

#### Feb 12, 2021 OntoLex-FrAC

Frequency, Attestations, Corpus Information

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- a.Corpus-based lexicography
  - i. Frequency, corpus links, "word sketches" (similarity and collocation analysis)
- b.Lexical data for Natural Language Processing
  - i. Frequency, dictionary links, similarity and collocation analysis, sense embeddings

### Requirements

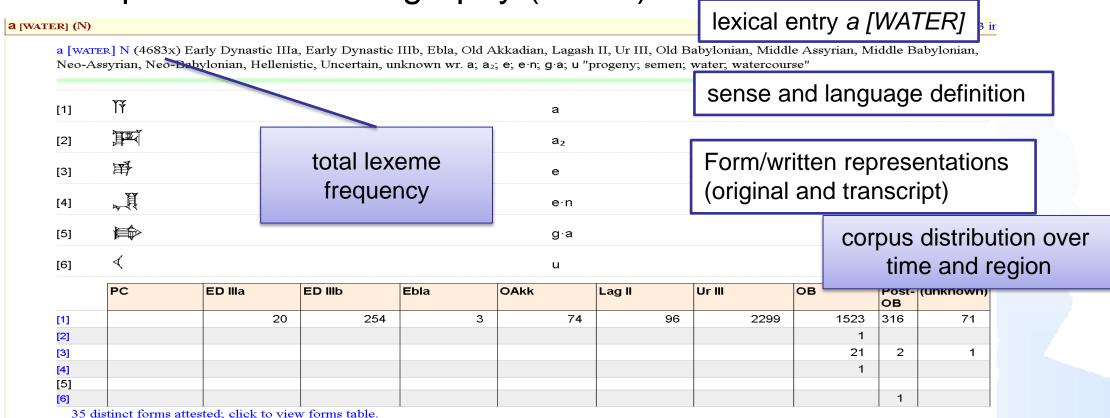
- representation of frequency information
  - corpus-based lexicography (Electronic Penn Sumerian Dictionary, ePSD)

		x) Early Dynastic IIIa Babylonian, Hellenis							iiddle B	abyloı
[1]	Υ¥				а					
[2]					a <sub>2</sub>					
[3]	鬥				е					
[4]	, I					e·n				
[5]		g⋅a								
[6]	√ u									
	PC	ED IIIa	ED IIIb	Ebla	OAkk	Lag II	Ur III	ОВ	Post- OB	(unkn
[1]		20	254	3	74	96	2299	1523	316	
[2]								1		
[3]								21	2	
[4]								1		
[5]										

#### Requirements

representation of frequency information

– corpus-based lexicography (ePSD)



- representation of frequency information
  - corpus-based lexicography
  - frequency dictionaries (e.g., stop word lists for NLP)
  - attestations
    - in dictionaries: real-world examples that illustrate a particular lexical entry, a lexical form, a sense or a concept

```
probatio , onis, f. [probo] .

I. A trying , proving; a trial , inspection , examination (class.):
athletarum probatio, Cic. Off. 1, 40, 144 : futura, id. Verr. 2, 1, 54, §
142; Varr. R. R. 1, 20, 1: oesypi, Plin. 29, 2, 10, § 36 : croci sinceri,
id. 21, 6, 17, § 32 : pumicis, id. 36, 21, 42, § 155 : gemmae recusan
limae probationem, id. 37, 13, 76, § 200 : equitum, a review , Val.

Max. 2, 2, 9 .--

Latin, Lewis & Short,
http://www.inrebus.com/latindictionary.php
```

- representation of frequency information
  - corpus-based lexicography
  - frequency dictionaries (e.g., stop word lists for NLP)
  - attestations
    - in dictionaries: real-world examples that illustrate a particular lexical entry, a lexical form, a sense or a concept
    - more generally: any link from a lexical resource into a corpus

- representation of frequency information
  - corpus-based lexicography
  - frequency dictionaries (e.g., stop word lists for NLP)
  - attestations
  - corpus data
    - similarity clusters (NLP: Brown clusters)
    - similarity metrics (in lexicography or NLP)
    - collocations (=> lexicographical similarity metrics)
    - embeddings (=> NLP similarity metrics)
    - multimodality (what about data other than text?)

### Progress since October 2018

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#### OntoLex-FrAC

- Draft and samples on GitHub
  - https://github.com/ontolex/frequency-attestation-corpusinformation
- Core classes
- Frequency
- Attestation
- Embeddings



#### General structure

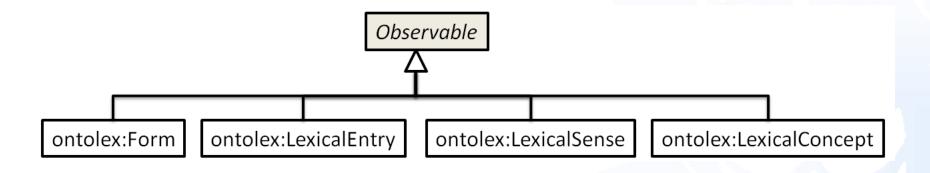




- FrAC aims at complementing lexical data with all relevant kinds of information drawn from a corpus
  - A corpus is any kind of collection of external data
  - It does not have to be a digital corpus or an annotated corpus
  - Any external data sample qualifies as a corpus

- FrAC aims at complementing lexical data with all relevant kinds of information drawn from a corpus
- The information that is extracted must be about an entity that can be observed or detected in a corpus
  - It does not have to be in there, but if it is, we must be able to observe it
  - frac:Observable
    - includes all elements of OntoLex core (entry, sense, form, concept)
    - can be applied to elements of any ontology (ontolex:reference)
    - can be extended to other entities (morph?)

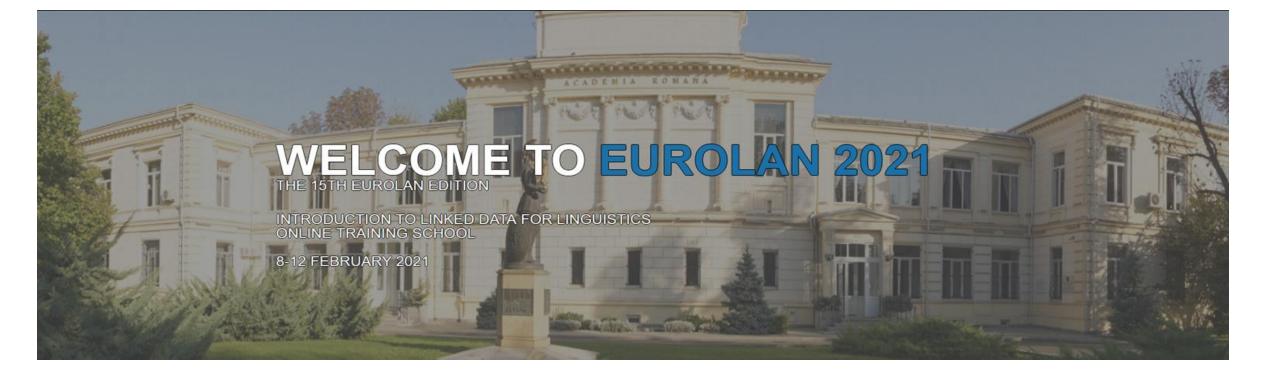
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- FrAC aims at complementing lexical data with all relevant kinds of information drawn from a corpus
- The information that is extracted must be about an entity that can be observed or detected in a corpus
  - frac:Observable
- Every type of observation is a separate class, linked with a designated property

```
frac:Observable => ontolex:frequency => ontolex:CorpusFrequency frac:Observable => ontolex:attestation => ontolex:Attestation
```

frac:Observable => ontolex:embedding => ontolex:Embedding



Observable frequency CorpusFrequency corpus Corpus rdf:value: int total: int



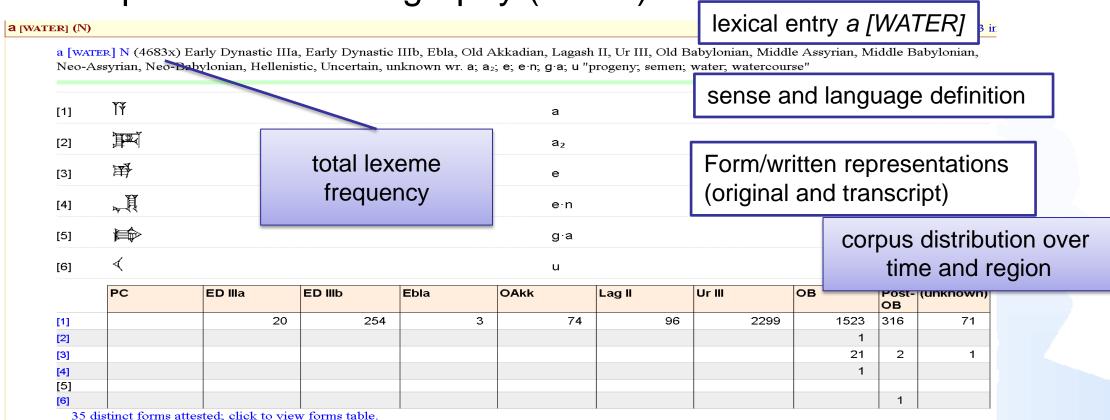


a [WATER] (N) 4683 ir. a [WATER] N (4683x) Early Dynastic IIIa, Early Dynastic IIIb, Ebla, Old Akkadian, Lagash II, Ur III, Old Babylonian, Middle Assyrian, Middle Babylonian, Neo-Assyrian, Neo-Babylonian, Hellenistic, Uncertain, unknown wr. a; a₂; e; e·n; g·a; u "progeny; semen; water, watercourse" [1] а [2]  $a_2$ Ħ [3] е ĮĮ. [4] e∙n [5] g a [6] u РС ED IIIa ОВ ED IIIb Ebla OAkk Lag II Ur III Post- (unknown) 254 20 3 74 96 2299 1523 316 71 [1] [2] [3] 21 2 [4] 1 [5]

35 distinct forms attested; click to view forms table.

representation of frequency information

– corpus-based lexicography (ePSD)



CorpusFrequency (Class) provides the absolute number of attestations (rdf:value) of a particular frac:Observable in a particular language resource (frac:corpus).

SubClassOf: rdf:value exactly 1 xsd:int, frac:corpus exactly 1

frequency (ObjectProperty) assigns a particular frac:Observable a frac:CorpusFrequency.

Domain frac:CorpusFrequency

Range frac:Observable

Corpus (Class) represents any type of linguistic data or collection thereof, in structured or unstructured format. At the lexical level, a corpus consists of individual elements (tokens, 'words'), and data providers should provide the total number of elements. It should also provide provenance information, e.g., the tokenization strategy, preprocessing steps, etc.

SubClassOf: frac:total exactly 1 xsd:int

corpus (Property) assigns a corpus to a particular frac:CorpusFrequency.

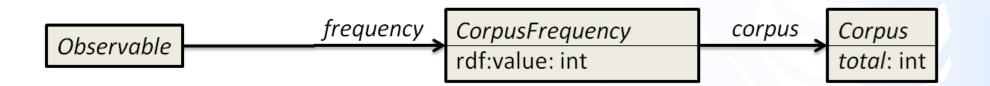
Domain: frac:CorpusFrequency

Range: frac:Corpus

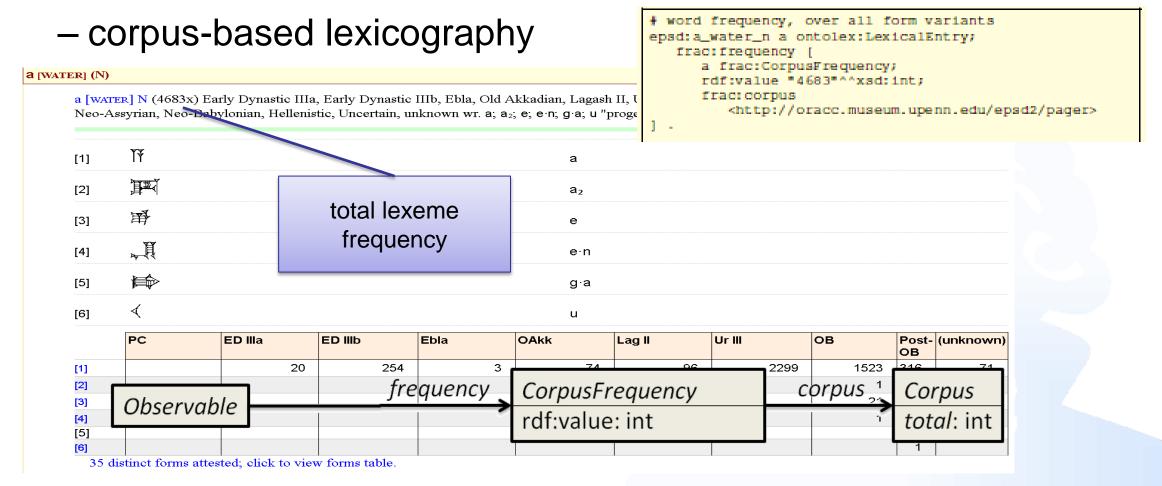
total (Property) assigns a corpus the total number of elements that it contains. In the context of OntoLex, these are instantiations of lexemes, only, i.e., tokens ('words').

Domain: frac:Corpus

Range: integer (long)



representation of frequency information

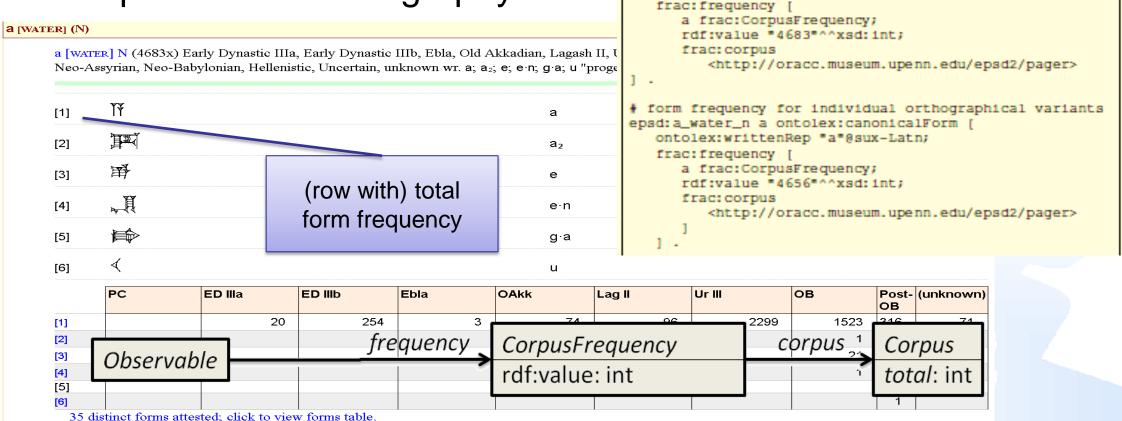


# word frequency, over all form variants

epsd:a\_water\_n a ontolex:LexicalEntry;

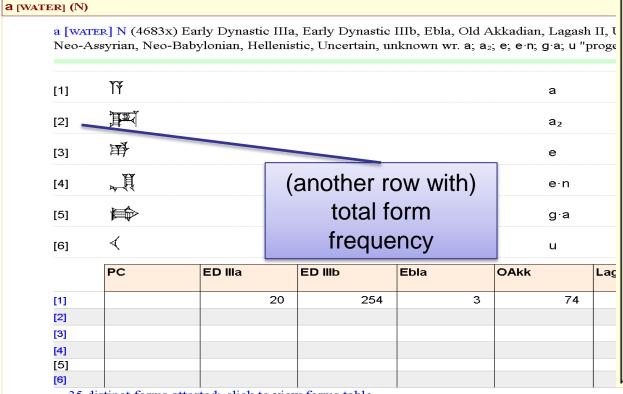
representation of frequency information

corpus-based lexicography



representation of frequency information

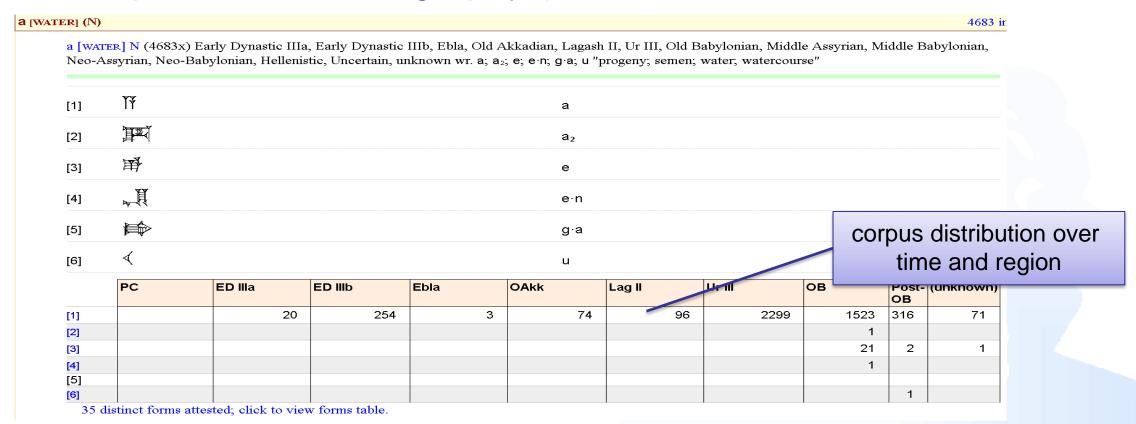
corpus-based lexicography



```
# word frequency, over all form variants
epsd:a_water_n a ontolex:LexicalEntry;
   frac:frequency [
      a frac:CorpusFrequency;
      rdf:value "4683"^^xsd:int;
      frac: corpus
         <http://oracc.museum.upenn.edu/epsd2/pager>
# form frequency for individual orthographical variants
epsd:a_water_n a ontolex:canonicalForm [
   ontolex:writtenRep "a"@sux-Latn;
   frac:frequency [
      a frac:CorpusFrequency;
      rdf:value "4656"^^xsd:int;
      frac: corpus
         <http://oracc.museum.upenn.edu/epsd2/pager>
epsd:a_water_n a ontolex:otherForm [
   ontolex:writtenRep "a2"@sux-Latn;
   frac:frequency |
      a frac:CorpusFrequency;
      rdf:value "l"^^xsd:int;
      frac: corpus
         <http://oracc.museum.upenn.edu/epsd2/pager>
```

### frac:frequency: metadata

- representation of frequency information
  - corpus-based lexicography (ePSD)

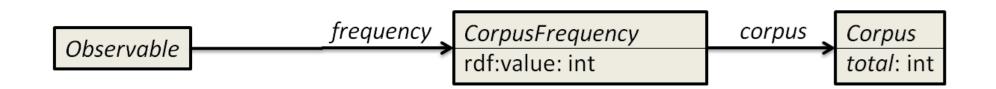


### frac:frequency: metadata

- adding provenance
  - can be expressed on every individual frequency object
  - but can also be inherited from a corpus-specific subclass of frequency
  - we recommend the latter

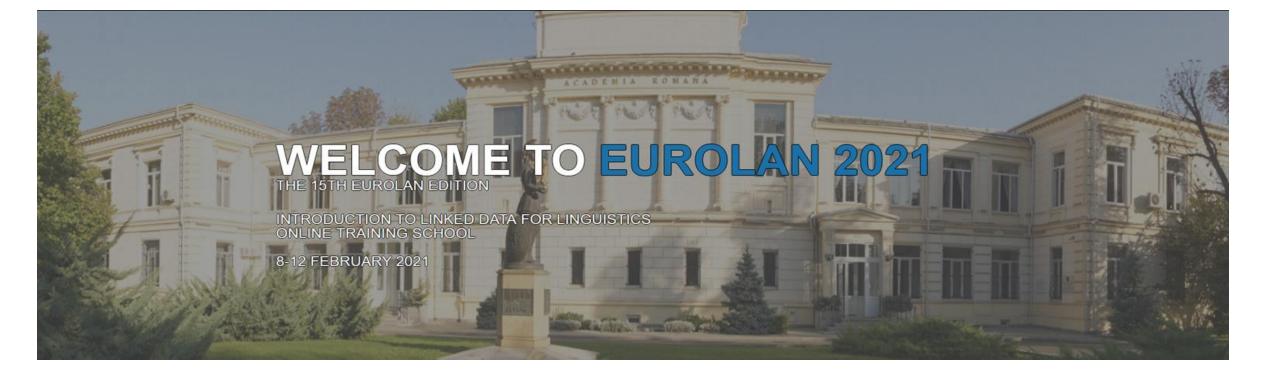
```
# EPSD frequency for the Ur-III period (aat:300019910)
:EPSDFrequency_UrIII
    rdfs:subClassOf :EPSDFrequency;
    rdfs:subClassOf [
        a owl:Restriction ;
        owl:onProperty dct:temporal ;
        owl:hasValue aat:300019910
    ] .

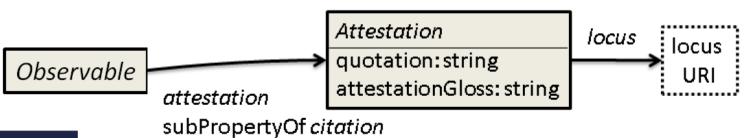
# frequency assessment for sub-corpus
epsd:a_water_n frac:frequency [
    a :EPSDFrequency_UrIII;
    rdf:value "2299"^^xsd:int
].
```



#### Limitations:

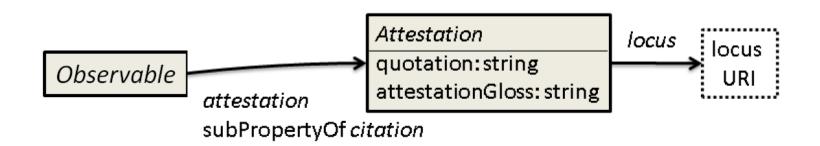
- At the moment, we represent absolute frequencies only
- For relative frequencies, use the frac:total property of the frac:Corpus class
  - except for being able to have a frac:total, frac:Corpus is undefined











frac:Attestation class represents an exact or normalized quotation or excerpt from a source document that illustrates a particular form, sense, lexeme or features such as spelling variation, morphology, syntax, collocation, register.

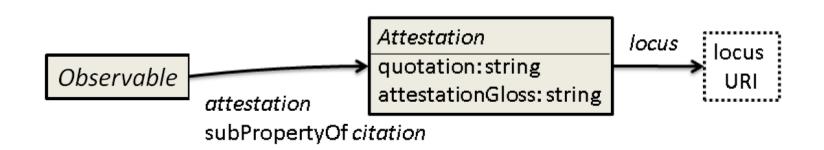
frac:citation (domain: frac:Observable) Associates a citation to the frac:Observable citing it.

frac:attestation (domain: frac:Observable, range: frac:Attestation) Associates an attestation to the frac:Observable. This is a subproperty of frac:citation using it as evidence. frac:quotation (range: xs:String) This contains the text content of the dictionary quotation.

frac:attestationGloss (domain: frac:Attestation, range: xs:String) This contains the text content of an attestation as represented within a dictionary. This may be different from a direct quotation because the target expression may be omitted or normalized.

frac:locus (domain: frac:Attestation) points to the location at which the relevant word(s) can be found.

Note: object of locus *can* be a corpus, but does not have to be



probatio, onis, f. [probo].

I. A trying, proving; a trial, inspection, examination (class.): athletarum probatio, Cic. Off. 1, 40, 144: futura, id. Verr. 2, 1, 54, § 142; Varr. R. R. 1, 20, 1: oesypi, Plin. 29, 2, 10, § 36: croci sinceri, id. 21, 6, 17, § 32: pumicis, id. 36, 21, 42, § 155: gemmae recusan limae probationem, id. 37, 13, 76, § 200: equitum, a review, Val. Max. 2, 2, 9.—

II. In partic.

Observable: lexical sense (here)
Attestation:

- quotation: athletarum probatio
- here: a citation
  - bibliographical metadata can be attached to Attestation
- locus:

http://www.perseus.tufts.edu/hop per/text?doc=Perseus%3Atext%3 A2007.01.0047%3Abook%3D1% 3Asection%3D40

### Beyond FrAC

- how to identify an element in a corpus?
  - fragment URIs for different media types, e.g., plain text URIs for strings (etc.)
  - NLP Interchange Format (NIF)

String URIs plus contexts

Web Annotation (WA)

- selectors for various formats; can be extended
- NIF and Web Annotation are partially compatible with each other

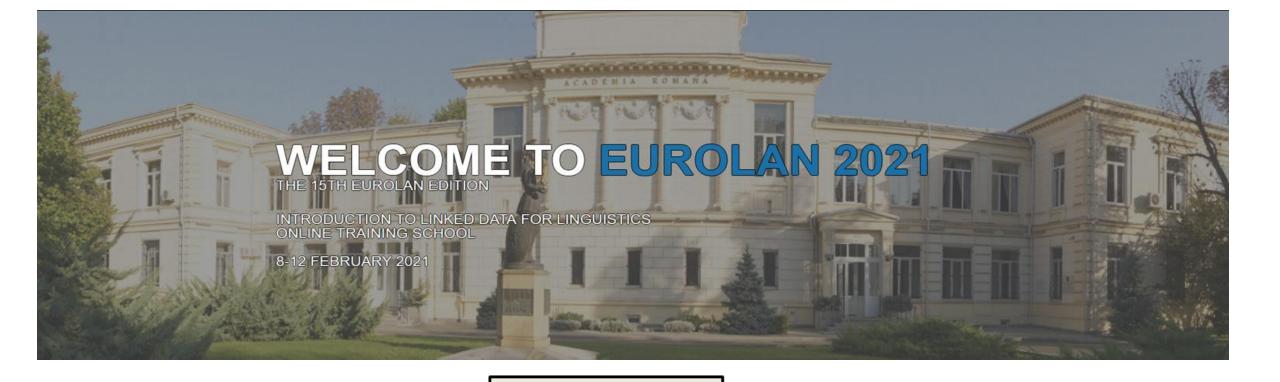
=> working on synergies (<a href="https://ld4lt.github.io/linguistic-annotation/">https://ld4lt.github.io/linguistic-annotation/</a>)

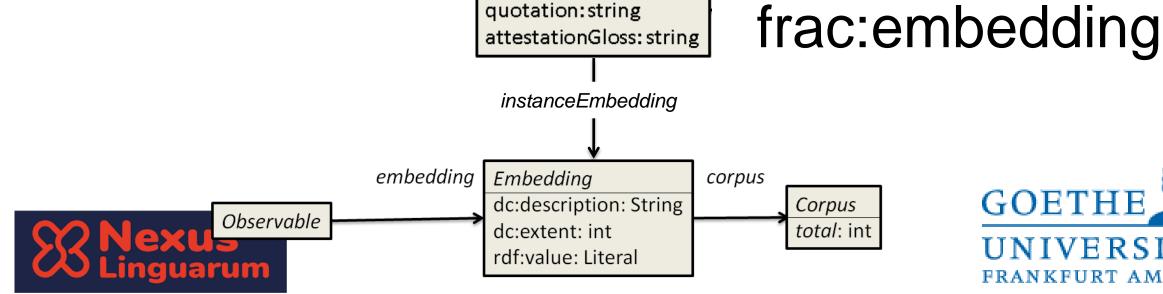
- how to model bibliographical data
  - as part of a citation
  - multiple ontologies are being applied
  - scope of that question is much more general than adequate for an OntoLex module

DiaMaNT (Diachroon seMAntisch lexicon van de Nederlandse Taal)

- diachronic semantic computational lexicon of Dutch
- under development at the Instituut voor de Nederlandse Taal (Dutch Language Institute)
- lexicon modelled using OntoLex
  - attestations => FrAC
  - corpus links => NIF
  - citations => CITO/FRBR
    - Functional Requirements for Bibliographic Records https://vocab.org/frbr/core
    - Citation Typing Ontology http://purl.org/spar/cito

```
diamant:entry_WNT_M030758 a ontolex:LexicalEntry;
 ontolex:sense diamant:sense WNT M030758 bet 207 .
diamant:sense_WNT_M030758_bet_207 a ontolex:LexicalSense;
 rdfs:label "V.-" ;
 frac:attestation diamant:attestation_2108540 ;
 skos:definition "Iemand een kat (of de kat)
                  aan het been jagen .... iemand
                  in moeilijkheden brengen." .
diamant:attestation_2108540 a frac:Attestation
 cito:hasCitedEntity diamant:cited_document_WNT_332819
 cito:hasCitingEntity diamant:sense_WNT_M030758_bet_207
 fracilocus diamantilocus 2108540 ;
 frac:quotation "... dat men licht yemant de cat
              aen het been kan werpen, " .
  amant:locus 2108540 a diamant:Occurrence
 nif:beginIndex 107;
                                              NIF
 nif:endIndex 110 .
 amant:cited document WNT 332819
 frbr:Manifestation ;
 frbr:embodimentOf diamant:expression_WNT_332819 ;
 diamant:witnessYearFrom 1621;
 diamant:witnessYearTo 1621 .
diamant:expression_WNT_332819 a frbr:Expression ;
 dcterms:creator "N. V. REIGERSB."
 dcterms:title "Brieven van Nicolaes
            van Reigersberch aan Hugo de Groot*;
 frbr:embodiment diamant:quotation_WNT_332819 .
```





Attestation

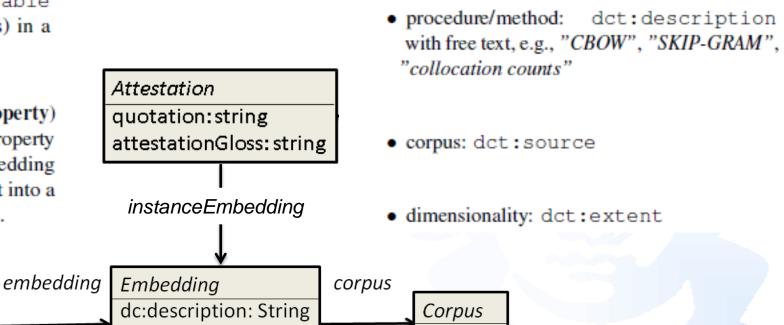


embedding (ObjectProperty) is a relation that maps an Observable into a numerical feature space. An embedding is a structure-preserving mapping in the sense that it encodes and preserves contextual features of a particular Observable (or, an aggregation over all its attestations) in a particular corpus.

#### instanceEmbedding (ObjectProperty)

For a given attestation, the property instanceEmbedding provides an embedding of the example in its current corpus context into a numerical feature space (see Embedding).

Observable



dc:extent: int

rdf:value: Literal

min 1

Embedding (Class) is a representation of a given Observable in a numerical feature space.

It is defined by the methodology used for creating it dct:description), the URI of the corpus or language resource from which it was created (corpus). The literal value of an Embedding is

Embedding  $\sqsubseteq$  rdf:value exactly 1  $\sqcap$ 

corpus exactly 1 □ dct:description

provided by rdf:value).

total: int

- originally, we thought about embeddings in the NLP sense
  - Word Embeddings (GloVe, Word2Vec) => Form
  - Lemma Embeddings (-"-) => LexicalEntry
  - Sense Embeddings (AutoExtend) => LexicalSense
  - Concept Embeddings (-"-) => LexicalConcept
    - for word embeddings, RDF modelling is just unnecessary
    - for sense and concept embeddings, it can be very helpful to bundle embeddings together with the lexical graph that define them

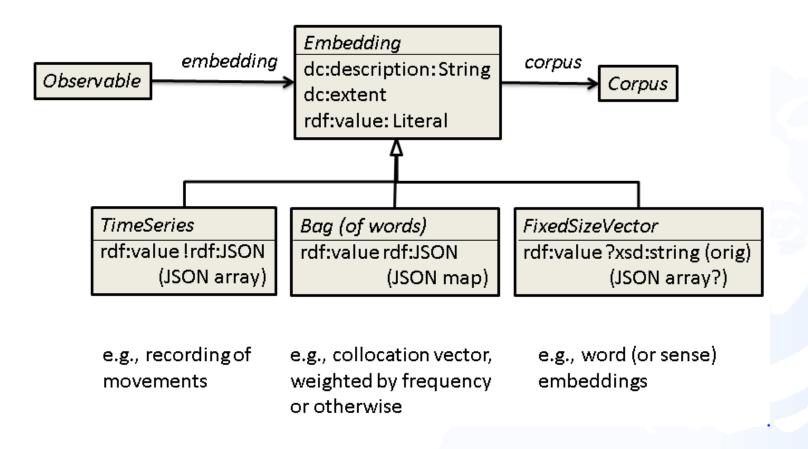
anecdotal evidence: the original AutoExtend embeddings (Rothe & Schütze 2015) came without metadata, and for 5 years, nobody realized that they were pointing to the wrong WordNet version (... and nobody published any experiments over them)

- note that NLP embeddings (word/sense/etc. vectors) belong to a larger group of data structures with similar uses
  - uses: similarity metrics (e.g., cosine distance) & clustering
  - 1. NLP embeddings: fixed size vector
    - fixed-size vectors, mapping positions to numerical scores
    - needed for NLP and computational lexicography

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  - 1. NLP embeddings: fixed size vector
    - fixed-size vectors, mapping positions to numerical scores
  - 2. collocation lists (bag of words): weighted multiset
    - infinite-size hashtable, mapping collocates to numerical scores
    - needed for computational lexicography and corpus linguistics

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  - 2. collocation lists (bag of words): weighted multiset
    - infinite-size hashtable, mapping collocates to numerical scores
  - 3. time series: sequences of a fixed number of observations
    - infinite-size sequence of fixed size vectors like (1)
    - needed for sign languages; useful for sequence models in NLP

three subclasses of frac:Embedding



#### frac:FixedSizeVector

- GloVe embeddings:
  - original data CSV file, first column is the word, followed by floats

```
frak 0.015246 -0.30472 0.68107 ...
```

FixedSizeVector (Class) is an Embedding that represents a particular Observable as list of numerical values in a k-dimensional feature space. The property dc:extent defines provides the value k.

```
: frak a ontolex: LexicalEntry;
  ontolex: canonicalForm /
    ontolex: writtenRep "frak"@en;
  frac: embedding [
    a frac: FixedSizeVector;
    rdf: value "0.015246 ...";
    dct: source
        <https://catalog.ldc....>;
    dct: extent 50^^^xsd:int;
    dct: description "GloVe v.1.1,
        ..." @en. ].
```

#### other embeddings

BagOfWords (Class) is a frac: Embedding that represents a particular Observable by a set of collocate terms or a mapping from collocates to numerical scores. The value of dc:extent can be used to specify either the maximum size of bags of words, or, the actual size of a particular bag of words. The rdf:value should be a JSON literal, e.g., a dictionary.

TimeSeries (Class) is a frac: Embedding that represents a particular Observable or its Attestation as a sequence of a fixed number of data points recorded over a certain period of time. The value of dc: extent must be used to specify the number of data points per observation. The rdf:value should be a structured JSON literal.

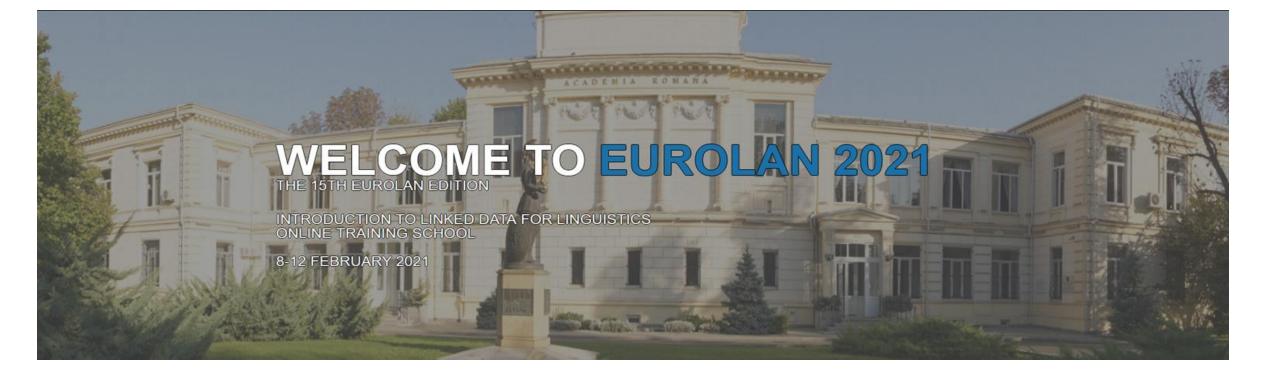
### frac:instanceEmbedding

- for modelling contextual embeddings as relevant for more recent architectures on neural NLP
- domain is not a *frac:Observable*, but a *frac:Attestation* 
  - may be left underspecified
  - embeddings represents the embedding of the target expression in this particular context
  - encoding of embedding itself otherwise identical to *frac:embedding*

```
wn31:play_n a ontolex:LexicalEntry;
  ontolex: sense wn31:07032045-n,
    wn31: play_n_4, \dots
wn31:07032045 - n
    a ontolex: Lexical Sense:
    frac: attestation
        frac: quotation "the play
        lasted two hours";
        frac: locus wn31:07032045 - n;
        frac:instanceEmbedding
            wn31-bert:07032045-n-1
wn31-bert:07032045-n a
    frac: FixedSizeVector;
    dc:extent "300"^^xsd:int;
    rdf: value "0.327246 0.48170 ...";
    dc: description "...";
    frac:corpus <http://wordnet-rdf.
       princeton.edu/static/wordnet.
       nt.gz>.
```

### OntoLex-FrAC as of January 2021

Chiarcos, C., Declerck, T. and Ionov, M. attestation **Attestation** locus  $\sqsubseteq$  citation (2021), Embeddings for the Lexicon: locus quotation: string URI Modelling and Representation. 6th attestationGloss:string Workshop on Semantic Deep Learning instanceEmbedding (SemDeep-6), co-located with IJCAI-PRICAI 2020. Japan, January 2021 Embedding embedding corpus dc:description: String Corpus Chiarcos, C., Ionov, M., de Does, J., Observable do:extent: int total: int Depuydt, K., Khan, F., Stolk, S., rdf:value: Literal Declerck, T. and McCrae, JP (2020). Bag (of words) TimeSeries | Modelling Frequency and Attestations rdf:value: JSON rdf:value rdf:JSON FixedSizeVector for OntoLex-Lemon. In Proceedings of rdf:value rdf:Literal the 2020 Globalex Workshop on Linked Lexicography (pp. 1-9), co-located with frequency corpus CorpusFrequency LREC 2020, France, May 2020 rdf:value: int ontolex:Form https://github.com/ontolex/frequencyontolex:LexicalSense attestation-corpus-information ontolex:LexicalConcept ontolex:LexicalEntry



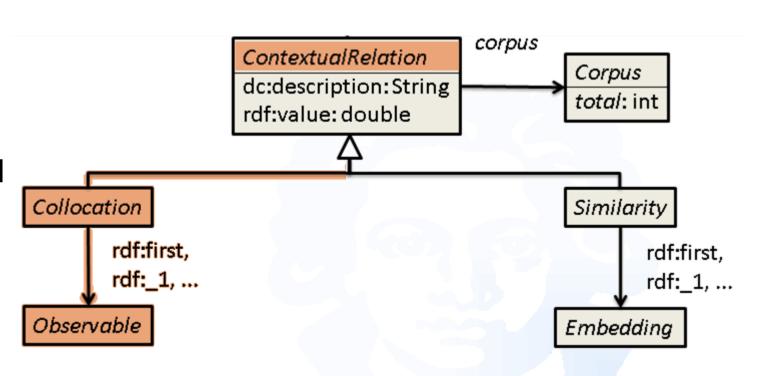
## On-going discussions





### Collocation and Similarity

- We have begun to discuss frac:Similarity
  - as an RDF collection of embeddings
  - can represent similarity clusters (Brown clusters) and similarity relations (pair-wise similarity)
- We have not discussed collocations
  - nor their relation with frac:Similarity



#### Internal consolidation

- We anticipate that the discussion of similarity and collocations can have a profound impact on other components of the vocabulary
  - BagOfWords also represents collocates
- After these have been addressed, a thorough review of all vocabulary components is required
  - reduce properties, improve readability, avoid mis-interpretations
- We expect to deliver a result by late 2021
  - depending on use cases, so, please join our calls;)
  - bi-weekly, see OntoLex mailing list and Nexus Linguarum calendar