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## **Education**

Georgia Institute of Technology Atlanta, USA PhD (CS, minor in Optimization) 2013 Indian Institute of Technology Kharagpur, India MSc & BSc (Math & Computing) 2007

## Research & Professional Experience

| 2020 – present | Principal Research Staff Member, IBM Research |
|----------------|---|
| 2018 - 2020    | Research Staff Member, IBM Research           |
| 2017 - 2018    | Principal Product Architect, Infosys Ltd      |
| 2015 - 2017    | Senior Staff Research Scientist, Skytree Inc  |
| 2013 - 2015    | Member of Technical Staff, Skytree Inc        |

## **Research Interests**

I have a wide range of research interests, and enjoy learning about new topics and making connections. Areas I have previously focused on: Optimization, Automated Machine Learning & Data Science, Large Scale Learning, Computational Geometry, Efficient All-Pairs Algorithms & Analysis, Density Estimation, Kernel Methods, Associative Memories & Energy-based Models, Machine Unlearning, Sparse Learning, Neuro-inspired Learning, Compositional Generalization.

#### **Selected Publications**

I have been fortunate to publish in various research areas at top AI, ML and DM conferences and journals (h-index: 23, 50+ publications). I have also filed 20+ patents. Here is a selected subset:

- B. Hoover, D. H. Chau, H. Strobelt, P. Ram, and D. Krotov. Dense Associative Memory Through the Lens of Random Features. *Advances in Neural Information Processing Systems*, 37, 2024
- J. Jia, J. Liu, Y. Zhang, P. Ram, N. Baracaldo, and S. Liu. WAGLE: Strategic Weight Attribution for Effective and Modular Unlearning in Large Language Models. *Advances in Neural Information Processing Systems*, 37, 2024
- P. Ram, T. Klinger, and A. G. Gray. What makes Models Compositional? A Theoretical View. In Proceedings of the Thirty-First International Joint Conference on Artificial Intelligence (IJCAI-24), 2024
- J. Liu, P. Ram, Y. Yao, G. Liu, Y. Liu, P. Sharma, S. Liu, et al. Model Sparsity can Simplify Machine Unlearning.

  \*Advances in Neural Information Processing Systems, 36, 2023 \*\*spotlight, 120+ citations\*\*
- B. Saha, D. Krotov, M. J. Zaki, and P. Ram. End-to-end Differentiable Clustering with Associative Memories. In International Conference on Machine Learning, pages 29649–29670. PMLR, 2023
- Y. Zhou, P. Ram, T. Salonidis, N. Baracaldo, H. Samulowitz, and H. Ludwig. Single-shot General Hyper-parameter Optimization for Federated Learning. In *The 11th International Conference on Learning Representations*, 2023 notable top-25%
- A. Gu, S. Lu, P. Ram, and T.-W. Weng. Min-max Multi-objective Bilevel Optimization with Applications in Robust Machine Learning. In *The 11th International Conference on Learning Representations*, 2023
- P. Ram and K. Sinha. Federated Nearest Neighbor Classification with a Colony of Fruit-flies. In *Proceedings of the AAAI Conference on Artificial Intelligence*, volume 36, pages 8036–8044, 2022
- K. Sinha and P. Ram. Fruit-fly Inspired Neighborhood Encoding for Classification. In *Proceedings of the 27th ACM SIGKDD Conference on Knowledge Discovery & Data Mining*, pages 1470–1480, 2021
- S. Liu, P. Ram, D. Vijaykeerthy, D. Bouneffouf, G. Bramble, H. Samulowitz, D. Wang, A. Conn, and A. Gray. An ADMM-based Framework for AutoML Pipeline Configuration. In *Proceedings of the AAAI Conference on Artificial Intelligence*, volume 34, pages 4892–4899, 2020 90+ citations
- P. Ram and K. Sinha. Revisiting kd-tree for Nearest Neighbor Search. In *Proceedings of the 25th acm sigkdd international conference on knowledge discovery & data mining*, pages 1378–1388, 2019 150+ citations
- R. R. Curtin, P. Ram, and A. G. Gray. Fast Exact Max-kernel Search. In *Proceedings of the 2013 SIAM International Conference on Data Mining*, pages 1–9. Society for Industrial and Applied Mathematics, 2013 best paper finalist
- P. Ram and A. G. Gray. Maximum Inner-product Search using Cone Trees. In *Proceedings of the 18th ACM SIGKDD international conference on Knowledge discovery and data mining*, pages 931–939, 2012 2004 citations
- P. Ram and A. G. Gray. Density Estimation Trees. In *Proceedings of the 17th ACM SIGKDD international conference on Knowledge discovery and data mining*, pages 627–635, 2011 145 citations
- P. Ram, D. Lee, W. March, and A. Gray. Linear-time Algorithms for Pairwise Statistical Problems. *Advances in Neural Information Processing Systems*, 22, 2009 spotlight, 90+ citations

## Recognition

- IBM Research Accomplishments Outstanding Technical Achievement Awards: Towards Automating AI Lifecycle with AutoAI (2019), AutoAI: The Next Level (2020), Federated Learning Security & Privacy (2022), Neurobiologically Inspired Foundation Models (2023).
- IBM Council for Innovation Leadership Eminence & Excellence Award (2024).
- IBM Outstanding Innovation Award for Neurobiologically Inspired Foundation Models (2024).
- IBM Invention Plateau 5 (2024).
- IBM Research Pat Goldberg Best Paper Finalist for An ADMM based Framework for AutoML Pipeline Configuration (2020).
- SIAM Data Mining Best Paper Finalist for Fast Exact Max-Kernel Search (2013).
- NeurIPS Top Reviewer (2022, 2023), ICML Top Reviewer (2022), TMLR Expert Reviewer (2023).

#### Service

- organizer, ICML 2025 Tutorial on Modern Methods in Associative Memory.
- Organizer, NeurIPS 2023 Workshop on Associative Memory and Hopfield Networks.
- Senior PC member AAAI (2024-25), NeurIPS Area Chair (2024-25), ICML Area Chair (2025).
- Office-hours, ICLR 2023.
- Organizer, KDD 2022 Tutorial on Gradual AutoML using Lale.
- Regular PC member for NeurIPS, ICML, AISTATS, ICLR, UAI, KDD, AAAI conferences.

## **Invited Talks**

- **VSAONLINE 06/2025.** Dense Associative Memories through the Lens of Random Features.
- **ICLR 04/2025** workshop on *New Frontiers in Associative Memories*. Associative Memories and its Role in Machine Learning.
- Centaur AI Institute 04/2025. What makes Models Compositional? A Neuro-Symbolic Theoretical View.
- IIITDM Kancheepuram 12/2024 workshop on Future Perspectives of AI & Data Sciences: Algorithms and Applications. The Critical Role of Fundamental Mathematical Tools on the Path to AGI.
- IJCAI 08/2024 workshop on *Logical Foundations of Neuro-Symbolic AI*. What makes Models Compositional? A Neuro-Symbolic Theoretical View.
- **INFORMS 10/2022** session on *Bilevel Stochastic Methods for Optimization and Learning*. Robust Multi-objective Bilevel Optimization With Applications In Machine Learning.
- **SIAMUQ 04/2014** minisymposium on *Nonparametric Density Estimation*. Density Estimation Trees.
- MLConf Atlanta 08/2014. Max-kernel Search: How to search for just about anything?
- U Rochester 03/2013. Fast Similarity Search for the Big Data Era: Boosting Performance with Machine Learning.

## **Teaching**

- Associative Memories at ICML 2025 Tutorial on Modern Methods in Associative Memory.
- Bilevel Optimization at the Polyhedra and Combinatorial Optimization Days 2023 (JPOC13) summer school on Combinatorial Optimization & Machine Learning.
- Compositional Generalization at the *Neuro-Symbolic Summer School* 2023.
- Hands-on tutorial at the KDD 2022 Tutorial on Gradual AutoML using Lale.
- Teaching Assistant, Data and Visual Analytics (Spring 2011, 2013), Georgia Tech.

#### **Research Grants**

- Fast Inference and Alignment for Large Multi-modal Models, RPI-IBM Future of Computing Research Collaboration Program, 2025
- Meta-Transfer-Learning for Tabular Data Distillation, Generation, and Predictive Modeling, RPI-IBM Future of Computing Research Collaboration Program, 2025
- FIT: Fast Inference using Transformer Models, RPI-IBM Future of Computing Research Collaboration Program, 2024
- Data Distillation in Tabular Data: A Foundation Model Approach, RPI-IBM Future of Computing Research Collaboration Program, 2024
- A Framework for Automating Decentralized Training of Foundation Models, RPI-IBM AI Research Collaboration Program, 2023
- AutoDML: A Framework for Automating Decentralized Machine Learning, RPI-IBM AI Research Collaboration Program, 2022

## Mentorship

I have mentored students both during summer internships at IBM research, and through continued collaborations with their advisors at various academic institutions.

## Continuing projects

- Ben Hoover (GT), 2024-present.
- Heshan Fernanda (RPI), 2024-present.
- Inwon Kang (RPI), 2023-present.
- Jinghan Jia (MSU), 2023-present.
- Bishwajit Saha (RPI), 2022-2024.
- Md Ibrahim Alam (RPI), 2022-present.
- Momin Abbas (RPI), 2022-2023.
- Jiancheng Liu (MSU), 2022-present.
- Yuguang Yao (MSU), 2020-present.
- Yihua Zhang (MSU), 2020-present.
- Yunfei Teng (NYU), 2020-2022.

#### Summer interns at IBM

- Inwon Kang (RPI) 2023, 2024
- Charlotte Park (MIT) 2024
- Momin Abbas (RPI) 2023
- Bishwajit Saha (RPI) 2022, 2023
- Xinying Qi (RPI) 2022, 2023
- Lucky Yerimah (RPI) 2021

#### **Undergraduate researchers at MIT-IBM**

• Alex Gu (MIT) 2021

#### **Publications**

Here is the complete list of my publications in chronological order for each publication type.

#### **Book Chapters**

1. Y. Zhou, P. Ram, T. Salonidis, N. Baracaldo, H. Samulowitz, and H. Ludwig. Hyper-parameter optimization in federated learning. In *Federated Learning*, pages 237–255. Academic Press, 2024

## **Journals**

- 1. R. R. Curtin, J. R. Cline, N. P. Slagle, W. B. March, P. Ram, N. A. Mehta, and A. G. Gray. Mlpack: A scalable c++ machine learning library. *The Journal of Machine Learning Research*, 14(1):801–805, 2013
- R. R. Curtin and P. Ram. Dual-tree fast exact max-kernel search. Statistical Analysis and Data Mining: The ASA Data Science Journal, 7(4):229–253, 2014
- 3. R. R. Curtin, D. Lee, W. B. March, and P. Ram. Plug-and-play dual-tree algorithm runtime analysis. *Journal of Machine Learning Research*, 16:3269–3297, 2015
- 4. O. Keivani, K. Sinha, and P. Ram. Improved maximum inner product search with better theoretical guarantee using randomized partition trees. *Machine Learning*, 107(6):1069–1094, 2018
- 5. I. Kang, P. Ram, Y. Zhou, H. Samulowitz, and O. Seneviratne. On learning representations for tabular data distillation. *Transactions on Machine Learning Research*, 2025. URL https://openreview.net/forum?id=GXlsrvOGIK

## **Conferences**

- 1. P. Ram, D. Lee, W. March, and A. Gray. Linear-time Algorithms for Pairwise Statistical Problems. *Advances in Neural Information Processing Systems*, 22, 2009
- 2. P. Ram, D. Lee, H. Ouyang, and A. Gray. Rank-approximate nearest neighbor search: Retaining meaning and speed in high dimensions. *Advances in Neural Information Processing Systems*, 22, 2009
- 3. W. B. March, P. Ram, and A. G. Gray. Fast euclidean minimum spanning tree: algorithm, analysis, and applications. In *Proceedings of the 16th ACM SIGKDD international conference on Knowledge discovery and data mining*, pages 603–612, 2010
- P. Ram, D. Lee, and A. G. Gray. Nearest-neighbor search on a time budget via max-margin trees. In SIAM Data Mining, 2012
- 5. P. Ram and A. G. Gray. Density Estimation Trees. In *Proceedings of the 17th ACM SIGKDD international conference on Knowledge discovery and data mining*, pages 627–635, 2011
- 6. P. Ram and A. G. Gray. Maximum Inner-product Search using Cone Trees. In *Proceedings of the 18th ACM SIGKDD international conference on Knowledge discovery and data mining*, pages 931–939, 2012
- 7. N. Koenigstein, P. Ram, and Y. Shavitt. Efficient retrieval of recommendations in a matrix factorization framework. In *Proceedings of the 21st ACM international conference on Information and knowledge management*, pages 535–544, 2012
- 8. R. R. Curtin, P. Ram, and A. G. Gray. Fast Exact Max-kernel Search. In *Proceedings of the 2013 SIAM International Conference on Data Mining*, pages 1–9. Society for Industrial and Applied Mathematics, 2013
- 9. R. Curtin, W. March, P. Ram, D. Anderson, A. Gray, and C. Isbell. Tree-independent dual-tree algorithms. In *International Conference on Machine Learning*, pages 1435–1443. PMLR, 2013
- 10. P. Ram and A. Gray. Which space partitioning tree to use for search? *Advances in Neural Information Processing Systems*, 26, 2013
- 11. O. Keivani, K. Sinha, and P. Ram. Improved maximum inner product search with better theoretical guarantees. In 2017 International Joint Conference on Neural Networks (IJCNN), pages 2927–2934. IEEE, 2017
- 12. P. Ram and K. Sinha. Revisiting kd-tree for Nearest Neighbor Search. In *Proceedings of the 25th acm sigkdd international conference on knowledge discovery & data mining*, pages 1378–1388, 2019
- 13. D. Wang, J. D. Weisz, M. Muller, P. Ram, W. Geyer, C. Dugan, Y. Tausczik, H. Samulowitz, and A. Gray. Human-ai collaboration in data science: Exploring data scientists' perceptions of automated ai. *Proceedings of the ACM on human-computer interaction*, 3(CSCW):1–24, 2019
- 14. S. Liu, P. Ram, D. Vijaykeerthy, D. Bouneffouf, G. Bramble, H. Samulowitz, D. Wang, A. Conn, and A. Gray. An ADMM-based Framework for AutoML Pipeline Configuration. In *Proceedings of the AAAI Conference on Artificial Intelligence*, volume 34, pages 4892–4899, 2020
- 15. D. Wang, P. Ram, D. K. I. Weidele, S. Liu, M. Muller, J. D. Weisz, A. Valente, A. Chaudhary, D. Torres, H. Samulowitz, et al. Autoai: Automating the end-to-end ai lifecycle with humans-in-the-loop. In *Companion Proceedings of the 25th International Conference on Intelligent User Interfaces*, pages 77–78, 2020
- 16. M. Katz, P. Ram, S. Sohrabi, and O. Udrea. Exploring context-free languages via planning: The case for automating machine learning. In *Proceedings of the International Conference on Automated Planning and Scheduling*, volume 30, pages 403–411, 2020

- 17. D. Bouneffouf, C. Aggarwal, T. Hoang, U. Khurana, H. Samulowitz, B. Buesser, S. Liu, T. Pedapati, P. Ram, A. Rawat, et al. Survey on automated end-to-end data science? In 2020 International Joint Conference on Neural Networks (IJCNN), pages 1–9. IEEE, 2020
- 18. R. Marinescu, A. Kishimoto, P. Ram, A. Rawat, M. Wistuba, P. P. Palmes, and A. Botea. Searching for machine learning pipelines using a context-free grammar. In *Proceedings of the AAAI Conference on Artificial Intelligence*, volume 35, pages 8902–8911, 2021
- 19. K. Sinha and P. Ram. Fruit-fly Inspired Neighborhood Encoding for Classification. In *Proceedings of the 27th ACM SIGKDD Conference on Knowledge Discovery & Data Mining*, pages 1470–1480, 2021
- 20. A. Kishimoto, D. Bouneffouf, R. Marinescu, P. Ram, A. Rawat, M. Wistuba, P. Palmes, and A. Botea. Bandit limited discrepancy search and application to machine learning pipeline optimization. In *Proceedings of the AAAI Conference on Artificial Intelligence*, volume 36, pages 10228–10237, 2022
- 21. G. Baudart, M. Hirzel, K. Kate, P. Ram, A. Shinnar, and J. Tsay. Pipeline combinators for gradual automl. *Advances in Neural Information Processing Systems*, 34:19705–19718, 2021
- 22. A. Kannan, A. R. Choudhury, V. Saxena, S. Raje, P. Ram, A. Verma, and Y. Sabharwal. Hyperaspo: Fusion of model and hyper parameter optimization for multi-objective machine learning. In 2021 IEEE International Conference on Big Data (Big Data), pages 790–800. IEEE, 2021
- 23. P. Ram and K. Sinha. Federated Nearest Neighbor Classification with a Colony of Fruit-flies. In *Proceedings of the AAAI Conference on Artificial Intelligence*, volume 36, pages 8036–8044, 2022
- 24. P. Ram. On the optimality gap of warm-started hyperparameter optimization. In *International Conference on Automated Machine Learning*, pages 12–1. PMLR, 2022
- D. Subramanian, S. Wasserkrug, P. Murali, D. Phan, P. Ram, O. Davidovich, X. Ceugniet, and F. Katai. Data and knowledge driven optimization model generation for flow based optimization problems. In *INFORMS Annual Meeting*, 2021
- 26. P. Zhao, P. Ram, S. Lu, Y. Yao, D. Bouneffouf, X. Lin, and S. Liu. Learning to generate image source-agnostic universal adversarial perturbations. In *Proceedings of the Thirty-First International Joint Conference on Artificial Intelligence (IJCAI-22)*, 2022
- 27. M. Hirzel, K. Kate, P. Ram, A. Shinnar, and J. Tsay. Gradual automl using lale. In *Proceedings of the 28th ACM SIGKDD Conference on Knowledge Discovery and Data Mining*, pages 4794–4795, 2022
- 28. Y. Teng, A. Choromanska, M. Campbell, S. Lu, P. Ram, and L. Horesh. Overcoming catastrophic forgetting via direction-constrained optimization. In *Joint European Conference on Machine Learning and Knowledge Discovery in Databases*, pages 675–692. Springer International Publishing Cham, 2022
- 29. A. Gu, S. Lu, P. Ram, and L. Weng. Robust multi-objective bilevel optimization with applications in machine learning. In *INFORMS Annual Meeting*, 2022
- 30. Y. Zhang, Y. Yao, P. Ram, P. Zhao, T. Chen, M. Hong, Y. Wang, and S. Liu. Advancing model pruning via bi-level optimization. *Advances in Neural Information Processing Systems*, 35:18309–18326, 2022
- 31. P. Palmes, A. Kishimoto, R. Marinescu, P. Ram, and E. Daly. Distributed automl pipeline search in pc/raspi k8s cluster. In *Julia Con*, 2022
- 32. P. Ram, A. G. Gray, H. C. Samulowitz, and G. Bramble. Toward theoretical guidance for two common questions in practical cross-validation based hyperparameter selection. In *Proceedings of the 2023 SIAM International Conference on Data Mining (SDM)*, pages 802–810. Society for Industrial and Applied Mathematics, 2023
- 33. Y. Zhang, P. Sharma, P. Ram, M. Hong, K. Varshney, and S. Liu. What is missing in irm training and evaluation? challenges and solutions. In *The 11th International Conference on Learning Representations*, 2023
- 34. A. Gu, S. Lu, P. Ram, and T.-W. Weng. Min-max Multi-objective Bilevel Optimization with Applications in Robust Machine Learning. In *The 11th International Conference on Learning Representations*, 2023
- 35. Y. Zhou, P. Ram, T. Salonidis, N. Baracaldo, H. Samulowitz, and H. Ludwig. Single-shot General Hyperparameter Optimization for Federated Learning. In *The 11th International Conference on Learning Representations*, 2023
- 36. P. Dube, T. Salonidis, P. Ram, and A. Verma. Runtime prediction of machine learning algorithms in automl systems. In *ICASSP 2023-2023 IEEE International Conference on Acoustics, Speech and Signal Processing (ICASSP)*, pages 1–5. IEEE, 2023
- 37. B. Saha, D. Krotov, M. J. Zaki, and P. Ram. End-to-end Differentiable Clustering with Associative Memories. In *International Conference on Machine Learning*, pages 29649–29670. PMLR, 2023
- 38. M. Feffer, M. Hirzel, S. C. Hoffman, K. Kate, P. Ram, and A. Shinnar. Searching for fairer machine learning ensembles. In *International Conference on Automated Machine Learning*, pages 17–1. PMLR, 2023
- 39. M. Lazuka, A. Anghel, P. Ram, H. Pozidis, and T. Parnell. xcloudserving: Automated ml serving across clouds. In 2023 IEEE 16th International Conference on Cloud Computing (CLOUD), pages 1–12. IEEE, 2023
- 40. J. Liu, P. Ram, Y. Yao, G. Liu, Y. Liu, P. Sharma, S. Liu, et al. Model Sparsity can Simplify Machine Unlearning. *Advances in Neural Information Processing Systems*, 36, 2023

- 41. I. Kang, P. Ram, Y. Zhou, H. Samulowitz, and O. Seneviratne. Effective data distillation for tabular datasets (student abstract). In *Proceedings of the AAAI Conference on Artificial Intelligence*, volume 38, pages 23533–23534, 2024
- 42. M. Abbas, Y. Zhou, P. Ram, N. Baracaldo, H. Samulowitz, T. Salonidis, and T. Chen. Enhancing in-context learning via linear probe calibration. In *International Conference on Artificial Intelligence and Statistics*, pages 307–315. PMLR, 2024
- 43. M. Abbas, Y. Zhou, N. Baracaldo, H. Samulowitz, P. Ram, and T. Salonidis. Byzantine-resilient bilevel federated learning. In 2024 IEEE 13rd Sensor Array and Multichannel Signal Processing Workshop (SAM), pages 1–5. IEEE, 2024
- 44. P. Ram, T. Klinger, and A. G. Gray. What makes Models Compositional? A Theoretical View. In *Proceedings of the Thirty-First International Joint Conference on Artificial Intelligence (IJCAI-24)*, 2024
- 45. J. Jia, J. Liu, Y. Zhang, P. Ram, N. Baracaldo, and S. Liu. WAGLE: Strategic Weight Attribution for Effective and Modular Unlearning in Large Language Models. *Advances in Neural Information Processing Systems*, 37, 2024
- 46. B. Hoover, D. H. Chau, H. Strobelt, P. Ram, and D. Krotov. Dense Associative Memory Through the Lens of Random Features. *Advances in Neural Information Processing Systems*, 37, 2024
- 47. S. Carrow, K. H. Erwin, O. Vilenskaia, P. Ram, T. Klinger, N. A. Khan, N. Makondo, and A. Gray. Neural reasoning networks: Efficient interpretable neural networks with automatic textual explanations. In *Proceedings of the AAAI Conference on Artificial Intelligence*, 2025

## Workshops

- 1. P. Ram and A. G. Gray. Fraud detection with density estimation trees. In KDD 2017 Workshop on Anomaly Detection in Finance, pages 85–94. PMLR, 2018
- 2. P. Ram, S. Liu, D. Vijaykeerthi, D. Wang, D. Bouneffouf, G. Bramble, H. Samulowitz, and A. G. Gray. Solving constrained cash problems with admm. In 7th ICML 2020 Workshop on Automated Machine Learning (AutoML), 2020
- 3. G. Baudart, M. Hirzel, K. Kate, P. Ram, and A. Shinnar. Lale: Consistent automated machine learning. In *AutoML Workshop @ KDD'20*, 2020
- M. Hirzel, K. Kate, and P. Ram. Engineering fair machine learning pipelines. In ICLR 2021 Workshop on Responsible AI, 2021
- 5. P. Ram, A. G. Gray, and H. Samulowitz. Leveraging theoretical tradeoffs in hyperparameter selection for improved empirical performance. In 8th ICML 2021 Workshop on Automated Machine Learning (AutoML), 2021
- 6. C. Fan, P. Ram, and S. Liu. Sign-MAML: Efficient model-agnostic meta-learning by SignSGD. In 5th NeurIPS 2021 Workshop on Meta-Learning, 2021
- 7. S. Wasserkrug, O. Davidovich, E. Shindin, D. Subramanian, P. Ram, P. Murali, D. Phan, N. Zhou, and L. M. Nguyen. Ensuring the quality of optimization solutions in data generated optimization models. In *IJCAI 2021 DSO (Data Science Meets Optimisation) Workshop*, 2021
- 8. P. Ram and K. Sinha. Flynn: Fruit-fly inspired federated nearest neighbor classification. In *International Workshop on Federated Learning for User Privacy and Data Confidentiality in Conjunction with ICML 2021 (FL-ICML'21)*, 2021
- 9. Y. Zhou, P. Ram, T. Salonidis, N. Baracaldo, H. Samulowitz, and H. Ludwig. Flora: Single-shot hyper-parameter optimization for federated learning. In *NeurIPS 2021 Workshop on New Frontiers in Federated Learning: Privacy, Fairness, Robustness, Personalization and Data Ownership*, 2021
- 10. A. Gu, S. Lu, P. Ram, and L. Weng. Nonconvex min-max bilevel optimization for task robust meta learning. In *ICML 2021 Workshop on Beyond first-order methods in ML systems*, 2021
- 11. M. Feffer, M. Hirzel, S. C. Hoffman, K. Kate, P. Ram, and A. Shinnar. An empirical study of modular bias mitigators and ensembles. In *ICML 2022 Workshop on Benchmarking Data for Data-Centric AI (DataPerf@ICML)*, 2022
- 12. R. Marinescu, T. Pedapati, L. Vu, P. Palmes, T. Mummert, P. Kirchner, D. Subramanian, P. Ram, and D. Bouneffouf. Automated decision optimization with reinforcement learning. In *AAAI-22 Workshop on AI for Decision Optimization*, 2022
- 13. O. Davidovich, P. Ram, S. Wasserkrug, S. Subramaniam, N. Zhou, D. Phan, P. Murali, and L. Nguyen. Addressing solution quality in data generated optimization models. In *AAAI-22 Workshop on AI for Decision Optimization*, 2022
- 14. T. Klinger, L. Liu, S. Dan, M. Crouse, P. Ram, and A. Gray. Compositional program generation for systematic generalization. In *IJCAI 2023 Workshop on Knowledge-Based Compositional Generalization*, 2023
- 15. P. Ram, T. Klinger, and A. G. Gray. How compositional is a model? In *IJCAI 2023 Workshop on Knowledge-Based Compositional Generalization*, 2023
- 16. M. Hirzel and P. Ram. Oversampling to repair bias and imbalance simultaneously. In Workshop track at AutoML Conference 2023, 2023

- 17. P. Ram, T. Klinger, and A. Gray. What makes models compositional? a neuro-symbolic theoretical view. In First IJCAI 2024 International Workshop on Logical Foundations of Neuro-Symbolic AI, 2024
- 18. B. Saha, D. Krotov, M. J. Zaki, and P. Ram. Deep clustering with associative memories. In NeurIPS 2024 Workshop on Machine Learning and Compression, 2024
- 19. B. Saha, D. Krotov, M. J. Zaki, and P. Ram. Deep clustering with associative memories. In *ICLR 2025 Workshop on New Frontiers in Associative Memories*, 2025
- 20. B. Hoover, K. Balasubramanian, D. Krotov, and P. Ram. Dense associative memory with epanechnikov energy. In ICLR 2025 Workshop on New Frontiers in Associative Memories, 2025

#### **Patents**

- 1. M. Gibiansky, R. Riegel, Y. Yang, P. Ram, and A. Gray. Configurable machine learning method selection and parameter optimization system and method, Apr. 21 2016. US Patent App. 14/883,522
- 2. D. K. I. Weidele and P. Ram. Conditional parallel coordinates, July 27 2021. US Patent 11,074,728
- 3. P. Ram, D. Wang, D. Vijaykeerthy, V. Saxena, S. Liu, A. Chaudhary, G. Bramble, H. C. Samulowitz, and A. Gray. Machine learning with multiple constraints, Mar. 10 2022. US Patent App. 17/015,243
- 4. M. Katz, P. Ram, S. S. Araghi, and O. Udrea. Machine learning pipeline generation, June 16 2022. US Patent App. 17/119,134
- 5. A. Kannan, V. Saxena, A. R. Choudhury, Y. Sabharwal, P. Ram, A. Verma, and S. M. Raje. Multi-objective machine learning with model and hyperparameter optimization fusion, Mar. 9 2023. US Patent App. 17/470,763
- 6. B. Zhang, G. Bramble, P. Ram, and H. C. Samulowitz. Methods for automatically configuring performance evaluation schemes for machine learning algorithms, June 20 2023. US Patent 11,681,931
- 7. D. K. I. Weidele, P. Ram, D. Wang, A. N. Valente, and A. Chaudhary. Conditional parallel coordinates in automated artificial intelligence with constraints, Jan. 17 2023. US Patent 11,556,816
- 8. A. Kishimoto, D. Bouneffouf, B. Chen, R. Marinescu, P. Ram, A. Rwat, and M. Wistuba. Automated generation of a machine learning pipeline, Apr. 11 2023. US Patent 11,625,632
- 9. L. Horesh, G. Nannicini, O. Gunluk, S. Dash, P. Ram, and A. Gray. Free-form integration of machine learning model primitives, Mar. 7 2023. US Patent 11,599,829
- 10. R. Marinescu and P. Ram. Automl with multiple objectives and tradeoffs thereof, Mar. 30 2023. US Patent App. 17/489,781
- 11. R. Marinescu and P. Ram. Enhanced machine learning pipelines with multiple objectives and tradeoffs, Apr. 13 2023. US Patent App. 17/450,670
- 12. Y. Zhou, P. Ram, N. B. Angel, T. Salonidis, H. C. Samulowitz, M. Wistuba, and H. H. Ludwig. Performing automated tuning of hyperparameters in a federated learning environment, June 15 2023. US Patent App. 17/547,122
- 13. E. S. Wasserkrug, O. Davidovich, E. Shindin, D. Subramanian, and P. Ram. Augmenting mathematical optimization models generated from historical data, Aug. 3 2023. US Patent App. 17/589,092
- 14. R. Marinescu, P. Ram, D. Bouneffouf, T. Pedapati, and P. Palmes. Computing robust policies in offline reinforcement learning, Dec. 21 2023. US Patent App. 17/807,397
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