

Using Crawled Data for MT Development - Promises and Pitfalls

Mārcis Pinnis Chief Al Officer, Tilde

Data for MT System Development

The main language resources for MT system development are:



Parallel corpora



Monolingual corpora

- Dictionaries
- Term glossaries
- Named entity dictionaries
- Etc.

Various lexical resources

Data for MT System Development

Crawling typically focuses on:

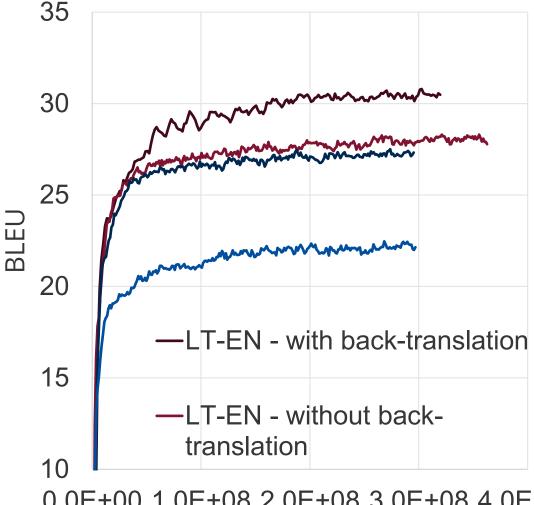
- Mining parallel data
- Mining monolingual data
- Monolingual data in NMT are used for back-translation
- Back-translation is a method that allows to acquire synthetic parallel training data using a reverse
 MT system and target-side monolingual data

Monolingual Data for Back-Translation

- Back-translation helps:
 - Adjusting to the required style
 - Disambiguating domain-specific terminology
 - Improving noise-robustness of models
- Back-translation is not magic it does not improve outof-vocabulary word/phrase translation quality

Back-Translation can Boost MT Quality 35

Domain of the monolingual data has to match the domain of the text that will be translated.



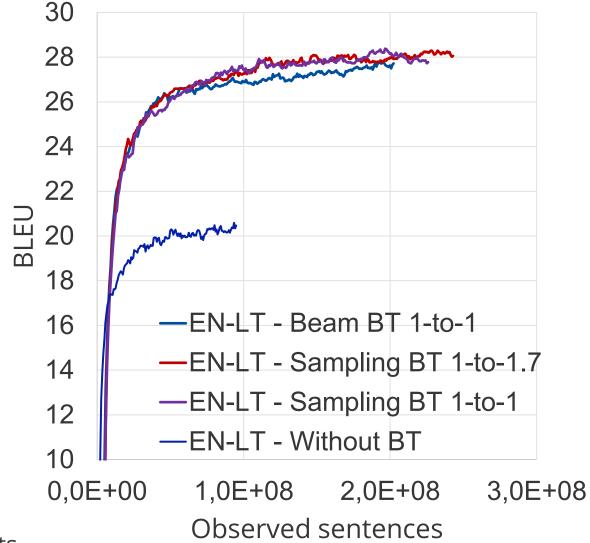
0,0E+00 1,0E+08 2,0E+08 3,0E+08 4,0E+08 Observed sentences

* Source of the graph: Tilde's WMT 2019 experiments

Back-Translation can Boost MT Quality

The data have to be of sufficient quantities to achieve highest quality increase

- For beam search approximately the same amount as parallel data
- For sampling the same or more



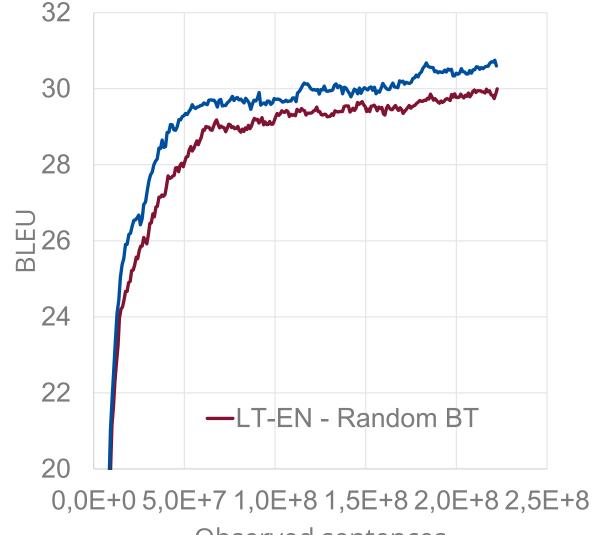
^{*} Source of the graph: Tilde's WMT 2019 experiments

Back-Translation can Boost MT Quality

It is important that the (target language monolingual) data are source-domain adherent

I.e., represent what users may want to write in the source language

However, if data are scarce, some data may be better than no data



Observed sentences

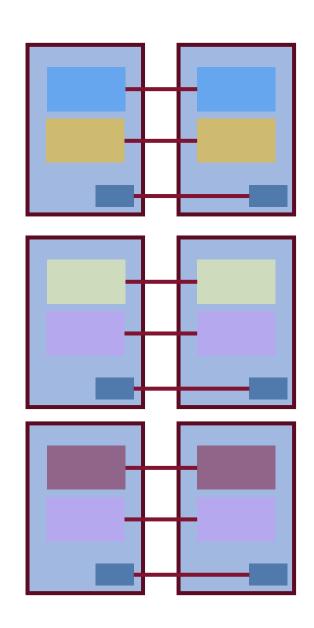
* Source of the graph: Tilde's WMT 2019 experiments

Parallel Data from the Web

Two main directions of parallel data mining are typically explored – focused or broad mining

Focused parallel data mining

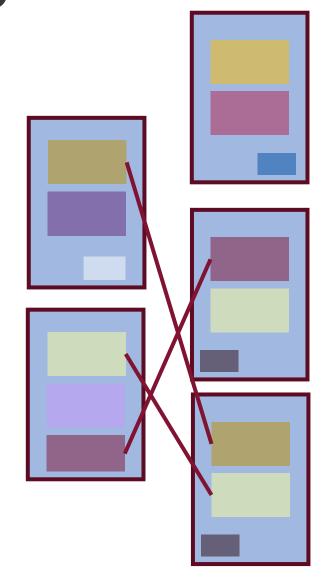
- Mining is performed for known web sites to contain parallel data
- Assumptions can be used to improve mining, e.g.:
 - Are corresponding documents identifiable?
 - Where is the main content to be mined located in documents?
- Higher (almost guaranteed) quality with smaller efforts



Parallel Data from the Web

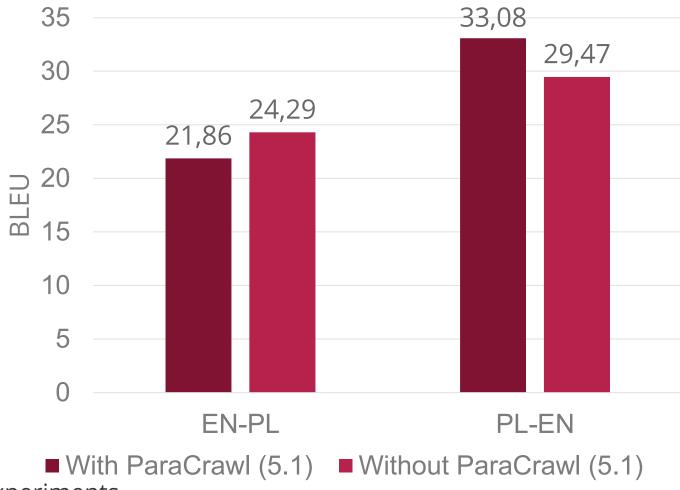
Broad parallel data mining

- The whole web is a potential source of parallel data
- Requires document alignment and more sophisticated sentence alignment methods
- Minimal to no assumptions on parallel data presence in documents can be made
- Quality depends heavily on the tools applied in the process



Parallel Data from the Web

- Parallel data from the broad parallel data mining processes may contain noise
- Noise can hinder training high quality MT systems
- It is important to evaluate quality of the crawled data and know when it is safe to use the data



^{*} Source of the chart: Tilde's WMT 2020 experiments

Thank you!

Time for questions