

## Summary

I am interested in opportunities involving the theoretical study and application of inference: Namely, algorithms, statistics, optimization, and other related fields. I am particularly interested in natural language and neuroscience applications. Currently, I am a member of:

- [Unsupervised Learning Group](#) under Professor Sanjeev Arora.
- [Princeton Neuroscience Institute](#) under Professor Ken Norman.

## Education

**Princeton University**, September 2016 - June 2017 (expected)

M.S.E. Computer Science

Advisor: Professor Sanjeev Arora

*Relevant Coursework:* graduate probability and statistics, graduate high-dimensional probability, sum-of-squares optimization seminar

**Princeton University**, September 2012 - June 2016

A.B. Mathematics with honors (Major GPA: 3.96), Computer Science Minor

*Relevant Coursework:* graduate algorithms and machine learning, neural networks, learning theory, online convex optimization, information theory, coding theory and random graphs, linear algebra, probabilistic modeling, natural language processing, functional programming, programming languages, systems programming, game theory, graph theory, point-set and basic algebraic topology, complex analysis, group and Galois theory, real analysis, metric embeddings, geometric inequalities, cognitive modeling

## Interests

### Theoretical Computer Science

Matrix/Tensor Decomposition, Reinforcement Learning, Representation Learning, Unsupervised Learning, (Nonconvex) Optimization, Dimension Reduction, Randomized/Approximation Algorithms, Generative Probabilistic Models

### Applied Inference

Natural Language Understanding, Computational Neuroscience, Computer Vision

## Research Projects

### Mapping Between Natural Movie fMRI Responses and Word-Sequence Representations (with [Sanjeev Arora](#) and [Ken Norman](#), Summer 2016—Sept. 2016)

This work is a continuation of my senior thesis, achieving much better results than previously. It was recently accepted as a full paper ([\[arXiv pdf\]](#)) and poster to the [NIPS 2016 Workshop on Representation Learning in Artificial and Biological Neural Networks](#). In the submission, we provide support for the notion that distributional methods of representing word meaning from computational linguistics are useful for capturing neural correlates of real life multi-sensory stimuli, where the stimuli—in this case, a movie being watched by the human subjects—have been given text annotations. Learned orthogonal linear maps between the fMRI and semantic representations allow us to successfully transform fMRI data generated by a natural movie stimulus into semantic vectors representing textual descriptions of the movie. We succeed at a scene classification task with 76% accuracy, over a 20% chance rate.

**Low-dimensional Representations of Semantic Context in Language and the Brain** (with [Sanjeev Arora](#) and [Ken Norman](#), Fall 2015—Spring 2015)

My senior thesis, advised by Prof. Arora and Prof. Norman (from Princeton Neuroscience Institute), builds a model for extracting low-dimensional representations of the semantic content of an fMRI signal recorded during the presentation of stories in various formats. The key result in my work was a good decoding accuracy from a shared fMRI response space (constructed using the [Shared Response Model](#)) to a semantic space encoded by word-context vectors. Additionally, I was able to verify that the Default Mode Network (DMN) does represent some semantic signal more so than other areas of the brain. This work was both a poster and selected for presentation at the ICML 2016 [Workshop on Multiview Representation Learning](#).

**Sparse, Low-dimensional and Multimodal Representations of Time Series for Mind-Reading** (for [COS 513](#), Fall 2015—Summer 2016)

This work is joint with Lydia Liu (Princeton ORFE '17) and Niranjani Prasad (Grad Student, Princeton CS Department). We investigated the application of sparse canonical correlation analysis (sCCA) as a tool for creating low-dimensional combined representations of EEG/MEG and fMRI brain data. We used two experiments to demonstrate that our low-dimensional representation retained useful information by testing on two datasets: One was a paired EEG-fMRI time series oddball response dataset and the other was a paired MEG-fMRI time series dataset of subjects looking at various types of objects ([\[Cichy et. al, 2014\]](#)). In both instances we outperformed other traditional methods of low-dimensional representation, including PCA and ICA. We submitted our work as a project for [COS 513: Foundations of Probabilistic Modeling](#), taught by Prof. Barbara Engelhardt, and are now in the process of submitting this paper for publication in a peer-reviewed journal.

**Learning Shifting Communities Online in the Adversarial Block Model** (for APC 529, Fall 2015)

For the final project in APC 529: Coding Theory and Random Graphs, taught by Professor Emmanuel Abbé, I analyzed the Stochastic Block Model (SBM) from the perspective of online optimization, making use of recent results in the online learning of eigenvectors and the exact recovery setting of the SBM to build a framework for learning communities as they change over time with guaranteed regret bounds.

**Solving Word Analogies with Convex Optimization** (with [Elad Hazan](#), Spring 2015)

My final project for [COS 511: Theoretical Machine Learning](#) investigated convex loss functions for learning word vectors to solve word analogy problems. Word analogies are of the form king:man :: queen:woman. Given three of the four words, the task is to correctly identify the fourth. Traditionally, this problem is approached in the unsupervised setting and texts are used to learn which words are most relevant. Word vectors, word representations in high-dimensional real space, are often used (particularly in the past few years) as a solution to the analogy problem via dot-product queries, an approach which has recently been validated by [\[Arora et al \(2015\)\]](#). I formulated a convex loss with which to train word vectors that in principle keeps the spirit of the dot product query intuition, implemented AdaGrad [\[Duchi et al \(2011\)\]](#), and trained on word pairs.

### **Comparing Hebbian Semantic Vectors Across Language** (for [NEU 330](#), Spring 2015)

My final project for NEU 330, Connectionist Models, focused on building Hebbian neural network word vector models for parallel corpora, with the purpose of evaluating the word vectors based on how similarly the word vectors for translation pairs behaved in their respective corpora. The principle I held throughout the project was simply that changing language should essentially not effect the representation of a word/concept in a high-dimensional vector space. I both proposed methods of evaluation and made use of previously used metrics to evaluate the 9 models considered. The texts used to form the word vectors were Harry Potter and The Philosopher’s Stone and its French counterpart. This project won a prize for being the best in the class.

### **Noun Compounds in Semantic Quad-Space** (with [Christiane Fellbaum](#), Fall 2014)

My junior independent work with Dr. Christiane Fellbaum aimed to build a model for analyzing the similarity between noun compounds, which consist of a modifier noun and a head noun, like “life force.” Accurate parsing can greatly improve question answering systems for various knowledge bases. I looked at several approaches to analyzing the similarity of noun compounds and built a vector space model of noun compounds, inspired by the papers [\[Turney 2013\]](#) and [\[Fyshe et al 2013\]](#). I extended Turney’s dual-space model to a quad space model and ran it on two large corpora, [COCA](#) and [GloWbE](#). I then evaluated the results by comparing to a ground truth provided by Amazon Mechanical Turk workers. My model achieved 88% accuracy on predicting human judgement of noun compound similarity, improving upon another paper’s model. In March 2015, my work won a **school-wide award** as a top project out of 100+ nominations by faculty and other students. The 25-under-25 award recognizes particularly good layman-friendly presentations of innovative research.

### **Estimating Trending Twitter Topics with Count-Min Sketch** (for [COS 521](#), Fall 2014)

My final project for [COS 521: Advanced Algorithms](#) was joint with Evan Miller (Princeton COS ‘16) and Albert Lee (Princeton COS ‘16). We attempted to solve the following problem: Given a time series of Twitter data, can we infer current trending topics on Twitter while appropriately discounting past tweets using a sketch-based approach? We tweaked the Hokusai data structure [\[Matusevych et al 2012\]](#) and implemented our modifications, then ran experiments on Twitter data.

### **Characterizing Intellectual Interests with SVM** (with [Sam Wang](#), Fall 2013—Fall 2016)

The goal of the project is to investigate intellectual interest as a potential phenotypic marker for autism. The Simons Simplex Collection (SSC) dataset is a repository of genetic samples from families where one child is affected with an autism spectrum disorder. We had survey responses from simplex members, the parents of autistic children. The other responses were obtained by polling readers of Professor Wang’s political blog. My role in this project was to create a classifier which given a survey response could output a score indicating certainty that the survey respondent had a particular intellectual interest; for instance, the humanities. Our learned classifier had 94% accuracy for determining intellectual interest, making the survey-classifier pair potentially useful as a tool.

## **Talks**

### **ICML 2016**

Decoding fMRI: A Semantic Shared Response Model (06/2016, [Workshop on Multiview Representation Learning](#))

## Princeton University

Sequence to Sequence Learning: From Machine Translation to Dialogue Generation (09/2016, [Princeton Deep Learning Reading Group](#))

Convolutional Tensor Decomposition for Word-Sequence Embeddings (09/2016, [Alg-ML Reading Group](#))

On Lipschitz Extensions from Finite Sets (04/2016, Metric Embeddings and Inequalities Seminar organized by [Assaf Naor](#), with Misha Khodak)

The Representation of Language in the Brain (10/2015, [Alg-ML Reading Group](#))

A Brief Survey on Expander Graphs (04/2015, Junior Seminar organized by [Zeev Dvir](#))

A Survey on Image Captioning with Deep Learning (02/2015, [COS 598B](#))

A Survey on Deep Learning for NLP (02/2015, [COS 598B](#))

## Teaching

### Princeton University

AI, COS 397 (see [IW03](#), [IW05](#), [IW08](#)): Independent Work Seminars (NLP, IR, Entrepreneurship)

My responsibilities include giving feedback on research project proposals and presentations, coming up with interesting directions for students to take, and generally acting as an assistant research advisor. (Fall 2016)

Seminar Leader, NLP-ML Reading Group (Spring 2014 — Present)

Grader, [COS 226](#) (Spring 2014)

[COS Lab TA](#) (Fall 2013 — Spring 2015)

## Industry Experience

### Palantir Technologies, IQE Intern (Summer 2015)

Worked on adding support for distributed systems frameworks for machine learning pipelines with Spark, YARN, and HDFS.

### Intel Corporation, [PerC](#) Intern (June 2011 — August 2012, Summer 2013)

Worked on basic computer vision algorithms for depth-cameras analogous to Microsoft Kinect, 3D image capture, basic natural language processing, speech recognition evaluation. Investigated the feasibility of using brain-computer interfaces. Made a few gesture-based demos as well.

## Skills

### Programming Languages

Python, L<sup>A</sup>T<sub>E</sub>X, C, OCaml, Haskell, C++, BASH, Mathematica, MATLAB, Java

### Distributed Systems

Some basic experience with: Spark, YARN, HDFS

## Awards

### NSF Graduate Research Fellowship Award

Awarded March 2016 for Computer Science in the subfield Machine Learning.

### 25 Under 25 Princeton Innovation Award

I was selected as a school-wide winner for clear scientific communication of research performed for my junior paper on natural language processing. See [princetoninnovation.org/25u25/](http://princetoninnovation.org/25u25/).

### Quinn Morton '36 Finalist

I was nominated as one of 67 students in the undergraduate class of 2016 to win the Quinn Morton '36 prize, which honors the best written final papers for the required writing seminar.