

→ As due on Next Monday

Outline Dependency parsing, shift-reduce

Dependency structure

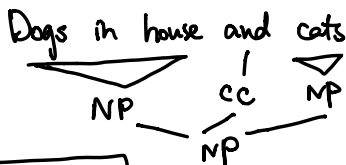
Root DT NN VBD IN DT NN

the dog ran to the house

PP Attachment

eg. children ate the cake with a spoon

Coordination



Constituency

Dependency



Arrows: Parent to the child.

eg: A hearing is scheduled on the issue today.

Non-projective

Project tree: has no crossing arcs

$\forall$  edges  $i \rightarrow j$ , all words in  $(i, j)$  have parents in  $(i, j)$

Arabic: 88.8% proj

Czech: 76.8%

Danish: 84.4%

Shift-reduce transition-based

- Linear time (Clark/Eisner:  $O(n^3)$ )

- stack: partially built tree

Buffer: words left in the sentence

Shift: word from buffer, pushes it onto stack

Reduce: take partial trees from stack + combines + pushes back on stack

Initial state :

S[ROOT] B[I ate some spa bo]

↓  
shift

S [ROOT I] B [Ate some spa bo]

Reduce : Left-arc } pop two from  
Right-arc } S, add arc,  
push on stack

S[ROOT I ate] B[Some spa bo]

↓ L-Ar

S [ ROOT ate ]      B [ some spa bo ]

 $RA =$ 

S [ ROOT I ]

ate

S.S.LA

S [root ate] B [some spa bo]

↓  
I

↓ s

S [ROOT ate some] B [spa bo]

↓  
I

↓ S, L-A

S [ROOT are spa]      B [bo]

S [some spa]

↓  
I

↓  
Some

S [ ROOT ate spa ]  
 ↓ ↓ ↘  
 I some bo

R-A

S [ ROOT ate I  
I spa  
↓ ↓

Q:  $n$  words, how many ops do we need?

A:  $2n$

are standard

## Short Break

## Short Break

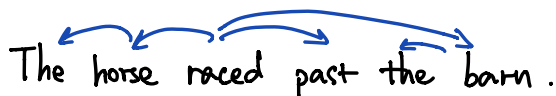
Parser Fcn ( $\overline{S, B}$ )  $\rightarrow$  6p

### 3-way classification

- tags in stack - buf
- 2x tags in stack
- previously built arcs
- buffer feats : contexts, "peek into future"
- action history
- words in stack and buff

Trees  $T$   $O(n)$  trees  $O(n)$  states/tree  
 $T \Rightarrow ((S_1, B_1, d_1^*), (S_2, B_2, d_2^*) \dots)$

Train classifier over  $\{(s, B, d^*)\}$   
from all exs  $O(mn)$



S [ROOT horse reed] B [put the barn (fell)]

(2) Have really good features

S (raced)  
↓  
horse  
↓  
Schorsej  
raced