Final Project Guidelines

Your class project is an opportunity for you to explore an interesting machine learning problem of your choice in the context of a real-world data set. Below, you will find some datasets, and you are encouraged to propose your own idea.

- Pick a real-world problem, describe your dataset, define your machine learning problem, apply a machine learning technique, and present the results. You are highly encouraged (not required) to use a large-scale dataset, i.e., over 100K data instances.
- Projects can be done individually, or in teams of two students. For a group, group
 members are responsible for dividing up the work equally and making sure that each
 member contributes.
- If you are having trouble writing a proposal or executing the project, please feel free to consult with the instructor (yfang@scu.edu).

Your project will be worth 20% of your final class grade, and will have three deliverables:

- Proposal, May. 8, Week 6, Friday at noon: 1 page (20%)
- Presentation, Week 10, Friday at noon (30%)
- Final Report, Week 11, Friday at noon (50%)

Your project will be evaluated based on several factors including:

- The presentation of your project
- The extensiveness of the study and experiments. A project that involves well-designed experiments with competitive baselines and thorough analysis of the experimental results are scored highly.
- The writing and the clarity of the final report.

Project Proposal

Include the following information:

- Project title
- Data set
- Project idea
- The approach you will use
- Software you will use
- References.
- Teammate (if any).
- Timeline.

Suggestions of Project Ideas:

Machine Learning for COVID-19:

• Data and Resources:

https://sites.google.com/view/data-science-covid-19/data-and-resources?authuser=0

Text

Autonomous Tagging of StackOverflow Questions

- Make a multi-label classification system that automatically assigns tags for questions posted on a forum such as StackOverflow or Quora.
- o Dataset: <u>StackLite</u> or <u>10% sample</u>

Keyword/Concept identification

- o Identify keywords from millions of questions
- o Dataset: StackOverflow question samples by Facebook

• Topic identification

- o Multi-label classification of printed media articles to topics
- o Dataset: Greek Media monitoring multi-label classification

Natural Language Understanding

Automated essay grading

- o The purpose of this project is to implement and train machine learning algorithms to automatically assess and grade essay responses.
- o Dataset: Essays with human graded scores

• Sentence to Sentence semantic similarity

- o Can you identify question pairs that have the same intent or meaning?
- o Dataset: Quora question pairs with similar questions marked

• Fight online abuse

- o Can you confidently and accurately tell whether a particular comment is abusive?
- Dataset: Toxic comments on Kaggle

Open Domain question answering

- Can you build a bot which answers questions according to the student's age or her curriculum?
- o <u>Facebook's FAIR</u> is built in a similar way for Wikipedia.
- Dataset: <u>NCERT books</u> for K-12/school students in India, <u>NarrativeQA by</u> Google DeepMind and SQuAD by Stanford

Social Chat/Conversational Bots

- Can you build a bot which talks to you just like people talk on social networking sites?
- o Reference: Chat-bot architechture
- o Dataset: Reddit Dataset

Automatic text summarization

- Can you create a summary with the major points of the original document?
- Abstractive (write your own summary) and Extractive (select pieces of text from original) are two popular approaches
- o Dataset: <u>CNN and DailyMail News Pieces</u> by Google DeepMind

Copy-cat Bot

- o Generate plausible new text which looks like some other text
- o Obama Speeches? For instance, you can create a bot which writes some <u>new speeches in Obama's style</u>
- o Trump Bot? Or a Twitter bot which mimics @realDonaldTrump
- Narendra Modi bot saying "doston"? Start by scrapping off his Hindi speeches from his personal website
- o Example Dataset: English Transcript of Modi speeches

Check mlm/blog for some hints.

• Sentiment Analysis

- o Do Twitter Sentiment Analysis on tweets sorted by geography and timestamp.
- o Dataset: Tweets sentiment tagged by humans

De-anonymization

- o Can you classify the text of an e-mail message to decide who sent it?
- o Dataset: 150,000 Enron emails

Forecasting

• Univariate Time Series Forecasting

- o How much will it rain this year?
- o Dataset: 45 years of rainfall data

• Multi-variate Time Series Forecasting

- o How polluted will your town's air be? Pollution Level Forecasting
- o Dataset: Air Quality dataset

Demand/load forecasting

- o Find a short term forecast on electricity consumption of a single home
- o Dataset: Electricity consumption of a household

• Predict Blood Donation

- We're interested in predicting if a blood donor will donate within a given time window.
- o More on the problem statement at <u>Driven Data</u>.
- o Dataset: <u>UCI ML Datasets Repo</u>

Recommendation systems

• Movie Recommender

- o Can you predict the rating a user will give on a movie?
- Do this using the movies that user has rated in the past, as well as the ratings similar users have given similar movies.
- o Dataset: Netflix Prize and MovieLens Datasets

Search + Recommendation System

- Predict which Xbox game a visitor will be most interested in based on their search query
- o Dataset: BestBuy

• Can you predict Influencers in the Social Network?

- o How can you predict social influencers?
- Dataset: PeerIndex

Vision

• Image classification

- Object recognition or image classification task is how Deep Learning shot up to it's present-day resurgence
- Datasets:
 - CIFAR-10
 - ImageNet
 - MS COCO is the modern replacement to the ImageNet challenge
 - MNIST Handwritten Digit Classification Challenge is the classic entry point
 - <u>Character recognition (digits)</u> is the good old Optical Character Recognition problem
 - Bird Species Identification from an Image using the <u>Caltech-UCSD Birds</u> dataset dataset
- o Diagnosing and Segmenting Brain Tumours and Phenotypes using MRI Scans
 - Dataset: MICCAI Machine Learning Challenge aka <u>MLC 2014</u>
- o Identify endangered right whales in aerial photographs
 - Dataset: MOAA Right Whale
- Can computer vision spot distracted drivers?
 - Dataset: <u>State Farm Distracted Driver Detection</u> on Kaggle

• Bone X-Ray dompetition

- o Can you identify if a hand is broken from a X-ray radiographs automatically with better than human performance?
- o Stanford's Bone XRay Deep Learning Competition with MURA Dataset

Image Captioning

- o Can you caption/explain the photo a way human would?
- o Dataset: MS COCO

• Image Segmentation/Object Detection

- Can you extract an object of interest from an image?
- o Dataset: MS COCO, Carvana Image Masking Challenge on Kaggle

• Large-Scale Video Understanding

- o Can you produce the best video tag predictions?
- o Dataset: YouTube 8M

• Video Summarization

- o Can you select the semantically relevant/important parts from the video?
- o Example: Fast-Forward Video Based on Semantic Extraction

 Dataset: Unaware of any standard dataset or agreed upon metrics? I think <u>YouTube 8M</u> might be good starting point.

• Style Transfer

- o Can you recompose images in the style of other images?
- Dataset: fzliu on GitHub shared target and source images with results

Chest XRay

- Can you detect if someone is sick from their chest XRay? Or guess their radiology report?
- Dataset: MIMIC-CXR at Physionet

• Face Recognition

- Can you identify whose photo is this? Similar to Facebook's photo tagging or Apple's FaceId
- o Dataset: <u>face-rec.org</u>, or <u>facedetection.com</u>

• Clinical Diagnostics: Image Identification, classification & segmentation

- Can you help build an open source software for lung cancer detection to help radiologists?
- o Link: Concept to clinic challenge on DrivenData

• Satellite Imagery Processing for Socioeconomic Analysis

- Can you estimate the standard of living or energy consumption of a place from night time satellite imagery?
- o Reference for Project details: Stanford Poverty Estimation Project

Satellite Imagery Processing for Automated Tagging

- o Can you automatically tag satellite images with human features such as buildings, roads, waterways and so on?
- Help free the manual effort in tagging satellite imagery: <u>Kaggle Dataset by DSTL</u>, UK

Reinforcement Learning

• Deep Q Learning

- o Can you make AI play games and automate stuff by learning in an environment.
- o Environments (dataset of Reinforcement Learning) OpenAI GYM
- T-REX Chrome Dino BOT <u>Git Repo</u>

• Music/Audio Recommendation Systems

- o Can you tell if two songs are similar using their sound or lyrics?
- o Dataset: Million Songs Dataset and it's 1% sample.
- o Example: Anusha et al

• Music Genre recognition using neural networks

- Can you identify the musical genre using their spectrograms or other sound information?
- o Datasets: FMA or GTZAN on Keras
- o Get started with Librosa for feature extraction

Other Dataset Suggestions

- <u>UCI also has a collection of datasets</u> sorted for various tasks (Classification, Regression, etc)
- <u>Data.gov</u>: U.S. Government's open data
- KDD Cup: http://www.kdd.org/kdd-cup, annual competition in data mining, like Kaggle
- Google public datasets.
- NYC Taxi data for 2013 (FOILed by Chris Wong). 2013 Trip Data (11.0GB). 2013 Fare Data (7.7GB). Visualization for a days trip.
- Yahoo WebScope
- Freebase
- Yelp
- Numerous APIs from Google (e.g., Maps, Freebase, YouTube, etc.)
- <u>Trulia</u>, <u>Zillow</u>: real estate listing sites
- Numerous graph datasets (large and small): <u>SNAP</u>, <u>Konect</u>
- Movies data: <u>Rotten Tomatoes</u>, <u>IMDB</u>
- List of lists of datasets for recommendations.
- <u>Million song dataset by Echo Nest</u>. It contains not only the basic information of songs (artist, genre, year, length etc), but also some musical features(like tempo, pitch, key, brightness).
- The Free 'Big Data' Sources Everyone Should Know
- Quandl a dataset search engine for time-series data.
- Amazon AWS Public Data Sets (Thanks Jonathan!)
- <u>KDD Cup</u>: annual competition in data mining, like Kaggle

- Academic domain: Microsoft Academic Search, DBLP
- Retrosheet: MLB statistics (Game/Play logs)
- Classification datasets
- <u>Various geophysical datasets</u> for the oceans (magnetism, gravity, seismology, etc).
- Social trends
- Beer data
- Academic torrents (terabytes)
- Article Search API from the New York Times (all the way back to 1851!)