### **Research Interests**

My research focuses on building more trustworthy machine learning systems, primarily through improving robustness to spurious correlations and mitigating unfairness and discrimination. I aim to do research which acknowledges the role of machine learning models in larger systems, and am interested in creating more systematic evaluation procedures, understanding measurement error in data collection, and the role of automated tools in decision-making. I am also interested in causal modelling, calibration, uncertainty estimation, and representation learning.

### EDUCATION

Jan. 2018 - Present	PH.D. Candidate (expected May 2022), <b>University of Toronto</b> , Toronto, Canada Advisor: Richard Zemel
Sep. 2016 - Jan. 2018	MASTER OF SCIENCE, <b>University of Toronto</b> , Toronto, Canada Thesis: Predict Responsibly: Improving Fairness and Accuracy by Learning to Defer Advisor: Richard Zemel
Sep. 2011 - Jun. 2016	BACHELOR OF SCIENCE, <b>University of Toronto</b> , Toronto, Canada Major: Computer Science (specialist), with minors in Mathematics and Statistics GPA: <b>3.92</b> (Dean's List)

### PUBLICATIONS & PREPRINTS

Oct. 2021	Madras D., Zemel R. Identifying and Benchmarking Natural Out-of-Context Prediction Problems.
	Neural Information Processing Systems, 2021.

- SEP. 2020 Loewe S.\*, <u>Madras D.\*</u>, Zemel R., Welling M. Amortized Causal Discovery: Learning to Infer Causal Graphs from Time-Series Data. *Causal Learning and Reasoning (CLeaR), 2022.*
- JUL. 2020 Creager E., <u>Madras D.</u>, Pitassi T., Zemel R. Causal Modelling for Fairness in Dynamical Systems. International Conference on Machine Learning, 2020.
- APR. 2020 <u>Madras D.</u>, Atwood J., D'Amour, A. Detecting Underspecification with Local Ensembles. International Conference on Learning Representations, 2020.
- APR. 2020 McCoy L., Burkell J., Card D., Davis B., Gichoya J., Le Page S., <u>Madras D.</u> Beyond "In the Loop": On The Role of Meaningful Human Control in High-Stakes Machine-Human Partnerships. (Oral), WeRobot 2020.
- JUN. 2019 Creager E., <u>Madras D.</u>, Jacobsen J.-H., Weis M., Pitassi T., Zemel R. Flexibly Fair Representation Learning by Disentanglement. *International Conference on Machine Learning*, 2019.
- JAN. 2019 <u>Madras D.</u>, Creager E., Pitassi T., Zemel R. Fairness Through Causal Awareness: Learning Latent-Variable Models for Biased Data. ACM Conference on Fairness, Accountability and Transparency (ACM FAT\*), 2019.
- DEC. 2018 <u>Madras D.</u>, Pitassi T., Zemel R. Predict Responsibly: Improving Fairness and Accuracy by Learning to Defer. Neural Information Processing Systems, 2018.
- JUN. 2018 <u>Madras D.\*</u>, Creager E.\*, Pitassi T., Zemel R. Learning Adversarially Fair and Transferable Representations. International Conference on Machine Learning, 2018.
- FEB. 2018 Chan T.C.Y., <u>Madras D.\*</u>, Puterman, M. Improving fairness in match play golf through enhanced handicap allocation. *Journal of Sports Analytics, 2018.*
- FEB. 2017 Allen, S.\*, Madras D.\*, Ye Y.\*, Zanotti, G.\* Change-point Detection Methods for Body-Worn Video. Society for Industial and Applied Mathematics (SIAM) Undergraduate Research Online, 2018.

#### WORKSHOP PAPERS

- DEC. 2021 <u>Madras D.</u>, Zemel R. Understanding Post-hoc Adaptation for Improving Subgroup Robustness. Distribution Shifts: Connecting Methods and Applications, NeurIPS 2021.
- DEC. 2021 <u>Madras D.</u>, Zemel R. Towards Systematic Evaluation in Machine Learning through Automated Stress Test Creation. *Data-Centric AI Workshop, NeurIPS 2021.*
- DEC. 2020 Adragna R., Creager E., <u>Madras D.</u>, Zemel R. Fairness and Robustness in Invariant Learning: A Case Study in Toxicity Classification. Algorithmic Fairness through the Lens of Causality and Interpretability (Oral), NeurIPS 2020.
- APR. 2020 Creager E., <u>Madras D.</u>, Pitassi T., Zemel R. Causal Modeling for Fairness in Dynamical Systems: A Case Study in Lending. Workshop on Causal Learning and Decision-Making, ICLR 2020.
- JUN. 2019 <u>Madras D.</u>, Atwood J., D'Amour, A. Detecting Extrapolation with Influence Functions. Workshop on Uncertainty and Robustness in Deep Learning (Oral), ICML 2019.
- DEC. 2018 <u>Madras D.</u>, Creager E., Pitassi T., Zemel R. Fairness Through Causal Awareness: Learning Latent-Variable Models for Biased Data. Workshop on Ethical, Social and Governance Issues in AI (Spotlight), NeurIPS 2018.
- DEC. 2017 <u>Madras D.</u>, Pitassi T., Zemel R. Predict Responsibly: Improving Fairness and Accuracy by Learning to Defer. Workshop on Transparent and Interpretable Machine Learning in Safety Critical Environments (Oral, Best Paper Award), NeurIPS 2017.

#### Awards and Honors

Nov. 2020	Schwartz Reisman Institute for Technology and Society Fellowship
Sep. 2019	NSERC Alexander Graham Bell Canada Graduate Scholarship-Doctoral (CGS D)
Dec. 2017	Best paper, NeurIPS 2017 Workshop on Transparent and Interpretable Machine Learning in Safety
	Critical Environments
Sep. 2016	NSERC CGS Master's Fellowship
Mar. 2016	2nd Place, Waterfront International Quantathon, Graduate Division
May 2016	Research in Industrial Projects for Students scholarship, Institute for Applied Mathematics, UCLA
May $2015$	Kupcinet-Getz scholarship, Weizmann Institute of Science
May $2014$	NSERC Undergraduate Student Research Award
Sep. 2014	Louis Savlov Scholarship, University of Toronto
Apr. 2013	Award of Excellence for Achievement in Computer Science – Department of Computer Science, Uni-
	versity of Toronto
Sep 2011	Reuben Leonard Wells Scholarship

#### LEADERSHIP

Jul. 2020	Co-organized inaugural workshop on Participatory Approaches to Machine Learning (ICML 2020)
Nov. 2019	Organized inaugural Pan-Canadian Self-Organizing Conference on Machine Learning (co-chair)
2019-2020	Organized Causal Inference reading group (Vector Institute)
2018	Organized Fairness in Machine Learning reading group (Vector Institute)
2014 - 2015	Co-president of Undergraduate Artificial Intelligence Group (UAIG), University of Toronto

### WORK EXPERIENCE

Feb. 2019 May. 2019	<b>Research Intern</b> , Google Brain, Cambridge, MA, USA Worked on methods for unreliability detection and sensitivity analysis with the Google Brain team, hosted by Alex D'Amour and James Atwood.
Sep. 2014	Software Developer, Ontario Financing Authority
Apr. 2015	Developed software using VB, C#, SQL; gathered requirements from traders and developers; suc-
	ceeded in self-motivated work environment.

### TEACHING EXPERIENCE

May 2019	African Institute of Mathematical Sciences, Kigali, Rwanda	
	Assistant Instructor	
	Three-week course on Fairness & Privacy in Machine Learning at the African Masters of Machine	
	Intelligence (https://aimsammi.org/)	

SEP. 2013 | University of Toronto, Toronto, Canada

PRESENT | Teaching Assistant

CSC411: Machine Learning and Data Mining, CSC412: Probabilistic Learning and Reasoning, CSC108: Introduction to Computer Programming, CSC148: Introduction to Computer Science

### SERVICE

REVIEWER: ICLR (2022, 2021, 2019), NeurIPS (2021, 2020, 2019), ICML (2019), FAccT (2021), AISTATS (2020), JMLR (2x)

### MISCELLANY

Ост. 2019	Attended NBER Economics of Artificial Intelligence Conference & Young Scholars Workshop (invitation only)
May. 2019	Summer Institute on AI and Society, Alberta Machine Intelligence Institute
Aug. 2017	Attended Deep Learning Summer School, University of Montreal

## GRADUATE COURSEWORK

WINTER 2020	Statistical Learning Theory
WINTER 2020	Algorithms for Collective Decision-Making
Fall 2018	Fundamentals of Cryptography
WINTER 2018	Computational Social Science
WINTER 2017	Visual Recognition with Text
WINTER 2017	Algorithms & Complexity in Private Data Analysis
Fall 2016	Inference & Generative Models
Fall 2016	Computational Linguistics

# INVITED TALKS

Aug 2021	Why Learn Fair Representations?
	KDD 2021 Deep Learning Day (Singapore)
Sep. 2020	Fairness Through Causal Awareness
	HAI Reading Group, Apple (Seattle)
May 2020	Causality in Machine Learning
	African Institute of Mathematical Sciences (Rwanda, Ghana)
Aug. 2019	Machine Learning in Decision-Making Systems
	Schwartz Reisman Institute for Technology and Society (Toronto)
June 2019	Detecting Extrapolation with Influence Functions
	Workshop on Uncertainty and Robustness in Deep Learning, ICML 2019 (Long Beach)
May 2019	Detecting Extrapolation with Influence Functions
	Google Brain (Cambridge)
Feb. 2019	Predict Responsibly: Fairness in Machine Learning
	Princeton University (Princeton)
Jan. 2019	Fairness Through Causal Awareness: Learning Latent-Variable Models for Biased Data
	ACM FAT* 2019 (Atlanta)
Dec. 2018	Fairness Through Causal Awareness: Learning Latent-Variable Models for Biased Data
	Workshop on AI, Ethics & Governance, NeurIPS 2018 (Montreal)
Ост. 2018	Predict Responsibly: Fairness in Machine Learning
	Toronto Deep Learning Series, Sidewalk Labs (Toronto)
Sep. 2018	Learning Adversarially Fair and Transferable Representations
	Fairness in Machine Learning Workshop, Google Brain (Cambridge)
Sep. 2018	Learning Adversarially Fair and Transferable Representations
	Google Brain (Toronto)
Aug. 2018	Learning Adversarially Fair and Transferable Representations
	Radiation Medication Program Summer Series, Princess Margaret Hospital (Toronto)
Jul. 2018	Learning Adversarially Fair and Transferable Representations
	Sunnybrook Health Sciences Centre (Toronto)

Jul.	2018	Learning Adversarially Fair and Transferable Representations
		ICML 2018 (Stockholm)
Apr. 2	2018	Fairness in Machine Learning
		University in the Community (Toronto)
Apr. 2	2018	Predict Responsibly: Improving Fairness and Accuracy by Learning to Defer
		Design+AI Meetup, Normative AI (Toronto)
Apr. 2	2018	Predict Responsibly: Improving Fairness and Accuracy by Learning to Defer
		Workshop on Transparent and Interpretable ML
		in Safety Critical Environments, NeurIPS 2017 (Long Beach)
MAR.	2018	Panel Discussion: Fairness and Interpretability in Machine Learning
		Integrate AI (Toronto)
Nov.	2017	Fairness in Machine Learning
		AI Day, University of Toronto (Toronto)