Apertium-IceNLP: A rule-based Icelandic to English machine translation system

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### Apertium-IceNLP: Why?

- $\blacksquare$  No freely available large parallel corpus exists for Icelandic  $\Rightarrow$  SMT not an option.
- Apertium: an open-source rule-based shallow-transfer MT platform
- NLP tools available for Icelandic, e.g. IceNLP (open-source)
- $\blacksquare \Rightarrow \mathsf{Apertium}\mathsf{-}\mathsf{IceNLP}$
- Research question: Can we obtain better translation quality by such an hybrid system, as opposed on relying solely on Apertium modules?

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#### License

The whole platform, both program and data, are licensed under GPL (http://www.apertium.org).

#### The Apertium pipeline (main modules)

- A morphological analyser (performs tokenisation and lemmatisation as well)
- A bigram/trigram Hidden Markov Model (HMM) PoS tagger
- A lexical selection module (based on Constraint Grammar)
- A transfer module: lexical and structural transfer
- A morphological generator

### Language pair specifics

- A monolingual source language (SL) dictionary
- A monolingual target language (TL) dictionary
- A bilingual SL-TL dictionary
- Transfer rules

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#### License

The whole platform, both program and data, are licensed under LGPL (http://icenlp.sourceforge.net)

#### Main modules

- A tokeniser/sentence segmentiser
- IceMorphy: A morphological analyser/unknown word guesser
- IceTagger: A linguistic rule-based PoS tagger
- TriTagger: A bigram/trigram HMM PoS tagger
- Lemmald: A mixed-method lemmatiser
- IceParser: A shallow (finite-state) parser

#### Tagset

A large detailed tagset consisting of 700 tags from the Icelandic Frequency Dictionary (IFD) corpus

#### Tagging accuracy

- Data-driven taggers, including state-of-the-art HMM taggers, have not achieved high accuracy
- IceTagger has achieved higher accuracy than the data-driven taggers
- IceTagger+TriTagger (HMM): The state-of-the-art PoS tagger for Icelandic (92.5%)

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# Apertium-IceNLP

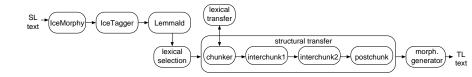
#### The idea

- To integrate existing tools from IceNLP into the Apertium pipeline in order to develop a prototype of an Icelandic-English MT system.
- (The "pure" Apertium version was developed in parallel)

#### Benefits

- Use state-of-the-art PoS tagger, IceTagger, in the pipe-line
- Information about syntactic functions can be of help in the translation process. IceParser can potentially be used.

# Apertium-IceNLP



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# IceNLP enhancements

### Which ones?

- Mappings from the output of IceTagger to the output generated by the Apertium tagger
- Daemonising IceNLP: Client-Server functionality was added to IceNLP.

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# IceNLP enhancements

#### Mappings – Examples

[TAGMAPPING]
nkfng <n><m><pl><nom><def>
[LEMMA]
vera <vblex><actv> <vbser>
[MWE]
að\_einhverju\_leyti <adv>

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# IceNLP enhancements

#### Client-Server

- IceNLPServer: A server which contains an instance of IceNLP in memory. A daemon which runs in the background. Can serve requests to the modules in IceNLP without any loading delay.
- IceNLPClient: A client for communicating with the server. Reads from standard input and writes to standard output (as the Apertium modules).
  - We replaced the Apertium tokeniser/morphological analyser/lemmatiser and PoS tagger with IceNLPClient.

#### **Client-Server**

echo "Hún er góð" | RunClient.sh

```
^Hún/hún<prn><p3><f><sg><nom>$
    ^er/vera<vbser><pri><p3><sg>$
    ^góð/góður<adj><pst><f><sg><nom><sta>$
```

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# The bilingual dictionary

### is-en bilingual dictionary

No is-en dictionary publicly available when this project was initiated.

#### Built in three stages

- Populated with entries spidered from the Internet (Wikipedia, Wiktionary, Freelang, etc.). Around 5,000 entries.
- A wordlist acquired from an individual, Anton Karl Ingason. Around 6,000 entries.
- A wordlist obtained from the dictionary publishing company Snara. Around 18,000 entries.
- In total, the bilingual dictionary currently contains about 22,000 entries.

# Transfer rules

#### Split into four stages

- **1** Local reordering and chunking (78 rules).
- Produces chunks of chunks, e.g. chunking relative clauses into noun phrases (3 rules).
- 3 Longer distance reorderings, e.g. constituent reordering (26 rules).
- Cleanup operations and insertion of the indefinite article (5 rules).

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# Evaluation

### Competing systems

- Apertium-IceNLP (http://nlp.cs.ru.is/is-en.htm)
- Apertium (http://www.apertium.org/)
- Tungutorg a proprietary rule-based system (http://www.tungutorg.is)
- Google Translate (http://translate.google.com)

#### Test data

- About 400 sentences from the Icelandic Wikipedia
- Run through the four systems, post-edited by a bilingual person to obtain reference sentences

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## Evaluation

#### Evaluation measures

- Word error rate (WER): Percentage of the TL words that require correction (substitutions, deletions and insertions)
- Position-independent word error rate (PER): Similar to WER, except that PER does not penalise correct words in incorrect positions
- Computed using the apertium-eval-translator tool

### Results: Icelandic to English

MT system	WER	PER
Apertium-IceNLP	50.6%	40.8%
Apertium	45.9%	38.2%
Tungutorg	44.4%	33.7%
Google Translate	36.5%	28.7%

Table: Word error rate (WER) and position-independent error rate (PER) over the test sentences

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## Error analysis

#### Development data created

- From the largest online Icelandic newspaper *mbl.is*
- Translated about 1700 files with Apertium-IceNLP and randomly selected 50 for analysis
- 6 error catagories created

# Error analysis

Error category	Freq.	%
Missing from the bidix	912	60.7%
Need further analysis	414	27.5%
Multiword expressions	90	6.0%
Abbreviations and initials	31	2.1%
More sophisticated patterns	31	2.1%
Other	24	1.6%
Total	1502	100%

Table: Error categories and corresponding frequencies.

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#### Only use IceTagger from IceNLP?

- MWEs and lemmata are an integral part of the Apertium morphological analyser
- It may produce better results to only use IceTagger for PoS tagging but rely on Apertium for tokenisation, morphological analysis and lemmatisation.
- IceTagger then needs to be changed to receive the necessary information from the morphological component (lt-proc) of Apertium.

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# Conclusion

- Apertium-IceNLP is the first system in which the whole morphological and tagging component of Apertium is replaced by modules from an external system.
- Apertium-IceNLP does neither perform as well as Google Translate nor as TunguTorg.
- *Apertium-IceNLP* also performs worse than the is-en system based solely on Apertium modules.
  - May be due to the fact that MWEs and lemmata are an integrated part of the Apertium morphological analyser whereas IceNLP does not handle them adequatly.

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This will be verified in future work.