## Linguistic structures:

#### 1.Phrase structure Grammar:

This method includes interpreting sentences as a collection of phrases.

Example:

There are different phrase structures for different languages.

In english:

1. Noun phrase: NP: Det. - (Adj) - N - PP

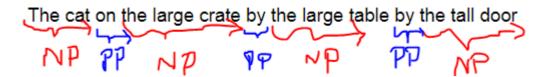
2. Preposition phrase: PP: Pre - NP

3. Verb phrase: VP: V - NP

4.

Where: ( Adj ) means optional adjective, Det are determiners ( The, That )

Prepositions (on, over, under, etc.)



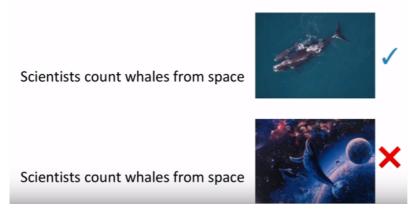
# 2. Dependency structure:

This deals with how words depend on ( are either modifiers or dependencies ) of other words.



Here look is the root word and all the other words are its modifiers or modifiers of modifiers.

The ambiguity attached with PP:



This type of ambiguity where we don't know what a modifier is modifying increases exponentially with the length of the sentence.

Ambiguity with coordination scope:

Shuttle veteran and longtime NASA executive Fred Gregory appointed to board

Or,

Shuttle veteran and longtime NASA executive Fred Gregory appointed to board

Lol

# **Adjectival Modifier Ambiguity**

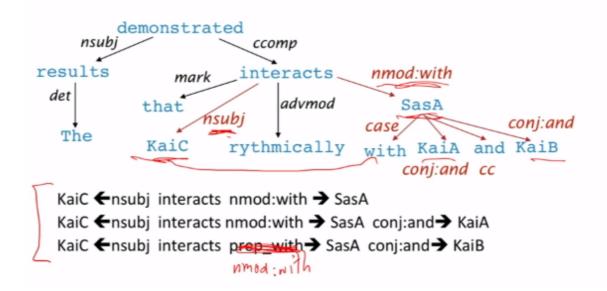




#### Rio de Janeiro

Mutilated body washes up on Rio beach to be used for Olympics beach volleyball

## Dependency paths

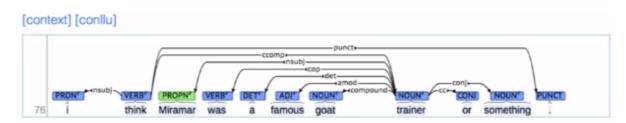


#### Annotated data:

Starting off, building a treebank seems a lot slower and less useful than building a grammar

## But a treebank gives us many things

- · Reusability of the labor
  - · Many parsers, part-of-speech taggers, etc. can be built on it
  - · Valuable resource for linguistics
- · Broad coverage, not just a few intuitions
- · Frequencies and distributional information
- · A way to evaluate systems



## Dependency parsing:

- A sentence is parsed by choosing for each word what other word (including ROOT) is it a dependent of
- · Usually some constraints:
  - · Only one word is a dependent of ROOT
  - Don't want cycles A → B, B → A
- This makes the dependencies a tree
- Final issue is whether arrows can cross (non-projective) or not



This type of crossing happens with delayed modifiers. We could have just said I'll give a talk on bootstrapping tomorrow.



# **Methods of Dependency Parsing**

Dynamic programming

Eisner (1996) gives a clever algorithm with complexity O(n<sup>3</sup>), by producing parse items with heads at the ends rather than in the middle

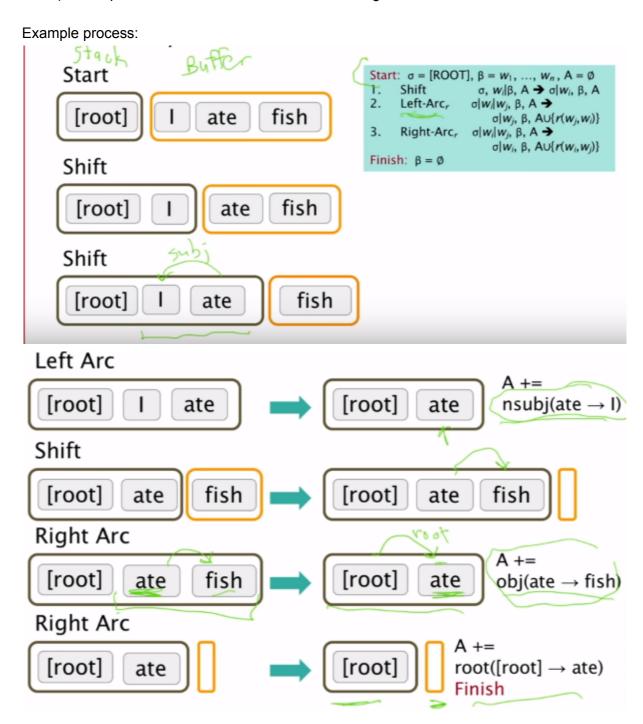
Graph algorithms

You create a Minimum Spanning Tree for a sentence McDonald et al.'s (2005) MSTParser scores dependencies independently using an ML classifier (he uses MIRA, for online learning, but it can be something else)

- 3. Constraint Satisfaction
  - Edges are eliminated that don't satisfy hard constraints. Karlsson (1990), etc.
- "Transition-based parsing" or "deterministic dependency parsing" Greedy choice of attachments guided by good machine learning classifiers MaltParser (Nivre et al. 2008). Has proven highly effective.

## Arc standard transition based parser:

In this we basically have a stack and a buffer and in every step we have an option to pull a word from buffer into stack, draw a left arc: word left of the second word ( which is the first word ) is a dependent of the second word, or draw a right arc.



This is where we use machine learning. We can just use a classifier algo.