# Balagopal (Balu) Unnikrishnan

Ph.D. Candidate, Computer Science University of Toronto

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### SUMMARY / RESEARCH INTERESTS

PhD Researcher focused on model generalization via mitigation of shortcut learning and spurious correlations in vision and language models. Skilled in developing robust AI systems - with prior industry experience as AI research engineer, strong publication record and experience working with multi-disciplinary teams.

### **EDUCATION**

#### University of Toronto, Toronto, Canada

09/21 - 09/26 (Expected)

Ph.D. in Computer Science | Advisors: Dr. Michael Brudno & Dr. Chris McIntosh

CGPA: 4.0/4.0

Research supported by Vector Institute, Schwartz Reisman Institute, UHN & SickKids Hospital

#### National University of Singapore, Singapore

2019

Masters in Intelligent Systems | Advisors: Dr. Matthew Chua & Dr. Xulei Yang

CGPA: 4.16/5.0

Research supported by Agency for Science, Technology & Research (A\*STAR) and Ministry of Education, Singapore

### RESEARCH EXPERIENCE

Ph.D. Candidate 2021 - Present

University of Toronto

Schwartz Reisman Institute (SRI) & Vector Institute Graduate Fellow

- Developed novel shortcut learning detection framework analyzing 750K+ samples across 13 datasets, predicting out-of-distribution performance degradation with 96% accuracy (Published Nature Digital Medicine)
- Created an attention-based mechanism for localizing and correcting for multiple shortcuts (spatial and spectral), surpasses SOTA by 7.5% in data with multiple spurious correlations occurring simultaneously
- Designed generative in-painting systems for confounder reduction in medical imaging tasks using diffusion models identified and corrected for hidden stratification, improving diagnostic performance by 20%
- Built and deployed multiple clinical AI tools for radiology & ultrasound, implementing validation protocols and coordinating with interdisciplinary teams in hospital environments

AI Research Engineer 2019 - 2021

Institute for Infocomm Research (I2R), Agency for Science Technology & Research (A\*STAR), Singapore

Top 1% performer in the organization

- Designed NoTeacher, a novel semi-supervised learning framework reducing annotation requirements by 95% while maintaining 90% of fully-supervised performance across multiple imaging modalities (MICCAI Best Paper Award Runner-up)
- $\bullet$  Co-developed multi-scale self-supervision technique for gigapixel pathology images, achieving SOTA performance (0.92 AUC) with only 10% labeled data
- Established cross-functional collaborations between research and clinical teams for successful translation of algorithmic advances
- Created IP "Semi-Supervised Process to Guide Annotation for Image Classification Tasks" successfully licensed for commercial application

## TECHNICAL SKILLS

- AI & Deep Learning: PyTorch, TensorFlow, algorithm development, generative models (GANs, diffusion), vision-language models for classification and retrieval (VLMs / CLIP), domain shift, confounder mitigation, semi/self-supervised learning
- Research Implementation & Deployment: Distributed training, experiment design, mixed-precision model training and deployment
- Programming, Systems & Deployment: Python, Git, Docker, AWS, Google Cloud, Flask, MongoDB
- Data Science: Pandas, NumPy, Scikit-learn, statistical modelling, data visualization
- Medical Domain Expertise: X-Ray Diagnostics, Ultrasound Imaging, Retinal Fundoscopy

### **PUBLICATIONS**

Full list of publications available on Google Scholar | Citations: 459, h-index: 8

### Journal Articles

- Ong Ly, C.\*, **Unnikrishnan**, **B.**\*, Tadic, T., et al. (2024). "Shortcut learning in medical AI hinders generalization: method for estimating AI model generalization without external data." *Nature npj Digital Medicine* (\*equal contribution)
- Nguyen, C., Raja, A., Zhang, L., Xu, X., **Unnikrishnan**, **B.**, et al. (2023). "Diverse and consistent multi-view networks for semi-supervised regression." *Machine Learning*
- Unnikrishnan, B., Nguyen, C., Balaram, S., Li, C., et al. (2021). "Semi-supervised classification of radiology images with NoTeacher: A teacher that is not mean." *Medical Image Analysis*
- Koohbanani, N. A., **Unnikrishnan, B.**, Khurram, S. A., et al. (2021). "Self-path: Self-supervision for classification of pathology images with limited annotations." *IEEE Transactions on Medical Imaging*

#### Conference Proceedings

- Unnikrishnan, B., Brudno, M., & McIntosh, C. (2025). "SilverLining: Data-First Debiasing of Spatial and Spectral Shortcuts through Attention." (Under Review)
- Protserov, S., **Unnikrishnan, B.**, Madani, A., & Brudno, M. (2025). "Synthetic dataset generation for efficient data utilization in medical image segmentation models for laparoscopic cholecystectomy." (Under Review)
- Unnikrishnan, B., Nguyen, C. M., Balaram, S., et al. (2020). "Semi-supervised classification of diagnostic radiographs with noteacher: A teacher that is not mean." MICCAI 2020
- Nguyen, Q. H., Nguyen, B. P., Dao, S. D., **Unnikrishnan, B.**, et al. (2019). "Deep learning models for tuberculosis detection from chest X-ray images." *ICT 2019*
- Dutta, R., Raju, S., James, A., Leo, C. J., Jeon, Y., **Unnikrishnan, B.**, et al. (2019). "Learning of multi-dimensional analog circuits through generative adversarial network (GAN)." *IEEE SOCC*

#### Workshop & Other Publications

- Unnikrishnan, B., Singh, P. R., Yang, X., Chua, M. C. H. (2020). "Semi-supervised and unsupervised methods for heart sounds classification in restricted data environments." arXiv preprint arXiv:2006.02610.
- Yu, Y., Kumar, A. J. S., Guretno, F., Balaram, S., **Unnikrishnan, B.**, Krishnaswamy, P., Ho Mien, I. (2023). "Integrated Platform for Resource-efficient Medical Image Annotation." *International Conference on AI in Medicine (iAIM)*, Singapore.
- Ouardini, K., Yang, H., Unnikrishnan, B., et al. (2019). "Towards practical unsupervised anomaly detection on retinal images." DART/MICCAI Workshop 2019, 225-234.
- Lecouat, B., Chang, K., Foo, C. S., **Unnikrishnan, B.**, et al. (2018). "Semi-supervised deep learning for abnormality classification in retinal images." *Machine Learning for Health (ML4H) Workshop at NeurIPS*.
- Jin, C., Badawi, A. A., **Unnikrishnan**, **B.**, et al. (2019). "CareNets: Efficient Homomorphic CNN for High Resolution Images." *Privacy in Machine Learning workshop at NeurIPS*.

#### **PROJECTS**

### Correcting confounder effects on vision-language models

2024 - Present

- Studied the effect of spurious correlations in vision-language models such as CLIP variants, identifying its impact on zero-shot, ranking and retrieval performance.
- Leading the research on unsupervised identification of shortcut learning and lightweight correction techniques.
- · Finetuned and deployed vision language model for image-text retrieval for identification of spurious associations

### Pneumothorax Detection & Triaging

2021 - 2025

- Curated and processed 200K X-ray dataset for comprehensive model training
- Developed detection pipeline deployed at University Health Network (UHN) for improving scan-to-intervention response times
- Identified and corrected critical data bias and confounder issues impacting model generalization

### Red Teaming Multi-Modal Vision-Language Models

2023 - 2024

- Conducted analysis of 4 leading vision-language models (both open and closed-source) for healthcare applications
- · Identified critical confounder dependencies and systematic biases in model reasoning across demographic factors
- Discovered hallucination effects for rare diseases, demonstrating potential impacts on clinical workflow

### Resource-Efficient Diffusion Models

2023 - 2024

- Developed lightweight diffusion model training strategy for GPU-constrained settings for X-Ray generation
- Created cached latent augmentation technique improving generation quality by 40% while maintaining throughput
- Reduced GPU memory usage by 37% and compute by 6x through these optimizations

### ACHIEVEMENTS / AWARDS / VOLUNTEER POSITIONS

• Schwartz Reisman Institute (SRI) Graduate Fellowship	2024
• IEEE Transactions on Medical Imaging (TMI) Distinguished Reviewer	2024
• Reviewer: Nature Scientific Reports	2024
• University of Toronto Fellowship, Faculty of Arts and Science	2023
• Vector Institute Research Grant	2022 - 2025
• Mentor: Toronto Graduate Application Assistance Program (GAAP)	2022 - 2024
AI Product Manager Nanodegree - Udacity	2020
Richard E Merwin Scholar - IEEE Computer Society	2017

### RESEARCH IN MEDIA

• Featured as invited guest on ATGO-AI (Accountability, Trust, Governance, and Oversight of AI) podcast discussing data biases and generalization issues in AI for Healthcare – Episodes available on Spotify