

## State-of-the-art Dependency Parsing



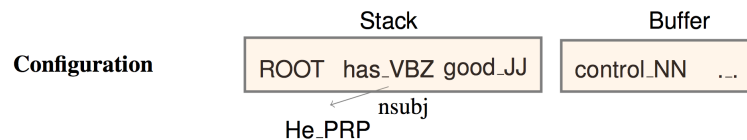
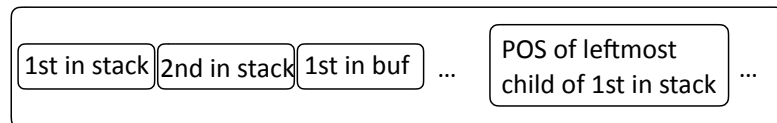
## State-of-the-art Parsers

- ▶ Unlabeled attachment score: fraction of words with correct parent
- ▶ Labeled attachment score: have to label each edge correctly (but this isn't that hard — noun before verb -> nsubj in most contexts)
- ▶ 2005: Eisner algorithm graph-based parser was SOTA (~91 UAS)
- ▶ 2010: Better graph-based parsers using “parent annotation” (~93 UAS)
- ▶ 2012: Transition-based Maltparser achieved good results (~90 UAS)
- ▶ 2014: Stanford neural dependency parser (Chen and Manning) got 92 UAS with transition-based neural model
- ▶ 2016: Improvements to Chen and Manning



## Stanford Dependency Parser

- ▶ Feedforward neural network on top of feature vector extracted from stack and buffer



Chen and Manning (2014)



## Stanford Dependency Parser

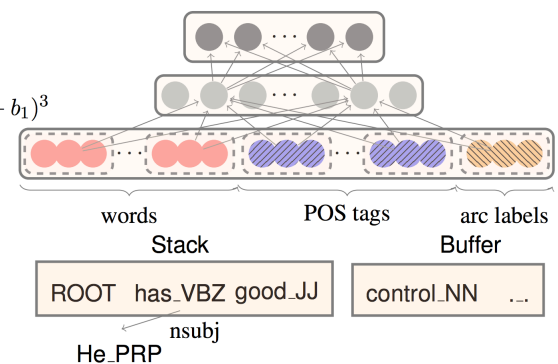
**Softmax layer:**

$$p = \text{softmax}(W_2 h)$$

**Hidden layer:**

$$h = (W_1^w x^w + W_1^t x^t + W_1^l x^l + b_1)^3$$

**Input layer:**  $[x^w, x^t, x^l]$



Chen and Manning (2014)



## Stanford Dependency Parser

Parser	Dev		Test		Speed (sent/s)
	UAS	LAS	UAS	LAS	
standard	90.2	87.8	89.4	87.3	26
eager	89.8	87.4	89.6	87.4	34
Malt:sp	89.8	87.2	89.3	86.9	469
Malt:eager	89.6	86.9	89.4	86.8	448
MSTParser	91.4	88.1	90.7	87.6	10
Our parser	<b>92.0</b>	<b>89.7</b>	<b>91.8</b>	<b>89.6</b>	<b>654</b>

- ▶ MSTParser: “graph-based” parser (like CKY) from 2005 — so Chen+Manning’s parser isn’t much better but is much faster!

Chen and Manning (2014)



## Parsey McParseFace (a.k.a. SyntaxNet)

- ▶ Close to state-of-the-art, released by Google publicly
- ▶ 94.61 UAS on the Penn Treebank using a transition-based system
  - ▶ Additional data harvested via “tri-training”, form of self-training
- ▶ Same feature set as Chen and Manning (2014), Google fine-tuned it

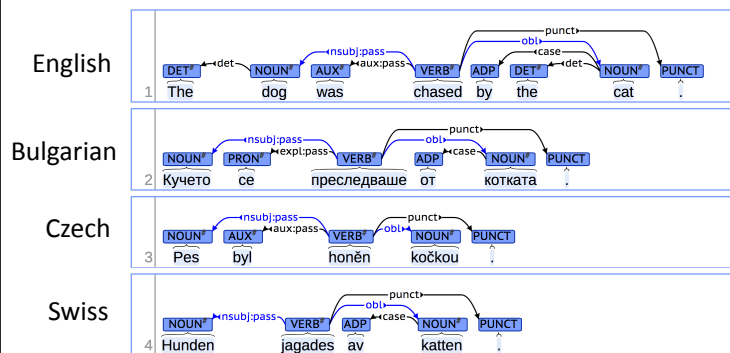
<https://github.com/tensorflow/models/tree/master/research/syntaxnet>

Andor et al. (2016)



## Other languages

- ▶ Annotate dependencies with the same representation in many languages



<http://universaldependencies.org/>