## **Umang Bhatt**

CONTACT usb20@cam.ac.uk Citizenship: USA Information umangsbhatt.github.io **EDUCATION** University of Cambridge, Cambridge, UK Sept 2019 - Present Ph.D. in Engineering Advisor: Adrian Weller MBE Affiliations: Machine Learning Group, Computation and Biological Learning Lab Carnegie Mellon University, Pittsburgh, PA M.S. in Electrical and Computer Engineering Aug 2017 - May 2019 B.S. in Electrical and Computer Engineering Aug 2015 - May 2019 **Positions** Research Associate, The Alan Turing Institute Jan 2023 - Present Co-lead the Turing Interest Group on Human-Machine Teams Research Fellow, Harvard University June 2022 - Mar 2023 Center for Research on Computation and Society Hosts: Milind Tambe (SEAS) and Himabindu Lakkaraju (HBS) SELECT J.P. Morgan AI PhD Fellowship 🔗 2022 - 2023**FELLOWSHIPS** The Alan Turing Institute Enrichment Studentship 🔗 2021 - 2022AND AWARDS Mozilla Fellowship **6** 2020 - 2021Partnership on AI Research Fellowship 2019 - 2020Leverhulme Center for the Future of Intelligence PhD Scholarship 2019 - 2023Fully funded by DeepMind and the Leverhulme Trust Best Presentation Award, AAAI Spring Symposium on Interpretable AI for Well-Being 2019 Lovett Family Endowed Scholarship, The Andrew Carnegie Society 2019 Undergraduate Research Presentation Award, CMU 2017 **NSF I-Corps Site Award** for research commercialization 2017 H. F. McCullough Memorial Scholarship, CMU 2016 PEER-[1] Human-in-the-Loop Mixup REVIEWED Uncertainty in Artificial Intelligence (UAI) 2023 Conference Katherine Collins, Umang Bhatt, Weiyang Liu, Vihari Piratla, Ilia Sucholutsky, Bradley Love, Adrian Weller **PUBLICATIONS** [2] On the Informativeness of Supervision Signals Uncertainty in Artificial Intelligence (UAI) 2023 Ilia Sucholutsky, Ruairidh McLennan Battleday, Katherine Collins, Raja Marjieh, Joshua Peterson, Pulkit Singh, Umang Bhatt, Nori Jacoby, Adrian Weller, Thomas Griffiths [3] Human Uncertainty in Concept-Based AI Systems AAAI/ACM Conference on Artificial Intelligence, Ethics, and Society (AIES) 2023 Katherine Collins, Matthew Barker, Mateo Espinosa Zarlenga, Naveen Raman, Umang Bhatt, Mateja Jamnik, Ilia Sucholutsky, Adrian Weller, Krishnamurthy Dvijotham [4] Iterative Teaching by Data Hallucination International Conference on Artificial Intelligence and Statistics (AISTATS) 2023 Zeju Qiu, Weiyang Liu, Tim Xiao, Zhen Liu, Yucen Luo, Umang Bhatt, Adrian Weller, Bernhard Schölkopf [5] Approximating Full Conformal Prediction at Scale via Influence Functions AAAI Conference on Artificial Intelligence (AAAI) 2023 Javier Abad Martinez, Umang Bhatt, Adrian Weller, Giovanni Cherubin [6] Towards Robust Metrics for Concept Representation Evaluation

Mateo Zarlenga, Pietro Barbiero, Zohreh Shams, D. Kazhdan, Umang Bhatt, Adrian Weller, Mateja Jamnik

AAAI Conference on Artificial Intelligence (AAAI) 2023

[7] Uncertainty Quantification with Pre-trained Language Models: An Empirical Analysis Conference on Empirical Methods in Natural Language Processing (EMNLP) 2022 (Findings) Yuxin Xiao, Paul Pu Liang, *Umang Bhatt*, Willie Neiswanger, Ruslan Salakhutdinov, L.P. Morency

## [8] Eliciting and Learning with Soft Labels from Every Annotator AAAI Conference on Human Computation and Crowdsourcing (HCOMP) 2022

Katherine Collins\*, *Umang Bhatt*\*, Adrian Weller

# [9] On the Utility of Prediction Sets in Human-AI Teams

International Joint Conference on Artificial Intelligence (IJCAI) 2022 (Oral Presentation) Varun Babbar, *Umang Bhatt*, Adrian Weller

# [10] Diverse and Amortised Counterfactual Explanations for Uncertainty Estimates

AAAI Conference on Artificial Intelligence (AAAI) 2022 Dan Ley, Umang Bhatt, Adrian Weller

### [11] On the Fairness of Causal Algorithmic Recourse

AAAI Conference on Artificial Intelligence (AAAI) 2022 (Oral Presentation) Julius von Kügelgen, Amir Karimi, *Umang Bhatt*, Isabel Valera, Adrian Weller, Bernhard Schölkopf

## [12] Uncertainty as a Form of Transparency: Measuring and Communicating Uncertainty AAAI/ACM Conference on Artificial Intelligence, Ethics, and Society (AIES) 2021

Umang Bhatt, Javier Antorán, Yunfeng Zhang, Q. Vera Liao, Prasanna Sattigeri, Riccardo Fogliato, Gabrielle Melançon, Ranganath Krishnan, Jason Stanley, Omesh Tickoo, Lama Nachman, Rumi Chunara, Madhulika Srikumar, Adrian Weller, Alice Xiang

### [13] Getting a CLUE: A Method for Explaining Uncertainty Estimates

International Conference on Learning Representations (ICLR) 2021 (Oral Presentation) Javier Antorán, *Umang Bhatt*, Tameem Adel, Adrian Weller, José Miguel Hernández-Lobato

#### [14] FIMAP: Feature Importance by Minimal Adversarial Perturbation

AAAI Conference on Artificial Intelligence (AAAI) 2021

Matt Chapman-Rounds, *Umang Bhatt*, Erik Pazos, Marc-Andre Schulz, Kostas Georgatzis

#### [15] Evaluating and Aggregating Feature-based Explanations

International Joint Conference on Artificial Intelligence (IJCAI) 2020 Umang Bhatt, Adrian Weller, José M.F. Moura

#### [16] Explainable Machine Learning in Deployment

ACM Conference on Fairness, Accountability, and Transparency (FAccT) 2020 Umang Bhatt, Alice Xiang, Shubham Sharma, Adrian Weller, Ankur Taly, Yunhan Jia, Joydeep Ghosh, Ruchir Puri, José M.F. Moura, Peter Eckersley

## [17] You Shouldn't Trust Me: Learning Models Which Conceal Unfairness From Multiple Explanation Methods

European Conference on Artificial Intelligence (ECAI) 2020 Botty Dimanov, Umang Bhatt, Mateja Jamnik, Adrian Weller

## [18] On Network Science and Mutual Information for Explaining Deep Neural Networks

IEEE Conference on Acoustics, Speech and Signal Processing (ICASSP) 2020 Brian Davis\*, Umang Bhatt\*, Kartikeya Bhardwaj\*, Radu Marculescu, José M.F. Moura

## [19] A Robot's Expressive Language Affects Human Strategy and Perceptions in a Competitive Game

IEEE Conference on Robot and Human Interactive Communication (ROMAN) 2019 Aaron Roth, Samantha Reig, Umang Bhatt, Johnathan Schulgach, Tamara Amin, Afsaneh Doryab, Fei Fang, Manuela Veloso

Journal Papers	[20] Perspectives on Incorporating Expert Feedback into Model Updates Patterns. Cell Press 2023 Valerie Chen*, Umang Bhatt*, Hoda Heidari, Adrian Weller, Ameet Talwalkar	
	[21] How Transparency Modulates Trust in Artificial Intelligence Patterns. Cell Press 2022 John Zerilli, Umang Bhatt, Adrian Weller	
Book Chapters	[22] <b>Trust in Artificial Intelligence: Clinicians are Essential</b> Healthcare Information Technology for Cardiovascular Medicine. Springer 2021 Umang Bhatt, Zohreh Shams	
Select Workshop Publications	[23] <b>GeValDi: Generative Validation of Discriminative Models</b> <i>ICLR Workshop on Pitfalls of Limited Data and Computation for Trustworthy ML 2023</i> Vivek Palaniappan, Matt Ashman, Katherine Collins, Juyeon Heo, Adrian Weller, <i>Umang Bhatt</i>	
TEACHING EXPERIENCE	<ul> <li>Vivek Palaniappan, MEng in Information Engineering (Next: Citadel)</li> <li>Katherine Collins, MPhil in Machine Learning (Next: PhD at Cambridge)</li> <li>Received Departmental Distinction for her thesis</li> <li>Varun Babbar, MEng in Information Engineering (Next: PhD at Duke)</li> <li>Won the 2022 Engineering Division F Thesis Prize</li> <li>Javier Abad Martinez, Research Assistant (Next: PhD at ETH Zurich)</li> </ul>	2022 – June 2023 2022 – June 2023 2021 – Sept 2022 2021 – June 2022 2021 – Feb 2022 2020 – Aug 2021 Lent 2023 Lent 2022 Michaelmas 2020 Spring 2019 Fall 2018 Spring 2018 Fall 2017 Spring 2017
SELECT INVITED TALKS	<ul> <li>Indian Institute of Technology Bombay, C-MInDS Seminar</li> <li>University of Chicago, Chicago Human+AI Lab</li> <li>Massachusetts Institute of Technology, AI Ethics and Policy Group</li> <li>Birkbeck, University of London, Workshop on Human Behavioral Aspects of XAI</li> <li>Harvard Business School, Digital, Data, and Design (D^3) Institute</li> <li>DeepMind, Ethics Research Team</li> <li>University of Bristol, REPHRAIN Masterclass</li> <li>University of Cambridge, Guest Lecture for MSt in AI Ethics and Society</li> <li>University of Manchester, Advances in Data Science and AI Conference</li> <li>Leverhulme Centre for the Future of Intelligence, Seminar Series</li> <li>Ada Lovelace Institute, Brown Bag Lunch</li> <li>Von Hügel Institute, Research Salon on Artificial Intelligence</li> <li>Pennsylvania State University, Young Achievers Symposium</li> <li>UK Ministry of Defense, AI Safety Workshop</li> <li>Huawei, Strategy &amp; Technology Workshop</li> <li>QuantUniversity, Summer School Speaker Series</li> <li>Vanguard Health, MedTech Insight Podcast</li> <li>Technical University of Denmark, Trustworthiness and Interpretability in ML Seminary</li> <li>Harvard SEAS, Guest Lecture for COMPSCI 282BR: Explainability in ML</li> </ul>	Jan 2023 Nov 2022 Oct 2022 Sept 2022 Sept 2022 July 2022 June 2022 Apr 2022 Mar 2022 Oct 2021 July 2021 June 2021 June 2021 Apr 2021 Apr 2021 Apr 2021 Apr 2021

	• Imperial College, Explainable AI Seminar	Feb 2021	
	Cambridge Department of Chemical Engineering	Oct 2020	
	Cambridge Observatory for Human-Machine Collaboration (Keynote)	Sept 2020	
	Robust and Responsible AI Developers (Keynote)	July 2020	
	ICML Workshop on Extending Explainable AI (Keynote)	July 2020	
	Mozilla All-Hands Meeting (Keynote)	June 2020	
	QuantumBlack (McKinsey), AI Seminar	May 2020	
	Fiddler Labs, Explainable AI Seminar	May 2019	
	• Element AI, Explainability Research Team	Dec 2018	
	<ul> <li>AILA, Symposium on Creating a Fair and Ethical Future</li> </ul>	Oct 2018	
	<ul> <li>AAAI, Spring Symposium on AI and Society</li> </ul>	Mar 2018	
	<ul> <li>University of Chicago, Data Science for Social Good Conference</li> </ul>	Oct 2017	
	• Bloomberg, Data for Good Exchange Conference	Sept 2017	
Professional Service	<ul> <li>Co-Organizer</li> <li>ICML Workshop on Human-Machine Collaboration and Teaming</li> <li>ELLIS Workshop on Human-Centric Machine Learning</li> <li>ICML Workshop on Human Interpretability in Machine Learning</li> <li>IBM + Partnership on AI Workshop on Explainable AI</li> </ul>	July 2022 May 2021 July 2020 Feb 2020	
	<ul> <li>Program Committee (Reviewer)</li> <li>2023: FAccT, ICLR, ICML, IJCAI, NeurIPS, UIST, WebConf</li> <li>2022: AAAI, AISTATS, FAccT, ICLR, ICML, NeurIPS, UAI</li> <li>2021: AAAI, AISTATS, FAccT, ICAIF, ICLR, ICML, KDD, NeurIPS, UAI</li> <li>2020: ICAIF, NeurIPS</li> </ul>		
	<b>Reviewer</b> : ACM Transactions on Computer-Human Interaction (TOCHI), ACM Transactions on Interactive Intelligent Systems (TiiS), Artificial Intelligence Journal (AIJ), Journal of Artificial Intelligence		

**Reviewer:** ACM Transactions on Computer-Human Interaction (TOCHI), ACM Transactions on Interactive Intelligent Systems (TiiS), Artificial Intelligence Journal (AIJ), Journal of Artificial Intelligence Research (JAIR), IEEE Transactions on Pattern Analysis and Machine Intelligence (TPAMI), Transactions on Machine Learning Research (TMLR)

OTHER
EXPERIENCE

Advisor, **OECD**, Paris, FR

Apr 2023 – Present

• Expert Group on AI Risk & Accountability

Expert Advisor, **Accenture**, New York, NY

Jan 2023 – Present

• Advising on Responsible AI strategy

Advisor, Responsible AI Institute, Austin, TX

Oct 2021 – Apr 2023

• Building tools and certification programs for Responsible AI

Advisor, Credo AI, Palo Alto, CA

June 2020 – June 2021

• Scoped an AI governance and auditing platform; backed by AI Fund

Research Assistant, Carnegie Mellon University, Pittsburgh, PA

Jan 2017 – Sept 2019

• Advisors: José M.F. Moura (ECE), Pradeep Ravikumar (MLD), and Zico Kolter (CSD)

Student Fellow, **.406 Ventures**, Boston, MA

July 2017 – June 2019

• Sourced startups and performed first-round due diligence on ventures

Co-Founder, **Percepsense**, Pittsburgh, PA

Jan 2017 – May 2018

• Built products to harvest vehicular telematics data; pipeline acquired by *Honda Motors*