# Evaluation of Uryupina's coreference resolution features for Polish 

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## Uryupina's features

- Over 350 linguistic features which can be used to recognize coreference
- Language independency

Research goals:

- Verify language independency statement by checking the impact of a certain subset of features on coreference resolution for Polish
- Build coreference resolution tool for Polish language based on acquired results


## Uryupina's features classification

- Surface similarity (implemented 88)
- Syntactic knowledge (implemented 9 core features)
- Semantic compatibility (omitted for the time being)
- Discourse structure and salience (implemented about 46, omitted in this presentation)
- Anaphoricity and antecedenthood (implemented 4 new features)


## Surface features configurations (1)

- all: all 88 implemented surface features
- baseline1: exact match for full names only
- baseline2: baselinel features and head exact matching
- MED+head: baseline1 and all MED based features
- MED-head: baseline1 features and MED based features without substring selection
- MED_w-head: baseline1 and MED measured in words features
- MED_s-head: baseline1 and MED measured in symbols features
- MED_bare-head: baseline1 and MED based features without length normalizations and substring selection


## Surface features configurations (2)

- MED ante-head: baseline1 and all MED features with normalization by antecedent length and without substring selection
- MED_anaph-head: baseline1 and all MED features with normalization by anaphor length and without substring selection
- Last: baseline1 and exact match for last word in mentions
- First: baseline1 and exact match for first word in mentions
- Rarest: baseline1 and rarest word-based features, each rarest feature is implemented for base forms of words and text forms
- No_MED: all implemented features without approximate match features


## Surface features configurations (3)

- No_abbrev: all implemented features without abbrev1 and abbrev2-based features
- No_rarest: all features without rarest word-based ones
- No_rarest_parser: all features without the rarest word-based ones and features using parsing (i.e., all types of matching except for abbreviation and head matching algorithms)


## Normalization functions

- no_case - ignore case in strings
- no_punctuation - strips off all punctuation marks and other auxiliary characters
- no_determiners - strips off determiners from text (omitted for the time being)


## Syntactic knowledge features

 8- Post-modification: checks whether the head is not the last word in mention string
- Number: checks the grammatical number of the anaphor or the antecedent
- Person: checks the grammatical person of the anaphor or the antecedent
- Same number: checks if the anaphor and the antecedent share the same number
- Same person: checks if the anaphor and the antecedent share the same person
- Syntactic agreement: checks if the anaphor and the antecedent share the same number and person


## Anaphoricity and antecedenthood features

- Surface
- Syntactic
- Semantic
- Salience
- Kartunnen-motivated features
- Same_head features:
- Same_head_exist: checks if there is a mention with same head as given in the preceding text
- Same_head_distance: measure distance between given markable and one with the same head in the preceding text


## Experiments conditions

- Measure - following CONLL-2011 (Pradhan et al.) average score of MUC, $\mathrm{B}^{3}$ and CEAFE
- Coreference decisions tests were performed using J48, WEKA's implementation of the C4.5 decision tree learning algorithm and weka classifier
- Texts - 390 files sample from Polish Coreference Corpus (http://zil.ipipan.waw.pl/ PolishCoreferenceCorpus)
- Scores were measured using 10 fold crossvalidation
- Test environment - BART (http://www.bartcoref.org/)


## Experiment 1: surface similarity

| Configuration | no | no_case | no_punctuation | full | all |
| :---: | :---: | :---: | :---: | :---: | :---: |
| all | 0.72 | 0.72 | 0.72 | 0.72 | 0.72 |
| baseline1 | 0.69 | 0.70 | 0.69 | 0.70 | 0.70 |
| baseline2 | 0.69 | 0.69 | 0.69 | 0.69 | 0.69 |
| MED+head | 0.70 | 0.70 | 0.70 | 0.70 | 0.70 |
| MED-head | 0.71 | 0.71 | 0.71 | 0.71 | 0.71 |
| MED_w-head | 0.69 | 0.70 | 0.69 | 0.70 | 0.69 |
| MED_s-head | 0.72 | 0.72 | 0.72 | 0.72 | 0.72 |
| MED_bare-head | 0.70 | 0.70 | 0.70 | 0.70 | 0.71 |
| MED_ante-head | 0.72 | 0.72 | 0.72 | 0.72 | 0.72 |
| MED_anaph-head | 0.72 | 0.72 | 0.71 | 0.72 | 0.72 |
| last | 0.69 | 0.70 | 0.69 | 0.70 | 0.70 |
| first | 0.69 | 0.70 | 0.69 | 0.70 | 0.70 |
| rarest | 0.72 | 0.72 | 0.72 | 0.72 | 0.72 |
| no_MED | 0.71 | 0.71 | 0.71 | 0.71 | 0.70 |
| no_abbrev | 0.72 | 0.72 | 0.72 | 0.71 | 0.71 |
| no_rarest | 0.70 | 0.70 | 0.70 | 0.70 | 0.70 |
| no_rarest_parser | 0.70 | 0.70 | 0.70 | 0.70 | 0.70 |

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## Experiment 1: conclusion

- Using normalizations for Polish coreference resolution can result in slight, but not very noticeable increase, best for no_case normalization
- Worst normalization is no_punctuation, even than without using normalization
- Best surface configurations: all, MED_s-head, MED_ante-head, MED_anaph-head, rārest and no_abbrev
- Best aproaches: rarest words, MED algorithm (specially based on signs)
- Configurations using head words obtain slightly lower scores than those not using it


## Experiment 2: adding complex features

| Configuration (F-score) | CEAFM | CEAFE | MUC | B3 | average |
| :---: | :---: | :---: | :---: | :---: | :---: |
| syntactic | 0.71 | 0.77 | 0.00 | 0.83 | 0.53 |
| all + synt | 0.75 | 0.80 | 0.53+ | 0.84+ | 0.72 |
| MED_s-head + synt | 0.76- | 0.80- | 0.48- | 0.84- | 0.71- |
| MED_ante-head + synt | 0.77 | 0.82 | 0.49 | 0.85- | 0.72 |
| MED_anaph-head + synt | 0.77- | 0.81- | 0.49 | 0.85- | 0.72 |
| rarest + synt | 0.77+ | 0.82 | 0.51+ | 0.85+ | 0.73+ |
| no_abbrev + synt | 0.74- | 0.79- | 0.52 | 0.83 | 0.72 |
| same_head | 0.71 | 0.77 | 0.00 | 0.83 | 0.53 |
| all + same_head | 0.61- | 0.66- | 0.45- | 0.72- | 0.61- |
| MED_s-head + same_----------------1-1 | 0.71- | 0.77- | 0.44- | 0.81- | 0.67- |
| MED_ante-head + same_head | 0.71- | 0.76- | 0.44- | 0.81- | 0.67- |
| MED_anaph-head + same_head | 0.73- | 0.78- | 0.45- | 0.82- | 0.68- |
| rarest + same_head | 0.76 | 0.82 | 0.50 | 0.84 | 0.72 |
| no_abbrev + same_head | 0.61- | 0.66- | 0.45- | 0.72- | 0.61- |
| synt + same_head | 0.72 | 0.78 | 0.07 | 0.83 | 0.56 |
| all + synt + same_head | 0.57- | 0.62- | 0.45- | 0.68- | $0.58-$ |
| MED_s-head + synt + + same_head | 0.-68- | 0.74- | 0.44-- | 0.78-- | 0.--35- |
| MED_ante-head + synt + same_head | 0.70- | 0.76- | 0.45- | 0.80--- | 0.67- |
| MED_anaph-head + synt + same_head | 0.69- | 0.75- | 0.44- | 0.79- | 0.66- |
| rarest + synt +-same_head | 0.74- | 0.80- | 0.49- | 0.83- | 0.71- |
| no_abbrev + synt + same_head | 0.57- | 0.61- | 0.45- | 0.68- | 0.58- |

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## Experiment 2: conclusion

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- Best configuration: rarest configuration + syntactic features
- Rarest based features are very good predictors of coreference in the Polish language
- Syntactic features do not provide any advantage on other surface configurations than rarest based ones
- Same head features affect coreference resolution in a very negative way
- Using only syntactic information and/or same_head features does not produce satisfying results
- Surface similarity features are indispensable in coreference resolution for Polish and no sufficient score is likely to be obtained with higher-level features only


## Thank you...

