

LING 410X: Language as Data

Semester: Spring '18

Instructor: Sowmya Vajjala

Iowa State University, USA

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Class Outline

- ▶ Quick recap of text classification
- ▶ Quick recap of what we learnt in R and text analysis so far
- ▶ Ideas for final projects, expectations etc.
- ▶ Discussion
- ▶ Mid-term feedback

Text Classification Review

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- ▶ We learnt about using tm.
- ▶ We saw how to use a "learned" classification model to predict categories for new data.
- ▶ We also saw how to understand whether our classifier is doing well or not.

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- ▶ Is it possible to increase the training data? Is "not having enough data" the main problem?
- ▶ Should I try other classification algorithms?
- ▶ Should I go beyond words ("don't like" as a feature is not the same thing as "don't" and "like" being separate words)

Text Classification: more details

For a little bit of theoretical background, I would suggest reading the following chapter from a standard Natural Language

Processing textbook:

<https://web.stanford.edu/~jurafsky/slp3/6.pdf>. You will need to know a little bit about probability to understand this.

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7. creating and evaluating text classification models, given a dataset.

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6. Creating basic plots: plot
7. lexical variety: sum, length functions
8. others: using rbind, cbind, sapply, lapply etc

Other useful things

1. writing our own R functions
2. writing a for loop
3. R markdown

So many of them - how to keep track?

- ▶ Attend classes regularly. Maintain notes.
- ▶ Spend some time with lecture slides/tutorials; Have a DIY attitude
- ▶ Use R outside classroom, and not only for doing assignments
- ▶ Be organized - have a folder structure in your computer. Keep all code in one place.
- ▶ Participate in the class, discuss in the forums, meet during office hours.

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"Education is the only business where customers pay more and expect less" - one day, I hope that will be proven wrong!

Final Projects - Discussion

Final Projects for the course: Expectations

- ▶ grade weightage: 25%
- ▶ Individual or group projects (Group projects are preferred, with group size being 2 or 3 max).
- ▶ Aim: choose some text dataset, explore a micro/meso/macro text analysis problem, and use some visualizations to summarize information from text.
- ▶ initial report (explaining what dataset you will use, what you will do with it, how you plan to do it): Due on 7th April - 5%
- ▶ presentation in the class in the last week of classes - 5%
- ▶ submission of your report about the project (with visuals, relevant R code etc) in exams week - 15%

Some ideas for project tasks

My final projects example descriptions document on Canvas.

Some Datasets

- ▶ Some data repositories for classification problems - look for text data in these
 - ▶ <https://goo.gl/UUkNZ1>
 - ▶ <https://goo.gl/3nKyAQ>
- ▶ For topic modeling:
 - ▶ Topic modeling datasets for humanities:
<https://de.dariah.eu/tatom/datasets.html>
 - ▶ Clinton-Trump tweets dataset: <https://www.kaggle.com/benhamner/clinton-trump-tweets>
 - ▶ Congressional speech data: <http://www.cs.cornell.edu/home/llee/data/convote.html>
 - ▶ Presidential speeches transcripts from Miller Center
<https://millercenter.org/the-presidency/presidential-speeches>. A project that is related to this:
<https://github.com/BBischof/speaksLike>

Rest of this class

- ▶ Think about some ideas for this course project (Take a look at Canvas document!)
- ▶ Talk to others, see if you want to form groups (strongly encouraged)
- ▶ try to connect what you learn about in your own disciplines to this course and formulate some project ideas that will be relevant for you in future (in course work, in job applications in future etc).
- ▶ Present your ideas in class on Thursday (Don't miss the class!).
- ▶ You don't need to prepare slides (you can, if you want). The idea is to discuss some ideas, and get some feedback from others.
- ▶ Keep in mind: there is only a limited amount of time. Don't think about impossible ideas.

Mid-term Feedback

- ▶ Please fill up the mid-term feedback.
- ▶ It is primarily for me to get some feedback, as there is still enough time to get better.
- ▶ It is also for you to think about how you are doing, and how you can improve.

Next class

- ▶ Discussion about your project ideas
- ▶ Today's attendance question: Try to look around, and, explain what a `do.call()` function does in R, with an example.
- ▶ There will be time allotted to do Assignment 4 in the class.