# Mining Paper Catalogues

A Multilingual Solution to Reduce Verbose Fields to Consistent Terminology

Felix Kußmaul

University of Cologne

Dr Tim Evans



31 August 2017

EAA Maastricht 2017



### Data Source

92

Form 23 Conical cup with smooth vertical rim Konische Schale mit glattem Steilrand Coppa troncoconica con orlo verticale Coupe tronconique à rebord vertical lisse

Conical cup representing the further evolution of Form 22. The floor is now always flat or biconical (meeting the wall at a sharp angle on the inside), usually with a low foot.

- 23.1: Plain tapering rim, inclined slightly inwards, sometimes bearing applied decoration.
- 23.2: Rim with flat outer face bearing applied decoration bounded above and below by simple convex mouldings; inner face plain or with a groove at lip.

#### Production

Subform 23.1 is probably made in many parts of Italy: examples in Padana ware do not show applied decoration. Subform 23.2 is made in Italy but apparently not in the Padana region.

#### Date

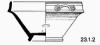
Subform 23.2 belongs to the second and third quarters of the first century A. D.: it is common in the South Stoa deposits at Corinth and at Pompeii, Subform 23.1 is less readily datable as it may occur as a simplified version of Form 22 or Form 23: other features of the vessel (e.g. foot-profile, decoration) may provide a clearer indication of date than the shape of the

#### Distribution

Subform 23.2 is very common throughout the Mediterranean region, with sporadic examples found in the North and in North-Italy: Subform 23.1 is relatively uncommon.

- References 23.1.1 Karthago K 78/172a, unpublished, Stamp L.MA.
- O.C. Italy 23.1.2 Berenice B210.2. Anepigraphic stamp. Italy. 23.2.1 Corinth 1973 pl.84.70. Stamp CAMVRI. O.-C. 397.
- 23.2.2 Berenice B216.2. Italy.
- Other findenote
- 23.1 Asciburgium, Bologna, Bolsena, Conimbriga, Köln, Luni Magdalensherg Ordona Pollentia Roma 23.2 Not separately listed.
  - Concordance
- 23.1: Goudineau 20c; 25a; 37a. Berenice B210.2. 23.2: Goudineau 40. - Barocelli 11. - Berenice B216. - Haves
- Pieces described as Haltern 9 sometimes belong to this P.M.K.







2311



Figure 1: Sample from Conspectus catalogue.

31 August 2017

### Oh dear!

### Problem

Running texts contain a lot of irrelevant information (for machine processing).

This makes database lookups without keywords extremely inefficient.

#### What we have:

#### Production

Subform 23.1 is probably made in many parts of Italy; examples in Padana ware do not show applied decoration. Subform 23.2 is made in Italy but apparently not in the Padana region.

#### Distribution

Subform 23.2 is very common throughout the Mediterranean region, with sporadic examples found in the North and in North-Italy; Subform 23.1 is relatively uncommon.

#### UNSTRUCTURED DATA

#### What we want:

#### STRUCTURED DATA

#### What we have:

#### Production

Subform 23.1 is probably made in many parts of Italy; examples in Padana ware do not show applied decoration. Subform 23.2 is made in Italy but apparently not in the Padana region.

#### Distribution

Subform 23.2 is very common throughout the Mediterranean region, with sporadic examples found in the North and in North-Italy; Subform 23.1 is relatively uncommon.

#### UNSTRUCTURED DATA

#### What we want:

```
"form": "23.1".
   "origin": "Italy".
   "decoration": "none",
   "occurs": "uncommon"
},
   "form": "23.2",
   "origin": "Italy, not Padana",
   "occurs": "Mediterranean region;
              North-Italy"
```

#### STRUCTURED DATA

#### What we have:

#### Production

Subform 23.1 is probably made in many parts of Italy; examples in Padana ware do not show applied decoration. Subform 23.2 is made in Italy but apparently not in the Padana region.

#### Distribution

Subform 23.2 is very common throughout the Mediterranean region, with sporadic examples found in the North and in North-Italy; Subform 23.1 is relatively uncommon.

#### UNSTRUCTURED DATA

#### What we want:

```
"form": "23.1".
   "origin": "Italy".
   "decoration": "none",
   "occurs": "uncommon"
},
   "form": "23.2",
   "origin": "Italy, not Padana",
   "occurs": "Mediterranean region:
              North-Italy"
```

#### STRUCTURED DATA



**TEXT MINING: THEORY** 

# **Definition: Text Mining**

- Information retrieval
- Statistical analysis
- Information extraction
- ...

# **Definition: Text Mining**

- Information retrieval
- · Statistical analysis
- Information extraction
- ...

# **Definition: Text Mining**

- Information retrieval
- Statistical analysis
- Information extraction
- . . . .

# **Definition: Text Mining**

- Information retrieval
- Statistical analysis
- · Information extraction
- . . .

# **Definition: Text Mining**

- Information retrieval
- Statistical analysis
- · Information extraction
- ..

# Why underestimation is bad

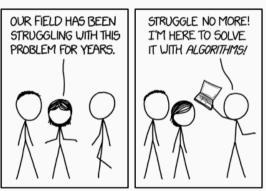






Figure 2: I can relate to this. [Source: xkcd.com/1831]

## Information Extraction

## Definition: Information Extraction (IE)

"[IE] is the task of automatically extracting structured information from unstructured [...] documents."

### Some other facts about Information Extraction

- Computer scientists have a hard time with IE (for over 30 years now!)
- IE is really super difficult and often inaccurate.

## Information Extraction

## Definition: Information Extraction (IE)

"[IE] is the task of automatically extracting structured information from unstructured [...] documents."

### Some other facts about Information Extraction:

- · Computer scientists have a hard time with IE (for over 30 years now!)
- IE is really super difficult and often inaccurate.

## Information Extraction

### Definition: Information Extraction (IE)

"[IE] is the task of automatically extracting structured information from unstructured [...] documents."

### Some other facts about Information Extraction:

- · Computer scientists have a hard time with IE (for over 30 years now!)
- IE is really super difficult and often inaccurate.

# Sorry!

### **DISCLAIMER**

We neither can nor do provide a perfect solution or perfect results.

Furthermore, this project is still work in progress.

# **Five Steps**

- 1 Tokenisation and Sentence splitting
- 2 Lemmatisation
- Part-of-speech-tagging (POS)
- 4 Named entity recognition (NER)
- 5 Relation Extraction



Figure 3: POS-tagging examples after lemmatisation.



Figure 3: POS-tagging examples after lemmatisation.

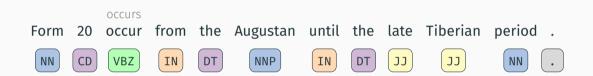


Figure 4: POS-tagging examples after lemmatisation.



Figure 4: POS-tagging examples after lemmatisation.

## **Relation Extraction**

Subject	Relation	Object
quick brown fox	jump over	lazy dog
Form 20	occur	Augustan
Form 20	occur	late Tiberian period



## Tools

presenting different tools here

# Adapting the NER

Stanford CoreNLP only recognises 8 entities types:

PERSON	DATE
ORGANIZATION	TIME
LOCATION	MONEY
PERCENT	MISC

So we have to add the custom type FORM. Adjusting DATE also necessary.

# iepy Active Learning Core

nuthin yet

# Temporal Expressions

With **HEIDELTIME** temporal expressions are mapped to TIMEX3 standard

```
around 140 B.C. \longmapsto APPROX BC0140 second quarter first century B.C. \longmapsto XXXX-Q2 BC00 first half third century A.D. \longmapsto XXXX-H1 02
```

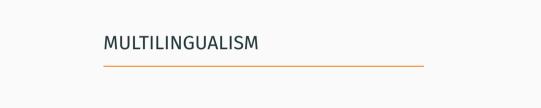
**HEIDELTIME** supports many other languages, e.g. German, Italian, French, ... HEIDELPLACE?!

# Temporal Expressions

With **HEIDELTIME** temporal expressions are mapped to TIMEX3 standard

```
around 140 B.C. \longmapsto APPROX BC0140 second quarter first century B.C. \longmapsto XXXX-Q2 BC00 first half third century A.D. \longmapsto XXXX-H1 02
```

**HEIDELTIME** supports many other languages, e.g. German, Italian, French, ...



# Mining Paper Catalogues

A Multilingual Solution to Reduce Verbose Fields to Consistent Terminology

Felix Kußmaul

University of Cologne

Dr Tim Evans



31 August 2017

EAA Maastricht 2017