## Beyond Translation Memories

Finding similar documents in comparable corpora

Project TTC<br>Terminology Extraction, Translation Tools and Comparable Corpora (FP-7, STREP-248.005)

30 November 2012
(1) Parallel and comparable resources Cline of comparability Collecting comparable corpora

## Cline of comparability

## Parallel texts Traditional source of texts in MT:

## Cline of comparability

## Parallel texts Traditional source of texts in MT:

- true and accurate translations;


## Cline of comparability

Parallel texts Traditional source of texts in MT：
－true and accurate translations；
－reasonable translations with minor language－specific variations（New York $\rightarrow$ 北京）；

## Cline of comparability




Parallel texts Traditional source of texts in MT:

- true and accurate translations;
- reasonable translations with minor language-specific variations (New York $\rightarrow$ 北京);
Strongly comparable texts Heavily edited translations or independent, but closely related texts:


## Cline of comparability

Parallel texts Traditional source of texts in MT:

- true and accurate translations;
- reasonable translations with minor language-specific variations (New York $\rightarrow$ 北京);
Strongly comparable texts Heavily edited translations or independent, but closely related texts:
- same source with same editorial control (BBC News in English and Romanian);


## Cline of comparability

Parallel texts Traditional source of texts in MT:

- true and accurate translations;
- reasonable translations with minor language-specific variations (New York $\rightarrow$ 北京);
Strongly comparable texts Heavily edited translations or independent, but closely related texts:
- same source with same editorial control (BBC News in English and Romanian);
- related independently written texts on same topic (interlinked Wikipedia articles, same event from AFP, DPA and Reuters);


## Cline of comparability

Weakly comparable texts More variation in topics
English and Chinese textbooks on designing the wind turbines, or parliamentary debates on health care from the Bundestag, the House of Commons and the Russian Duma;

## Cline of comparability

Weakly comparable texts More variation in topics
English and Chinese textbooks on designing the wind turbines, or parliamentary debates on health care from the Bundestag, the House of Commons and the Russian Duma;
General unrelated texts Texts representing language varieties without a claim to their relatedness
Brown corpus, LOB, Lancaster Corpus of Mandarin Chinese (A. Press: reportage, B. Press: editorial, C. Press: Reviews...); Web snapshots in Chinese, German and Italian

## Existing studies

- Parallel fragments for MT parallel sentences in Wikipedia articles [Adafre and de Rijke, 2006] BBC News in English and Romanian [Munteanu and Marcu, 2006] CLIR in news corpora [Zhao and Vogel, 2002]


## Existing studies

- Parallel fragments for MT parallel sentences in Wikipedia articles [Adafre and de Rijke, 2006] BBC News in English and Romanian [Munteanu and Marcu, 2006] CLIR in news corpora [Zhao and Vogel, 2002]
- Terminology extraction Dictionary-based methods [Li and Gaussier, 2010, Su and Babych, 2012]
- Limited parallel resources for new domains (mostly institutional repositories, like UN or EuroParl)


## Rationale

- Limited parallel resources for new domains (mostly institutional repositories, like UN or EuroParl)
- Noisy comparable corpora: different topics


## Rationale

- Limited parallel resources for new domains (mostly institutional repositories, like UN or EuroParl)
- Noisy comparable corpora: different topics
- Few or no dictionaries


## Rationale

- Limited parallel resources for new domains (mostly institutional repositories, like UN or EuroParl)
- Noisy comparable corpora: different topics
- Few or no dictionaries
- Purpose: Terminology Extraction


## Collecting weakly comparable corpora

Three strategies:
(1) targeted crawling of specific resources, which are known to be comparable;

## Collecting weakly comparable corpora

Three strategies:
(1) targeted crawling of specific resources, which are known to be comparable;
(2) collection of responses from search engines using parallel terms;

## Collecting weakly comparable corpora

Three strategies:
(1) targeted crawling of specific resources, which are known to be comparable;
(2) collection of responses from search engines using parallel terms;
(3) focused crawling which starts from a small number of seeds.

## Targeted crawling

| Language | id | Million Tokens | Articles | EN iwikis |
| :--- | :--- | ---: | ---: | ---: |
| Chinese | zh | 101 | 137179 | 87389 |
| Dutch | nl | 163 | 435716 | 290979 |
| English | en | 1440 | 2524134 | n/a |
| French | fr | 459 | 838771 | 541715 |
| German | de | 563 | 1114696 | 603437 |
| Portuguese | pt | 156 | 361204 | 245102 |
| Russian | ru | 268 | 609525 | 345195 |
| Spanish | es | 365 | 664097 | 438864 |
| Ukrainian | uk | 81 | 214403 | 139827 |

## Crawling Wikipedia

','Biogas',' typically refers to a [[gas]] produced by breakdown of [[organic matter]] in the absence of [[oxygen]].
[[Category:Anaerobic digestion]]
[[Category:Biofuels]]
[[Category:Biodegradation]]
[[af:Biogas]]
[[bg: Биогаз]]
[[ca:Biogàs]]
[[cs:Bioplyn]]
[[da:Biogas]]
[[de:Biogas]]
[[et:Biogaas]]

## English-Russian energy corpus from Wikipedia

|  | Wiki-En |  | Wiki-Ru |  |
| :--- | ---: | ---: | ---: | ---: |
|  | texts | words | texts | words |
| Nuclear | 158 | 254014 | 165 | 130797 |
| Renewable | 51 | 99960 | 51 | 47927 |

## Keywords for comparable corpus

| wind farm | 风力发电厂 | ветроэлектростанция |
| :--- | :--- | :--- |
| geothermal power | 地热能 | геотермальная энергия |
| hydroelectricity | 水力发电 | гидроэнергетика |
| photovoltaics | 太阳能光伏 | фотоэлектричество |


|  | Crawled－En |  | Crawled－Ru |  | Crawled－Zh |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: |
|  | texts | words | texts | words | texts | words |
| Renewable | 5762 | 7505765 | 5126 | 7766462 | 3287 | 12431752 |

Parallel and comparable resources Collecting comparable corpora

## Focused crawling



## Focused crawling interface



Syllabs Babouk demo

Babouk
Home »Babouk » Add

## Add a new job

Tip: for more information about a specific field, place your mouse above it and a tooltip will appear.


Cline of comparability Collecting comparable ccrpora
(2) Measuring text similarity

Features to compare texts Anchor-based method

## Features to compare texts

- 500 most frequent words [Kilgarriff, 2001]


## Features to compare texts

- 500 most frequent words [Kilgarriff, 2001]
- hapax legomena [Patry and Langlais, 2011] or named entities [Goeuriot et al., 2009]


## Features to compare texts

- 500 most frequent words [Kilgarriff, 2001]
- hapax legomena [Patry and Langlais, 2011] or named entities [Goeuriot et al., 2009]
- flexigrams [Forsyth and Sharoff, 2011]
oil and gas industry $\rightarrow$ oil industry, gas industry, oil and, and gas, oil gas, and industry


## Features to compare texts

- 500 most frequent words [Kilgarriff, 2001]
- hapax legomena [Patry and Langlais, 2011] or named entities [Goeuriot et al., 2009]
- flexigrams [Forsyth and Sharoff, 2011]
oil and gas industry $\rightarrow$ oil industry, gas industry, oil and, and gas, oil gas, and industry
- part-of-speech signatures [Sharoff, 2010, Santini et al., 2006] or mix of frequent words with POS tags
[Baroni and Bernardini, 2006, Sharoff, 2007] for genres

Keywords for 'Darrieus wind turbine'

| LL | DocF | Word | Total | LL | DocF | Word | Total |
| ---: | ---: | :--- | ---: | ---: | ---: | :--- | ---: |
| 326.11 | 15 | Darrieus | 50 | 145.18 | 10 | ротор (rotor) | 1889 |
| 224.29 | 21 | blade | 20269 | 130.67 | 9 | дарье (Darrieus) | 1699 |
| 208.15 | 19 | turbine | 15976 | 65.57 | 3 | самозапуск (self-start) | 13 |
| 135.47 | 18 | wind | 84724 | 56.41 | 6 | поток (flow) | 14719 |
| 95.85 | 9 | torque | 8821 | 51.51 | 6 | крыло (aerofoil) | 22180 |
| 79.80 | 6 | aerofoil | 1559 | 34.36 | 2 | подъёмная (lifting) | 99 |
| 68.83 | 9 | angle | 39843 | 33.39 | 3 | турбина (turbine) | 3092 |
| 66.15 | 17 | design | 516317 | 29.94 | 3 | вектор (vector) | 5503 |
| 61.91 | 6 | rotor | 6944 | 27.29 | 4 | скорость (speed) | 35960 |
| 54.37 | 7 | spin | 29185 | 24.16 | 2 | мгновенный (instant) | 1280 |
| 50.57 | 8 | generate | 69293 | 18.47 | 4 | сила (force) | 111062 |
| 47.59 | 6 | rotate | 23012 | 17.67 | 2 | вращение (spin) | 6518 |
| 46.95 | 9 | speed | 137005 | 17.25 | 2 | плохой (difficult) | 7239 |
| 35.88 | 4 | propeller | 9107 | 17.25 | 2 | коэффициент (rate) | 7253 |
| 35.74 | 2 | self-starting | 52 |  |  |  |  |
| 34.51 | 6 | pitch | 69433 |  |  |  |  |
| 34.08 | 3 | airflow | 2059 |  |  |  |  |
| 33.51 | 10 | force | 405295 |  |  |  |  |
| 32.11 | 6 | tower | 85230 |  |  |  |  |
| 25.84 | 4 | load | 32271 |  |  |  | зо November 2012 |

## Geometric interpretation of anchoring



## Separating Ireland

| Town | antrim | armagh | athy |
| :--- | ---: | ---: | ---: |
| antrim | 0 | 31 | 105 |
| armagh | 31 | 0 | 74 |
| athy | 105 | 74 | 0 |


| Town | arklow | athlone | ballina |
| :--- | ---: | ---: | ---: |
| arklow | 0 | 80 | 146 |
| athlone | 80 | 0 | 66 |
| ballina | 146 | 66 | 0 |

26 dimensions in each list

## Re-uniting Ireland


(Spearman's) Rank correlation: 0.9941-0.9986
(1) Select/inject anchors

## Procedure for texts

(1) Select/inject anchors

- in-domain parallel texts


## Procedure for texts

(1) Select/inject anchors

- in-domain parallel texts
- in-domain comparable texts (manual or automatic)


## Procedure for texts

(1) Select/inject anchors

- in-domain parallel texts
- in-domain comparable texts (manual or automatic)
- generic parallel texts ( 5 g corpus)


## Procedure for texts

(1) Select/inject anchors

- in-domain parallel texts
- in-domain comparable texts (manual or automatic)
- generic parallel texts ( 5 g corpus)

NB $N_{a} \ll N_{c}$

## Procedure for texts

(1) Select/inject anchors

- in-domain parallel texts
- in-domain comparable texts (manual or automatic)
- generic parallel texts ( 5 g corpus)

NB $N_{a} \ll N_{c}$
(2) Compute monolingual distances to anchors

## Procedure for texts

(1) Select/inject anchors

- in-domain parallel texts
- in-domain comparable texts (manual or automatic)
- generic parallel texts ( 5 g corpus)

NB $N_{a} \ll N_{c}$
(2) Compute monolingual distances to anchors
(3) Compute distances between texts represented by their distances to anchors

## Procedure for texts

(1) Select/inject anchors

- in-domain parallel texts
- in-domain comparable texts (manual or automatic)
- generic parallel texts ( 5 g corpus)

NB $N_{a} \ll N_{c}$
(2) Compute monolingual distances to anchors
(3) Compute distances between texts represented by their distances to anchors
(4) Perform MDS (Multi-Dimensional Scaling) for visualisation purposes

## Comparability across languages


$+=\mathrm{RuNu},+=\mathrm{EnNu},{ }^{*}=\mathrm{RuRe},{ }^{*}=\mathrm{EnRe}$

## Term alignment

- Similarity between keywords of related documents [Rapp et al., 2012]


## Term alignment

- Similarity between keywords of related documents [Rapp et al., 2012]
- Initial weights for linking terms: airflow $\rightarrow$ поток, Дарье, самозапуск, лопасть blade $\rightarrow$ поток, Дарье, самозапуск, лопасть Darrieus $\rightarrow$ поток, Дарье, самозапуск, лопасть self-starting $\rightarrow$ поток, Дарье, самозапуск, лопасть


## Term alignment

- Similarity between keywords of related documents [Rapp et al., 2012]
- Initial weights for linking terms:
airflow $\rightarrow$ поток, Дарье, самозапуск, лопасть
blade $\rightarrow$ поток, Дарье, самозапуск, лопасть
Darrieus $\rightarrow$ поток, Дарье, самозапуск, лопасть self-starting $\rightarrow$ поток, Дарье, самозапуск, лопасть
- Spreading activation airflow $\rightarrow$ поток
Darrieus $\rightarrow$ Дарье
blade $\rightarrow$ лопасть
self-starting $\rightarrow$ самозапуск


## Thank you from Wiktionary

In other languages
Eesti
Euskara
Français
Bahasa Indonesia
IsiZulu
İslenska
Italiano
Kurdî
Latviešu
Lietuviu
Magyar
Na Vosa Vakaviti
日本語
Polski
Русский
Suomi
Svenska
தமிழ．
Точикй
Tiếng Việt
中文

## thank you

1．An expression of gratitude or politeness，in response to something done or given．

## Synonyms

－cheers（informa），thanks，thanks very much，thank you very much，thanks a lot，ta（UK，Australia），thanks a bunch（informal），thanks a million（informal），much obliged，gracias，muchos gracias，mooch ass grassy ass

Translations

## $\pm$ an expression of gratitude

Select targeted languages
－Abkhaz：итаабуп ${ }^{(a b)}$（it ${ }^{\circ}$ abup）
－Adangme：mo tsumi
－Afar：gadda ge
－Afrikaans：dankie（af），baie dankie（af）
－Albanian：faleminderit ${ }^{(s q)}$ ，ju falem nderit ${ }^{(s q)}$ Gheg：falimineres
－Aleut：qaĝaasakuq（Atkan），qaĝaalakux̂（Eastern）
－Alutiq：quyanaa
－American Sign Language：OpenB＠Chin－PalmBack OpenB＠FromChin－PalmUp

－Arabic：｜اُشكرُ（ar）（šúkran）
－Aramaic：－ว○ดa（tawdi）
－Armenian：
2 Unnhulyu⿺n LpJnĽu（hy）（šnorhakalut＇yun），
2 unphulumi tuu（hy）（šnorhakal em），（colloqually）
Beyond Translation Memories Malagasy：misaose（Nobvem ber 2012
－Kiowa：áho
－Kongo：ntondele
－Korean：고맙습니다 ${ }^{(k 0)}$（gomapseumnida），감사합 니다 ${ }^{(k 0)}$（gamsahamnida），고마워（ko）（gompwoe）
－Kurdish：spas（ku），سوباس（ku）
－Kyrgyz：рахмат（ ${ }^{\text {（ky）}}$（rahmat），ыракмат（ky）（irakmat）
－Ladin：giulan
－Lao：2งปใจ（lo）（kööp cai）
－Latin：benignē dīcis ${ }^{(l a)}$ ，tibi gratiās agō ${ }^{(l a)}$ ， （informal）gratiās ${ }^{(l a)}$ f pl，gratiās agō ${ }^{\text {（la）}}$
－Latvian：paldies ${ }^{(\mathbb{N})}$
－Lithuanian：ačiú（t）
－Luo：erokamano
－Macedonian：благодарам（mk）（blagodaram） （forma），фала ${ }^{(m k)}$（fála）（informal）

