# Interoperable annotation of (co)references in the Democrat project

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#### Abstract

This paper proposes XML-TEI-URS, a generic TEI-based format for the annotation of coreferences in arbitrary corpora. This proposal is made in the context of Democrat, a French *Agence Nationale de la Recherche* project that aims to produce a large corpus of written French with coreference annotations, in an attempt to design a corpus that is usable both by humans and automated tools and as compatible as possible with future concurrent annotations.

### 1 Introduction

In this paper we propose XML-TEI-URS, a TEI-compliant format for coreference annotation inspired by Glozz' URS (Unit-Relation-Schema) metamodel (Widlöcher and Mathet 2012). Our main goal is to provide a standard that is easy to process for automated tools, compatible with other types of annotations and stays as human-readable as possible, in order to improve the interoperability of annotated corpora.

This proposal is formulated in the context of the Democrat project (Landragin 2016), which aims to produce a large corpus of written French with coreference annotations. It also takes inspiration from the MC4 projet (Mélanie-Becquet and Landragin 2014) —which has served as a proof-of-concept for the Democrat project—, the ANCOR (Muzerelle et al. 2014) and PCC (Polish Coreference Corpus (Ogrodniczuk et al. 2015)) corpora, which fulfilled similar objectives, respectively for oral French and written Polish and previous standardisation initiatives, such as Bruneseaux and Romary (1997).

We first give a rough description of the existing formats for coreference-annotated corpora, then go on to look at the tools available in the TEI for coreference annotation, and finally describe how we plan to implement coreference annotation in the Democrat corpus and in a TEI-compliant version of the ANCOR corpus.

#### 2 Context

Historically, the first corpus with coreference annotations was the MUC corpus (Grishman and Sundheim 1996) released in 1995 in the occasion of the 6th Message Understanding Conference and annotated using simple inline SGML. Its natural successor, ACE (Doddington et al. 2004), which was dedicated to the related Entity Detection and Tracking task and released in 2003 used a similar format, but with stand-off annotations to replace some of the inline ones used in the MUC corpus.

In 1999, in the context of the MATE project Poesio, Bruneseaux, and Romary (1999) proposed a generic scheme for annotating coreference in the MATE workbench (Isard et al. 2000), both in terms of representation format and annotation conventions. The MATE project and its follow up (Poesio 2004) inspired the format of several subsequent corpora, most notably the GNOME (Poesio 2000) and AnCora (Taulé, Martí, and Recasens 2008) corpora and directly influenced the markup scheme used by the MMAX2 annotation format in which several corpora have been annotated. Among them were ARRAU (Poesio and Artstein 2008), LiveMemories (Rodríguez et al. 2010) and EPEC-KORREF (Soraluze et al. 2012). To our knowledge, this was the first effort of standardization of coreference annotations. These formats were XML-based, using elements similar —but not identical— to those proposed by the TEI for stand-off annotation. While being similar, they were not generally compatible, and not necessarily easy to reuse.

A major event for coreference-annotated corpora was the release in 2007 of the first edition of the OntoNotes corpus (S. S. Pradhan et al. 2007), followed by several other editions. It is to this day the largest coreference-annotated corpus, with nearly 3M words in three languages —Arabic, English and Chinese. Its format was inspired from those of the MUC and ACE corpora, with inline SGML annotations for coreference (and other

types of annotation, most notably for parsing in independent files and formats) and with a methodology inspired in part by the MATE guidelines. The use of the OntoNotes corpus in the CoNLL-2011 and CoNLL-2012 (S. Pradhan et al. 2012) shared tasks made it the standard evaluation ground for coreference detection systems, but in that case, the compatibility of the corpus and its ease of reuse in other contexts was far from being evident.

An example of a coreference corpus that followed a TEI-format is the PCC, developed by Ogrodniczuk et al. (2015). Its format is an extension of the one used by its base, the NKJP corpus (Adam Przepiórkowski and Łaziński 2008), and coreference annotations are implemented as stand-off annotations in separate files.

Regarding French, for now, the only publicly available large-scale coreference-annotated corpus is ANCOR (Muzerelle et al. 2014), a 418k words corpus of transcribed oral. This transcription imposed the base of its format, as the source corpora were in the Transcriber's (Barras et al. 1998) TRS format. As for the coreference annotations, they started as stand-off Glozz annotations in separate files, that were later integrated into the original Transcriber files. The resulting corpus has thus an non-standard format that is importable neither in Transcriber nor in Glozz and can be cumbersome to parse for other applications. Another corpus of importance for our reflexions is MC4, a diachronic corpus of written French, annotated for the MC4 project as a proof-of-concept. Its format, XML-TEI-Analec, is the base of our reflexion here, presenting TEI-compliant stand-off coreference annotations in self-contained files.

The Democrat project, started in 2015, aims at creating and using a large-scale coreference-annotated diachronic corpus of written French by 2019. To that aim, it plans to leverage the experience gathered in the similar but smaller-scaled MC4 project. The manual annotation of this corpus is planned to be done with Analec (Landragin, Poibeau, and Victorri 2012) at first, while phasing it out for appropriate tools implemented for the TXM platform (Heiden 2010). For now, this annotation procedure yields native Analec files, with optional conversion to the XML-TEI-Analec format.

### 3 Linguistic annotations and coreference in the TEI

The description of an annotation in any kind of representation is made of two parts: a way of marking the element (markable) that is being annotated (unitizing) and a way of stating the annotations you are giving about it (categorizing).

For coreference (as for most linguistic annotations), the markables are usually contiguous spans of text. Unitizing is thus easily done using TEI's <span> element (or possibly <seg> as in the PCC). The main point of divergence is on how to specify the boundaries of those spans. Following Bański et al. (2016), we can identify three main pointing mechanisms in the TEI for stand-off annotations:

- Offset-based mechanisms such as TEI pointers (see Cayless (2013) for details and perspectives)
  - Used by the PCC and NKJP corpora through TEI's string-range and separate files.
  - Does not require source text alteration, but has to refer to a specific version of it.
- In-source <anchor> or similar markers
  - Used by Analec to denote markable (e.g. mentions) boundaries.
  - Requires minimal source text alteration and does not limit concurrent annotations.
  - Considerable source text clutter (particularly with concurrent annotations).
- Referring to <w> words/tokens
  - Used by TXM to mark words (tokens) for lemmatisation and POS-tagging.
  - Requires source text alteration and the non-trivial choice of a segmentation
  - Does not ease character-level boundaries encoding.
  - Considerably eases the aggregation of e.g. syntactic and coreference annotations.

As for categorizing, the TEI offers the <fs> structure, that can support a variety of annotations, including recursive structures, multivalued features, free-text features... This mostly solves the issue of annotating mention features — such as definiteness or syntactical type — but also cluster-level features — such as associativity or agreement — that have no support in the source text.

Finally, it is of course crucial for coreference annotation to be able to denote relations between mentions. There are usually two types of relations that have to be annotated: coreference relation between pairs of entity,

<sup>1.</sup> Tutin et al. (2000) presents another large-scale corpus with anaphoric links annotations, which is not publicly available. It uses a close derivative of the MATE format.

which can be directed (from a source to a target) in the case of anaphora; and coreference of a set of mentions (usually called a *coreference chain*). While there is no explicit way of specifying this kind of relation in the TEI, one can be designed with existing elements. Since mentions are already annotated, these relations can simply be annotated as references to them. There are mechanisms for this usage in the TEI, under the *linking* and *aggregating* categories (TEI consortium 2016). Analec uses <join> elements to that purpose, which is arguably non-conform with the stated purpose of these elements. The PCC corpus uses the more generic <ptr> <ptr> qtr>, which is more relevant, but makes the association between elements of a coreference chain harder, as it then requires to look for siblings of a given <ptr> qtr>. A third possibility exists in the form of the link> element, which "defines an association [...] among elements". This last alternative seems to be the most standard way of marking both URS relations and URS schema in the TEI, the only inconvenient being the necessity of relying on the order of xml:id in the target attribute to mark the direction of directed relations. It is also coherent with the recommendations of (Bruneseaux and Romary 1997).

### 4 XML-TEI-URS: a format for coreference annotation

In this section, we describe the XML-TEI-URS format: a lightweight format for the annotation of coreferences. This format is heavily inspired from the XML-TEI-Analec format described in Mélanie-Becquet and Landragin (2014), with an effort to improve its compliance with the spirit of the TEI guidelines and its integration in various types of TEI-formatted documents. The core of the format is the implementation in TEI elements of the URS metamodel introduced by Widlöcher and Mathet (2012).

- Mentions are *units* in the Glozz sense, i.e. contiguous<sup>2</sup> spans of the source text. They are represented by <span> elements with type="unit".
- Coreference relations between mentions are represented by link> elements with type="relation" whose target attributes are, in that order, the xml:id of the source mention and the xml:id of the target mention.
- Coreference chains are represented by link> elements with type="schema" whose target attributes are the xml:id of their member mentions, in no particular order.
- All of these might point to a <fs> using ana attributes to encode further linguistic annotations.

While they may seem redundant in the context of coreference, relations and schema are both needed for the annotation of more sophisticated concepts — for example bridging anaphora — that are naturally represented as directed relations between coreferences chains. This justify their inclusion here, however close the concepts and their concrete representations may seem.

Note that none of theses requirements specify where those elements should be located. This is due to the lack of a dedicated place in TEI documents for stand-off annotations. In our experiments with ANCOR, we follow Romary (2017) and use the <standOff</td>
 standOff
 <td

Example 1: XML-TEI-URS for the ANCOR corpus

<sup>2.</sup> Contiguity is actually not required for <pan>, so this could be easily extended to non-contiguous units.

```
[...]
       </u>
       [...]
       <u start="#t7.0" who="#spk2" xml:id="u7" end="#t7.19">
          [...]
          <w xml:id="u7-w20">en</w>
          <w xml:id="u7-w21">octobre</w>
          <w xml:id="u7-w22">mille</w>
          <w xml:id="u7-w23">neuf</w>
          <w xml:id="u7-w24">cent</w>
          <w xml:id="u7-w25">soixante</w>
          <anchor synch="#t7.6" type="time"/>
          [...]
          <w xml:id="u7-w36">à</w>
          <w xml:id="u7-w37">ce</w>
          <w xml:id="u7-w38">moment-la</w>
          <w xml:id="u7-w39">après</w>
          [...]
       </u>
       [...]
   </div>
   [...]
</body>
</text>
<standOff>
   <div type="coreference">
       <spanGrp type="unit">
          <span ana="#m2713-fs" from="#u7-w21" to="#u1-w25" xml:id="m2713"/>
          <span ana="#m2714-fs" from="#u7-w37" to="#u1-w38" xml:id="m2714"/>
          Γ...1
       </spanGrp>
       <div type="unit-fs">
          [...]
          <fs xml:id="#m2713-fs">
              <f name="type">
               <string>DATE</string>
              </f>
              [...]
          </fs>
          [\ldots]
       </div>
       <linkGrp type="relation">
          <link ana="#r212-fs" target="#m2713 #m2714" xml:id="r212"/>
          [...]
       [...]
       <linkGrp type="schema">
          <link target="#m2713 #m2714 #m2731" xml:id="s150"/>
          Γ...
       </linkGrp>
   </div>
</standOff>
```

The format described above does not impose a particular pointing mechanism from those listed in section 3. However, in the specific context of the Democrat project, mentions boundaries may not occur inside of words, which relieves us from the burden of supporting character-level annotation. In addition to this, the TXM platform that is planned to support the final corpus already allows orthographic tokenisation as a support for its own internal annotations. This considerations lead us to recommend the use of the third solution, namely annotating mentions as spans anchored to <w> elements as shown in example 1.

As a support for the development and test of our proposed format, we used it to convert the ANCOR corpus to a fully TEI-compliant format. This involved both converting its original transcription-related annotation to their TEI equivalents and converting its coreference annotations to the format described above, example 1

shows an example of this. This shows the capacity of our format to adapt to different corpus paradigms, and bodes well for further applications, including to documents with more complex TEI representations. It also eases the access to the annotations of ANCOR for the automated annotation tools we are developing in the Democrat project (which was part of our initial motivation) compared to both the original ANCOR format and MC4's XML-TEI-Analec format.

It should also be noted that this format, while designed for coreference annotation, is not restricted to this application. Indeed, Glozz' URS metamodel has been shown to be suitable for a variety of applications such as analysis of opinion or discourse structures, which gives us hopes for the adoption of our format for other kinds of annotations, thus increasing the general interoperability of annotated corpora.

### 5 Conclusion and perspectives

In this paper, we presented a quick overview of the formats used for existing coreference-annotated corpora. While some efforts of standardization exist, it is our beliefs that those do not fulfill our goals of simplicity and interoperability for the annotation of the Democrat corpus. The XML-TEI-URS format we propose is TEI-compliant and plays well with other types of linguistic annotations, including transcription annotations for oral corpora. At the same time, it offers some leeway, particularly regarding pointing mechanisms, in order to accommodate different exigences for corpus makers and users. This proposal is also intentionally agnostic regarding the theoretical framework used for the actual annotation of (co)reference. In that sense, it is complementary to of e.g. the future recommendations of ISO (2017) and potentially any other paradigm.

We worked within the limits of the TEI, which already provides suitable tools for reference annotation. However, we deplore the lack of dedicated mechanisms to attach stand-off annotations to documents, and it is our hope that the integration of the <standOff element in the TEI guidelines would fulfill that lack.

Our next steps should be the release of both an explicit TEI XML schema for our format, and the release of the whole ANCOR corpus in this format as a proof-of-concept. In the context of the Democrat project, we will also have to refine the actual features we use for the annotation of coreference phenomena, features that could then make their way into our recommendations for the annotation of coreference in other projects.

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