

Tarun Kathuria

CONTACT INFORMATION	101, Jai Jawan Colony-3, J.L.N. Marg, Jaipur - 302018, India	E-mail: tarunkathuria@gmail.com Homepage: tarunkathuria.github.io Mobile: +91-8879346633
RESEARCH INTERESTS	Approximation Algorithms and Hardness of Approximation, Spectral Methods in Combinatorics, Randomized Numerical Linear Algebra, Geometry of Polynomials, Iterative methods for Convex and Non-Convex Optimization and their applications to Machine Learning and Database Theory	
EMPLOYMENT	Microsoft Research India , Bangalore <i>Research Fellow, Algorithms and Theory Group</i>	<i>July 2015 - Present</i> <i>Mentor: Dr. Amit Deshpande</i>
EDUCATION	Indian Institute of Technology - Bombay , Mumbai, India <i>Bachelor of Technology (Honors)</i> <ul style="list-style-type: none">• Major: Computer Science & Engineering• Minor: Applied Statistics and Informatics• CGPA: 9.08/10.00• Ranked 10th in the department (among 96 students)	<i>July 2011 - June 2015</i>
PUBLICATIONS	<ol style="list-style-type: none">1. Tarun Kathuria, S. Sudarshan. Efficient and Provable Multi-Query Optimization. <i>Proceedings of the 36th ACM SIGMOD-SIGACT-SIGART Symposium on Principles of Database Systems (PODS 2017)</i>, to appear. ArXiv:1512.025682. Tarun Kathuria, Amit Deshpande, Pushmeet Kohli. Batched Gaussian Process Bandit Optimization via Determinantal Point Processes. <i>Advances in Neural Information Processing Systems (NIPS 2016)</i>, to appear.3. L. Elisa Celis, Amit Deshpande, Tarun Kathuria, Nisheeth K. Vishnoi. How to be Fair and Diverse? <i>3rd Workshop on Fairness, Accountability, and Transparency in Machine Learning (FATML 2016)</i>, to appear. ArXiv:1610.07183	
MANUSCRIPTS	<ol style="list-style-type: none">1. Amit Deshpande, Tarun Kathuria, Damian Straszak, Nisheeth K. Vishnoi. Combinatorial Determinantal Point Processes. ArXiv:1608.00554	
(SUB)REVIEWER	<i>Conference on Learning Theory (COLT)</i> <i>Neural Information Processing Systems (NIPS)</i> <i>ACM-SIAM Symposium on Discrete Algorithms (SODA)</i>	<i>2016</i> <i>2016</i> <i>2017</i>
RESEARCH EXPERIENCE	Research Project, Microsoft Research <i>Combinatorial Determinantal Point Processes and Mixed Discriminants</i> <ul style="list-style-type: none">• Determinantal Point Processes (DPPs) are popular models in math and statistical physics. They are also used in approximation algorithms and models of diversity in machine learning. However, efficient sampling algorithms only exist for sampling from unconstrained and cardinality constrained DPPs• Provided exact sampling algorithms for DPPs constrained to partition matroids (as well as a large class of “linear constrained families”) which are poly-time when the size of the partition is constant. Algorithms based on <i>computing coefficients of curated multivariate characteristic polynomials</i> of a matrix• Showed an <i>equivalence</i> between exact counting/sampling from Partition-DPPs and mixed discriminants, which generalize permanents• Making the proof of Kadison-Singer conjecture by Marcus, Spielman and Srivastava algorithmic is currently an outstanding open problem which would involve approximately computing largest roots of “<i>mixed characteristic polynomials</i>”, which generalize mixed discriminants• Showed that our algorithms can be used to compute the larger coefficients of the mixed characteristic polynomial. Proved a <i>reduction</i> between exact computations of mixed discriminants and mixed characteristic polynomials which allows for poly-time computation of the latter in certain special cases• Working on extensions and related problems	Dr. Amit Deshpande and Prof. Nisheeth K. Vishnoi, EPFL <i>January 2016 - Ongoing</i> <i>November 2016 - Ongoing</i>
	Research Project, Microsoft Research <i>Strongly Rayleigh distributions in Approximation Algorithms and Learning Theory</i> <ul style="list-style-type: none">• Working on consequences of strongly Rayleigh distributions and negative dependence to approximation algorithms as well as some consequences to learning theory	

Undergraduate Dissertation, IIT Bombay
Efficient and Provable Algorithms for Multi-Query Optimization

Prof. S. Sudarshan
July 2014 - May 2015

- Work in the area of multi-query optimization (finding a set of common sub-expressions to materialize in order to find the optimal plan for a batch of queries) relies on *development of heuristics* which work well in practice. *No theoretical guarantees* on the quality of solution obtained by any heuristics exist so far
- Under assumptions of **submodularity** of a reformulation of the problem which is known to work well in practice, proposed an algorithm for **unconstrained normalized, submodular maximization** when the values may be negative
- **Proved an approximation factor** for the proposed algorithm. Further showed that it is NP-hard to achieve a **better approximation ratio**. Also proposed optimizations and pruning techniques for the algorithm which preserve the theoretical guarantee
- Integrated the above into **PyroJ**, a *Volcano/Cascades*-based query optimizer developed at **IIT Bombay** and observed 15 – 20% improvements over existing algorithms on benchmark queries

Research Project, Microsoft Research

Dr. Amit Deshpande and Dr. Pushmeet Kohli

Batched Gaussian Process Bandit Optimization via Determinantal Point Processes.

April 2016 - May 2016

- Optimizing noisy evaluations of an **unknown function** with only *black-box evaluation oracles* is an important problem in machine learning and a variety of disciplines
- Modelling the function as a **Gaussian process** and employing **stochastic bandit optimization techniques** to optimize by probing the function at few points has emerged as a powerful tool. However, it is desirable to run function evaluations *in parallel* while ensuring that the points probed are “far-apart”
- Showed that an existing method for batched Gaussian process bandit optimization is equivalent to modelling it as *choosing points greedily* to find the subset with maximum probability from an appropriately defined **Determinantal Point Process (DPP)**
- Based on this, proposed a **DPP-sampling** based algorithm for this problem and showed **regret bounds better than** the best known algorithms
- Implemented our algorithms and obtained *considerable improvements* for optimization of synthetic and real-world functions, e.g. *hyper-parameter optimization for extreme multi-label classification algorithms*

Research Project, Microsoft Research India

Dr. S. Sellamanickam

Evaluation of Anomaly Detectors in Data Analytics Platforms

July 2015 - December 2015

- Anomaly detectors for many modern data analysis platforms are created primarily using *loose domain knowledge*. Many such detectors may not be useful and may be misleading.
- It is, thus, desirable to *rank the detectors based on quality* and prune out bad detectors, in the **absence of accurately labelled data** from past anomalies
- Investigated properties of a restricted set of anomalies and devised an *ensemble-based model for ranking* as well as creating a more accurate detector

Internship, IBM Research Labs, Bangalore

Dr. Indrajit Bhattacharya

Large Scale Topical Analysis using the Social Network

May 2014 - July 2014

- Proposed extensions to existing **non-parametric topic modelling algorithms** to account for various relations amongst users like geographies, friend circles, achieving better accuracy than existing models
- Devised **influence-aware topic models** to capture the effect of *user information cascades* by incorporating the **Independent Cascade Model** in these models
- Implemented a preliminary version of the above in the **Hadoop** framework for large-scale Twitter analysis

Research Project, IIT Bombay

Prof. Saketha Nath & Prof. Chiranjib Bhattacharyya

Graph Learning using Orthonormal Representation

Autumn 2014

- **Proved an equivalence** between *margin complexity* of one-class SVMs and *Lovasz ϑ function* on graphs
- Explored approaches to proving the **statistical consistency** of transductive learning on graphs using *orthonormal representations* using *VC-dimension* and *Rademacher complexity* based risk bounds

ACADEMIC
DISTINCTIONS
AND AWARDS

Awarded **AP grade** for exceptional performance in *Introduction to Numerical Analysis, Electricity & Magnetism and Introduction to Linear Algebra*; awarded to **top 2 %** students at IIT Bombay

Awarded the **Institute Academic Prize** in 2012 for academic excellence at IIT Bombay

Secured 10.0/10.0 GPA in the 7th semester (Fall 2014)

Amongst the top **300 (0.1%)** to be selected for *Indian National Chemistry Olympiad, 2011*

Awarded **CBSE Merit Certificate** in *Mathematics (100% marks obtained)* & in *Computer Science* for being in the **top 0.1%** of the students taking the *CBSE 2011* high school examinations

Offered a 100 % scholarship to pursue undergraduate studies at the **Hong Kong University (HKUST)**

Awarded **A* grade** in *Mathematics, Physics, Chemistry and Information Technology (Computer Science)* in the **IGCSE 2009 (University of Cambridge International Examinations)** in the 10th grade

KEY ACADEMIC PROJECTS

Subquery optimization in PyroJ

Guide: Prof. S. Sudarshan

Autumn 2014

- Implemented algorithms for elimination of subqueries in the **PyroJ** query optimizer at IIT Bombay using ideas like the *Apply* operator from **Execution Strategies for SQL Subqueries**, Elhemali et al., SIGMOD '07
- Implemented subquery optimization using *Magic sets* as well as by re-ordering and efficient evaluation of semi-joins and anti-joins

Chess Titans

Guide: Prof. Amitabha Sanyal

Spring 2013

- Developed a one player chess game, in PLT Scheme using the DrRacket in-built GUI Toolkit
- Implemented the **Minimax algorithm** with $\alpha - \beta$ **pruning** and various clever heuristics for move determination

Twitter Sentiment Analysis

Guide: Prof. Pushpak Bhattacharya

Spring 2014

- Implemented a feed-forward with back-propagation neural network and applied it for sentiment analysis of about 50k Twitter annotated tweets
- Implemented various syntactic, semantic and stylistic features for better feature selection. Achieved the highest accuracy in the class for the same

Detecting and Classifying Geometric Shapes

Guide : Prof. Varsha Apte

Autumn 2012

- Developed an application to detect various shapes like *conics*, *lines*, *polygons* in a given image
- Implemented famous techniques like **Hough Transforms**, **Bresenham Line Drawing** and **Harris Corner Detection** along with novel approaches based on regression analysis and heuristics

Estimation of Gamma Parameters with Censored Samples

Guide: Prof. Siuli Mukhopadhyay

Autumn 2013

- Studied methods for estimation of gamma distribution parameters in censored data
- Implemented line search optimization techniques and Newton's numerical approximation methods to efficiently find the point and interval **Maximum Likelihood** estimates in Matlab

On the Complexity of Linear Prediction

Autumn 2014

Surveyed and presented literature on *risk*, *margin* and *covering number bounds* of linear classification algorithms using **Rademacher & Gaussian complexities** as part of an *Statistical Learning Theory* course

Computational Humor

Autumn 2014

Surveyed recent literature on **Computational Humor Recognition and Generation** and presented the same to a class of 90 students as part of an *AI* course, earning the **highest mark** for the same

TEACHING EXPERIENCE

Undergraduate Teaching Assistant

Summer 2013, Spring 2014, Spring 2015

Course : *Introduction to Numerical Analysis*

Prof. S. Baskar

Assisted the professor in *setting question papers and model solutions* for examinations, conducting *problem solving* sessions and invigilating for examinations for **three offerings** of the course

Undergraduate Teaching Assistant

Autumn 2012

Course : *Electricity & Magnetism*

Prof. Tomy C. V.

Assisted the professor in *setting question papers and model solutions* for examinations, conducting *problem solving* sessions and invigilating for examinations of the course

High School Teaching Volunteer

Winter 2013

Course : *Basic Programming in Java*

Taught a class of 30 students in high school about fundamentals of *Java programming* and *algorithmic thinking*

TECHNICAL SKILLS

Programming

C++, Java, Python, Julia, Ruby, Haskell, Scheme (Lisp)

Databases

PostgreSQL, Hive, Hyracks, HBase, Neo4j

Web Development

JavaScript, Rails, Django

Software Packages

Hadoop, Mahout, Matlab, OpenCV

RELEVANT COURSES UNDERTAKEN	<p>Core: Statistical Techniques in Data Mining, Implementation of Relational Database Systems, Advanced Databases, Foundations of Machine Learning, Topics in Machine Learning, Markov Decision Processes, Game Theory, Artificial Intelligence, Linear Optimization, Convex Optimization, Operating Systems, Networks, Computer Architecture, Automata Theory, Data Structures, and Algorithms, Algorithm Design</p> <p>Breadth: Calculus, Linear Algebra, Differential Equations, Numerical Analysis, Electricity and Magnetism, Chemistry, Psychology</p>	
INDEPENDENT STUDY	<p>I have studied the following courses on coursera.org</p> <ul style="list-style-type: none"> Machine Learning Probabilistic Graphical Models Algorithms - I & II Mining Massive Datasets 	
EXTRA CURRICULAR ACTIVITIES	<ul style="list-style-type: none"> Participated in Mozilla's MozBoot 2014, an overnight code contribution sprint to bootstrap developer contribution to Mozilla's large open source projects like <i>Firefox</i> & <i>Servo</i> Completed a 1 year Guitar course offered by <i>National Sports Organization</i> at IIT Bombay Solved Rubik's Cube as part of IIT Bombay's successful Guinness World Record attempt for maximum number of people simultaneously solving the Rubik's Cube Served as Editor of my high-school magazine Won various national debate competitions at the high school level Playing Chess and solving game puzzles like Sudoku & Kakuro 	
REFEREES	<p>Dr. Amit Deshpande Researcher Microsoft Research Bangalore, India e-mail: amitdesh@microsoft.com</p> <p>Dr. Pushmeet Kohli Director of Research, Cognition Group Microsoft Research Redmond, USA e-mail: pkohli@microsoft.com</p>	<p>Professor S. Sudarshan Professor IIT Bombay Mumbai, India e-mail: sudarsha@cse.iitb.ac.in</p> <p>Dr. Indrajit Bhattacharya Senior Researcher IBM Research Labs Bangalore, India e-mail: indrajitb@in.ibm.com</p>