Raghav Somani

Ph.D. candidate at

Paul G. Allen School of Computer Science & Engineering

University of Washington Advisor: Prof. Sewoong Oh ☑ September 8, 2023
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RESEARCH INTERESTS

I am interested in machine learning and optimization broadly. Particularly in characterizing fundamental quantities, phenomena, and general laws that arise due to scale.

Research Interests Machine Learning, Large-scale Optimization, Probability theory
Learning Interests Geometry and Analysis, Pure Mathematics, Quantitative Finance

EDUCATION

• University of Washington

Ph.D. in Computer Science and Engineering Advisor: Prof. Sewoong Oh

GPA: 3.90*/4

• University of Washington

M.S. in Computer Science and Engineering

Supervisor: Prof. Sewoong Oh

GPA: 3.90/4

• Indian Institute of Technology Guwahati

Bachelor of Technology in Mathematics and Computing

GPA: 9.10/10 (9.30/10 in major courses)

July '13 - June '17

June '23 - Sept '23

July '17 - July '19

May '16 - July '16

June '15 - July '15

Sept '19 - Present

March '22

WORK EXPERIENCES

• The D. E. Shaw Group - Quantitative Analyst Ph.D. Intern

Manager: Dr. Austin Benson Group - Systematic Equities

• Microsoft Research India - Research Fellow

Advisors: Dr. Praneeth Netrapalli & Dr. Prateek Jain

Project group - Provable Non-convex Optimization for Machine Learning Problems

• Microsoft Research India - Research Intern

Advisor: Dr. Sreangsu Acharyya

Project - Recommendation systems

• CAFRAL, Reserve Bank of India - Summer Research Intern

Advisor: Prof. Nagpurnanand R. Prabhala

Project - Modeling 'Economic Policy Uncertainty Index' for India

SELECTED PUBLICATIONS

Preprints

1. Path convergence of Markov chains on large graphs

S. Athreya, S. Pal, **R. Somani**, and R. Tripathi $^{\#}.$

Stochastic optimization on matrices and a graphon McKean-Vlasov limit
 Harchaoui, S. Oh, S. Pal, R. Somani, and R. Tripathi[#].
 Under review.

[arXiv]

[arXiv]

Journal Publications

 Gradient flows on graphons: existence, convergence, continuity equations S. Oh, S. Pal, R. Somani, and R. Tripathi[#]. Journal of Theoretical Probability [paper]

Conference Publications

1. Robust Meta-learning for Mixed Linear Regression with Small Batches

[paper]

W. Kong, R. Somani, S. M. Kakade, and S. Oh.

Advances in Neural Information Processing Systems (NeurIPS), December 2020.

2. Meta-learning for mixed linear regression

[paper]

W. Kong, R. Somani, Z. Song, S. M. Kakade, and S. Oh.

International Conference on Machine Learning (ICML), July 2020.

 $3. \ \, \text{Support Recovery for Orthogonal Matching Pursuit: Upper and Lower bounds.}$

[paper]

R. Somani*, C. Gupta*, P. Jain, and P. Netrapalli.

Advances in Neural Information Processing Systems (NeurIPS), Montréal, Canada, December 2018. Spotlight.

4. Clustered Monotone Transforms for Rating Factorization

paper

R. Somani*, G. Hiranandani*, O. Koyejo, and S. Acharyya.

ACM International Conference on Web Search and Data Mining (WSDM), Melbourne, Australia, February 2019.

Workshop Publications

Gradient flows on graphons: existence, convergence, continuity equations
 S. Oh, S. Pal, R. Somani, and R. Tripathi#.
 OTML workshop, Neural Information Processing Systems (NeurIPS), December 2021.

2. Non-Gaussianity of Stochastic Gradient Noise

arXiv

A. Panigrahi, R. Somani, N. Goyal, and P. Netrapalli.

SEDL workshop, Neural Information Processing Systems (NeurIPS), Vancouver, Canada, December 2019.

* - equal contribution, # - alphabetical ordering

Please visit (dblp) or (Google Scholar) for the list of all research articles.

RESEARCH PROJECTS

Scaling laws of optimization algorithms for Deep Learning

May '21 - Present

Advisors: Prof. Sewoong Oh. Prof. Soumik Pal & Prof. Zaid Harchaoui, University of Washington

[Page

- Neural Networks are large computational graphs with edge weights and permutation symmetries. We develop a theory for gradient flows on limits of such graphs that are called *graphons*, and show that Euclidean gradient flows on finite graphs converge to gradient flows on graphons. [paper, arXiv]
- We characterize scaling limits of first-order stochastic optimization algorithms on such graphs. Using graph limit theory, mean-field theory, and our developed calculus on graphons, we characterize the scaling limit as a graphon McKean-Vlasov SDEs and derive the propagation of chaos phenomenon. [arXiv]
- Measure-valued graphons are the most refined analytical limits of large weighted graphs. First order stochastic optimization algorithms, as well as a Monte Carlo Markov Chain (MCMC) algorithm (zeroth order), are shown to exhibit scaling limits that can be described using measure-valued graphon McKean-Vlasov SDEs. Interestingly, we again recover gradient flows on graphons as the scaling limit under the asymptotic zero diffusion noise limit. [arXiv]
- This is an attempt to generalize the Wasserstein calculus to higher-order exchangeable structures.

Robustness and Meta Learning for Mixed Linear Regression (MLR)

Nov '19 - Mar '21

Advisors: Prof. Sewoong Oh & Dr. Weihao Kong, University of Washington

[Page]

- Analyzed conditions under which abundant tasks with small data can compensate for lack of tasks with large data in the context of MLR. [arXiv]
- Tightened conditions using the sum-of-squares method. Worked on the robust subspace estimation.

[arXiv]

- Looked into Robust Subspace estimation for mixture distributions under the batch setting.
- \bigstar Works got accepted at ICML '20 & NeurIPS '20 respectively.

[video 1, video 2]

Optimization and Generalization in Deep Neural Networks

Advisors: Dr. Prateek Jain, Dr. Praneeth Netrapalli & Dr. Navin Goyal, Microsoft Research

July '18 - Sept '19 [Page 1, Page 2]

- Understanding the dependence of batch-size (stochasticity), over-parameterization, and optimization on the generalization properties of a variety of neural networks on real world data distributions for classification tasks.
- Analyzing the dependence of support separation, number of hidden neurons, ambient dimension of data distribution, number of training points on optimization and generalization of shallow neural networks.
- ★ A work on distributional characterization of SGD got accepted at the workshop SEDL '19 at NeurIPS '19. [arXiv]

Sparse Regression and Optimal Bounds for Orthogonal Matching Pursuit (OMP) Sept '17 - June '18 Advisors: Dr. Prateek Jain & Dr. Praneeth Netrapalli, Microsoft Research [Page]

- Analyzed Accelerated IHT, trying to strengthen Jain et al.'s results for better support expansion and generalization.
- Analyzed OMP for the Sparse Linear Regression problem under Restricted Strong Convexity (RSC) assumptions obtaining its support recovery and generalization guarantees. Also provide tight lower bounds for OMP. Our results are the first such matching upper and lower bounds (up to log factors) for any Sparse Regression algorithm under RSC assumption.
- ★ Accepted for a **Spotlight** paper presentation at **NeurIPS** '18.

[paper, spotlight video]

Clustered Monotone Transforms for Rating Factorization (CMTRF)

Advisors: Dr. Sreangsu Acharyya (MSR India) & Prof. Oluwasanmi Koyejo (UIUC)

May '16 - Aug '18 [Page]

- Implemented and analyzed CMTRF for recommendation systems which performs regression under shared low-rank structure up to unknown monotonic transforms. CMTRF recovers a unique solution under mild conditions and also outperforms other state-of-the-art baselines on 7 benchmark and 2 synthetic datasets.
- ★ Accepted for an oral presentation at WSDM '19.

[arXiv]

SELECTED TALKS

- Scaling limits of graph dynamics
 - 1. Kantorovich Initiative retreat 2023

May '23

Jan '23

- Scaling limits of SGD over large networks
 - Paul G. Allen School of Computer Science and Engineering @ University of Washington
 Department of Computer Science and Engineering @ Indian Institute of Technology Bombay
 School of Technology and Computer Science @ Tata Institute of Fundamental Research

 Jan '23
 - 4. System and Control Engineering department @ Indian Institute of Technology Bombay
 - 5. Google India Research Lab

 Jan '23
 - 6. Institute for Foundations of Data Science

 Nov '22
 - 7. Machine Learning Foundations seminar @ Microsoft Research Redmond

 Sept '22
 - 8. Scaling Laws for Deep Learning Micro-workshop @ University of Washington, CSE

 Aug '22
- Gradient flows on Graphons @ Kantorovich Initiative retreat 2022

March '22

• Sparse Regression and Optimal Bounds for Orthogonal Matching Pursuit (OMP) @ Machine Learning seminar, Microsoft Research India 2019

Relevant Courses

Optimization Theory of Optimization, Variational Analysis, Convex Optimization (Stanford MOOC)

Probability Advanced Probability, Probability & Random Processes

Finance Financial Engineering I & II, Monte Carlo Simulations, Stochastic Calculus for Finance Mathematics Linear Algebra, Real & Complex Analysis, Stochastic Calculus, Optimal Transport

Matrix Computation, Scientific Computation

Computer Science Design and Analysis of Algorithms, Randomized Algorithms, Discrete Mathematics

Professional Responsibilities

- 1. Reviewer: JMLR, NeurIPS '19, NeurIPS '20, ICML '20.
- 2. Teaching Assistant: Machine Learning CSE 446/546 Spring '21.

SCHOLASTIC ACHIEVEMENTS

- 2013 Among top 1.7% of all selected candidates (126,000+) in JEE-Advanced (IIT-JEE).
- 2013 Among top 0.5% of all candidates (1,400,000+) in JEE-Mains.
- 2013 Among top 0.15% of all candidates (150,000+) in WBJEE.

References

- 1. Prof. Sewoong Oh, Associate Professor, University of Washington
- 2. Prof. Soumik Pal, Professor of Mathematics, University of Washington
- 3. Dr. Praneeth Netrapalli, Research Scientist, Google Research, India
- 4. Dr. Prateek Jain, Sr. Staff Research Scientist, Google Research, India