## Natural language processing

## Slavko Žitnik

University of Ljubljana Faculty for computer and information science



March 2024

March 2024

## Natural language processing

association analysis

document summarization

lexical analysis

information retrieval named entity recognition

concept extraction sentiment analysis

text clustering text categori

ext clustering text categorization coreference resolution

sentiment analysis

information extraction

link mining

200

entity extraction pattern recognition

visualization

relation modeling

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### Ivan Cankar

Writer

Wikipedia

Ivan Cankar was a Slovene writer, playwright, essavist, poet and political activist. Together with Oton Župančič, Dragotin Kette, and Josip Murn, he is considered as the beginner of modernism in Slovene literature.

Born: May 10, 1876, Vrhnika

Died: December 11, 1918, Ljubljana

Education: University of Vienna

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Dragotin Kette







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Article Talk

Ivan Cankar

From Wikipedia, the free encyclopedia

Ivan Cankar (4) pronunciation (help-info)) (10 May 1876 - 11 December 1918) was a Slovene writer, playwright, essavist, poet and political activist. Together with Oton Župančič. Dragotin Kette, and Josip Murn, he is considered as the beginner of modernism in Slovene literature. He is regarded as the greatest writer in the Slovene language, and has sometimes been compared to Franz Kafka and James Joyce.[1]

#### Contents [hide]

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- 3 Personality and world view
- 4 Influence
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### Biography [edit]



Cankar's birth house in Vrhnika

realism and national liberalism.[8]

Ivan Cankar was born in the Carniolan town of Vrhnika near Liubliana. He was one of the many children of a poor artisan who emigrated to Bosnia shortly after Ivan's birth.[2] He was raised by his mother, Neža Cankar née Pivk, with whom he established a close, but ambivalent relationship.[3][4] The figure of a self-sacrificing and submissively repressive mother would later become one of the most recognizable features of Cankar's prose.[5][6] After finishing grammar school in his hometown, he studied at the Technical High School (Realka) in Liubliana.

During this period, he started writing literature, mostly poetry, under the

influence of Romantic and post-Romantic poets such as France Prešeren, Heinrich Heine, Simon Jenko and Simon Gregorčič.[7] In 1893, he discovered the epic poetry of Anton Aškerc, which had a

huge influence on the development of his style and ideals. Under Aškerc's influence, Cankar rejected the sentimental post-Romantic poetry and embraced literary

Ivan Cankar

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10 May 1876 Vrhnika, Duchy of Carniola, Austria-Hungary (now in Slovenia)

11 December 1918 (aged 42) Liubliana, Kingdom of Serbs. Croats and Slovenes (now the

capital of Slovenia) Occupation Writer, essayist, playwright, poet,

political activist Genres plays, short stories, short novels,

essays Symbolism, Modernism

Literary movement

Born

Died

In 1896, he enrolled at the University of Vienna, where he studied engineering, but later switched to Slavic philology.[2] In Vienna, he soon started to lead a bohemian lifestyle. He came under the influence of contemporary European literature, especially decadentism, symbolism and naturalism. He became friends with Fran Govekar, a young Slovene writer and intellectual living in Vienna, who introduced him to positivism and natiralism. [9] Between 1897 and 1899. Cabkar's core of the control of the co

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Ivan Cankar

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Cankar's birth house in Vrhnika

realism and national liberalism.[8]

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1918-12-11 (xsd:date)

dbpedia:Kingdom of Yugoslavia

dbpedia:Ljubljana

plays, short stories, short novels, essays

Ivan Cankar

most of modern Slovenian literature, Fulvio Tomizza

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 dbpedia:Leo\_Tolstoy dbpedia:Ralph\_Waldo\_Emerson

dbpedia:Fvodor Dostovevsky

dbpedia:Modernism

dbpodia:Symboliem (arte)

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10 May 1876 Born

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plays, short stories, short novels, essays

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Ivan Cankar 10 May 1876 Born

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Vrhnika, Duchy of Carniola,

(now in Slovenia)

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Text excerpt

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Ivan Cankar Išči

#### 666 najdenih zadetkov:

Ivan Cankar - Wikipedija, prosta enciklopedija ★ ★ ★ ★ ★ Ivan Cankar se je rodil v hiši Na klancu 141, kot eden od dvanajstih otrok obrtniško-proletarske družine. Leta 1882 se je vpisal v osnovno ...

<u>Ivan Cankar – največji mojster slovenske besede</u> ★★★★ <u>Ivan Cankar</u> se je rodil na Vrhniki (na Klancu) 10. maja 1876 kot osmi otrok v propadajoči obrtniško – proletarski družini trškega krojača ...

### Cankarjeva smrt je bila političen umor ★★★★ Cankarjeva smrt je bila političen umor. Pisatelj, politik in ljudski tribun

Cankarjeva smrt je bila politicen umor. Pisatelj, politik in ljudski tribun Ivan Cankar Ivan Cankar velja za največjega slovenskega pisatelja in ...

## [PDF] Ivan Cankar (1876 - 1918) ★★★★ Ivan Cankar (1876 - 1918), Največii moister slovenske besede in

osrednja postava v moderni književnosti izvira iz revne družine ...

### ŽIVLJENJEPIS Ivan Cankar ★★★★

Ivan Cankar se je rodil 10. maja leta 1876 v kmečko družino na. Vrhniki. V družini je bilo osem otrok. Zapustil je družino. Ker je bil zelo ...

#### Ivan Cankar memorial house \*\*\*

Ivan Cankar memorial house. Ivan Cankar (1876 – 1918) is considered to be Slovenia's most important writer. The original house ...

1 | 2 | 3 | 4 | 5 | ... | Zadnja



Ivan Cankar

Informacije ekstrahirane iz 25 zadetkov, najdenih 666:

Ljubijanska Realka

Cankarjeva mati

seJeŠolal

mati

prijateli

Josip Murn

Ivan Cankar

prijatelj

Hlapec Jernej in njegova pravica

Dragotin Kette

Ivan Cankar - Wikipedija, prosta enciklopedija ★★★★
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otrok v propadajoči obrtniško – proletarski družini trškega krojača ...

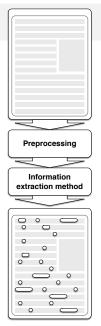
## Definition

### Information extraction

- type of information retrieval
- goal to automatically extract structured data from unstructured data sources

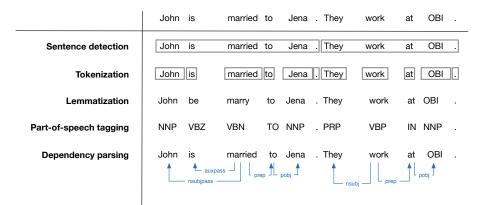
## **Subtasks**

- named entity recognition
- relationship extraction
- coreference resolution

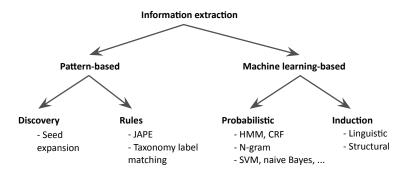




## Preprocessing



## General approaches



## Named entity recognition

Person Person Position Organization

John is married to Jena. He is a mechanic at OBI and she also works there .

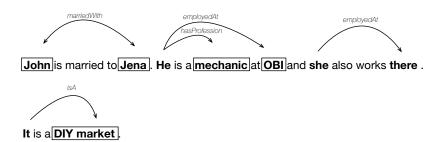
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It is a DIY market

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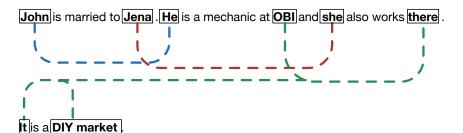
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## Relationship extraction



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## Coreference resolution

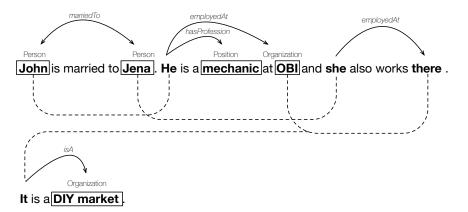


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## End-to-end information extraction



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## Course goals

### Goals

- To study algorithms and methods for building computational models of natural language processing.
- To study issues involved in understanding natural languages together with cognitive and linguistic phenomena.
- To identify a text processing problem, design a solution and practically solve it.
- To get to know existing NLP approaches, techniques, tools and the state-of-the-art in the field.
- To become profficient in the end-to-end text processing problems handling.

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## Syllabus

## **Proposed syllabus**

- Corpora acquisition and tagging, preprocessing techniques
- Information extraction tasks and systems
- Slovene text processing, regular expressions, rule based systems
- Unsupervised learning and visualisation, classification and tagging techniques
- Semantic web and ontologies (optional)
- (Deep) Neural networks for text (optional)
- Generative and conversational AI (optional)
- LLMs and new NLP frameworks (optional)
- Text processing assignment (practical work)

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## Assignment goals

### Goals

- End-to-end NLP task processing
- Understanding of existing works
- Presenting results in an article-like report

### Tools

- Python 3.10 (Anaconda) and an optional deep NLP library (PyTorch, Tensorflow, Keras)
- Preferred IDE: JetBrains PyCharm (free for students, otherwise Community Edition)
- Other tools & languages: KNIME, Orange, ...

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## **REPORT**



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## Submission

## **PDF Report**

- Follow IMRAD (Introduction-Methods-Results-And-Discussion) structure. A full paper should have Abstract, Introduction, Related work, (Data), Methods/Algorihtms/..., Results/Evaluation/Experiments, (Discussion) and Conclusion.
- Use provided LaTeX template (if not submitting to another venue).
- Submit a manuscript up to 6 pages long (max) + references + appendices.

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## Submission

## LATEX template

### PDF Repo

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Results

John Doe, Jane Doe, and Mike Smith

University of Liubliana Faculty of Computer and

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#### Abstract

The abstract goes here. The abstract goes here.

#### Keywords

Keyword1, Keyword2, Keyword3 ...

Advisors: Slavko Žitnik

#### Introduction

These latex files are intended to serve as a the template for the NLP course at FRI. The template is adapted from the FRI Data Science Project Competition, template If you find mistakes in the template or have problems using it, please consult Jure Demšar (jure.demsar@fri.uni-lj.si).

In the Introduction section you should write about the relevance of your work (what is the nurnose of the project

#### Equations

You can write equations inline, e.g.  $\cos \pi = -1$ ,  $E = m \cdot c^2$ and a, or you can include them as separate objects. The Bayes's rule is stated mathematically as:

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Project report

$$P(A|B) = \frac{P(B|A)P(A)}{P(B)},$$

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## **RELATED WORK**



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## Related work

## Related work search

- NLP Journals, conferences
  - Computational linguistics, TACL, NLE, IJCL
- ACL 2023, EMNLP 2023, NeurIPS 2023, LREC-COLING 2024
- NLP Shared Tasks, workshops
  - CoNLL 2020 SemEval 2020, CodaLab
- Code, paper repositories
  - arXiv.org, Google Scholar, Papers with code, HuggingFace

### Slovene NLP resources

- NLP Journals, conferences
  - Slovenščina 2.0
  - JTDH 2020
- NLP resources, projects
  - CLARIN.SI, CJVT, slovenscina.eu

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