# Handling Overlapping Parallel Corpora 

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## Overview

- Overlapping parallel corpora?
- Handling them?
- Implementation
- Experiments
- Corpora analysis
- MT


## Overlapping Parallel Corpora?

| Corpus A |  | Corpus B |  |
| :---: | :---: | :---: | :---: |
|  |  | English | Estonian |
| English | Estonian | oses are red | roosid on punased |
| roses are red, | roosid on punased, | is line got lost | kannikesed on sinised |
| violets are blue, | kannikesed on sinised ; | pause > | < paus > |
| corpora are great, | korpused on toredad - | orpora are | korpused on |
| and so are you! | nagu sinagi ! | great ! | toredad - |
|  |  | nd so are you! | nagu sinagi! |

Figure 2.1: An example of overlapping parallel corpora with the correspondence of the two corpora shown. Second sentence pair of corpus B is an erroneous alignment.

## Source

- Same source documents, corpora created independently
- Same corpus aligned independently


## Problems

- Minor text differences
- Typos corrected/added
- Special symbols handled differently
- Different sentence alignment depths
- Added/omitted sentence pairs


## Benefits

- Increase segmentation depth
- Find potential sentence alignment error spots
- Combine corpora
- Check/improve one corpus by comparison to the other


## Some examples from real life

- JRC-Acquis corpus
- Aligned with Vanilla and HunAlign alternatives
- Hunglish and JRC-Acquis
- CzEng and JRC-Acquis
- SUBTITLES
- CzEng, Hunglish, OPUS
- Kind of a special case


## Method of processing



## Method of processing

- Align language-parts independently
- N -to-M edit distance sentence matching
- Adding/omitting weight=1
- Replacement weight = sentence pair distance

- Sentence distance = approximate matching with general edit distance
- Weight("," -> ".") = small
- Weight("D" -> "d") = small
- Weight("3"->"6") = really big



## Optimization

- Head \& tail
- Anchor-points
- Trimming the corners
- Traverse with a "front", quit if threshold exceeded


## Method of processing

- Align the alignments
- Simple Levenstein distance



## Implementation: CorporAl

- Aligns parallel corpora to each other
- Having an alignment
- Outputs it or
- Uses it to generate a combined corpus


## Combining corpora

- Requires exact behavior specified
- Include snt. pairs from just one corpus?
- Include snt. pairs that match?
- 3 sentences matched 2 - include what?
- Include snt. pairs that did not match and how?
- mismatch consists of 3 vs 2 sentences - include what?


## Combining corpora

- Requires exact behavior specified
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- Include snt. pairs that match?
- 3 sentences matched 2 - include what?
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- mismatch consists of 3 vs 2 sentences - include what?
- Max-size vs Max-accuracy


## Corpora analysis

- UT vs JRC corpus (Est-Eng)

| UT+JRC2, et-en | \#docs | \#snt pairs | \#en words | \#et words |
| :--- | ---: | ---: | ---: | ---: |
| Just UT | 2048 | 134684 | $3.12 \cdot 10^{6}$ | $2.17 \cdot 10^{6}$ |
| Just JRC2 | 5807 | 205025 | $4.86 \cdot 10^{6}$ | $3.25 \cdot 10^{6}$ |
| Common UT | 2009 | 93152 | $1.88 \cdot 10^{6}$ | $1.27 \cdot 10^{6}$ |
| Common JRC2 | 2009 | 68165 | $1.67 \cdot 10^{6}$ | $1.09 \cdot 10^{6}$ |
| Max-size | 2009 | 98946 | $2.03 \cdot 10^{6}$ | $1.36 \cdot 10^{6}$ |
| Max-acc | 2009 | 56234 | $1.35 \cdot 10^{6}$ | $0.88 \cdot 10^{6}$ |


|  | UT | JRC2 |
| :---: | ---: | ---: |
| $\emptyset$ | $7.12 \%$ | $9.89 \%$ |
| $0-1$ | $0.00 \%$ | $8.25 \%$ |
| $1-0$ | $32.57 \%$ | $0.00 \%$ |
| $1-1$ | $59.30 \%$ | $81.04 \%$ |
| $1-2$ | $0.06 \%$ | $0.17 \%$ |
| $2-1$ | $0.91 \%$ | $0.62 \%$ |
| $2-2$ | $0.00 \%$ | $0.00 \%$ |
| $3-1$ | $0.01 \%$ | $0.00 \%$ |

## Corpora analysis

- JRC HunAline vs Vanilla (Est-Eng-Lat, Ger-Eng)

| JRC3, de-en | \#docs | \#snt pairs | \#de words | \#en words |
| :--- | ---: | ---: | ---: | ---: |
| Just Hun | 4 | 66148 | $0.84 \cdot 10^{6}$ | $0.80 \cdot 10^{6}$ |
| Just Van | 83 | 3716 | $0.11 \cdot 10^{6}$ | $0.08 \cdot 10^{6}$ |
| Identical | 14733 | 614199 | $13.79 \cdot 10^{6}$ | $15.03 \cdot 10^{6}$ |
| Common Hun | 8598 | 658532 | $15.75 \cdot 10^{6}$ | $16.97 \cdot 10^{6}$ |
| Common Van | 8598 | 621816 | $15.65 \cdot 10^{6}$ | $16.94 \cdot 10^{6}$ |
| Max-size | 8598 | 658583 | $15.75 \cdot 10^{6}$ | $16.97 \cdot 10^{6}$ |
| Max-acc | 8072 | 575749 | $14.19 \cdot 10^{6}$ | $15.67 \cdot 10^{6}$ |


|  | JRC3 de-en |  |
| :---: | ---: | ---: |
|  | Hun | Van |
| $\emptyset$ | $11.9 \%$ | $7.8 \%$ |
| $0-1$ | $0.0 \%$ | $0.0 \%$ |
| $1-0$ | $0.6 \%$ | $0.0 \%$ |
| $1-1$ | $86.7 \%$ | $91.8 \%$ |
| $1-2$ | $0.0 \%$ | $0.0 \%$ |
| $2-1$ | $0.8 \%$ | $0.4 \%$ |
| $2-2$ | $0.0 \%$ | $0.0 \%$ |

## Influence on MT

- Overlapping corpora cannot be concatenated
- data distribution gets skewed
- freq. of the samples present in both parts increased relative to everyone else
- Baseline
- snt. pairs from just corpus A +
snt. pairs from just corpus B +
snt. pairs from the overlapping part of
either corpus B or corpus A


## Experiment setup

- Baseline-1 and baseline-2 (from both corpora)
- vs max-accuracy and max-size
- Moses and Joshua default
- MERT
- GIZA++ default
- SRI LM 5-gram Kneser-Ney discounting
- 2500 snt. pairs in dev and test sets


## Influence on MT



Joshua



## Influence on MT



Moses


Joshua



## Influence on MT



## Influence on MT

Moses



Joshua



## Influence on MT




Joshua



## Implementation

- PERL script
- corporal.sf.net


## Future work

- Currently matches both language parts and looks for matches/mismatches
- Could be used to generate a Greek-German Europarl
- Extend to non-parallel corpora
- treat text as language-1 and markup as language-2
- combine OR
- generate e.g. corpus, annotated morphologically AND syntactically


## Thank you!

