# On the inevitability of multivariate statistics in corpus-based translation studies: some whys and hows 

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## Purpose

1. Argue that multivariate statistics is an inevitable part of corpus-based translation studies
$\rightarrow$ Because CBTS community is ready for it
2. Explore the field of what could constitute multivariate corpus-based translation studies
$\rightarrow$ Multidimensionality of translational behaviour

## Purpose

1. Argue that multivariate statistics is an inevitable part of corpus-based translation studies
$\rightarrow$ why?
2. Explore the field of what could constitute multivariate corpus-based translation studies $\rightarrow$ what and how?

## A time to look back

1993
A major year for the public life of corpus-based translation studies (CBTS)

- Baker, M. (1993). "Corpus Linguistics and Translation Studies: Implications and Applications."


## A time to look back

The importance of Baker's seminal paper:

- Introduction of corpus methodology in TS
- Shift of focus: from the primacy of the source text to the position of the target text in the target system
- Highly attractive research agenda (translation universals, translational norms)
$\rightarrow$ Institutionalisation of CBTS as a major paradigm within TS while setting it apart from neighbouring disciplines (esp. linguistics)


## A time to look back

However, 20 years later, and many publications later, Baker sometimes appears to be public enemy $n^{\circ} 1$ in CBTS

- "It is therefore misleading to call explicitation a (possible) universal of translation, as e.g. Baker (1993, 1996) does." (Becher 2010)
- Also: House 2008, Bernardini \& Ferraresi 2011, Kruger \& van Rooy 2012, Hansen-Schirra, Neumann, Steiner 2012, our own work


## A time to look back

Much of the debate centres around the universality assumption

- "features which typically occur in translated text rather than original utterances and which are not the result of interference from specific linguistic systems" (Baker 1993: 243)


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$\rightarrow$ Translation features are pervasive, hence irrespective of other factors, such as genre


## A time to look back

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- "features which typically occur in translated text rather than original utterances and which are not the result of interference from specific linguistic systems" (Baker 1993: 243)
$\rightarrow$ Translation features are pervasive, hence independent of source language


## A time to look back

Two of the most obvious potentially influencing factors of linguistic behaviour in translations were relegated from the very beginning

- Bernardini \& Ferraresi (2011): interference and normalisation
- Kruger \& van Rooy (2012): register variation within translations


## A time to look back

## More or less ackowledged by Baker herself (1999)

- "we take the view that language in general, and the language of translation in particular, reflects constraints which operate in the context of production and reception: these constraints are social, cultural, ideological, and of course also cognitive in nature"
- "Are certain linguistic features or strategies more likely to occur in certain types of translation genres, like translated fiction, news, inflight magazines?"


## A time to grow up

20 years after Baker's seminal paper, CBTS has come of age
$\rightarrow$ How can we adequately capture the multidimensionality of linguistic behaviour in translations?

## A time to grow up

Answer can be found in Baker 1993:
"It [the paper] argues that the techniques and methodology developed in the field of corpus linguistics will have a direct impact on the emerging discipline of translation studies [...]."
$\rightarrow$ The institutionalisation of CBTS also led to an autoisolation wrt neighbouring disciplines

## A time to grow up

Let's tie up with common practices in corpus linguistics:
"multifactorial data must be analyzed multifactorially (Gries 2010: 143)

CBTS community is ready for it

Saarbrücken, 09.02.2013

## Purpose

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## Explore the field of investigation

Depending on the research question, different multivariate statistics are needed in order to adequately grasp the multifactorial nature of translation behaviour


Correspondence analysis
Logistic regression analysis
Mixed-effect modelling

## Central hypothesis: conservatism

Conservatism hypothesis: translators tend to use more often conservative language than nontranslators (Baker 1996, 2004)
$\rightarrow$ Operationalisation: formal (archaic) lexemes

## Data, method, analysis

## Dutch Parallel Corpus (DPC)

- $\quad 10 \mathrm{M}$ tokens
- Parallel and comparable corpus: Dutch is SL (> FR, EN) and TL (< FR, EN)
- Stratified in text types: ADMIN, JOURNAL, INSTR, NON-FIC, FIC


## Data, method, analysis

- This case study: selection from DPC

1. Only Dutch data (target-oriented)
2. Exit Dutch Dutch data ( $\mathrm{n}=\mathrm{ca} .1 .5 \mathrm{M}$ )
3. Exit fiction (only available for FR>NL; $n=116.178$ )
4. Exit data with unknown source language $(\mathrm{n}=313.774)$

## Data, method, analysis

|  | Non-translated <br> Dutch | Translated <br> Dutch (<EN) | Translated <br> Dutch(< FR) |
| :---: | :---: | :---: | :---: |
| ADMIN | 428,391 | 237,579 | 339,826 |
| JOURNAL | 483,714 | 295,039 | 272,429 |
| INSTR | 106,640 | 0 | 45,371 |
| EXTERNAL | 371,154 | 311,493 | 261,640 |
| NON-FIC | 412,712 | 0 | 96,688 |

Total: $\mathrm{n}=3.662 .676$

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## Data, method, analysis

How to measure formality adequately?

Profile-based method (Speelman et al. 2003)

- Central idea: lexical variation implies that language users have different options to express a given concept
- $\quad$ Profile $=$ the set of synonyms designating a concept (e.g. underground vs. subway)
- Crucial to use a profile-based method when studying lexical variation


## Data, method, analysis

Let us illustrate what can go wrong

- When studying a formal lexeme as tewerkstelling (job employment) in isolation

|  | Admin | Extern | Instr | Journal | Non_Fic |
| :--- | :---: | :---: | :---: | :---: | :---: |
| Abs. freq. | 79 | 37 | 2 | 8 | 11 |
| Norm freq. | 0.78 | 0.52 | 0.35 | 0.07 | 0.21 |

Difficult to interpret
High frequency of tewerkstelling in ADMIN could mean either 'this is a formal register' or 'this register is often about job employment'

## Data, method, analysis

## Profile-based method

- If you want to know how lexically formal a register is, the proportion of neutral words should be taken into account too

|  | Admin | Extern | Instr | Journal | Non_Fic |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Tewerkstelling | 26,9 | 33,9 | 66,7 | 11,1 | 54,2 |
| Werk- |  |  |  |  |  |
| gelegenheid | 73,1 | 66,1 | 33,3 | 88,9 | 45,8 |

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## Data, method, analysis

- Extracting 10 profiles
- Profile = set of synonymous onomasiological variants to express a certain concept (i.c. formal vs. neutral)
- $\quad 10$ is more than 1
- Profile selection

1. Based on dictionaries and style guides (without contradiction)
2. Only difference in formality allowed

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## Data, method, analysis

| Profile <br> number | Formal variant | Neutral variant |
| :---: | :---: | :---: |
| 1 | Echter $(\mathrm{n}=1452)$ | Maar $(\mathrm{n}=9328)$ |
| 2 | Alsook; alsmede $(\mathrm{n}=74 ; 299)$ | Evenals $(\mathrm{n}=171)$ |
| 3 | Trachten $(\mathrm{n}=133)$ | Proberen $(\mathrm{n}=552)$ |
| 4 | Thans $(\mathrm{n}=170)$ | Nu $(\mathrm{n}=2902)$ |
| 5 | Bekomen $(\mathrm{n}=199)$ | Verkrijgen $(\mathrm{n}=409)$ |
| 6 | Indien $(\mathrm{n}=163)$ | Als $(\mathrm{n}=720)$ |
| 7 | Te + plaats $(\mathrm{n}=264)$ | In + plaats $(\mathrm{n}=3208)$ |
| 8 | Reeds $(\mathrm{n}=778)$ | AI $(\mathrm{n}=3774)$ |
| 9 | Dienen $+\operatorname{lnf}(\mathrm{n}=826)$ | Moeten $+\operatorname{lnf}(\mathrm{n}=1238)$ |
| 10 | telwoord $+\operatorname{maal}(\mathrm{n}=97)$ | telwoord + keer $(\mathrm{n}=411)$ |

Total: $\mathrm{n}=27.166$

## Data, method, analysis

|  | Admin | Extern | Instr | Journal | Non-fic |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Al | 296 | 254 | 67 | 731 | 634 |
| Reeds | 161 | 118 | 33 | 37 | 87 |
| Dienen+inf | 251 | 64 | 180 | 18 | 32 |
| Moeten+inf | 193 | 47 | 36 | 137 | 98 |

How to discern patterns in this table?

Complex tables with different variables included ask for multivariate statistics

## Conservatism, part 1

Lectometric research goal

- Measure formality distances between different lects of translated and non-translated Dutch texts
- Lects = varieties (text types, translations vs. nontranslations)
- Underlying idea: the more lexical use differs between lects, the bigger the distance between these lects


## Multivariate statistics, part 1

- Profile-based correspondence analysis
- Explorative technique for data reduction
- Conditional analysis of associations between rows and columns (taking into account the profile structure)
- Visual representation of these associations in a lowdimensional plot

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## 



Saarbrücken, 09.02.2013

## Multivariate statistics, part 1

Adding interactions to the profile-based correspondence analysis

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Journal


Non-fiction


Saarbrücken, 09.02.2013
Extern


## Admin



## Summing up

- Observations:

1. Not all text types show formality differences between translated and non-translated Dutch
2. Conservatism hypothesis confirmed for external communication only

- Conclusion:
- Features of translation, like conservatism, are not text type and source language dependent (as suggested in Baker 1993)
- The observed variation in the dataset cannot be explained satisfactorily by translators' assumed conservative behaviour


## Conservatism, part 2

Onomasiological research goal

- Measure the exact effect sizes of the two factors on the choice between neutral and formal lexemes
- Measure the explanatory and predictive power of such a model


## Multivariate statistics, part 2

Binary logistic regression analysis

- Do all factors have a significant effect on the choice of word order?
- What is the relative impact of each factor?
- How do the different factors relate to each other?
- What is the collective effect of all factors?
- What is the predictive power of the model?


## Results

| Predictor | Odds ratio |
| :---: | :---: |
| Reference value: instr |  |
| ADMIN | $2.04^{* * *}$ |
| EXTERN | $2.56^{* * *}$ |
| NON-FICTION | $6.22^{* * *}$ |
| JOURNAL | $22.27^{* * *}$ |
| Reference value: non-trans |  |
| Translations from French | $0.79^{* * *}$ |
| Translations from English | n.s. |

Model L.R. $=3056.27, \mathrm{df}=6, \mathrm{p}<.0001$
$\mathrm{C}=0.75$

## Summing up

## Impact hierarchy of the different factors

- What stimulates the use of formal (vs. neutral) lexemes the most, is not the difference between translations and nontranslation, but the difference between text types


## Conservatism, part 3

Onomasiological research goal (extd.)

- Measure the exact effect sizes of the two factors on the choice between neutral and formal lexemes, while checking a potential influence of individual lexemes (random variation)
- Measure the explanatory and predictive power of such a model


## Multivariate statistics, part 3

Generalized mixed-effect models

- Answers the same questions as logistic regression, but it explicitly takes into account the random variation by the individual lexemes

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## Results

| Predictor | Odds ratio |
| :---: | :---: |
| Reference value: instr |  |
| ADMIN | $1.63^{* * *}$ |
| EXTERN | $1.73^{* * *}$ |
| NON-FICTION | $4.01^{* * *}$ |
| JOURNAL | $15.33^{* * *}$ |
| Reference value: non-trans |  |
| Translations from French | $0.86^{* * *}$ |
| Translations from English | n.s. |

$$
C=0.79
$$

## Summing up

- Relative sizes of the factors remain stable, but the mixed model shows that the random effect does play a role, too
- Random effects are useless when one wants to inform theories
- Introduce new fixed effects to decrease the effect size of the random effect


## Conclusion

- Many techniques and tools in corpus linguistics are ready to be used in CBTS
- Correspondence analysis, logistic regression, mixed-effect
- Cf. also Diwersy et al.: PCA
- Be careful when using normalised frequencies, and consider using a profile-based approach (cf. Bernardini \& Ferraresi 2011, Chesterman 2010)
- Drawbacks of profile-based method: a lot of manual annotation (checking function stability), decision on what is synonymous is not always easy


## Conclusion

- Multivariate statistics should be used only as a means to answer translation-relevant research questions (it is not a goal in itself)
- Multivariate statistics should be used with caution
- Check model diagnostics (e.g. multicollinearity)


# More information? 

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