TEXT REUSE IN DH RESEARCH

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Text Reuse at Scale workshop – University of Luxembourg, 23-24 November 2022



SUMMARY

- 1. Definition, applications, methods
- 2. Text reuse in impresso
- 3. Text reuse beyond impresso
- 4. Text reuse at scale

DEFINITION IN CONTEXT

What do we mean by *text reuse detection* and when is it used?

What research questions are investigated by means of it?

DEFINITION

Text Reuse (TR)

"The meaningful reiteration of text, usually beyond the simple repetition of common language."

(Romanello et al. 2014)

Text reuse detection (TRD)

The task of automatically detecting reiterations (reuses) of text, usually carried out in an unsupervised setting.

CONTEXTS

"meaningful reiteration": function of domain, document type and research question/application.

Scholarly publications



(Image source)

Quotations, plagiarism Academic writing/bibliometrics

Newspapers

82

83



Copy/shake & paste, repurposing Printing culture, virality of news

Literature

Shakespeare, William (1564-1616) 1710 - Macbeth

MACBETH 29

And the service of the Large fragments of the service of the servi

Allusions, paraphrases, quotations Intertextuality, lit. reception 5

APPLICATIONS

•••

- To identify multiple editions of the same work(s) in a corpus
- To find quotations of a text when target works are known
- To identify/filter out duplicates before further processing
- To study the virality and spread of texts

Primary text (v. 1-3)

'AEI μέν, ὦ παῖ Λαρτίου, δέδορκά σε πειράν τιν' ἐχθρῶν ἀρπάσαι θηρώμενον· καὶ νῦν ἐπὶ σκηναῖς σε ναυτικαῖς ὁρῶ

Lemmata

1 del μέν, followed in 3 by καl νῦν: cp. . Tr. 689-691 ἔχρισα μὲν...κάθηκα (n.): Lucian Dialog. marin. 8 πάλαι μὲν

Δαρτίου, as in 380: but $\Lambda \alpha \epsilon \rho \tau i o v$ in 101, and $\Lambda \alpha \epsilon \rho \tau o v$ in 1393. $\Lambda \alpha \epsilon \rho \tau \eta s$ is the only Homeric form (*Ph.* 87 n.), but Eur., like Soph., uses all three. In

Line number anchor

Word anchor

Reference to primary literature

Reference to tutor text

METHODS

Newspapers domain

Challenges:

- OCR noise
- Scale of corpora

Methods:

- Character-level alignment \rightarrow BLAST (Vesanto et al. 2017)
- Ngram-level alignment \rightarrow Passim (Smith et al. 2015)

Literature domain

Challenges:

- Quotations, allusions, paraphrases
- Need to go beyond repetition of n-grams

Methods:

- TRACER toolbox for historical text reuse (Büchler et al. 2014)
- Extend the feature set → syntax, metre, semantic context (Coffee et al. 2012, Scheirer et al. 2016, Moritz & Steding 2018)
- Word embeddings-based similarity (Liebl & Burghardt 2020)

IMPLEMENTATIONS

- The <u>R textreuse package</u> (R) written by Lincoln Mullen
- TRACER (Java) developed by Marco Büchler and colleagues
- Basic Local Alignment Search Tool (BLAST)
- <u>Tesserae</u> (PHP, Perl)
- <u>TextPAIR (Pairwise Alignment for Intertextual Relations)</u>
- <u>Passim</u> (Scala) developed by David Smith (Northeastern University)

TEXT REUSE IN IMPRESSO

Detection, post-processing, exploration.

TR-RELATED JARGON

TR *cluster*: a group of *passages*, from different newspapers content items (~articles), that have a certain amount of text in common.

Several clusters can be detected within a single content item – esp. if a long one. The length of TR passages can vary considerably.



TR IN IMPRESSO: WORKFLOW & SOME STATS





Detecting Text Reuse with Passim

Matteo Romanello 💿 and Simon Hengchen 💿

In this lesson you will learn about text reuse detection - the automatic identification of reused passages in texts - and why you might want to use it in your research. Through a detailed installation guide and two case studies, this lesson will teach you the ropes of Passim, an open source and scalable tool for text reuse detection.

Peer-reviewed https://doi.org/10.46430/phen0092

CC-BY 4.0 **Support PH** Post-processing of TR clusters:

- Cluster size
- Lexical overlap
- Time span (# of days)
- Connected clusters

6,177,815 clusters

16,099,821 passages

~17% of content items contain TR

TR IN THE IMPRESSO APP

Display of text reuse in the reading mode.



TR IN THE IMPRESSO APP

(1 2 3 4 ...) »

BOXE - La Valatan de Garaire Jean Obarali (28 and, dans la conterne des prote valant, en la Tharganian Solar



Text reuse explorer: filtering (even on a collection), overview of what's in a TR cluster, and which clusters are connected.

Media Monitoring Search [®] Newspap	ers Topics Inspect & Compare	Text reuse	FAQ LOG	N RE	GISTER
BROWSE 2,342,258 CLUSTERS ±:: Lexical overlap between 70 and 10 ~ ±:: Cluster size between 1 and 54 ~ #tr-nobp-all-vo1-c188978588270	TEXT REUSE CLUSTERS () Cluster #c18897858 2 articles from Sat, Nov 27, 1993 to Sat, Nov OVERVIEW 2 PASSAGES ORDER BY DEFAULT ~	38270 27, 1993 (o years) with 94.57% loxical overlap ① 4 CONNECTED CLUSTERS			
ORGER RY NUMBER OF PASSAGES T > IfCL\$89278568270 95% - 2 ARTICLES LATEST SAMPLE ALXOUEL HOCKEY SUR GLACE Après les Russes Valcheslav Bykov et Andrei Kho-mutor Freiburg Cathéres and Andrei Kho-mutor (reflourg Cathéres), let CD-avos ser analanament renforcé par les Sué-dois Per Dinos et (MORE) 1724		A LA VOLEEE Journal de Genève - Saturday, November 27, 1993p.17 A LA VOLEE HOCKEY SUR GLACE Après les Russes Viatcheslav Bykov et Andrei Kho- mutov (Fribourg Gottéron), le HC Da- vos se les Sué- dois Per Djoss et Jan Larsson (Lugano) tors de la 67 e Coupe Spengler, du 26 au 31 décembre. HOCKEY SUR GLACE Reto toujours leader du tro- phée Jacques Plante des meilleurs gar- diens au terme de la dix-huitième jour- née. Tenant du titre, Ravonl coéquipier en équipe na- tionaia, Renat Toisoi (HC Berne). Tro- phée Jacques-Plante. Classement après 28 journées : Reto Pavoi Renato Toisoi (Berne) 23.2, Dino Stecher (Fribourg-Gottéron) 38.4. Lars Weibel (Lugano) 37,5. Olivier An- kro (Bienno) 4.6. Patrick S VOLLEYBALL Le circuit de la Ligue mondiale 1994, organisé du 6 mal au 12 juin pour la phase préliminaire, les 27 et 28 juillet pour si millions de dollars que se partage- ront douze pays, répartis en trois groupes. La phase préliminaire are en c- ganisée ser six v.	ra également Ravonl (HC K orécédait d'ur (Kloten) 23 po chôpf (Zoug) a phase finalo ' eek-ends, ch	renforc loten) é i point s ints. 2. 3. a, sera c aque éc	cé par śtait son doté de iquipe
#C94489386267 82% – 2 ARTICLES LITET SAMPLE GAINS 2 × 12 Fr. 11.768,70 40 × 11 441,30 442 × 10 39,00 Somme approximative au premier rang du prochain concourse Fr. 170,000 - 92 Fr. 574 - 374 - 374 X 4 20 - 4547 × 3 - Somme approximative (Most) 17/8		rencontrant les trois autres en matches aller et retour. Les deux pre-miers de chaque groupe seront qualifiés pour le tourno final douze participants figuraient déjà dans la Ligue mondiale 1993, le seul nouveau venu étant la Bulgarie qui a remplacé le Canada. Lu ainsi établie : pour la phase préliminaire, les équipes recevront res-pectivement dans l'ordre du classement, 215 000,208 000,200 Pour la phase finale, toujours dans l'ordre du classement : 1 000 000, 500 000,300 000 et 200 000 dollars. Le meilleur joueur du te 200 dollars. BOXE Le Valaisan de Genève Jean Chiarelli (28 ans), dans la catégorie des poids welter, et le Thurgovien Stefan Angele catégorie des mi-lourds, participeront au traditionnel meeting de la Saint-Etienne, le 26 dé-cembre, au Xursaal de Berne. VOLEEE	organisé en It n répartition d ooo et 200 o urnoi recevra m (29 ans), da	alie. On es prix : po dolla quant à ns la	ize des a été ars. à lui 14
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Renato Tosio (Berne) 22.3. Dino Stecher (Fribourg-Gottéron) 18.4 Lars Weibel (Lugano) 17.5. Olivier An- ken (Bienne) 4.6. Patrick Schôpf (Zoug) VOLLEY

CLUSTER EXAMPLES





Reprinted 68 times over 21 years (1977-1998), in 3 Swiss

newspapers.

Content item type:

- Advertisement (n = 64)
- Article (n = 4)

(Filter by type not supported by the impresso app.)

CLUSTER EXAMPLES

8 TR passages, with 7.5% lexical overlap. 100% advertisements.

Job postings by a consultancy company. Texts differ, but similar template.

TEXT REUSE CLUSTERS Cluster #c21855

8 articles

COMPTABLE mi-temps SECRETAIRE COMPTABLE mi-temps

> alté suisse ou permis Agence Raymonde Pont Conseil et sélection de person 11, rue Cornevin, 1201 Genève Tél. 022 732 82 82 Fax 022 732 81 82

from TUE, MAR 4, 1997 to TUE, NOV 11, 1997 (1 years) with 7.5% lexical overlap 🔅

8 PASSAGES

ORDER BY DEFAULT ~

Vencellentes conneissances d'anglais sont dan lous Mes ágéis) entre 24-40 ans et cas postes v essent, prenez contact avec nous.



Gazette de Lausanne - Tuesday, June 24, 1997p.43

Nous sommes mandatés par nos clients, société Multinationale, financièreet fiduciaire pour la recherche de leurs nouveauxcollaborateurs. COMPTABLE COMPTABLEMi-temps SECRETAIRE .. COMPTABLE mitemps D'excellentesconnaissancesd'anglais sont dernandées. Vousêtes âgé (e) entre 24-40 ans et ces postesvous inté- ressent, prenezcontactavec nous. NationalitésuissêoupermisC. Agençe. Raymonde Pont Conseil et sélection de personnel 11, rue Cornavin, 1201 Genève Tél. 022 732 8282 Fax 022 7328182, ~

NaN

Gazette de Lausanne 🕀 Tuesday, November 11, 1997p.47

français-anglais

.

SECRETAIRE-ASSISTANTE DE GESTION

s travaillerez en étroite collaboration avec un gestio * tenue de dossiers, contact clientèle, secrétariat, etc. 45 êtes âgée entre 34 et 35 uns, de nationalité suisse s

Notre client, une banque privée, nous a mandatés pour la recherche d'une SECRETAIRE-ASSISTANTE DE GESTION français-anglais justifiant d'une expérience dans la gestion. Vous travaillerez en étroite collaboration avec un gestion- naire : tenue de dossiers, contact clientèle, secrétariat, etc. Vous êtes âgée entre 24 et 35 ans, de nationalité suisse ou Permis C, alors appele / .- nous rapidement pour convenir d un entretien. RAYMONDE PONT CONSEILS D'ENTREPRISES ET SÉLECTION DE PERSONNEL II-"UE CORNAVIN 1201 GENÈVE-TÉL. (0221 732 82 82-FAX (022) 732 81 82

datáes par notre client, un avoc national, nous sommes à la recherc SECRETAIRE TRILIN

Vous êtes une personne sympathique, de bonne présentation et ce poste vous intéresse, alors appe

lationalité suisse - perm ce 25 ans - 40 ans.

NaN Gazette de Lausanne 🕘 Tuesday, March 4, 1997p.44

Mandatées par notre client, un avocat de Droit International, nous sommesà la recherched'une SECRETAIRE TRILINGUE français-anglais-allemand Vous travaillerez en étroite collaboration avec lui : prise de PV, secrétariat courant, dictaphone, pré- paration et gestion de dossiers, contacts banques, sociétés et clients, comptabilité simple, tenue agenda, etc. Ce poste requiertde l'indépendanceet le sens des responsabilités. Yous êtes une personne sympathique, de bonne présentationet ce poste vous intéresse, alors appe-lez-nous. Nationalitésuisse-permis C. Age 25 ans-40 ans. -; ii ... Raymonde pont I CONSEIL ET SELECTION DE PEE 1 S 0 NNEL 11, rue Cornavin 1201 Genève Tél. (022) 732 82 82-Fax : (022) 732 81 82



CLUSTER EXAMPLES

Front page article on "the art of advertisement" (L'art de la reclame).

Main cluster: 4 reprints over 17 years, appeared on *L'Impartial* (CH) and *L'indépendance luxembourgeoise* (LU).

Connected clusters show that portions of this circulated as individual articles.

Article is rather a mashup (or compilation) of existing materials, which circulated across countries, even signed by different journalists (Robert Delys, Georges Rocher)



Le grand art. - Un des maîtres du geure: H. de Villemessant. - Un mot de la fin. - aAu serin de Marieo. - A New-York et à Chicago : la réclame vivante aux vitrines. - La dame de l'hôtel

La Chaux-de-Fonds

Un testament original. - On nous écrit :

Vendredi dernier, les locataires d'une maison de la rue du Nord faisaient la chasse à un petit serin qui voltigeait dans la cour. Ils mettaient d'autant plus d'ardeur à l'attraper que l'oiscau avait un petit papier suspendu au cou, au bout d'un fil. Enfin le fugitif fut pris, le papier déplié et en y lut ce qui suit :

« Demoiselle, 26 ans n'ayant plus de travail, « sans ressources, Je n'ai même plus de quoi « nourrir mon seul ami au monde, ce petit oi-« seau à qui je rends la liberté! Je prie la per-« sonne qui le trouvera d'en prendre grand soin. « Merci, merci par avance !

» Jeanne ».

L'oiseau a été trouvé par une personne qui lui a donné asile et veille sur lui avec un soin touchant.



TEXT REUSE BEYOND IMPRESSO

Inspirations from past and current projects.

ETH <u>project</u>, interface development by Benoit Seguin.

Text corpus: OCR of 1,300 rare books on architecture from ETH library.

TRD performed with *passim*.

3 types of TR visualizations:

- 1. Graph
- 2. Matches
- 3. Compare
- 4. Flows

Interactive graph visualization of reuse between books, rearrangeable according to time (x-axis).

TR clusters are grouped by individual publications.

≡ **ETH** zürich | Graph – Text reuse in rare books

Nuova raccolta SU O A A A COCOLTA A UTO A UTO	A d'autori che tratta Year Authors / Collaborators Imprint Localisation Description Language Nb pages	no del moto d 1766 Parma : per Filip ETH Library, Ra 7 volumi ; 22 cm Italian 3542	ell'acque	2 gnani, 1766-1780 SEE ON • 1	3 rara 🚺	
Detected text reuses with 6 b	pooks					
Voverview	Architettura d'acqu	Year Authors / Collaborators Imprint Localisation Description Language Nb pages	1699 Barattieri, Piacenza Bazachi, ETH Libra 2 parti ; 3 Italian 618	, Giovan Battista I : nella Stampa 1699 ary, Rar 687 I3 cm	a [1600-1677] Ducale di Lea SEE ON •	Ido Leandro

(Link to match)

3 types of TR visualizations:

- 1. Graph
- 2. Matches
- 3. Compare
- 4. Flows

TR is highlighted directly on the page facsimile.

3 types of TR visualizations:

- 1. Graph
- 2. Matches
- 3. Compare
- 4. Flows



(Static) visualisation of TR flows across different sections of any two matching books.

Middle-Level View Raccolta d'autori che trattano del moto dell'acque, 1765 Nuova raccolta d'autori che trattano del moto dell'acque, 1766 Discorso al seren. Considerazioni intorno Della misura dell. Tomo primo. Il mare Adriatico e sua.. Discorso di Vincezio VI.. attato della c Volume primo. Misura dell' acqu. Misura dell'acque corre. Trattato del moto.. Parte seconda Tre lettere idrostatich... Tomo secondo. Della natura de' Capitolo guinto, Della ... Capitolo sesto, Della r... Libro primo Del movimento del.. Volume secondo. Annotazio Tomo terzo. Del moto misto de. Libro prime Relazione di Domenico G. Esperin Libro primo. De' princi. Scriture, e relaz Libro secondo. Del moto Tomo quarto. Volume terzo Serie di scrittur... Scritture alla sa. Del moto misto dell'acq. mage number Del moto misto dell' ad Scritture del Doc. Delle pescaje, o catera. Tomo quinto. Risposta del Dott Scritture del dottore E. Appendice geometr Volume quarto Memoria che cont Replica de' Bolognesi a.. Dialoghi Fra Gior Compendio, ed esame del. Tomo sesto Relazione all' en Relazione dello stato p... Alla santità di nostro ... Relazione della v. Capitolo quarto. Parte Volume quinto Scelta di cio', che con. Riflessioni del P. Capitolo ottavo, Delle ... Capitolo nono. Delle co. Tomo settimo Piano della separ.. Relazione per la divers. Dei fiumi dei tor rattato del livellare sperimenti sopra il co.. Relazione per la . Capo secondo, Risposta Sperienze di Teodoro Bo... Volume sesto Capitolo quinto. Tomo ottavo. Leggi e fenomeni,.. Memorie dell'antico, e . Capitolo decimo. Dissertazione sopra i Capitolo decimogu Ragionamento istorico s. Memorie dell' ant Dell' antico, e p Discorso del Sign. Parte prima. Delle orig Sopra Campagna Pi.. Storia dell'antico cors.. Volume settimo, ed ulti. Tomo nono, ed ult. Memoria idrometri. Del modo di regolrae i Index

3 types of TR visualizations:

- 1. Graph
- 2. Matches
- 3. Compare
- 4. Flows

KITAB





RECEPTION READER

App to explore text reuse in the ECCO corpus.

Developed at the Helsinki Computational History Group (<u>COMHIS</u>).



The Dedication.

tion: The great Things You have faid and done, in our *Senate* and our *Camps*, in the great Caufe of Liberty, are lafting Trophies to eternize your Fame: Our Annals are full of 'em;

Griffin, Benjamin (1680-1740)

1720 - Whig and Tory

And when we read Tour Perfonal Venture in Tour Country's Caule, Our Wonder and our Paifes then contend Which Boall exceed: When we review Tour Worth, We find Tou in the fout Britannick Ranks, Not flarting at the Images of Death, Made by Tour felf. ______Shake,

'Twere endlefs, fhould I attempt to recount Your noble Acts; in whofe Praife I might be lavifh, did I not fear to offend Your Lordfhip's Modefty; to whom this Motto may with the greateft Juftice be applied: Non magna loquimur, fed wivimus. It being Your Lordthip's proper

Page 5

Reception reader app: reuses of Shakespeare's Macbeth

SCHOLARLY RECEPTION IN CLASSICS

Quotations (and references) extracted from JSTOR, and used as a proxy for scholarly reception.



Cited loci of the Aeneid: interactive visualisation.

VIRAL TEXTS

Corpus of pre-1861 American newspapers in Library of Congress' Chronicling America archive.





Historical research insights (Cordell 2015):

- The network author model allowed for a better
 understanding of 19C newspaper literature → something
 "composed incrementally, by a community of writers and
 editors in a network."
- Network analysis pointed to newspapers in understudied cities as "important brokers of textual exchange".

VIRAL TEXTS

Corpus of pre-1861 American newspapers in Library of Congress' Chronicling America archive.





(from Cordell 2015)

http://networks.viraltexts.org/1836to1860/index.html

SCANDINAVIAN TEXT REUSE



Text reuse in the Swedish-language press, 1645-1918

Ousters ~	land		Search Q			
Limit your se	Limit your search		zers > land X	Start Over Query to TSV Analyze		
4						
scarting year		* Previous 1 - 10 of 108,	124, which consist of 108124 clusters Next +	Sort by Date, descending - 10 per page -		
1771 - 1	220 Limit					
		Count:	1			
		werage length:	0.12			
		Wranty score:	0.13			
1900	1850 1990	Maximum man dank	0			
		Cluster ID:	10634154			
Starting locati	on ~	Starting year:	1914			
Mahanki	64.851	Starting location:	Helsinki			
Turio	16,231	Starting language:	Sana			
Vesse	6.798	Starting style:	Newspaper			
Vipuri	5.671	Unique locations:	1			
Tarroere	2.320	Unique titles:	3			
Hanko	1,766	Timespan in days:	1			
Maarianhamine	1,511	First text:	an, till corresp. burv u telegraferas från valona, at	t den internationella kontrollkommissionen i		
Pori	1,448		anvenning ar att soora albanien inom kort skall uts upprop till det albanska folket och framhållit, hurs	rymmas ar de grekoka truppernä, vä nd t sig med ett - usom makterna säsom sitt mål uppställt att af		
Porvoo	1,426		albanien bilda ett själfståndigt land under egen furste, hvars uppgift blir att införa statlig ordning	este, hvars uppgift blir att införa statlig ordning i det		
Koldosta	1,020		nya landiet, ett dylikt upprop ha jämsäl de holländska gendarmofficerarna utfärdat, utofvande t datramma full frihat och limilidat som tälkochet till namma ät alla hvariämte ställar justale de			
Lovisa	877		strängaste strnff för dem, hvilka störa frede	the period of the company of the second second second		
Tammisaari	753					
Pietarsaari	532	Count:	4			
Kristinankaupu	nki 500	Average length:	1914			
Kotka	478	Wrality score:	0.04			

TRD performed with BLAST (Vesanto et al. 2017)

For each TR cluster, a *virality score* is computed, which "is a way of approaching how efficiently a particular text is circulated through the media network" (<u>source</u>).

Virality score = number_venues * number_countries * (1/time_span). The score is then normalized to a 0-100 range.

TR clusters are characterised with further properties:

- Max. gap in the circulation chain (# of days)
- Start location / port location / incoming location
- Crossed (boolean)
- Average length

Text Reuse in Finnish Newspapers and Journals, 1771–1920

SCANDINAVIAN TEXT REUSE



Text reuse in the Swedish-language press, 1645-1918

Reuse in Finnish N	lewspapers and Journ	ils, 1771–1920 About	Credits How to Cite	
Ousters	~ land		Search Q	
Limit yo	ur search	You searched for:	exercisland X	Start Over Query to TSV Analyze
Starting y	year V	* Previous 1 - 10 of 108.	124, which consist of 168124 clusters Next +	Sort by Date, descending - 10 per page -
1771	- 1920 Lintz	Count: Average length: Virality score: Max gap (yrs): Maximum span (yrs):	3 646 0.13 0	
Starting k	location ~	Cluster ID: Starting year:	10634154	
Helsinki Turku Vlassa Vilpuri Tampere Hanko Masrianha Pori Ronson Kokkolo Lovisa	64,853 16,231 6,738 5,671 2,330 1,766 1,511 1,486 1,029 877 877	Starting location: Starting language Strinting style: Unique locations: Linespan files: Timespan in dwp: First text:	Helshil Ime Knoppper 1 3 3 1 3. Uterresp. burv: steppeters: Monators, a anderlong of att stoke alberien into intal al- opport of that abanes folkers of handhills anders of att stoke alberien into intal al- generation of the stoke of the stoke of the andhills decarment of the three of periodices want share decarment of the three of periodices want share the stopport of the stoke on share share the stoke of the decarment of the stoke of periodices want share the stopport of the stoke on share share the stoke of the stopport of the stoke on share share the stoke of the stopport of the stoke on share share the stoke of the stopport of the stoke of the stoke of the stoke of the stopport of the stoke of the stopport of the stoke of the stopport of	nt den memoratoreta kontroficementocoren i Ingenera al de grestida trappene, si el el se greste at noran materiaria sistem en el capatal el al de cara en alemana sistem en el cara el cara el cara el cara de gresta el cara el cara el cara el cara el cara el cara de gresta el cara el cara el cara el cara el cara el cara de gresta el cara el cara el cara el cara el cara el cara de gresta el cara el cara el cara el cara el cara el cara de gresta el cara el cara el cara el cara el cara el cara el cara de cara el cara de cara el cara el cara el cara el cara el cara el cara el cara el cara el cara el cara el cara
Tammisaa Pietarsaari Kristiinarik	in 753 1 532 Gupunki 500	Count: Average length:	4	

Historical research insights (Salmi et al. 2020):

- Publishing hubs emerging from TR data confirm results from previous studies.
- Increase in virality of news is linked to technological progress at end of 19C (rail, telegraph, telephone)
- Long-term reuse of texts: news travelling slowly over long periods of time → press becomes archive, repertory, "platform for cultural memory".

Text Reuse in Finnish Newspapers and Journals, 1771–1920

TEXT REUSE AT SCALE

Some ideas for this workshop.

NEEDLE-IN-THE-HAYSTACK PROBLEM



S. Sachsalber, Inside, Paris 2014. (image source)

Impresso TR data: very large and still too noisy to be analysed. Double strategy:

- Provide effective ways to filter out uninteresting things
- Make it easier for the user to spot the interesting things (e.g. long term reuse, viral articles in a collection)

Criteria for filtering:

- Average passage length (of a cluster)
- Lexical overlap (find a meaningful threshold)
- Predominant type of content items

VIRALITY IN IMPRESSO

- Virality: unharvested low-hanging fruit
- Suitability of impresso corpus (?)
- Tension: generic vs specialised interface

Historical research questions:

- What type of texts circulated virally *across* countries as opposed to *within* countries?
- Which newspapers/cities/cantons played a primary role in spreading viral news?
- Similarities/differences wrt (re)printing cultures in other countries (FI, US)?

Visualisation ² Geographical map, with arcs for flows of news (reprints) + time-based animation.



Arc layer in Kepler.gl (<u>source</u>)

NETWORKS OF TEXT REUSE

Currently, no high-level "picture" of reuse dynamics in our corpus.

Graph-based visualisations for impresso's TR data could help:

- Cluster level \rightarrow clarify genealogical relationships between clusters
- *Corpus level* \rightarrow explore the network of reuse (hubs, communities)

Characterisation of reuse relationships through semantic enrichments (topics)



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