# **Text Processing**

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## **Influencing Factors**

- Who wrote (age, gender, race)
- When was written
- Language: 7097 languages in the world
- Dialects
- Purpose: news, scientific article, book
- Multiple languages: Hindi/English

```
क्या आप मुझे गरीबरथ तीव्रगामी का आगमन वक्रत बता सकते है?
क्या आप मुझे Garibrath express का arrival time बता सकते है?
क्या आप मुझे Garibrath express का आगमन समय बता सकते है?
क्या आप मुझे गरीबरथ तीव्रगामी का arrival time बता सकते है?
```

Source:https://kunal-dhawan.weebly.com/language-modelling-of-hindi-english-code-switched-data--a-novel-approach.ht ml





#### **Text Processing Steps**

- Tokenization
- Normalization
- Segmentation of sentences





#### **Tokenization**

- Brake sentences into words
- How many words are in the spoken sentence?
  - "I do uh main- mainly business data processing"



#### **Tokenization**

- Example of simple approach
  - Any sequence of alphanumeric characters of minimum size 3
  - Ended with space or any special character
  - All the letters to lowercase

Bigcorp's 2007 bi-annual report showed profits rose 10% tokenization

["bigcorp","2007","annual","report","showed","profits","rose"]



### **Tokenization**

- Example of simple approach
  - Any sequence of alphanumeric characters of minimum size 3
  - Ended with space or any special character
  - All the letters to lowercase

Mr. O'Neill thinks that the boys' stories about Chile's capital aren't amusing

tokenization

["mr","neill","thinks","that","the","boys","stories","about","chile","capital","aren","amusing"]





#### **Issues in Tokenization**

- Small words might be important
  - Ex: am, pm, el (paso), (world war) II
- Hyphens
  - Some times are required
    - Ex: e-bay, wal-mart, cd-rom, t-shirts
  - Separate words
    - Ex: Dallas-Fort Worth, spanish-speaking



### **Issues in Tokenization**

- Special characters are important for URLs, emails, entity names
  - AT&T, \$4.5, user@gmail.com
- Word in lowercase can have a different meaning than the original one
  - Bush, Apple
- Apostrophe can be part of a word or part of a possessive (English)

rosie o'donnell, can't, don't, 80's, 1890's, men's straw hats, master's degree, england's ten largest cities, shriner's





#### **Issues in Tokenization**

- Number might be useful
  - Ex: nokia 3250, united 93, quicktime 6.5 pro
- Periods can be in numbers, abbreviations, URLs, end of sentences, etc.
  - Ex: I.B.M., Ph.D.



#### **Issues in Tokenization: Chinese**

莎拉波娃现在居住在美国东南部的佛罗里达。今年4月9日,莎拉波娃在美国第一大城市纽约度过了18岁生日。生日派对上,莎拉波娃露出了甜美的微笑。



## Issues in Tokenization: Japanese

ノーベル平和賞を受賞したワンガリ・マータイさんが名誉会長を務めるMOTTAINAIキャンペーンの一環として、毎日新聞社とマガジンハウスは「私の、もったいない」を募集します。皆様が日ごろ「もったいない」と感じて実践していることや、それにまつわるエピソードを800字以内の文章にまとめ、簡単な写真、イラスト、図などを添えて10月20日までにお送りください。大賞受賞者には、50万円相当の旅行券とエコ製品2点の副賞が贈られます。



#### **Issues in Tokenization: Chinese**

姚明进入总决赛 "Yao Ming reaches the finals"

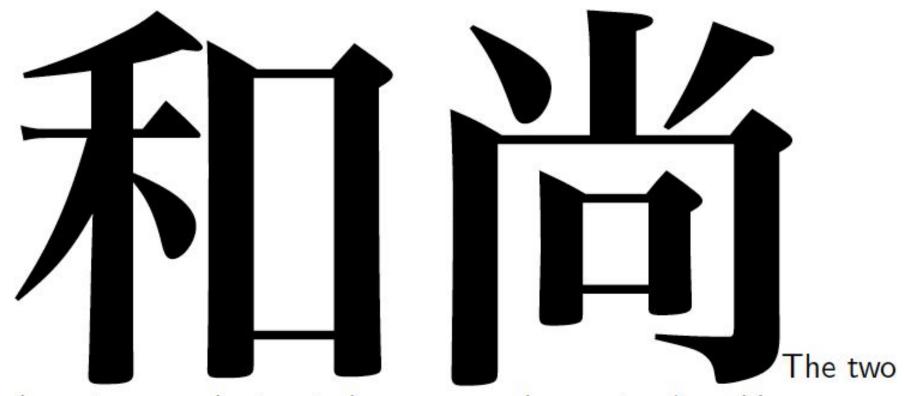
```
3 words?
姚明 进入 总决赛
YaoMing reaches finals
```

5 words? 姚 明 进入 总 决赛 Yao Ming reaches overall finals

7 characters? 姚 明 进 入 总 决 赛 Yao Ming enter enter overall decision game



### **Issues in Tokenization: Ambiguity**



characters can be treated as one word meaning 'monk' or as a sequence of two words meaning 'and' and 'still'.

cin.ufpe.br



#### **Issues in Tokenization: German**

computerlinguistik computer + linguistik computational linguistics

lebensversicherungsgesellschaftsangestellter leben + versicherung + gesellschaft + angestellter life insurance company employee



#### **Issues in Tokenization: Turkish**

Uygarlastiramadiklarimizdanmissinizcasina "(behaving) as if you are among those whom we could not civilize"

```
Uygar "civilized" + las "become" + tir "cause" + ama "not able"
+ dik "past" + lar "plural" + imiz "p1pl" +

dan "abl" + mis "past" + siniz "2pl" + casina "as if"
```



### **Normalization: Stopwords**

- Words with high frequency in a collection
- Don't have much meaning
- Usually not good at differentiating
- Articles, prepositions, conjunctions, etc.
- Created from high frequency words or existing lists

```
and
                                      be
                                                for
                                                       from
                    are
     an
has
     he
                   is
                          it
                                 its
                                      of
                                                that
            in
                                           on
                                                       the
                   will
                          with
to
     was
            were
```

► Figure 2.5 A stop list of 25 semantically non-selective words which are common in Reuters-RCV1.

Fonte: <a href="https://nlp.stanford.edu/IR-book/">https://nlp.stanford.edu/IR-book/</a> - Capítulo 2 - The term vocabulary & postings lists





#### **Normalization: Lemmatization**

- Group words with the same root (lemma)
  - am, are, is  $\rightarrow$  be
  - car, cars, car's, cars' → car
  - He is reading detective stories → He be read detective story



### **Normalization: Stemming**

- Reduce morphological variations of words to a common stem
- Remove prefix or suffix -> stem
  - Ex: connect connected, connecting, connection, connections
- There is no consensus on benefits (depends on the language/task)





#### **Porter Stemmer**

- Very popular
- Consist of a series of rules
- Make mistakes and hard to modify

```
ATIONAL \rightarrow ATE (e.g., relational \rightarrow relate)

ING \rightarrow \epsilon if stem contains vowel (e.g., motoring \rightarrow motor)

SSES \rightarrow SS (e.g., grasses \rightarrow grass)
```

Example of rules

#### Original text:

Document will describe marketing strategies carried out by U.S. companies for their agricultural chemicals, report predictions for market share of such chemicals, or report market statistics for agrochemicals, pesticide, herbicide, fungicide, insecticide, fertilizer, predicted sales, market share, stimulate demand, price cut, volume of sales.

#### Porter stemmer:

document describ market strategi carri compani agricultur chemic report predict market share chemic report market statist agrochem pesticid herbicid fungicid insecticid fertil predict sale market share stimul demand price cut volum sale





### **Effect of Normalization on Reuters-RCV1**

	number
unfiltered	484,494
no numbers	473,723
case folding	391,523
30 stop words	391,493
150 stop words	391,373
stemming	322,383





### **Sentence Segmentation**

- Characters! and? are precise to separate sentences
- Character "." not so much
  - Abbreviation: Dr.
  - Number: 7.5%
- Most used strategy:
  - Tokenize first
  - Uses rules or Machine Learning to classify the point
  - Use of abbreviation dictionary





#### **Tools and Libraries**

- Stanford tokenizer para inglês (http://nlp.stanford.edu/software/tokenizer.shtml)
- CoreNLP (https://stanfordnlp.github.io/CoreNLP/)
- NLTK (https://www.nltk.org/)
- Spacy (https://spacy.io/)