Erik - Katja O O

Lexical Patterns or Dependency Patterns: Which is better?

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Debate: shallow parsing vs full parsing

• Erik (engineer)

Shallow parsing information (part-of-speech tags) is sufficient for performing NLP tasks. It is robust and easy to obtain. Parsers make many errors and they are slow!

· Katja (scientist)

Actually parsers are getting better and faster all the time. From parse trees you can obtain generalized information and retrieve non-local dependencies. Dependency parsing is the way to go!

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Previous work

- Lexical patterns: P=0.48; R=0.45; F=0.46; T=45,979
 Tjong Kim Sang and Hofmann, Automatic Extraction of Dutch Hypernym-Hyponym Pairs. In: Proceedings of CLIN-2006.
- Dependency parsing: P=0.22; R=0.30; F=0.25; T=5,115 Hofmann and Tjong Kim Sang, Automatic Extension of Non-English WordNets. In: Proceedings of SIGIR'07.

But papers use different evaluation methods and the systems have access to different amounts of training data.

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Task: hypernym extraction

A hypernym of a term \boldsymbol{X} is another term \boldsymbol{Y} which both covers the meaning of \boldsymbol{X} and is broader.

Examples:

meubel is a hypernym of dier is a hypernym of slak iets is a hypernym of alles

Hypernym information can be found in lexical resources like WordNet and EuroWordNet but these resources are incomplete.

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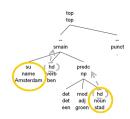
Identifying hypernyms with lexical patterns

- Hearst (1992) identified hypernym pairs from lexical patterns
- Example pattern: H such as A, B and C
- $\bullet\,$ From the pattern we conclude: H is a hypernym of A, B and C
- The patterns make use of part-of-speech tags and lemma information

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Finding hypernyms with dependency patterns



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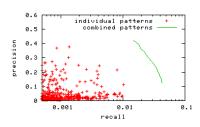
Predicting hypernymy from learned patterns

- Collect and store all contexts of noun pairs in sentences.
- Use frequent contexts (patterns) as features representing noun pairs.
- Present a collection of positive (hypernym-hyponym) pairs and negative pairs to a machine learner as training data
- Let the system build a model for predicting whether two nouns are related according to hypernymy based on their contexts in text

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Graph of the approach



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Evaluation

- \bullet We measure precision (P), recall (R) and F-rates (F $_{\beta=1})$ according to the performance on the test data
- Since it is difficult to evaluate both systems on exactly the same test set, we also record the target number of positive pairs (T)

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Results for the Twente Nieuws Corpus

News texts; 23 million sentences; 300 million words

| | Lexical | Dependency |
|---------------|----------|------------|
| | approach | approach |
| Targets | 35,441 | 43,267 |
| Precision | 0.051 | 0.085 |
| Recall | 0.121 | 0.160 |
| $F_{\beta=1}$ | 0.072 | 0.111 |

The dependency approach performs better despite many efforts (data representation optimizations) to improve the lexical results.

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Results for Wikipedia

Encyclopedic texts: 5 million sentences; 174 million words

| | approach | approach |
|---------------|----------|----------|
| Targets | 15,623 | ??? |
| Precision | 0.321 | ??? |
| Recall | 0.137 | ??? |
| $F_{\beta=1}$ | 0.192 | ??? |

The lexical approach needs one day for processing Dutch Wikipedia. The dependency parsing approach requires several months!

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Concluding remarks

For the current task, automatically predicting noun hypernyms, dependency patterns outperform lexical patterns on **ALL** tested evaluation measures.

However, the dependency parsing approach needs considerably more computational resources than the lexical approach.

Tip: if your corpus is small or if you have access to a computer cluster, use the dependency parsing approach. Otherwise use the lexical approach.

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THE END

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