### Delving deep into some UFAL data and tools

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### Introduction

#### Master Thesis

- Ontology Enrichment Based on Unstructured Text Data
- supervised by Martin Nečaský, Department of Software Engineering

#### **Dissertation Thesis**

Exploiting linguistic knowledge for relation extraction from texts

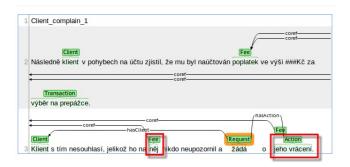
# My very first year at UFAL

- Recent research on coreference resolution at UFAL
- Extraction of numerical expression in INTLIB project
- Sentence diagramming editor ČAPEK

# Coreference - my field of interest

Coreference resolution within information extraction

- real-word data
  - medical domain
  - banking domain
- extraction of entities and relations
- coreference between entities



### Coreference resolution

#### Grammatical coreference

- Nguy 2006
  - set of rules
  - over 90% F-measure

#### Textual coreference - pronouns

- Nguy and Žabokrtský 2007
  - rule based
  - ▶ 74,2% F-measure
- Nguy et al. 2009
  - C5.0 classifier 76,3% F-measure
  - perceptron ranking 79,4% F-measure

# Coreference resolution, cont.

### Textual coreference - name phrases

- Novák 2010
  - maximum entropy ranking
  - 39,4% F-measure
- Novák and Žabokrtský 2011
  - maximum entropy classifier 42,3% F-measure
  - maximum entropy ranking 44,3% F-measure
  - perceptron ranking 44,4% F-measure

### INTLIB - extraction of numerical expressions

http://ufal.mff.cuni.cz/grants/intelligent-library

Problem: extraction of structured information from unstructured text

- extraction of dictonary items
  - entities , units , attributes
- extraction of numerical expressions
- their linking

Provozní doba zařízení je 8 <mark>hod/den</mark>, tj. cca 1000-1120 <mark>hod/rok</mark> Kapacita parkování v terminálu bude 507 vozidel.

### INTLIB - extraction of numerical expressions

#### Solution: extraction using the GATE tool

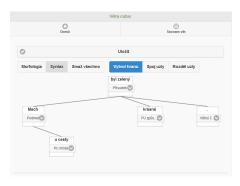
- dictionaries generation of morphological forms with CzechMorpho
- annotation with GATE gazeteers & regular expressions
- tagging with Treex GATE plugin
- annotations linking with regular expressions over annotations (GATE JAPE plugin):

```
(Attribute) (Entity, Tag= "N...2") (Token){0,5} (Number) (Unit)
```

Provozní doba zařízení je 8 hod/den, tj. cca 1000-1120 hod/rok

#### http://ufal.mff.cuni.cz/capek

- sentence diagramming editor for schoolchildren
- collect the diagrams and transform them to PDT
- based on the results of Hana and Hladká, 2012
- GAUK n. 1568314, duration 2014 2016



# ČAPEK

#### Problems:

- how to combine sentence diagrams of multiple users to better one?
- how to measure user agreement on sentence diagrams?

Paper (Hana, Hladká, Lukšová, 2014) submitted to LAW VIII workshop, COLING 2014

### ČAPEK - Tree Edit Distance

- measuring of user agreement on a sentence diagram
- adjusted Tree Edit Distance
- including 4 operations
  - split, join, create node, change parent, change label

$$TED(D_1, D_2, n) = (\#SPL + \#JOIN + \#INS + \#LINK + \#SLAB)/n$$

|                | (T1,T2) | (T1,S1) | (T1,S2) | (S1,S2) |
|----------------|---------|---------|---------|---------|
| # of sentences | 101     | 91      | 101     | 91      |
| TED            | 0.26    | 0.49    | 0.56    | 0.69    |

Table: Average TED for pairs of teachers (T1, T2) and students (S1, S2)

# ČAPEK - multiple diagram combination

- majority voting on token join/split
- diagram edge weighting based on user voting
- greedy algorithm to find edges and labels of a final sentence diagram

#### Experiments with 7 annotators:

|     | U1   | U2   | U3   | U4   | U5   | U6   | U7   | their combination |
|-----|------|------|------|------|------|------|------|-------------------|
| TED | 0.78 | 0.63 | 0.56 | 0.76 | 0.38 | 0.62 | 1.21 | 0.40              |

Table: Average  $\overline{TED}$  for pairs of teacher T1 and users U1,...,U7 and their combination MV

### References I

[1] J. Hana and B. Hladká.

Getting more data - schoolkids as annotators.

In *LREC*, pages 4049–4054. European Language Resources Association (ELRA), 2012.

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Proposal of a set of rules for anaphora resolution in Czech. Master's thesis, 2006.

[3] G. L. Nguy, V. Novák, and Z. Žabokrtský. Comparison of Classification and Ranking Approaches to Pronominal Anaphora Resolution in Czech.

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### References II

[4] G. L. Nguy and Z. Žabokrtský.

Rule-based Approach to Pronominal Anaphora Resolution Applied on the Prague Dependency Treebank 2.0 Data.

In A. Branco, T. McEnery, R. Mitkov, and F. Silva, editors, Proceedings of the 6th Discourse Anaphora and Anaphor Resolution Colloquium (DAARC 2007), pages 77–81, Lagos (Algarve), Portugal, 2007. University of Lisbon, Faculty of Sciences, CLUP-Center for Linguistics of the University of Oporto.

- [5] M. Novák and Z. Žabokrtský. Resolving Noun Phrase Coreference in Czech. Lecture Notes in Computer Science, 7099:24–34, 2011.
- [6] M. Novák. Machine Learning Approach to Anaphora Resolution. Master's thesis, 2010.