## Multilingual Corpora

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## A terminological note

- a multilingual corpus any collection of texts in more than one language
- a **parallel** corpus a collection of texts and their corresponding translations (possibly with document/sentence/word level alignment)
- a **comparable** corpus something in between: texts from the same domains in multiple languages; not translations of each other, just thematically related
- a code-switching corpus technically also multilingual, but something very different: a collection in which two or more languages alternate in a single text (possibly even in a single sentence)

### **Outline**

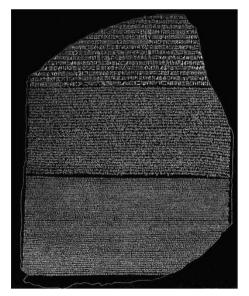
Parallel corpora

Other multilingual non-parallel corpora

Homework

# Parallel corpora

## The mandatory cliché introduction - the Rosetta Stone



## Factors in design of parallel corpora

- which languages; bilingual vs. multilingual
- unidirectional vs. bidirectional
  - Why to consider translation direction? E.g. because of studying "translationese"
- included data sources
  - as in any other corpus: notoriously problematic notion of representativeness/balance
  - authentic vs. synthetic data
- provided alignment
  - document level
  - sentence level
  - word level
  - subword/morpheme level (very rare)
- additional markup: lemmas, POS, syntactic trees ...

## The Bible Corpus

- translations of the Bible.
- easily aligned: verse-parallel alignments
- massively multilingual: 1,600 languages from 90 language families in the JHU version, 4,000 translations (McCarthy, 2020)
- 0.8 MW in the English Bible translation

### **JW300**

- (Agic, Vulic, 2019)
- a complete crawl of jw.org (Jehovah's Witnesses)
- 300 languages, 100 kS per language pair, 1,4 GW in total

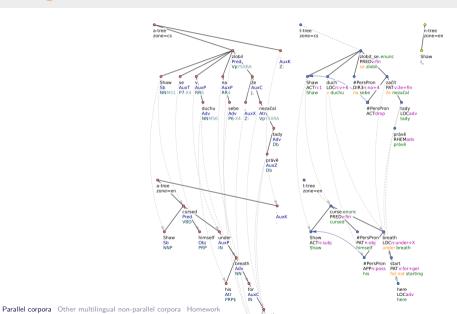
## **Interkorp**

- 61 languages (in 2023), 5GW in total
- parallel search possible: https://treq.korpus.cz
- word-to-word alignment (manual alignment for the "core" part, the rest aligned automatically)

## **CzEng**

- a Czech-English parallel corpus
- collected at ÚFAL for MT purposes
- in 2.0: 61 M sentence pairs (0.7 GW in English, 0.6 GW in Czech)
- automatically parsed in the Prague Dependency Treebank style

## CzEng, cont.



#### **EuroParl**

- proceedings of the European Parliament
- 21 European languages: Romanic (French, Italian, Spanish, Portuguese, Romanian), Germanic (English, Dutch, German, Danish, Swedish), Slavik (Bulgarian, Czech, Polish, Slovak, Slovene), Finni-Ugric (Finnish, Hungarian, Estonian), Baltic (Latvian, Lithuanian), and Greek.
- 60 MW/language

## **JRC-Acquis**

- The Acquis Communautaire the total body of EU law
- JRC = Joint Research Center, a European Commission's science and knowledge service
- JRC-Acquis a parallel corpus of EU legal texts from 1950 to now
- 22 languages: Bulgarian, Czech, Danish, German, Greek, English, Spanish, Estonian, Finnish, French, Hungarian, Italian, Lithuanian, Latvian, Maltese, Dutch, Polish, Portuguese, Romanian, Slovak, Slovenian and Swedish

## The OPUS Corpus

- a collection of translated texts from the web and from many already existing parallel corpora
- in 2020:
  - 57 source corpora
  - 700 languages
  - 70,000 bitexts
- online search interface https://opus.nlpl.eu/

#### **OPUS** search interface





#### ... the open parallel corpus

OPUS is a growing collection of translated texts from the web. In the OPUS project we try to convert and align free online data, to add linguistic annotation, and to provide the community with a publicly available parallel corpus. OPUS is based on open source products and the corpus is also delivered as an open content package. We used several tools to compile the current collection. All pre-processing is done automatically. No manual corrections have been carried out.

The OPUS collection is growing! Check this page from time to time to see new data arriving ... Contributions are very welcome! Please contact < opus-project@helsinki.fi >



| corpus              | doc's | sent's | cs<br>tokens | mn<br>tokens | XCES/XML   | raw   | TMX  | Moses | mono  | raw   | ud | alg     | dic | freq  |        | other<br>files |
|---------------------|-------|--------|--------------|--------------|------------|-------|------|-------|-------|-------|----|---------|-----|-------|--------|----------------|
| GNOME v1            | 649   | 0.2M   | 1.2M         | 1.2M         | xces cs mn | cs mn | tmx  | moses | cs mn | cs mn |    | alg smt |     | cs mn | sample |                |
| MultiCCAligned v1.1 | 1     | 0.2M   | 138.7M       | 5.5M         | xces cs mn | cs mn | tmx  | moses | cs mn | cs mn |    |         |     | cs mn | sample |                |
| XLEnt v1.2          | 1     | 52.0k  | 0.1M         | 0.1M         | xces cs mn | cs mn | tmx  | moses | cs mn | cs mn |    |         |     | cs mn | sample |                |
| QED v2.0a           | 219   | 22.5k  | 0.3M         | 0.2M         | xces cs mn | cs mn | tmx  | moses | cs mn | cs mn |    | alg smt | dic | cs mn | sample |                |
| TED2020 v1          | 181   | 17.2k  | 0.3M         | 0.3M         | xces cs mn | cs mn | tmx  | moses | cs mn | cs mn |    | alg smt | dic | cs mn | sample |                |
| NeuLab-TedTalks v1  | 114   | 7.1k   | 0.1M         | 0.1M         | xces cs mn | cs mn | tmx  | moses | cs mn | cs mn |    |         |     | cs mn | sample |                |
| Mozilla-I10n v1     | 1     | 1.0k   | 0.4M         | 7.5k         | xces cs mn | cs mn |      |       | cs mn | cs mn |    |         |     | cs mn | sample |                |
| total               | 1166  | 0.5M   | 141.1M       | 7.5M         | 0.5M       |       | 0.3M | 0.3M  |       |       |    |         |     |       |        |                |

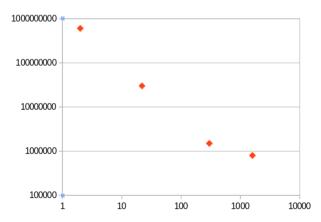
 color:
 size (src+trg):
 16.4k | 32.8k | 65.5k | 0.1M | 0.3M | 0.5M | 1.0M | 2.1M | 4.2M | 8.4M | 16.8M | 33.6M | 67.1M | 134.2M |

#### **OPUS-100**

- 100 languages
- an English centric version a selection of texts whose translations are available also in English
- 44 languages with at least 1M sentences (sentence pairs with English)
- 55M sentence pairs in total

#### Size or size?

- Obvious trade-off: number of languages vs. size of parallel data (words per lang)
- sample: CzEng, JRC-Acquis, JW300, Bible



## Synthetic parallel corpora

- authentic data limited in size, need for data augmentation
- an old idea in Machine Translation: back-translation
  - you need huge training data for MT training from language A to language B
  - you take monolingual data in B and translate them back to A
  - and you use it as parallel training data for A-to-B direction
  - the trick: good quality of the B side; quality of the A side less important
  - possible modification: filter the back-translated data, i.e. keep only reasonably looking sentence pairs

## Other multilingual non-parallel corpora

#### **Common Crawl**

- growing steadily: 200-300 TB/month
- some 160 languages recognized
- in total tens of PB (?)
- massive amount of comparable content can be expected, but no obvious alignment

## **Universal Dependencies**

- 100+ languages
- a common annotation scheme syntactic trees
- mostly tens to hundreds kW per language (max a few MW/language)

#### **CorefUD**

- created at ÚFAL
- coreference + UD
- coreference a relation between two or more expressions ("mentions") in a text that refer to the same entity (or event)
- 21 coreference-annotated datasets for 13 languages
- coreference annotation combined with (automatic or manual) dependency syntax annotation

## **Code switching corpora**

- code switching alternation between two or more languages in a single utterance
- distinct from other language-contact phenomena such as lexical borrowing or calques
- English-Hindi, English-Spanish, Turkish-German ...

## HinDialect - a dialect-continuum corpus

- a collection of folksongs for 26 languages that form a dialect continuum in North India and nearby regions
- Angika, Awadhi, Baiga, Bengali, Bhadrawahi, Bhili, Bhojpuri, Braj, Bundeli, Chhattisgarhi, Garhwali, Gujarati, Haryanvi, Himachali, Hindi, Kanauji, Khadi Boli, Korku, Kumaoni, Magahi, Malvi, Marathi, Nimadi, Panjabi, Rajasthani, Sanskrit.
- see https://lindat.cz



## Homework

## **Homework specification**

- Download a parallel corpus (any).
- Find out how exactly the alignment is represented in that corpus.
- Find pairs of aligned sentences whose lengths (in terms of the number of words) differ substantially.
- Try to explain the main reasons behind the differences. Are they typologically grounded, or is it rather noise resulting from automatic processing, or ... ?
- Summarize and exemplify your findings in a 0.5-1 page report (PDF).
- Create directory hw3 in your git repo, and submit the report into it.
- Optional: you can submit also small data samples which you find relevant for your report.