# Natural Language Processing SoSe 2017



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#### **Tokenization**

Separation of words in a sentence

"Latest figures from the US government show the trade deficit with China reached an all-time high of \$365.7bn (£250.1bn) last year. By February this year it had already reached \$57bn."

"Latest figures from the US government show the trade deficit with China reached an all time high of \$365.7 bn (£250.1 bn) last year. By February this year it had already reached \$57 bn."



#### **Tokenization**

- Issues related to tokenization:
  - Separators: punctuations
    - Exceptions: "m.p.h", "Ph.D"
  - Expansions: "we're" = "we are"
  - Multi-words expressions: "New York", "doghouse"



#### Segmentation = Tokenization

 Word segmentation: separation of the morphemes but also tokenization for languages without 'space' character

朝鲜外务省发言人11月1日在平壤宣布,朝鲜将重返六方会谈,但前提条件是朝鲜与美国在 六方会谈框架内讨论解除美国对朝鲜 () 最问题。

针对朝鲜方面, are the Words? 財问题。 Where are the Words.

美联社11月1日报道说:"长期以来一直拒绝与平 壤进行直接对话的美国总统布什认为, 各方达成 一致、同意恢复六方会谈应归功于中国的斡旋。



### Segmentation?

Improve production uptime and efficiency, while lowering maintenance costs



## Sentence separation (splitting)

- Also usually based on punctuations (.?!)
  - Exceptions: "Mr.", "4.5"



#### Approaches for tokenization

- Based on regular expressions
- Based on rules or machine learning
  - Binary classifers that decides whether a certain punctuation is part of a word or not



#### Approaches for segmentation

- Maximum matching approach
  - Based on a dictionary
  - Longest sequence of letters that forms a word
- Palmer (2000):

thetabledownthere

thetabledownthere

thetabledownthere

thetabledownthere



#### Neural networks for segmentation

 Chinese word segmentation formalized as a character-based sequence labeling task where only contextual information within fixed sized local windows and simple interactions between adjacent tags can be captured.

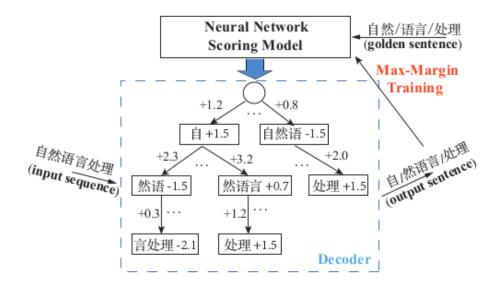
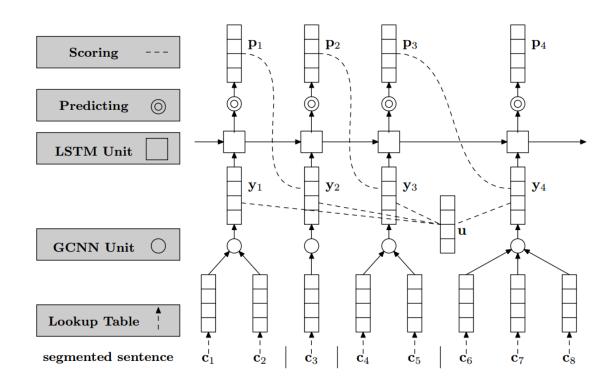


Figure 1: Our framework.



## Neural networks for segmentation





#### Tools for tokenization

- Spacy: https://spacy.io/
- OpenNLP: https://opennlp.apache.org/
- Stanford CoreNLP: https://stanfordnlp.github.io/CoreNLP/
- deeplearning4j tokenizer: https://deeplearning4j.org/tokenization
- Neural tokenizer: https://github.com/Kyubyong/neural\_tokenizer



#### Exercise

- Project: choose a tokenizer and try it in your document collection.
  - Manually check a sample of the results.



## Further reading

NLP book: Chapter 3