

Monitor corpus of Slovene and automatic text categorization

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Structure

- Monitor corpora
- The SLED project
- Monitor corpus of Slovene Trendi
- Thematic categorisation of texts



Monitor corpora

- Growing needs for resources that help with monitoring language use
- Why?
 - Detection of new words (lexical neologisms)
 - Detection of new senses (semantic neologisms)
 - Detection of new uses of existing words or multiword units
 - Detection of drops or cessations in word or sense usage
- For whom?
 - Lexicographers (e.g. dictionaries)
 - Linguists, sociolinguists etc. (research)
 - Teachers and learners (education materials)
 - Others



Monitor corpora

Case studies

- Bank of English (650+ mio words): since 1991, no info on updates
- ONLINE (Czech National Corpus): since 2017, last update 2021 (ONLINE-NOW; ONLINE_ARCHIVE)
- Timestamped JSI web corpora (Sketch Engine, 18 languages): 2014 Apr 2021
- NOW corpus (News on the web; Davies 2016-); 15 billion words, from 2010-now
- Coronavirus corpus: 1.3 billion words, 2020 November 2021
- Corpus of Contemporary American English (COCA): over 1 billion words 1990 March 2020



Monitor corpora

- Slovene resources
 - Jezikovni sledilnik (Language Monitor), Centre for Language Resources and Technologies, University of Ljubljana
 - https://viri.cjvt.si/sledilnik/eng/
 - Monthly calculations of most trending words
 - JSI Newsfeed used
 - Many steps (data filtering, calculations) still manually run, no pipeline
 - Growing Dictionary of the Slovenian Language (Fran Ramovš Institute of the Slovenian Language)
 - source of info unclear



SLED project

- Call by the Ministry of Culture:
 - Funding of projects aimed at the development and upgrading of infrastructure for Slovene in the digital environment
- Funding period: Sept. 2021 Oct. 2022
- Amount: 58.300 EUR
- Project website: <u>https://sled.ijs.si</u>

- Core team:
 - Iztok Kosem (project leader)
 - Simon Krek
 - Jaka Čibej
 - Kaja Dobrovoljc
 - Luka Krsnik
 - Nikola Ljubešič
 - Primož Ponikvar
 - Janez Brank

















Activities and aims

- Activity 1: Monitor corpus of Slovene
- Activity 2: Data collections
 - Survey into user needs
 - Data containing various calculations on word usage (e.g. words or phrases with highest surge in recent month(s) or year(s), word of the day etc.)
 - Regular uploads of data into CLARIN.SI repository
- Activity 3: Automatic text categorization (by topic)



Trendi - monitor corpus of Slovene (1)

- Contents of Trendi
 - to complement Gigafida, a reference corpus of written standard Slovene
 - 110 sources (selected from 243 sources in JSI Newsfeed)
 - Version 2022-05 just published!
 - 565 million tokens, nearly 20 million tokens per month
 - News sources regularly added (e.g. necenzurirano.si)

Spremljevalni korpus Trendi 2022-05 // Monitor corpus Trendi 2022-05

| Counts | | General info | | Lexicon sizes | |
|------------|-------------|--------------------|---------------------|------------------|-----------|
| Tokens | 565,308,991 | Corpus description | <u>Document</u> | word | 1,842,693 |
| Words | 473,161,507 | Language | Slovenian | lempos 😨 | 1,087,105 |
| Sentences | 25,186,942 | Encoding | UTF-8 | tag_en 🔞 | 1,303 |
| Paragraphs | 8,326,466 | Compiled | 06/10/2022 18:51:54 | tag 😧 | 1,303 |
| Documents | 1,436,548 | Tagset | Description | ud_pos 🔞 | 17 |
| | | | | ud_feats 😧 | 2,269 |
| | | | | id 🕑 | 9,770 |
| | | | | ud_dep 🚱 | 33 |
| | | | | ud_head_lemma 📀 | 656,488 |
| | | | | ud_head_tag_en 🚱 | 1,244 |
| | | | | ud_head_tag 🔞 | 1,244 |

Word list

Corpus: **Trendi (spremljevalni)** Total number of items: **142** Total frequency: **1,436,548**

| <u>text.publisher</u> | document frequency |
|---------------------------------|--------------------|
| Slovenska tiskovna agencija STA | 228,456 |
| MMC RTV Slovenija | 121,357 |
| STA d.o.o. | 97,916 |
| Delo | 81,789 |
| 24ur.com | 76,333 |
| Siol.net Novice | 57,555 |
| Dnevnik | 55,335 |
| vecer.com | 53,538 |
| Svet24 | 34,714 |
| Slovenske novice | 31,356 |
| Žurnal24 | 30,465 |
| Športni Dnevnik Ekipa | 30,039 |
| Tednik Demokracija | 28,902 |
| Vestnik | 28,760 |
| Gorenjski Glas | 27,964 |

Keywords (Trendi vs Gigafida 2.0)

| | Trendi (| (spremljevalni) | Gigafida v2.0 (re | Gigafida v2.0 (referenčni, dedupliciran) | | |
|-----------------|----------------|------------------|-------------------|--|-------|--|
| lempos | frequency | frequency/mill 🚱 | frequency | frequency/mill | Score | |
| quot-s | <u>601,486</u> | 1064.0 | <u>12</u> | 0.0 | 107.3 | |
| nbsp-s | <u>384,144</u> | 679.5 | <u>119</u> | 0.1 | 68.3 | |
| koronavirus-s | <u>296,948</u> | 525.3 | <u>172</u> | 0.1 | 52.8 | |
| covid-s | <u>228,868</u> | 404.9 | 0 | 0.0 | 41.5 | |
| pandemija-s | <u>136,041</u> | 240.6 | <u>1,573</u> | 1.2 | 22.4 | |
| epidemija-s | <u>211,646</u> | 374.4 | <u>9,936</u> | 7.5 | 22.0 | |
| cepivo-s | <u>159,051</u> | 281.4 | <u>12,703</u> | 9.5 | 14.9 | |
| okužba-s | <u>327,586</u> | 579.5 | <u>40,839</u> | 30.6 | 14.5 | |
| sta-n | <u>172,811</u> | 305.7 | <u>17,203</u> | 12.9 | 13.8 | |
| karantena-s | <u>74,140</u> | 131.1 | <u>2,574</u> | 1.9 | 11.8 | |
| piškotek-s | <u>69,415</u> | 122.8 | <u>1,797</u> | 1.3 | 11.7 | |
| cepljenje-s | <u>139,038</u> | 246.0 | <u>19,089</u> | 14.3 | 10.5 | |
| Nijz-s | <u>44,790</u> | 79.2 | <u>76</u> | 0.1 | 8.9 | |
| coviden-p | <u>41,216</u> | 72.9 | 0 | 0.0 | 8.3 | |
| cepljen-p | <u>56,378</u> | 99.7 | <u>4,340</u> | 3.3 | 8.3 | |
| epidemiološki-p | <u>46,091</u> | 81.5 | <u>1,564</u> | 1.2 | 8.2 | |
| href=-s | <u>40,361</u> | 71.4 | 0 | 0.0 | 8.1 | |
| Šarec-s | <u>48,100</u> | 85.1 | <u>2,345</u> | 1.8 | 8.1 | |
| okužen-p | <u>101,315</u> | 179.2 | <u>20,149</u> | 15.1 | 7.5 | |
| covid-k | <u>36,131</u> | 63.9 | 0 | 0.0 | 7.4 | |
| LMŠ-s | <u>41,197</u> | 72.9 | <u>1,877</u> | 1.4 | 7.3 | |
| PCR-s | <u>34,326</u> | 60.7 | <u>142</u> | 0.1 | 7.0 | |
| Levica-s | <u>32,515</u> | 57.5 | <u>101</u> | 0.1 | 6.7 | |
| PCT-s | <u>28,408</u> | 50.3 | <u>57</u> | 0.0 | 6.0 | |
| cepiti-g | <u>44,880</u> | 79.4 | <u>7,026</u> | 5.3 | 5.9 | |
| odmerek-s | <u>76,880</u> | 136.0 | <u>20,024</u> | 15.0 | 5.8 | |
| zajezitev-s | <u>32,542</u> | 57.6 | <u>2,592</u> | 1.9 | 5.7 | |
| Dončić-s | <u>47,801</u> | 84.6 | <u>9,402</u> | 7.1 | 5.5 | |
| testiranje-s | <u>89,671</u> | 158.6 | <u>27,429</u> | 20.6 | 5.5 | |



Trendi - monitor corpus of Slovene (2)

Article collection and annotation pipeline

- Articles downloaded daily, in JSON format; JSI Newsfeed service used for now
- Deduplication at URL level
- Annotation:
 - Classla-stanza (Ljubešić and Dobrovoljc 2019): sentence segmentation, tokenisation, morphosyntactic annotation and lematisation
 - parsing using Universal Dependencies
 - Named-entity recognition



Trendi - monitor corpus of Slovene (3)

- Article collection and annotation pipeline
 - Conversions:
 - CONNL-U \rightarrow TEI XML (daily)
 - TEI-XML \rightarrow VERT (monthly)
- Availability
 - In corpus tools KonText CLARIN.SI and NoSketchEngine CLARIN.SI
 - ccTRendi version (selected paragraphs from each text) in CLARIN.SI repository under CC 4.0 BY-SA



Automatic text categorization (1)

Developing a classification of categories

- Three sources:
 - Six popular read news portals
 - •
- •
- .
- .



Aktualno

Odločitev vlade v sredo / Prvi sveženj ukrepov proti draginji naj bi zajemal pogonska goriva

Energetiki napovedujejo dodatne podražitve električne energije. Vlada medtem pripravlja ukrepe za blažitev posledic energetske in prehranske draginje. Prvi sveženj naj bi bil že pripravljen za sprejemanje v sredo na seji vlade.



Dirka po Sloveniji / Pogačar: Vesel sem, da sem na startu ene najlepših dirk na svetu

Na 28. Dirki po Sloveniji bo lansko zmago branil Tadej Pogačar, prvi kolesar svetovne lestvice, ki je tudi letos glavni favorit, da v Novo mesto prikolesari v zeleni majici.



Automatic text categorization (1)

- Developing a classification of categories
 - Three sources:
 - Six popular read news portals
 - Thematic codes by IPTC (International Press Telecommunications Council)
 - Categories from corpora, esp. SYN_2015 and Estonian National Corpus
 - Aim was to have a relatively small number of categories
 - To compare: IPTC 17 top-level (out of 1400); SYN_2015 13; ENC 25
 - Final set: 13 categories

| Trendi category | Slovene | SYN_2015 | ENC | ІРТС |
|---------------------------|---------|-------------|---------------------------------|--|
| Arts and culture | 5 | culture | culture & entertainment | arts, culture and entertainment |
| Crime and accidents | 6 | crime | / | disaster and accident |
| Economy | 6 | economy | economy, finance & business + 2 | economy, business and finance; labour |
| Environment | 2 | / | nature & environment | environmental issue |
| Health | 3 | / | health | health |
| Leisure | 4 | leisure | beauty + 7 | lifestyle and leisure |
| Politics and Law | 1 | politics | politics & government | Politics + 2 |
| Science and Technology | 5 | / | science, technology & IT | science and technology |
| Society | 1 | social life | society; religion; sex; women | social issue + 2 |
| Sports | 6 | sports | sports | sport |
| Weather | 4 | / | / | weather |
| Entertainment | 4 | / | culture & entertainment* | arts, culture and entertainment* |
| Education | 1 | / | education | education |



Automatic text categorization (2)

Preparing training datasets

- class balance: each category to contain an equal number of examples
- source balance: equal or similar number of examples from various resources
- Two datasets: 1000 instances per category; 3000 instances per category (to see if larger means better)
- Evaluation datasets: 100 per category for development, 100 for evaluation
- Problems:
 - Some categories have subpages on only certain portals (e.g. education, weather)
 - Some categories even do not have subpages (e.g. politics, society)



Future work

- Regular monthly updates of the Trendi corpus
- Regular updates of statistical calculations
- Finishing the development of automatic text categorisation tool
- Finishing the development of a new newsfeed collection pipeline
- And last but not least...



Implementation into lexicographic practice!



| CJVt ^{sopomenke} | | ideja | c | ۶ 🗰 | ≡ |
|---------------------------|---------|--------------------------------|------------|-----|-----|
| ideja 2017-11-24 | | | | | 000 |
| Relevantnost 👻 | Pogosto | əst • + | | | |
| zamisel | | predstava filozofija | | | |
| misel | | bežen vtis | | | |
| domislica | | nejasna predstava | | | |
| | | | | | |
| odkritje | | pojem | pojmovanje | | |
| pogruntavščina | | koncept | | | |
| zasnova | | pogled | | | |





Thank you!

Hvala!

Aitäh!