



# Novel Architectures for Applications in Data Science and Beyond

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# Apps: Massive+-scale data analysis

**Cyber-security** Identify anomalies, malicious actors

**Health care** Find outbreaks, population epidemiology, similar patient association

**Social networks** Advertising, searching, grouping

**Intelligence** Decisions at scale, regulating markets, smart & sustainable cities

**Systems biology** Understanding interactions, drug design

**Power grid / Smart cities** Disruptions, conservation, prediction

**Irregular data access. Changing data.**

The New York Times  
Thursday, September 4, 2008

Rogues Gallery Said To Describe Failure to React

By MATTHEW FLAHERTY  
Published November 12, 2009

Massive Social Network Analysis:  
Mining Twitter for Social Good

11 @TIME  
12 @CDCemergency  
13 @CDC\_eHealth  
14 @pereshilton  
15 @billmaher  
@ATLien  
@MarshallRams  
@Kanye

# High-Performance Data Analysis (HPDA)

Novel applications:

- Data at scale and speed needs new ideas for computing analysis.
- “Big data” platforms fare poorly v. a single thread plus large SSD even for static data sets. (McSherry, Isard, Murray. “Scalability! But at what COST?” HotOS XV, 2015.)
- Many high-level codes are written and re-written to answer one question: need flexibility.
- *Some* primitives may be tuned and re-used.

# HPDA and Architectures

- Current architectures are hitting limits on manufacturing, heat dissipation, memory latency...
- New architecture proposals are difficult to evaluate via simulation and modeling alone.
- What happens when novel prototypes hit reality?
- Architects/designers need rapid feedback on new ideas.
- New ideas only become successful with a community: software ecosystem, **trained students**.

**Need bridges between apps and architects.**

# Introducing the CRNCH Rogues Gallery

**Georgia Tech**  **Center for Research into  
Novel Computing Hierarchies**

A physical & virtual space for hosting novel computing architectures, systems, and accelerators.

**FPGAs &  
HMC/HBM**

**Emu Chick**



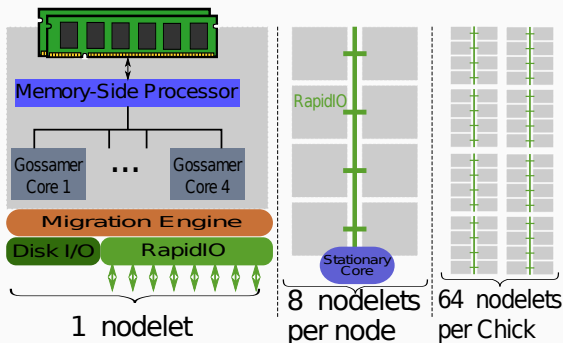
**FPAA**



Amortize effort and cost of trying novel architectures.  
Break the “but it’s too much work” barrier.

<http://crnch.gatech.edu/rogues-gallery>

# Emu Technology's PGAS Architecture



- Multithreaded multicore
- Memory-side “processor” for operations in narrow-channel DRAM
- Stationary core for OS
- **Threads migrate in hardware on reads!**
- Optimize for weak locality

# 3D Stacked Memory and FPGAs



FPGAs enable flexible “near-memory” research for both hardware **and** programming models:

- Micron/Pico EX700 & HMC
- Nallatech 385s (Arria 10)
- Intel Arria10 DevKit
- Nallatech 520N (Stratix 10)
- Xilinx MpSOC

# Neuromorphic Systems

- Field-Programmable Analog Array (FPAA) System-On-Chip, designed in the lab of Dr. Jennifer Hasler.
- Analog arrays can achieve unprecedented power and size reductions.



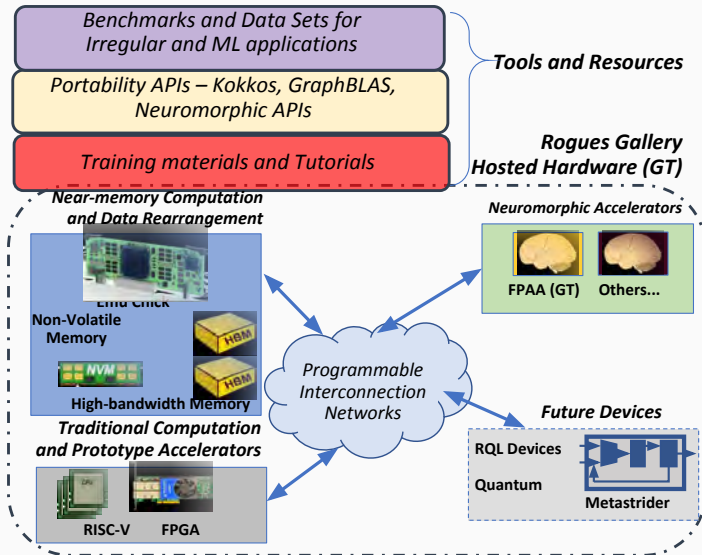
FPAA “driven” by a RPi



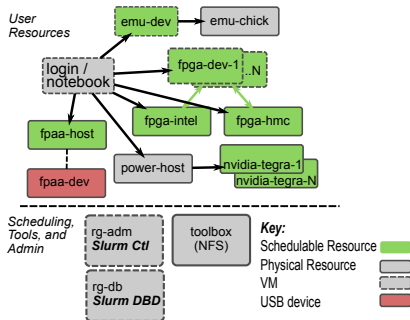
Neuromorphic Workshop,  
27 Apr 2018



# Rogues Gallery Current Targets



# Flexible Infrastructure



- Available. Plans to integrate with NSF XSEDE.
- Scheduler being deployed.
- Incorporates Singularity and virtual machines for OS/library versioning.
- Fun tools: usbip for FPAA... Analog inputs?

Powell, Riedy, Young, and Conte. "Wrangling Rogues: Managing Experimental Post-Moore Architectures."  
<https://arxiv.org/abs/1808.06334>



On *The Next Platform*, a partner of *The Register*:

HOME > COMPUTE > A Rogues Gallery of Post-Moore's Law Options

## A ROGUES GALLERY OF POST-MOORE'S LAW OPTIONS

August 27, 2018 Nicole Hemsoth



<https://www.nextplatform.com/2018/08/27/a-rogues-gallery-of-post-moores-law-options/>

# Neuromorphic Workshop - April 2018



FPAA-focused workshop led by Dr. Hasler introduced the wider community to FPAA programming for neuromorphic systems.


- Tutorial-style class
- Lightning talks from GT and DoE researchers
- <http://crnch.gatech.edu/neuro-workshop18>



# Rogues Gallery VIP Team

2019 - Present | Section - VWA  
**NEW TEAM: Rogues Gallery**

**GOALS:** Computing is changing - energy constraints and performance bottlenecks create new opportunities for unique and novel hardware designs. However, these new systems require new approaches for application development, management, and visualization. Our main goal for this project is to help interface new "post-Moore" hardware like neuromorphic field-programmable analog arrays (FPAAs), memory-centric architectures like the Emu Chick, and tightly coupled FPGAs with current software technologies. We aim to develop easy-to-use software demonstrations and examples for each new piece of hardware in the Rogues Gallery testbed and to design strategies to extend the



**Disciplines**

- College of Co
- Computational
- Computational Engineering
- Computer Eng
- Computer Sci
- Electrical Eng
- Industrial Eng
- Mechanical En

Rogues Gallery VIP team has started in Spring 2019. This course allows undergraduates to get research experience working with software for novel architectures.

[http://www.vip.gatech.edu/teams/  
new-team-rogues-gallery](http://www.vip.gatech.edu/teams/new-team-rogues-gallery)

# Selected Results: Emu Pointer-Chasing Benchmark

Data-dependent loads, fine-grained access<sup>1</sup>

## Ordered



## Intra-block shuffle: weak locality

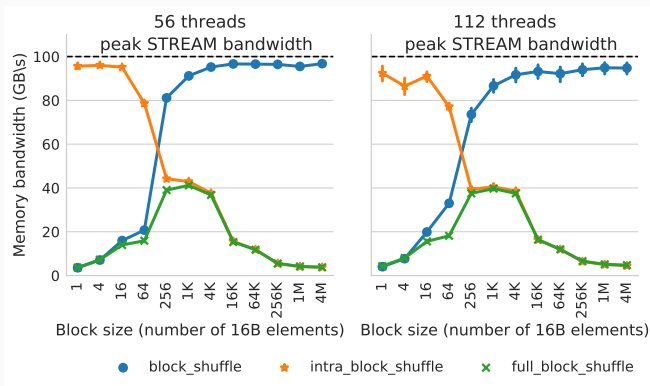


## Full block shuffle: weak locality



<sup>1</sup>Eric Hein, Young, Srinivas Eswar, Jiajia Li, Patrick Lavin, Vuduc, Riedy. "An Initial Characterization of the Emu Chick," Workshop on Accelerators and Hybrid Exascale Systems (AsHES) 2018.

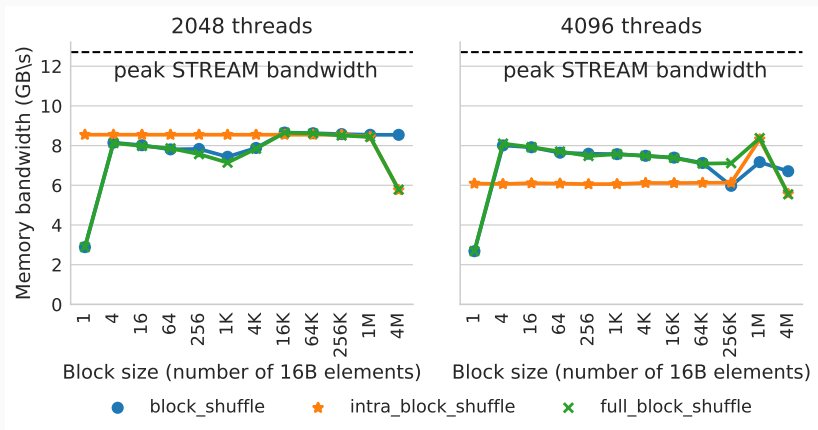
# Selected Results: x86 Pointer-Chasing Benchmark



Haswell results, every pattern is different.<sup>2</sup>

<sup>2</sup> Eric Hein, Young, Srinivas Eswar, Jiajia Li, Patrick Lavin, Riedy, Vuduc, Conte. "A Microbenchmark Characterization of the Emu Chick." <https://arxiv.org/abs/1809.07696>

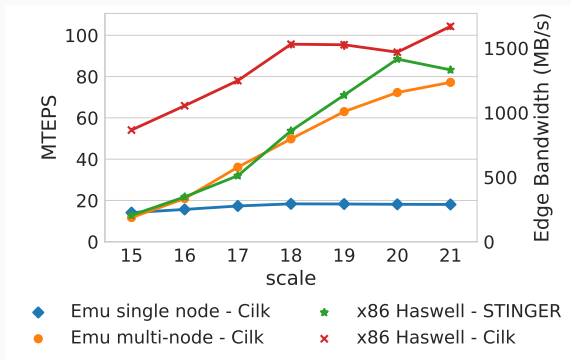
# Selected Results: Emu Pointer-Chasing Benchmark



Mostly flat performance, high utilization.<sup>2</sup>



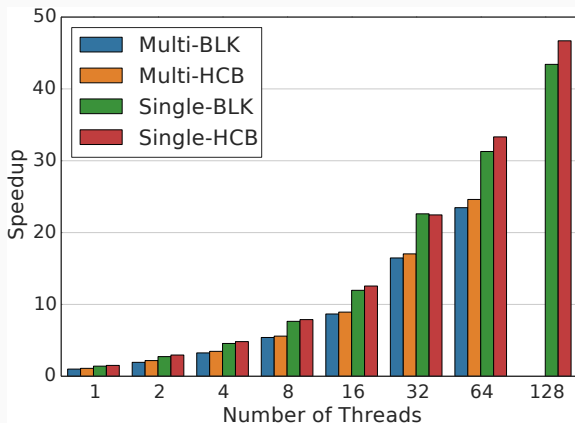
# Selected Results: BFS on a Dynamic Data Structure



Note: Streaming data structure, not statically optimized. <sup>3</sup>

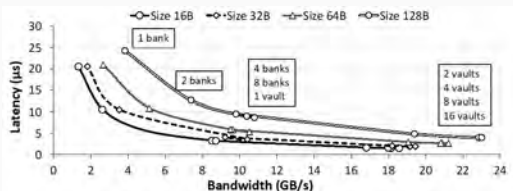
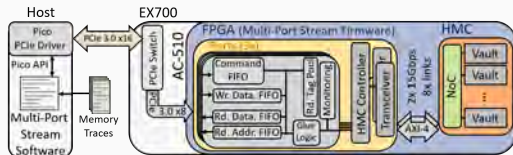
<sup>3</sup> Hein, Eswar, Abdurrahman Yasar, Prasanth Chatarasi, Li, Young, Conte, Ümit Çatalyürek, Vuduc, Riedy, Bora Uçar. "Programming Strategies for Irregular Algorithms on the Emu Chick." <https://arxiv.org/abs/1901.02775>

# Selected Results: Labeled Subgraph Alignment



GSANA, the first parallel algorithm, strong scaling on DBLP graph (2048 vertices)<sup>3</sup>

# Selected Results: FPGAs



Hadidi, Asgari, Young, Mudassar, Garg, Krishna, Kim. "Performance Implications of NoCs on 3D-Stacked Memories: Insights from the Hybrid Memory Cube (HMC)," ISPASS 2018

- Characterizations with FPGA and Hybrid Memory Cube show latency/bandwidth tradeoff.
- Other FPGA work is focused on compilers, HPC prototyping, and sparse algorithms for Intel and Xilinx FPGAs.

- Finding appropriate metrics is difficult, e.g. for the Emu:
  - Comparing ASICs (e.g. x86) to FPGA-based prototypes can be unfair either way.
  - Fraction of peak bandwidth for the *idealized* problem?
  - SpMV:  $\text{FLOP/s} \propto \text{BW}$ , level 2 sparse BLAS op.
  - Graph500 BFS:  $\text{TEPS} \propto \text{BW}$

# Lessons Learned, Emu Chick ii

- Distilling observations on architecture  $\leftrightarrow$  programming model:
  - Program data location for load (BW) balance.
  - Remote memory operations v. migration exposes the architecture.
  - Migrations cost more than it appears. Computation?
  - Stack spills/access can cause ping-ponging.
  - How does HW support for top-down (Cilk-ish) affect bottom-up (UPC/SHMEM) PGAS programming?
    - Memory allocation similar to UPC, SHMEM
    - UPC++ `rpc_ff` v. Emu thread migration?

# Acknowledgments

## Fantastic students and colleagues:

- Srinivas Eswar (GT CSE)
- Dr. Eric Hein (GT ECE  $\Rightarrow$  Emu)
- Patrick Lavin (GT CSE)
- Dr. Jiajia Li (GT CSE  $\Rightarrow$  PNNL)
- Abdurrahman Yaşar (GT CSE)
- Dr. Ümit Çatalürek (GT CSE)
- Dr. Tom Conte (GT CS/ECE)
- Dr. Bora Uçar (ENS Lyon CNRS)
- Dr. Rich Vuduc (GT CSE)
- Dr. Jeffrey S. Young (GT CS)

Code (ideally will have links from `crnch.gatech.edu`):

- <https://gitlab.com/crnch-rg> (soon)
- <https://github.com/ehein6/emu-microbench>

## Other testbeds:

- ORNL: ExCL
- Argonne
- Berkeley: AQCT
- PNNL: CENATE
- Sandia
- (others?)

# Rogues Gallery: Active and Growing

- Added FPGA resources, integrating FPAAs
- Tight development loop with Emu
- Active research projects and publications
- Community outreach and education underway
- One GT student has made the leap to industry already...

**CRNCH Rogues Gallery connects researchers **and** **students** with novel architectures and architects with upcoming applications.**

**Let us host / manage your neat stuff!**

<http://crnch.gatech.edu/rogues-gallery>