Deep Learning for Natural Language Processing

The arc-standard algorithm

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The arc-standard algorithm

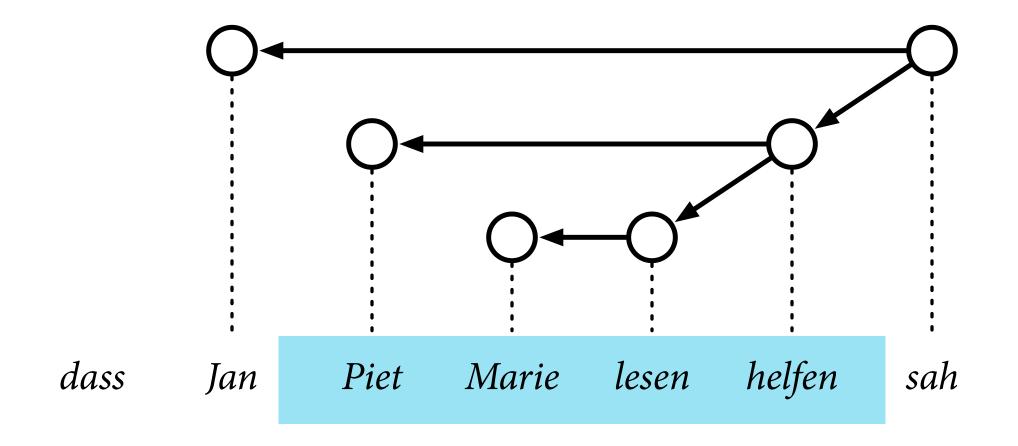
- The arc-standard algorithm is an algorithm for transition-based dependency parsing.
- It can be viewed as a generalisation of the shift–reduce algorithm for parsing context-free grammars.

two types of 'reduce' actions

 The arc-standard algorithm can only predict projective dependency trees.

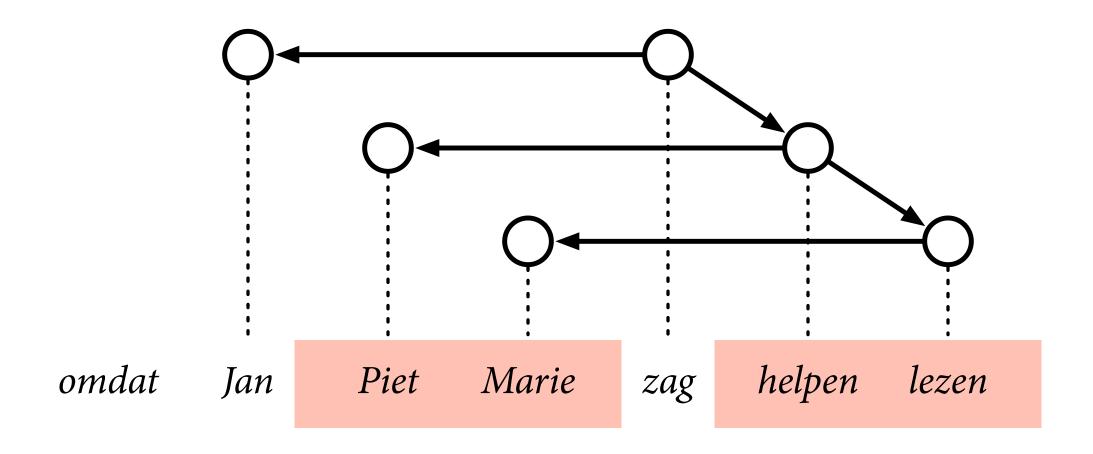
Algorithms for non-projective trees exist, see e.g. Nivre (2009).

Projective dependency trees



Every subtree corresponds to a contiguous sequence of words.

Non-projective dependency trees



The sequence of words in a subtree may contain 'gaps'.

Transition-based dependency parsing

• The parser starts in the **initial configuration**.

empty dependency tree

• It then calls a classifier, which predicts the **transition** that the parser should make to move to a next configuration.

extend the partial dependency tree

 This process is repeated until the parser reaches a terminal configuration.

complete dependency tree

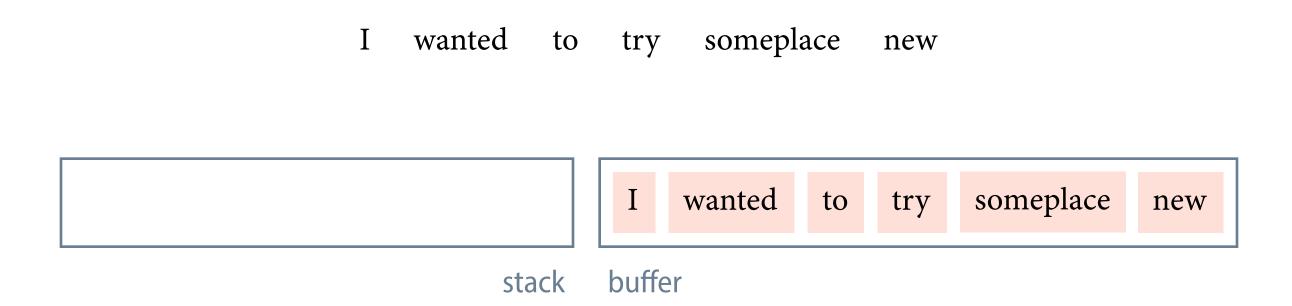
Configurations

A parser configuration consists of three parts:

- A buffer, which contains those words in the sentence that still need to be processed. Initially, the buffer contains all words.
- A **stack**, which contains those words in the sentence that are currently being processed. Initially, the stack is empty.
- A partial dependency tree. Initially, this tree contains all the words of the sentence, but no dependency arcs.

Transitions

- The **shift transition (sh)** removes the frontmost word from the buffer and pushes it to the top of the stack.
- The **left-arc transition** (**LA**) creates a dependency from the topmost word on the stack to the second-topmost word, and pops the second-topmost word.
- The **right-arc transition** (**RA**) creates a dependency from the second-topmost word on the stack to the topmost word, and pops the topmost word.



(initial configuration)

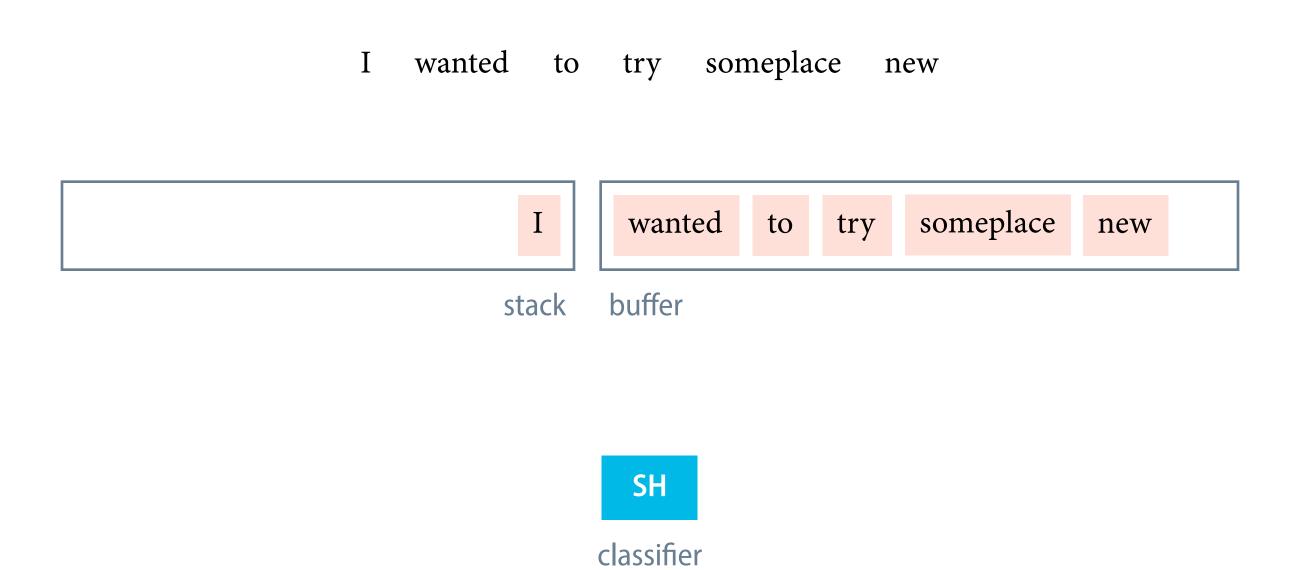
I wanted to try someplace new

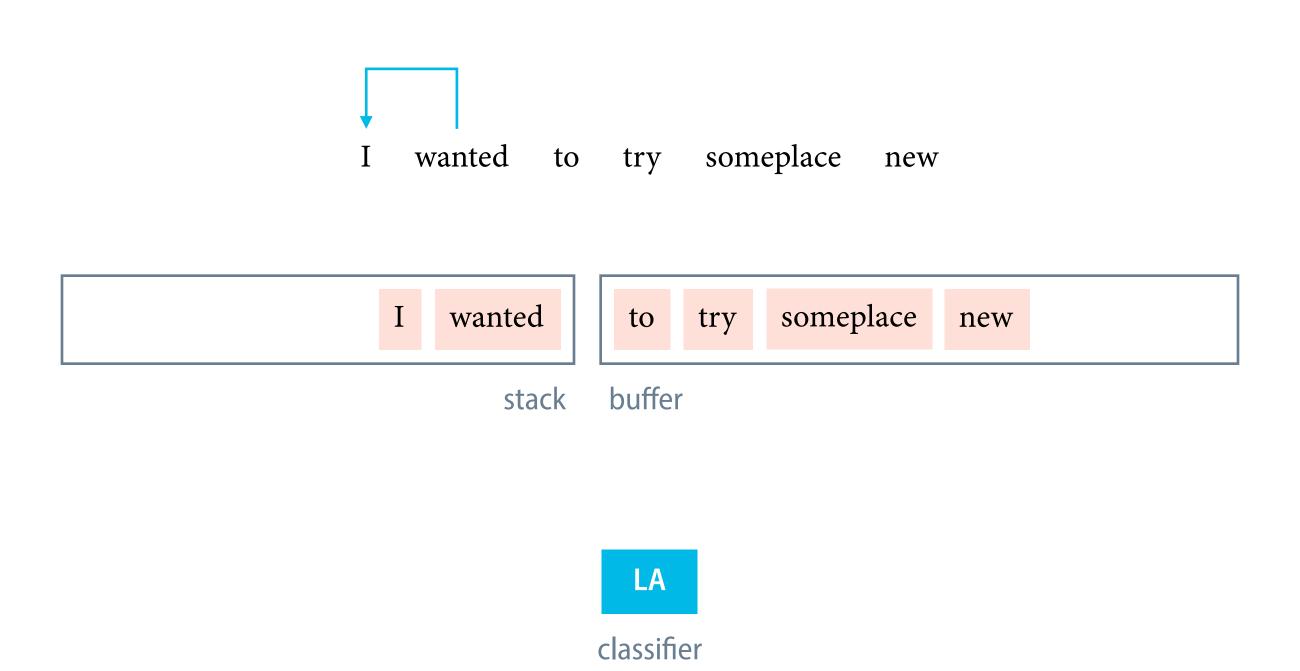
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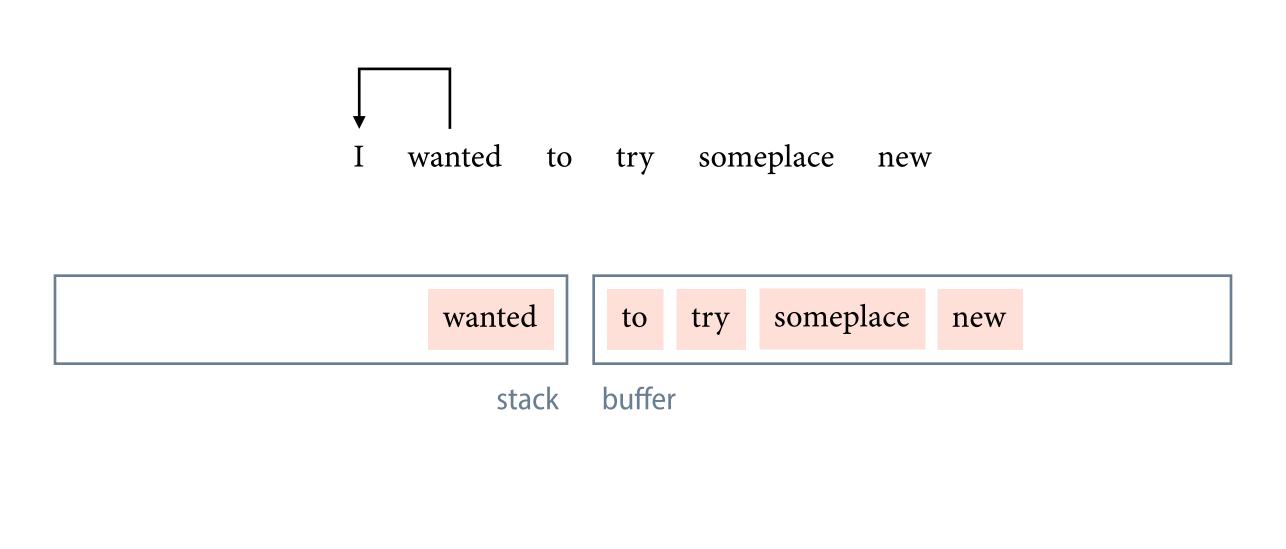
stack buffer

SH

classifier

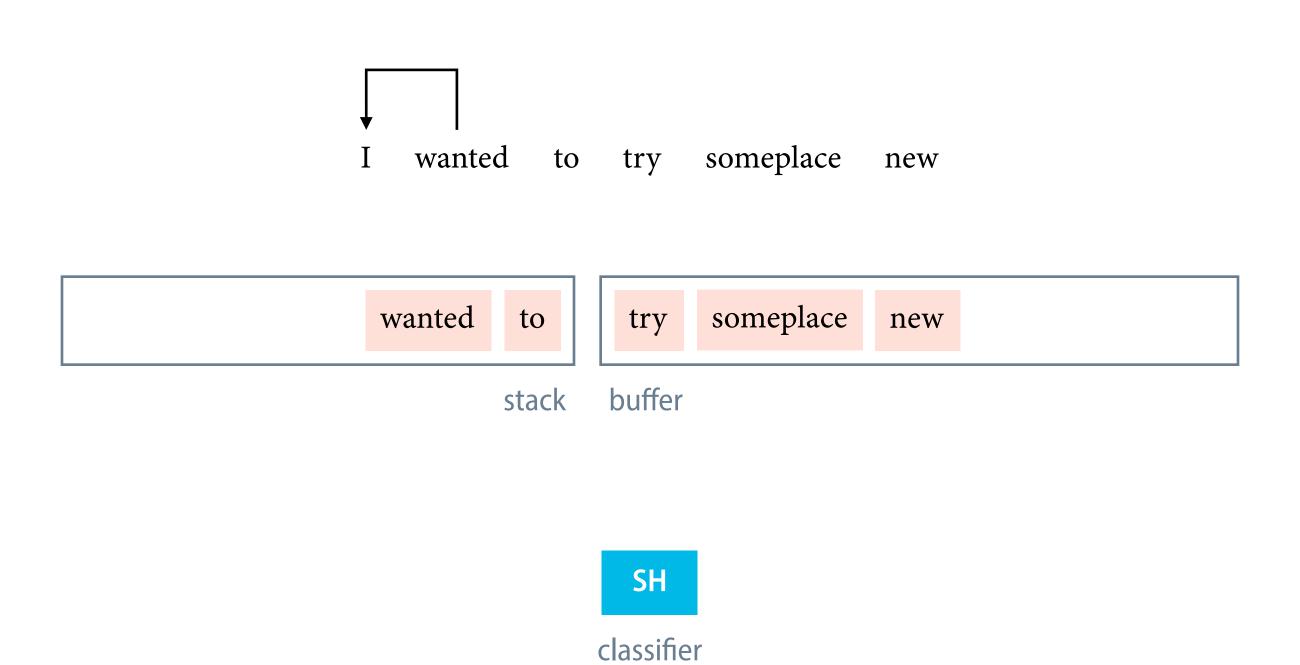


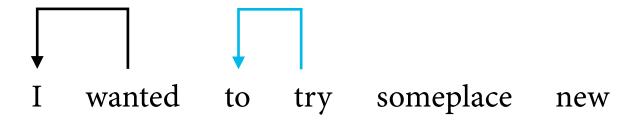


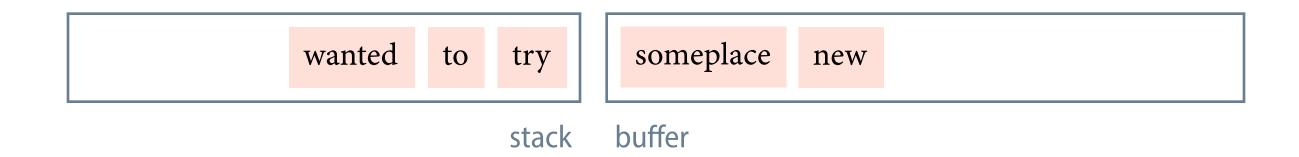


SH

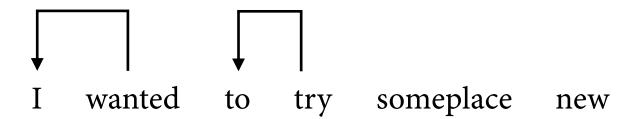
classifier

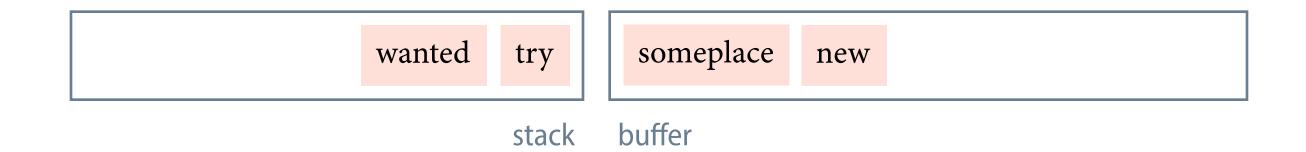




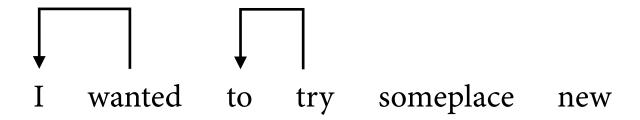


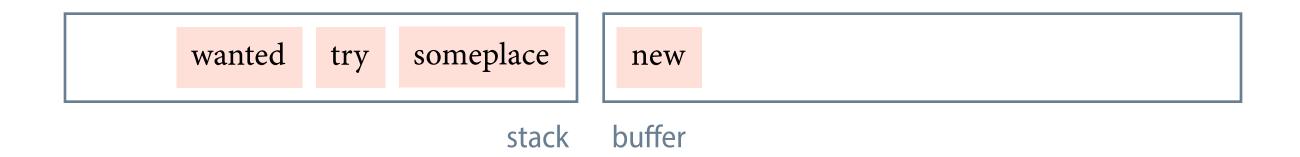




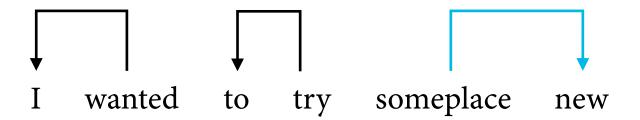


SH classifier



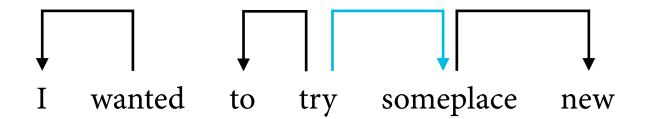


SH classifier



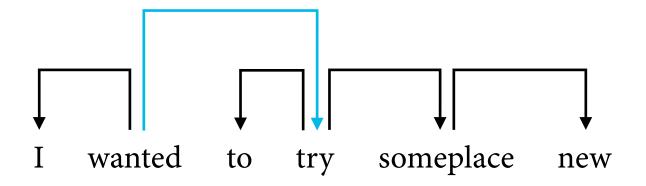
wanted try someplace new stack buffer

RA classifier



wanted try someplace
stack buffer

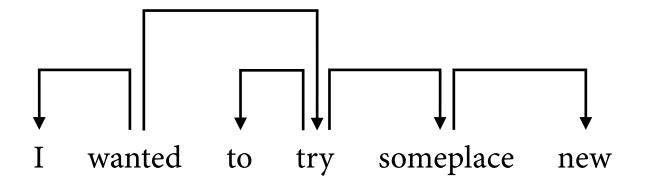




wanted try

stack buffer

RA classifier



wanted stack buffer

(terminal configuration)

Valid transitions

Valid transitions

- sh is valid if the buffer contains at least one word.
- LA and RA are valid if the stack contains at least two words.

Valid transition sequences

are transition sequences in which all transitions are valid

Soundness and completeness

Soundness

Every valid transition sequence that starts in the initial configuration and ends in some terminal configuration builds some projective dependency tree.

Completeness

Every projective dependency tree can be built by some valid transition sequence that starts in the initial configuration and ends in some terminal configuration.

Non-uniqueness and runtime

Non-uniqueness

One and the same projective dependency tree can in general be built by several valid transition sequences.

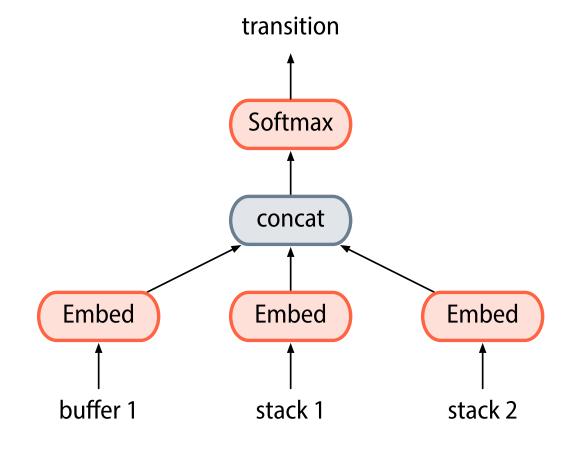
Runtime

The number of transitions that the arc-standard algorithm takes to build a tree for a sentence with n words is 2n - 1.

Features used with the arc-standard algorithm

Features for the classifier can be defined over

- the words in the buffer
- the words on the stack
- the partial dependency tree



Chen and Manning (2014)

Static training oracle

- Choose LA if this would create an arc from the gold-standard tree, and if all arcs from the <u>second-topmost</u> word on the stack have already been assigned by the parser.
- Choose RA if this would create an arc from the gold-standard tree, and if all arcs from the <u>topmost</u> word on the stack have already been assigned by the parser.
- Otherwise, choose sh.

must always be valid, unless the tree is non-projective