

Dependency Parsing

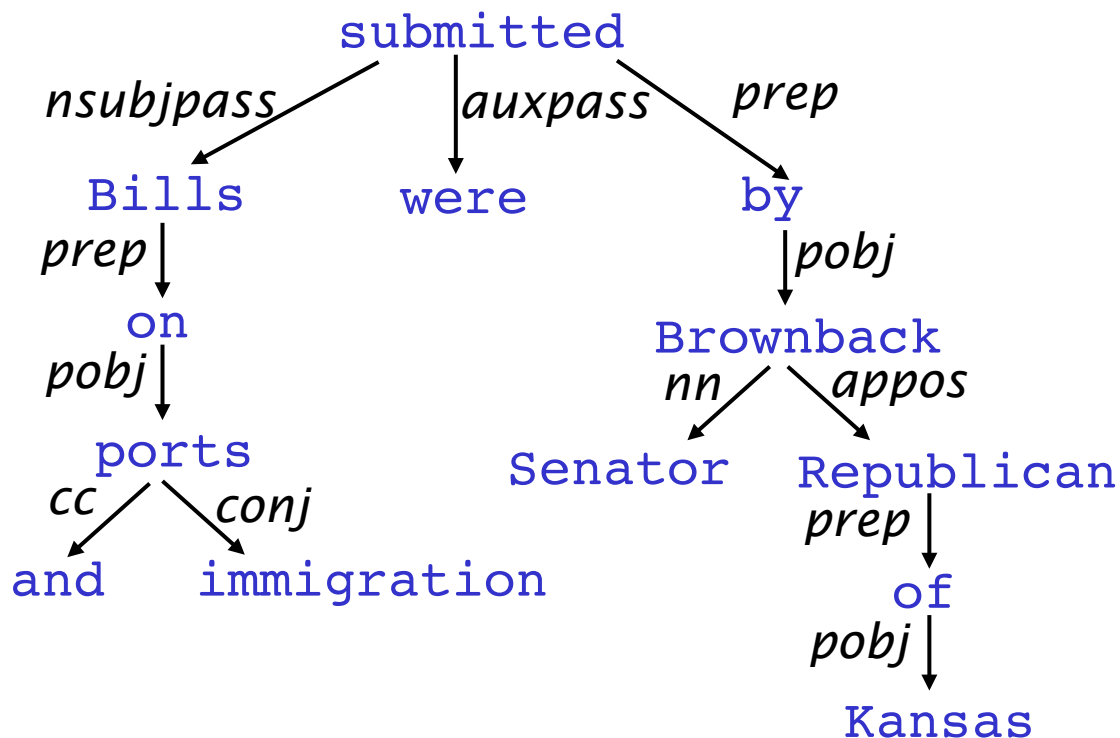
Introduction



Dependency Grammar and Dependency Structure

Dependency syntax postulates that syntactic structure consists of lexical items linked by binary asymmetric relations (“arrows”) called dependencies

The arrows are commonly **typed** with the name of grammatical relations (subject, prepositional object, apposition, etc.)



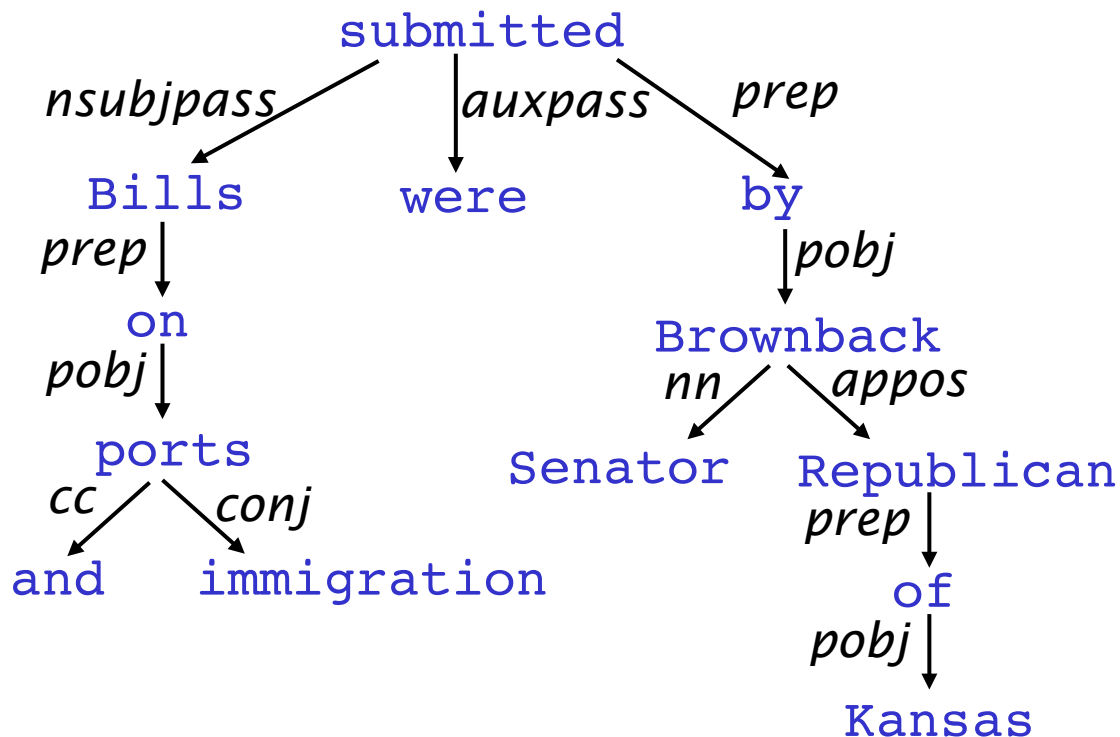


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The arrow connects a **head** (governor, superior, regent) with a **dependent** (modifier, inferior, subordinate)

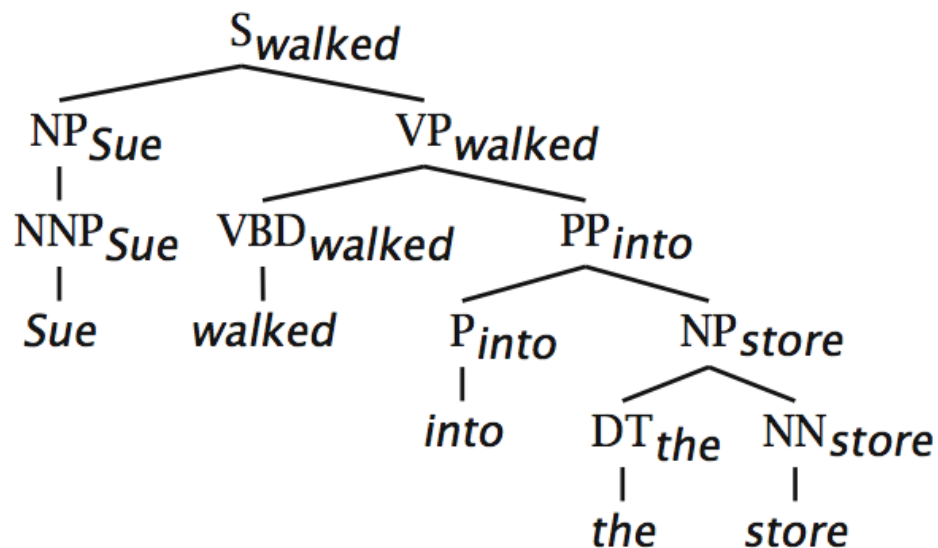
Usually, dependencies form a tree (connected, acyclic, single-head)





Relation between phrase structure and dependency structure

- A dependency grammar has a notion of a head. Officially, CFGs don't.
- But modern linguistic theory and all modern statistical parsers (Charniak, Collins, Stanford, ...) do, via hand-written phrasal "head rules":
 - The head of a Noun Phrase is a noun/number/adj/...
 - The head of a Verb Phrase is a verb/modal/....
- The head rules can be used to extract a dependency parse from a CFG parse
- The closure of dependencies give constituency from a dependency tree
- But the dependents of a word must be at the same level (i.e., "flat") – there can be no VP!





Methods of Dependency Parsing

1. Dynamic programming (like in the CKY algorithm)

You can do it similarly to lexicalized PCFG parsing: an $O(n^5)$ algorithm

Eisner (1996) gives a clever algorithm that reduces the complexity to $O(n^3)$, by producing parse items with heads at the ends rather than in the middle

2. Graph algorithms

You create a Maximum Spanning Tree for a sentence

McDonald et al.'s (2005) MSTParser scores dependencies independently using a ML classifier (he uses MIRA, for online learning, but it could be MaxEnt)

3. Constraint Satisfaction

Edges are eliminated that don't satisfy hard constraints. Karlsson (1990), etc.

4. "Deterministic parsing"

Greedy choice of attachments guided by machine learning classifiers

MaltParser (Nivre et al. 2008) – discussed in the next segment



Dependency Conditioning Preferences

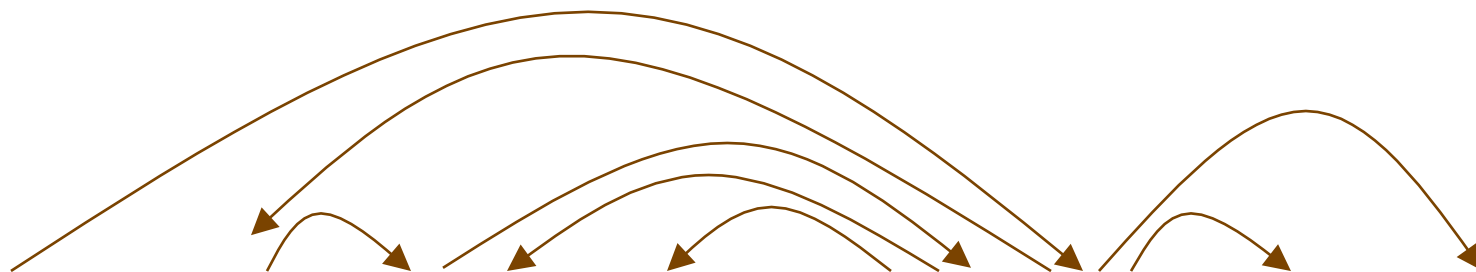
What are the sources of information for dependency parsing?

1. Bilexical affinities [issues → the] is plausible
2. Dependency distance mostly with nearby words
3. Intervening material

Dependencies rarely span intervening verbs or punctuation

4. Valency of heads

How many dependents on which side are usual for a head?



ROOT Discussion of the outstanding issues was completed .

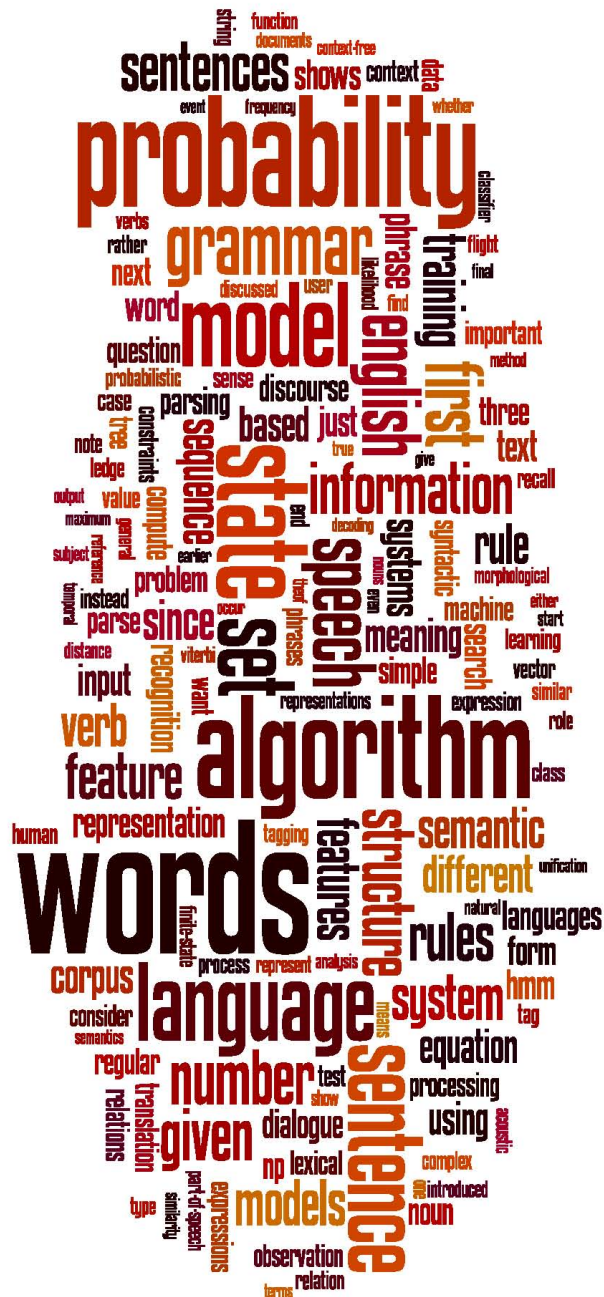


Quiz question!

- Consider this sentence:

Retail sales drop in April cools afternoon
market trading.

- Which word are these words a dependent of?
 1. sales
 2. April
 3. afternoon
 4. trading



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