## The Role of Parallel Corpora in Bilingual Lexicography

Enikő Héja<br>Research Institute for Linguistics, HAS eheja@nytud.hu

## Outline

- The project
- The role of parallel corpora in lexicography
- Workflow
- Results
- Conclusions and future work


## EFNILEX (EFNIL)

- Objectives:
- Dictionaries for human use covering every day vocabulary for medium density languages
- 20.000-45.000 entries (depending on the size of available resources)
- Methodology:
- Statistical word alignment
- Based on parallel corpora
- Language pairs:
- Hungarian - Slovenian
- Hungarian - Lithuanian


## Advantages

- Parallel corpus $=>$ Corpus-driven technique to diminish the role of lexicographers' intuition
- Usage-based, representative translations
- Clear ranking between more likely and less likely translations
- Most-used translation equivalents are ranked higher (Example I)
- Provided contexts facilitate the creation of encoding dictionaries (Example II)
- Compilation of the reversed dictionary is more simple


## Advantages - a Sample

- Positive evidence that the various sub-senses of a word are translated in the same way

| HUN <br> LEMMA | LIT <br> LEMMA | TRANSLATIONAL <br> PROBABILITY | FREQUENCY <br> OF HUN <br> LEMMA | FREQUENCY <br> OF LIT <br> LEMMA |
| :--- | :--- | :--- | :--- | :--- |
| Születik | Gimti <br> $(-$ sta,-è $)$ | 0.579005 | 169 | 174 |


| HUN | LIT |
| :--- | :--- |
| Ö 1870-ben született | Jis gimė 1870 metais |
| He was born in 1870 |  |
| De Fache mintha erre született volna | Bet Fasas, regis, tiesiog tam gimęs |
| As if Fache was born to do this |  |

## Advantages - a Sample

| Úgy látszik, szerencsétlen csillagzat alatt születtél | Turbūt gimei po nelaiminga ̌̌vaigžde |
| :---: | :---: |
| It seems that you were born under an unlucky star |  |
| ..., mert ikrei születtek. | ..., nes jai gimé dvynukai. |
| ..., because twins were born to her. |  |
| Maga úriembernek született. | Tu gimei džentlemanu. |
| You was born a gentleman. |  |
| ... hogy Buddha nem lótuszvirágból született? | ....kad Buda gimé ne iš lotoso žiedo? |
| ...that Buddha was born from a lotus flower? |  |

## Difficulties

- Creation of the parallel corpus is tedious
- Dictionaries generated by word alignment comprise only one-to-one mappings between lemmata
- Does not handle MWEs, collocations, verbal constructions => can be added based on the provided contexts manually afterwards


## Resources and Tools

- Resources: goal: a 10.000.000-token corpus for each language
- Tools: language dependent tools are needed for each language
- Sentence splitting
- Tokenising
- Lemmatising
- Disambiguating between lemmata


## Resources

- Lithuanian-Hungarian, Slovenian-Hungarian
- Collecting direct translations yielded only moderate success
- Instead, translations from a third language
- Parallel web pages from the web ( $\sim 200,000$ tokens per language).
- Literature from the web (mainly resources of Hungarian digital archives: MEK, DIA)
- Texts from national corpora
- Lithuanian: Lithuanian National Corpus, Lithuanian-English parallel corpus
- Slovenian: FIDA corpus


## Tools

- Language specific tools were available in the form of toolchains
- LIT: Centre of Computational Linguistics, Vytautas Magnus University
- SLO: Jozef Stefan Institute, freely available at http://nl.ijs.si/jos/analyse/
- HUN: Research Institute for Linguistics, used for the annotation of the Hungarian National Corpus


## Workflow



## Evaluation Steps

- The quality of the resulting dictionary depends highly on the factors below:
- Quality of input texts
- Quality of sentence alignment
- Quality of word alignment


## Size of Parallel Corpora

- Lithuanian-Hungarian

| LITHUANIAN | $1,765,000$ tokens | 147,158 aligned unit <br> $(\mathrm{AU})$ |
| :--- | :--- | :--- |
| HUNGARIAN | $2,121,000$ tokens | $147,158 \mathrm{AU}$ |

- Slovenian-Hungarian

| SLOVENIAN | 733,000 tokens | $38,574 \mathrm{AU}$ |
| :--- | :--- | :--- |
| HUNGARIAN | 666,000 tokens | $38,574 \mathrm{AU}$ |

## Most Probable Translation Candidates I

- After word alignment we had the following data at our disposal:

| HUN LEMMA | LIT LEMMA | Translational <br> probability <br> P( $\left.\mathbf{W}_{\text {target }} \mid \mathbf{W}_{\text {sorrce }}\right)$ | Corpus frequency <br> HUN LEMMA | Corpus frequency <br> LIT LEMMA |
| :--- | :--- | :--- | :--- | :--- |
| Ajak (lip) | Lūpa | 0.77063 | 312 | 509 |
| Alagút (tunel) | Tunelis | 0.755043 | 145 | 157 |

- Objective: to find the "ideal" values for these parameters


## Most Probable Translation Candidates II

- We set these values based on the evaluation of the HUN-SLO translation candidates
- Every lemma should occur at least 5 times $=>$ to have sufficient amount of data to give a reliable estimation of $\mathrm{P}(\mathrm{tr})$
- If $\mathrm{P}(\operatorname{tr})<0.5$, the proportion of correct translation candidates drops considerably
- $65 \%$ of the translation candidates is correct


## Preliminary Results

|  | NUMBER OF <br> TRANSLATION- <br> CANDIDATES ABOVE <br> THE THRESHOLD | EXPECTED <br> NUMBER OF <br> CORRECT <br> TRANSLATION- <br> CANDIDATES |
| :--- | :--- | :--- |
| HUNGARIAN- <br> SLOVANIAN | 4969 | 3230 |
| HUNGARIAN- <br> LITHUANIAN | 4025 | 2616 |

## Evaluation: Useful Translation Candidates

- Correct translational equivalents [gyümölcs - vaisius (fruit)]
- Partially correct translational equivalents $=>$ Post editing is needed
- Improper lemmatization
- Only partial match in the case of MWEs compounds [fofelügyelő - vyriausiasis inspektorius (chief inspector)] collocations [bíborosi testület - Kardinoly kolegija (cardinal college)]
- Looser semantic relation (e.g. hypernymy)
[lúdtoll (literally: goose-feather) - plunksna (literally: feather, pen)] intended meaning in both cases: quill pen


## Evaluation: Useless Translation Candidates

- Irrelevant vocabulary (e.g. recurrent proper names) [Abdul - Abdulas]
- Incorrect translation candidates
- Usually due to the loose translations of texts


## Evaluation - Data

- Out of 4025 HUN-LIT translation pair 863 pairs were sampled
- freq $\geq 5, \mathrm{P}\left(\mathrm{w}_{\text {target }} \mid \mathrm{w}_{\text {source }}\right) \geq 0.5$
- Evaluation intervals:
- $0.5 \leq \quad \mathrm{P}\left(\mathrm{w}_{\text {target }} \mid \mathrm{w}_{\text {source }}\right)<0.7$
- $0.7 \leq \quad \mathrm{P}\left(\mathrm{w}_{\text {target }} \mid \mathrm{w}_{\text {source }}\right)<1$
- $P\left(w_{\text {target }} \mid w_{\text {source }}\right)=1$


## Results

|  | Useful candidates |  | Useless candidates |  |
| :--- | :--- | :--- | :--- | :--- |
| $P(\operatorname{tr})$ | OK | Post-editing | Irrelevant | Incorrect |
| $[0.5,0.7)$ | $52.1 \%$ | $32.9 \%$ | $2.3 \%$ | $12.7 \%$ |
| Sum | $\Sigma 85 \%$ |  | $\Sigma 15 \%$ |  |
| $[0.7,1)$ | $65.3 \%$ | $31.9 \%$ | $0.6 \%$ | $2.2 \%$ |
| Sum | $\Sigma 97,2 \%$ |  | $\Sigma 2,8 \%$ |  |
| 1 | $38 \%$ | $13 \%$ | $49 \%$ | $0 \%$ |
| Sum | $\Sigma 51 \%$ |  | $\Sigma 49 \%$ |  |

- Proportion of incorrect translation pairs is low
- $85 \%$ of translation pairs are useful in the 1 . probability range
- $\mathbf{9 7 , 2} \%$ of translation pairs are useful in the 2 . range
- $\mathrm{P}(\operatorname{tr})=1$ produces the lowest proportion of useful candidates and the highest ratio of irrelevant pairs


## Related Meanings I

- Presupposition: frequent words tend to have more meanings than less frequent ones
- Lithuanian-Hungarian dictionary:
- Frequency of Lithuanian lemma is min. 100
- Translational probability was considerably decreased $(0.5 \boldsymbol{\rightarrow}$ 0.02 )


## Related Meanings - Example I

| LIT | HUN | $\mathbf{P}\left(\mathbf{w}_{\mathbf{t}} \mid \mathbf{w}_{\mathbf{s}}\right)$ | ENG |
| :--- | :--- | :--- | :--- |
| puikus | jó | 0.128 | good |
| puikus | remek | 0.071 | great, <br> all right |
| puikus | tökéletes | 0.052 | perfect |
| puikus | szép | 0.048 | nice |
| puikus | pompás | 0.035 | splendid |
| puikus | jól | 0.035 | well |
| puikus | nagyszerü | 0.035 | great |
| puikus | finom | 0.028 | fine |
| puikus | gyönyörű | 0.02 | marvelous |

-Puiku, - atsakè balsas. -Remek - válaszolta a hang. (-All right the voice answered)
-Puikus darbas.
-Szép munka volt.
(-Good job)

## Related Meanings - Example II

- Use in the creation of encoding dictionaries

| aiškiai tisztán |  | [literally: pure+ly] (clearly) |  |
| :---: | :---: | :---: | :---: |
| PERCEPTION | N lát, látszik, hall | ('see', 'seem', 'hear') |  |
| aiškiai | világosan | [literally: |  |
| PERCEPTION | N the same verbs as in the first case |  |  |
| COGNITION | N megért, gondolkodik ('understand', 'think') |  |  |
| COMMUNICA | ICATION beszél, válaszol ('speak', 'answer') |  |  |
| aiškiai | láthatóan [literally: visible $+l y$ ] (visibly) |  |  |
| ('be worried', 'amuse', 'enjoy', 'do not like') | aggódik, mulattat, élvez, nem tetszik |  |  |
| aiškiai |  |  | (we |
| PERCEPTION |  |  |  |

- Tisztán, világosan, jól can modify verbs of perception with the same meaning
- Láthatóan refers to the fact that the emotional change a person underwent did not remain hidden
- Világosan is used with verbs of cognition and communication meaning that the content of the act is comprehensible
- Tisztán would mean that the speech conveying the message was clearly pronounced


## Conclusion and Future Work

- The corpus-driven nature of this method decreases the role of human intuition during dictionary building
- Translations are provided together with their contexts
- Translations can be ranked according to their likelihood
- Size of parallel corpora has to be augmented
- Automatic treatment of MWEs, collocations and verbal constructions should be included in the workflow


## Thank you for your attention!

