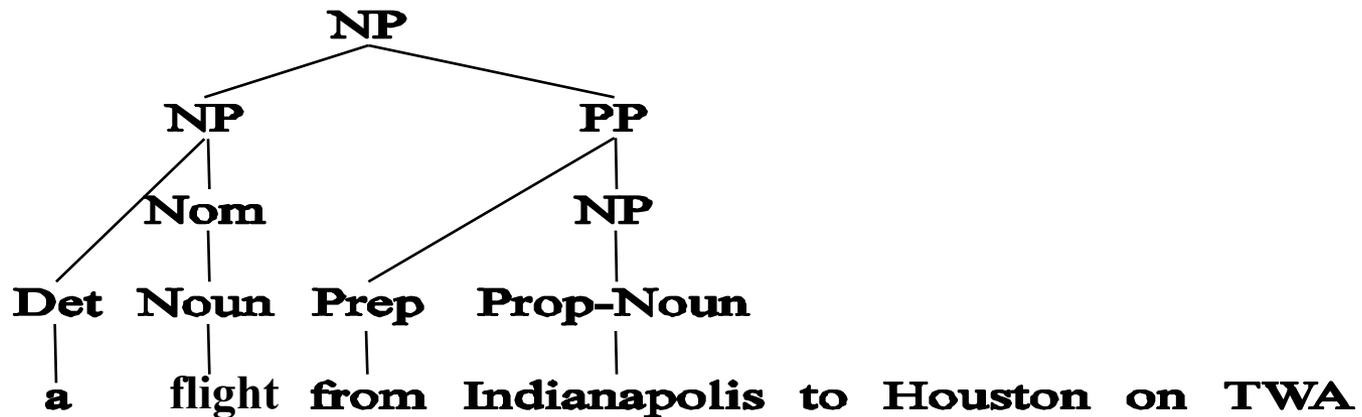
PPs	2	3	4	5	6	7	8
Parses	2	5	14	132	469	1430	4867

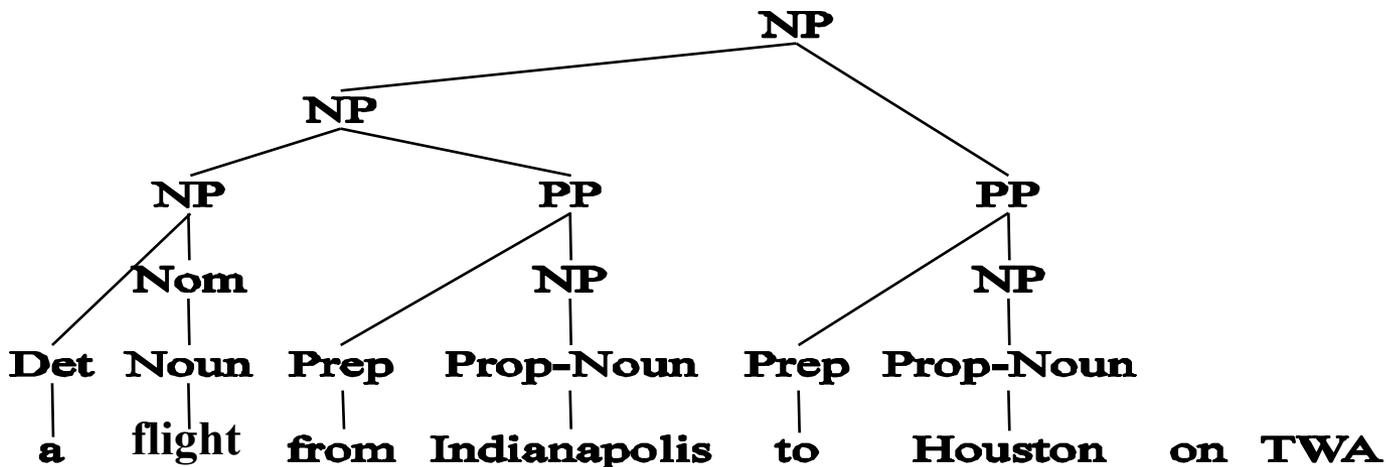
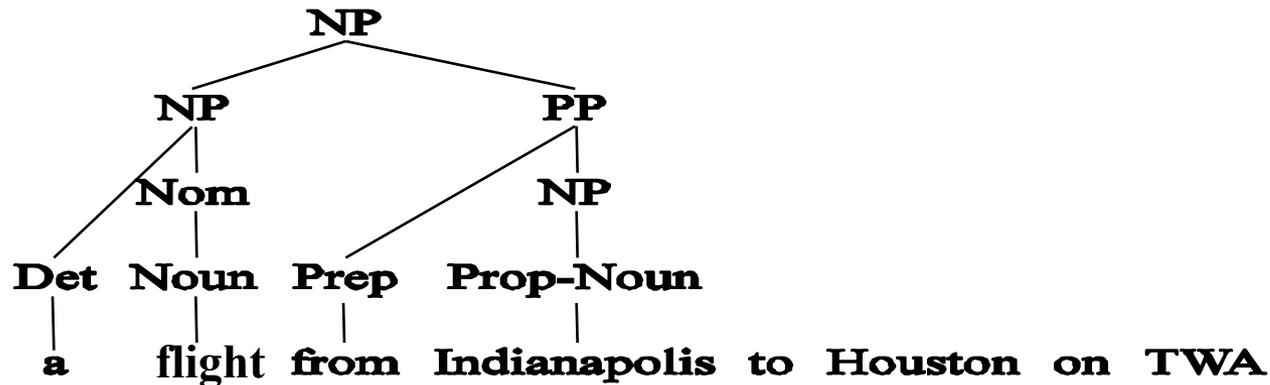
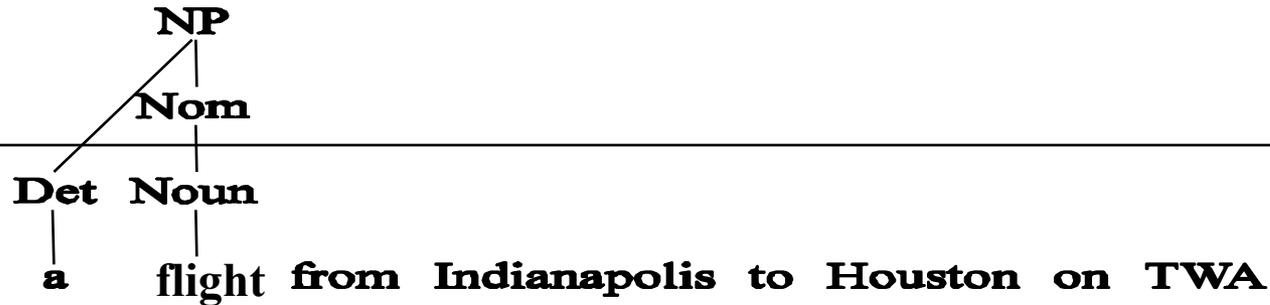
Avoiding Repeated Work

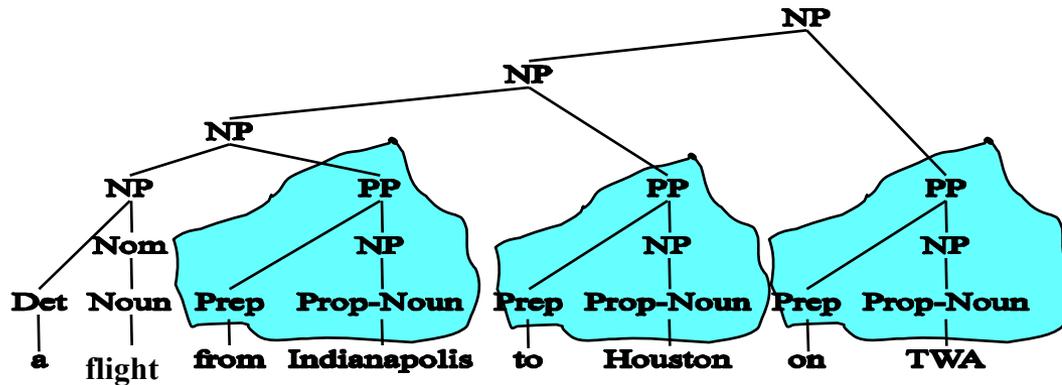
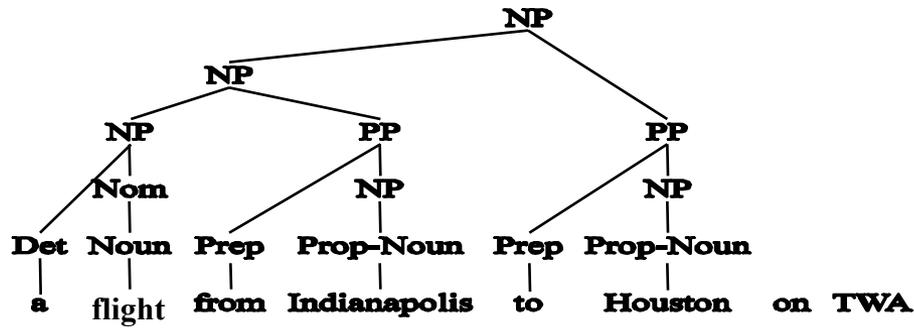
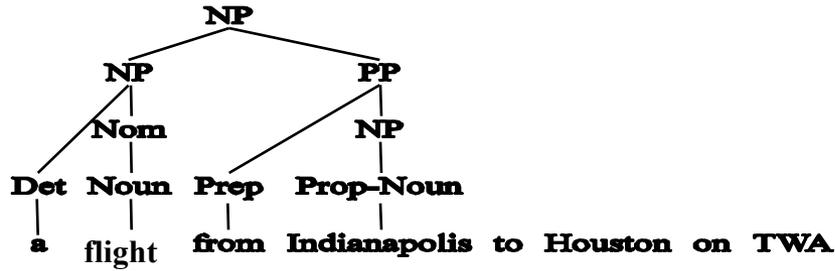
- Parsing is hard, and slow. It's wasteful to redo stuff over and over and over.
- Consider an attempt to top-down parse the following as an NP

A flight from Indianapolis to Houston on TWA









Dynamic Programming

- We need a method that fills a table with partial results that
 - Does not do (avoidable) repeated work
 - Does not hang in left-recursion
 - Solves an exponential problem in polynomial time (sort of)

Repeated Parsing of Subtrees

- The parser often builds valid trees for a portion of the input and then discards them during backtracking because they fail to cover all of the input. Later, the parser has to rebuild the same trees again in the search.

Repeated Parsing of Subtrees

- How many times each constituent in the Previous example sentence “A flight from Indianapolis to Houston on TWA” is built.

A flight	4
from Indianapolis	3
Houston	2
on TWA	1
A flight from Indianapolis	3
A flight from Indianapolis to Houston	2
A flight from Indianapolis to Houston on TWA	1

Dynamic Programming

- Create table of solutions to sub-problems (e.g. subtrees) as parse proceeds
- Look up subtrees for each constituent rather than re-parsing
- Since all parses implicitly stored, all available for later disambiguation
- Method:
 - Cocke-Younger-Kasami (CYK) (1960)
 - Graham-Harrison-Ruzzo (GHR) (1980)
 - Earley's (1970) algorithm
 - Next Class

Thank you

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