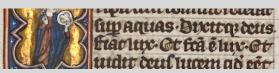


Assembling Legacy Data for Al: the Case of the Paris Bible Project



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> **Futurs Fantastiques, BnF** 09/12/2021

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OUTLINE

- 1. Our Source Material & Collaboration
 - What is a Paris Bible?
 - Paris Bibles as a Collection
- 2 Assembling Legacy Data for AI
 - Gathering Data and Images
 - Challenges of Legacy Data
- 3 Understanding Digital Collections with AI
 - HTR-centered Workflow
 - Some High Level Results
- 4 Collaboration and AI Research for Culture
- Conclusion: What is the Promise of HTR for Other Archival Situations?



BnF Latin 10422 115x90 cm



BnF Latin 40 255x180 cm



BnF Latin 11 425x300 cm

A Museum-University Collaboration for Studying Paris Bibles...

- One of the first mass-produced objects.
- Emerged in the 13th century, following the foundation of European Universities, specifically Paris.
- Spread in Europe during two centuries, with thousands n institutions worldwide.
- Books usually not signed, often portrayed as uniform:
 - Shared layout
 - New division of biblical books, following scrupulously the same order.
 - Increased number of abbreviations added to a smaller font size and more lines on the pages with a division in two text columns.
- Script somewhat specific to regions/workshops.
- This diversity in "uniformity" plus the scale of the archive makes it a perfect test case for machine learning
- BUT... we are not working with existing structured data, but creating unstructured textual data from HTR



Paris Bibles as Collection

- Evolution in book history. Paris Bibles...
 - were objects for individuals, for studying, teaching or preaching purposes.
 - have not traditionally been a particular medieval collection, or created to be part of a collection. To our knowledge, there have not been collections of fully digitized ones.
 - became a "must-have": today most modern cultural institutions possess at least one, and some historical libraries, many.
 - are not digitised and found in one place..

Digital Collections

- We are creating a **curated digital collection**.
- We are **not** building a digital collection in our institution-s, but collecting from across institutions.
- Our curation principles have machine learning in mind.







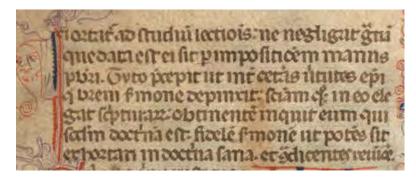
Vatican Apostolic Library





Gathering Data and Images

- Understanding where the Paris Bibles are
- Identifying metadata and denominations:
 - Biblia sacra
 - Pariser Normbibel
 - Bibbia dell' università
 - Universitetsbibel
 - Or even general denomination "Bible"
- Choosing sections of Bibles, if fully digitized.
- Isolating text from fragments or partial digitization.
- Challenge: document management and conflicting metadata



Biblioteca digital hispanica: Madrid, BNE 12906, 2r



Biblioteca nazionale centrale di Roma, Ms.Vitt.Em.825, 1r



e-codices: Aargau Cantonal Library, MsWettF 11, 1r

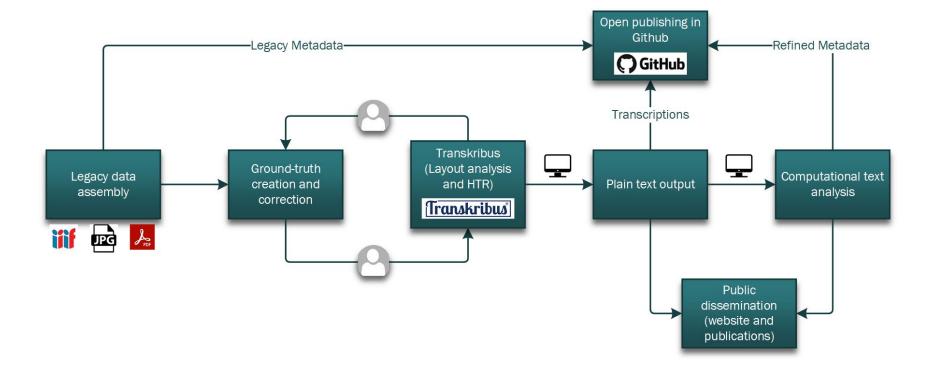
Challenges of Legacy Data

- creating ground truth is a time consuming process (there is little or none with all the features of interest to us)
- with high quality ground truth created based on one or two manuscripts, applying the models to new scenarios led to overfitting
- Ideal of creating a generic model that works across all possible manuscripts is a complex endeavor.
 - is more data the answer?
 - are sub-models the answer?
- On top of these question of the creation of ground truth, many issues are encountered with medieval manuscripts owing to layered histories of digitization:
 - Quality unequal from copy to copy (not so much a machine problem as a human one)
 - Metadata: Can we trust it? Need to start with well known documented mss
 - what is difficult for a machine might not be the same for humans
 - Making the objects comparable, finding a middle ground

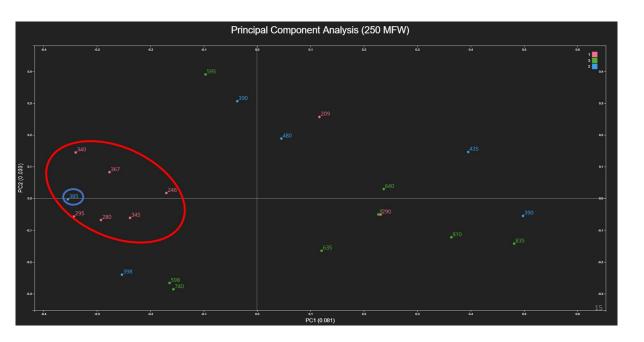
HTR-centered Workflow

- HTR we have such a controlled corpus (uniformity of layout, of base text, narrow possibilities for paleographic) that we can aim for very low consistent CER.
- Other medieval and non medieval textual examples → higher paleographic difference will mean need for more HTR training and more keyword spotting approach.

• Such work is of a scale that is prohibitive for researchers -- need HTR

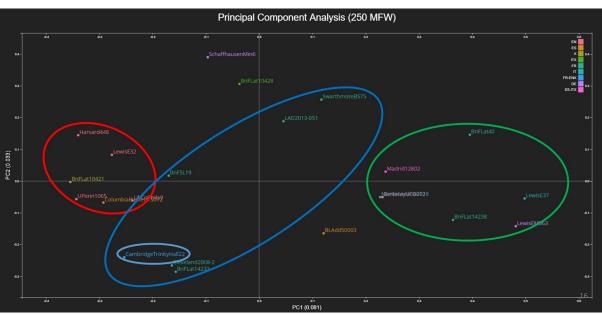


Principal Component Analysis (250 MFW) Output Output



Some High Level Results

- Expectations: The use of abbreviations and special letter forms is specific to every scribe.
- Exciting findings:
 - Size of manuscripts seems to matter
 - regional patterns of abbreviation exist
 - Abbreviation patterns are highly localizable -- to scribe or a workshop











Collaboration and AI Research for Culture

- Timelines for research between university and museum are not the same.
- Funding in different institutions is not balanced.
- Project management for remote work was particularly important.
- Happy consequence of a tricultural project team, for understanding better the ways in which such collections are organized and described.
- Interlocking question of diversity: diversity of cultural knowledge about collections and how that diversity can benefit the models we train.
- But having members from those different environments did not assure us that we found everything, including GT from different manuscripts did not assure better output.



Conclusion: What is the Promise of HTR for Other Archival Situations?

- HTR has great promise for medieval archives, or for any other voluminous handwritten collections
- However, remember that our scenario works relatively well since we are working with a corpus in which the domain is stable and the form is somewhat uniform
- There are plenty of medieval textual traditions with large numbers of manuscripts (*De consolatio philosophiae, Legenda aurea, Roman de la Rose*, etc.)
- BUT these have a very large spatio-temporal imprint, are found in many hands, many layouts, etc.
- You need to have a clear question in mind so that you design your research instrument clearly to know how AI/HTR will give you results which are useful to you, at the level of desired granularity.

Thank you for your attention!

Merci de votre attention!

شكراً لإتبهكم!



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