# Modelling Scale in Historiographical Data

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#### Introduction

The project will investigate the meaning of *scale* in historical writings, and more precisely how scale is expressed through language in historical discourse. This question draws attention to the conceptual and linguistic mechanisms at play in building historical knowledge, when the historian moves between different layers of analysis, narration or consulted sources, involving different degrees of generality. Studies in "global microhistory" (Trivellato, 2011) have highlighted the idea of variable scale representation in texts that integrate micro and global history. Nonetheless, the question of how this phenomenon of scale is actually expressed through language in historians' discourse has been less studied so far.

A small historiographical corpus, in which variations of scale are clearly present, will serve to develop the digital approach/tools/methodology. Depending on the findings of the project, an extension of the research to other types of corpora is envisaged.

The proposal presents the intended workflow for a scale analysis prototype and the first experimental results using topic modelling.

### Workflow

The historiographical corpus includes a series of books that mingle micro and macro scales of historical analysis (Brook, 2009; Rothschild, 2013; Sparks, 2004; Stein, 2008; Wills, 2001). Each document is cut in chapters (or parts), considered as units of analysis to be examined via a topic modelling tool. The assumption is that, for this type of documents, the text inside the units can be restructured on levels of generality/specificity (or macro/micro), according to a number of topics that traverse the whole conceptual space (Figure 1).

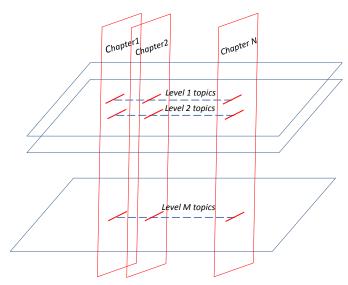


Figure 1. Restructured text by levelled topics

In a first phase, the workflow will consist in applying LDA-based techniques for topic modelling (Blei et al., 2003a, b; Blei, 2012; Rhody, 2012; Underwood, 2012; Weingart, 2012) to the selected corpus. For illustration, it is intended to provide means of exploring restructured text fragments through a zoomable layout, from global to micro perspectives (see next section). Other methods, e.g. for hierarchical or

knowledge-based topic modelling (Hofman, 1999; Hu et al. 2016) and visualisation (Smith et al., 2014; Yang et al. 2017), are also studied.

# Experiments

Table 1 shows the first results of an experiment on *Vermeer's Hat* (Brook, 2009) using MALLET (McCallum, 2002) and TWiC (Topic Words in Context) (Armoza, 2017). One can observe the coverage of about 80% by the top 3 topics in each chapter and the recurrence of topics 13 and 7 in all the eight units.

Document (chapter)	Торіс	Proportion	Торіс	Proportion	Торіс	Proportion	Total top 3 topics by chapter
1_TheViewFromDelft_0.txt	13	0.418965239	14	0.294147794	7	0.145840564	0.858953597
2_VermeersHat_0.txt	17	0.445442596	7	0.259011646	13	0.1249389	0.829393141
3_ADishOfFruit_0.txt	4	0.420070653	7	0.295845845	13	0.167718771	0.883635269
4_GeographyLessons_0.txt	16	0.423656784	7	0.306487232	13	0.108303131	0.838447147
5_SchoolForSmoking_0.txt	8	0.415263013	7	0.251512379	13	0.123663831	0.790439223
6_WeighingSilver_0.txt	2	0.376408245	7	0.332168176	13	0.120215764	0.828792186
7_Journeys_0.txt	19	0.378046282	7	0.257079274	13	0.205071495	0.840197051
8_EndingsNoManIsAnIsland_0.txt	3	0.379550072	13	0.268323093	7	0.217947775	0.86582094

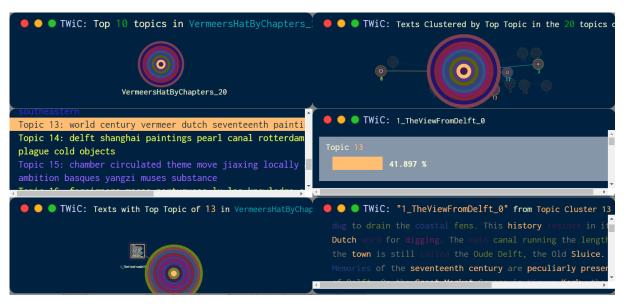
Table 1. Top 3 topics for Vermeer's Hat, by chapters

Table 2. Weight and words for dominant topics in Vermeer's Hat

Торіс	Weight	Words
		chinese china people back trade made european europe europeans men end time south century
7	2.4119	called make year dutch coast spanish
		world century vermeer dutch seventeenth painting place delft life time voc long years side east
13	1.83863	home vermeers things trade paintings
		silver spanish manila economy money coins gold potos god supply spain orozco parian grams coin
2	0.14006	spaniards philippines governor cargo spring
		foreigners macao portuguese lu las knowledge cortes xu jesuit red pan gua silver maps macanese
16	0.13547	pirates zhaolong ashore mission ships
		dutch ship bontekoe ships bramer painting weltevree cocchi magi black sailors korean boy men
19	0.07524	macao women story servant survivors junk
		donne corcuera state wen language death donnes translators trading responsibility bell treasure
3	0.07299	zhenheng governor translation bullion metaphor corcueras coin meditation
		porcelain ships white objects dishes lion wen dutch voc pieces amsterdam potters portuguese
4	0.04935	foreign dish taste cargo produced style li
		delft shanghai paintings pearl canal rotterdam schouten chamber herring schiedam oude surface
14	0.0486	kolk buildings great built influence plague cold objects
		tobacco smoking smoke opium beijing yang plant pipe smokers smoked women fujian tobaccos
8	0.03339	english capital native americas local things habit
		champlain french lake beaver native champlains arquebus huron mohawks hurons hat st
17	0.02491	montagnais chiefs lawrence allies war felt hats north

A closer examination of the words and contexts corresponding to each topic (Table 2, Figure 2) may lead to the assumption that the recurrent topics 7 and 13 correspond to higher levels in the hierarchy, i.e. accounting for larger-scale events in seventeenth century and the trade routes between Europe and China, while the other dominant topics in the chapters refer to more particular circumstances, places or people as pieces in the global picture.

Figure 3 illustrates another way of exploring the book using an editor for zoomable texts (Armaselu, 2010). The representation (created manually) shows on level 1 a general account (chapter 1) on the global cooling in the seventeenth century and gradually narrows down to the Little Ice Age in Europe, Pieter Bruegel the Elder's winter landscapes and Vermeer's *View of Delft* painted in 1660.



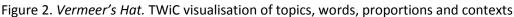




Figure 3. Vermeer's Hat (Brook, 2009: 12, 13, 10, 133). Z-editor, zoomable text layout

## **Conclusion and future work**

The paper presents a workflow and first experiments using topic modelling to analyse scale representation in historiographical data. The project is still under development. Further work will include tests with other documents from the "global microhistory" corpus. Experiments with hierarchical topic models and other visualisation tools, as well as creating a pipeline for semi-automatic restructuration of data as zoomable texts are also envisaged.

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