

# Разбиение на токены / Word tokenization.

**Speech and Language Processing (3rd ed. raft), Dan Jurafsky and James H. Martin**  
**Глава 2.3, стр. 11**

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# Text Normalization

- Every NLP task needs to do text normalization:
  1. Segmenting/tokenizing words in running text
  2. Normalizing word formats
  3. Segmenting sentences in running text

Для чего необходимо решение задач 1-3?

# How many words?

- I do uh main- mainly business data processing
  - Fragments, filled pauses
- Seuss's **cat** in the hat is different from other **cats!**
  - **Lemma:** same stem, part of speech, rough word sense
    - **cat** and **cats** = same lemma
  - **Wordform:** the full inflected surface form
    - **cat** and **cats** = different wordforms

- Рыбак рыбака видит издалека.
  - Рыбак и рыбака — одна лемма, но разные словоформы.

В чем отличие леммы от словоформы?

# How many words?

they lay back on the San Francisco grass and looked at the stars and their

- **Type**: an element of the vocabulary.
- **Token**: an instance of that type in running text.
- How many?
  - 15 tokens (or 14)
  - 13 types (or 12) (or 11?)

Чем отличается модель от токена?

- Он не мог не ответить на это письмо.

Сколько моделей и токенов?

# How many words?

$N$  = number of tokens

$V$  = vocabulary = set of types

$|V|$  is the size of the vocabulary

Church and Gale (1990):  $|V| > O(N^{1/2})$

|                                 | Tokens = $N$ | Types = $ V $ |
|---------------------------------|--------------|---------------|
| Switchboard phone conversations | 2.4 million  | 20 thousand   |
| Shakespeare                     | 884,000      | 31 thousand   |
| Google N-grams                  | 1 trillion   | 13 million    |

# Simple Tokenization in UNIX

- (Inspired by Ken Church's UNIX for Poets.)
- Given a text file, output the word tokens and their frequencies

```
tr -sc 'A-Za-z' '\n' < shakes.txt | sort | uniq -c
```

Change all non-alpha to newlines  
Sort in alphabetical order  
Merge and count each type

|           |          |
|-----------|----------|
| 1945 A    | 25 Aaron |
| 72 AARON  | 6 Abate  |
| 19 ABBESS | 1 Abates |
| 5 ABBOT   | 5 Abbess |
| ...       | 6 Abbey  |
|           | 3 Abbot  |

Какие команды UNIX можно использовать для обработки текста?

# The first step: tokenizing

```
tr -sc 'A-Za-z' '\n' <  
shakes.txt | head
```

THE  
SONNETS  
by  
William  
Shakespeare  
From  
fairest  
creatures  
We  
...

Что произошло в  
результате выполнения  
команды?

## The second step: sorting

```
tr -sc 'A-Za-z' '\n' <  
shakes.txt | sort | head
```

A

A

A

A

A

A

A

A

A

...

Что вывелоось в результате  
выполнения команды?

# More counting

- Merging upper and lower case

```
tr 'A-Z' 'a-z' < shakes.txt | tr -sc 'A-Za-z' '\n' | sort | uniq -c
```

- Sorting the counts

```
tr 'A-Z' 'a-z' < shakes.txt | tr -sc 'A-Za-z' '\n' | sort | uniq -c | sort -n -r
```

|       |     |
|-------|-----|
| 23243 | the |
| 22225 | i   |
| 18618 | and |
| 16339 | to  |
| 15687 | of  |
| 12780 | a   |
| 12163 | you |
| 10839 | my  |
| 10005 | in  |
| 8954  | d   |

Почему “d” вывелоось как отдельное слово?

What happened here?

# Issues in Tokenization

- Finland's capital → Finland Finlands Finland's ?
- what're, I'm, isn't → What are, I am, is not
- Hewlett-Packard → Hewlett Packard ?
- state-of-the-art → state of the art ?
- Lowercase → lower-case lowercase lower case ?
- San Francisco → one token or two?
- m.p.h., PhD. → ??
- Красно-желтый → Красно желтый? Красно-желтый?

В чем заключается проблема токенизации?

# Tokenization: language issues

- French
  - *L'ensemble* → one token or two?
    - *L* ? *L'* ? *Le* ?
    - Want *l'ensemble* to match with *un ensemble*
- German noun compounds are not segmented
  - *Lebensversicherungsgesellschaftsangestellter*
  - ‘life insurance company employee’
  - German information retrieval needs **compound splitter**

Какие проблемы, связанные с  
особенностями языков, могут  
возникнуть?

# Tokenization: language issues

- Chinese and Japanese no spaces between words:
  - 莎拉波娃现在居住在美国东南部的佛罗里达。
  - 莎拉波娃 现在 居住 在 美国 东南部 的 佛罗
  - Sharapova now lives in US southeastern Florida
- Further complicated in Japanese, with multiple alphabets intermingled
  - Dates/amounts in multiple formats

フォーチュン500社は情報不足のため時間あた\$500K(約6,000万円)

The diagram illustrates the complexity of Japanese tokenization. It shows a sentence in Japanese with boxes highlighting different character types. Arrows point from these boxes to four pink boxes at the bottom labeled 'Katakana', 'Hiragana', 'Kanji', and 'Romaji'. The 'Katakana' box covers the first two characters 'フォ'. The 'Hiragana' box covers the next three characters 'ーチュン'. The 'Kanji' box covers the character '社'. The 'Romaji' box covers the dollar sign '\$', the number '500', the letter 'K', and the parentheses '(約)'.

Katakana      Hiragana      Kanji      Romaji

Какие особенности японского языка  
еще больше осложняют обработку  
текста?

# Word Tokenization in Chinese

- Also called **Word Segmentation**
- Chinese words are composed of characters
  - Characters are generally 1 syllable and 1 morpheme.
  - Average word is 2.4 characters long.
- Standard baseline segmentation algorithm:
  - Maximum Matching (also called Greedy)

Какой алгоритм применяется для токенизации в китайском языке?

# Maximum Matching Word Segmentation Algorithm

- Given a wordlist of Chinese, and a string.
- 1) Start a pointer at the beginning of the string
  - 2) Find the longest word in dictionary that matches the string starting at pointer
  - 3) Move the pointer over the word in string
  - 4) Go to 2

В чем заключается суть алгоритма Maximum Matching?

# Max-match segmentation illustration

- Thecatinthehat the cat in the hat
  - Thetabledownthere the table down there  
theta bled own there
  - Doesn't generally work in English!
  - But works astonishingly well in Chinese
    - 莎拉波娃现在居住在美国东南部的佛罗里达。
    - 莎拉波娃 现在 居住 在 美国 东南部 的 佛罗里达
  - Modern probabilistic segmentation algorithms even better

## Интересные статьи:

- <http://www.dialog-21.ru/digests/dialog2012/materials/pdf/68.pdf>
- <http://www.dialog-21.ru/media/2213/muravyev.pdf>