# NEERAJ KULKARNI

PhD Candidate, Computer Systems Laboratory, Cornell University

# **RESEARCH INTERESTS**

High-performance Computer Architecture, Datacenters, System Resource Management

### EDUCATION

August 2014	Ph.D in Electrical and Computer Engineering, Cornell University
- Current	GPA - 4.0/4.0 Area: Computer Architecture
	Committee: Dr. Dave Albonesi, Dr. Christina Delimitrou, Dr. Jose Martinez
JULY 2014	B.TECH-M.TECH (Dual Degree) in ELECTRICAL ENGINEERING, IIT Kanpur, India
	Master's CGPA - 10.0/10.0, Bachelor's CGPA - 9.0/10.0

# Work Experience

June 2017	HPC Architect Engineer - Intern at Intel Federal LLC, Hudson, MA
- DEC 2017	Manager: Olivier Franza, Mentor: Elliot Fleming
	Developed distributed and pro-active micro-architectural techniques to mitigate on-chip supply voltage
	variations induced by di/dt (current spikes) in large CGRAs.

### PUBLICATIONS

**Neeraj Kulkarni**, Christina Delimitrou, Christine Shoemaker, David Albonesi, "Rapid Power Management in Latency-Critical Systems using Reconfigurable Cores" is *under submission*.

**Neeraj Kulkarni**, Feng Qi, Christina Delimitrou, "Pliant: Leveraging Approximation to Improve Datacenter Resource Efficiency" published at the 25<sup>th</sup> IEEE International Symposium on High-Performance Computer Architecture (HPCA), 2019.

Neeraj Kulkarni, Feng Qi, Christina Delimitrou, "Leveraging Approximation to Improve Datacenter Resource Efficiency" published in IEEE Computer Architecture Letters (CAL), 2018.

# **RESEARCH PROJECTS**

**Power Management in Servers using Reconfigurable Cores** (Under Submission) Advisors- Dr. Christina Delimitrou, Dr. Dave Albonesi May. '18 - Current

Sept. '16 - Dec. '18

- Tackled low utilization (by co-scheduling of latency-critical & batch apps) and poor energy proportionality (by dynamically tailoring static power usage) in servers using reconfigurable cores.
- Formulated it as an optimization problem that involves appropriately reconfiguring cores, to maximize throughput of batch apps and meet QoS of latency-critical apps while operating under server node's power budget.
- Employed collaborative filtering & heuristic search to rapidly characterize the system and find near-optimal solution.
- Met QoS of latency-sensitive apps & achieved up to 3.5x speed-up on batch apps compared to core-level gating strategy.

# **Exploring Accuracy, Performance and Resource usage Trade-offs in Machine Learning Algorithms** Mar. '19 - Current *Advisor- Dr. Christina Delimitrou*

- Deployment of ML apps difficult i) large computations at training, ii) real-time latency & limited resources for inference.
- Employed approximations to explore accuracy and performance & resource requirements trade-off.
- Working on exploring possibilities to dynamically sacrifice accuracy during high load and limited resources scenarios.

#### Using Approximate Computing to Improve Datacenter Utilization

Advisor- Dr. Christina Delimitrou

- Co-scheduled approximate apps with latency-sensitive apps to boost utilization and mitigated interference in shared resources by employing approximation & resource reclamation from approximate apps.
- Leveraged approximation to a) directly reduce interference, and b) preserve performance of approximate apps when executing with reduced resources, at the cost of some accuracy loss.
- Developed runtime system that switches approximation degree and relocates cores, caches & memory among apps.
- Preserved QoS for all evaluated co-scheduled workloads, while incurring a 2.1% loss in output quality, on average.

#### Power Management in Heterogeneous Reconfigurable Multi-Core Architectures

Advisors- Dr. Dave Albonesi, Dr. Christine Shoemaker

- Built an energy-efficient multicore system to tackle the dark silicon problem using asymmetric & reconfigurable CPU cores that operate by turning on/off lanes in sections of the superscalar out-of-order pipeline.
- Formulated it as an optimization problem that involves mapping applications onto different core types & reconfiguring the cores, to maximize the system throughput while operating under a power budget.
- Developed techniques to solve problem at millisecond-scale using machine learning & global optimization algorithms.
- Outperformed core-level gating and state-of-the-art by up to 30% and 15% respectively across SPEC2006 benchmarks.

#### Design of Flexible Associative Cache based on Way-Prediction

Advisor- Dr. Christopher Batten

- Developed RTL implementation of flexible associative cache (using way-prediction) having performance similar to setassociative cache but energy consumption similar to direct-mapped cache.
- Developed cycle-level C model of way-prediction cache to analyze performance and guide RTL design decisions.
- Designed the flexible associative cache in Verilog; pushed it through the ASIC design tool flow to analyze energy & area.
- Demonstrated 28% energy savings at cost of only 2% performance loss compared to set-associative cache.

#### MASTER'S THESIS - Acceleration of Critical Sections in Multi-Threaded Programs Advisors- Dr. Mainak Chaudhuri, Dr. SSK Iyer

- Demonstrated that load/stores are majorly responsible for stalls in critical sections of multithreaded programs.
- Accelerated loads/stores in critical sections by prioritizing them in Network-On-Chip switches which reduced the network buffer latency of critical requests & subsequently stall times of critical load/stores.
- Achieved speed-up of up to 13% over baseline (round-robin scheduling in switches) across parallel benchmark suites.

Nano-Satellite Project JUGNU, IIT Kanpur with INDIAN SPACE RESEARCH ORGANIZATION (ISRO)Dec. '09 - Dec. '11Advisor- Dr. Nalinaksh VyasDec. '09 - Dec. '11

- Headed the Motor-Driver subsystem, co-headed the Inertial Measurement Unit (IMU) subsystem and worked in the Onboard Communication and Ground Station team over the 2 years of my involvement in the project.
- Designed & implemented power efficient control system driving 4 DC motors (Actuators of Attitude Control algorithm)
- Programmed the IMU board involving data acquisition from sensors, flash memory management, interface with OBC.
- Worked at INDIAN SATELLITE CENTRE, Bangalore for conducting various tests during flight model fabrication of JUGNU.

#### Awards

2017	Selected to participate in 2017 January Colman Leadership Program.
2014	Awarded H.C. Torng Fellowship at Cornell University.
2012 & 13	Academic Excellence Award for being in top 7% of the institute by IIT Kanpur for 2 years.
2009	All India Rank (AIR) 380 in IIT Joint Entrance Exam amongst 0.4 million entrants.
2009	National Top 1% & selected for Indian National Physics Olympiad & Chemistry Olympiad among 35K students.
2008 & 09	National Top 1% and selected for Indian National Astronomy Olympiad at Senior Level among 30K applicants.
2007	National Talent Search(NTS) Scholarship awarded to top 500 students in India.

# **TECHNICAL SKILLS**

Programming:	C, C++, Python, Perl, MATLAB.
Digital Design:	Verilog, BlueSpec Verilog, Synopsys- Design Compiler, PrimeTime, PrimePower, Xilinx ISE, ModelSim.
Architectural	sesc, gem5, zsim, McPAT.
Simulators:	-

# **Relevant Coursework**

#### Postgraduate/Senior Undergraduate Level

Systems:Datacenter Computing, Computer Architecture, Advanced Computer Architecture, Operating Systems,<br/>Microprocessor Design Methodology, High Level Design AutomationVLSI/Circuits:Complex ASIC Design, VLSI System Design, Digital/Analog VLSI Circuits, Semiconductor Device Modeling,<br/>Organic Electronics, Solid State Devices, MicroelectronicsCS (Cornell):Analysis of Algorithms, Machine Learning for Data Science, Advanced Machine Learning

Feb. '16 - May '16

Feb. '13 - June '14

# TEACHING EXPERIENCE

- Head Teaching Assistant for Digital Logic & Computer Organization (ECE2300) at Cornell University in Fall '18 & '19
- Teaching Assistant for Digital Logic & Computer Organization (ECE2300) at Cornell University in Fall '15
- Teaching Assistant for Embedded Systems (ECE3140) at Cornell University in Spring '15.
- Teaching Assistant, Digital Electronics, Fall '13. Awarded best TA award for the year 2013-14 at IIT Kanpur.

# **ACADEMIC PROJECTS**

#### Implementation of multi-core PARC Processor

Advisor- Dr. Chritopher Batten

- Implemented a 5-stage pipelined core running PARC ISA with aggressive bypassing and a 2-way set associative FSM writeback write-allocate cache.
- Implemented 8-node bi-directional ring network to support 4-core system with private i-cache and shared d-cache.

#### Six-stage Pipelined SMIPS Processor and Branch Prediction Schemes Advisors- Dr. Arvind (MIT), Dr. Ameya Karkare

- Developed an inorder 6-stage pipelined SMIPS processor from a single cycle processor in BlueSpec Verilog (BSV).
- Implemented Set Associative Branch Table Buffer, Two Level Direction Predictors (GAg, SAg and Gshare), Tournament Predictor (GAg/Gshare + SAg), and PPM like Tag-based Predictor (variant of TAGE).
- Coupled the predictors with the SMIPS processor & evaluated prediction accuracies using typical C programs.

#### **CORDIC Processor Design**

Advisor- Dr. S. Qureshi

- Implemented 16-bit CORDIC core which has the ability to compute sin, cos, arctan, sinh, cosh, sqrt and In functions using Verilog in 3 styles of hardware architecture: Combinational, Sequential and Pipelined.
- Developed scaling-free algorithm for sin & cos, which allowed skipping of around 50% of the iterations.
- Obtained power savings of upto 20% in scaling free algorithm over the normal sequential implementation.

#### **Thread Criticality Predictors for Load Balancing**

Advisor- Dr. Mainak Chaudhuri

- Implemented hardware architecture for the thread criticality prediction (TCP) based on the measurements of L1 and L2 cache misses from each core in a CMP as proposed by Bhattacharjee et.al.
- Applied the TCP hardware to guide task stealing in Intel's TBB library which initially followed random policy.
- Evaluated the performance gains of the TCP method using PARSEC benchmarks to get speed-up as high as 10%.

# **Characterization of PARSEC Benchmarks**

Advisor- Dr. Mainak Chaudhuri

- Instrumented PARSEC apps using PIN tool to find out re-use distance and sharing profiles of accessed memory blocks.
- Simulated 3-level cache hierarchy to calculate the misses for different cache policies and re-use distances of L3 misses.

Feb. '13 – April. '13

Jan. '13 - April. '13

Aug. '12 – Nov. '12

Sept. '12

Sept. '14 - Dec. '14