DATA.STAT.840 Statistical Methods for Text Data Analysis

Exercises for Lecture 11: Visualization and feature extraction

Exercise 11.1: Principal component analysis of four newsgroups. Using the same data as in exercise 6.1 (four newsgroups), use principal component analysis to reduce the TF-IDF vectors of the documents (as computed in exercise 6.1) to two dimensions.

Plot the resulting two-dimensional vectors; plot the documents of the different four newsgroups with different colors. Discuss the results: does the PCA plot tell something about the distribution of the document features?

You can use the Python implementation discussed on the lecture (lecture 11, slide 4), or another language/library of your choice. Report your code, the resulting plot, and your discussion.

Exercise 11.2: t-SNE plot of four newsgroups. Using the same data as in exercise 6.1 (four newsgroups), use the t-distributed stochastic neighbor embedding (t-SNE) method to reduce the TF-IDF vectors of the documents (as computed in exercise 6.1) to two dimensions.

Plot the resulting two-dimensional vectors; plot the documents of the different four newsgroups with different colors. Discuss the results: does the t-SNE plot tell something about the distribution of the document features?

You can use the Python implementation discussed on the lecture (lecture 11, slide 7), or another language/library of your choice.

- Hint 1: If the t-SNE computation takes too long on your computer, it is ok to use a subset of the documents, e.g. 1000 or 500 samples.
- Hint 2: If the plot looks like a central mass of points and isolated groups of points very far from the center, the far-away groups may be outliers: in that case, you can set the axis limits of your plot to focus on the central group. In Python, if you created a myaxis object using matplotlib.pyplot.subplots(), then you can set the axis limits by myaxes.axis([-50, 50, -50, 50]) where the first two numbers are the horizontal minimum and maximum and the last two are the vertical minimum and maximum.

Report your code, the resulting plot, and your discussion.

Exercise 11.3: Word embedding. In this exercise we use the same data as in exercise 8.1 (provided in "hmm_sentences.txt" for that exercise, one sentence per line, and also in the current exercise package; in the current package we also provide a subdirectory "hmm_sentences" with the same data as separate files for each sentence). Note: you do not need to prune the vocabulary of these texts since it is so small already.

Using the gensim library as in lecture 11 slide 24, or using another language/library of your choice, create 5-dimensional word2vec embeddings for the data. Use a window size of 3 words.

Report the resulting embeddings (vectors) for the words "where", "dog", and "explain".