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Estimating language relationships from a parallel corpus. A study of the Europarl corpus

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Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Språkbanken

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GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Outline

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Lexicostatistics I

Objective is to automatically identify the genetic relationships between languages from parallel corpus.

Taraka Rama
and Lars Borin

- ▶ Estimate the distance matrix between the languages.
- ▶ Use a clustering algorithm to infer the family tree for the languages.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Lexicostatistics II

Some concepts.

- ▶ Cognates are words which are genetically related. Ex: English/German: **hound/Hund**; English/Armenian: **two/erku**.
- ▶ Loanwords from other languages are not considered as cognates.

Taraka Rama
and Lars Borin

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Lexicostatistics III

Some assumptions about using lexical items for estimating the distance matrix.

- ▶ A word list of length of 40-200 basic meanings is collected for every language.
- ▶ Expert cognacy judgements are made between the word pairs in the lists.
- ▶ Expert judgement is based on comparative method.
- ▶ Cognates are identified using recurrent sound correspondences.
- ▶ The number of cognates between the two languages is judged as the similarity between the two languages.
- ▶ These steps is known as *lexicostatistics* in historical linguistics.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Lexicostatistics IV

Automatic Identification of cognates.

- ▶ Orthographic measures are generally used for judging the similarity between the word pairs.
- ▶ Methods such as HMMs require initial training data.
- ▶ Computational linguistics use the term *cognates* in a broader sense.
- ▶ Includes loanwords and chance resemblances, *false positives*.
- ▶ No way of identifying genetically related but having different forms, *false negatives*.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Outline

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

The previous work which comes closest to the work presented here is that of (Koehn 2005), who trains pair-wise statistical translation systems for the 11 languages of the Europarl corpus and uses the systems' BLEU scores for clustering the languages, under the assumption that ease of translation correlates with genetic closeness.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk

BANKEN

CLT

Taraka Rama
and Lars Borin

Outline

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Automatic Identification of Cognates I

- ▶ Automatically identify word pairs which are translations of each other.
- ▶ Use an orthographic measure for computing the similarity between each word pair.
- ▶ Remove word pairs which are below a particular *cutoff*.
- ▶ We use *longest common subsequence ratio* as the orthographic measure.
- ▶ The *cutoff* is fixed at 0.58 to account for length bias.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Automatic Identification of Cognates II

Given the cognate lists for two languages, the distance between two languages l_a, l_b can be expressed using the following equation:

$$Dist(l_a, l_b) = 1 - \frac{\sum_i sim(l_a^i, l_b^i)}{N} \quad (1)$$

$sim(l_a^i, l_b^i)$ is the similarity between the i th cognate pair and is in the range of $[0, 1]$.
 N is the number of words being compared.

Taraka Rama
and Lars Borin

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Automatic Identification of Cognates III

String similarities is only one of the many possible ways for computing the similarity between two words.

Lexicostatistics is a special case of above equation where the range of *sim* function is $0|1$.

Definitions:

- ▶ Levenshtein distance is defined as the minimum number of insertions, deletions and subtractions to transform a string into other.
- ▶ Dice is defined as twice the overlap of the number of bigrams divided by the total number of bigrams.
- ▶ LCSR is defined as the length of the longest common subsequence divided by the maximum length of the two strings.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk

BANKEN

CLT

Taraka Rama
and Lars Borin

Outline

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Europarl Corpus

- ▶ The publicly available Europarl corpus was used.
- ▶ The corpus is from English to ten languages.
- ▶ 45 pairs of parallel corpora were created by using English as bridge language.
- ▶ The first 100,000 sentences were included.
- ▶ Every language except Finnish is a Indo-European language.
- ▶ All the other languages fall into different branches of Indo-European language family, Germanic and Romance.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk

BANKEN

CLT

Taraka Rama
and Lars Borin

Outline

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

- ▶ The freely available statistical machine translation system MOSES (Koehn et al. 2007) was used for aligning the words.
- ▶ Word alignments were used for extracting the cognate pairs.
- ▶ For every language pair, word pairs with **LCSR** less than cutoff were removed.
- ▶ We experimented with three string similarity measures Levenshtein Distance, Dice and LCSR.
- ▶ All the measures are symmetric.
- ▶ UPGMA as implemented in PHYLIP was used to cluster these distances.



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Outline

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

| Language | # Probable Cognates |
|------------|---------------------|
| English | 1458 |
| German | 1043 |
| Dutch | 1489 |
| Swedish | 2624 |
| Danish | 2149 |
| French | 955 |
| Spanish | 823 |
| Portuguese | 831 |
| Italian | 1333 |

Table: The number of probable cognates of each language with Finnish.



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

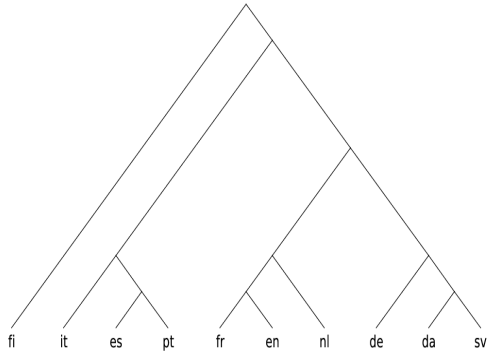


Figure: **Levenshtein Distance**: UPGMA tree.



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

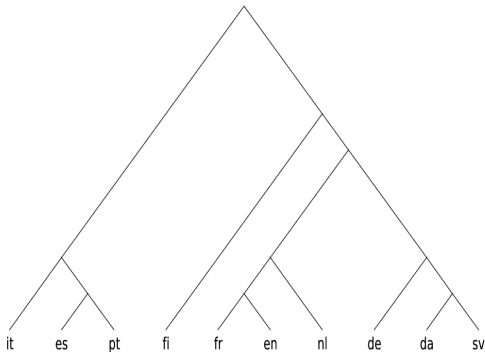


Figure: **Dice**: UPGMA tree.



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

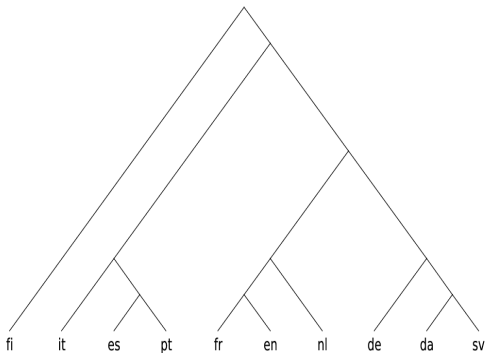


Figure: **LCSR**: UPGMA tree.



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Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Discussion

- ▶ Finnish shares the highest number of cognates with Swedish.
- ▶ Working with corpus avoids the subjectivity involved in collecting the Swadesh list.
- ▶ It also brings in automation which is not available in (?).
- ▶ The tree on the whole agrees with the commonly accepted subgrouping.
- ▶ Comparing with (Koehn 2005) it returns lower order relationships better than the higher order.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk

BANKEN

CLT

Taraka Rama
and Lars Borin

Outline

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Conclusion

- ▶ The preliminary results indicate that a parallel corpus could be used for this kind of study.
- ▶ Dutch, English and French might have borrowed large parts of the vocabulary used in the Europarl corpus (administrative and legal terms) from French, and additionally in many cases have a spelling close to the original French form of the words.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

- ▶ Automatically distinguish cognates from loanwords.
- ▶ Incorporate syntactic and semantic features in the future.
- ▶ Use POS tags and context vectors for estimating the similarity.

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk

BANKEN

CLT

Taraka Rama
and Lars Borin

Outline

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References



GÖTEBORGS
UNIVERSITET

Språk
BANKEN

CLT

Taraka Rama
and Lars Borin

Introduction

Previous Work

Our Approach

Dataset

Experiments

Results

Final Words

References

References



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