# AARON HARLAP

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### **EDUCATION**

# Carnegie Mellon University, Pittsburgh, PA.

Ph.D., Electrical and Computer Engineering (GPA: 3.89)

• Advisors: Greg Ganger and Phil Gibbons

• Research Topic: Large Scale Machine Learning in Shared Computing Environments

Master of Science, Electrical and Computer Engineering

May 2016

Expected: May 2019

## Northeastern University University, Boston, MA.

Bachelor of Science, Electrical and Computer Engineering

May 2014

#### SKILLS

**Programming languages** C++, Python

Software Systems Git, Linux, Shell, LaTeX, Matlab, SVN

Big data Systems TensorFlow, Caffe

#### PHD THESIS RESEARCH

Thesis: Improving efficiency, run-time and cost of machine learning applications in cloud computing environments

- Committee: Greg Ganger, Phil Gibbons, Ameet Talwalkar, and Amar Phanishayee
- Thesis Subprojects: As follows:

# PipeDream: Pipeline Parallelism for DNN Training

Published at SysML'18

- Designed PipeDream, an efficient data-parallel+model-parallel system for distributed deep learning.
- Extended Caffe, a popular deep learning system, to run on distributed GPU machines, by using PipeDream.
- Achieved good scalability for DNNs that scaled poorly using prior technique.
- Achieved near linear scaling on modern hardware (v100 GPUs) where prior techniques struggled.

## Tributary: spot-dancing for elastic services with latency SLOs

Published at Usenix ATC'18

- Designed Tributary, a system for running services with latency SLOs on pre-emptible resources.
- Build and deployed a machine learning model for predicting pre-emption of Amazon EC2 Spot instances.
- Developed a cost-model for acquiring resources in order to meet user specified SLO requirements.
- Experimented with real-world web-service traces, and observed cost savings up to 85% for achieving same SLOs compared to using non-preemptible resources.

## Proteus: agile ML elasticity through tiered reliability in dynamic resource markets.

Published at EuroSys'17

- Designed Proteus, a agile elastic machine learning system that efficiently runs on pre-emptible instances.
- Proposed new parameter-server architecture to efficiently handle bulk resource pre-empetion.
- Implemented a novel resource manager for Amazon EC2 that decreased cost for ML applications by 85%.
- Experimented with real ML tasks, running on pre-emptible Amazon EC2 instances.

#### Addressing the straggler problem for iterative convergent parallel ML

Published at SoCC'16

- Observed adverse straggler effects on ML training systems running on Amazon EC2 and Microsoft Azure.
- Designed a parameter server system that supports temporary work-reassignment and relaxed worker synchronization.
- Experimented with many real ML applications, running on Amazon EC2 and Microsoft Azure, observing improvements up to 3x over prior approaches.

#### INTERNSHIPS

# Microsoft Research May 2017 to Aug 2017

Research Intern

- Developed novel machine learning training system.
- Responsible for developing research ideas and system implementation.
- Work published at SysML' 18.

## Spectral Sciences Incorporated

January 2013 to June 2013

Co-Op Software Engineer

- Developed and implemented tests for existing code base.
- Developed graphical interface for new applications.
- Responsible for MODTRAN code upgrade process.

# Motorola Mobility

January 2012 to June 2012

Co-Op Software Engineer

- Worked as part of the BSR sustaining team.
- Developed solutions for customer related issues.
- Implemented early patching system and IPV6 neighbor discovery customer interface.

# Charles River Development

January 2011 to August 2011

SQA Co-Op Engineer

- Worked as part of the Automaton and Infrastructure Group.
- Developed automated resource status check system.
- Rebuilt and centralized regression testing suite.

#### **PUBLICATIONS**

- 1 Aaron Harlap, Andrew Chung, Alexey Tumanov, Gregory R. Ganger, Phillip B. Gibbons. Tributary: spot-dancing for elastic services with latency SLOs. In *USENIX Annual Technical Conference (Usenix ATC' 18)*, 2018.
- 2 Aaron Harlap, Deepak Narayanan, Amar Phanishayee, Vivek Seshadri, Gregory R. Ganger, Phillip B. Gibbons. PipeDream: Pipeline Parallelism for DNN Training. In SysML (SysML'18), 2018.
- 3 Aaron Harlap, Alexey Tumanov, Andrew Chung, Gregory R. Ganger, Phillip B. Gibbons. Proteus: agile ML elasticity through tiered reliability in dynamic resource markets. In *ACM European Conference on Computer Systems (EuroSys'17)*, 2017.
- 4 Kevin Hsieh, **Aaron Harlap**, Nandita Vijaykumar, Dimitris Konomis, Gregory R. Ganger, Phillip B. Gibbons, Onur Mutlu. Gaia: Geo-Distributed Machine Learning Approaching LAN Speeds. In *USENIX Symposium on Networked Systems Design and Implementation (NSDI' 17)*, 2017.
- 5 Aaron Harlap, Henggang Cui, Wei Dai, Jinliang Wei, Gregory R. Ganger, Phillip B. Gibbons, Garth A. Gibson, and Eric P. Xing. Addressing the Straggler Problem for Iterative Convergent Parallel ML. In *ACM Symposium on Cloud Computing (SoCC'16)*, 2016.

#### COURSES

18847 Machine Learning Infrastructure	15719 Advanced Cloud Computing
10701 Machine Learning	15721 Advanced Database Systems
18749 Building Reliable Distributed Systems	18601 Entrepreneurship Innovation Technology
18746 Storage Systems	15712 Advanced Topics in Operating Systems

## TEACHING EXPERIENCE

Teaching Assistance: 15746/18746 Storage Systems
Fall 2016
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Fall 2017