

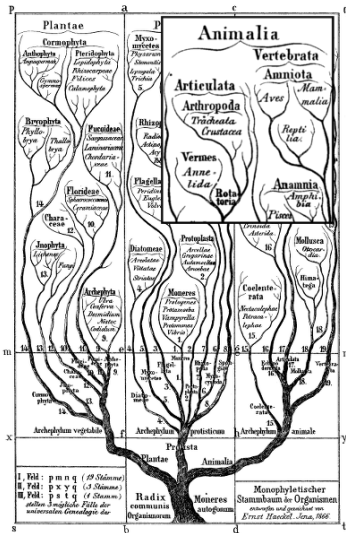
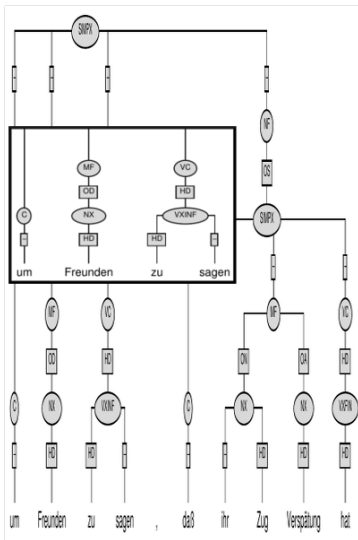
# SyPhy

## A Phylosyntactic Approach to Model the Evolution of Indo European Languages (Mid Term Presentation)

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left: phrase structure tree from the Tüba-D/Z corpus (Telljohann et al. 2012)  
 right: one of the first monophyletic tree of life from Haeckel 1866

## ① Materials and Research Questions

Corpora

Research Questions

## ② Approaches and Methods

Data Preparation

Analyses

## ③ Outlook

## ④ Contribution to (Humanities) Research

- several syntax-annotated corpora will be used
- part-of-speech classifications for token and analyses of syntax structure of the sentences
- focus on corpora adopting the constituency/phrase structure paradigm for syntax analyses for now

Name	Language	Size	License
YTH-PC-OEP <sup>1</sup>	Old English	1,5 mio. token	prop.; non-comercial
TüBa-D/Z	German	1,5 mio. token	prop.; academic research
CINTIL	Portugese	110,000 token	prop.; academic resarch
French Treebank	French	1 mio. token	prop; academic research
IcePaHC <sup>2</sup>	Icelandic	1 mio. words	LGPL

<sup>1</sup>The York-Toronto-Helsinki Parsed Corpus of Old English prose

<sup>2</sup>Icelandic Parsed Historical Corpus

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- ③ Will phylo-syntactic analyses yield genealogical trees for the IE languages in agreement with trees previously obtained using other methods?

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Computational methods inspired by life sciences are interesting.

A combination of both = really cool topic



- phylolinguistic analyses can help to further the understanding of early human history
  - ⇒ results can confirm or falsify hypotheses drawn from archeologic evidence, evolutionary anthropology and historical linguistics
  - ⇒ Gray and Atkinson 2003: phylolinguistic analysis of IE languages supports the Anatolian farmer hypothesis
  - ⇒ approach was based on lexical properties of the IE languages; additional phylosyntactic analyses for the IE family could in turn confirm or falsify Gray & Atkinson's investigations

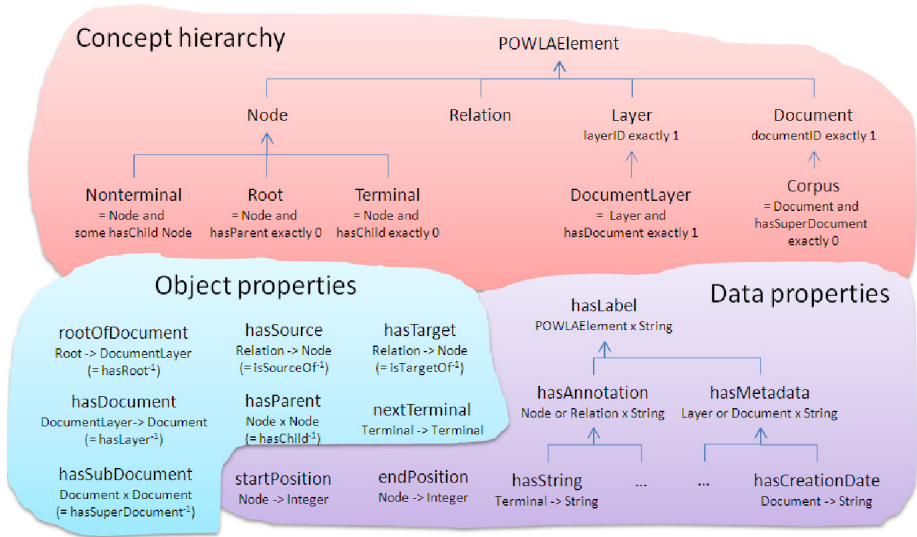
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- application of phylogenetic methods already help answering philological questions on text heritage
  - ⇒ Barbrook et al. 1998: phylogenetic analyses of 58 manuscripts of a Canterbury Tales story indicate distinct ancestry for groups of these manuscripts
  - ⇒ activities in SyPhy help building up experience for possibly more syntactically informed phylolinguistic analyses



- search: query of the Clarin VLO (Uytvanck et al. 2010), the Oxford Text Archive and Google, hints by colleagues
- search criteria: Indo European language, syntax annotations (preferably at least manually revised and using constituency/phrase grammar model)
- itemization of corpora with relevant properties:  
size, annotation method, syntax model (dependency vs. constituents)  
accessibility/licensing, format of corpus data

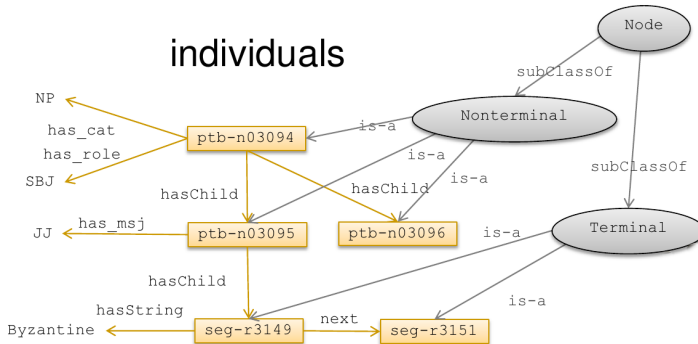
- adoption of approach by Chiarcos 2012: POWLA
- representation of corpus data in RDF

# Data Preparation - Data Integration

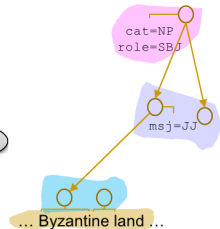


overview for POWLA Top ontology (Chiarcos 2012)

## individuals



## original



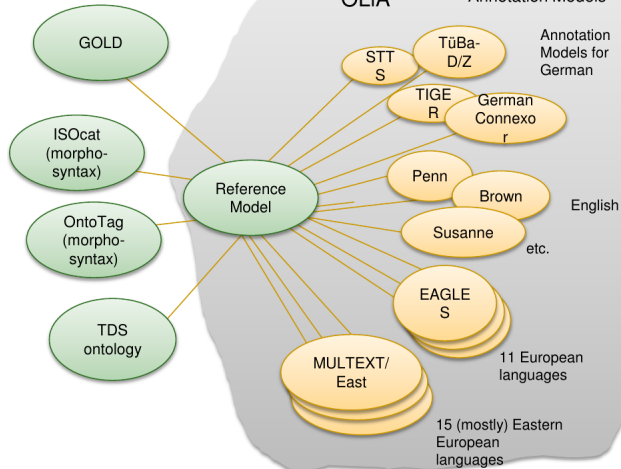
example for linguistic annotations in POWLA (Chiarcos 2012)

- adoption of approach by Chiarcos 2012: POWLA
- representation of corpus data in RDF
- use unifying domain ontology: OLiA (Ontology for Linguistic Annotations, Chiarcos 2008)
- unification/linking of different denotations for part of speech and constituent types via OLiA link ontologies (provided for some corpus formats, will be created by ourselves for others)



# Data Preparation - Data Integration

external Reference Models  
(Terminology Repositories)



import relations and usage of OLiA (Chiarcos 2008)

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**Result:** language data with annotations...

...in unified data format

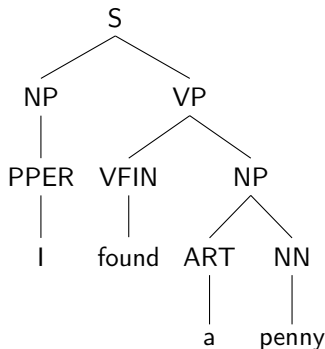
...that are conceptually interoperable (for constituency and POS)

...accessible using a single set of technologies

(SPARQL queries; RDF APIs; Gremlin via SAIL, ...)

- extract syntactic features for each language from the corpora (frequencies syntax tree paths or patterns, pos ngrams, ...)
- evaluate distinctiveness and applicability of extracted feature in a language classification setting  $\Rightarrow$  feature selection
- use resulting feature matrix for phylogenetic analysis
- re-iterations after error analyses or additions of further data sources

# Analyses - Extracting Syntax Features



syntax tree paths:

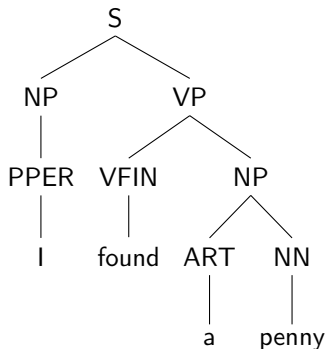
S-NP-PPER

S-VP-VFIN

S-VP-NP-ART

S-VP-NP-NN

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subtree patterns:

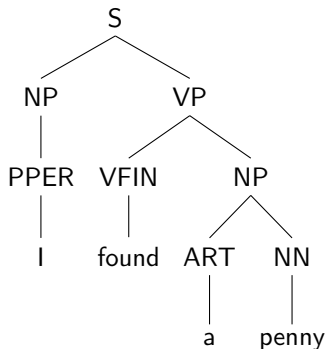
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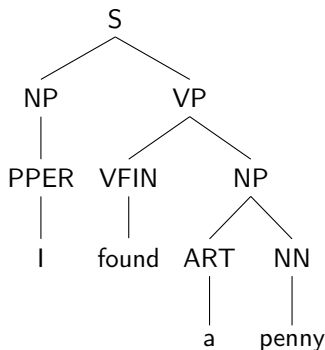
part of speech bigrams:

\$-PPER, PPER-VFIN,  
VFIN-ART, ART-NN,  
NN-\$

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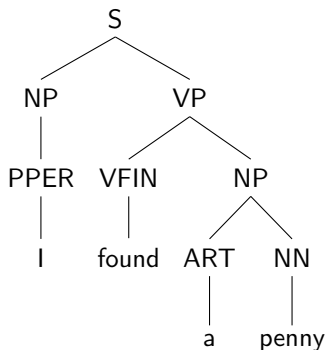
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S > NP, VP  
NP > PPER  
NP > ART, NN  
VP > VFIN, NP

dominated POS-seqs:

S :> PPER,VFIN,ART,NN  
VP :> VFIN, ART, NN  
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**for each sentence:** count occurrence count for each feature and compute a feature score adapting the tf/idf idea

**for each corpus:** compute the mean feature vector over all sentences in the corpus to obtain a feature vector for the language as a whole



# Analyses - Feature Evaluation and Feature Selection

- initially we will have a huge feature space, but limited example sentences to learn from
    - ⇒ bias/variance problem likely
  - whole feature classes or single feature manifestations will probably be uninformative, yielding more 'noise' than distinctive information
    - hence: evaluate feature for their usefulness in the simpler setting of language classification before starting phylogenetic analyses
- ⇒ train log. regression classifiers with the syntax features applying Ridge regularisation
- ⇒ evaluate aptitude of possible feature subsets by measuring overlap of clustering results with actual language groups; use soft computing optimization (GA, PSO) to find (semi-)optimal feature subsets

**phylogenetic analysis:** generate an ancestral tree representing a hypothesis about the lineages of a group of species or genes based on agreement and differences in their characteristics

	<b>(classic) analysis</b>	<b>phylogenetic</b>	<b>phylosyntactic analysis</b>
taxa	species, genomes	phenotypes,	languages, texts, text groups
characteristics	physiological traits, abilities, behaviour patterns, amino acid sequences...		tree structures, POS se- quences, dominance rela- tions...
causes for mod.	changes in habitat, contact with new species, mutation, ...		interaction with other cul- tures, discovery of new knowledge/technologies, new social structures, ...

- several established methods to compute phylogenetic trees

**distance matrix methods (DM):** relies on explicitly provided distance measurements between the taxa and applies specialised clustering methods to devise a tree

- + direct control on distance estimation, fast (polynomial time)
- constant change rate assumption to produce trees with ancestry relationships

**maximum parsimony (MP):** search for potential phylogenetic trees explaining the data with a minimal number of evolutionary events (divergences, convergences, parallel evolutions)

- + in agreement with Okham's razor (Parsimonieprinzip)
- computationally extensive (NP hard), heuristics required

**maximum likelihood (ML):** infers a probability distribution for possible tree according to the data (more evolutionary events in a tree make it less likely)

- + inherent MP-like effect, but more flexible (no constant rate assumptions needed)
- computationally expensive, appropriate change model required

the next weeks: importers/converters from corpora to RDF/OWL; create and apply linking ontologies

at the end of the Vorlesungszeit: preliminary answers to questions (1) and (2) based on a language subset from 3-4 corpora

at the end of the semester: answer to question (3); refined answers to (1) and (2) based on 2-3 additional languages

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- possibilities for extension: integration of additional constituency based corpora; development of methods that allow also for dependency parsed corpora; try out additional syntax features; investigate influences of the phylogenetic computation methods and their parameters
- possibilities for reduction: integration of fewer corpora; test less syntactic features; just use DM method for tree computation

## methodological advancement

- additional insight in the advantages and limitations of characterising texts or languages by their syntactic characteristics for phylolinguistic analyses
- indication which kind of syntactic fingerprinting is most useful for studies on the ancestry of languages

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## contribution to Humanities

- additional support or falsification on an disputed aspect of the development of the IE language family
- methodoligal experiences and results will be (at least partially) transferable to pyhlosyntactic approaches for authorship attribution and stylometry (for syntax-analysed material)  $\Rightarrow$  ground work for *PhyloPhilology*?
- integrated RDF meta-corpus will be made publicly available to the extend permissible by the licenses  $\Rightarrow$  contribution to the Linked Linguistic Data Cloud

- [1] Adrian C. Barbrook et al. “The phylogeny of The Canterbury Tales”. In: Nature 394 (Aug. 1998), pp. 839–846.
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- [4] Russell D. Gray and Quentin D. Atkinson. “Language-tree divergence times support the Anatolian theory of Indo-European origin”. In: Nature 426 (Feb. 2003), pp. 435–439.
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