

# 11 – Indexing and Searching Very Large Texts

## IA161 Advanced Techniques of Natural Language Processing

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1 Indexing

2 Searching

# Searching big text corpora

## Corpus:

- positional attributes – word form, lemma, PoS tag, ...
- structures and structure attributes – documents (e.g. with author, id, year, ...), paragraph, sentence
- searching: Manatee/Bonito/Sketch Engine
- <http://corpora.fi.muni.cz>
- <http://the.sketchengine.co.uk>

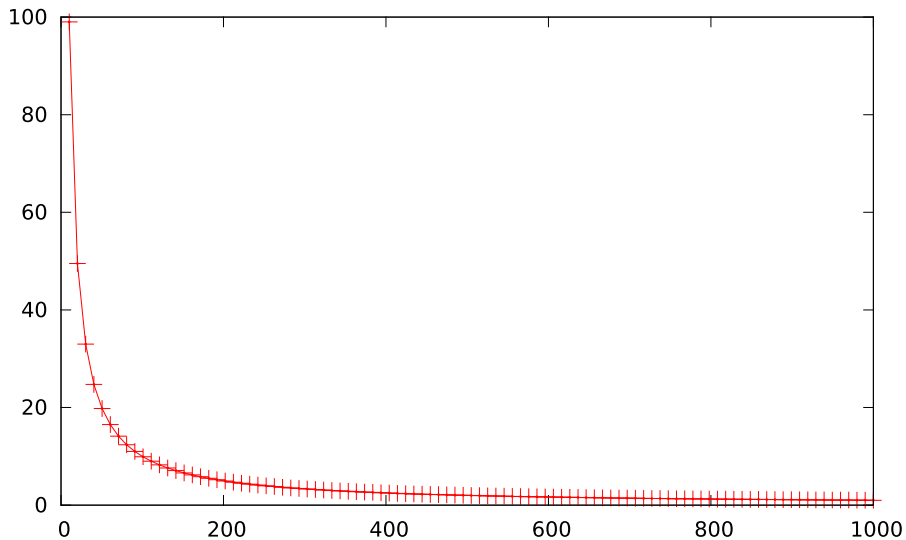
# Searching big text corpora

- data too big to be stored in memory
- data too big to be search sequentially

⇒ preprocessing needed (indexing, alias corpus compilation)

- key decisions are:
  - ▶ trade off between compile-time (preprocessing) and run-time
  - ▶ trade off between in memory and off-memory processing

# Zipf's law I



## Zipf's law II

- may be simplified to inductive definition:

### Zipf's law (simplified)

frequency of the  $n$ -th element  $f_n \approx \frac{1}{n} \cdot f_1$

- $\Rightarrow$  frequency is inversely proportional to the rank according to frequency
- $\Rightarrow$  one needs really large corpora to capture all the variety of many language phenomena
- $\Rightarrow$  implications for text indexing

## Zipf's law III

<u>tag</u>	<u>Freq</u>
NN	<a href="#">161881</a>
NP	<a href="#">62669</a>
NNS	<a href="#">56629</a>
VVN	<a href="#">27545</a>
VV	<a href="#">27481</a>
VVD	<a href="#">27391</a>
VVG	<a href="#">16922</a>
VBD	<a href="#">13275</a>
VBZ	<a href="#">11321</a>
VVZ	<a href="#">8254</a>
VVP	<a href="#">7912</a>
VB	<a href="#">6377</a>
VBP	<a href="#">5211</a>
VHD	<a href="#">5190</a>
VHZ	<a href="#">2497</a>
VBN	<a href="#">2470</a>
VHP	<a href="#">2445</a>
VH	<a href="#">1780</a>
NPS	<a href="#">1524</a>
VBG	<a href="#">674</a>
VHG	<a href="#">279</a>
VHN	<a href="#">194</a>

Substantives + Verb tags on the Brown corpus

# Building corpora

- 1 content definition (what will it be used for? how do I get texts?)
- 2 obtaining data (e.g. crawling)
- 3 data cleaning (spam, boilerplate, duplicates)
- 4 tokenization
- 5 sentence segmentation
- 6 further annotation (PoS tagging)
- 7 corpus indexing and analysis



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# Corpus indexing

- text corpus is a database
- standard (=relational) database management systems are not suitable at all
  - ▶ text corpus does not have relational nature
- special database management systems needed

⇒ Manatee

# Indexing corpora in Manatee

Key data structures for a positional attribute:

- lexicon
  - ▶ because operations on numbers are just so much faster than on strings
- corpus text
  - ▶ to iterate over positions
- inverted (reversed) index
  - ▶ to give fast access to positions for a given value

# How to store integer numbers

- given Zipf's distribution: fixed-length storing very inefficient
- variable-length more complicated but yielding much smaller and quicker indices
- variable-length bit-wise universal Elias' codes: gamma, delta codes
- cf. Huffman coding

# Indexing corpora in Manatee

Structures and operations:

- operations in between: string (`str`) – number (`id`) – position (`poss`)
- lexicon building:  $\Rightarrow$  word-to-id mapping  $\Rightarrow$  operations on numbers, not strings  $\Rightarrow$  `id2str`, `str2id`
- inverted index: `id2poss`
- corpus text: `pos2id`
- yields transitively also `pos2str`, `str2poss`

# Searching corpora in Manatee

- key idea: operations on sorted forward-only streams of positions
- FastStream – single position stream
- RangeStream – stream of position pairs (structures: *from* position, *to* position)

- = Corpus Query Language (Christ and Schulze, 1994)
- positions and positional attributes: [attr="value"]
- structures and structural attributes: <str attr="value">
- example:

```
[word=".*ing" & tag="V.*"]  
  <doc id="20[5-9].*">
```

- established a within <str/> query:

```
[tag="N.*"]+ within <s/>
```

and alternative meet/union query:

```
(meet [lemma="take"] [tag="N.*"] -5 +5)  
  (union (meet ...) (meet ...))
```

# CQL in Manatee/Bonito

- enhancements and differences to the original CQL syntax
- within <query> and containing <query>
- meet/union (sub)query
- inequality comparisons
- frequency function



## within/containing queries

- searching for particles:

```
[tag="PR.*"] within [tag="V.*"] [tag="AT0"]?  
[tag="AJO"]* [tag="(PR.?|N.*)"] [tag="PR.*"] within  
<s/>
```

- searching for a Czech idiom “hnout někomu žlučí” (“to get somebody’s goat”):

word-by-word translated as:

*hnout* “move” [V, infinitive]

*někomu* “somebody” [N, dative]

*žlučí* “bile” [N, instrumental].

```
<s/> containing [lemma="hnout"] containing  
[tag=".*c3.*"] containing [word="žlučí"]
```

## within/containing queries

- structure boundaries: begin: `<str>`, whole structure: `<str/>`, end: `</str>`
- **changes**: `within <str>` not allowed anymore, use `within <str/>`

## meet/union queries

- combined with regular query: <s/>

```
containing (meet [lemma="have"] [tag="P.*"] -5 5)
```

```
containing (meet [tag="N.*"] [lemma="blue"])
```

- changes:** meet/union queries can be used on any position, they can contain labels and no MU keyword is required (and deprecated):  
(meet 1:[] 2:[]) & 1.tag = 2.tag

# Inequality comparisons

- former comparisons allowed only equality and its negation:  
`[attr="value"]` `[attr!="value"]`
- inequality comparisons implemented: `[attr<="value"]`  
`[attr>="value"]` `[attr!<="value"]` `[attr!>="value"]`
- intended usage:  
`[tag="AJ.*"]` `[tag="NN.*"]` within `<doc year>="2009">`
- sophisticated comparison performed on the attribute value: `<doc id<="CC20101031B">` matches e.g. BB20101031B, CC20091031B, CC20101030B CC20101031A.

## Fixed string comparisons

- normally the CQL values are regular expressions
- sometimes this is not desirable (batch processing needs escaping of metacharacters)
- new == and != operator introduced for fixed strings comparison
- no escaping needed except for "" and '\'
- examples: ".", "\$", " " matches a single dot, dollar sign and tilda, respectively, "\n" matches a backslash followed by the character n,

# Frequency function

- a frequency constraint allowed in the global conditions part of CQL:  
1: [tag="PP.\*"] 2: [tag="NN.\*"] & f(1.word) > 10

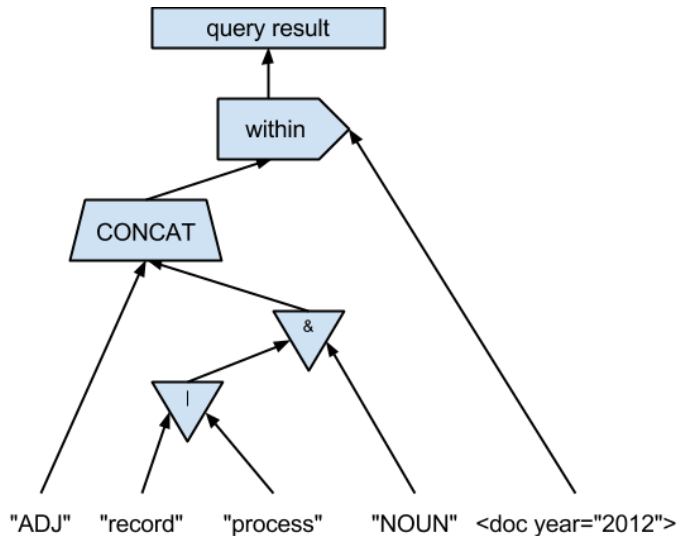
# Performance evaluation

**Table:** Query performance evaluation – corpora legend: ○ BNC (110M tokens), ● BiWeC (version with 9.5G tokens), \* Czes (1.2G tokens)

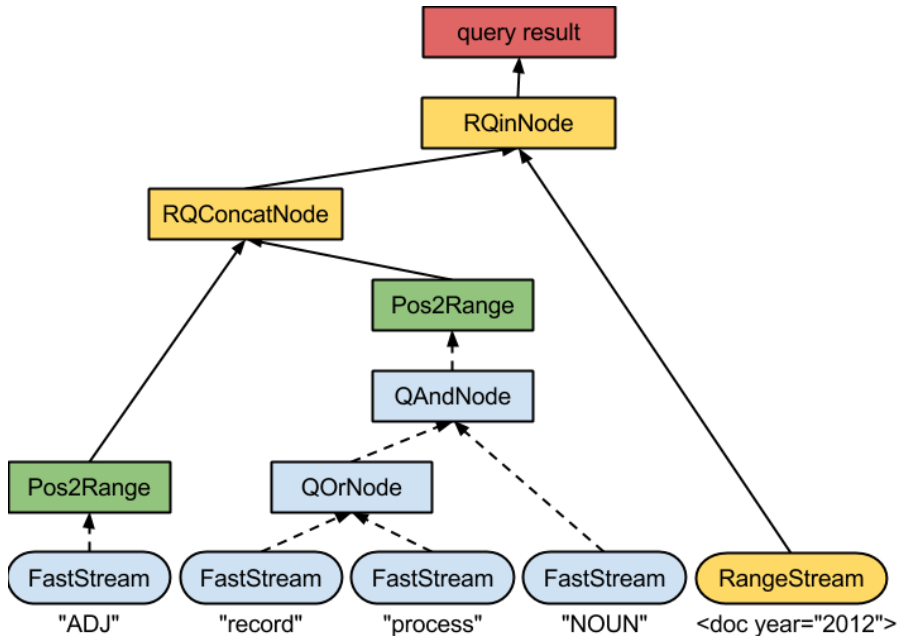
query	# of results	time (m:s)
○ [lemma="time"]	179,321	0.07
○ [lemma="t.*"]	14,660,881	3.12
○ Ex: particles	1,219,973	33.36
● Ex: particles	97,671,485	32:26.48
* Ex: idioms	66	1:6.86
○ Ex: meet/union	3	8.47
● Ex: meet/union	1457	7:13.12

# CQL query evaluation

Example: `[tag="ADJ"] [(word="record" | word="process") & tag="NOUN"] within <doc year="2012"/>`







# Today's Corpora in Sketch Engine

- **LARGE** (= billions of tokens, and it's going to be worse)
- complex multi-level multi-value annotation
- wide range of languages
- growing demand on complex searching – moving from morphology to syntax and semantics
- search API for automatic information retrieval and post-processing in particular applications needed