# DiaCollo: On the trail of diachronic collocations

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#### Abstract

This paper presents DiaCollo, a software tool developed in the context of CLARIN for the efficient extraction, comparison, and interactive visualization of collocations from a diachronic text corpus. Unlike other conventional collocation extractors, DiaCollo is suitable for extraction and analysis of diachronic collocation data, i.e. collocate pairs whose association strength depends on the date of their occurrence. By tracking changes in a word's typical collocates over time, Dia-Collo can help to provide a clearer picture of diachronic changes in the word's usage, in particular those related to semantic shift. Beyond the domain of linguistics, DiaCollo profiles can be used to provide humanities researchers with an overview of the discourse topics commonly associated with a particular query term and their variation over time or corpus subset, while comparison or "diff" profiles highlight the most prominent differences between two independent target queries. In addition to traditional static tabular display formats, a web-service plugin also offers a number of intuitive interactive online visualizations for diachronic profile data for non-technical users.

### 1 Introduction

In recent years, an increasing number of large diachronic text corpora have become available for linguistic and humanities research, including the *Deutsches Textarchiv*<sup>1</sup> (Geyken et al., 2011) and the Corpus of Historical American English<sup>2</sup> (Davies, 2012). While the broad time spans represented by these corpora offer unique research opportunities, they also present numerous challenges for conventional natural language processing techniques, which in turn often rely on implicit assumptions of corpus homogeneity – in particular with respect to the temporal axis. Indeed, even putatively synchronic newspaper corpora have a nontrivial temporal extension and can reveal date-dependent phenomena if queried appropriately (Scharloth et al., 2013). This paper addresses the problem of automatic *collocation profiling* (Church and Hanks, 1990; Evert, 2005) in such diachronic corpora by introducing a new software tool "DiaCollo" explicitly designed for this purpose which allows users to choose the granularity of the diachronic axis on a per-query basis.

DiaCollo is a modular software package for the efficient extraction, comparison, and interactive visualization of collocations from a diachronic text corpus. Unlike conventional collocation extractors such as DWDS Wortprofil<sup>3</sup> (Didakowski and Geyken, 2013), Sketch Engine<sup>4</sup> (Kilgarriff and Tugwell, 2002; Rychlý, 2008), or the UCS toolkit<sup>5</sup>, DiaCollo is suitable for extraction and analysis of diachronic collocation data, i.e. collocate pairs whose association strength depends on the date of their occurrence and/or other document-level properties. By tracking changes in a word's typical collocates over time and applying J. R. Firth's famous principle that "you shall know a word by the company it keeps" (Firth, 1957), DiaCollo can help to provide a clearer picture of diachronic changes in the word's usage.

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<sup>&</sup>lt;sup>1</sup>http://www.deutschestextarchiv.de

<sup>&</sup>lt;sup>2</sup>http://corpus.byu.edu/coha

<sup>&</sup>lt;sup>3</sup>http://zwei.dwds.de/wp

<sup>&</sup>lt;sup>4</sup>http://www.sketchengine.co.uk

<sup>&</sup>lt;sup>5</sup>http://www.collocations.de/software.html

DiaCollo was developed in the context of CLARIN in order to aid historians participating in the CLARIN Working Groups in their analysis of the changes in discourse topics associated with selected terms as manifested by changes in those terms' context distributions, and has been successfully applied to both mid-sized and large corpus archives, including the *Deutsches Textarchiv* (1600–1900, ca. 2.6K documents, 173M tokens) and a large heterogeneous newspaper corpus (1946–2015, ca. 10M documents, 4G tokens).

# 2 Implementation

DiaCollo is implemented as a Perl library, including efficient re-usable classes for dealing with native index structures such as  $(string \leftrightarrow integer)$  mappings, *n*-tuple inventories and component-wise equivalence classes, or hierarchical tuple-pair frequency databases. DiaCollo indices are suitable for use in a high-load environment, since no persistent server process is required and all runtime access to native index data structures occurs either via direct file I/O or (optionally) via the mmap() system call for efficient kernel-managed page caching, relying on the underlying filesystem cache to optimize access speed.

In addition to the programmatic API provided by the Perl modules, DiaCollo provides both a command-line interface as well as a modular plugin for the D\* corpus administration framework which includes a publicly accessible RESTful web service (Fielding, 2000) and a form-based user interface for evaluation of runtime database queries and interactive visualization of query results. The remainder of this paper describes the DiaCollo web service, whose architecture closely mirrors the independently documented command-line and Perl APIs. A publicly accessible web front-end for the *Deutsches Textarchiv* corpus can be found at http://kaskade.dwds.de/dstar/dta/diacollo/, and the source code is available via CPAN at http://metacpan.org/release/DiaColloDB.

**Requests & Parameters** DiaCollo is a request-oriented service: it accepts a user request as a set of *parameter=value* pairs and returns a corresponding *profile* for the term(s) queried. Parameters are passed to the service RESTfully via the URL query string or HTTP POST request as for a standard web form. Each request must contains at least a *query* parameter specifying the target term(s) to be profiled. The date-range to be profiled can be specified with the *date* parameter, while the *slice* parameter can be used to alter the granularity of the returned profile data by specifying the size in years of a single profile epoch. Candidate collocates can be filtered by means of the *groupby* parameter, and result-set pruning is controlled by the *score*, *kbest*, and *global* parameters.

**Profiles & Diffs** The results of a simple DiaCollo user request are returned as a tabular *profile* of the *k*-best collocates for the queried word(s) or phrase(s) in each of the requested date sub-intervals ("epochs" or "slices", e.g. decades) specified by the date and slice parameters. Alternatively, the user may request a comparison or "diff" profile in order to highlight the most prominent differences between two independent queries, e.g. between two different words or between occurrences of the same word in different date intervals, corpus subsets, or lexical environments.

**Indices, Attributes & Aggregation** For maximum efficiency, DiaCollo uses an internal "native" index structure over the input corpus content words to compute collocation profiles. Each indexed word is treated as an *n*-tuple of linguistically salient token- and/or document-attributes selected at compile-time, in addition to the document date. User query and groupby request parameters are interpreted as logical conjunctions of restrictions over these attributes, selecting the precise token tuple(s) to be profiled. For finer-grained selection of profiling targets, DiaCollo supports the full range of the DDC<sup>6</sup> query language (Sokirko, 2003; Jurish et al., 2014) via the ddc and diff-ddc profile types whenever the DiaCollo instance is associated with an underlying DDC server back-end.

**Scoring & Pruning** DiaCollo assigns each collocate  $w_2$  in a unary profile for a target term  $w_1$  a realvalued score by means of a user-specified *score function*. Supported score functions include absolute raw- and log-frequency (*f*, *lf*), normalized raw- and log-frequency per million tokens (*fm*, *lfm*), pointwise

<sup>&</sup>lt;sup>6</sup>http://www.ddc-concordance.org



Figure 1: DiaCollo interactive tag-cloud visualization of the ten best proper name collocates of the noun *Krise* ("crisis") in the German weekly newspaper *DIE ZEIT* for the epochs 1980–1989 (left) and 2010–2014 (right).

mutual information × log-frequency product (*mi*), and the scaled log-Dice coefficient (*ld*) as proposed by Rychlý (2008). Candidate collocates are ranked in descending order by the associated scores, and the *k*-best candidates in each epoch are selected and returned. "Diff" queries compute independent profiles  $p_a$  and  $p_b$  for the *query* and *bquery* parameters, respectively. After ranking according to the selected score function, a comparison-profile  $p_{a-b}$  is computed as  $p_{a-b} : w_2 \mapsto p_a(w_2) - p_b(w_2)$  for each of the up to 2k collocates  $w_2 \in k$ -best $(p_a) \cup k$ -best $(p_b)$  and the *k*-best of these with the greatest absolute differences  $|p_{a-b}(w_2)|$  are selected and returned.

**Output & Visualization** DiaCollo supports a number of different output formats for returned profile data, including TAB-separated plain text suitable spreadsheet import, native JSON for further automated processing, and a simple tabular HTML format. In addition to the static tabular formats, the D\* web-service plugin also offers several interactive online visualizations for diachronic profile data, including two-dimensional time series plots using the Highcharts JavaScript library, flash-based motion charts using the Google Motion Chart library, and interactive tag-cloud and bubble-chart visualizations using the D3.js library. The HTML and interactive D3-based display formats provide an intuitive color-coded representation of the association score (rsp. score-difference for "diff" profiles) associated with each collocation pair, as well as hyperlinks to underlying corpus hits ("KWIC-links") for each data point displayed.

# 3 Example

Figure 1 contains example tag-cloud visualizations for a unary DiaCollo profile of proper name collocates for the noun *Krise* ("crisis") in 10-year epochs over an archive of the German weekly newspaper *DIE ZEIT* spanning the interval 1950–2014. Since the term "crisis" usually refers to a short-lived and inherently unstable situation, its typical collocates can be expected to vary widely over time, reflecting changes in the discourse environment which in the case of a newspaper corpus can themselves be assumed to refer to events in the world at large. Indeed, the data in Figure 1 can easily be traced to prominent political events of the associated epochs. Conspicuous *Krise*-collocates and associated events in the 1980s include *Afghanistan* and *Sowjetunion* ("Soviet Union") for the Soviet-Afghan war (1979–1989); *Polen* ("Poland") due to the *Solidarność* movement and declaration of martial law in 1981; *Schmidt* and *Sozialdemokratische Partei Deutschlands* (SPD) referring to the collapse of the SPD-led German government coalition under Helmut Schmidt in 1982; and *NATO*, *Bonn*, and *Berlin* in the context of NATO's deployment of mid-range missiles in western Europe. The foreshortened final epoch (2010–2014) can be traced to civil wars in the Ukraine and Syria (*Syrien*), the Greek government-debt crisis and its repercussions in the European Union (*Griechenland*, *Italien*, *Spanien*), the Russian annexation of Crimea (*Krim*), and the German FDP (*Freie Demokratische Partei*) party's loss in the 2013 federal elections.

#### 4 Summary & Outlook

This paper introduced DiaCollo, a new software tool for the efficient extraction, comparison, and interactive online visualization of collocations specially tailored to the unique demands of diachronic text corpora. In its top-level incarnation as a modular web service plugin for the D\* corpus administration framework, DiaCollo provides a simple and intuitive interface for assisting linguists, lexicographers, and humanities researchers to acquire a clearer picture of diachronic variation in a word's usage over time or corpus subset. Future work will focus on implementing new visualization techniques for DiaCollo profile data, as well as extending the profiling back-end to handle other corpus input formats or online search APIs such as CLARIN Federated Content Search.

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