



UNIVERSITÀ
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del Sacro Cuore



Risorse linguistiche per il latino

Lemmatizzazione, PoS Tagging e Interoperabilità

Marco Passarotti

Università di Parma
29 Marzo 2023



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Overview



The Story So Far (through the lenses of the *Index Thomisticus*)

Analogical and Isolated ...but Findable
Digital and (Partly) Accessible

Lemmatization & Part-of-Speech Tagging

What is lemmatization and PoS tagging?
Lemmatized Corpora for Latin

Tools and Hands-on

Tools for lemmatization & POS Tagging

Latin in the Semantic Web

The LiLa Knowledge Base
Services and Tools
To sum up

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Millions of Punched Cards

Analogical and isolated ...but Findable



Millions of Punched Cards

Analogical and isolated ...but Findable



[...] in the early 1960s, when computers were scarce, expensive, and cumbersome, using computers for communication was almost unthinkable.
[...] A scientist who needed to use a distant computer might find it easier to get on a plane and fly to the machine's location to use it in person.

(Janet Abbate. Inventing the Internet. MIT, 1999, 1.)



Millions of Punched Cards

Analogical and isolated ...but Findable



The Result ...on Paper

The *Index Thomisticus*

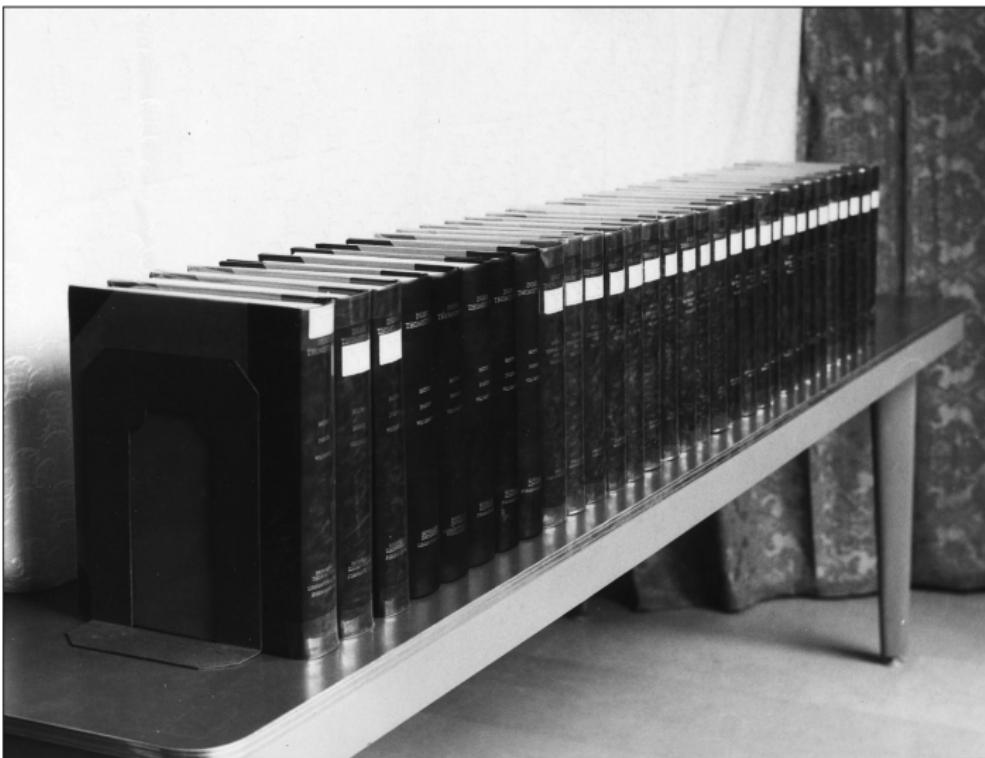


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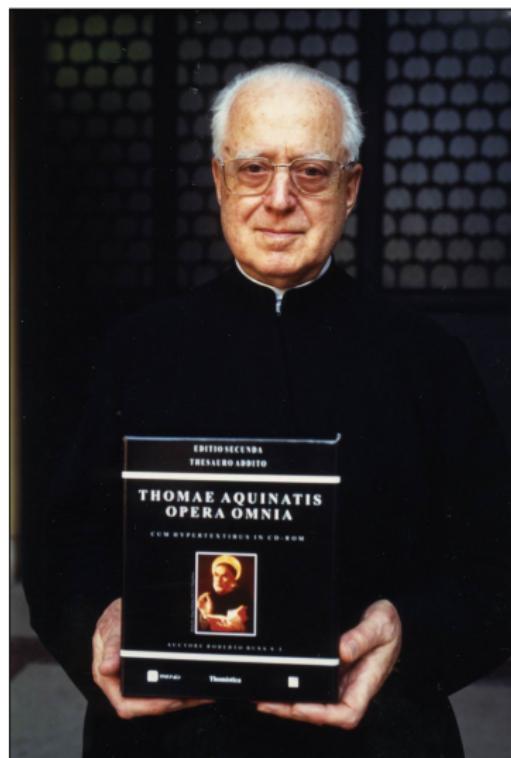
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The Digital Turn: (meta)data (partly) accessible

The CD-ROM of the *Index Thomisticus*



The Digital Turn: (meta)data (partly) accessible

Thanks God for the CD-ROM!



The Digital Turn: (meta)data (partly) accessible

Thanks God for Internet!



CORPUS THOMISTICUM
INDEX THOMISTICUS
by Roberto Busa SJ and associates
web edition by Eduardo Bernot and Enrique Alarcón
la versione italiana non è ancora disponibile

Search: computare

concordances terms works options new search

FOUND 13 CASES IN 13 PLACES

1-10

CASE 1. PLACE 1. *Super Sent., lib. 2 d. 14 q. 1 a. 4 arg. 4.* [...]⁻¹ Sed ratione hujus convenientiae aer et ignis caelum dicuntur. Ergo videtur quod oportuisset similiter aqueum elementum inter caelos **computare**.

CASE 2. PLACE 2. *Super Sent., lib. 4 d. 30 q. 2 a. 1 qc. 2 co.* Ad secundam quaestionem dicendum, quod conveniens fuit matrem Christi matrimonio esse junctam tum propter causas in littera assignatas, tum etiam propter alias causas: quarum prima est, ut significaret Ecclesiam, quae est virgo et sponsa. Secunda, ut per Joseph genealogia Mariae texeretur: non enim erat consuetudo apud Hebreos ex parte mulierum genealogiam **computare**. Tertia, ut virginibus excusatio tolleretur, si de fornicatione infamantur. [...]⁻²

CASE 3. PLACE 3. *Super Sent., lib. 4 d. 43 q. 1 a. 3 qc. 2 co.* [...]⁻⁷ Unde illi omnes qui tempus praedictum numerare voluerunt, hactenus falsiloqui sunt inventi. Quidam enim, ut Augustinus dixit ibidem, dixerunt ab ascensione domini usque ad ultimum ejus adventum quadringentos annos posse compleri, alii quingentos, alii mille: quorum falsitas patet; et similiter patebit eorum qui adhuc **computare** non cessant.

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Lemmatization & Part-of-Speech Tagging

Attaining a standard representation of lexicon and morphosyntax



Goals

Lemmatization and **part-of-speech tagging** (POS-tagging) aim to **abstract** some linguistic properties to allow **form-invariant** reference to types/tokens.

- ?! How can I retrieve all the occurrences of a word in a text?
- ?! How can I know which (morphosyntactic) function(s) a word plays in a text?

Lemmatization & Part-of-Speech Tagging

Attaining a standard representation of lexicon and morphosyntax



Different word forms in different contexts...

- ▶ ...*his rebus cognitis Caesar Gallorum animos verbis confirmavit...*
 - ablative plural (token); dative & ablative plural (type)
- ▶ ...*quod ego si verbo adsequi possem...*
 - ablative singular (token); dative & ablative singular (type)
- ▶ ...*ne more iuvencae mugiat, et timide verba intermissa retemptat...*
 - accusative plural (token); nominative, accusative & vocative plural (type)

...but all can be referred to a canonical/standardized citation form
(Lemma):

⇒ ***uerbum***

→ nominative singular of neuter II. declension noun

What about *cognitis*, *intermissa* and *timide*?

Lemmatization & Part-of-Speech Tagging

Attaining a standard representation of lexicon and morphosyntax



Lemmatization

Type-based the process of assigning each type (in a text) to one, or more lemma(s)

Token-based the process of assigning each token in a text to a lemma

Different lexicographic criteria:

- ▶ inflectional morphology: same paradigm, same lemma? what about participles?
- ▶ graphical representation: *voluptas* vs. *uoluptas*
- ▶ spelling: *sulphur* vs. *sulfur*
- ▶ ending and inflectional type: *diameter* vs. *diametros* vs. *diametrus*
- ▶ paradigmatic slot for the lemma: *sequor* vs. *sequo* (see Du Cange: infinitives used)
- ▶ homographs: *occido/[caedo|cado]* vs. *occido[1|2]*

Lemmatization & Part-of-Speech Tagging

Attaining a standard representation of lexicon and morphosyntax



Words can play different (morphosyntactic) functions in sentences:

★ *supra*

- ▶ ... *ager trecentis aut etiam supra nummorum milibus emptus...*
→ adverb (ADV)
- ▶ ... *ille qui supra nos habitat...*
→ preposition (ADP)

★ *scribo*

- ▶ ... *atque in Thesauro scripsit causam dicere prius unde petitur...*
→ verb (VERB)

★ *elephantus*

- ▶ ... *elephanto beluarum nulla prudentior...*
→ noun (NOUN)

These functions are predictable and come from a rather small set of alternatives.

Lemmatization & Part-of-Speech Tagging

Attaining a standard representation of lexicon and morphosyntax



Part-of-speech tagging

Type-based: the process of assigning each type one, or more morphosyntactic **function(s)**, i. e. parts of speech, from a given set

Token-based the process of assigning each token in a text one morphosyntactic **function**, i. e. part of speech, from a given set

Current standard de facto tagset: **Universal Dependencies**



16+1 classes: ADJ (adjectives), ADP (pre- & postpositions), ADV (adverbs), AUX (auxiliaries), CCONJ & SCONJ (co-ordinating & subordinating conjunctions), DET (determiners), INTJ (interjections), NOUN & PROPN (common & proper nouns), NUM (numerals), PART (particles), PRON (pronouns), VERB (verbs), SYM (symbols), X (other) + PUNCT (punctuation)

<https://universaldependencies.org>

Lemmatization & Part-of-Speech Tagging

Attaining a standard representation of lexicon and morphosyntax



Type-based vs. token-based POS tagging:

- ▶ Every ADJ can be NOUN
- ▶ Every ADP, CCONJ, SCONJ etc. can be NOUN (like in metalinguistic discourse)
- ▶ Every VERB can be NOUN

One or more part-of-speech? Which part-of-speech?

- ▶ *italicus*: ADJ? NOUN? PROPN?
- ▶ *ubi*: ADV? SCONJ?
- ▶ *non*: ADV? PART?
- ▶ *aliqui*: PRON? DET? ADJ?

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Lemmatized Corpora for Latin



- ▶ LASLA Corpus
- ▶ Index Thomisticus
- ▶ Computational Historical Semantics
- ▶ 5 Latin Treebanks in UD
- ▶ CLaSSES
- ▶ ...and others

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Analysed wordform : sulphur

=====ANALYSIS=====

SEGMENTATION: sulphur

-----morphological feats 1 -----

--nns--

Case: Nominative

Gender: Neuter

Number: Singular

-----morphological feats 2 -----

--ans--

Case: Accusative

Gender: Neuter

Number: Singular

-----morphological feats 3 -----

--vns--

Case: Vocative

Gender: Neuter

Number: Singular

=====LEMMA=====

sulphur N3B s3429 n

-----morphological feats-----

NcC

PoS: Noun

Type: Common

Inflexional Category: III decl

```
# generator = UDPipe 2, https://lindat.mff.cuni.cz/services/udpipe
# udpipe_model = latin-proiel-ud-2.6-200830
# udpipe_model_licence = CC BY-NC-SA
# newdoc
# newpar
# sent_id = 1
# text = Cui dono lepidum novum libellum arida modo pumice expolitum?
1   Cui   qui   PRON   Pr   Case=Dat|Gender=Masc|Number=Sing
2   dono   donum   NOUN   Nb   Case=Abl|Gender=Neut|Number=Sing
3   lepidum   lepidus   ADJ A-   Case=Acc|Degree=Pos|Gender=Masc|Number=Sing
4   novum   novus   ADJ A-   Case=Acc|Degree=Pos|Gender=Masc|Number=Sing
5   libellum   libellus   NOUN   Nb   Case=Acc|Gender=Masc|Number=Sing
6   arida   aridus   ADJ A-   Case=Acc|Degree=Pos|Gender=Masc|Number=Sing
7   modo   modo   ADV Df   _   8   advmod   _   TokenFeature=Modality
8   pumice   pumic   NOUN   Nb   Case=Abl|Gender=Masc|Number=Sing
9   expolitum?   expolio   VERB   V-   Case=Nom|Gender=Masc|Number=Sing
SpaceAfter=No|TokenRange=51:61
```

```
# generator = UDPipe 2, https://lindat.mff.cuni.cz/services/udpipe
# udpipe_model = latin-evalatin20-200830
# udpipe_model_licence = CC BY-NC-SA
# newdoc
# newpar
# sent_id = 1
# text = Cui dono lepidum novum libellum arida modo pumice expolitum?
1   Cui   qui   PRON   _   -   -   -   -   -   TokenRange=0:3
2   dono  donum  NOUN  _   -   -   -   -   -   TokenRange=4:8
3   lepidum  lepidus  ADJ  _   -   -   -   -   -   TokenRange=9:16
4   novum  novus  ADJ  _   -   -   -   -   -   TokenRange=17:22
5   libellum  libellus  NOUN  _   -   -   -   -   -   SpacesAfter=\r\n|TokenRange=23:31
6   arida  aridus  ADJ  _   -   -   -   -   -   TokenRange=33:38
7   modo   modo   ADV  _   -   -   -   -   -   TokenRange=39:43
8   pumice  pumicus  NOUN  _   -   -   -   -   -   TokenRange=44:50
9   expolitum?  expolito  VERB  _   -   -   -   -   -   SpaceAfter=No|TokenRange=51:61
```

- ▶ Download the tool from <https://www.cis.uni-muenchen.de/~schmid/tools/TreeTagger/>
- ▶ Prepare a txt file with a Latin text
- ▶ Tokenize the file and prepare the input (one-word-per-line):
`cd treetagger/cmd
perl utf8-tokenize.perl INPUT-FILE.txt >
OUTPUT-FILE.txt`

► cd ../bin

► Linux/Mac:

```
./tree-tagger <parameter-file> <input-file>  
<output-file> -token -lemma
```

Example (download a parameter file for Latin and put it into the 'bin' folder):
./tree-tagger latin.par input.txt output.txt
-token -lemma

► Windows:

```
tag-LANGUAGE.bat <input-file> <output-file>  
Example: tag-latin.bat input.txt output.txt
```

Further Tools

All Token-based



- ▶ Collatinus Web:
<https://outils.biblissima.fr/en/collatinus-web/>
- ▶ Deucalion: <https://dh.chartes.psl.eu/deucalion/latin>
- ▶ Stanza: three models for Latin. https://stanfordnlp.github.io/stanza/available_models.html
- ▶ Morpheus: <https://github.com/PerseusDL/morpheus>
- ▶ Whitaker's Words: <https://latin-words.com>

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The Linked Data Principles

...just to be FAIR



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- ▶ Use URIs for things (e.g. an entry in a lexicon, a token in a corpus)

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- ▶ Use URIs for things (e.g. an entry in a lexicon, a token in a corpus)
- ▶ Use HTTP URIs to allow people (and machines) to look up things

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- ▶ Use web standards to represent/query (meta)data, such as RDF and SPARQL

The Linked Data Principles

...just to be FAIR



- ▶ Use URIs for things (e.g. an entry in a lexicon, a token in a corpus)
- ▶ Use HTTP URIs to allow people (and machines) to look up things
- ▶ Use web standards to represent/query (meta)data, such as RDF and SPARQL
- ▶ Include links to other URIs

Why To Apply LD to Linguistic Resources

J. Gracia: LLD CLARIN Café, 29/4/21



Why To Apply LD to Linguistic Resources

J. Gracia: LLD CLARIN Café, 29/4/21



- ▶ Resources disconnected from each other (silos of LRs)

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Why To Apply LD to Linguistic Resources

J. Gracia: LLD CLARIN Café, 29/4/21



- ▶ Resources disconnected from each other (silos of LRs)
- ▶ Proprietary and heterogeneous formats
- ▶ Different representation schemes, query languages, annotation criteria and tagsets

The LiLa Knowledge Base

Key-word: interoperability



ERC Consolidator Grant 2018-2023

A collection of multifarious, interoperable linguistic resources described with the same vocabulary for knowledge description
(by using common data categories and ontologies)

Interlinking as a Form of Interaction



Common Language Resources and
Technology Infrastructure

Infrastructure



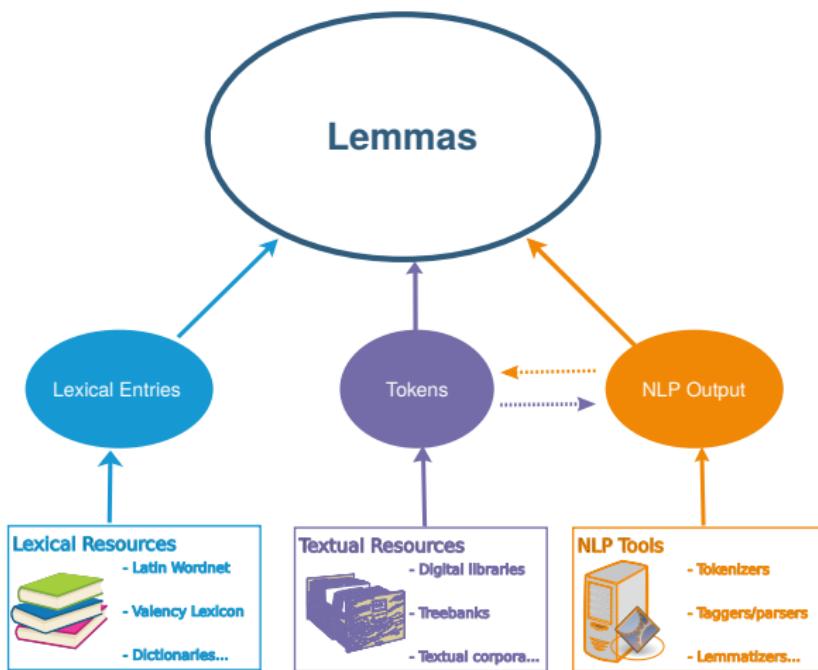
Interoperability

The LiLa Knowledge Base

Lexically-based architecture and (meta)data sources



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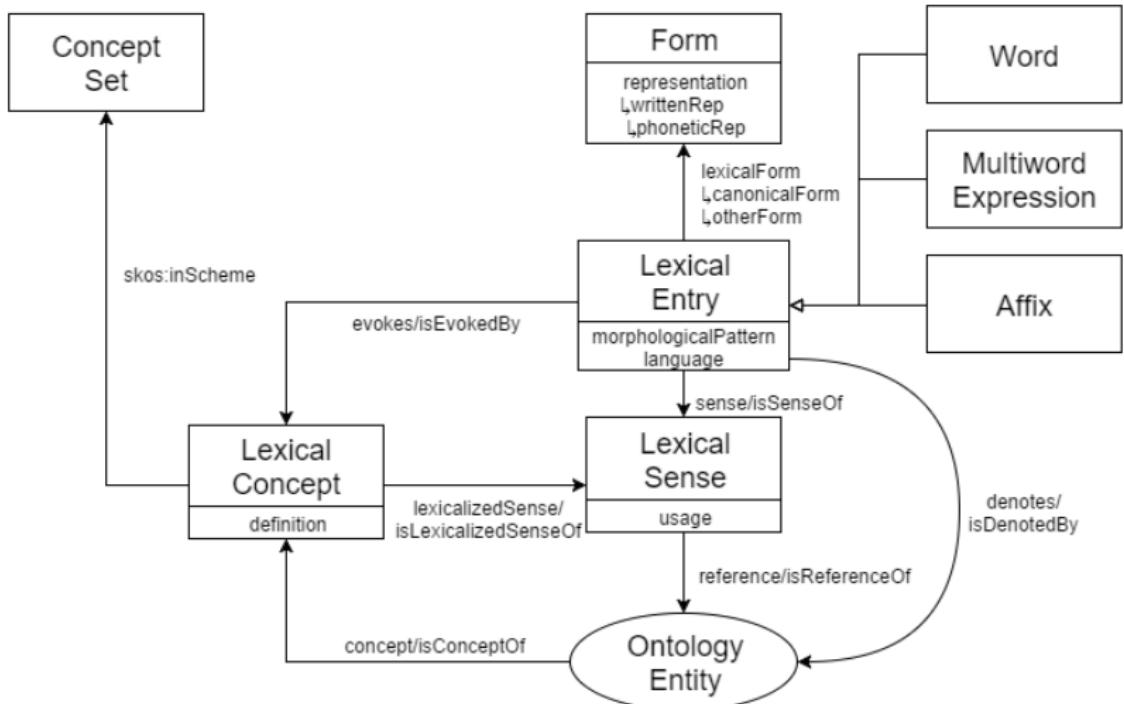


LiLa and Ontolex Lemon

A *de facto* W3C standard for publishing lexical data as LLOD



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Lemma Bank and Lexical Resources

The core of LiLa



Lemma *admiror* ‘to admire, to respect’

<http://lila-erc.eu/data/id/lemma/87541>

- ▶ Lemma Bank
- ▶ A bilingual dictionary (Lewis & Short)
- ▶ A derivational lexicon (Word Formation Latin)
- ▶ A polarity lexicon (LatinAffectus)
- ▶ An etymological dictionary (De Vaan)
- ▶ A Valency Lexicon (Latin Vallex)
- ▶ A manually checked subset of the Latin WordNet

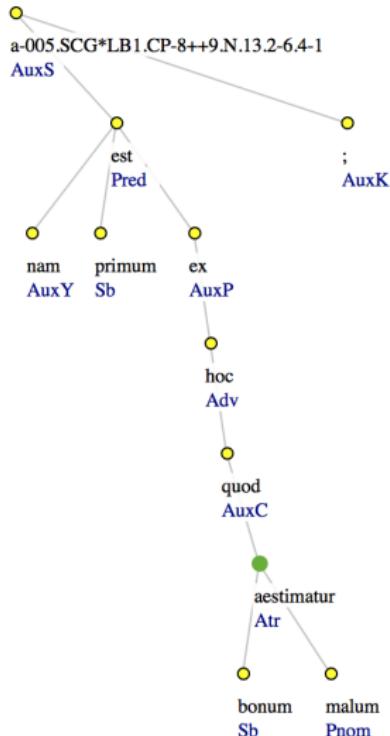
Textual Resources

Source: the *Index Thomisticus* Treebank (original scheme)



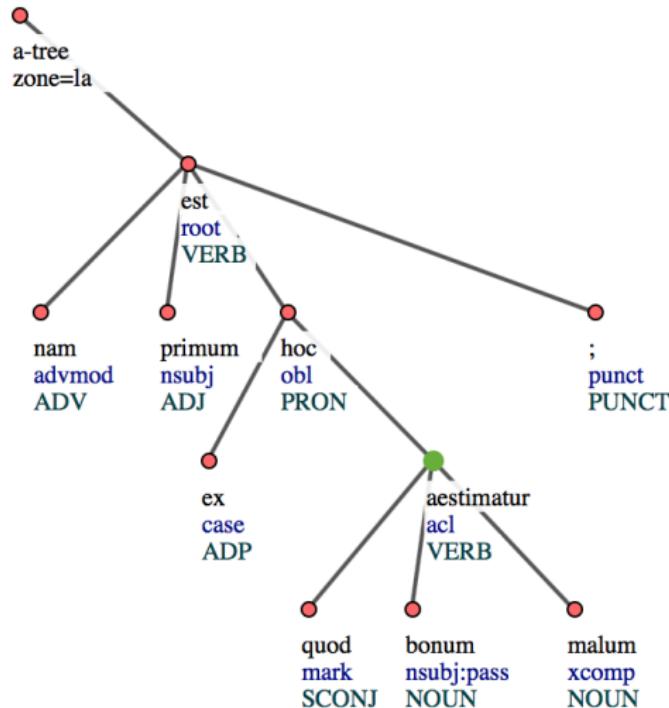
*nam primum est ex hoc
quod bonum **aestimatur**
malum; (IT-TB: SCG, lib. 1,
cap. 89, n. 13)*

*for the first arises because
the good **is judged** to be
evil; (Trans. Anton C. Pegis)*



Textual Resources

Source: the *Index Thomisticus* Treebank (UD scheme)



Textual Resources

A token from the *Index Thomisticus* Treebank in LiLa



Token *aestimatur*

[http://lila-erc.eu/lodview/data/corpora/
ITTB/id/token/005.SCG*LB1.CP-8++9.N.13.](http://lila-erc.eu/lodview/data/corpora/ITTB/id/token/005.SCG*LB1.CP-8++9.N.13.)

2-6.4-1W8

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Lemma Bank Query Interface

<https://lila-erc.eu/query/>



SPARQL Access Point

<https://lila-erc.eu/sparql/>

TextLinker

<http://lila-erc.eu:8080/LiLaTextLinker/>



LiLa Search Platform

<http://lila-erc.eu:8080/lila-lisp/>

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LiLa: Overview

Resources connected so far



Resources connected in LiLa

<https://lila-erc.eu/data-page/>

Thanks!

Get in touch



LiLa: Linking Latin

Università Cattolica del Sacro Cuore
CIRCSE Research Centre

info@lila-erc.eu

<https://github.com/CIRCSE>

<https://lila-erc.eu>

@ERC_LiLa

Largo Gemelli 1, 20123 Milan, Italy



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