# **Mining Paper Catalogues**

A Multilingual Solution to Reduce Verbose Fields to Consistent Terminology

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# **MOTIVATION**

#### **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.
- 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 23 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 rim.

#### 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- References 23.1.1 Karthago K 78/172a, unpublished, Stamp L.MA.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.
- Arezzo. 23.2.2 Berenice B216.2. Italy.
- Other findspots
- Asciburgium, Bologna, Bolsena, Conimbriga, Köln, Luni, Magdalensberg, Ordona, Pollentia, Roma.
   Not separately listed.
  - Concordance
- 23.1: Goudineau 20c; 25a; 37a. Berenice B210.2. 23.2: Goudineau 40. – Barocelli 11. – Berenice B216. – Hayes
- Pieces described as Haltern 9 sometimes belong to this







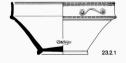




Figure 1: Sample from consp

#### 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:

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#### UNSTRUCTURED DATA

#### What we want:

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#### What we want:

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

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   "occurs": "Mediterranean region:
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### STRUCTURED DATA

# TEXT MINING

## **Definition: Text Mining**

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

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#### **Information Extraction**

## **Definition: Information Extraction (IE)**

"[IE refers to] the identification and extraction of instances of a particular class of events or relationships in a natural language text and their transformation into a structured representation."

— Grishman 1997, Eikvil 1999

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.

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# Sorry!

### **DISCLAIMER**

In this presentation, we show **preliminary** results, as this project is still work in progress.

# **IE Process Pipeline with UIMA**

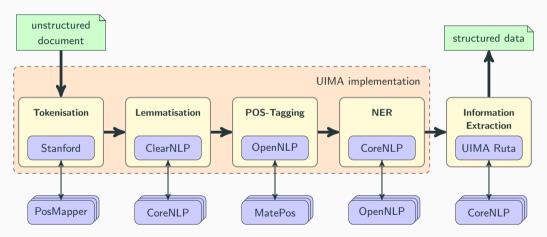


Figure 2: IE Process Pipeline.

# **POS-Tagging**



Figure 3: POS-tagging examples after lemmatisation.

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# Adapting the NER

Most NERs (e.g. **Stanford CoreNLP**) only recognise 8 entities types:

PERSON	DATE
ORGANIZATION	TIME
LOCATION	MONEY
PERCENT	MISC

So we have to add the custom entity type FORM.

# Rule-based approach

- High precision, but lower recall
  - ⇒ Many many rules?!

## Machine-learning approach

- Lower precision, but high recall
- Needs to be trained!

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- High precision, but lower recall
  - ⇒ Many many rules?!

K 612

Abb. 117,2

Amphoriskos mit breitem, annähernd zylindrischem Hals und davon abgesetzter Schulter. Schmaler, aussen vorkragender Wulstrand mit an der Innenseite umlaufender breiter Riefe. Zwei Bandhenkel vom Mündungsrand zur Schulter. Form des Gefässkörpers unbekannt.

Ton I,B mit rotem Überfang

M. Dm 9.5-10 cm

Vk. Selten

Dat. Spätes 3.-4. Jh. n. Chr.

Figure 4: Excerpt from eleph

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Form 23: 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 Pompeü.

**Figure 5:** Manually annotated sentence from **consp** in iepy.

## **Temporal Expressions**

With HeidelTime temporal expressions are mapped to TIMEX3 standard

```
around 140 B.C. \longmapsto APPROX BC0140 Sptes 3.4. Jh. n.Chr. \longmapsto END 02; 03 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, ...

### **Relation Extraction**

Subject	Relation	Object
quick brown fox	jump over	lazy dog
K 612	dates	03 <sup>1</sup>
Form 23	dates	$XXXX-Q2 00^2$
Subform 23.2	dates	XXXX-Q2 00

<sup>&</sup>lt;sup>1</sup> "4th century A. D."

<sup>&</sup>lt;sup>2</sup> "second and third quarters of the first century A. D."

### **Relation Extraction**

Subject	Relation	Object
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K 612	dates	$03^{1}$
Form 23	dates	$XXXX-Q2 00^2$
Subform 23.2	dates	XXXX-Q2 00

<sup>&</sup>lt;sup>1</sup> "4th century A. D."

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#### Locations with HeidelPlace

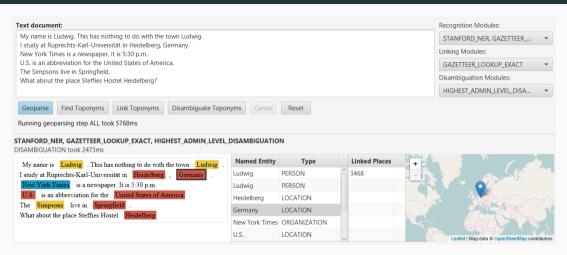


Figure 6: Screenshot of HEIDELPLACE.



# **Background**

## Two problems:

- Linguistic
- Conceptual

# **Different languages**



## Different traditions

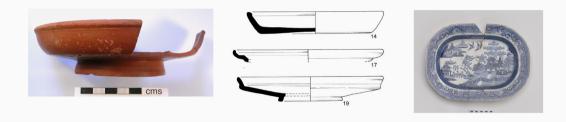


Figure 7: Plate, platter or dish?

# **Creating controlled vocabularies**

Creating wordlists that project team would be most useful to describe the key features of a vessel or sherd

- Sherd type (e.g. rim or handle)
- Form (e.g. plate or bowl)
- Decoration form (e.g. burnished)
- Decoration color (e.g. yellow)
- Fabric (e.g. Dressel 28 fabric)

### **Lessons from ARIADNE**



Used tools and methodology developed for the ARIADNE project by the Hypermedia Research Group at the University of South Wales

- Created a neutral spine based on the Getty Institute's Art and Architecture Thesaurus (AAT)
- This spine was poulated by memebers from partner organisations, identifying common terms and concepts within it
- Project partners then mapped terms in their language to this neutral spine
- French terms supplied courtesy of a 2001 Masters thesis by Caroline SOURZAT (thanks to Eleni Schindler Kaudelka for identifying this on the ArchAIDE blog!)

# Mapping terms and concepts (part 1)

Often this was very straightforward, for example:

- The Italian terms graffita, graffita a punta, graffita a stecca = "sgraffito" (http://vocab.getty.edu/aat/300266416)
- The Spanish term *Cntaro* = "jars" (http://vocab.getty.edu/aat/300195348)
- The German terms gebogener Henkel, Ohrfrmiger Henkel, langer Vertikalhenkel = "handles" (http://vocab.getty.edu/aat/300266416)

# Mapping terms and concepts (part 2)

Often this was more complicated, with partners having differing perceptions on what to call something (e.g. "plate versus platter)

In truth, this confusion may also be reflected by what has come out of the ground!

An advantage of using the AAT (a "SKOS'd" thesaurus), is that ambiguity or difference in nomenclature can be resolved by a broader term or concept, so for example...

# Mapping terms and concepts (part 3)

Looking at the hierarchies for plate and platter in the AAT we can see that both are "dishes (vessels for food)", or even broader "culinary containers". So whole we can retain our original classifications (and this is essential for text mining), we can agree at a fundamental level what these fundamentally are

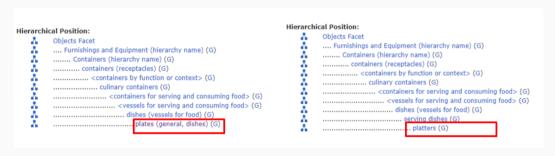


Figure 8: AAT Hierarchies for Plate and Platter



## **Challenges to meet**

challenges:

choice of tools, coreferences in text, eloquence of archaeologists, maybe calculating F-value?

HEIDELTIME:

second and third quarter of the first century A.D.  $\longmapsto$  XXXX-Q3; 00

## References

# Thank you very much for your attention!

Questions?

This project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement 693548

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