A software-driven workflow for the reuse of language documentation data in typological studies

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Abstract

Existing language documentation datasets may be reused in typological research projects, if they can be evaluated for suitability. As these datasets may implement the FAIR principles insufficiently, and occur in diverse data formats, data exploration represents an alternative means of evaluation, as well as the core feature of iterative annotation-analysis cycles during the project. This paper presents a semiautomated workflow driven by a set of corpus software, which enables data exploration as part of the research process, and alleviates its cost. The presented software includes a conversion tool to deal with different formats as well as a search and analysis platform for evaluation and exploration. The authors have successfully extended the software, and implemented the presented workflow in a typological research project on the TAM systems of Melanesian languages.

1 Introduction

Corpus-based typological studies on endangered languages rely on corpus data, whose usual sources include language archives, fieldwork, and data exchange between individual researchers. Irrespective of the source, defining and compiling suitable datasets for a typological study – and working with them to answer a research question – is challenging in two respects, as available datasets

- 1. must be evaluated for reusability in the first place, unless they are produced during fieldwork which targets the research question;
- 2. may come in different data formats.

Evaluation of the reusability of a language documentation dataset for typological research includes fine-grained assessments, e.g., probing the occurrence of linguistic phenomena in the data. If the data is retrieved from language archives this is ideally supported by detailed metadata attached to the dataset, as well as suitable metadata search functionality provided by the archive web service. If the data is acquired directly from a colleague, the relevant information may also be retrieved from metadata, or through personal communication. For datasets produced during dedicated fieldwork, reusability information for a research question is inherently available. Due to differing metadata models and formats, incomplete metadata, lack of relevant metadata, and lack of suitable search functionality for archives, reusability information may not be retrievable from metadata. In short, datasets may fail to meet the FAIR Data Principles (Wilkinson et al., 2016).¹ In this case, the assessment must be based on in-depth data exploration. Such an exploration across several datasets can be tedious and time-consuming work, especially if the datasets come in different data formats, and hence may require different tools for the exploration process.

The second challenge - having datasets in different formats - can also complicate the actual research workflow, as different tools with different analysis capabilities may be needed for different datasets. Additionally, the analyses provided by different tools may be hard to compare, or even incompatible.

We propose that the challenges presented above can be mastered in a workflow based on a set of corpus linguistics software, *corpus-tools.org* (Druskat et al., 2016). The software set can be used to convert both the dataset candidates that should be evaluated ('dataset candidates') and the actual datasets to be analysed during a study ('research datasets') to a single format, in which they can be imported in the included search and analy-

¹With respect to metadata, datasets may fail to meet the reusability principle by not providing "meta(data) [that are] richly described with a plurality of accurate and relevant attributes", or "(meta)data [that does not] meet domain-relevant community standards" (Wilkinson et al., 2016, p. 4).

sis platform, for cross-corpus evaluation and analysis. We present the case study of a typological research project on Melanesian languages, where we have successfully extended and used these tools to evaluate and analyse datasets from different sources and in different formats.

2 A software-driven workflow

The workflow we propose bypasses the obstacles of datasets in different formats and missing metadata through a focus on data exploration, and the application of suitable software, i.e., corpustools.org. This set of linguistic corpus software includes ANNIS (Krause and Zeldes, 2016), an open source search and visualization platform. ANNIS is a web application implemented with a Java frontend and exchangeable backends; while older and current versions use the object-relational database management system PostgreSQL² as backend, future versions will use the faster custom in-memory graph database graphANNIS (Krause, 2019). The software unifies linguistic annotations and structures of corpora in graphs and makes them accessible via its powerful, linguistically-informed query language AQL³ Results can be displayed in a wide variety of visualizations, including the ones common for linguistic data, e.g., trees, coreference graphs, etc. Further functionality includes automated frequency analysis based on text and annotation as well as structure and subgraph searches, export of results, and the provision of uniquely identifiable references to queries, result sets and single results via generated hyperlinks. Both text and multimedia corpora are supported, and ANNIS offers playback of video and audio segments. With ANNIS it is possible to conduct cross-corpus data exploration and analysis, independently of original data formats of the corpora.

In order to use the given corpus datasets in *ANNIS*, they must be converted into a format that *ANNIS* can import. To this end, *corpus-tools.org* also includes an open source conversion framework for linguistic data, *Pepper* (Zipser et al., 2011). During a conversion process with *Pepper*, data is mapped to an instance of the meta-model *Salt* (Zipser and Romary, 2010), of which an open source implementation and API in the Java programming language is also a part of *corpustools.org*. *Salt* is based on a generic graph with se-

mantically sparse layers that concretize the model and API.⁴ Following the mapping to this intermediate model, the data is mapped to the target format. The *Pepper* platform provides the intermediate graph model, an API, a command-line interface, and a plugin mechanism based on OSGi (OSGi Alliance, 2011), a dynamic module system for Java. The mapping process itself is implemented in plugins for import, export, and model manipulation. A *Pepper* workflow description in XML specifies the order and configuration of plugins to be used during conversion.

The described set of software tools make it possible to implement a workflow for the evaluation of candidate datasets, as well as for the actual analysis in typological and other linguistic studies, via cross-corpus search and visualisation, and iterative cycles of annotation and analysis.

The workflow consists of the following steps, see Figure 1.

- 1. Compilation of candidate datasets
- 2. Conversion from source formats to *ANNIS* format and import in *ANNIS*
- 3. Evaluation of candidate datasets' suitability for the study (query, visualization, analysis)
- 4. Definition of research datasets based on 3
- 5. Conversion of research datasets to the format of the annotation software (e.g., *MMAX2*, *EX-MARaLDA*, *GraphAnno*, *Toolbox*, *TCF*, *Tree-tagger*, and more)⁵
- 6. Annotation
- 7. Conversion from annotation format to *ANNIS* format and import in *ANNIS*
- 8. Analysis via query/visualization in ANNIS
- 9. Formulation of research results based on 8

Steps 6–8 are usually repeated in iterative cycles of annotation, analysis, adjustment of requirements. One of the main advantages of the proposed workflow is that these steps can be automated by implementing best practices from software engineering: version control and continuous integration (CI, Booch (1992)). The annotated files can be placed in a version control system, which is polled by a CI system.

When changes are committed to version control, the CI system triggers the conversion to

²https://www.postgresql.org/

³https://github.com/korpling/ANNIS

 $^{^{4}}Salt$ differs from *LAF* (Ide and Romary, 2006) in that: *Salt* allows annotations on edges; *Salt* models relations between tokens and base text where *GrAF* (Ide and Suderman, 2007) uses spans for both; in *Salt*, primary data is part of the model.

⁵For a list of available modules see http:// corpus-tools.org/pepper/knownModules.



Figure 1: Diagram depicting the proposed workflow based on corpus-tools.org software.

the ANNIS format via the Pepper command-line client, and the subsequent import in ANNIS via its REST API. This method also introduces positive side-effects in the workflow: Automated conversion relieves researchers of tedious work; version control allows for unwanted changes to be rolled back; combined with version control, CI introduces reproducibility of annotation-analysis cycles, and enables debugging of erratic processes, and the testability of the automation itself, e.g., by implementing unit and integration tests.

3 Case study: The MelaTAMP project

We have implemented the proposed workflow in the typological research project MelaTAMP.⁶

The project aims to expand the knowledge about tempus, aspect, modality and polarity systems in mood-prominent languages (cf. Bhat (1999)) through a corpus-based analysis of relevant expressions and contexts in 7 Melanesian languages. To this end, the corpora (see Table 1) have been iteratively annotated for clause types, temporal reference, event structure, modal domain, and polarity. Subsequent conversion and visualization in *ANNIS* have enabled the analysis of, e.g., expressions of irrealis (von Prince et al., 2018), or habitual contexts (von Prince et al., accepted).

Within the scope of the project, we have started out with a set of seven existing corpora. The corpora have been acquired through direct exchange with colleagues, and some had been created by project members (see Table 1). We have also added another set of six corpora to the research datasets, that have been elicited as part of the project, using custom storyboards (von Prince, 2018a,b,c,d,e; Krajinović, 2018a,b,c).

Some of the corpora are available from language archives, but the obstacles to data evaluation presented by the lack of relevant metadata and search options in archive interfaces, mentioned in the introduction, pertain, and we have bypassed them by acquiring the respective datasets directly from their authors. Nevertheless, the dataset candidates for our different research questions have been evaluated and selected as intended.

As most of the corpora were available in the *Toolbox* format, we chose to annotate directly in the *Toolbox* text format files with the help of a text editor (Sublime Text 3^7).

We have automated the annotation-analysis cycle by versioning our *Toolbox* text format files with *Git* (Chacon and Straub, 2014) on our institutional *GitLab*⁸ instance. *GitLab*'s CI system has been configured to poll the repository holding the annotations, and run a script on a virtual machine whenever files have changed. The script installs *Pepper*, installs the necessary conversion plugins,

⁶https://hu.berlin/melatamp

⁷https://www.sublimetext.com/

⁸https://about.gitlab.com/

Language	ISO 639-3	Tokens	Country	Elicitator	Format (Software)
Daakie	ptv	~86k	Vanuatu	Krifka (2013)	Text (Toolbox)
Daakie	ptv	~3k	Vanuatu	Manfred Krifa	Text (Toolbox)
Daakaka	bpa	~59k	Vanuatu	von Prince (2013a)	Text (Toolbox)
Daakaka	bpa	~80k	Vanuatu	Kilu von Prince	XML (ELAN)
Dalkalaen		~30k	Vanuatu	von Prince (2013b)	Text (Toolbox)
Dalkalaen		~13k	Vanuatu	Kilu von Prince	XML (ELAN)
North Ambrym	mmg	~24k	Vanuatu	Franjieh (2013)	XML (FLEx)
North Ambrym	mmg	~15k	Vanuatu	Michael Franjieh	XML (ELAN)
Mavea	mkv	~30k	Vanuatu	Guérin (2006)	Text (Toolbox)
Mavea	mkv	~12k	Vanuatu	Valérie Guérin	Text (Toolbox)
South Efate	erk	~54k	Vanuatu	Thieberger (2006)	Text (Toolbox)
South Efate	erk	~15k	Vanuatu	Ana Krajinovic	XML (ELAN)
Saliba/Logea	sbe	~138k	Papua	Margetts et al. (2017)	Text (Toolbox)
			New Guinea		

Table 1: Overview of corpora used in the MelaTAMP project. **Bold** language names signify that a corpus has been elicited during the project. Software: "Toolbox" = (unknown) version of SIL Toolbox (Robinson et al., 2007); "ELAN" = (unknown) version of ELAN (Wittenburg et al., 2006); "FLEx" = (unknown) version of SIL FieldWorks Language Explorer (https://github.com/sillsdev/FieldWorks).

converts the annotation data into the *ANNIS* format, and uploads the converted files to an *ANNIS* instance via REST API.

Following the workflow, we needed the following *Pepper* plugins:

- Toolbox text format import plugin
- FLEx XML import plugin
- ELAN import plugin
- *Toolbox* text format export plugin
- ANNIS format export plugin

An export plugin for the *ANNIS* format already exists,⁹ as does an *ELAN* import plugin.¹⁰ However, the *ELAN* import plugin has been developed for a relatively narrow set of use cases, and did not yield usable results for our case. Instead, we exported the corpus files that were available in the *ELAN* XML format to the *Toolbox* text format via the respective export functionality in *ELAN*.

In the course of the project, we have developed three further plugins in two open source software projects: *ToolboxTextModules* and *FLExModules*.

3.1 ToolboxTextModules

The *ToolboxTextModules* (Druskat, 2018b) project holds a *Pepper* import plugin to map the *Toolbox* text format to a *Salt* model, and an export plugin to map a *Salt* model to the *Toolbox* text format. The import plugin is passed a *Toolbox* text format file or a directory containing such files. It will parse the files, validate them, and transform their contents into a *Salt* graph structure of corpora and documents. Documents have their own *document graph*, which contains the language data as nodes and edges. It will contain two base text nodes, whose text values represent:

- the lexical information from lines in the *Tool*box file marked with \tx;
- the morphological information from lines marked with \mb.

Token nodes segment the text base according to *Toolbox*' interlinearization; *Salt* can handle *Toolbox*' double segmentation by aligning tokens through a sequential data structure. The plugin also detects invalid interlinearizations in the *Toolbox* data based on incongruencies over token indices, and records them.

Token nodes can have multiple annotations – annotations are realized in the graph model as labels on nodes – and can be covered by span nodes which in turn can have multiple annotations themselves. Span nodes are used to represent \ref phrases and \id documents.

The import plugin can be passed parameters to configure the conversion. These include: specifications for marker distinction; how morphology delimiters should be handled; whether markers should be changed during conversion; if and how interlinearization errors should be recorded, and

⁹https://github.com/korpling/

pepperModules-ANNISModules

¹⁰https://github.com/korpling/ pepperModules-ElanModules

more. Additionally, the plugin supports a custom structure which cannot be expressed in the *Toolbox* software, but is supported by the format and leveraged by our annotation process: Annotations in *Toolbox* can only be assigned to either lexical or morphological units, or to the whole \ref span. We have introduced sub-phrases termed *subref*, which are index-determined spans which cover a subset of the complete set of morphological token nodes within a *Toolbox* \ref unit. These can be used to annotate, e.g., clauses.

The export plugin converts a *Salt* model to *Toolbox* text format files, and adheres as closely as possible to the Multi-Dictionary Formatter specifications (Coward and Grimes, 2003). Parameters are again used to configure the conversion, mainly to specify which annotation layers in the *Salt* model should be mapped to which markers.

3.2 FLExModules

FLExModules (Druskat, 2018a) provides an import plugin for the XML format exported from *FieldWorks Language Explorer (FLEx)*. It transforms the interlinearized text structure provided in the XML to a *Salt* model, complete with corpus structure and annotations. This model is very similar to the model produced during conversion from the *Toolbox* text format, but the implementation is less complex than for the import plugin for the latter, given the structured nature of the data. The *FLEx* XML import plugin provides parametrization inasmuch as annotation namespaces and names can be changed in the process using a pre-defined mapping.

4 Conclusion

In the MelaTAMP research project we have successfully implemented and automated the annotation-analysis part of the proposed workflow (see Figure 1) for 13 language documentation corpora provided in three different data formats, and have enabled future implementations of the evaluation part by creating *ToolboxTextModules* and *FLExModules*. In this paper we have also shown that a workflow driven by extended *corpus-tools.org* software can bypass obstacles to data evaluation presented by insufficient implementation of the FAIR principles for data management in language documentation datasets as available in, e.g., archives of endangered languages. The presented workflow features automation as a means to boost efficiency and reduce errors. It enabled us to analyse expressions of irrealis and habitual contexts across 7 Melanesian languages, and subsequently formulate research results such as von Prince et al. (2018) and von Prince et al. (accepted).

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