Nvidia Toronto AI Lab Phone: +1 (647) 784 6242

Nvidia Corporation Email: rafid.mahmood@mail.utoronto.ca

Toronto, Ontario, Canada Homepage: http://rafidrm.github.io

Employment

Nvidia Corporation

AI Resident Researcher 2020–pres.

Education

University of Toronto, Mechanical and Industrial Engineering

Ph.D Industrial Engineering

2015-2020

Vector Institute for Artificial Intelligence Postgraduate Affiliate

2019-2020

Thesis: Learning to Solve Optimization Problems with Hidden Components: Applications

in Automated Treatment Planning

Adviser: Professor Timothy C. Y. Chan

University of Toronto, Electrical and Computer Engineering

M.A.Sc. Electrical Engineering

2013-2015

Thesis: Rank Metric Convolution Codes with Applications in Network Streaming

Adviser: Professor Ashish Khisti

Honors B.A.Sc. Electrical Engineering

2008-2013

Publications¹

Working Papers

- 1. T. C. Y. Chan, D. L. O'Connor, **R. Mahmood**, D. Stone, S. Unger, R. K. Wong*, and I. Y. Zhu, Milk Bank Batching Operations: A Data-driven Optimization Approach, in preparation for Manufacturing & Service Operations Management, 2021.
 - Preliminary version at The Journal of Nutrition.

¹Articles for operations research journals use alphabetical author ordering. The primary author is starred.

Pre-prints

1. **R. Mahmood***, S. Fidler, and M. T. Law, Low Budget Active Learning via Wasserstein Distance: An Integer Programming Approach, under review at the International Conference on Learning Representations, 2022.

- 2. A. Babier, T. C. Y. Chan, A. Diamant, and **R. Mahmood***, Learning to Optimize with Hidden Constraints, *major revision in Management Science*, 2021.
- 3. T. C. Y. Chan, **R. Mahmood***, and I. Y. Zhu*, Inverse Optimization: Theory and Applications, *under review at SIAM Review*, 2021.

Journal Articles

- 1. R. K. Wong*, M. A. Pitino, **R. Mahmood**, I. Y. Zhu, D. Stone, S. Unger, D. L. O'Connor, and T. C. Y. Chan, Prediction of Protein and Fat Content in Human Donor Milk Using Machine Learning, *The Journal of Nutrition*, 2021.
- 2. A. Babier, T. C. Y. Chan, T. Lee, **R. Mahmood***, and D. Terekhov, An Ensemble Learning Framework for Model Fitting and Evaluation in Inverse Linear Optimization, *INFORMS Journal on Optimization*, 3(2), 119–138, 2021.
 - Honorable Mention (second place) at CORS 2018 Best Student Paper Competition.
 - Preliminary version at the 2019 Canadian Healthcare Optimization Workshop.
- 3. A. Babier*, B. Zhang, **R. Mahmood**, K. Moore, T. Purdie, A. McNiven, and T. C. Y. Chan, OpenKBP: The Open-access Knowledge-Based Planning Grand Challenge and Dataset, *Medical Physics*, 48(9), 5549–5561, 2021.
- 4. T. C. Y. Chan, A. Diamant, and **R. Mahmood***, Sampling from the Complement of a Polyhedron: An MCMC Algorithm for Data Augmentation, *Operations Research Letters*, 48 (6), 744–751, 2020.
- M. J. Crowson*, A. Hamour, R. Mahmood, A. Babier, V. Lin, D. Tucci, and T. C. Y. Chan, AutoAudio: Deep Learning for Automatic Audiogram Interpretation, *Journal of Medical Systems*, 44 (163), 2020.
- 6. A. Babier*, **R. Mahmood**, A. McNiven, A. Diamant, and T. C. Y. Chan, The Importance of Evaluating the Complete Knowledge-Based Planning Pipeline, *Physica Medica: European Journal of Medical Physics*, 72, 73–79, 2020.
 - Preliminary version at the 2019 International Conference on the Use of Computers in Radiotherapy.
- 7. M. J. Crowson*, P. Dixon, **R. Mahmood**, J. W. Lee, D. Shipp, T. Le, V. Lin, J. Chen, and T. C. Y. Chan, Predicting Post-Operative Cochlear Implant Performance Using Supervised Machine Learning, *Otology & Neurotology*, 41 (8), 1013–1023, 2020.

8. A. Babier*, **R. Mahmood**, A. McNiven, A. Diamant, and T. C. Y. Chan, Knowledge-based Automated Treatment Planning with Three-dimensional Generative Adversarial Networks, *Medical Physics*, 47, 297–306, 2019.

- Preliminary version at the 2018 NeurIPS Workshop on Machine Learning for Health.
- 9. **R. Mahmood***, A. Badr, and A. Khisti, Streaming Codes for Multiplicative-Matrix Channels with Burst Rank Loss, *IEEE Transactions on Information Theory*, 64 (7), 5296–5311, 2018.
 - Preliminary version at the 2016 International Symposium on Information Theory.
- 10. **R. Mahmood***, A. Badr, and A. Khisti, Convolutional Codes with Maximum Column Sum Rank for Network Streaming, *IEEE Transactions on Information Theory*, 62 (6), 3039–3052, 2016.
 - Preliminary version at the 2015 International Symposium on Information Theory.

Conference Proceedings

- R. Mahmood*, A. Babier, A. McNiven, A. Diamant, and T. C. Y. Chan, Automated Treatment Planning in Radiation Therapy with Generative Adversarial Networks, *Machine Learning for Healthcare*, Proceedings of Machine Learning Research 85, 484–499, 2018.
 - Runners' Up (second place) at CORS 2019 HCOR Student Presentation Competition.
- 2. **R. Mahmood***, A. Badr, and A. Khisti, Low Delay Network Streaming Under Burst Losses, *IEEE International Symposium on Information Theory*, 2898–2902, 2016.
- 3. **R. Mahmood***, A. Badr, and A. Khisti, Convolutional Codes with Maximum Column Sum Rank for Network Streaming, *IEEE International Symposium on Information Theory*, 2271–2275, 2015.
- 4. A. Badr*, **R. Mahmood**, and A. Khisti, Embedded MDS Codes for Multicast Streaming, *IEEE International Symposium on Information Theory*, 2276–2280, 2015.

Refereed Workshops and Clinical Abstracts

- 1. A. Babier*, **R. Mahmood**, A. McNiven, A. Diamant, and T. C. Y. Chan, The Importance of Evaluating the Complete Knowledge-based Automated Planning Pipeline, *International Conference on the Use of Computers in Radiotherapy*, 2019.
- 2. A. Babier*, **R. Mahmood**, A. McNiven, and T. C. Y. Chan, An Optimization Method for Knowledge-based Automated Planning that Leverages Ensemble Dose Predictions, *American Association of Physicists in Medicine*, 2019.
- 3. A. Babier*, **R. Mahmood**, A. McNiven, and T. C. Y. Chan, Comparing Deep Learning Architectures for Knowledge-Based Automated Planning, *American Association of Physicists in Medicine*, 2019.

4. A. Babier, T. C. Y. Chan, T. Lee, **R. Mahmood***, and D. Terekhov, Model Fitting in Generalized Inverse Linear Optimization: Applications in Radiation Therapy, *Canadian Healthcare Optimization Workshop*, 2019.

5. A. Babier*, **R. Mahmood***, A. McNiven, A. Diamant, and T. C. Y. Chan, Automated Treatment Planning in Radiation Therapy with 3-D Generative Adversarial Networks, *NeurIPS Workshop on Machine Learning for Health*, 2018.

Presentations²

Low Budget Active Learning: An Integer Programming Approach	
- INFORMS Annual Meeting, Anaheim, CA, USA	2021
Learning to Optimize with Hidden Constraints	
- CORS Annual Conference, Toronto, ON, Canada	2021
 INFORMS Annual Meeting, Washington, DC, USA 	2020
- AOIS Seminar, Alberta School of Business, Edmonton, AB, Canada	2020
- Nvidia AI Research Seminar, Toronto, ON, Canada	2020
- IE Department Seminar, University of Pittsburgh, Pittsburgh, PA, USA	2020
 INFORMS Annual Meeting, Seattle, WA, USA 	2019
 CORS Annual Conference, Saskatoon, SK, Canada 	2019
 GERAD Seminar, Université de Montréal, Montréal, QC, Canada 	2019
An Ensemble Learning Framework for Inverse Linear Optimization	
- INFORMS Health Care, Boston, MA, USA	2019
 CORS Annual Conference, Saskatoon, SK, Canada 	2019
- CORS Annual Conference, Halifax, NS, Canada	2018
 INFORMS Annual Meeting, Houston, TX, USA 	2017
- CORS Annual Conference, Quebec City, QC, Canada	2017
- INFORMS Annual Meeting, Nashville, TN, USA	2016
Automated Treatment Planning with Generative Adversarial Networks	
- CORS Annual Conference, Saskatoon, SK, Canada	2019
- MLHC Conference, Palo Alto, CA, USA	2018
Convolutional Codes with Maximum Column Sum Rank for Network Streaming	

2015

- IEEE ISIT, Hong Kong, HK, China

²Presentations are categorized by the abbreviated main paper discussed. Actual titles may vary.

Teaching Assistantship

MIE 465: Analytics in Action

2017-2019

- Responsible for course creation in 2017.

MIE 1620: Linear Programming and Network Flows

2018

MIE 258: Engineering Economics and Accounting

2016-2017

ECE 363: Communication Systems

2015

Students Supervised

University of Toronto³

- 1. Rachel Wong, Machine Learning Regression Models to Predict Protein and Fat Content in Human Donor Milk, *Masters of Applied Science Thesis*, 2020. Co-supervised with Ian Y. Zhu.
- 2. Richard Chavez, Sliding Window Generative Adversarial Networks for Radiation Therapy, *Industrial Engineering 4th Year Thesis*, 2019. Co-supervised with Aaron Babier.
- 3. Michael Shin, Using Portfolio Theory to Optimize Selection of Daily Fantasy Basketball Contests, *Engineering Science 4th Year Thesis*, 2018. Co-supervised with Ben Potter.
- 4. Yusuf Shalaby, Inverse Optimization for Measuring Cancer Treatment Pathway Concordance, *Industrial Engineering 4th Year Thesis*, 2018. Co-supervised with Nasrin Youssefi.
- 5. Palmira Pereira, Netflix Prize Problem Using Inverse Optimization, *Masters of Engineering Thesis*, 2017.

Awards

- 1. University of Toronto Doctoral Completion Award, 2019–2020 (\$8 000).
- 2. Runners' Up, Health Care Operations Research Student Presentation Competition, CORS Annual Conference, 2019.
- 3. Postgraduate Affiliate Award, Vector Institute for Artificial Intelligence, 2019 (\$12 000).
- 4. Honourable Mention, Student Paper Competition: Open Category, CORS Annual Conference, 2018 (\$100).
- 5. Postgraduate Doctoral Scholarship, NSERC, 2017 (\$42 000).
- 6. First Place, Waterfront International Ltd. Quantathon, 2016 (\$7 500).

³All students were co-supervised with my adviser Timothy C. Y. Chan.

Other Professional Experience

NHL Expansion Draft Optimizer (http://nhlexpansiondraft.com) 2017, 2021 Back-end Software Developer (2017), Adviser (2021)

- Implemented an online tool demonstrating the power of optimization in simulating team choices for the 2017 and 2021 NHL Expansion Draft with the Vegas Golden Knights and Seattle Kraken, respectively.
- Our site received media coverage from <u>The Toronto Star</u>, OR/MS Today, and <u>The Seattle Times</u>.

OpenKBP Grand Challenge, American Association of Physicists in Medicine 2019–2020 Machine Learning Expert

- Released the OpenKBP Data Set, which is the first public-access data set (of 400 ML-generated treatments) to standardize research in automated planning.
- Organized the OpenKBP Grand Challenge, which was an international competition for predicting radiation therapy dose treatments in head-and-neck cancer.

Opus One Solutions, Toronto, ON, Canada

2019

Independent Contract/Power Systems Optimization Expert

 Developed and implemented algorithms to solve optimal power flow, dispatch, and related power systems problems.

Service

Academic

Ad-hoc Journal Referee

Health Care Management Science, European Journal of Operations Research

Ad-hoc Conference Referee

ICLR 2022, NeurIPS 2020–2021, ICML 2021, ACM CHIL 2020–2021, NeurIPS ML4H Workshop 2019–2020, IEEE ISIT 2017

Conference Session Chair

INFORMS Annual Meeting 2021, CORS Annual Conference 2019

University of Toronto

Electrical and Computer Engineering Graduate Student Society 2014–2015 Treasurer

Electrical and Computer Engineering Graduate Students Symposium Organizing Committee Member

Personal

Languages: English (fluent), French (beginner)

Citizenship: Canadian

Last updated: September 29, 2021 http://rafidrm.github.io