Improved Infrastructure for Historical Dutch

INT

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Abstract

High quality linguistic annotation of historical Dutch is still problematic. This is clearly exemplified by a project like Nederlab covering Dutch language from the 6th- 21st century. Even though there are by now several tools that handle the problem,

- Efforts are fragmented
- Training material is scarce, absent for some periods and diverse in adopted tagset and annotation guidelines
- There is no common strategy to deal with typical issues of historical Dutch nontrivial word segmentation, spelling variation, and inflectional features which are hard to classify

There is need for a more thorough approach, comprising the following tasks: We propose tasks to

- Develop a common tag set and annotation guidelines
- Reliable metadata for historical corpus data
- Harmonize available training data and historical lexica
- Extend training data where the gaps are most painful
- Optimization and minor adaptation of existing taggers
- Integrate tools in a workflow for corpus processing
- Create a community and a shared infrastructure to enable researchers to easily upload, annotate and correct their data

Most tasks belong to WP3; The last task is WP6

1 Introduction

We propose to work on an infrastructure with the necessary tools, lexica and training data to deal with historical language material. The infrastructure should be beneficial to both tool developers and non-technical users/researchers, who would like to annotate their own material.

In DH projects, a lot of research is based on historical corpus material. This research could benefit from good quality linguistic annotation. Linguistic annotation of historical language data however still remains a challenge. Work has been done in several projects, national and international (e.g. IMPACT, Brieven als Buit, and recently Nederlab), but results are fragmented and far from providing a complete solution. There are several approaches to linguistic annotation of historical material and tools which are valuable enough to develop further. What all approaches need is gold standard material to train, develop and evaluate on. Not only is there not enough training material. Currently available training material for various tasks (NER tagging, PoS tagging) is fragmented and should be harmonized for optimal benefit. We would like to develop an infrastructure which provides this necessary material and an environment in which tool developers could make their tool available to potentially function in a tagging service.

For the non-technical researchers, the infrastructure should offer a user friendly environment which offers a means to upload their data and choose a tool for automatic annotation. The environment should also offer potential users options to assess the quality of the offered tools. There should also be a tool (service) by means of which efficient correction of linguistically annotated corpus material can be done.

Tools and annotated data will benefit the maintenance and improvement of the Nederlab infrastructure.

1.1 Impact

Targeted/Actual users Digital humanities, historical linguists, historians, any digital humanities scholar working with (historical) text.

Actual use (quantify!) It is difficult to quantify the use of historical annotation tools. One needs to distinguish the smaller group of corpus builders from the arger group of corpus users. Both benefit from an improved infrastructure, directly and indirectly. Obviously,

- There are many researchers using historical text
- The amount of corpus material that is processed by these tools is huge
- Easy accessibility to tools may increase the number of corpus builders

Social Impact All types of research involving historical language is still hindered by the complexities of historical Dutch. A good infrastructure will greatly benefit many researchers. (WP6 part:) By having the opportunity to involve digital humanities scholars in the development of user interfaces of tools from the linguistic community, the tools will become more accessible, also for the individual scholar with no particular technical background and with little or no technical support.

1.2 What is available

(this list is not complete; it shows that substantial work is available to build on, but harmonization and integration is necessary)

1.2.1 Tools for automatic linguistic annotation

- Adelheid¹, Developed by Hans van Halteren. Adelheid is already available in a CLAM-based web service for CLARIN-authenticated users at http://corpus1.mpi.nl/adelheid/main/
- Midas², developed by Mike Kestemont, now maintained by a.o. Enrique Manjavacas.
- INL labs, a supervised tagger trained on the Letters as Loot corpus³
- Frog middle Dutch (trained on CRM and Gysseling). Frog has recently been extended to deal with non-CGN tagsets 4
- Nederlab spelling normalization, cf. a.o. ⁵

1.2.2 Tools for manual annotation / correction of automatic annotation

- FlaT⁶
- COBALT⁷
- Gustave⁸
- Adelheid also comes with a manual correction tool
- Generic annotation tools like Brat⁹

1.2.3 Training and evaluation data

- Corpus Oud-Nederlands
- Corpus Gysseling
- Corpus van Reenen-Mulder
- Extensions to CRM

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1http://adelheid.ruhosting.nl/
2https://github.com/mikekestemont/Midas
3http://inl-labs.inl.nl/
4https://github.com/LanguageMachines/frog/issues/53
5https://ifarm.nl/clin2017st/paper/final.pdf
6https://flat.science.ru.nl/
7https://github.com/INL/COBALT
8https://languagedynamics.wp.hum.uu.nl/projects/
9http://brat.nlplab.org/
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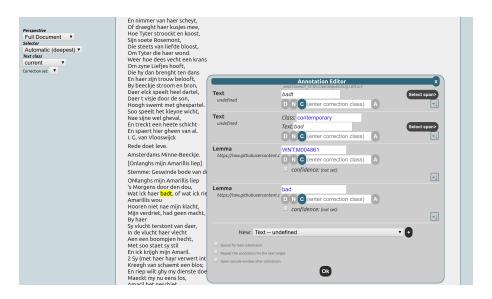


Figure 1: The FoLiA Linguistic Annotation Tool.

- KANTL southern extensions
- -15^{th} century extensions (Margit?)
- Letters as Loot
- Gentse Spelen
- Hooft letters¹⁰
- Nederlab evaluation sets
- Corpora compiled by Rik Vosters and colleagues at VU Brussel (early 19th century legal transcripts)

1.2.4 Lexica

- GiGaNT historical lexicon and web service

1.2.5 Tagsets and annotation guidelines

- Tagset Gysseling/CRM
- Extended subset of CGN tagset to incorporate features of Gysseling/CRM
- Main PoS according to INT lexica (Letters as Loot, Gentse Spelen)
- Extended CGN subset developed for the Hooft Letters
- Reduced CGN tagset in Nederlab Evaluation Samples
- GiGaNT tagset¹¹ and lemmatization principles¹²

1.2.6 Workflow systems

- The PICLL-based Nederlab corpus processing workflow

 $^{^{10} {\}tt https://languagedynamics.wp.hum.uu.nl/projects/}$

¹¹https://www.ivdnt.org/images/stories/onderzoek_en_onderwijs/publicaties/TaalbankWorkingpaper3.

 $^{^{^{1}2}} https://www.ivdnt.org/images/stories/onderzoek_en_onderwijs/publicaties/TaalbankWorkingpaper4.pdf$

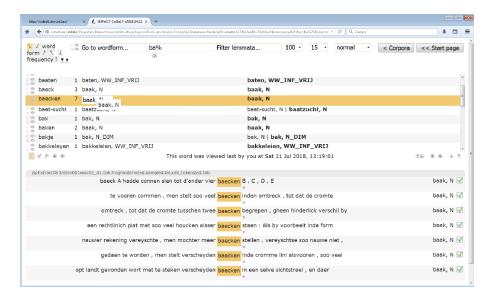


Figure 2: The CoBaLT Lexicon Annotation Tool.

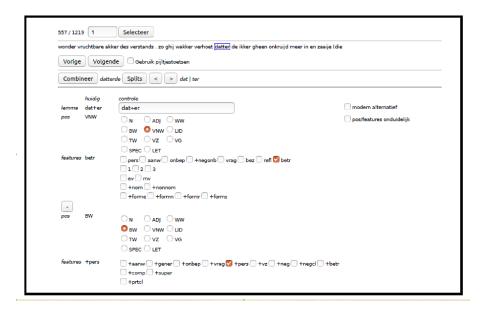


Figure 3: The Gustave Annotation Tool.

1.3 What must be created

While the most obvious thing to do is to sit down, take a deep breath and start annotating as much training data as possible, we think that history has shown that fragmentation will continue without an infrastructure and "community building" effort. (hence the involvement of research partners).

We propose tasks to

- 1. Develop a common tag set and annotation guidelines, such that
 - It allows different levels of linguistic detail to enable projects with different aims to profit
 from each others efforts the tag set and guidelines should cover both extremely coarsegrained tagging (main PoS and lemma) and detailed annotation up the the annotation
 of difficult features like case¹³.
 - It includes a standardized approach to tokenization issues in corpus (XML) file formats.
 Neither TEI nor FoLiA currently offer a completely satisfactory solution. For both

 $^{^{13}}$ Currently, only the Old Dutch corpus has case. This is obviously a significant gap, as is the (almost, cf. InPolder, 14) absence of syntactically annotated material



Figure 4: The Adelheid tagging service.



Figure 5: The INL labs demonstrator.

issues we may build on work done in the context of Nederlab to harmonize CGN-based and historical tagging, and to elaborate TEI- and FoLiA based approaches to encoding historical "splits" (te rugh) and "merges" (saghse). Cf. for instance [Cou] for a discussion of tag set issues.

- Mapping to other tagsets, such as universal dependencies
- Adequate metadata for historical corpus data. This involves solid principles enabling
 a distinction between dating of "text", text witness and publication date, as well as
 assigning separate metadata to parts of documents which may be .e.g. of different date
 (In Nederlab, both a proposed FoLiA and TEI approach have been developed)
- 2. Harmonize available training data and historical lexica. It should be clear that this involves more than a mapping of tags; extensive manual work may be required to achieve agreement
- 3. Extend training data where the gaps are most painful (as shown by an extensive evaluation). There are obvious gaps in most periods.
 - 14th century: no literary material
 - 15th-19th century: very little for "standard" written text
- 4. We do not propose to build completely new taggers/lemmatizers. Instead we will concentrate on optimization and adapting existing annotation tools, both by retraining and possible tool maintenance where needed and feasible. Also, it should be determined by an extensive

| Century | rate (tokens/hour) | tokens | hours | months |
|-----------------------------|--------------------|---------|--------|--------|
| 1350-1550 (Middle Dutch) | 150 | 100,000 | 666 | 5 |
| 1550-1650 (Early New Dutch) | 200 | 100,000 | 500 | 4 |
| 1650-1800 (New Dutch 1) | 400 | 100,000 | 250 | 2 |
| 1800-1954 (New Dutch 2) | 500 | 100,000 | 200 | 1.5 |
| total | | 400,000 | 1616.7 | 12.5 |

Table 1: Estimated workload for training data production according to the periodization adopted in Nederlab. Please note that sharing of training material between centuries is possible, and that with the existing corpora, we will have around 3 million annotated tokens

evaluation which combination of tool and training data is best suitable for a certain type of material

- 5. Integrate tools in a workflow for corpus processing robust enough to handle large volumes of data and sensitive enough to select the right tools for the right data
- 6. Test the workflow on a considerable amount of data
- 7. Create a community and a shared infrastructure to enable researchers to easily upload, annotate and correct their data [Task for WP6].

2 Work plan

2.1 Technical plan

2.1.1 Evaluation and testing infrastructure

This is the first task to be tackled. Involves both web service testing and UI testing.

2.1.2 Deep learning domain adaptation methods

Due to recent advances in deep learning and more specifically domain adaptation[HE19], it is not unlikely that off-the-shelf deep learning methods will outperform dedicated tools. Furthermore, the existing tools for historical Dutch do not use domain adaptation, which makes them inefficient in terms of training data effort.

For a straightforward baseline application of this type of approach, we need

- A generic trained BERT or other context-sensitive embedding models¹⁵. Candidate corpora are
 - SoNaR (500M tokens) model built by LIACS, Susan Verberne)
 - CHN-large (1.2G tokens)
 - DBNL (historical, about 1G tokens)

Since training such models is resource-intensive, we will need access to a cluster.

Scripts for finetuning and task adaptation e.g. https://github.com/xhan77/AdaptaBERT.
 Note that fine-tuning is feasible on one GPU.

2.2 Workload for manual tagging

Usually, 300-500 tokens per hour, depending on expertise of the tagger and difficulty of the material, is to expected for historical material. It should be taken into account that for difficult material, the rate may slow down to slightly above 100 tokens per hour. A preliminary estimate is in table 2.2

¹⁵We should not concentrate on one particular type of embedding, XLNet (https://arxiv.org/abs/1906.08237) already appears to outperform BERT on a set of tasks. Training effort is so huge that it does not seem a practical option for now, but that might change

2.3 Involved Partners

- RU: Piccl, Frog, Corpus encoding, Adelheid, user interface (FLaT, Piccl)
- RU (Margit Rem): Tagging principles
- INT: Tagging guidelines, tagset, INL labs, tokenization guidelines, corpus encoding, user interface, metadata
- Leiden University (Sjef Barbiers) Tagging principles
- Utrecht (Marjo van Koppen) Tagging principles, annotation tool (Gustave)
- Meertens (Hennie Brugman) relation to Nederlab
- Karina van Dalen-Oskam (Huygens) superuser and user interface concerns

External collaboration will probably involve Mike Kestemont and Enrique Manjavacas.

2.4 Deliverables

| ID | Description | Who | PM | WP |
|------|------------------------------------|---------------|----------------|----|
| D0a | Tagging and lemmatization | INT, Leiden, | INT 3, Leiden, | 3 |
| | guidelines | RU, Utrecht | RU, Utrecht | |
| | | | each 1 | |
| D0b | XML corpus encoding for histor- | INT (TEI), RU | 2 | 3 |
| | ical corpora | (FoLiA) | | |
| D1 | Evaluation of automatic annota- | INT, RU | 4 | 3 |
| | tion tools per period and type of | | | |
| | material | | | |
| D2a | Training data development | INT | 12 | 3 |
| D2b | Automatically tagged proof of | INT | 2 | 3 |
| | concept diachronic corpus, con- | | | |
| | sisting of a substantial reliably | | | |
| | metadated, non-OCR subset of | | | |
| | Nederlab | | | |
| D3 | Workflow, web service and web | RU, INT | 4 | 3 |
| | application(s) for historical tag- | | | |
| | ging incorporating most essen- | | | |
| | tial tools and appropriate choice | | | |
| | mechanism per period; Training | | | |
| D. (| of tools | TATE II | 10 | |
| D4 | Web-based environment(s) for | INT, Huygens, | 10 | 6 |
| D. | manual corpus annotation | RU | | |
| D5 | Web site with demonstrator tools | INT, RU, All | 2 | 6 |
| | and extensive documentation | | | |

References

- [Cou] Evie Coussé. Een digitaal compilatiecorpus historisch nederlands. Lexikos, 20:123–142.
- [HE19] Xiaochuang Han and Jacob Eisenstein. Unsupervised domain adaptation of contextualized embeddings: A case study in early modern english. arXiv preprint arXiv:1904.02817, 2019.