# Apurva Gandhi

## Curriculum Vitae

## Education

- Aug 2024 Ph.D. Computer Science, Carnegie Mellon University, Pittsburgh, PA
  - Present Advisor: Graham Neubig
    - Research Areas: Multimodal/Embodied Agents, RL, Program Synthesis, Reasoning/Abstraction
- Jan 2019 M.S. Electrical Engineering, University of Southern California, Los Angeles, CA, GPA: 4.0
- May 2020 Graduated concurrently with B.S.; Focus on Machine Learning.
- Aug 2016 **B.S. Computer Engineering and Computer Science (CECS)**, University of Southern May 2020 California, Los Angeles, CA, GPA: 3.98, Summa Cum Laude

#### Selected Coursework

Reinforcement Learning, ML Systems, Game Engines, Numerical Methods, Parallel/Distributed Computing, Mathematics of High-Dimensional Data, Neural & Computational Intelligence

## Experience

### Microsoft Corporation, Mountain View, CA

- Sep 2023 Senior Machine Learning Scientist, Office AI/Microsoft Copilot
- Aug 2024 O Worked as a cross-org architect and tech lead for Microsoft Copilot, leveraging program synthesis techniques to enable scenarios for the product in the areas of LLM orchestration/planning, natural language commanding and extensibility (plugins, agents, etc.)
  - Worked on parameter-efficient fine-tuning and constrained decoding to make SLMs (e.g. phi-3) more reliable for tool-use and code generation in Copilot.
  - Designed and shipped the grounding/context-passing architecture for tool use in Microsoft Copilot's (Sydney) LLM orchestrator using ideas from programming languages.
- Jun 2022 Machine Learning Scientist II, Office AI
  - Sep 2023 Created the Office Domain Specific Language (ODSL) framework and the original prototype for Office/M365 Copilot. The ODSL framework lets apps easily create a strongly-typed DSL for the app's commands and use a RAG-based LLM framework to convert natural language commands into DSL plans that can be verified and run on the ODSL interpreter. See [P1] in Publications and [PC1] for a MSFT Ignite talk. The ODSL prototype grew into what is now called M365 Copilot at Microsoft.
    - Shipped ODSL in PowerPoint, just 3 months after the original ODSL demo, to limited customers to execute on the M365 Copilot vision and establish Microsoft as the first-mover in the space.
    - Was a tech lead on the crew that productionized the ODSL framework into a Copilot platform for M365 apps. With the help of my teammates, leadership and cross-org partnerships, ODSL has grown to support natural language commanding across 25+ apps including all core office apps (Word, PPT, Excel, OneNote, etc.), many M365 apps (Teams, Outlook, etc.), Azure, PowerApps and more.
    - Prior to work on ODSL, I co-led development of foundation models for user behavior intelligence pretrained on more than 60 billion user interactions with Microsoft Office Applications, powering applications such as search, command prediction, RPA, etc.

#### Microsoft New England Research & Development, Cambridge, MA

#### Mar 2022 - Applied Scientist II, Al Rotation Program

- Jun 2022 O Collaborated with the Gray Systems Lab (GSL) on the Tensor Query Processor (TQP): a system that compiles SQL queries to tensor programs that can be executed with PyTorch on GPUs, TPUs, etc. leading to massive speedup in query execution (often > 10X speedup).
  - Researched and implemented differentiable approximations to SQL operators such as groupedaggregation and filtered-aggregation. This lets us introduce a new class of *trainable* SQL queries which use SQL syntax to express end-to-end differentiable, neurosymbolic programs that can be trained from query (input, output) examples to answer a query.
  - Our work resulted in a **Best Demonstration Award at VLDB 22** [C3] and a **CIDR 2023 paper** [C1]. I also prepared a demo that was presented at Microsoft Build 2023 [PC2].
- Aug 2020 Applied Scientist, Al Rotation Program
  - Mar 2022 O Built a prototype surfing video analysis pipeline (pose estimation, object detection and video action recognition) for the **USA Surfing team** and **US Olympic Committee**. This has now manifested into an official partnership between USA Surfing and Microsoft.
    - Applied a sequence labeling approach to the problem of identifying and extracting action items/tasks from digitally handwritten notes on canvases such as Microsoft Whiteboard or OneNote. This resulted in an EMNLP 22 Industry track publication [C2].

#### Amazon AI (Amazon Web Services), Seattle, WA

#### May 2019 - Software Development Engineer Intern

- Aug 2019 O Worked on Amazon Lex, a low-code chatbot creation service leveraging natural language understanding and slot filling.
  - Implemented neural text normalization to help standardize differently styled content from varying modalities (e.g., spoken, written) to a common style before further processing.

#### Sandia National Laboratories, Albuquerque, NM

- July 2018 Deep Learning R&D Intern, Year-Round
- May 2019 O Built a framework to facilitate easy testing of defenses against adversarial attacks on ML models.
  - Prototyped and reproduced the results of popular attacks and defenses including targeted/untargeted, iterative FGSM attacks and GAN-based defenses.

#### May 2018 - Mathematics Research Intern for Advanced National Security (MARTIANS)

July 2018 • Developed a pruning method for convolutional neural networks achieving at least a 40% parameter reduction on models tested while maintaining accuracy.

## Publications

#### Preprints

[P1] Natural Language Commanding via Program Synthesis, A. Gandhi<sup>\*</sup>. T. Nguyen, H. Jiao, R. Steen and A. Bhatawdekar, arXiv 2023

#### **Conference Publications**

- [C1] The Tensor Data Platform: Towards an Al-Centric Database System, A. Gandhi\*. Y. Asada, V. Fu, A. Gemawat, L. Zhang, R. Sen, C. Curino, J. Camacho-Rodriguez and M. Interlandi, CIDR 2023
- [C2] SLATE: A Sequence Labeling Approach to Task Extraction from Free-form Inked Content, A. Gandhi\*, R. Serrao, B. Fang, G. Antonius, J. Hong, T. M. Nguyen, S. Yi, E. Nosakhare, I. Shaffer, S. Srinivasan and V. Gupta, EMNLP 2022 – Industry Track

- [C3] Share the Tensor Tea: How Databases can Leverage the Machine Learning Ecosystem, Y. Asada\*, V. Fu\*, A. Gandhi\*, A. Gemawat\*, L. Zhang\*, D. He, V. Gupta, E. Nosakhare, D. Banda, R. Sen and M. Interlandi, VLDB 2022 – Best Demo Award
- [C4] Adversarial Perturbations Fool Deepfake Detectors , A. Gandhi<sup>\*</sup> and S. Jain, IJCNN 2020

#### Patents

- [PA1] Extending Query Languages with Differentiable Operators, M. Interlandi\*, A. Gandhi\*, Y. Asada, A. Gemawat, V. Fu, L. Zhang, R. Sen and D. Banda, October 4, 2022, Patent Pending.
- [PA2] Sequence Labeling Task Extraction From Inked Content, J. Hong, A. Gandhi<sup>\*</sup>, G. Antonius, T. M. Nguyen, R. Serrao, B. Fang and S. Yi, November 12, 2021, Patent Pending.

#### Magazine Articles

[M1] Deepfakes: Fooling Humans with Artificial Intelligence, A. Gandhi, USC Viterbi Illumin Magazine 2021

## Selected Press Coverage of Work

- [PC1] How M365 Copilot Works, David Conger, Microsoft Ignite, Nov 20, 2023
- [PC2] Inside Azure Innovations Tensor query processing, Mark Russinovich, Microsoft Build, Jun 1, 2023
- [PC3] Introducing Microsoft 365 Copilot A whole new way to work, Colette Stallbaumer, Microsoft Blog, Mar 16, 2023
- [PC4] Giving the Sport of Surfing its Next Big Break, Microsoft In Culture, Jun 22, 2022
- [PC5] How Olympic Surfing Is Trying to Ride the Machine Learning Wave, Daniela Hernandez, The Wall Street Journal, July 27, 2021
- [PC6] Fooling Deepfake Detectors, Ben Paul, USC Viterbi School of Engineering, May 4, 2020

#### Awards and Honors

#### Nov 2022 First Place, Microsoft Hack for Cloud – Executive Challenge

Won a Microsoft-wide hackathon (over 400 projects competing in the Cloud category) for my work on extending SQL for differentiable and multi-modal query processing, winning an opportunity to pitch to Executive leadership. For details check our CIDR 23 paper [C1].

Sept 2022 VLDB 22 Best Demonstration Award Awarded for our VLDB 22 Demo Paper [C3] where we demonstrate TQP: The world's first Tensor-based SQL Query Processor.

#### Skills

Languages Python, TypeScript, C#, C++, C, HLSL, MATLAB, Verilog, SQL

Frameworks PyTorch, CUDA, ONNX, NodeJS, PySpark, OpenMPI, DirectX