

NSF Al Institute for Edge Computing Leveraging Next Generation Networks (Athena)

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PI and Director of Athena

Summary and Vision

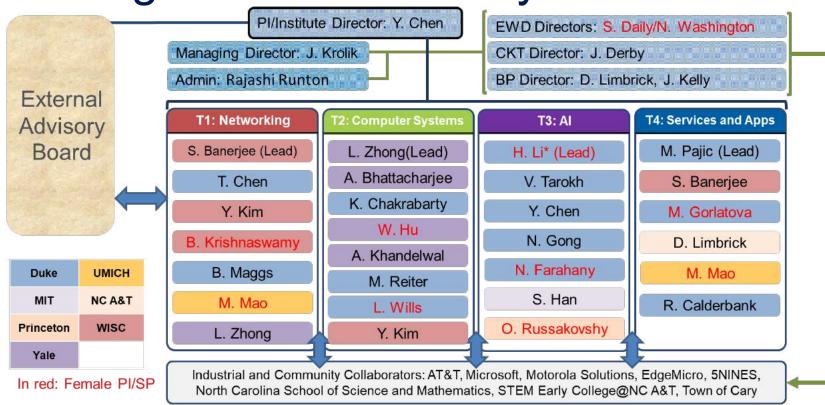
- The Athena Institute advances Artificial Intelligence (AI) technologies to transform the design, operation, and service of future mobile networks.
- The research activities of Athena are organized under four synergistic thrusts: Networking, Computer Systems, AI, and Services.
- Athena is committed to educational and workforce development, cultivating a diverse next generation of mobile network leaders with the core values of ethics and fairness for AI.
- As a nexus point for community, Athena spearheads collaboration and knowledge transfer to translate its emerging technical capabilities to new business models and entrepreneurial opportunities, transforming the future competition model in both research and industry.

A Team Composed of 30 World-class Scholars



A multi-disciplinary team of scientists, engineers, statisticians, legal scholars, and psychologists.

Organization and Key Personnel





The Geographical Distribution of the Participated Institutions

7 Participating Institutions:

- Puke University (Duke, Lead)
- Massachusetts Institute of Technology (MIT)
- North Carolina A&T University (NCAT)
- Princeton University
- University of Michigan (UMich)
- University of Wisconsin-Madison (WISC)
- Yale University (Yale)

8 National Collaborators:



TedgeMicro



Motorola (Moto)

North Carolina School of Science and Mathematics

The STEM Early College at NCAT

Town of Cary

5NINES



External Advisory Board



Victor Bahl Technical Fellow, CTO Azure for Operators at Microsoft



Jilei Hou VP & Head of Al Research Qualcomm



Jehan Wickramasuriya
VP, AI & Data Engineering
Motorola Solutions

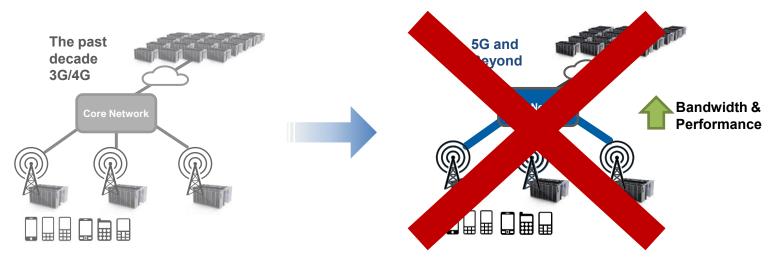


Charlie Zhang SVP Samsung Research America



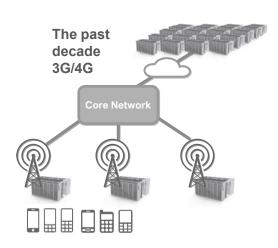
Victor Zhirnov Chief Scientist Semiconductor Research Corporation

Current Generational Upgrade of Mobile Networks

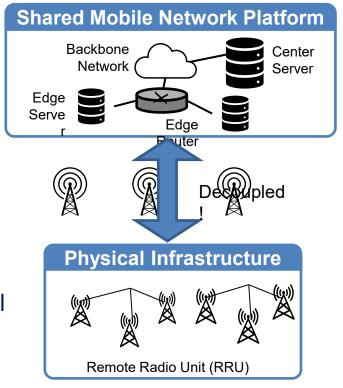


- Current generational upgrade: redesign and rebuild infrastructure to host higher performance and bandwidth for newer generation networks.
- This model is inflexible, wasteful, and monopolistic.

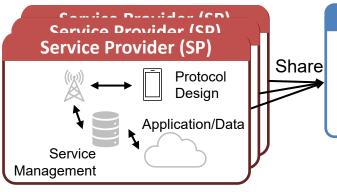
Decoupling of Network Platform and Infrastructure



 Instead, our vision decouples the shared mobile network platform from the physical infrastructure



Decoupling of Network Platform and Infrastructure



Shared Mobile Network Platform

Backbone Center Server

Edge Serve Edge

Pouter

Physical Infrastructure

Remote Radio Unit (RRU)

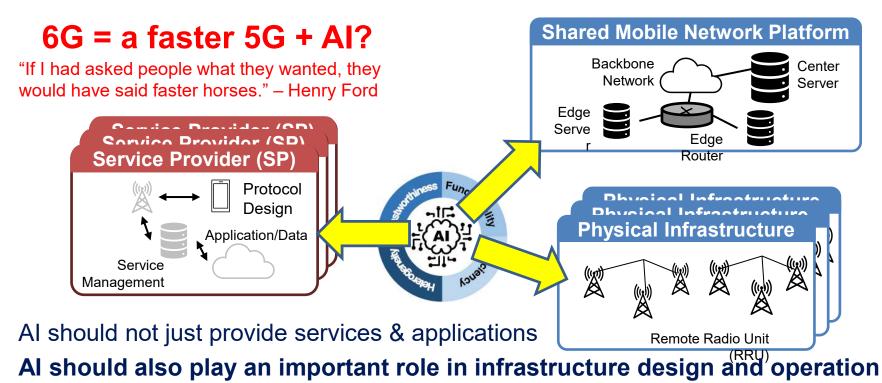
Shewapled!

New Business Models + Entrepreneurial Opportunities

 Instead, our vision decouples the shared mobile network platform from the physical infrastructure

- Enabling modularity of physical infrastructure
- And of flexible opportunity for services

A New Comprehensive Role of Al



Our Three Key Insights and Main Goal

Insight 1: Advances in *AI provides* powerful tools to solve the problems in compute and network system designs and operation at scale.

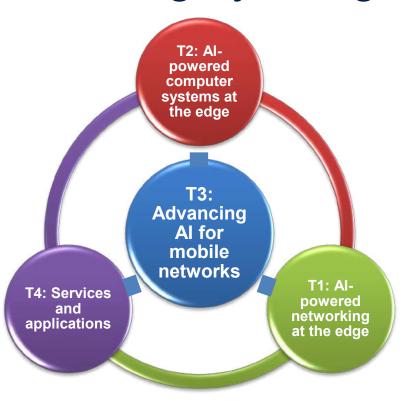
Insight 3: Mobile network infrastructures and their clients allow for new modalities of AI in clients, edge datacenters, and the Cloud (e.g., FL)

Warehouse 5G and beyond datacenter Cloud-native mobile network 1. Al as Powerful Tools **Foundational** datacenter Internet research Remote Radio Unit (RRU) 3. New modalities of Al 2. Fresh challenges to Al

Insight 2: Mobile networks and services pose fresh and intriguing challenges to Al's theoretical advances and practical applications.

Athena not only addresses the challenges facing mobile networks but also advances the stateof-the-art of AI regarding functionality, efficiency, heterogeneity, and trustworthiness, enabling a shared intelligent network infrastructure and disrupting the ecosystem and business model.

Four Highly-Integrated Research Thrusts



T1: Create an adaptable, scalable, performance-aware mobile network infrastructure using a data-driven approach

T2: Design the next-generation edge data center with high efficiency, availability, and security, investigate system support for Al

T3: Develop AI techniques to fulfill the needs of the next-generation network in functionality, efficiency, heterogeneity, and trustworthiness

T4: Develop innovative services and applications for the next-generation network enabled and inspired by the AI technologies

AI-Powered Networking

Goals

- Adaptability
- Scalability
- Efficiency

Outcomes

- Wireless networks that learn
- Explainable configurations
- Trials with partners (EdgeMicro, 5NINES) and on PAWR platforms



Duke

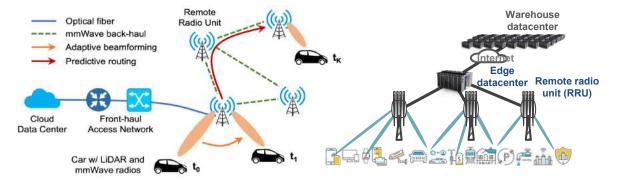
UMICH

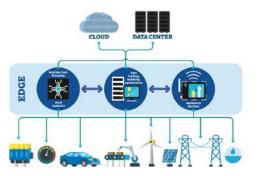
Yale

WISC

Fundamental Challenges

- Adaptability: Wireless environment continues to be highly dynamic (e.g., mobility, higher frequencies)
- devices growth is unabated (e.g., IoT, vehicles, multiple devices /person)
- require edge cloud services for faster processing, but need to deal with consequent growth in network traffic





Al-Powered Computer Systems at Edge

Goals

- Efficiency
- **Programmability**
- **Availability**

Outcomes

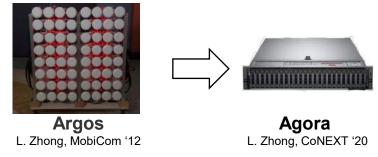
Design, implementation, and evaluation of algorithm, software systems, & hardware



Edge Datacenters

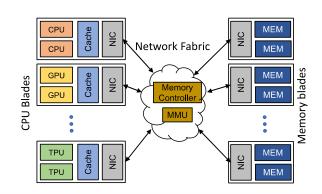
Shouldering the computational need of mobile networks & services

- Challenges
 - Efficiency & Availability
 - Diversity of requirements



World's first massive MIMO: From FPGA to software

- Opportunities
 - Disaggregating resources for flexibility
 - Al-powered performance optimization
 - Hardware acceleration for Al



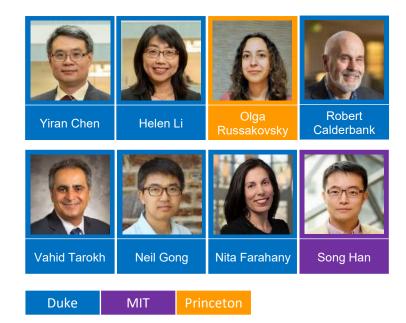
Al Foundations

Goals

- Functionality
- Efficiency
- Heterogeneity
- Trustworthiness

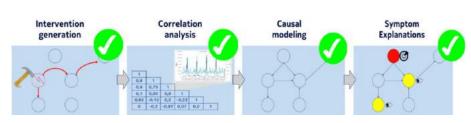
Outcomes

- · Al methods for CNS systems
- Significant improvement in system metrics
- Theoretical breakthrough in Al foundations



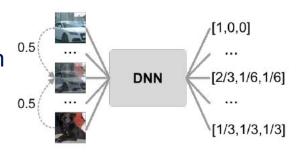
Al Foundations in Functionality

- Goals: Gain insights into network and system operations while appropriately responding to both foreseen and unforeseen circumstances
- Causal analysis
 - Causal inference
 - Invariant representations
- Out-of-distribution (OOD) prediction
 - Calibration over input space via outlier exposure
 - Feature space analysis

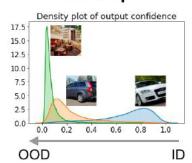


Causal analysis and interpretable AI (L. Carin, ICLR'21, NeuIPS'20)

Training phase



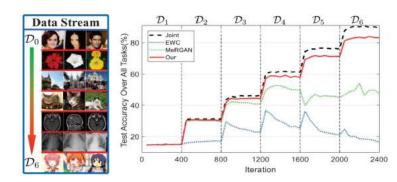
Inference phase



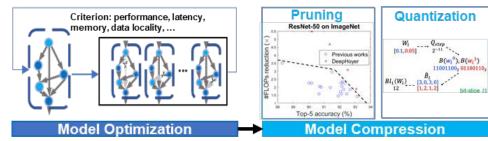
OOD data prediction (Y. Chen & H. Li, '21)

Al Foundations in Efficiency

- Goals: Improve efficiency and scalability of AI models in networking and computing systems
- Efficient learning
 - Domain adaptation / knowledge transfer
 - Distributed optimization / federated learning
- Al model design / deployment / execution
 - Compact model design
 - Hardware-aware AutoML / neural architecture search (NAS)



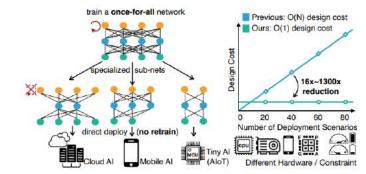
Continual learning (L. Carin, NeurlPS'20, CVPR'21)
Distributed learning (H. Li, NeurlPS'17 Oral)



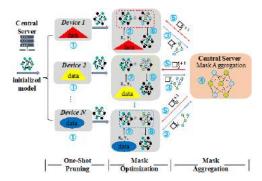
Compact model design and NAS (H. Li, AAAI'20, ICLR'21)

Al Foundations in Heterogeneity

- Goals: Learn in the "physical world" via heterogeneous data and systems in distributed networks, and improve Al's applications and services
- Horizontal heterogeneity
 - Personalization for each device
- Vertical heterogeneity
 - Heterogeneity-aware federated learning
 - Adaptive optimization



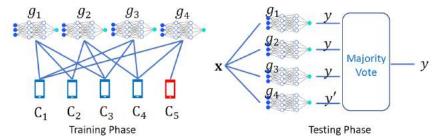
Personalization (S. Han, ICLR'20; Y. Chen, TCPS'21, ICLMA'19 Best Paper)



Federated leaning (Y. Chen, MobiCom'21; L. Carin & H. Li, NSF C-Accel)

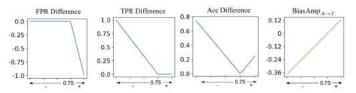
Al Foundations in Trustworthiness

- Goals: Ensure predictable and reliable quality-of-service (QoS) and measure fairness within an ethics framework
- Robustness at deployment
 - Robustness to adversarial attacks
 - Provable security and privacy protection
- Fairness, ethics and social implications
 - Algorithmic bias mitigation with practical solutions and theoretical guarantees
 - Ethics consultation framework



Robustness and security (N. Gong, AAAl'21; NDSS'19 Distinguished Paper Award honorable mention; H. Li, NeurlPS'20 Oral)

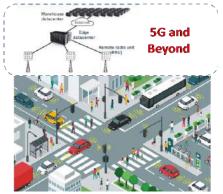
$$\begin{aligned} \operatorname{BiasAmp}_{\to} &= \frac{1}{|\mathcal{A}||\mathcal{T}|} \sum_{a \in \mathcal{A}, t \in \mathcal{T}} y_{at} \Delta_{at} + (1 - y_{at}) (-\Delta_{at}) \\ y_{at} &= \mathbbm{1} \left[P(A_a = 1, T_t = 1) > P(A_a = 1) P(T_t = 1) \right] \\ \Delta_{at} &= \begin{cases} P(\hat{T}_t = 1 | A_a = 1) - P(T_t = 1 | A_a = 1) \\ \text{if measuring } A \to T \\ P(\hat{A}_a = 1 | T_t = 1) - P(A_a = 1 | T_t = 1) \\ \text{if measuring } T \to A \end{cases} \end{aligned}$$



Algorithmic fairness (O. Russakovsky, '21; CVPR'20; FAT*'20; ECCV'20 spotlight; CVPR'21)

Al-Powered Services & Apps at Edge

Promise of Edge-Supported Autonomy









Limbrick









Gorlatova

Duke

NC A&T

UMICH

WISC

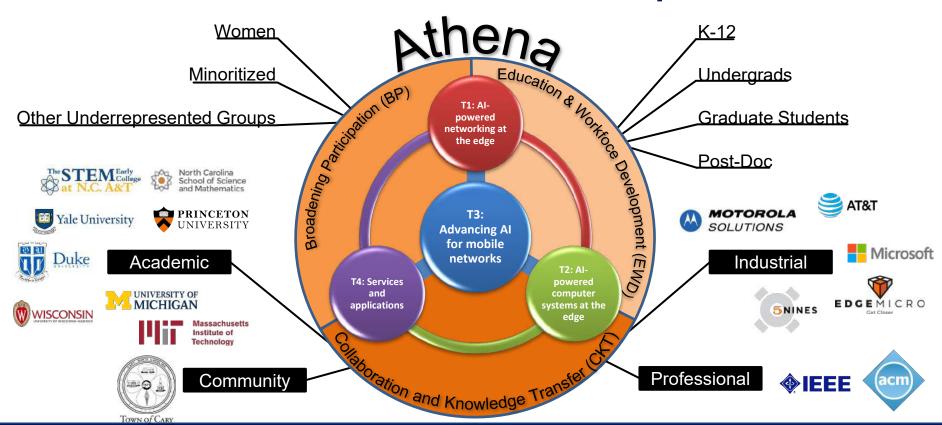
- Goal: **Assured**, **robust** & **resilient** services for autonomous systems at the edge
- Challenges:
 - Infrastructural (i.e., data/processing) requirements:
 - Low-latency, high-bandwidth network
 - Integrated computational support for collaborative AI
 - Algorithmic requirements:
 - (Scalable) Al methods for distributed/collaborative decision making
 - Strong performance (safety & functionality, robustness, trustworthiness) quarantees

Al-Powered Services and Apps at Edge



- Goal: Assured, robust & resilient services for autonomous systems at the edge
 - Exploiting the available (heterogenous) communication and computation resources
 - Provide strong safety & performance guarantees at design- and run-time, as the system & environment evolve
 - Rigorous design and analysis approaches for safetycritical systems
- Our Focus
 - Robust situational-awareness at the edge
 - High-assurance autonomy at the edge

The Roles of Other Components



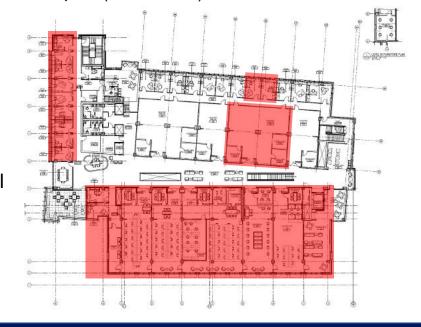


Office and Lab Space, Computing Resources

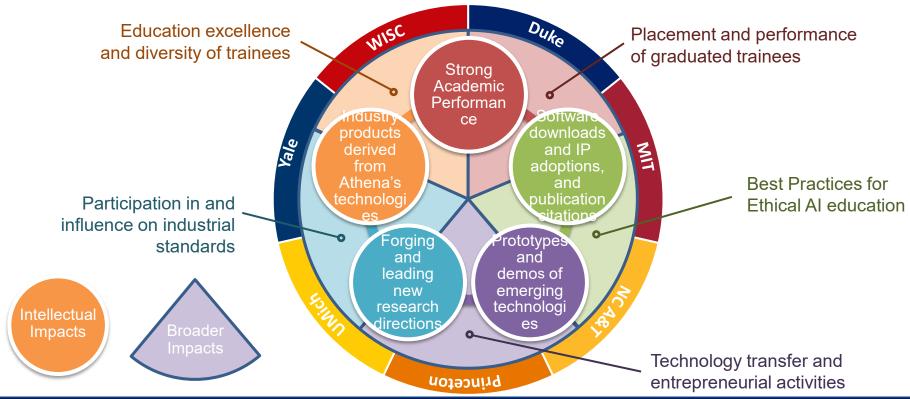


- The project leads directly own 130+ servers with 600+ CPUs and have the accesses to institutional high-performance computing facilities of 60,000+ CPU cores and 10,000+ GPUs.
- Physical proximity of Aerpaw and MCity testbeds.
 Existing collaborations facilitate physical access to other PAWR testbeds.

The hub of Athena will be housed on the 4th floor of the new Wilkinson Building on Duke campus (10,000+sf).



Metrics of Athena's Success



Summary



Vision: Athena envisions a virtualized mobile network powered by AI with unprecedented efficiency, reliability, and performance, and aims at realizing this vision with foundational and use-inspired research as well as advancing the SOTA of AI in both application and theory.



Role of Al: Instead of a mere important application, our developed Al technologies will also offer theoretical and technical foundations for future mobile networks in functionality, heterogeneity, scalability, and trustworthiness.



Nexus Point: Serving as the nexus point of community, Athena will facilitate the ecosystem of the emerging technologies and cultivate the diverse next-generation technical leaders having the values of ethics and fairness.



Societal Impact: The success of Athena will disrupt the future mobile network industries, create new business model and entrepreneurial opportunities, and transform the competition model of future mobile network industry and research.

Call for Collaborations!

