

# Understanding Sentences

Informatics 1 CG: Lecture 14

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February 11, 2016

Reading:

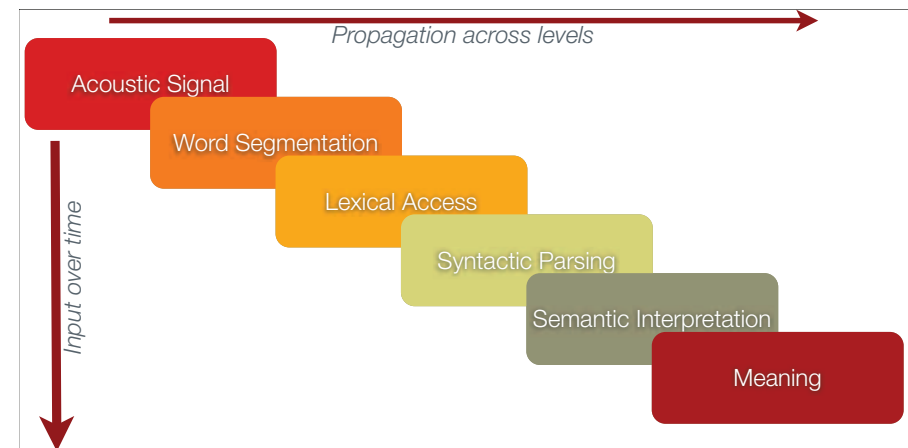
Trevor Harley (2001). *The Psychology of Language*,  
Chapter 9

## Recap: The Associationist View of Word Meaning

- You shall know a word by the company it keeps (Firth, 1957).
- **Distributional hypothesis** about word meaning: the context surrounding a given word provides information about its meaning.
- Experimental evidence indicates that the cognitive system is sensitive to distributional information.
- Construction of vector spaces.
- Latent Semantic Analysis.

What happens after we recognize a word? How do we put together words to form meaningful sentences?

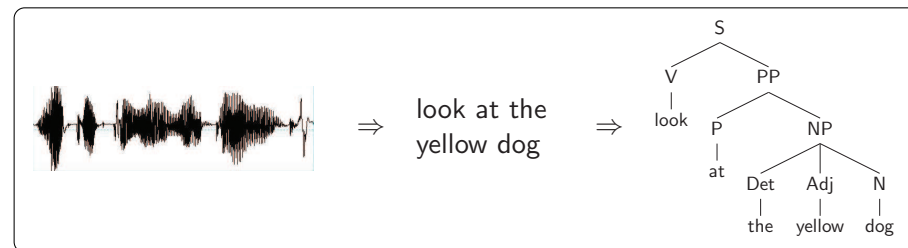
## Sound to Meaning



How do we understand a sentence? First step is to “parse” it.

- Parsing takes place **unconsciously** (involves finding the subjects, verbs, objects and so on).
- A parser is the mental program that analyzes sentence structure during language comprehension.
- Ultimately parsing helps us to **interpret** sentences during language comprehension.

- 1 The ghost chased the vampire.
- 2 The vampire chased the ghost.
- 3 The vampire was chased by the ghost.



Today we will look at parsing, which turns a sequence of words into a **syntactic representation**.

Syntactic representations make explicit how the words in a sentence relate to each other.

## Phrase Structure Grammar

In order to build syntactic representations, we need a grammar. The simplest type of grammar is a **context-free grammar**:

### Phrasal categories:

S: sentence, NP: noun phrase, VP: verb phrase

### Lexical categories (aka parts of speech):

Det: determiner, N: noun, V: verb

### Phrase structure rules:

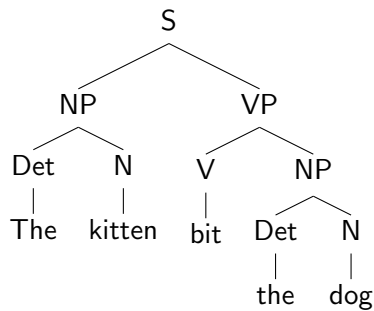
- |    |   |       |     |   |        |
|----|---|-------|-----|---|--------|
| S  | → | NP VP | Det | → | the    |
| NP | → | Det N | N   | → | kitten |
| VP | → | V NP  | N   | → | dog    |
|    |   |       | V   | → | bit    |

## Derivations and Syntax Trees

A **derivation** is the sequence of strings that results from applying a sequence of grammar rules:

**Derivation**  
 $S \rightarrow NP VP \rightarrow NP V NP \rightarrow NP V Det N \rightarrow NP bit Det N \rightarrow NP bit Det dog \rightarrow NP bit the dog \rightarrow Det N bit the dog \rightarrow the N bit the dog \rightarrow the kitten bit the dog$

Derivations are represented as **syntax trees**:



Syntactic ambiguity: a sentence can have multiple syntax trees.  
**These correspond to different interpretations.**

A **parser** takes a sentence and computes a **syntax tree** for it, given a **grammar**. This is a prerequisite for assigning an interpretation to the sentence.

The cognitive device that performs syntactic parsing is called **human sentence processing mechanism (HSPM)**.

Parsing is **incremental**: the HSPM builds structures word by word as the input arrives.

But what if more than one structure is compatible with the input:

- at the current point but not later: **local ambiguity**;
- for the input overall: **global ambiguity**.

## Global Ambiguity

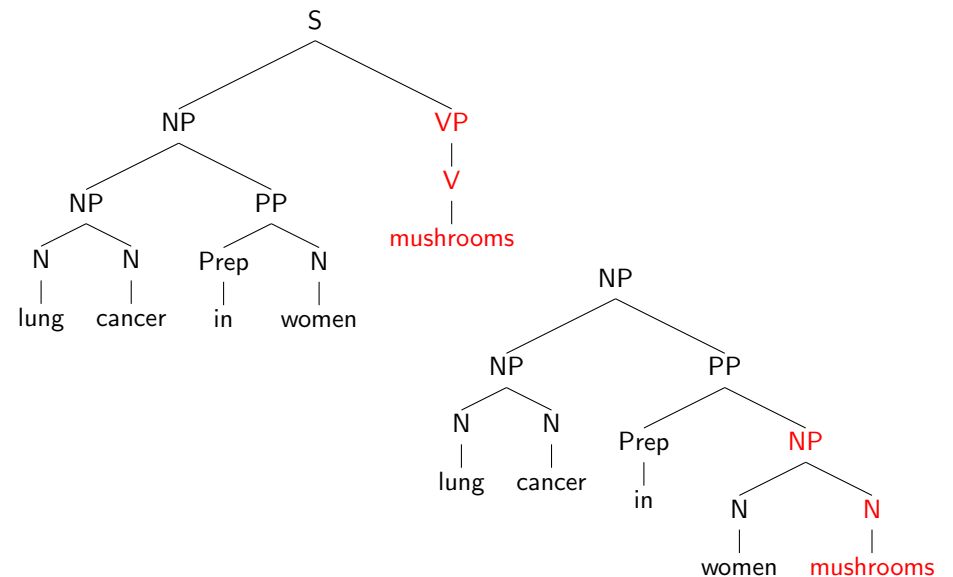
Given a grammar, strings that have more than one complete syntax tree (parse) are said to have global structural ambiguity.

### Examples

- 1 She sat on the chair covered in dust.
- 2 I put the book on the table in the kitchen.
- 3 Lung cancer in women mushrooms.

Examples from [http://www.fun-with-words.com/ambiguous\\_garden\\_path.html](http://www.fun-with-words.com/ambiguous_garden_path.html)

## Global Ambiguity

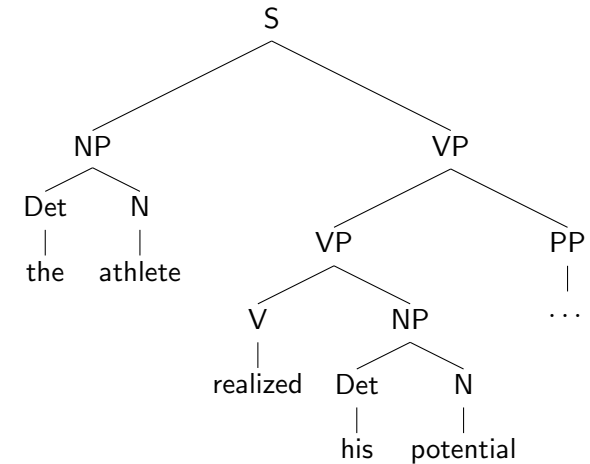


When only an initial substring is structurally ambiguous, the sentence is said to have **local** ambiguity; once the remainder of the string is known, only one tree remains possible.

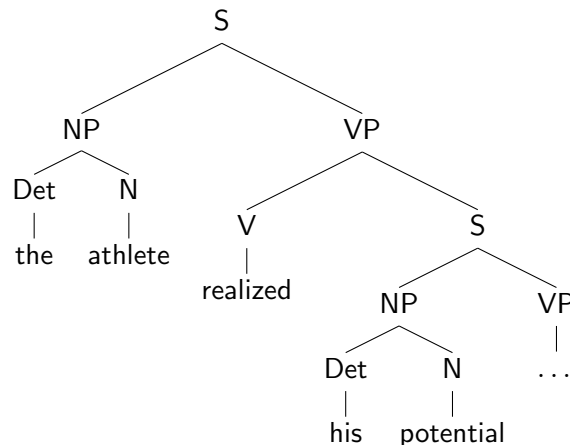
### Example

The athlete realized his potential ...

- a. ... at the competition.
- b. ... could make him a world-class sprinter



The athlete realized his potential **at the competition.**



The athlete realized his potential **could make him a world-class sprinter.**

This is an example of a **garden path**:

- both structures are compatible with the input up until *potential*; only the next word disambiguates;
- however, the processor commits to a single (wrong) structure early on, and trips up when later input is inconsistent with that structure;
- presumably, the processor now has to compute a new structure that is consistent with the input;
- garden path sentences result in longer reading times, reverse eye-movements, lower comprehension accuracies, etc.;
- some garden paths are so strong that the parser fails to recover from them.

## More examples of garden paths

- 1 I convinced her **that** children are noisy.
- 2 Until the police **make the** arrest , the drug dealers control the street.
- 3 The old **people** man the boat.
- 4 **The Fat that** people eat accumulates **in their bodies**.
- 5 The cotton **that** clothing is usually made of grows in Mississippi.
- 6 The prime **people** number few.

Examples from [http://www.fun-with-words.com/ambiguous\\_garden\\_path.html](http://www.fun-with-words.com/ambiguous_garden_path.html)

- 1 What mechanism is used to construct interpretations?
- 2 What information is used to determine preferred structure?

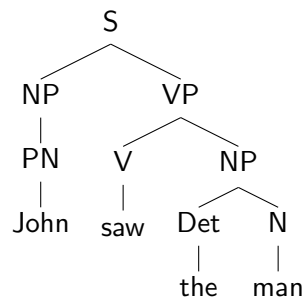
## Garden Path Theory

Parsing is **autonomous** and takes place in **two stages**; during stage 1 **only syntactic information** is taken into account; stage 2 takes additional information sources into account if single analysis turns out to be incorrect.

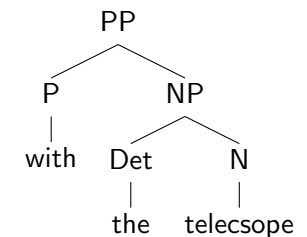
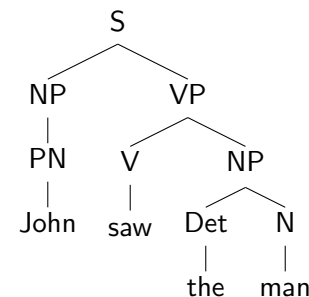
## Constraint-based Theory

Parsing is **interactive** and takes place in **one stage**. Processor uses **multiple sources** of information at once, structure most supported by constraints is active, plausible alternatives also remain active.

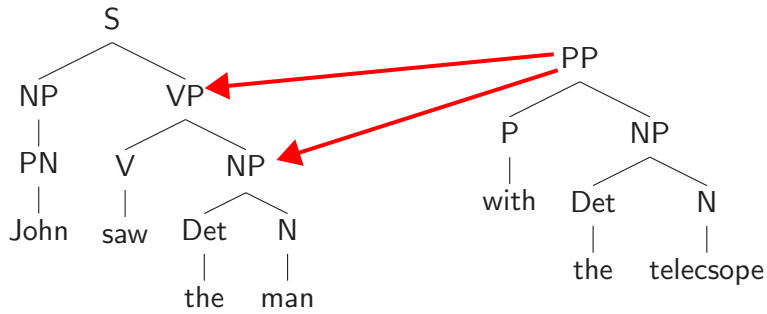
# The Garden Path Theory (Frazier, 1987)



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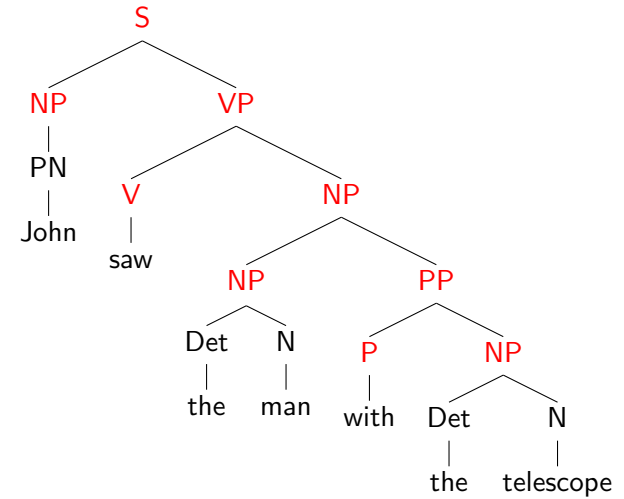


# The Garden Path Theory (Frazier, 1987)



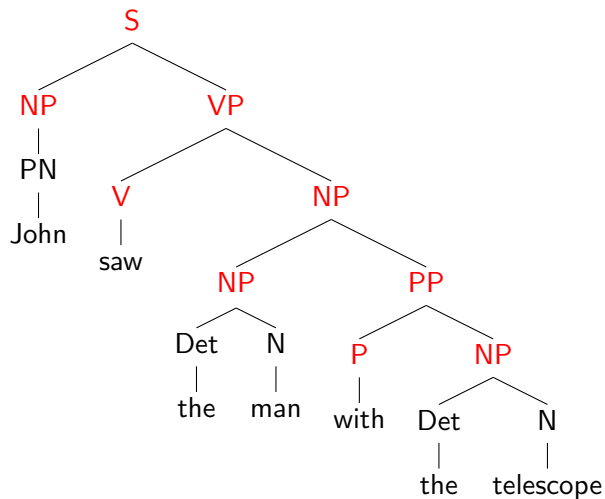
Which attachment do people initially prefer?

# First Strategy: Minimal Attachment



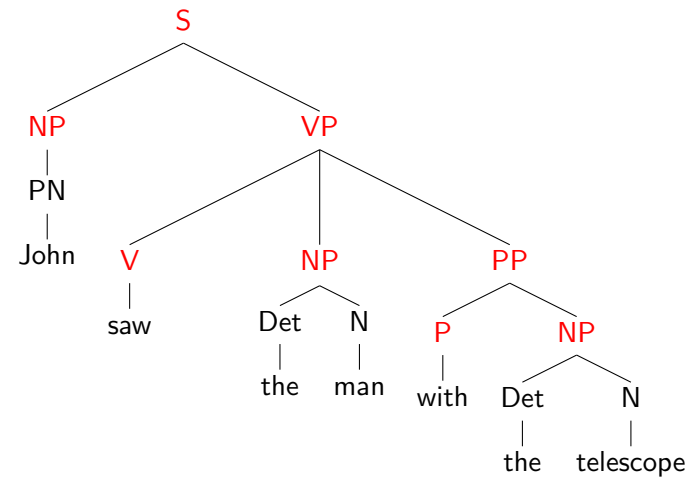
Adopt structure containing fewest number of nodes

# First Strategy: Minimal Attachment



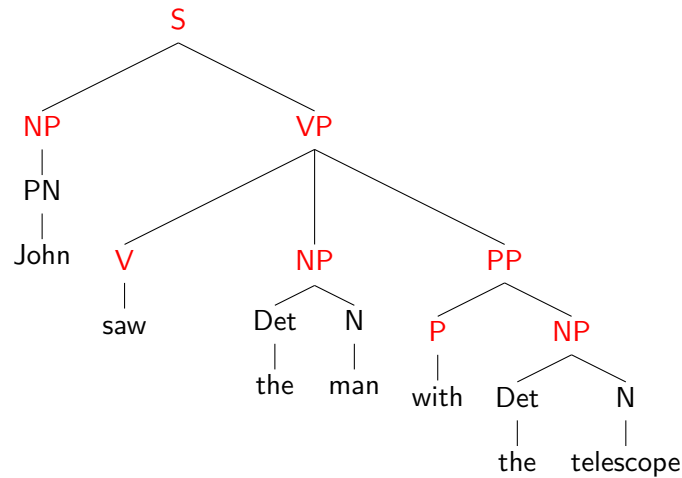
Adopt structure containing fewest number of nodes

# First Strategy: Minimal Attachment



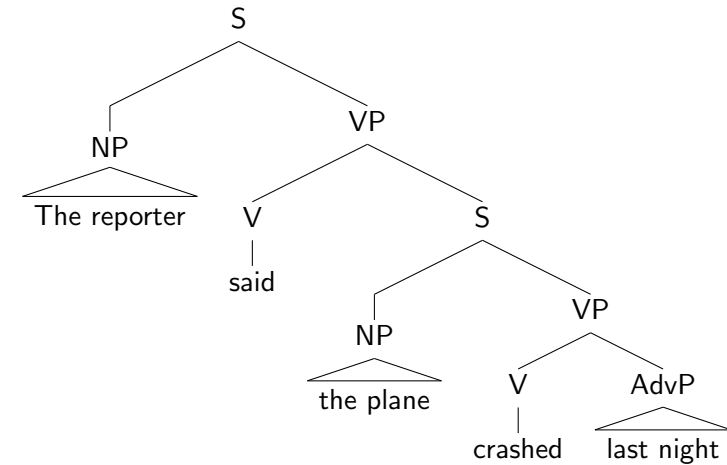
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## First Strategy: Minimal Attachment



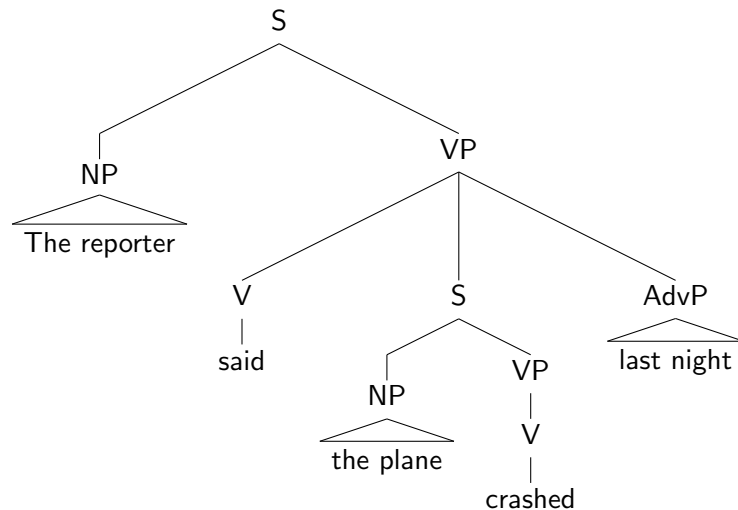
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## Second Strategy: Late Closure



Add incoming material to clause/phrase currently processed.

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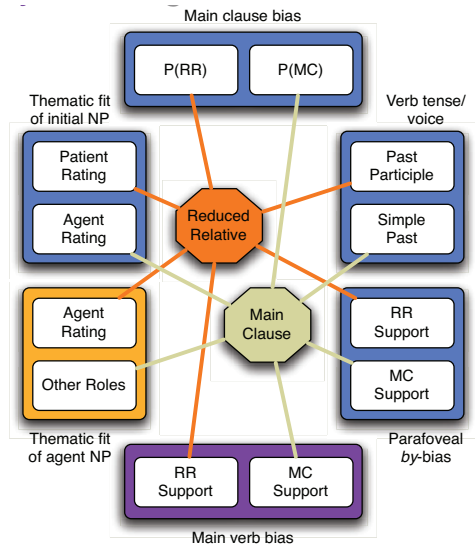
## The Competition Integration Model (McRae et al., 1998)

Diverse constraints (linguistic and conceptual) are brought to bear simultaneously in ambiguity resolution.

- Model assumes all possible analyses are constructed
- Constraints provide **probabilistic** support for analyses
- There are multiple processing cycles given each input
- On each cycle, evidence in support of the syntactic alternatives is computed.
- Competition ends when the activation of one alternative reaches a threshold.
- Processing time is assumed to be a linear function of the duration of competition.

## The Competition Integration Model (McRae et al., 1998)

The crook arrested by the detective was guilty of taking bribes.



## Summary

- Sentence processing (parsing) is the task of assigning a structure to a string of words;
- Human sentence processing is incremental (word by word);
- It can encounter global vs local ambiguity.
- Garden paths derive from local ambiguities that are hard to resolve; they lead to longer processing times
- Theories of sentence processing: serial vs parallel, autonomous vs. interactive.