Elias Bareinboim

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Address: 530 W 120th St (Schapiro CEPSR), Columbia University, New York, NY, 10027.

[Research Interests Education Academic Positions Awards and Honors
Publications Team Teaching Tutorials Talks Funding Service Misc]

Research Interests

- Causal Inference: Theory and Applications.
- Causal Data Science; Causal Fairness Analysis; Causal Reinforcement Learning.
- Artificial Intelligence, Machine Learning, Statistics.
- Cognitive Science, Philosophy of Science.

Education

• Ph.D. in Computer Science – University of California, Los Angeles (UCLA), 2014.

Title: Generalizability in Causal Inference: Theory and Algorithms.

Advisor: Judea Pearl.

• B.Sc., M.Sc. in Computer Science – Federal University of Rio de Janeiro (UFRJ), 2007.

Title: Descents and nodal load in scale-free networks.

Advisor: Valmir C. Barbosa.

Academic Positions

- Associate Professor (tenured), Computer Science, Columbia University, Summer/2019-now.
 - Director, Causal Artificial Intelligence Laboratory.
 - Member, Data Science Institute.
 - Member, NSF National AI Institute for Artificial and Natural Intelligence.
 - Member, Program for Mathematical Genomics.
- Assistant Professor, Computer Science, Purdue University, Fall/2015-Spring/2019.
 - Director, Causal Artificial Intelligence Laboratory.
 - Assistant Professor, courtesy appointment, Statistics.
 - Faculty Affiliate, Regenstrief Center for Healthcare Engineering.
- Postdoctoral Scholar, Cognitive Systems Lab/UCLA, Judea Pearl, Fall/2014-Summer/2015.
- Research Assistant, Cognitive Systems Lab/UCLA, Judea Pearl, Fall/2009-Summer/2014.

Awards and Honors

- 2023 DARPA Young Faculty Award.
- 2022 ONR Young Investigator Award.
- 2021 JP Morgan Faculty Research Award.
- 2020 Amazon Research Award.
- 2019 UAI Best Paper Award (1 out of 450 papers).
- 2018 NSF Faculty Early Career Development (CAREER) Award.

- 2018 Adobe Data Science Research Award.
- 2018 UAI Best Student Paper Award (1 out of 337 papers).
- 2018 AAAI Outstanding Paper Award Honorable Mention (2 out of 3800 papers).
- 2017 IBM Open Collaborative Award.
- 2016 IEEE AI's 10 to Watch, Intelligent Systems.
- 2015 ACM Notable Paper, 19th Annual Best of Computing, Computing Reviews.
- 2014 UCLA Edward K. Rice Outstanding Doctoral Student Award (given to a single PhD student in all engineering and applied sciences majors), School of Engineering and Applied Sciences, UCLA.
- 2014 AAAI Outstanding Paper Award (1 out of 1406 papers).
- 2014 UCLA Outstanding Graduating PhD Student (commencement award), Computer Science.
- 2014 Google Outstanding Graduate Research Award, Computer Science, UCLA.
- 2014 Dan David Scholar, Future Dimension: Artificial Intelligence (\$15,000), Dan David Foundation.
- 2013 UCLA Dissertation Year Fellowship (DYF) (~\$35,000).
- 2012 Yahoo! Key Scientific Challenges Award, area Machine Learning & Statistics (\$5,000).
- 2008 UCLA Ph.D.'s Fellowship (~\$45,000).
- 2008 Top 10 award National contest of M.Sc. thesis (2007), Brazilian Computer Society.
- 2008-2012 Ph.D.'s Fellowship, Fulbright U.S. Dep. of State / CAPES-MEC, declined.
- 2003-2007 Undergraduate's and Master's Fellowships, Brazilian Research Council CNPq.

Publications

102. Yushu Pan, Elias Bareinboim (2023)

Counterfactual Image Editing

Columbia CausalAI Laboratory, Technical Report (R-103), Dec/2023.

101. Mingxuan Li, Junzhe Zhang, Elias Bareinboim (2024)

Causally Aligned Curriculum Learning

Columbia CausalAI Laboratory, Technical Report (R-102), Oct/2023.

Proc. of the 12th International Conference on Learning Representations (ICLR), 2024. (Acceptance rate = 31%)

100. Kevin Xia, Elias Bareinboim (2024)

Neural Causal Abstractions

Columbia CausalAI Laboratory, Technical Report (R-101), Dec/2023.

Proceedings of the 38th AAAI Conference on Artificial Intelligence (AAAI), 2024.

(Acceptance rate = 23.7%)

99. Kasra Jalaldoust, Elias Bareinboim (2024)

Transportable Representations for Out-of-distribution Generalization

Columbia CausalAI Laboratory, Technical Report (R-99), May/2023.

Proceedings of the 38th AAAI Conference on Artificial Intelligence (AAAI), 2024.

(Acceptance rate = 23.7%)

98. Adam Li, Amin Jaber, Elias Bareinboim (2023)

Causal discovery from observational and interventional data across multiple environments *Columbia CausalAI Laboratory*, *Technical Report* (*R-98*), May/2023.

Proc. of the 37th Annual Conference on Neural Information Processing Systems (NeurIPS), 2023. (Acceptance rate = 26%)

97. Yonghan Jung, Ivan Diaz, Jin Tian, Elias Bareinboim (2023)

Estimating Causal Effects Identifiable from a Combination of Observations and Experiments *Columbia CausalAI Laboratory, Technical Report (R-97)*, May/2023.

Proc. of the 37th Annual Conference on Neural Information Processing Systems (NeurIPS), 2023. (Acceptance rate = 26%)

96. Shalmali Joshi, Junzhe Zhang, Elias Bareinboim (2024)

Towards Safe Policy Learning under Partial Identifiability: A Causal Approach

Columbia CausalAI Laboratory, Technical Report (R-96), May/2023.

Proceedings of the 38th AAAI Conference on Artificial Intelligence (AAAI), 2024.

(Acceptance rate = 23.75%)

95. Drago Plecko, Elias Bareinboim (2023)

Causal Fairness for Outcome Control

Columbia CausalAI Laboratory, Technical Report (R-95), May/2023.

Proc. of the 37th Annual Conference on Neural Information Processing Systems (NeurIPS), 2023. (Acceptance rate = 26%)

94. Julius von Kügelgen, Michel Besserve, Wendong Liang, Luigi Gresele, Armin Kekic,

Elias Bareinboim, David Blei, Bernhard Schölkopf (2023)

Nonparametric Identifiability of Causal Representations from Unknown Interventions

Columbia CausalAI Laboratory, Technical Report (R-97), June/2023.

Proc. of the 37th Annual Conference on Neural Information Processing Systems (NeurIPS), 2023. (Acceptance rate = 26%)

93. Drago Plecko, Elias Bareinboim (2023)

A Causal Framework for Decomposing Spurious Variations

Columbia CausalAI Laboratory, Technical Report (R-94), May/2023.

Proc. of the 37th Annual Conference on Neural Information Processing Systems (NeurIPS), 2023. (Acceptance rate = 26%)

92. Drago Plecko, Elias Bareinboim (2024)

Reconciling Predictive and Statistical Parity: A Causal Approach

Columbia CausalAI Laboratory, Technical Report (R-92), February/2023.

Proceedings of the 38th AAAI Conference on Artificial Intelligence (AAAI), 2024.

(Acceptance rate = 23.75%)

91. Yonghan Jung, Jin Tian, Elias Bareinboim (2023)

Estimating Joint Treatment Effects by Combining Multiple Experiments

Columbia CausalAI Laboratory, Technical Report (R-91), Apr/2023.

Proceedings of the 39th International Conference on Machine Learning (ICML), 2023.

(Acceptance rate = 27%)

90. Drago Plecko, Elias Bareinboim (2022)

Causal Fairness Analysis

Columbia CausalAI Laboratory, Technical Report (R-90), July/2022.

Foundations and Trends in Machine Learning, forthcoming.

89. Darren Kangrui, Junzhe Zhang, Sharon Di, Elias Bareinboim (2023)

Causal Imitation Learning via Inverse Reinforcement Learning

Columbia CausalAI Laboratory, Technical Report (R-89), May/2022.

Proc. of the 11th International Conference on Learning Representations (ICLR), 2023.

 $(Acceptance\ rate\ =31\%)$

88. Alexis Bellot, Elias Bareinboim (2023)

Partial Transportability for Domain Generalization

Columbia CausalAI Laboratory, Technical Report (R-88), May/2023.

87. Kevin Xia, Yushu Pan, Elias Bareinboim (2023)

Neural Causal Models for Counterfactual Identification and Estimation

Columbia CausalAI Laboratory, Technical Report (R-87), May/2022.

Proc. of the 11th International Conference on Learning Representations (ICLR), 2023.

 $(Acceptance\ rate\ =31\%)$

86. Amin Jaber, Adele Ribeiro, Jiji Zhang, Elias Bareinboim (2022)

Causal Identification under Markov equivalence: Calculus, Algorithm, and Completeness *Columbia CausalAI Laboratory*, *Technical Report* (*R-86*), May/2022.

Proc. of the 36th Annual Conference on Neural Information Processing Systems (NeurIPS), 2022.

 $(Acceptance\ rate < 2\%\ (highlight))$

85. Hyunchai Jeong, Jin Tian, Elias Bareinboim (2022)

Finding and Listing Front-door Adjustment Sets

Columbia CausalAI Laboratory, Technical Report (R-85), Sep/2022.

Proc. of the 36th Annual Conference on Neural Information Processing Systems (NeurIPS), 2022.

(Acceptance rate = 26%)

84. Junzhe Zhang, Elias Bareinboim (2022)

Online Reinforcement Learning for Mixed Policy Scopes

Columbia CausalAI Laboratory, Technical Report (R-84), May/2022.

Proc. of the 36th Annual Conference on Neural Information Processing Systems (NeurIPS), 2022.

(Acceptance rate = 26%)

83. Alexis Bellot, Junzhe Zhang, Elias Bareinboim (2024)

Scores for Learning Discrete Causal Graphs with Unobserved Confounders

Columbia CausalAI Laboratory, Technical Report (R-83), May/2022.

Proceedings of the 38th AAAI Conference on Artificial Intelligence (AAAI), 2024.

(Acceptance rate = 23.75%)

82. Juan Correa, Sanghack Lee, Elias Bareinboim (2022)

Counterfactual Transportability: A Formal Approach

Columbia CausalAI Laboratory, Technical Report (R-82), May/2022.

Proceedings of the 38th International Conference on Machine Learning (ICML), 2022.

(Acceptance rate = 21%)

81. Yonghan Jung, Shiva Kasiviswanathan, Jin Tian, Dominik Janzing, Elias Bareinboim (2022)

On Measuring Causal Contributions via do-Interventions

Columbia CausalAI Laboratory, Technical Report (R-81), May/2022.

Proceedings of the 38th International Conference on Machine Learning (ICML), 2022.

(Acceptance rate = 21%)

80. Kevin Xia, Kai-Zhan Lee, Yoshua Bengio, Elias Bareinboim (2021)

The Causal-Neural Connection: Expressiveness, Learnability, and Inference

Columbia CausalAI Laboratory, Technical Report (R-80), May/2021.

Proc. of the 35th Annual Conference on Neural Information Processing Systems (NeurIPS), 2021.

(Acceptance rate = 26%)

79. Juan Correa, Sanghack Lee, Elias Bareinboim (2021)

Nested Counterfactual Identification from Arbitrary Surrogate Experiments

Columbia CausalAI Laboratory, Technical Report (R-79), May/2021.

Proc. of the 35th Annual Conference on Neural Information Processing Systems (NeurIPS), 2021.

(Acceptance rate = 26%)

78. Junzhe Zhang, Jin Tian, Elias Bareinboim (2022)

Partial Counterfactual Identification from Observational and Interventional Data

Columbia CausalAI Laboratory, Technical Report (R-78), May/2021.

Proceedings of the 38th International Conference on Machine Learning (ICML), 2022.

(Acceptance rate = 21%)

77. Tara Anand, Adele Ribeiro, Jin Tian, Elias Bareinboim (2023)

Effect Identification in Causal Diagrams with Clustered Variables

Columbia CausalAI Laboratory, Technical Report (R-77), May/2021.

Proceedings of the 37th AAAI Conference on Artificial Intelligence (AAAI), 2023.

(Acceptance rate = 19.6%)

76. Daniel Kumor Justin Zhang, Elias Bareinboim (2021)

Sequential Causal Imitation Learning with Unobserved Confounders

Columbia CausalAI Laboratory, Technical Report (R-76), May/2021.

Proc. of the 35th Annual Conference on Neural Information Processing Systems (NeurIPS), 2021.

(Acceptance rate < 1% (oral))

75. Yonghan Jung, Jin Tian, Elias Bareinboim (2021)

Double Machine Learning Density Estimation for Local Treatment Effects with Instruments *Columbia CausalAI Laboratory, Technical Report (R-75)*, May/2021.

Proc. of the 35th Annual Conference on Neural Information Processing Systems (NeurIPS), 2021.

(Acceptance rate < 3% (spotlight))

74. C. Mao, K. Xia, J. Wang, H. Wang, J. Yang, E. Bareinboim, C. Vondrick (2022)

Causal Transportability for Neural Representations

Columbia CausalAI Laboratory, Technical Report (R-74), forthcoming.

Proc. of IEEE/CVF Conference on Computer Vision & Pattern Recognition (CVPR), 2022, in press. (Acceptance rate = 25%)

73. Adele Ribeiro, Elias Bareinboim (2022)

Causal Inference and Data Fusion: Towards an Accelerated Process of Scientific Discovery

Columbia CausalAI Laboratory, Technical Report (R-73), Apr/2022.

Organisation for Economic Co-operation and Development (OECD),

Volume "AI and the productivity of science", forthcoming.

72. Junzhe Zhang, Elias Bareinboim (2021)

Non-Parametric Methods for Partial Identification of Causal Effects

Columbia CausalAI Laboratory, Technical Report (R-72), Feb/2021.

71. Yonghan Jung, Jin Tian, Elias Bareinboim (2021)

Estimating Identifiable Causal Effects on Markov Equiv. Class through Double Machine Learning *Columbia CausalAI Laboratory, Technical Report (R-71)*, Feb/2021.

Proceedings of the 37th International Conference on Machine Learning (ICML), 2021.

(Acceptance rate = 21%)

70. Sanghack Lee, Elias Bareinboim (2021)

Causal Identification with Matrix Equations

Columbia CausalAI Laboratory, Technical Report (R-70), Jun/2021.

Proc. of the 35th Annual Conference on Neural Information Processing Systems (NeurIPS), 2021.

(Acceptance rate < 1% (oral))

69. Yonghan Jung, Jin Tian, Elias Bareinboim (2021)

Estimating Identifiable Causal Effects through Double Machine Learning

Columbia CausalAI Laboratory, Technical Report (R-69), Jun/2020.

Proceedings of the 35th AAAI Conference on Artificial Intelligence (AAAI), 2021.

(Acceptance rate = 21%)

68. Junzhe Zhang and Elias Bareinboim (2021)

Bounding Causal Effects on Continuous Outcomes

Columbia CausalAI Laboratory, Technical Report (R-61).

Proceedings of the 35th AAAI Conference on Artificial Intelligence (AAAI), 2021.

(Acceptance rate = 21%)

67. Juan Correa and Elias Bareinboim (2020)

General Transportability of Soft Interventions: Completeness Results

Columbia CausalAI Laboratory, Technical Report (R-68).

Proc. of the 34th Annual Conference on Neural Information Processing Systems (NeurIPS), 2020.

(Acceptance rate = 20%)

66. Amin Jaber, Murat Kocaoglu, Karthikeyan Shanmugam, Elias Bareinboim (2020)

Causal Discovery from Soft Interventions with Unknown Targets: Characterization & Learning *Columbia CausalAI Laboratory*, *Technical Report* (*R*-67).

Proc. of the 34th Annual Conference on Neural Information Processing Systems (NeurIPS), 2020. (Acceptance rate = 20%)

65. Junzhe Zhang, Daniel Kumor, Elias Bareinboim (2020)

Causal Imitation Learning with Unobserved Confounders

Columbia CausalAI Laboratory, Technical Report (R-66).

Proc. of the 34th Annual Conference on Neural Information Processing Systems (NeurIPS), 2020. (Acceptance rate < 1% (oral))

64. Elias Bareinboim, Sanghack Lee, Junzhe Zhang (2020)

An Introduction to Causal Reinforcement Learning

Columbia CausalAI Laboratory, Technical Report (R-65), forthcoming.

63. Junzhe Zhang and Elias Bareinboim (2022)

Can Humans Be Out of the Loop?

Columbia CausalAI Laboratory, Technical Report (R-64), Jun/2020.

Proc. of the 1st Conference on Causal Learning and Reasoning (CLeaR), 2022.

62. Sanghack Lee and Elias Bareinboim (2020)

Characterizing Optimal Mixed Policies: Where to Intervene, What to Observe

Columbia CausalAI Laboratory, Technical Report (R-63).

Proc. of the 34th Annual Conference on Neural Information Processing Systems (NeurIPS), 2020. (Acceptance rate = 20%)

61. Yonghan Jung, Jin Tian, Elias Bareinboim (2020)

Learning Causal Effects via Empirical Risk Minimization

Columbia CausalAI Laboratory, Technical Report (R-62).

Proc. of the 34th Annual Conference on Neural Information Processing Systems (NeurIPS), 2020. (Acceptance rate = 20%)

60. Elias Bareinboim, Juan Correa, Duligur Ibeling, Thomas Icard (2020)

On Pearl's Hierarchy and the Foundations of Causal Inference

Columbia CausalAI Laboratory, Technical Report (R-60), 2020.

ACM Special Turing Series, Vol. "Probabilistic and Causal Inference: The Works of Judea Pearl".

59. Yonghan Jung, Yuhao Wang, Jin Tian, Elias Bareinboim (2020)

Efficient and Doubly Robust Estimation of Causal Effects

Columbia CausalAI Laboratory, Technical Report (R-59), 2020, forthcoming.

58. Sanghack Lee and Elias Bareinboim (2020)

Causal Effect Identifiability under Partial-Observability

Columbia CausalAI Laboratory, Technical Report (R-58), 2020.

Proceedings of the 37th International Conference on Machine Learning (ICML), 2020.

(Acceptance rate = 21.8%)

57. Junzhe Zhang and Elias Bareinboim (2020)

Designing Optimal Dynamic Treatment Regimes: A Causal RL Approach

Columbia CausalAI Laboratory, Technical Report (R-57), 2020.

Proceedings of the 37th International Conference on Machine Learning (ICML), 2020.

(Acceptance rate = 21.8%)

56. Daniel Kumor, Carlos Cinelli, Elias Bareinboim (2020)

Efficient Identification in Linear Structural Causal Models with Auxiliary Cutsets

Columbia CausalAI Laboratory, Technical Report (R-56), 2020.

Proceedings of the 37th International Conference on Machine Learning (ICML), 2020.

(Acceptance rate = 21.8%)

55. Juan Correa and Elias Bareinboim (2020)

A Calculus For Stochastic Interventions: Causal Effect Identification and Surrogate Experiments *Columbia CausalAI Laboratory, Technical Report (R-55), 2020.*

Proceedings of the 34th AAAI Conference on Artificial Intelligence (AAAI), 2020.

(Acceptance rate = 20.6%)

54. Yonghan Jung, Jin Tian, Elias Bareinboim (2020)

Estimating Causal Effects Using Weighting-Based Estimators

Columbia CausalAI Laboratory, Technical Report (R-54), 2020.

Proceedings of the 34th AAAI Conference on Artificial Intelligence (AAAI), 2020.

(Acceptance rate = 20.6%)

53. Sanghack Lee, Juan Correa, Elias Bareinboim (2020)

Generalized Transportability: Synthesis of Experiments from Heterogeneous Domains

Columbia CausalAI Laboratory, Technical Report (R-53), 2020.

Proceedings of the 34th AAAI Conference on Artificial Intelligence (AAAI), 2020.

(Acceptance rate = 20.6%)

52. Sanghack Lee, Juan Correa, Elias Bareinboim (2020)

Identifiability from a Combination of Observations and Experiments

Columbia CausalAI Laboratory, Technical Report (R-52), 2020.

Proceedings of the 34th AAAI Conference on Artificial Intelligence (AAAI), 2020.

(Acceptance rate = 20.6% [best paper award — sister's conference track])

51. P. Hunermund and Elias Bareinboim (2019)

Causal Inference and Data-Fusion in Econometrics

Columbia CausalAI Laboratory, Technical Report (R-51), 2019.

The Econometrics Journal, 2023 in press.

50. Amin Jaber, Jiji Zhang, Elias Bareinboim (2019)

Identification of Conditional Causal Effects under Markov Equivalence

Columbia CausalAI Laboratory, Technical Report (R-50), 2019.

Proc. of the 33rd Annual Conference on Neural Information Processing Systems (NeurIPS), 2019.

(Acceptance rate = 2.5% (spotlight))

49. Daniel Kumor, Bryant Chen, Elias Bareinboim (2019)

Efficient Identification in Linear Structural Causal Models with Instrumental Cutsets

Columbia CausalAI Laboratory, Technical Report (R-49), 2019.

 $Proc.\ of\ the\ 33rd\ Annual\ Conference\ on\ Neural\ Information\ Processing\ Systems\ (NeurIPS), 2019.$

(Acceptance rate = 21%)

48. Junzhe Zhang and Elias Bareinboim (2019)

Near-Optimal Reinforcement Learning in Dynamic Treatment Regimes

Columbia CausalAI Laboratory, Technical Report (R-48), 2019.

Proc. of the 33rd Annual Conference on Neural Information Processing Systems (NeurIPS), 2019.

(Acceptance rate = 21%)

47. Murat Kocaoglu, Amin Jaber, Karthikeyan Shanmugam, Elias Bareinboim (2019)

Characterization and Learning of Causal Graphs with Latent Variables from Soft Interventions *Columbia CausalAI Laboratory*, *Technical Report* (*R-47*), 2019.

Proc. of the 33rd Annual Conference on Neural Information Processing Systems (NeurIPS), 2019.

(Acceptance rate = 21%)

46. Sanglack Lee, Juan Correa, Elias Bareinboim (2019)

General Identifiability with Arbitrary Surrogate Experiments

Columbia CausalAI Laboratory, Technical Report (R-46), 2019.

Proceedings of the 35th Uncertainty in Artificial Intelligence (UAI), 2019.

Best Paper Award (1 out of 450 papers).

(Acceptance rate = 26%)

45. Juan Correa and Elias Bareinboim (2019)

From Statistical Transportability to Estimating the Effects of Stochastic Interventions

Columbia CausalAI Laboratory, Technical Report (R-45), 2019.

Proceedings of the 28th International Joint Conference on Artificial Intelligence (IJCAI), 2019.

(Acceptance rate = 17.8%)

44. Amin Jaber, Jiji Zhang, Elias Bareinboim (2019)

On Causal Identification under Markov Equivalence

Columbia CausalAI Laboratory, Technical Report (R-44), 2019.

Proceedings of the 28th International Joint Conference on Artificial Intelligence (IJCAI), 2019.

(Acceptance rate = 17.8%)

43. Juan Correa, Jin Tian, Elias Bareinboim (2019)

Adjustment Criteria for Generalizing Experimental Findings

Columbia CausalAI Laboratory, Technical Report (R-43), 2019.

Proceedings of the 36th International Conference on Machine Learning (ICML), 2019.

(Acceptance rate = 22.5%)

42. Amin Jaber, Jiji Zhang, Elias Bareinboim (2019)

Causal Identification under Markov Equivalence: Completeness Results

Columbia CausalAI Laboratory, Technical Report (R-42), 2019.

Proceedings of the 36th International Conference on Machine Learning (ICML), 2019.

(Acceptance rate = 22.5%)

41. Carlos Cinelli, Daniel Kumor, Bryant Chen, Judea Pearl, Elias Bareinboim (2019)

Sensitivity Analysis of Linear Structural Causal Models

Columbia CausalAI Laboratory, Technical Report (R-41), 2019.

Proceedings of the 36th International Conference on Machine Learning (ICML), 2019.

(Acceptance rate = 22.5%)

40. Sanghack Lee and Elias Bareinboim (2019)

On Structural Causal Bandits with Non-manipulable Variables

Columbia CausalAI Laboratory, Technical Report (R-40), 2019.

Proceedings of the 33th AAAI Conference on Artificial Intelligence (AAAI), 2019.

(Acceptance rate = 16.2%)

39. Andrew Forney and Elias Bareinboim (2019)

Counterfactual Randomization: Rescuing Experimental Studies from Obscured Confounding

Columbia CausalAI Laboratory, Technical Report (R-39), 2019.

Proceedings of the 33th AAAI Conference on Artificial Intelligence (AAAI), 2019.

(Acceptance rate = 16.2%)

38. Juan Correa, Jin Tian, Elias Bareinboim (2019)

Identification of Causal Effects in the Presence of Selection Bias

Columbia CausalAI Laboratory, Technical Report (R-38), 2019.

Proceedings of the 33th AAAI Conference on Artificial Intelligence (AAAI), 2019.

(Acceptance rate = 16.2%)

37. Junzhe Zhang and Elias Bareinboim (2018)

Equality of Opportunity in Classification: A Causal Approach

Proc. of the 32nd Annual Conference on Neural Information Processing Systems (NeurIPS), 2018.

(Acceptance rate = 21%)

36. Sanghack Lee and Elias Bareinboim (2018)

Structural Causal Bandits: Where to intervene?

Proc. of the 32nd Annual Conference on Neural Information Processing Systems (NeurIPS), 2018.

(Acceptance rate = 21%)

35. Amin Jaber, Jiji Zhang, Elias Bareinboim (2018)

Causal Identification under Markov Equivalence

Proceedings of the 34th Uncertainty in Artificial Intelligence (UAI), 2018.

Best Student Paper Award (1 out of 337 papers).

 $(Acceptance\ rate = 9\%\ (plenary))$

34. Junzhe Zhang and Elias Bareinboim (2018)

Non-Parametric Path Analysis in Structural Causal Models

Proceedings of the 34th Uncertainty in Artificial Intelligence (UAI), 2018.

 $(Acceptance\ rate = 9\%\ (plenary))$

33. Amiremad Ghassami, Saber Salehkaleybar, Negar Kiyavash, Elias Bareinboim (2018)

Budgeted Experimental Design for Causal Structural Learning

Proceedings of the 35th International Conference on Machine Learning (ICML), 2018.

 $(Acceptance\ rate = 25\%)$

32. Amin Jaber, Jiji Zhang, Elias Bareinboim (2018)

A Graphical Criterion for Effect Identification in Equivalence Classes of Causal Diagrams Proceedings of the 27th International Joint Conference on Artificial Intelligence (IJCAI), 2018. (Acceptance rate = 20%)

31. Judea Pearl and Elias Bareinboim (2018)

A note on "Generalizability of Study Results (Lesko et al., 2017)" *Purdue CausalAI Laboratory, Technical Report (R-31), Apr/2018. Epidemiology*, v. 30(2), pp. 186-188, Mar/2019.

30. Junzhe Zhang and Elias Bareinboim (2018)

Fairness in Decision-Making — The Causal Explanation Formula Proceedings of the 32nd AAAI Conference on Artificial Intelligence (AAAI), 2018. (Acceptance rate = 24%)

29. Juan Correa, Jin Tian, Elias Bareinboim (2018)

Generalized Adjustment under Confounding and Selection Biases Proceedings of the 32nd AAAI Conference on Artificial Intelligence (AAAI), 2018. Outstanding Paper Honorable Mention (2 out of 3800 papers). (Acceptance rate = 24%)

28. Murat Kocaoglu, Karthikeyan Shanmugam, Elias Bareinboim (2017)

Experimental Design for Learning Causal Graphs with Latent Variables Proceedings of the 31st Annual Conference on Neural Information Processing Systems (NIPS), 2017. (Acceptance rate = 21%)

27. Bryant Chen, Daniel Kumor, Elias Bareinboim (2017)

Identification and Model Testing in Linear Structural Equation Models using Auxiliary Variables *Proceedings of the 34th International Conference on Machine Learning (ICML)*, 2017. (Acceptance rate = 24%)

26. Andrew Forney, Judea Pearl, Elias Bareinboim (2017)

Counterfactual Data-Fusion for Online Reinforcement Learners

Proceedings of the 34th International Conference on Machine Learning (ICML), 2017.

(Acceptance rate = 24%)

25. Junzhe Zhang and Elias Bareinboim (2017)

Transfer Learning in Multi-Armed Bandits: A Causal Approach

Proceedings of the 26th International Joint Conference on Artificial Intelligence (IJCAI), 2017.

(Acceptance rate = 26%)

24. Juan Correa and Elias Bareinboim (2017)

Causal Effect Identification by Adjustment under Confounding and Selection Biases *Proceedings of the 31th AAAI Conference on Artificial Intelligence* (AAAI), 2017. (*Acceptance rate* = 25%)

23. Junzhe Zhang and Elias Bareinboim (2016)

Markov Decision Processes with Unobserved Confounders: A Causal Approach Columbia Causal Al Laboratory, Technical Report (R-23), Dec/2016.

22. Bryant Chen, Judea Pearl, Elias Bareinboim (2016)

Identification by Auxiliary Instrumental Sets in Linear Structural Equation Models

Proceedings of the 25th International Joint Conference on Artificial Intelligence (IJCAI), AAAI

Press, pp. 3577-3583, 2016.

 $(Acceptance\ rate = 25\%)$

21. Elias Bareinboim and Judea Pearl (2016)

Causal Inference and the Data-Fusion Problem

Proceedings of the National Academy of Sciences (PNAS), v. 113(27), 2016.

20. Elias Bareinboim (2016)

Comment on "Causal Inference using invariance prediction: identification and confidence intervals by Peters, Buhlmann and Meinshausen"

Journal of the Royal Statistical Society, Series B.

19. Elias Bareinboim, Andrew Forney, Judea Pearl (2015)

Bandits with Unobserved Confounders: A Causal Approach

Proceedings of the 29th Annual Conference on Neural Information Processing Systems (NIPS), pp. 1342-1350, 2015.

 $(Acceptance\ rate = 21.9\%)$

18. Elias Bareinboim and Jin Tian (2015)

Recovering Causal Effects From Selection Bias

Proceedings of the 29th AAAI Conference on Artificial Intelligence (AAAI), pp. 3475-3481, 2015. (Acceptance rate = 26.7%)

17. Judea Pearl and Elias Bareinboim (2014)

External Validity: From do-calculus to Transportability across Populations *Statistical Science*, v. 29(4), pp. 579-595, 2014.

16. Elias Bareinboim and Judea Pearl (2014)

Transportability from Multiple Environments with Limited Experiments: Completeness Results *Proceedings of the 28th Annual Conference on Neural Information Processing Systems (NIPS)*, pp. 280-288, 2014.

 $(Acceptance\ rate = 24.7\%.)$

15. Elias Bareinboim, Jin Tian, Judea Pearl (2014)

Recovering from Selection Bias in Causal and Statistical Inference

Proceedings of the 28th AAAI Conference on Artificial Intelligence (AAAI), pp. 2410-2416, 2014. Outstanding Paper Award (1 out of 1406 papers).

(Acceptance rate = 28%.)

14. Elias Bareinboim and Judea Pearl (2013)

A General Algorithm for Deciding Transportability of Experimental Results *Journal of Causal Inference*, v. 1(1), pp. 107-134, 2013.

13. Elias Bareinboim, Sanghack Lee, Vasant Honavar, Judea Pearl (2013)

Transportability from Multiple Environments with Limited Experiments

Proceedings of the 27th Annual Conference on Neural Information Processing Systems (NIPS), pp. 136-144, 2013.

 $(Acceptance\ rate = 25\%)$

12. Elias Bareinboim and Judea Pearl (2013)

Causal Transportability with Limited Experiments

Proceedings of the 27th AAAI Conference on Artificial Intelligence (AAAI), pp. 95-101, 2013. (Acceptance rate = 29%)

11. Elias Bareinboim and Judea Pearl (2013)

Meta-transportability of Causal Effects: A Formal Approach

Proceedings of the 16th International Conference on Artificial Intelligence and Statistics (AISTATS), JMLR, pp. 135-143, 2013.

(Acceptance rate = 11% (plenary))

10. Elias Bareinboim and Judea Pearl (2012)

Causal Inference by Surrogate Experiments (or, *z*-Identifiability)

Proceedings of the 28th Conference on Uncertainty in Artificial Intelligence (UAI), AUAI Press, pp. 113-120, 2012.

 $(Acceptance\ rate = 31\%)$

9. Elias Bareinboim and Judea Pearl (2012)

Transportability of Causal Effects: Completeness Results

Proceedings of the 26th AAAI Conference on Artificial Intelligence (AAAI), pp. 698-704, 2012. (Acceptance rate = 26%)

8. Elias Bareinboim and Judea Pearl (2012)

Controlling Selection Bias in Causal Inference

Proceedings of the 15th International Conference on Artificial Intelligence and Statistics (AISTATS), JMLR, pp. 100-108, 2012.

 $(Acceptance\ rate = 33\%)$

7. Elias Bareinboim, Carlos Brito, Judea Pearl (2012)

Local characterizations of Causal Bayesian Networks

Lecture Notes in Artificial Intelligence, v. 7205, Springer-Verlag, pp. 1-17, 2012.

6. Judea Pearl and Elias Bareinboim (2011)

Transportability across studies: A formal approach

Proceedings of the 25th AAAI Conference on Artificial Intelligence (AAAI), pp. 247-254, 2011. (Acceptance rate = 24.8%)

5. Judea Pearl and Elias Bareinboim (2011)

External Validity and Transportability: A formal approach

Proceedings of the Joint Statistical Meetings, American Statistical Association, pp. 157-171, 2011.

4. Paulo Carvalho, J. Fischer, J. Perales, J. Yates, V. C. Barbosa, Elias Bareinboim (2011)

A statistical approach for analyzing marginal cases in shotgun proteomics *Bioinformatics*, v. 27(2), 2011.

3. <u>Elias Bareinboim</u>, Carlos Brito, Judea Pearl (2011) Local characterizations of Causal Bayesian Networks Proceedings of Graph Structures for Knowledge Representation and Reasoning — IJCAI, 2011.

- 2. <u>Elias Bareinboim</u> and Valmir C. Barbosa (2008) Descents and nodal load in scale-free networks *Physical Review E*, v. 77(4), American Physical Society, 2008.
- Elias Bareinboim, Ana T. R. Vasconselos, Joao C. P. Silva (2007)
 Grammatical inference applied to linguistic modeling of biological networks
 E. Journal of Communication, Information & Innovation in Health, v.1, pp. 329-333, 2007.

Team / Mentoring

- Ph.D. students

- Yonghan Jung (Fall/18-)
 Title (tentative): Estimation of Causal Effects
- Hyun Chai Jeong (Fall/18-)
- Kevin Xia (Spring/20-)
- Kasra Jalaldoust (Fall/21-)
- Kai-Zhan Lee (Fall/21-)
- Mingxuan Li (Fall/21-)
- Yushu Pan (Fall/21-)
- Tara Anand (Fall/21-; co-advised w/ Prof. George Hripcsak @DBMI)
- Yusuf Efe (Fall/22-)
- Aurghya Maiti (Fall/22-)
- Arvind Raghavan (Spring/23-)
- Adiba Ejaz (Fall/23-)
- Hongshuo Yang (Fall/23-)

Postdoctoral Scholars

- Drago Plecko (Fall/22-)
- Adam Li (Spring/22-)
- Junzhe Zhang (Fall/23-)

— Alumni

• Juan David Correa (PhD; Fall/16-Summer/21)

Title: A Computational Perspective of Causal Inference and the Data Fusion Problem

• Daniel Kumor (PhD; Fall/16-Spring/21)

Title: Effect Algorithms for Identification in Linear Systems and Imitation Learning

• Amin Jaber (PhD; Fall/16-Fall/22)

Title: Causal Identification in Equivalence Classes

• Junzhe Zhang (PhD; Fall/16-Summer/23)

Title: Towards Causal Reinforcement Learning

• Alexis Bellot (Postdoc; Summer/21-Spring/22)

Current: Researcher, Deep Mind

• Adele Ribeiro (Postdoc; Fall/19-Summer/22)

Current: Postdoc Scholar, Philipps-Universität Marburg

• Sanghack Lee (Postdoc; Spring/18-Spring/21)

Current: Assistant Professor, Seoul National University

- Visiting Scholars

- Prof. Juan Correa (Summer/22, Summer/23)
- Christoffer Riis (Fall/22-Spring/23)
- Julius von Kügelgen (Jun/22)
- Drago Plecko (Fall/21-Spring/22)
- Prof. Jin Tian (Fall/20-Summer/21)

M.Sc. students

• Prateek Jain (Spring/23-)

- Undergraduate

• Noah Rouleau (Fall/15)

• Mahimna Kelkar (Fall/17)

Current: PhD student, Cornell University

PhD Committees

• Dustin Train (defense: 8/20)

Advisor: David Blei

• Tyler Joseph (defense: 3/21)

Advisor: Itsik Pe'er

Teaching

- At Columbia (instructor)

- CS 4775 (graduate), Causal Inference I: Spring/2020, Fall/2020, Fall/2021, Fall/2022, Fall/2023.
- CS 4995 (graduate), Causal Inference II: Spring/2021, Spring/2022, Spring/2023.
- CS 6995 (graduate), Causal Trustworthy AI: Fall/2023.

At Purdue (instructor)

- CS 47100 (undergraduate), Artificial Intelligence, Spring/2017, Spring/2018.
- CS 57800 (graduate) Machine Learning, Fall/2015.
- CS 59000-AI (graduate), Artificial Intelligence, Fall/2016, Fall/2018.
- CS 59000-AML (graduate), Causal Inference / Advanced Machine Learning, Spring/2016, Fall/2017, Spring/2019.

Before

- CS 262Z (graduate), Causal Inference, instructor with J. Pearl and J. Tian, UCLA, Spring/2013.
- CS 262Z (graduate), Causal Inference, teaching assistant, UCLA, Spring/2010, Spring/2011.
- MAB 525 (undergrad), Special Topics in Artificial Intelligence, instructor with J. C. P. Silva, Federal University of Rio de Janeiro (UFRJ), Spring/2007.

Tutorials & Short Courses

- "Causal Fairness Analysis" (with D. Plecko)
 Association for Advancement of Artificial Intelligence (AAAI), Vancouver, Feb/2024, forthcoming.
- "Causal Fairness Analysis" (with D. Plecko)
 International Conference on Machine Learning (ICML), Baltimore, Jul/2022.
- "Causal Inference and the Data-Fusion Problem" (with A Ribeiro) Lisbon Machine Learning School (LxML), Jul/2022.
- "An Introduction to Causal Inference"
 Bellairs Invitational Workshop on Causal Inference & Representation Learning, Barbados, Mar/2022.
- "Causal Inference and the Data-Fusion Problem" (with A Ribeiro) Lisbon Machine Learning School (LxML), Jun/2021.
- "Causal Fairness Analysis" (with D. Plecko, J. Zhang)
 ACM Conference on Fairness, Accountability, and Transparency (FaccT), Mar/2021.
- "Causal Inference and the Data-Fusion Problem" (with A Ribeiro) Annual Deming Conference on Applied Statistics, NY, Dec/2020.
- "Causal Inference in the Health Sciences" (with M. Adibuzzaman, A. Ribeiro).

 American Medical Informatics Association Annual Symposium (AMIA), Nov/2020.
- "Causal Reinforcement Learning"
 International Conference on Machine Learning (ICML), Jul/2020.
- "Causal Reinforcement Learning" (with S. Lee, J. Zhang)
 International Joint Conference on Artificial Intelligence (IJCAI), Macau, China, Aug/2019.

- "An Introduction to Causal Inference"
 Machine Learning Research School (MLRS), Bangkok, Thailand, Aug/2019.
- "Causal Reinforcement Learning"
 Uncertainty in Artificial Intelligence (UAI), Tel Aviv, Israel, Jul/2019.
- "Causal Inference and the Data-Fusion Problem"
 International Conference on Autonomous Agents and Multi-agent Systems (AAMAS), Sao Paulo, Brazil, May/2017.
- "An Introduction to Causal Inference"

 West Coast Experiments Conference (Graphical Models in Economics), Los Angeles, CA, Apr/2017.
- "Causal Inference and the Data-Fusion Problem"
 Association for Advancement of Artificial Intelligence (AAAI), San Francisco, CA, Feb/2017.
- "Causal Inference and the Data-Fusion Problem"
 Department of Computing Science, University of Alberta, Edmonton, Canada, August/2016.
- "Causes and Counterfactuals: Concepts, principles, and tools" (with J. Pearl) Neural Information Processing (NIPS), Lake Tahoe, Nevada, December/2013.
- "Causality and Big Data" EMC² Summer School on Big Data, Rio de Janeiro, Brazil, February/2013.
- "An Introduction to Causal Inference"

 The Second IEEE Conference on Healthcare Informatics and Systems Biology (Analyzing Big Data For Healthcare and Biomedical Sciences), UCSD, La Jolla, California, September/2012.

Invited Talks, Lectures, Panels

- 2024 Workshop on Applied Algorithms for Machine Learning (Future of Computation), forthcoming.
- 2024 Yale AI in Medicine Interest Group, forthcoming.
- 2024 Workshop on Causal Discovery in Semiconductor Manufacturing (NSF/NIST), forthcoming.
- 2024 Columbia-Dream Sports Research Center.
- 2023 Yale Research Initiative on Innovation and Scale Annual Meeting.
- 2023 Columbia Economics Department.
- 2023 NSF NAII (kickoff), The Artificial and Natural Intelligence Institute.
- 2023 National Academy of Sciences.
- 2023 IROS workshop on Causality for Robotics.
- 2023 Causality for Ethics and Society Workshop, LMU Munich.
- 2023 CVPR Workshop on Compositionality, Prompts and Causality.
- 2023 Bloomberg's Quant seminar series.
- 2023 UChicago Booth Econometrics and Statistics seminar.
- 2023 UIUC Causal Inference Workshop: Current Trends and the Future of Research.
- 2023 Vanderbilt Biostatistics seminar.

- 2023 Columbia Department of Biomedical Informatics.
- 2023 UMass Computer Science seminar.
- 2022 Boeing Aerospace & Autonomy Center.
- 2022 Bloomberg's Data Science Speaker Series.
- 2022 Oregon State University, AI seminar.
- 2022 ICLR Workshop on "Privacy, Accountability, Interpretability, Robustness, Reasoning on Structured Data" (PAIR2Struct).
- 2022 1st International Workshop on Interactive Causal Learning.
- 2022 MIT IDSS Distinguished Speaker Seminar.
- 2022 UC Berkeley/Simons Institute Workshop on "Learning from Interventions".
- 2021 NeurIPS Workshop on Algorithmic Fairness thr. the Lens of Causality & Robustness.
- 2021 NeurIPS Workshop on Causality in Sequential Decision Making.
- 2021 MIT-Harvard Economics seminar.
- 2021 ICML Algorithmic Recourse Workshop.
- 2021 ICAPS Workshop on Planning and Reinforcement Learning.
- 2021 JPMorgan Chase Faculty Research Meeting.
- 2021 OECD workshop on AI & the Productivity of Science.
- 2021 Society for Imprecise Probability (SIPTA) Annual Meeting Keynote.
- 2021 Inria Workshop "Leveraging Observational Data with Machine Learning".
- 2021 23rd Japanese Workshop on Information-Based Induction Sciences (IBIS).
- 2021 Seoul National University, Data Science Seminar.
- 2021 Columbia Data Science Institute.
- 2020 Machine Learning in Science and Engineering Conference (MLSE).
- 2020 Society for Epidemiologic Research (SER) Annual Meetings.
- 2020 AMIA Causal Inference from Observational Healthcare Data.
- 2020 CMU Machine Learning Department Seminar.
- 2020 MICCAI Causality in Medical Computing.
- 2020 AFOSR Understanding in the Human and the Machine Workshop.
- 2020 KDD Workshop on Causal Discovery.
- 2020 Microsoft Research Frontiers of Machine Learning.
- 2019 Max Planck Institute (Intelligent Systems), Tübingen, Germany.
- 2019 Mailman School of Public Health, Columbia University, NY.
- 2019 Data Council New York City, NY.
- 2019 INFORMS Annual Meeting, Seattle, WA.
- 2019 Stanford Graduate School of Business, CA.
- 2019 MIT-IBM Watson AI Lab workshop on "Bridging causal inference, reinforcement learning and transfer learning (CRT)", MA.
- 2019 MIT workshop on "Graphical Models, Causality, Exchangeable Models, Graphons", MA.
- 2019 Technion Israel Institute of Technology, Haifa, Israel.
- 2019 Hebrew University of Jerusalem, Jerusalem, Israel.

- 2019 Oberwolfach Research Institute for Mathematics, "Foundations and New Horizons for Causal Inference", Germany.
- 2019 Foundations of Data Science, Purdue University, Lafayette, IN.
- 2019 FDA / DIA Statistics Forum, Washington DC.
- 2019 Computer Science, Columbia University, NY.
- 2019 Harvard Medical School, Boston, MA.
- 2019 UIC Department of Information & Decision Sciences, Chicago, IL.
- 2019 DARPA CausalX-World Modelers' meeting, Los Angeles, CA.
- 2019 AI Roadmap: Learning and Robotics, Computing Community Consortium (CCC), CA.
- 2018 NeurIPS-18 Workshop "Causal Learning", Montreal, Canada.
- 2018 School of Medicine, Indiana University, Indianapolis, IN.
- 2018 NIH Division of Cancer Biology, National Cancer Institute (NCI), Rockville, MD.
- 2018 UAI-18 Workshop on Causal Inference, Monterey, CA.
- 2018 Adobe Research, San Jose, CA.
- 2018 RSS-18 Workshop "Causal Imitation in Robotics", Pittsburgh, PA.
- 2018 Atlantic Causal Inference Conference (ACIC), Pittsburgh, PA.
- 2018 TTI Vanguard Conference (Intelligence: Natural and Artificial), New York, NY.
- 2017 CVPR-17 Workshop "Functionality, Physics, Intentionality, and Causality", Honolulu, HI.
- 2017 Statistical Society of Canada Annual Meeting, Winnipeg, Canada.
- 2017 School of Engineering, University of São Paulo (USP), São Paulo, Brazil.
- 2017 Institute of Computing, University of Campinas (UNICAMP), Campinas, Brazil.
- 2017 Workshop on Causal Analysis in the Social Sciences, UCLA, CA.
- 2017 NSF Workshop: Advancing the Science of Transportation Demand Modeling, UC Berkeley, CA.
- 2017 Computer Science, University of Wisconsin, Madison, WI.
- 2017 Computer Science, ISI / University of Southern California (USC), CA.
- 2016 NeurIPS-16 Workshop "Inference and Learning of Hypothetical and Counterfactual Interventions in Complex Systems", Barcelona, Spain.
- 2016 AAAI-16 Fall Symposium on Accelerating Science: A Grand Challenge for AI, Arlington, VA.
- 2016 Department of Public Health Sciences, University of Chicago, Chicago.
- 2016 54th Allerton Conference on Communication, Control, and Computing, UIUC, IL.
- 2016 Department of Computing Science, University of Alberta, Edmonton, Canada.
- 2016 International Conference on Thinking (ICT), Providence, RI.
- 2016 Joint Statistical Meetings (JSM), Chicago, IL.
- 2016 Workshop on Statistical Causal Inference and its Applications to Genetics, Centre de Recherches Mathématiques (CRM), Montreal, Canada.
- 2016 Frontiers of Engineering Symposium (US-JP), National Academy of Engineering (NAE), CA.
- 2016 Max Planck Institute (Empirical Inference Dept.), Tübingen, Germany.
- 2016 Department of Computer Science and Mathematics, University of Passau, Germany.
- 2016 Munich Workshop on Causal Inference and Information Theory (MCI), Munich, Germany.
- 2016 Statistics Colloquium, Purdue University, West Lafayette, IN.
- 2015 Computer Science, Purdue University, West Lafayette, Indiana.
- 2015 Biostatistics and Computer Science, Johns Hopkins University, Baltimore, Maryland.

- 2015 Computer Science Division, University of California, Berkeley, California.
- 2015 Department of Computer Science, University of Southern California (USC), CA.
- 2015 School of Information and Computer Science, University of California, Irvine, CA.
- 2015 Department of Computer Science, Cornell University, New York.
- 2015 Department of Statistics, Stanford University, California.
- 2015 60th World Congress of Statistics, International Statistics Institute (ISI), Brazil.
- 2014 Department of Economics, University of Chicago, Chicago.
- 2014 Kyoto International Conference on Modern Statistics, Kyoto.
- 2014 International Workshop on Causal Inference and its related topics, Tokyo.
- 2014 ACM-SIGKDD-14 Workshop on Discovery Informatics, New York.
- 2014 UAI-14 Workshop on Causality: Learning and Prediction, Quebec City, Canada.
- 2014 NICTA, Sydney, Australia.
- 2014 Institute of Mathematical Statistics (IMS) Annual Meeting, Sydney, Australia.
- 2014 MURI, Office of Naval Research (ONR), UCLA, Los Angeles, California.
- 2014 Atlantic Causal Inference Conference, Brown University, Providence, RI.
- 2014 Joint Mathematics Meetings, American Mathematical Society, Baltimore, Maryland.
- 2013 NeurIPS-13 Workshop "Causality: Large-scale Experimental Design", Lake Tahoe, NV.
- 2013 MURI, Office of Naval Research (ONR), UCLA, Los Angeles, California.
- 2012 Graduate School of Engineering, Federal University of Rio de Janeiro (UFRJ), Brazil.
- 2012 Computer Science Colloquium, Federal University of Rio de Janeiro (UFRJ), Brazil.
- 2012 MURI, Office of Naval Research (ONR), UCLA, Los Angeles, California.
- 2011 International Workshop on Mining Multiple Information Sources, International Conference on Data Mining (ICDM), Vancouver, Canada.
- 2011 58th World Congress of Statistics, International Statistics Institute (ISI), Dublin.
- 2011 DERI/National University of Ireland (NUI), Galway, Ireland

Funding (Bareinboim's share > \$8M)

• NSF CISE: Large: Causal Foundations of Decision Making and Learning, PI Title: Causal Decision-Making, 10/2023-09/2028.

Amount: \$1,672,312 (=33% of total).

 Defense Advanced Research Projects Agency (DARPA), Young Faculty Award, PI Title: Causal Reinforcement Learning, 9/2023 - 8/2026.

Amount: \$1,000,000 (=100\% of total).

• Columbia-Amazon Center of AI Technology, PI

Title: Algorithmic Fairness through a Causal Lens, 7/2023 - 6/2024.

Amount: \$100,000 (=100\% of total).

NSF Eager, Robust Intelligence/IIS, PI

Title: Causal Decision-Making, 9/2022-8/2023.

Amount: \$150,000 (=50\% of total).

· Computing Research Association, PI

Title: Computing Innovation Fellows, 1/2022-5/2024.

Amount: \$321,288 (=100\% of total).

• Air Force Office of Scientific Research (AFOSR), PI

Title: Causal Reinforcement Learning: Discovery and Decision Making, 09/2022-08/2025.

Amount: \$825,000 (=100% of total).

• Office of Naval Research (ONR), Young Investigator Program (YIP), PI

Title: Causal Reinforcement Learning: Theory, Algorithms, & Applications, 05/2022-04/2025.

Amount: \$510,000 (=100\% of total).

• The Alfred P. Sloan Foundation Award, PI

Title: The Mathematics of Fair Decision-Making, 08/2021-07/2023.

Amount: \$564,726 (=100\% of total).

• Amazon, Research Award (gift)

Title: Approximate Causal Inference, cycle 2021; awarded 2022.

Amount: \$140,000 (=100\% of total).

• JP Morgan, Research Award (gift)

Title: Causal Reinforcement Learning, cycle 2021.

Amount: \$120,000 (=100\% of total).

• Carnegie Mellon University, Software Engineering Institute (SEI)

Title: Investigating the Maturation of Determining the Limits of AI Robustness, 09/2021-08/2022.

Amount: \$200,000 (=20\% of total).

• Department of Energy (DoE), ASCR (thr. UCSD); CU PI: Gentine

Title: Discovering Physically Meaningful Structures from Climate Extreme Data, 09/2021-08/2024.

Amount: \$300,000 (=25\% of total).

• Columbia University, SIRS/STAR Program, PI

Title: Causal Data Science: Towards an Accelerated Process of Cancer Translation Research, (cycles:

2021-22 and 2022-23). Co-PI: Prof. Anil Rustgi (Medical School).

Amount: \$170,000 (=100\% of total).

• Amazon, Research Award (gift)

Title: Off-policy Evaluation through Causal Models, cycle 2020; awarded 2021.

Amount: \$90,000 (=100\% of total).

• NSF, Robust Intelligent/IIS, PI

Title: Towards Causal Fair Decision-Making, 04/2021 - 03/2023.

Amount: \$270,000 (=35% of total).

· Columbia-Amazon Center of AI Technology, PI

Title: Counterfactual Reinforcement Learning for Personalized Decision-Making, 1/2021 - 12/2021.

Amount: \$150,000 (=100\% of total).

• NIH, R01, PI: George Hripcsak

Title: NLM:Discovering and Applying Knowledge in Clinical Databases. 09/2020 - 08/2021.

Amount: \$74,485 (=5\% of total)

NSF, CAREER, PI

Title: Approximate Causal Inference, 04/2018 - 03/2023.

Amount: \$499,712 (=100% of total).

• NSF, Robust Intelligence, Medium, PI

Title: Causal Inference: Identification, Learning, and Decision-Making, 10/2017 - 09/2020.

Amount: \$536,515 (=50% of total).

• Purdue, Integrative Data Science Initiative, PI

Title: Causally-driven Healthcare Science, 06/2018 - 05/2020.

Amount: \$200,000 (=75\% of total).

• Adobe, Data Science Research Award (gift)

Title: Optimal Decision-making under Causal Constraints, 2018.

Amount: \$50,000 (100% of total).

• IBM, Open Collaborative Research Award (gift)

Title: Machine Learning and Causal Inference, 2017.

Amount: \$50,000 (100% of total).

• DARPA, Fundamental Limits of Learning (FunLol), co-PI

Title: Fundamental Limits of Learning Concepts and Models for Complex Systems, 10/2016-12/2017.

Amount: \$125,000 (=16.6\% of total).

Community Service

- Editor-in-Chief, Journal of Causal Inference (JCI), 2023-now.
- Action Editor, Journal of Machine Learning Research (JMLR), 2022-now.
- Reviewer, Israel National Science Foundation, 2023.
- Editorial Board, Journal of Causal Inference (JCI), 2017-2023.
- Chair (with J. Pearl, B. Schölkopf, Y. Bengio, T. Sejnowski), NeurIPS-21 workshop,
 - "WHY-21 Causal Inference and Machine Learning: Why now?", 2021.
- Editor (w/ Mark V. D. Laan), Journal of Causal Inference Special issue on
 - "Integrating Observational Studies with Randomized Trials", 2021-2022.
- Reviewer, National Science Foundation (NSF), area: IIS, 2019, 2020, 2021, 2023.
- Co-chair (w/ B. Schölkopf, K. Zhang, B. Huang et al), NeurIPS Workshop on Causal Discovery, 2020.

- Chair (w/ J. Pearl, B. Schölkopf, C. Szepesvari, S. Mahadevan, P. Tadepalli), AAAI-SS-19, "WHY-19 Beyond Curve Fitting: Causation, Counterfactuals, and Imagination-based AI", 2019.
- Chair (with K. Zhang, C. Uhler, J. Zhang, D. Janzing), 7th UAI Causality Workshop, 2017.
- Co-chair (with K. Zhang, J. Li, L. Liu), KDD Workshop on Causal Discovery, 2016.
- Co-chair (with F. Eberhardt, R. Silva, J. Mooij, M. Maathuis), UAI Causality Workshop, 2016.
- Guest Editor (with J. Pearl, B. Schölkopf, K. Zhang, J. Li), Special Issue on Causality, ACM Transactions on Intelligent Systems and Technology (TIST), 2015.
- Co-chair (with B. Schölkopf, K. Zhang, J. Zhang), ICML 2014 Workshop on Causal Modeling and Machine Learning, 2014.
- Reviewer, National Science Foundation (NSF), area: Methodology, Measurement, and Statistics, 2014.
- Area Chair / Senior PC-Conferences (* Senior AC):
 - 2024: ICML*.
 - 2023: NeurIPS*, AAAI*, ICLR.
 - 2022: NeurIPS*, ICML, AAAI, AIStats, ICLR¹, CLeaR.
 - 2021: NeurIPS*, ICML, AAAI, AIStats, ICLR, UAI, IJCAI.
 - 2020: NeurIPS, ICML, AAAI, AIStats, UAI, IJCAI.
 - 2019: NeurIPS, AAAI.

• Program Committee-Conferences:

- 2020: FODS (Foundations of Data Science).
- 2019: UAI, IJCAI, ICML.
- 2018: NeurIPS, UAI, AAAI, IJCAI, ICML.
- 2017: NeurIPS, UAI, AAAI, AISTATS.
- 2016: NeurIPS, UAI, AAAI, IJCAI, ECAI.
- 2015: NeurIPS, UAI, AAAI, AISTATS, UAI-Causality.
- 2014: UAI, ICML, AISTATS, KDD-DI.
- 2013: UAI, AAAI, IJCAI, ICML, NeurIPS-Causality, IEEE-BigData, UAI-Causality.
- 2012: UAI, ICML.
- 2011: NeurIPS, UAI, IJCAI, ICDM-MMIS.
- 2010: KR (rev).

• Reviewer-Journals:

- 2023: Statistics in Medicine.
- 2022: J. of Machine Learning Research (JMLR), Statistical Science, Journal of the ACM (JACM).
- 2021: J. of Machine Learning Research (JMLR), Statistical Science, PloS Medicine, Epidemiology, Am. J. of Epidemiology.
- 2020: J. of Machine Learning Research (JMLR), Statistical Science, Statistics in Medicine.
- 2019: J. of Machine Learning Research (JMLR), Statistical Science, Statistics in Medicine.
- 2018: J. of Machine Learning Research (JMLR), Artificial Intelligence Journal (AIJ), Statistics in Medicine, Peer J (Computer Science).
- 2017: J. of Machine Learning Research (JMLR), J. of Causal Inference.
- o 2016: Biometrika, Bayesian Analysis, J. Causal Inference, Epidemiology, Behaviormetrika.

¹ Selected as "Highlighted Area Chair".

- 2015: Artificial Intelligence Journal (AIJ), Biometrics, J. of Causal Inference, Epidemiology.
- 2014: Statistical Science, The British Journal for the Philosophy of Science, Annals of Applied Statistics.
- 2013: J. of Machine Learning Research (JMLR), Scandinavian Journal of Statistics, Annals of Applied Statistics, J. of Causal Inference, Statistics in Medicine, Statistics.
- 2012: J. of Machine Learning Research (JMLR), IEEE Transactions on Pattern Analysis and Machine Intelligence (TPAMI), Statistics in Medicine, Bioinformatics, J. of Proteome Research.
- 2011: J. of Causal Inference.
- o 2009: J. of Proteomics, Bioinformatics, Physica A.

Departmental/University Service

- Member, Task Force for AI Initiative, School of Engineering, Columbia University, since 2021.
- Member, Data Science in Health Initiative (DASHI), Data Science Institute, Columbia University, since 2021.
- Columbia University (CS Department):
 - Member, Graduate Admissions Committee, since Fall/2020.
 - Member, Student Nominations Committee, since Fall/2019.
- Purdue University (CS Department):
 - Member, Graduate Committee, Fall/2017-Spring/2019.
 - Member, Graduate Admissions Committee, cycle: Fall/2016, Fall/2017.
- UCLA (CS Department):
 - Reviewer, Graduate Admissions Committee, 2013-2014;
 - Mentor for 3 PhD students, 2010-2013.

Industrial Experience

- Software Engineer, Intern (Systems/Data Mining), Google, Mountain View/CA, USA, Summer 2009.
- Software Engineer, Programare Software Factory, Brazil, Feb/2008 Aug/2008.
- CTO and Co-Founder, Linux Solutions Ltda, Brazil, 1999 2004.

Professional Associations

- Association for the Advancement of Artificial Intelligence (AAAI), since 2011.
- Association for Computing Machinery (ACM), since 2011.
- Brazilian Computer Society (SBC), since 2004.

Media coverage

- MIT Technology Review (featured), "What AI still can't do", Feb/2020 (link).
- NewScientist (featured), "Correlation or causation? Mathematics can finally give us an answer", Apr/2020 (link).
- Communication of ACM (featured), "Solving for Why", Vol. 65(2), p. 11-13, Feb/2022 (link).
- The State of Sao Paulo (in Portuguese), "Brazilians in AI: Elias Bareinboim", Oct/2023 (link).