# Processing of Very Large Text Collections

#### Miloš Jakubíček

Natural Language Processing Centre, Faculty of Informatics Masaryk University, Brno, Czech Republic

jak@fi.muni.cz

Workshop of Natural Language Processing Centre & Seznam.cz, a.s.

May 16, 2014

# Why to process natural language texts?

- lots of information, growing every day (web)
- need for fast and continuous knowledge mining
- no time for human intervention
- large data make statistical processing possible
- real data instead of false assumptions

#### Information in Text



### Text collection = a text corpus

- text collection: usually referred to as text corpus
- humanities → corpus linguistics, language learning
- computer science → effective design of specialized database management systems
- **applications**  $\rightarrow$  usage of *any text* as information source

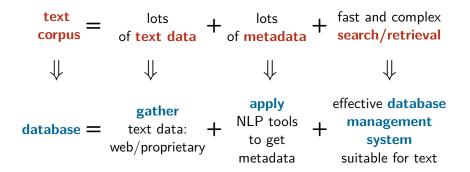
## Text Corpora as Information Source

### goal

| object of  | 78390      | 3.0  | subject of | <u>25451</u> | 2.3  | modifie   |  |
|------------|------------|------|------------|--------------|------|-----------|--|
| score      | 8390       | 18   | score      | 903          | 8.8  | actual    |  |
| achieve    |            |      |            |              |      | - Thorn   |  |
| concede    | 1          | -    | сопсеае    | 204          | 7.47 | argue     |  |
| accomplish | <u>585</u> | .9   | gape       | 105          | 7.3  | winning   |  |
| reach      | 1924       | 7.57 | kick       | 100          | 6.5  | primary   |  |
| net        | 337        | 7.4  | orientate  | 94           | 6.23 | seconda   |  |
| pursue     | 648        | 7.35 | rule       | <u>78</u>    | 5.5  | strategic |  |
| grab       | <u>406</u> | 7.33 | come       | <u>175</u>   | 5.21 | common    |  |
| attain     | 400        | 7.32 | cap        | <u>65</u>    | 4.32 | realistic |  |
| pull       | <u>504</u> | 6.69 | beat       | <u>20</u>    | 3.69 | achievat  |  |

noyer will seek to achieve three goals once employment min order to achieve the agreed goal of sustainable de daily distribution was to achieve its goals of peasant mobility ction of how you can achieve those goals. So it's unlike a law mow you, how you could achieve the goal I mean it just says order to achieve stated organisational goals. This definition (S is concerned with achieving a specific goal in a given time us to be directed towards achieving the goals of the organisation ought to be structured to achieve their goals (Abrahamsson 15 maximizing profit and achieve the goals with which other profits the input. To achieve such a goal it is necessary to ow you manage to achieve the same goals; 'said T.E. (he is; uueezed. In a move to achieve these goals we have merged but stop until we have achieved this goal. In our sincere p

## So what is a corpus?



## Corpora

#### text type

- general language (gather domain independent information: common sense knowledge, global statistics, information defaults)
- domain specific (gather domain specific information: terminology, in-domain knowledge, contrast to common texts)

#### timeline

- *synchronic*: one time period / time span ( $\rightarrow$  what is up now?)
- diachronic: different time periods / time spans ( $\rightarrow$  what are the trends?)
- language, written/spoken, metadata annotation type,

. . .

#### Corpora

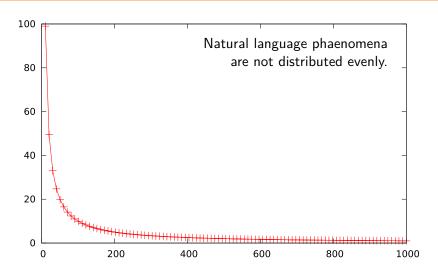
So is there any property one should aim at for all corpora?

## Corpora

So is there any property one should aim at for all corpora?

Yes - the size. The bigger, the better.

# Why does size matter so much?



#### Corpora at NLP Centre:

- **LARGE**: billions ( $\sim 10^{10}$ ) of words
- COMPLEX: muti-level multi-value annotation, wide range of languages

#### Corpora at NLP Centre:

■ LARGE: billions (~10<sup>10</sup>) of words



Page 1

#### Corpora at NLP Centre:

of 13 Go

Query new, york, Br 114,980 > Random sample 250 (0.0 per million)

Next Last

 COMPLEX: muti-level multi-value annotation, wide range of languages

<s> Jodie /Jodie n/NP joined /join v/VVD Acxiom /Acxiomn/NP as /as i/IN Chief /Chief n/NP Privacy

| doc#53002  | /Privacy n/NP and /and c/CC Compliance /Compliance n/NP Officer n/NP and /and c/CC moved //move v/N/D with /with i/Nv them //themd/PP to /to i/N the //the x/DT US //US n/NP in //n: 1/N 2007 /@card@ x/CD before //before //N joining //join v/N/G the //the x/DT DMA //DMA n/NN in //in i/NN New iNew n/NP York in NP in //in i/N 2009 /@card@ x/CD as /as i/N/ Senior //Senior n/NP Vice ///ce n/NP President //President n/NP of /of i/N Education //Education n/NP & /& c/CC Global /Global n/NP Development //NP · ./ x/SENT  |
|------------|---|
| doc#169551 | <s> New /New n/NP York /York n/NP Times /Times n/NP ' /* x/* redesign /redesign n/NN is /be v/VBZ a /a x/DT beautiful //beautiful //JD example /example n/NN of //of i//N a /a x/DT webpage /webpage n/NN which which x/WDT feels //eel v/VyZ like /i/lke i/lN a /a x/DT newspaper /newspaper n/NN which /which x/WDT feels //eel v/VyZ like //i/ka /a x/DT blog //blog n/NN · /. X/SENT</s>  |
| doc#329449 | <s> new <math>_{lnew}</math> jJJ york <math>_{lyork}</math> v/vv into <math>_{/into}</math> i/ln this <math>_{/this}</math> x/DT house <math>_{/house}</math> n/NN — /— x/: knowing <math>_{/know}</math> v/vvG ·/, x/, as <math>_{/si}</math> i/N ye <math>_{/se}</math> n/NN ought <math>_{/ought}</math> x/MD to <math>_{/to}</math> x/TO dash <math>_{/dash}</math> v/vv ·/, x/, that <math>_{/that}</math> x/II/that <math>_{/lithat}</math> 1/I d/IPP neer <math>_{/nee}</math> jJJR powderise <math>_{/powderise}</math> n/NN little <math>_{/ittle}</math> a/RB but <math>_{/but}</math> c/CC when <math>_{/when}</math> x/WRB im <math>_{/imn}</math> /Inbbs <math>_{/hDR}</math> a <math>_{/si}</math> a/DT rollicking <math>_{/rollick}</math> v/vVG tonsure <math>_{/tonsure}</math> n/NN ·/, x/, in <math>_{/in}</math> i/IN furniture <math>_{/tumiture}</math> n/NN company <math>_{/company}</math> n/NN Tubbs <math>_{/tubbs}</math> n/NP SMC <math>_{/swc}</math> n/NP and <math>_{/swc}</math> fasten <math>_{/tought}</math> x/SENT</s> |

A big need for search/retrieval that is:

- INTELLIGENT: complex searching involving large amounts of metadata
- VERY FAST: parallel and distributed processing
- ACCESSIBLE: interfaces for automatic processing via third-party tools

# **Applications**

- information systems (going beyond fulltext search)
- information analytics (opinion mining, marketing assessment)
- intelligent text processing (predictive and adaptive writing, correction tools, effective writing in mobile devices)
- computer lexicography (better dictionaries, larger dictionaries)
- machine translation (parallel corpora)
- statistics for enhancing NLP tools

#### What can we offer?

Ready-made tools for corpus building, management and effective search:

- Building: from own data/from the web, crawling, cleaning, deduplication
- Management: effective indexing in special DBMS
- Search: very fast evaluation of complex queries, keywords extraction, extraction of semantically related words, word sketches

Most of the tools are part of Sketch Engine, a product developed in collaboration with Lexical Computing Ltd.

# Demo: Sketch Engine

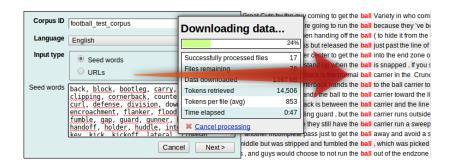
compare and contrast words visually

| informative   | 0         |           |     | 6.6         | artifically     |           |           | 5.1 | 3.7 | being         |           |   | 5.9 | 3.1 |
|---------------|-----------|-----------|-----|-------------|-----------------|-----------|-----------|-----|-----|---------------|-----------|---|-----|-----|
| perceptive    | 0         | 3         |     | 6.6         | extremely       | 14        | <u>5</u>  | 6.1 | 4.6 | robot         |           |   | 6.0 | 2.9 |
| cultured      | 0         |           |     | 6.6         | very            |           |           | 6.8 | 4.9 | agent         | <u>3</u>  | 0 | 5.7 | 2.8 |
| knowledgeable | 0         | 3         |     | 6.4         | emotionally     | <u>76</u> | <u>20</u> | 6.2 | 4.3 | guess         | <u>5</u>  | 0 | 5.8 | 2.6 |
| humorous      | 0         | <u>3</u>  | -   | 6.3         | fiercely        | <u>72</u> | <u>16</u> | 5.4 | 3.3 | conversation  | <u>3</u>  | 0 | 5.8 | 2.5 |
| dedicated     | 0         | 4         | -   | 6.3         | particularly    | 11        | 0         | 5.0 | 3.0 | human         | 4         | 0 | 6.3 | 2.2 |
| charming      | <u>3</u>  | <u>10</u> | 5.8 | 7.2         | rather          | <u>13</u> | 0         | 5.2 | 2.8 | creature      | <u>3</u>  | 0 | 6.4 | 2.0 |
| witty         | cle       | ver       | 6.0 | 4.          | 0 2.0 0         | -2        | 2.0       | -4  | .0  | -6.0 intellig | ent       | 0 | 6.4 | 1.9 |
| sexy          | 3         | 3         | 6.6 | 6.2         | terribly        | <u>3</u>  | 0         | 5.8 | 2.4 | fellow        | 11        | 0 | 6.  | 1.7 |
| ambitious     | <u>5</u>  | 4         | 6.4 | 5.8         | pretty          | <u>8</u>  | 0         | 5.9 | 2.0 | pass          | 4         | 0 | 6.6 | 1.5 |
| amusing       | <u>5</u>  | 4         | 7.2 | 6.5         | jolly           | 3         | 0         | 6.7 | 1.8 | wordplay      | 4         | 0 | 6.7 | 1.2 |
| clever        | <u>10</u> | 4         | 7.2 | 5.7         | that            | 11        | 0         | 6.8 | 1.1 | chap          | <u>10</u> | 0 | 7.0 | 1.1 |
| subtle        | <u>6</u>  | 0         | 6.4 | 5.4         | damn            | <u>5</u>  | 0         | 6.8 | 1.0 | snap          | 7         | 0 | 7.1 | 0.8 |
| brave         | <u>6</u>  | 0         | 6.6 | 5.1         | awfully         | 4         | 0         | 7.0 | 0.0 | twist         | <u>18</u> | 0 | 7.2 | 0.6 |
| devious       | 3         | 0         | 7.1 | <b>0</b> .0 | extraordinarily | <u>6</u>  | 0         | 7.4 | 0.0 | kick          | 8         | 0 | 7.7 | 0.1 |
| cunning       | 5         | 0         | 7.7 | 0.0         | fiendishly      | 5         | 0         | 7.9 | 0.0 | trick         | 12        | 0 | 8.2 | 0.0 |

Miloš Jakubíček

## Demo: Sketch Engine

build specialised corpora instantly from the Web



# Demo: Sketch Engine

thesaurus

 $test_{(verb)}$  enClueWeb (full) freq = 6180301 (74.8 per million)

| Lemma              | Score | Freq     |
|--------------------|-------|----------|
| <u>evaluate</u>    | 0.532 | 4453262  |
| <u>analyze</u>     | 0.475 | 3595762  |
| <u>monitor</u>     | 0.467 | 4047771  |
| <u>examine</u>     | 0.455 | 5078101  |
| <u>investigate</u> | 0.453 | 3907848  |
| <u>utilize</u>     | 0.439 | 4047715  |
| <u>maintain</u>    | 0.438 | 10975886 |
| <u>introduce</u>   | 0.435 | 8263900  |
| <u>assess</u>      | 0.43  | 3196297  |
| <u>demonstrate</u> | 0.426 | 5668643  |
| <u>identify</u>    | 0.423 | 10722177 |

Miloš Jakubíček

#### Conclusions

- Text corpora represent a valuable information source useful for many practical applications
- Corpora as text databases require special solutions that are fast and powerful
- There are number of tools developed in the NLP Centre for corpus building, management and efficient search