Authorship Attribution and the Federalist Papers









Hamilton

Madison

Jay

Summary:

You will replicate and extend the authorship attribution experiments of Jockers and Witten (2010) on the Federalist Papers. The **Federalist Papers** are "a series of <u>85 articles</u> or essays advocating the <u>ratification</u> of the <u>United States Constitution</u>" (Wikipedia, 2011). In particular, you will use a number of machine learning techniques to gather evidence as to who *may have* written the twelve disputed papers and the three co-authored papers.

(0) Read Matt Jockers and Daniela Witten's 2010 paper (see the starter kit for a .pdf of the paper). Which of the 85 papers gave some machine learning techniques a challenge? (that is, for papers where we *know* the author but the models often got them wrong?) Which author is most often attributed to the Disputed papers? You don't have to exactly replicate these results, but they

In the PRESS,
and speedily will be published,
THE
FEDERALIST,
A Collection of Estays written in sa
yor of the New Constitution.
By a Cliesten of New Terk.
Corrected by the Author, with Additions
and Alternitons.
This work well be private on a few Peper
and god Type, in one handlines Fichine dudetons, and deterred to spleniter at the
motivate private of one deliver, in Spleniters at the
motivate private of one deliver, or figure or private
private of the Millery.
To render this work more complete, will be
added, subthest any additional sepace,
BHILO-PUBLIUS,
AND THE
Articles of the Convention,
As agreed apar at Poliedsiphia, Equinber 17th, 1727.

Methods

Workflow Part I – The Beginning Game

form a "benchmark" set of results.

(1) Typically, you'd have to (a) find the digitized texts, (b) fix Optical Character Recognition (OCR) and/or other "errors", (c) parse the text, (d) count the words in each text, (e) save the proportion of counts in a dictionary, and (f) export the "matrix" to a .csv file. But "hear yea, hear yea" ... this part has been done for you. See the files:

Note: these files were produced with the *Lexos* web app (Kleinman *et al.*, 2019). For each file, **scrubbing settings were**: whitespace (newlines, tabs, runs of spaces) denote "word" boundaries; convert everything to lowercase; remove digits; remove any punctuation *except* keep apostrophes, so for example we'd keep "we'd" as one token); hyphens were removed; no stop words were removed. You must include this language in your report.

The initial file has proportional counts of "single" (1-gram) words that appear in all of the 85 texts. The second file has the proportional counts of "word pairs" (bigrams or 2-grams). This second file may contain some bi-grams that do not always appear in each text, that is, some zeros may appear if an author did not use that bi-gram in a specific text. Rows are for each text and the columns indicate the word usage proportions for each "token" used in that text.

(2) **Refining the data:** The given datasets may not be completely ready for "prime time". As always, you should explore, check, and refine your starting data. For example, do you like the orientation of your pandas data frame? Do you want the rows that show the Totals and Averages? Should you even keep the Co-Authored texts when building a model? Remember, we are most interested in seeing if (a) our models can correctly predict authorship *for the authors we know* and if so, (b) what do our models predict for the Disputed and/or Co-Authored texts?

Regarding culling of features (e.g., 1-gram words or bi-grams), what if a "token" was only used once in one of the texts? Would it be better to only keep words (tokens) that are used by each of the authors at least once within one of their texts? Or perhaps you want to be more stringent and only keep words that are used in all the texts at least once? (As indicated on the previous page, these culling decisions have already been made; make sure you indicate these in your report in order for someone to replicate your results).

Workflow Part II - The "Middle Game"1

Using 1-grams initially and then using bi-grams:

- (3) confirm the authorship of papers when we know the author using:
 - (a) a clustering technique
 - (b) a classification technique
- (4) generate evidence of predicted authorship for the disputed and co-authored papers using:
 - (a) a classification technique
 - (b) add additional classification methods

Workflow Part III - Discussion

(5) Write up the results of your experiment in a Jupyter Notebook. You are *not* proving authorship, but ... do you have evidence as to who might have written the disputed Federalist Papers?

References

Jockers, M.L. and Witten, D.M. (2010). A comparative study of machine learning methods for authorship attribution. *Literary and Linguistic Computing*, v25(2), p215-223.

Kleinman, S., LeBlanc, M.D., Drout, M., and Zhang, C. (2019). Lexos v3.2.0. https://github.com/WheatonCS/Lexos/.

¹ The year I lived in Australia (2004-2005), I met the late digital humanities pioneer Dr. John Burrow's who devised the Delta authorship attribution technique. John was very modest about his computational techniques, calling them *only middle game* techniques. That is, there is much scholarship to do at the start, we then perform computational experiments to generate some evidence, but then there is still much scholarship to do afterwards.