Natural Language Processing for the Classics Teacher's Toolkit

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June 16, 2020

Funded by

DFG Deutsche Forschungsgemeinschaft

German Research Foundation



Outline

- Natural Language Processing
- 2 Lexical Analysis
- 3 Syntactic Analysis
 - 4 Semantic Analysis

Natural vs. Constructed Languages

	Natural	Constructed
used by	humans	machines
purpose	interaction, communication	internal processing
reasoning	joint	isolated
syntax	flexible, evolving ¹	well-defined, strict
ambiguity	is produced	is resolved

 ¹N.B.: This may vary for historical languages like Latin or Ancient Greek. Further reading. Interaction & communication: Crocker 2013; joint reasoning: Textor 2011; syntax, amibiguity: Ljunglöf et al. 2010, Palmer 2010

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C. Iulius Caesar (PROIEL): Commentarii

Corpus for the reference vocabulary

Bamberg Core Vocabulary (1276 Item \$

Take only the 500 \$ most frequent words in the reference vocabulary

Desired number of sentences

3

Intelligent choice of text passages (uncheck for all possibilities)

PROIEL: Haug et al. 2008; core vocabularies: Jones et al. 2006,

Robillard et al. 2014; Bamberg Core Vocabulary: Utz 2000;

out-of-vocabulary words: Parada et al. 2010





Highlight unknown vocabulary

Qua de causa <u>Helvetii</u> quoque reliquos Gallos virtute <u>praecedunt</u> quod <u>fere cotidianis</u> proeliis cum Germanis contendunt cum aut suis finibus eos prohibent aut ipsi in eorum finibus bellum gerunt. Apud <u>Helvetios</u> longe nobilissimus fuit et <u>ditissimus</u> Orgetorix. Is Marco Messala Marco Pisone consulibus regni <u>cupiditate</u> <u>inductus coniurationem nobilitatis</u> fecit et civitati <u>persuasit</u> ut de finibus suis cum omnibus copiis <u>exirent</u>.

Build your own vocabulary exercises...

dolore				
numerum				
sementes				
numerum				
maximas	magnum	maximum	magno	
Charle				
Check				
Check				

Ita sive casu sive consilio deorum immortalium quae pars civitatis Helvetiae insignem calamitatem populo Romano intulerat ea princeps poenam persolvit. Qua in re Caesar non solum publicas etiam privatas inturias ultus est quod eius soceri Lucii Pisonis avum Lucium Pisonem legatum Tigurini eodem proelio quo Cassium interfecerant. Hoc proelio facto reliquae socias Helvetiorum ut consequi posset pontem in Arari faciendum curat ita exercitum traducit. Helvetii repentino eius adventu commoti cum id quod ipsi diebus viginti aegerrime confecerant ut flumen transirent illum uno die fecisse intellegerent legatos ad eum mittunt. cuius legationis Divico princeps fuit qui bello Cassiano dux Helvetiorum fuerat. Is ita cum Caesare egit. pacem populus Romanus cum Helvetiis faceret in eam partem ituros ibi futuros Helvetios ubi eos Caesar constituisset esse voluisset. atque si atque sed atque	Cloze: Assign the words fro	m the pool to the correct gaps!		
calamitatem populo Romano intulerat ea princeps poenam persolvit. Qua in re Caesar non solum publicas etiam privatas inturias ultus est quod eius soceri Lucii Pisonis avum Lucium Pisonem legatum Tigurini eodem proelio quo Cassium interfecerant. Hoc proelio facto reliquas copias Helvetoirum ut consequi posset pontem in Arari faciendum curat it a exercitum traducit. Helvetii repentino eius adventu commoti cum id quod ipsi diebus viginti aegerrime confecerant ut flumen transirent illum uno die fecisse intellegerent legatos ad eum mittunt. cuius legationis Divico princeps fuit qui bello Cassiano dux Helvetorum fuerat. Is ita cum Caesare egit. pacem populus Romanus cum Helvetiis faceret in ease voluisset. atque si atque sed atque	Ita sive casu sive consilio deore	um immortalium quae pars civitatis Helvetiae insignem		
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Charle	atque si atque se	ad atque		
	Charle			
Check	Crieck			

Interactive exercises: E. C. Schmid 2010, Harecker et al. 2011; indirect learning: Röhr-Sendlmeier et al. 2012; authentic text corpora: Römer 2009; H5P interactive exercises: *H5P. Create, Share and Reuse Interactive HTML5 Content in Your Browser* 2018 Lexical Analysis

... and evaluate your students' performance!

Result Entry test:	
	5 of 11 tasks were processed correctly.
Result Vocabulary work	on text:
	8 of 8 tasks were processed correctly.
Result Exercise:	
	22 of 35 words were learned of which indicated as mastered: 9
Result Final test:	0 of 11 tasks were presented correctly
	S of Thildsks were processed correctly.



Advanced feedback: Narciss 2008

Lexical Analysis



Dataset: Schulz2020; visualized assessment: Ferguson 2012; computer-aided vocabulary learning: Crossley et al. 2010; context-based vocabulary lerning: Nation 2012

Syntactic Analysis

Keyword in Context



Keyword in context: Helm 2009; interaction syntax/semantics: Rich et al. 1991, Aijmer 2009, Rei et al. 2014, Lebani et al. 2018; development of syntactic knowledge: Farmer et al. 2011; context as multi-level interaction: Gries et al. 2013

Syntactic Analysis

Construction Frequencies



AGLDT: Bamman et al. 2011; learners expect constructions: Ellis 2008, Hahn et al. 2019; constructions attract lexemes: H.-J. Schmid et al. 2013; ANNIS corpus search tool: Krause et al. 2016

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Input: In principio erat verbum et verbum erat apud deum et deus erat verbum.

Task: Define the meaning of every word by looking at its right and left **neighbor**.

- Assign identifiers to every unique word form: In: 1, principio: 2, erat: 3, verbum: 4, et: 5, apud: 6, deum: 7, deus: 8
- Represent every word as a sequence of identifiers: In = [1,2], principio = [1,2,3], erat₁ = [2,3,4], erat₂ = [4,3,6], erat₃ = [8,3,4]
- **3** Aggregate representations of the same word form: $erat = \frac{erat_1 + erat_2 + erat_3}{3}$
- Formulate a query: What is a typical context for 'erat'? \rightarrow verbum

foundations: Harris 1954, Firth 1957; DS and common knowledge: Bruni et al. 2014; DS and morphology: Gladkova et al. 2016; DS and functional similarity: Gries et al. 2009; DS and polysemy: Hamilton et al. 2016; transformer-based DS: Devlin et al. 2018; optimal parameters for DS: Dobó 2019; limitations of DS: Grigonyte et al. 2010, Karan et al. 2012, Faruqui et al. 2016, Rogers et al. 2017

Task: Using a panegyric from late antiquity, build a word field for "veritas" (*truth*). \rightarrow

- simulatio (pretense)
- crederet (to trust)
- suggerendis (to suggest)
- excogitandum (*to contrive*)
- cohibere (to restrain)
- audaciorem (bold)



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Research on factuality: Cordes 2020

Books may not be **tailored** to your specific context, so you need to create new materials. NLP helps you do this!

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For students, it is certainly not trivial. Besides, the algorithm ensures that the solution is **empirically grounded** in the target text.

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"The underlying algorithm is a **black box**. We do not know how it works!"

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"The underlying algorithm is a **black box**. We do not know how it works!"

⁹⁹⁹ True, but that is a **research** problem, not an educational one. In school, it is more important that the materials are suitable for a specific learning context.

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Task: Find contexts where factuality is discussed.

haec pro imperatore nostro in quae 5 sint uerba suscepta ope1 ae pretium est adnotare : rsi bene rem publicam et ex utilitate omnium * * ' digna uota quae semper suscipiantur semper -que soluantur .

ut haec esse uera credamus quae mendaciis uatum in plausus aptata cauearum .

merito necne, neutram in partem decernere audeamus, quia nec fas est affirmationi tuae derogare et onerosum confiteri uera esse quae de nobis, praesertim tam magnifica, dixisti.

scis enim uhi uera principis, ubi sempiterna sit gloria.

quae perpetuae et constantis benit1olentiae prima fiducia est, certissima ui1-tut11m et max.ima principis, 11eritas, numquam in animo esse suspicacem te audiui.

dico enim magna certa -que fiducia : digna est hac quoque glo1 ia uestra pietas , et potest eam praestare felicitas .

o tego properationem militum iuui, ego fugam hostium praepediui, ego Maximt1m in muros coegi et quem uos cogebatis mori uiuum domino reseruaui': non uideo quod possit esse iudicium quin , cum ista pars imputet tyranni fugam, illa custotiam, res publica

20 legii religionem uererer, si is, qui semper 1-es a numine tuo gestas praedicare solitus esseni , haec tanto maiora pristinis silentio praeterirem, per quae non pars aliqua seruata, sed uniuersa sibi est res publica

reque enim parui negotii est imperatorem toitus or bis pro se peculiariter rogare, sub tantae maiestatis aspectu perfricare frontem, uultum componere, 20 confirmare animum, uerba conci pere, intracidante i dorer, apte decimere, expectarer responsum.

quibus enim m11neribus aequari 20 haec cura principis , haec patientia potest , qua meruisti ut ille sibi nimium fortis ac p1-ope durus uideretur ?

est enim haec demum uera felicitas ao

hace set uera pietas , hace uoluptas conseruandi generis humani , exemplum dare gentibus ad matrimonia studiosius expetenda et liberos educandos , ut substituendis so successionibus singulorum nihi losbit unumquemque esse mortalem , cum immortalis sit omnium posteritate res publica .

etenim cetterae uirfutes et bona cettera processu aetatis eueniunt, fortitudo a.nnis accedentibus roboratur, continentia disciplinae praeceptis traditur, iustilita conditio- ne luris addiscitur, 6 ipsa denique illa quae uidetur rerum omnium domina esse sapientia perspectis homin11m moribus et exploratis rerum docetur euentis : solae cum nascentibus parter oriuntur pietas atque felicitas ; naturalia sunt emi animorum bona et praemia fatorum.

ibi adulescentes optimi discant, nobis quasi sollemne carmen praefantibus, maximorum principun1 facta celebrare (quis enim melior usus est eloquentiae ?

neque enim fabula est de licentia poetarum nec opinio de fama ueterum saeculorum , sed manifesta res et probata, 20 sicut hodie -que testatur Herculis ara maxima et Herculei sacri custos familia Pinaria , principem illum tui generis ac nominis Pallantea moenia adisse ui

magnus uterque honor uester, sit1e eosdem maxime diligit quos scit uobis esse carissimos siue illis neminem praef ert, quamuis aliquem magis amet; proposita sunt senioribus p1-aemia, i juuenibit1s exempla: adaent, 20 frequenterta escuras tandem ac patentes domos: quisquisquis probatos senatui uinos suspicit, hi tons suspicit, hi tons

etenim ut nomj-ne Augusti admonemur eius cui primum dicatum est, ita haec optimi appellatio numquam memoriae l1ominum sine te recurret, quotiensque posteri nostri optimum aliquem uocare cogentur, so totiens recordabuntur quis me1-uerti uocari.

Context and acquisition of word meaning: Webb 2008

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Semantic Analysis



Source: Ochab et al. 2019, p.141; effects of text length and topic in stylometry: Golcher et al. 2011

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Take Home Message

NLP can ...

- improve and assess your students' vocabulary knowledge
- **visualize** syntactic structures to help students break down complex sentences
- retrieve relevant text passages for a given topic

NLP cannot (yet) ...

- provide advanced feedback beyond 'correct/incorrect'
- reliably discover syntactic structures all by itself
- pin down ambiguous contexts to a specific meaning

Useful resources

- interactive exercises: H5P
- Latin vocabulary exercises: Machina Callida
- visualization for linguistic annotations: CONLLU Viewer
- annotated ancient texts: AGLDT & PROIEL
- corpus search and visualization: ANNIS

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