# CS344: Introduction to Artificial Intelligence 

Pushpak Bhattacharyya<br>CSE Dept.,<br>IIT Bombay

Lecture 20-21- Natural Language
Parsing

## Parsing of Sentences

## Are sentences flat linear structures? Why tree?

- Is there a principle in branching
- When should the constituent give rise to children?
- What is the hierarchy building principle?


## Structure Dependency: A Case Study

## > Interrogative I nversion

(1) J ohn will solve the problem.

Will J ohn solve the problem?

Declarative
(2) a. Susan must leave.
b. Harry can swim.

Interrogative
Must Susan leave?
Can Harry swim?
c. Mary has read the book. Has Mary read the book?
d. Bill is sleeping.

Is Bill sleeping?

The section, "Structure dependency a case study" here is adopted from a talk given by Howard Lasnik (2003) in Delhi university.

## I nterrogative inversion <br> Structure Independent ( $1^{\text {st }}$ attempt)

(3)I nterrogative inversion process

Beginning with a declarative, invert the first and second words to construct an interrogative.

Declarative
(4) a. The woman must leave.
b. A sailor can swim.
c. No boy has read the book.
d. My friend is sleeping.

Interrogative
*Woman the must leave?
*Sailor a can swim?
*Boy no has read the book?
*Friend my is sleeping?

## I nterrogative inversion

## correct pairings

- Compare the incorrect pairings in (4) with the correct pairings in (5):


## Declarative

(5) a. The woman must leave.
b. A sailor can swim.
c. No boy has read the book. Has no boy read the book?
d. My friend is sleeping.

I nterrogative
Must the woman leave?
Can a sailor swim?

Is my friend sleeping?

## I nterrogative inversion

## Structure Independent (2 ${ }^{\text {nd }}$ attempt)

## (6) I nterrogative inversion process:

- Beginning with a declarative, move the auxiliary verb to the front to construct an interrogative.


## Declarative

(7) a. Bill could be sleeping.
b. Mary has been reading.
c. Susan should have left.

Interrogative
*Be Bill could sleeping?
Could Bill be sleeping?
*Been Mary has reading?
Has Mary been reading?
*Have Susan should left? Should Susan have left?

## Structure independent ( $3^{\text {rd }}$ attempt):

(8) Interrogative inversion process

- Beginning with a declarative, move the first auxiliary verb to the front to construct an interrogative.


## Declarative

Interrogative
(9) a. The man who is here can swim. *Is the man who here can swim? b. The boy who will play has left. *Will the boy who play has left?

## Structure Dependent Correct Pairings

- For the above examples, fronting the second auxiliary verb gives the correct form:

Declarative
Interrogative
(10) a.The man who is here can swim. Can the man who is here swim?
b.The boy who will play has left. Has the boy who will play left?

## Natural transformations

(11) Does the child acquiring English learn these properties?
(12) We are not dealing with a peculiarity of English. No known human language has a transformational process that would produce pairings like those in (4), (7) and (9), repeated below:
(4) a. The woman must leave.
(7) a. Bill could be sleeping. *Be Bill could sleeping?
(9) a. The man who is here can swim. *Is the man who here can swim?

## Deeper trees needed for capturing sentence structure


[ The big book of poems with the Blue cover] is on the table.

## Other languages



## Other languages: contd



## PPs are at the same level: flat with respect to the

 head word "book"
[ The big book of poems with the Blue cover] is on the table.

## "Constituency test of Replacement" runs into problems

- One-replacement:
- / bought the big [book of poems with the blue cover] not the small [one]
- One-replacement targets book of poems with the blue cover
- Another one-replacement:
- / bought the big [book of poems] with the blue cover not the small [one] with the red cover
- One-replacement targets book of poems


## More deeply embedded structure



## To target $\mathrm{N}_{1}{ }^{\prime}$

- I want [ ${ }_{N P}$ this [ ${ }_{N}$ big book of poems with the red cover] and not [ ${ }_{N}$ that [ ${ }_{N}$ one]]


## Bar-level projections

- Add intermediate structures
- NP $\rightarrow$ (D) N'
- $\mathrm{N}^{\prime} \rightarrow$ (AP) $\mathrm{N}^{\prime} \mid \mathrm{N}^{\prime}$ (PP) | N (PP)
- () indicates optionality


## New rules produce this tree



## As opposed to this tree



## V-bar

- What is the element in verbs corresponding to one-replacement for nouns
- do-so or did-so


## As opposed to this tree



## I [eat beans with a fork]



No constituent that groups together V and NP and excludes PP

## constituents

- I [eat beans] witt a fork but Ram [does so] with a spoon



## How to target $\mathrm{V}_{1}{ }^{\prime}$

- I [eat beans withpa fork], and Ram [does so] too.



## Parsing Algorithms

## A simplified grammar

- $\mathrm{S} \rightarrow \mathrm{NP}$ VP
- NP $\rightarrow$ DT N|N
- VP $\rightarrow$ VADV|V


## A segment of English Grammar

- $\mathrm{S}^{\prime} \rightarrow$ (C) S
- $\mathrm{S} \rightarrow$ \{NP/S'\} VP
- VP $\rightarrow$ (AP+) (VAUX) V (AP+) ( $\left\{\mathrm{NP} / \mathrm{S}^{\prime}\right\}$ ) (AP+) (PP+) (AP+)
- NP $\rightarrow$ ( D ) (AP+) $\mathrm{N}(\mathrm{PP}+$ )
- PP $\rightarrow$ P NP
- $A P \rightarrow(A P) A$


## Example Sentence



Lexicon:
People - N, V
Laugh - N, V


## Top-Down Parsing

State

1. ((S) 1)

Position of input pointer
2. ((NP VP)1)

3a. ((DT N VP)1)
((N VP) 1)
3b. ((N VP)1)
4. ((VP)2)

Backup State
Action

5a. ((V ADV)2)
((V)2)
6. ((ADV)3)
((V)2)

5b. ((V)2)
6. ((.)3)
-
-

Consume "People"

Consume "laugh"

Consume "laugh"

Termination Condition : All inputs over. No symbols remaining. Note: Input symbols can be pushed back.

## Discussion for Top-Down <br> Parsing

- This kind of searching is goal driven.
- Gives importance to textual precedence (rule precedence).
- No regard for data, a priori (useless expansions made).


## Bottom-Up Parsing

## Some conventions:



## Bottom-Up Parsing (pictorial representation)



$$
\begin{gathered}
\mathrm{N}_{12} \\
\mathrm{~V}_{12} \\
\mathrm{NP}_{12}->\mathrm{N}_{12}{ }^{\circ} \\
\mathrm{VP}_{12}->\mathrm{V}_{12} \circ \\
\mathrm{~S}_{1 ?}->\mathrm{NP}_{12}{ }^{\circ} \mathrm{VP}_{2 ?}
\end{gathered}
$$

$$
\begin{gathered}
N_{23} \\
V_{23} \\
{N P_{23}}^{->} N_{23}^{\circ}{ }^{\circ} \\
\mathrm{VP}_{23}->V_{23}{ }^{\circ}
\end{gathered}
$$

## Problem with Top-Down Parsing

- Left Recursion
- Suppose you have A-> AB rule.

Then we will have the expansion as follows:
. ((A)K) $->((A B) K)->((A B B) K) . . . . .$.

## Combining top-down and bottom-up strategies

## Top-Down Bottom-Up Chart Parsing

- Combines advantages of top-down \& bottomup parsing.
- Does not work in case of left recursion.
- e.g. - "People laugh"
- People - noun, verb
- Laugh - noun, verb
- Grammar -

$$
\begin{aligned}
& \mathrm{S} \rightarrow \mathrm{NP} \mathrm{VP} \\
& \mathrm{NP} \rightarrow \mathrm{DT} \mathrm{~N} \mid \mathrm{N} \\
& \mathrm{VP} \rightarrow \mathrm{~V} \mathrm{ADV} \mid \mathrm{V}
\end{aligned}
$$

## Transitive Closure



## Arcs in Parsing

- Each arc represents a chart which records
- Completed work (left of .)
- Expected work (right of .)


## Example



## Dealing With Structural Ambiguity

- Multiple parses for a sentence
- The man saw the boy with a telescope.
- The man saw the mountain with a telescope.
- The man saw the boy with the ponytail.

At the level of syntax, all these sentences are ambiguous. But semantics can disambiguate $2^{\text {nd }} \& 3^{\text {rd }}$ sentence.

## Prepositional Phrase (PP) Attachment Problem

$\mathrm{V}-\mathrm{NP}_{1}-\mathrm{P}-\mathrm{NP}_{2}$
(Here P means preposition)
$\mathrm{NP}_{2}$ attaches to $\mathrm{NP}_{1}$ ?
or $\mathrm{NP}_{2}$ attaches to V ?

## Parse Trees for a Structurally Ambiguous Sentence

Let the grammar be -
$\mathrm{S} \rightarrow \mathrm{NP}$ VP
NP $\rightarrow$ DT N \| DT N PP
$\mathrm{PP} \rightarrow \mathrm{PNP}$
$\mathrm{VP} \rightarrow \mathrm{V}$ NP PP \| V NP
For the sentence,
"I saw a boy with a telescope"

## Parse Tree s $_{\text {- }} 1$ saw Det <br> a telescope

## Parse Tree $\bar{s}^{2}$  <br> a telescope

