# Part of speech tagging

### Part of speech

A category of words that play similar roles within the syntactic structure of a sentence.

## Part of speech tagging

Part of speech tagger = program that tags each word in sentence with its part of speech.

Can be approached using supervised learning (requires training data).

Ambiguity (words can have different tags) → combinatorial explosion

### **Accuracy**

Diagonal / whole

### **Precision**

Exact match / column

#### Recall

Exact match / row

## **Hidden Markov model (HMM)**

Words have probabilities tied to each of its tags (jag  $\rightarrow$  NN, jag  $\rightarrow$  PN)

Tags have probabilities for its next tag (NN  $\rightarrow$  VB)

HMM has two probabilities: transitional (tag2 given tag1) and output (word given tag).

Transitional first, then output at every junction.

P(VB | PN) → amount of PN followed by VB / all occurences of VB

 $P(jag \mid PN) \rightarrow amount of jag when PN / all words that are PN$ 

## **Multi-class perceptron**

#### **Feature window**

HMM looks back once; might want to look further, or look forward. But dont want to see too much (efficiency).

Need a feature window. Feature window sees x in front and x in back of the current word.

# Evaluate a part-of-speech tagger based on accuracy, precision, and recall

# Compute the probability of a tagged sentence in a hidden Markov model

Probability of tagged sentence → product of transition and output (transition \* output)

# **Syntactic Analysis**

### Phrase structure tree

Sentence divides into parts (S  $\rightarrow$  Noun Phrase, Verb Phrase), which in turn divide into parts (NP  $\rightarrow$  Pro  $\rightarrow$  "I", VP  $\rightarrow$  Verb, NP).

## **Dependency tree**

"This word depends on that word". Verbs have subjects and objects, etc.

## Probabilistic context-free grammar (PCFG)

Words within sentences form phrases:

"Kim read [a book]", "Kim read [a very interesting book about grammar]"

Syntactic head → most important word in sentence.

Context free grammar → Phrases combine. How to combine? Context free grammar! Example: Sentence → NP, VB (Basically BNF)

Probabilistic → Number of trees grows exponentially with length of sentence. Not all parse trees are relevant, only most probable.

 $PCFG \rightarrow Every rule R$  has probability P(R), and sum of all P(R) with same left side is 1.

Tree probability = product of all P(R)

# Transition-based dependency parser

Contains: buffer, stack, tree

**Operations:** 

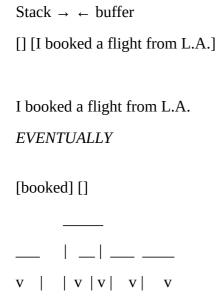
- Shift transition → Pop buffer, push to stack
- Left arc transition → Dependency from top of stack to second top, remove second top.
- Right arc transition → Dependency from second top of stack to top, remove top.

Terminate when buffer is empty and stack has 1 or less elements

# Learn a probabilistic context-free grammar from a treebank

Estimate rule probabilities  $\rightarrow$  count of specific rule / count of all rules with same left side.

# Simulate a transition-based dependency parser



I booked a flight from L.A.