CSE 255

Data Mining and Predictive Analytics

- Open-ended
- Due Feb 23 (four weeks from today)
- Submissions should be made electronically to Dongcai (doshen@cs.ucsd.edu)

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Basic tasks:

- 1. Identify a dataset to study
- 2. Identify a predictive task on this dataset
- 3. Describe literature relevant to the task
- Identify features that will be relevant to the prediction task at hand
- Develop a model for the task and run experiments
- 6. Describe results and conclusions

1. Identify a dataset to study

Amazon data

(http://snap.stanford.edu/data/web-Amazon-links.html)

Beer data

(http://snap.stanford.edu/data/Ratebeer.txt.gz)

Wine data

(http://snap.stanford.edu/data/cellartracker.txt.gz)

Google Local (Maps & Restaurants)

(http://jmcauley.ucsd.edu/data/googlelocal.tar.gz - warning: kind of huge)

Reddit submissions

(http://snap.stanford.edu/data/web-Reddit.html)

1. Identify a dataset to study

Reddit submissions

(http://snap.stanford.edu/data/web-Reddit.html)

Facebook/twitter/Google+ communities

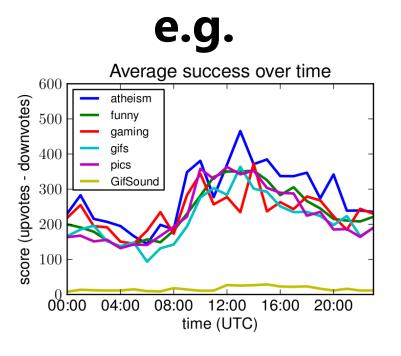
(http://snap.stanford.edu/data/egonets-Facebook.html
http://snap.stanford.edu/data/egonets-Twitter.html)

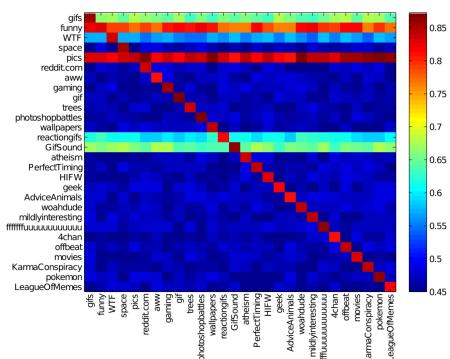
Many many more from other sources, e.g.

http://snap.stanford.edu/data/

Use whatever you like, as long as it's **big** (e.g. 50,000 datapoints minimum)

1b: Perform an **exploratory analysis** of this dataset to identify interesting phenomena





2. Identify a predictive task on this dataset

- How will you evaluate the model?
- What are the relevant baselines that can be compared?
- How will you assess the validity of your predictions and confirm that they are significant?

3. Describe related literature

- If you used an existing dataset, where did it come from and how was it used there?
- What other similar datasets have been used in the past and how?
- What are the state-of-the-art methods for the prediction task you are considering? Are any of them suitable to implement for comparison?

4. Identify features that will be relevant to the task at hand

- Why do you expect the chosen features to be useful for prediction?
- Your exploratory analysis of the data should justify the features you have selected
- What pre-processing of the data was necessary to select or manipulate the features?

5. Describe your model

- How will you optimize it?
 - What issues did you face scaling it up to the required size?
 - Any issues overfitting?
- What other models did you consider besides the one you proposed (and what were your unsuccessful attempts before arriving at the right model)?
- What are the strengths and weaknesses of the different models being compared?

6. Describe results and conclusions

- How well did your model perform compared to alternatives?
- What is the significance of the results?
- Are they robust to noise in the data, mislabeled examples etc.?
- What is the interpretation of the parameters in your model? Which features ended up being predictive?
- Why did the proposed model succeed while others failed?

Example

Maybe I want to use **restaurant data** to build a model of people's tastes in different locations

(http://jmcauley.ucsd.edu/data/googlelocal.tar.gz)

- 1. Perform an **exploratory analysis** of this dataset to identify interesting phenomena
- How many users/items/ratings are there? Which are the most/least popular items and categories?
- What is the geographical spread of users, items, and ratings?
- Do people give higher/lower ratings to more expensive items, or items in certain countries/locations?

2. Identify a predictive task on this dataset

- Predict what rating a person will give to a business based on the time of year, the past ratings of the user, and the geographical coordinates of the business
- Predict which businesses will succeed or fail based on its geographical location, or based on its early reviews

3. Describe related literature

- Relevant literature or predicting ratings
- Literature on using geographical features for various predictive tasks
- Literature on predicting long-term outcomes from time series data
- Literature on predicting future ratings from early reviews, herding etc.

4. Identify features that will be relevant to the task at hand

- Ratings, users, geolocations, time
- Ratings as a function of price
- Ratings as a function of location
 - How to represent location in a model? Just using a linear predictor of latitude/longitude isn't going to work...

5. Describe your model

- E.g. Adapt collaborative filtering techniques to include a geographic regularizer
- Adapt long-term forecasting techniques to make use of user and rating information
- Analyze the text of people's reviews to predict linguistic signals of popular and successful businesses

6. Describe results and conclusions

- Did geographical information help? If not why not?
- Which locations are the most price sensitive?
- Do people prefer restaurants that are unlike anything in their area, or restaurants which are exactly the same as others in their area?

More examples

A similar type of project from Stanford's "Social and Information Network Analysis" course:

http://snap.stanford.edu/class/cs224w-2013/projects.html

Evaluation

- These 6 sections will be worth (roughly) 5 out of 30 percent each
- Not all sections will be relevant for all assignments so there
 is some flexibility, but be reasonable
- Assignments can be done individually or in pairs, though
 if done in pairs the expected contribution should be larger
- Length is not strict, but I'd expect a report of about 6-10 pages (more like 6 for individuals, more like 10 for pairs)
- This probably adds up to 3-5k words (plus figures tables, equations etc.)