



[www.chameleoncloud.org](http://www.chameleoncloud.org)

## Infrastructure for New Ideas

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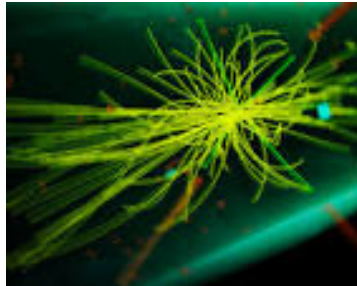
**CARLA, 09/25/25**



# MAKING SCIENCE



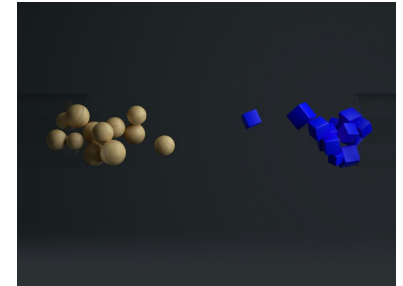
Human genome sequencing



High Energy Physics



Drug discovery



Materials discovery

high performance computing

data science

Artificial Intelligence

machine learning

security    energy efficiency    performance management

storage systems    virtualization    networking    databases



800+

Papers  
published

1,300+  
Unique  
projects

13,000+  
Users



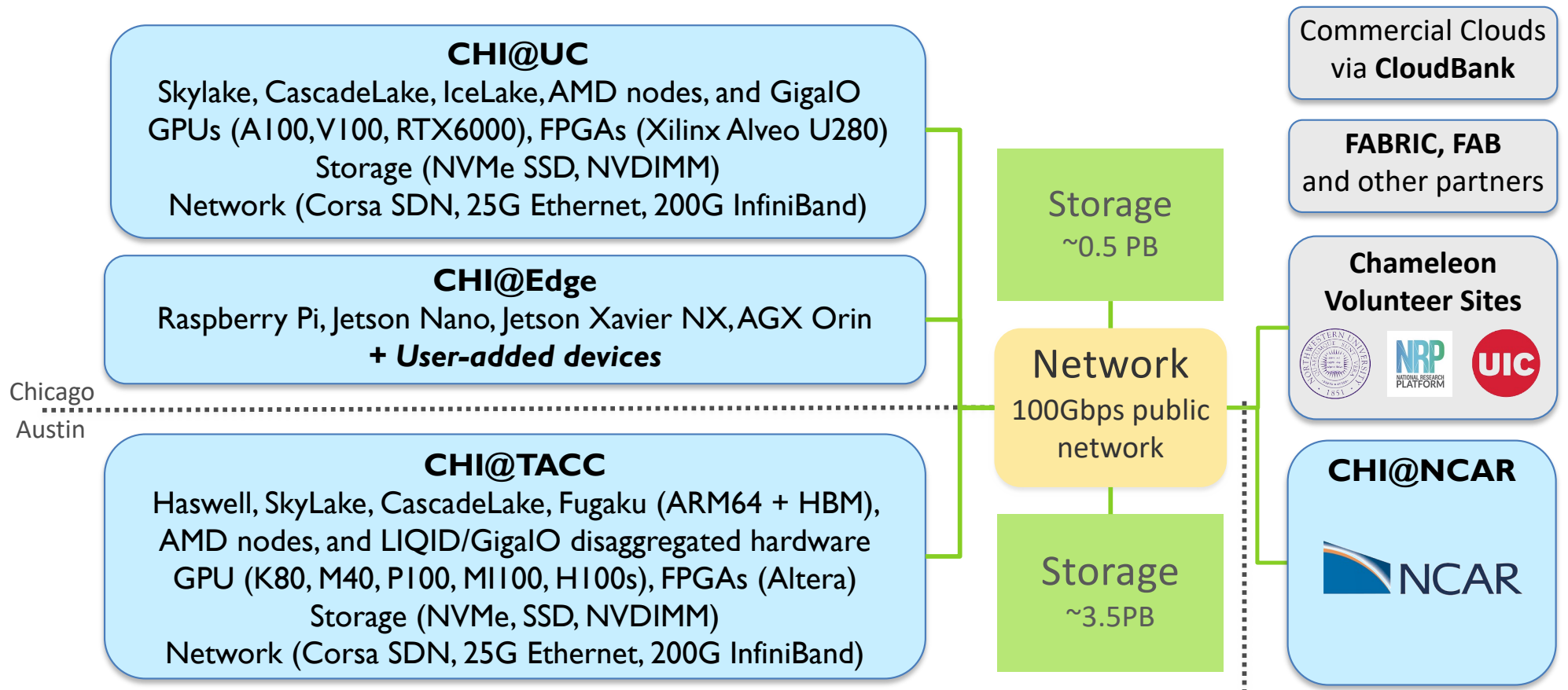
# INFRASTRUCTURE FOR NEW IDEAS

- ▶ Support a **broad** set of experiments
  - ▶ Diverse: architectures, accelerators, storage, interconnects and networks
  - ▶ From large to small: scale versus diversity trade-off
  - ▶ Wide interfaces, distributed capability, integration with other testbeds
- ▶ **Deeply** reconfigurable
  - ▶ Capabilities: power on/off, custom kernel boot, serial console access, firmware change, etc.
  - ▶ A spectrum of reconfigurability options: bare metal, virtualization, containerization
- ▶ Supporting and innovating experimental **methodology**
  - ▶ Experiment packaging and sharing
  - ▶ Practical reproducibility
- ▶ **Cost-effective** yet **evolving**
  - ▶ Solid base in mainstream open source capabilities
  - ▶ Capable of evolution

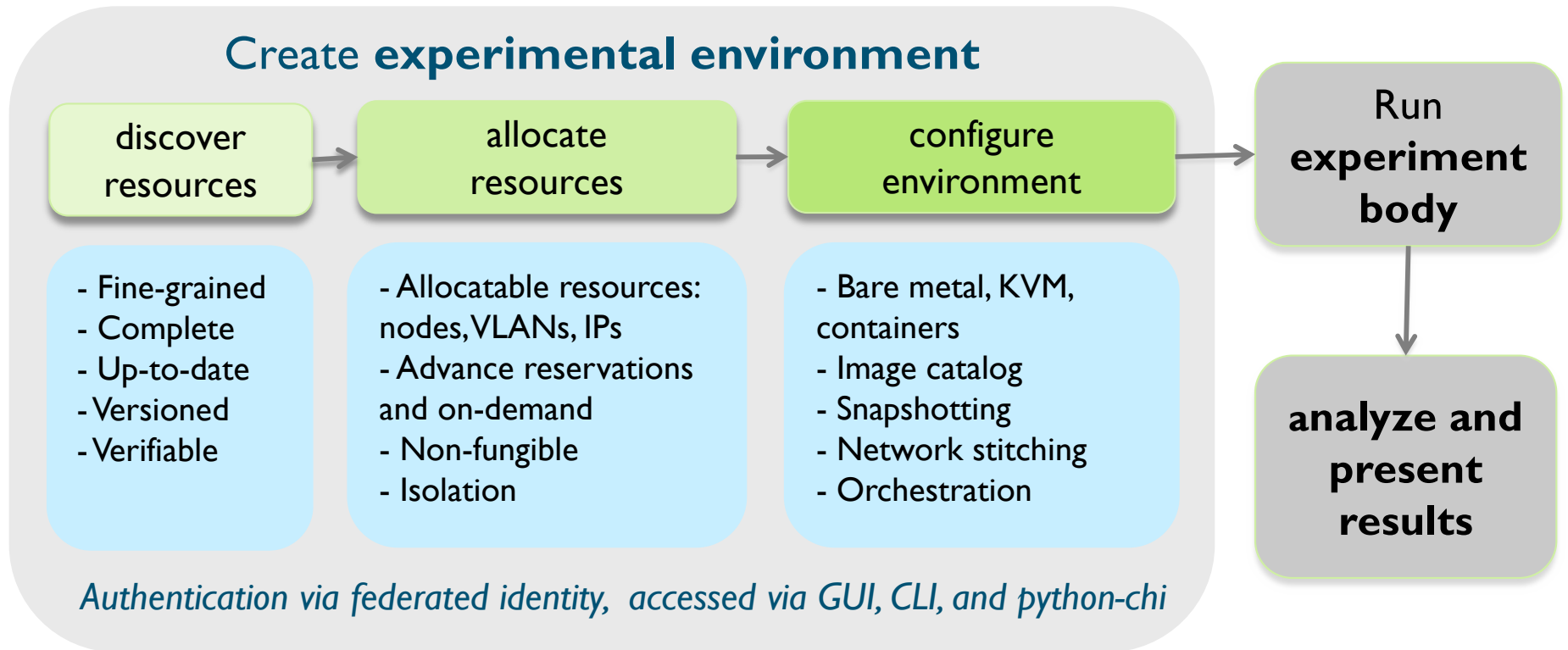




# CHAMELEON HARDWARE



# EXPERIMENT STRUCTURE



*Paper: "Lessons Learned from the Chameleon Testbed", USENIX ATC 2020*

# NOT JUST A TESTBED, A COMMUNITY



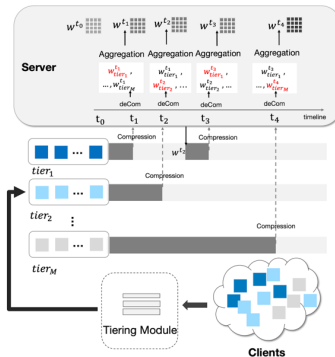
Supporting research projects in architecture, operating systems design, virtualization, power management, real-time analysis, security, storage systems, databases, networking, machine learning, neural networks, data science, and many others.



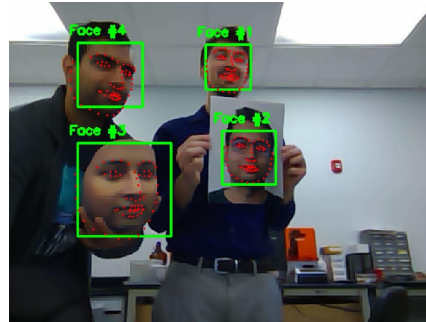
[www.chameleoncloud.org](http://www.chameleoncloud.org)

Check out user experiment stories on our blog:  
<https://www.chameleoncloud.org/blog/category/user-experiments/>

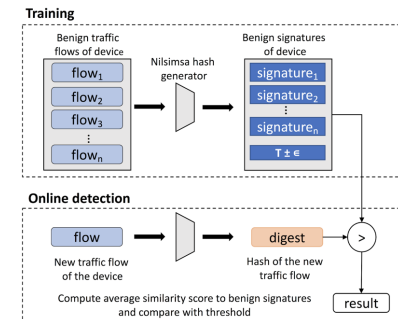
# FROM CLOUD TO EDGE WITH CHAMELEON



*federated learning*



*biometrics*



*network traffic fingerprinting for IoT devices*

- ▶ Increasingly more Chameleon project applications working on IoT/edge
- ▶ Simulation/emulation don't always provide the answer: What are the impacts of this approach on power management on edge device? How will the performance transfer to edge? Can we measure the impact of distribution/networking for edge/cloud applications?
- ▶ **Goal: “realistic edge to cloud experiments from one Jupyter notebook”**



# PROGRAMMABLE WITH CHI@EDGE

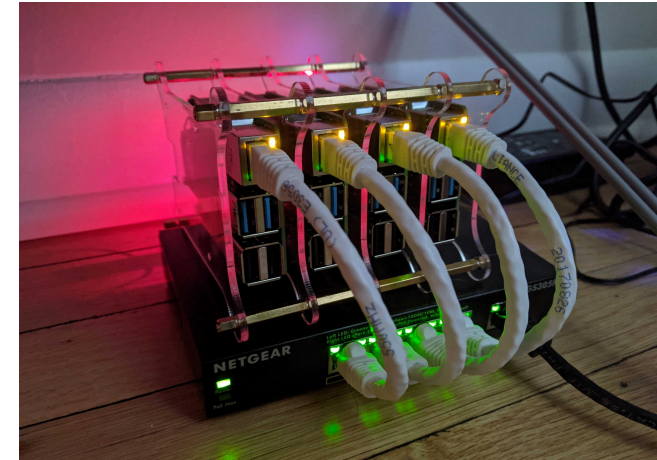


A lot like a cloud!  
All the features we know  
and love – but for edge!  
“Edge to cloud from one  
Jupyter notebook.”

Not at all like a cloud!  
Location, location, location!  
IoT: cameras, actuators, SDRs!  
Not server-class!  
And many other challenges!



- ▶ CHI@Edge: all the features you love in CHI, plus:
  - ▶ Reconfiguration through non-prescriptive **container deployment** via OpenStack interfaces (using K3 under the covers)
  - ▶ Support for “standard” **IoT peripherals** (camera, GPIO, serial, etc.) + easy for you to add support for your own peripherals
  - ▶ **Bring Your Own Device (BYOD): Mixed ownership** model via an SDK with devices, virtual site, and **restricted sharing** – building on OpenBalena



# AUTOLEARN

- ▶ Chameleon notebooks based on the DonkeyCar package
- ▶ Students learn in three stages:
  - ▶ Data collection – actual/simulator – edge to cloud
  - ▶ Model training in the cloud
  - ▶ Verification via autonomous driving – actual/simulator – edge to cloud
- ▶ Supports different emphasis in teaching
  - ▶ Introduction to engineering might emphasize driving the actual car
  - ▶ Machine learning focus might use the simulator
- ▶ Individual exploration:
  - ▶ E.g., digital twin combining simulator and experimental driving



REU 2023 students working on hardware setup for autonomous vehicles

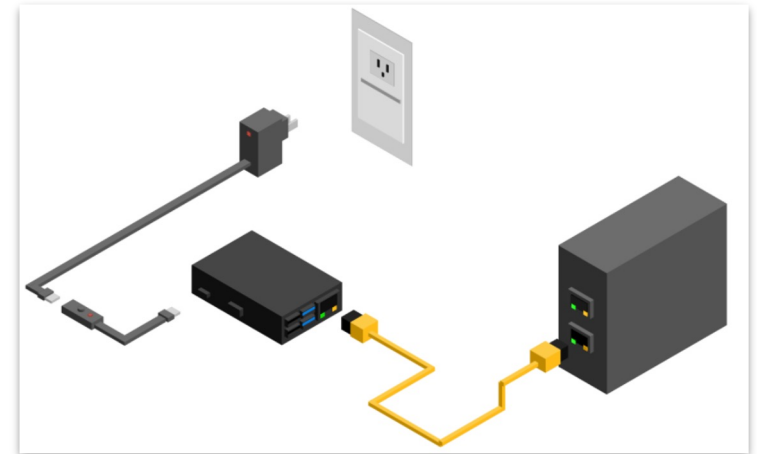
*Paper: “AutoLearn: Learning in the Edge to Cloud Continuum”, EduHPC’23*

# FROM EXPLORATION TO OBSERVATION: THE FLOTO PROJECT CASE STUDY

- ▶ Why broadband monitoring?
  - ▶ Technical questions: what happens in conditions of oversubscription?
  - ▶ Policy questions: can we characterize the “digital divide” in our society?
  - ▶ Modeling questions: what assumptions about broadband are realistic?
- ▶ Measuring broadband – different approaches/applications depending on context, objective, use case, etc.
  - ▶ Netrics: open-source library of standard network diagnostic tools (ndt7, speedtest, ping, traceroute, etc.) for continuous, longitudinal network measurement
  - ▶ Others: e.g., residential versus rural broadband and other use cases
- ▶ **Approach:** connect a “measurement box” to the router and run tests
- ▶ **Can we use CHI@Edge as a large observatory instrument for broadband monitoring?**
- ▶ Collaboration with Nick Feamster & his UChicago team

# THE DEVICES

- ▶ Raspberry Pi 4 (8GB)
- ▶ Additional Components
  - ▶ MicroSD Cards (32GB)
  - ▶ CAT 6 Ethernet Cable
  - ▶ Power Cord
- ▶ Optional: PoE+ HATs to enable deployment in locations with scarce power sources
- ▶ Inventory: 1,000 devices
- ▶ Allocations via a device request form:  
<https://floto.cs.uchicago.edu/deployment/apply-for-floto-devices/>

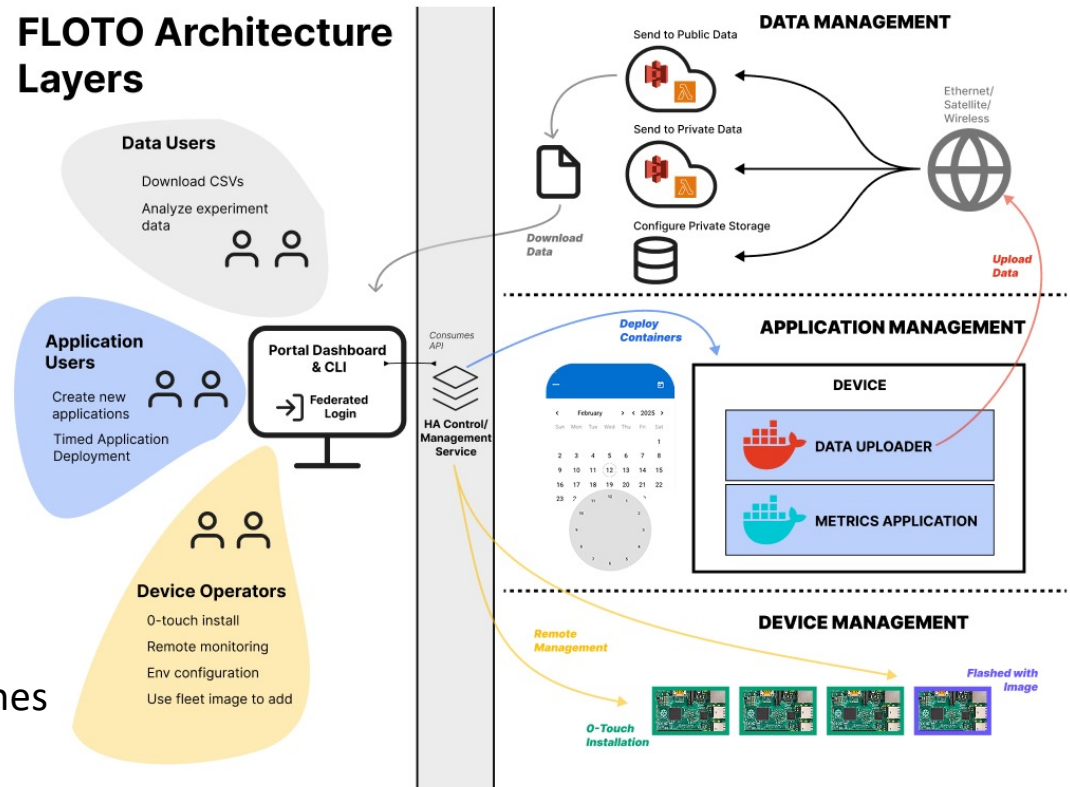




# IBIS: A SENSING SUPERCOMPUTER

- ▶ Device operators
  - ▶ Ease of use vs control trade-off
  - ▶ User operator vs centralized
- ▶ Application users
  - ▶ Applications composed of several functions
  - ▶ Application configuration
- ▶ Data users
  - ▶ Sharing versus privacy trade-off
  - ▶ Established community data pipelines versus new sharing methods

## FLOTO Architecture Layers



# DEVICE MANAGEMENT LAYER

- ▶ Onboard, offboard, and repurpose devices
- ▶ Devices self-enroll
  - ▶ 0 touch device enrollment (after imaging)
  - ▶ Alternatively, flash with our image to enroll your own device
- ▶ Configuration management
  - ▶ Update and deploy without physical access, stateless, vetted images, includes software and device configuration, can be pinned to releases
  - ▶ OpenBalena + “special sauce”
- ▶ Robust remote management features
  - ▶ View status and statistics, create and manage deployments, trigger appropriate actions (e.g., send mail), dashboard and CLI interfaces
- ▶ HA control plane, federated identity login, etc.

Count	Heartbeat State	VPN connected	Status	Provisioning State	OS Version	Supervisor Version	Release	Fleet	Devices
1	online	True	Idle		balenaOS 2.105.1rev1	14.2.0	test2	floto-testing	<a href="#">Details</a>
14	offline	False					51	bootstrap	<a href="#">Details</a>
6	online	True							<a href="#">Details</a>
3	offline	False			balenaOS 2.113.18	14.9.4			<a href="#">Details</a>
3	online	False			balenaOS 2.105.1rev1	14.2.0			<a href="#">Details</a>
2	offline	False					53		<a href="#">Details</a>
2	online	True							<a href="#">Details</a>
6	unknown	False	None	None	None	None	None	esnet	<a href="#">Details</a>
2	offline	False	Idle		balenaOS 3.1.1	14.11.12	177		<a href="#">Details</a>
1	offline	False			balenaOS 2.105.1rev1	14.2.0	73	experiment	<a href="#">Details</a>
29	online	True					125	floto	<a href="#">Details</a>
4	offline	False					metrics		<a href="#">Details</a>
1	offline	False					125		<a href="#">Details</a>
5	online	True					172	floto-k3s	<a href="#">Details</a>
1	offline	False					170		<a href="#">Details</a>
4	online	True					None	floto-staging	<a href="#">Details</a>

[Devices](#)
[Fleets](#)
[Releases](#)

[keahy@chameleoncloud](#)
[Logout](#)

Device "floto-H03-803B"

floto-H03-803B

UUID

97403327662C7604644504087187804

Temp: 54°C

CPU: 12%

Memory: 13.8%

Storage: 8.2%

Logout

Heartbeat State

online since 2023-08-08T10:53:41.692Z

VPN connected

True since 2023-08-08T10:53:41.692Z

Status

Idle

Provisioning State

OS Version

balenaOS 2.105.1rev1

Supervisor Version

14.2.0

Release

125

Fleet

floto

IP address

128.135.150.132

MAC address

E4:5F:01:AC:E3:BC:AE:AA:BB:9D:BA:7A

actions

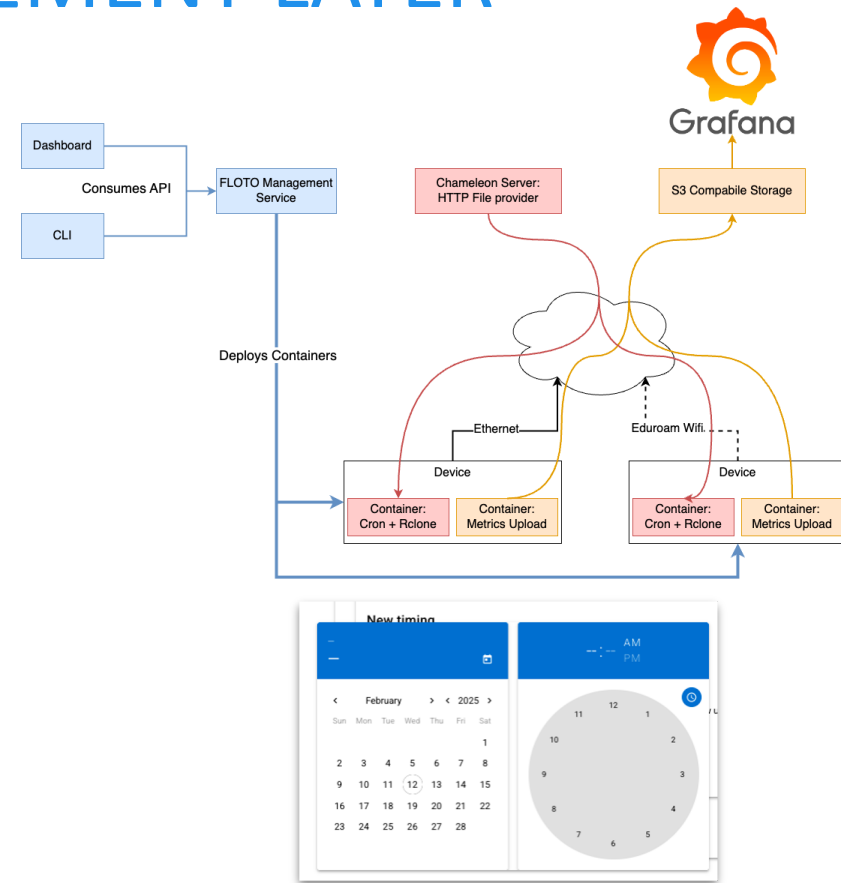
Command

uptime

Run

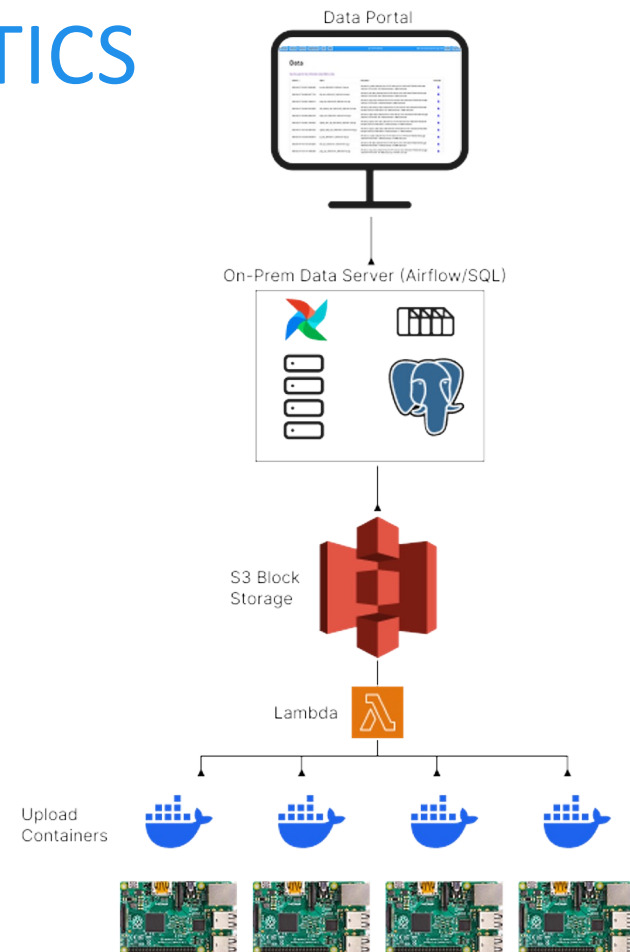
# APPLICATION MANAGEMENT LAYER

- ▶ Supports deployment of applications on device fleets via a system container
- ▶ Applications are packaged as Docker containers and reviewed
- ▶ Users can reserve overlapping or non-overlapping timeslots for application deployment so as not to conflict with other deployments
- ▶ Generic data streaming implemented as a “system application”
- ▶ Multi-container applications deployed via docker-compose syntax



# DATA COLLECTION AND ANALYTICS

- ▶ Applications gather data locally on device
- ▶ Upload containers send it to cloud/central storage
  - ▶ Default processing pipeline (Netrics Data): Netrics Uploader → AWS Lambda & S3 → on-prem Airflow & PostgreSQL → FLOTO Data Portal
  - ▶ User-defined pipeline (new broadband test): FLOTO Uploader/Custom → Chameleon Block Storage → Compute processing → Shared as artifact on Chameleon
- ▶ Filter and share securely
  - ▶ Filtering: Remove sensitive data before publication
  - ▶ Public portal dataset (default): download CSV files
  - ▶ Private storage: FLOTO-managed or user-controlled





# INSTRUMENT ADAPTABILITY

## What knobs can I turn on this instrument?

- Deployment scope: deploy the devices in a different area
- Application: adapting “sensing abilities” programmatically
- Hardware: combine devices with different IoT gadgets (e.g., GPS)
- Data aggregation: different methods for different applications
- Data: ask different questions of the data



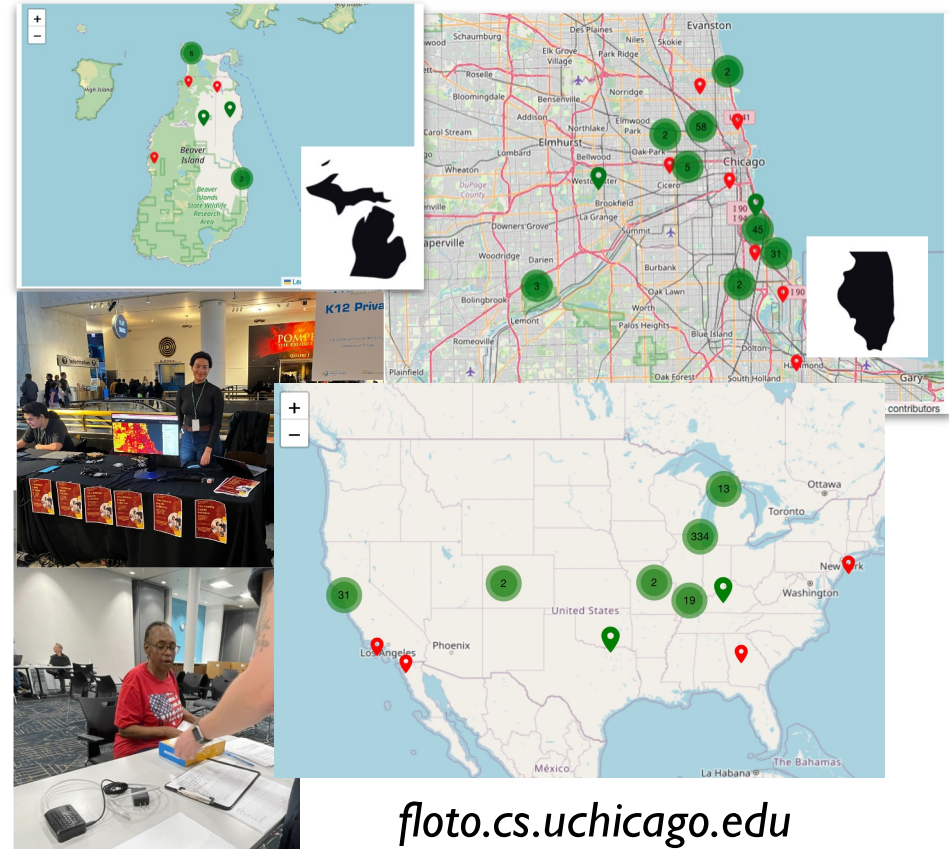
# FLOTO: DEPLOY DEVICES IN DIFFERENT AREAS

~500 devices deployed across multiple states  
Notable deployments:

- ▶ Chicago (180+ devices)
- ▶ Milwaukee (200+ devices)
- ▶ Marion County, IL; Beaver Island, MI -- and others

As a distributed community, we rely on trust and deep partnerships to bring infrastructure where it is needed most

- ▶ Building trust with communities
- ▶ Managing devices remotely (with many participants)
- ▶ Coordinating large-scale distribution



# FLOTO: RUN A DIFFERENT APPLICATION

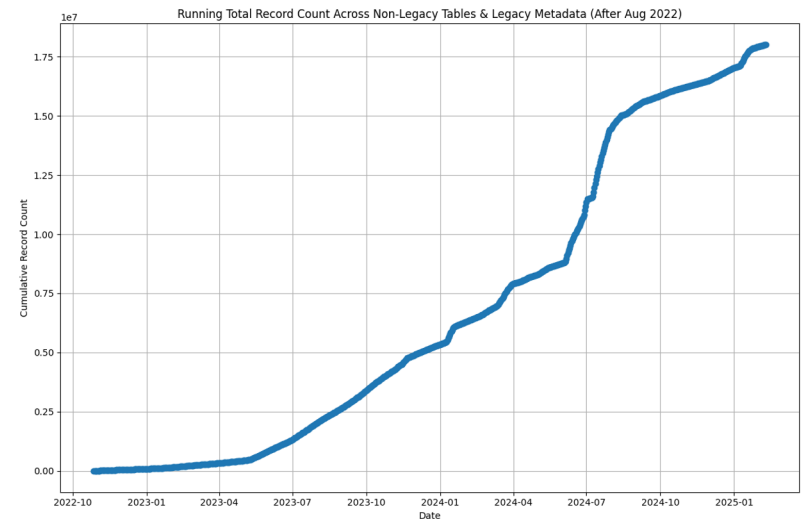
## Applications Deployed on FLOTO to Date:

*Each application provides different methods for broadband measurement depending on research interest*

- ❑ **Netrics:** Broadband performance measurements to study access networks
- ❑ **RADAR Toolkit:** QoE measurements for telehealth applications
- ❑ **NetUnicorn:** Data pipeline experiments
- ❑ **Georgia Tech:** IPv6 Performance Studies
- ❑ **M-Lab:** Measurement Swiss Army Knife (MSAK) integration
- ❑ **ARA:** Monitoring 5G wireless performance in rural areas

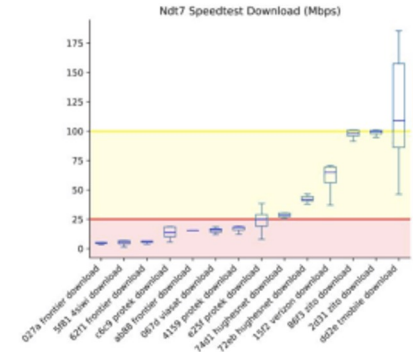
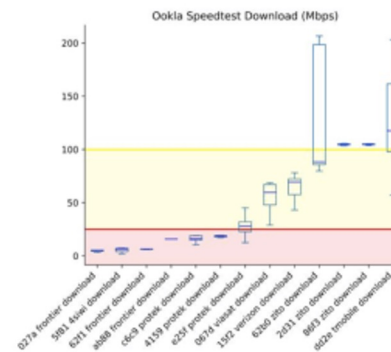
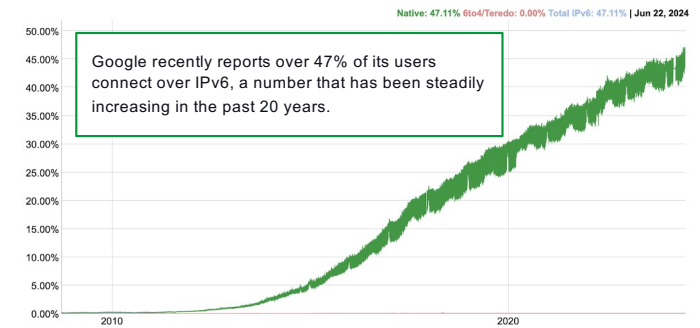
# FLOTO: MINE THE DATASET

- ▶ ~25M million measurements collected since Oct. 2022
- ▶ What Measurements? Time series speed tests, latency, DNS performance, network paths on fixed connection (no WiFi bias)
- ▶ Spans 19 different network providers
- ▶ Multiple access technologies (fiber, cable, satellite, fixed wireless)
- ▶ Data is publicly available via project website
- ▶ Proposed as NAIRR dataset for working with projects like e.g., anomaly detection



# FLOTO: CASE STUDIES

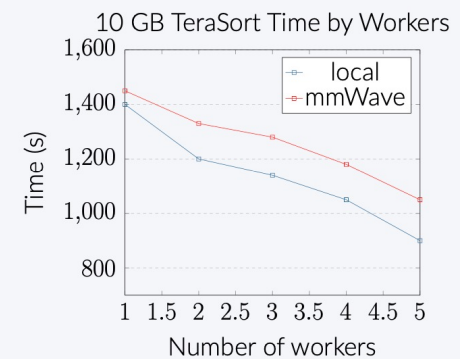
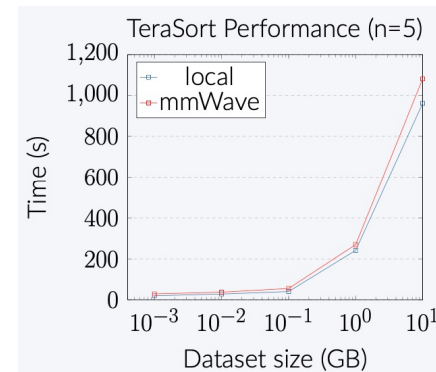
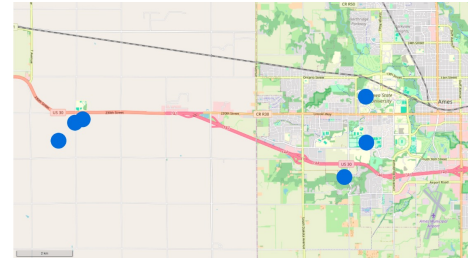
- ▶ Computer Science questions: IPv4 versus IPv6
  - ▶ Objective: Understand how Internet speed varies between IPv4 and IPv6'
  - ▶ Method: sequential speed tests comparing IPv4 and IPv6 results under similar conditions
  - ▶ Early Findings: IPv4 and IPv6 speeds degrade differently under various conditions, influenced by the ISP (SIGMOD paper in preparation)
- ▶ Policy questions: Marion County
  - ▶ Objective: Improve internet infrastructure and performance in Marion County, Illinois
  - ▶ Method: Deploy FLOTO devices to collect and analyze broadband performance data
  - ▶ Finding: 32% of sampled households below the federal threshold -- data used to support grant applications for fiber broadband expansion





# MEASURING RURAL WIRELESS

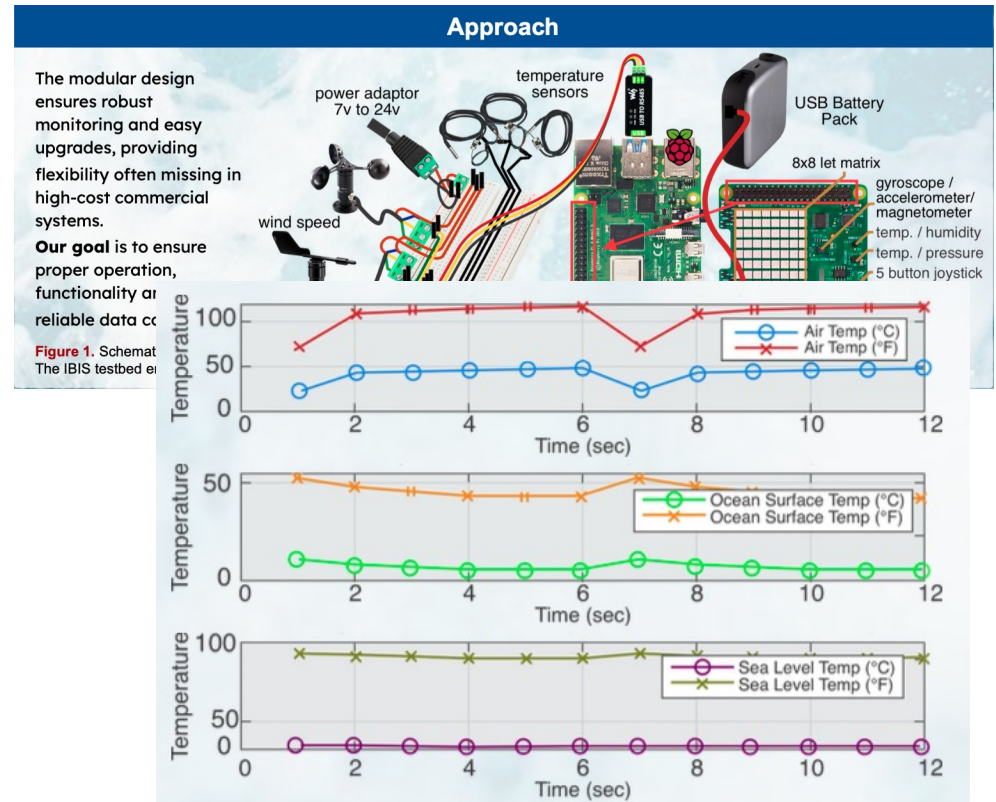
- ▶ Collaboration with ARA project
- ▶ Assessing the quality of rural 5G networks
  - ▶ Measuring device to device latency
  - ▶ Clock synchronization
  - ▶ Comparing over different network fabrics
- ▶ Deployed 6 Raspberry Pi devices with 5G connectivity in rural Iowa
- ▶ Latency measurements: GPS-based time synchronization for precise measurements (4000x more precise than NTP over 5G)
- ▶ Tested using Hadoop
- ▶ Hey presto: 5G networks can support distributed computing with performance comparable to wired connections!



*Zack Murry, University of Missouri*

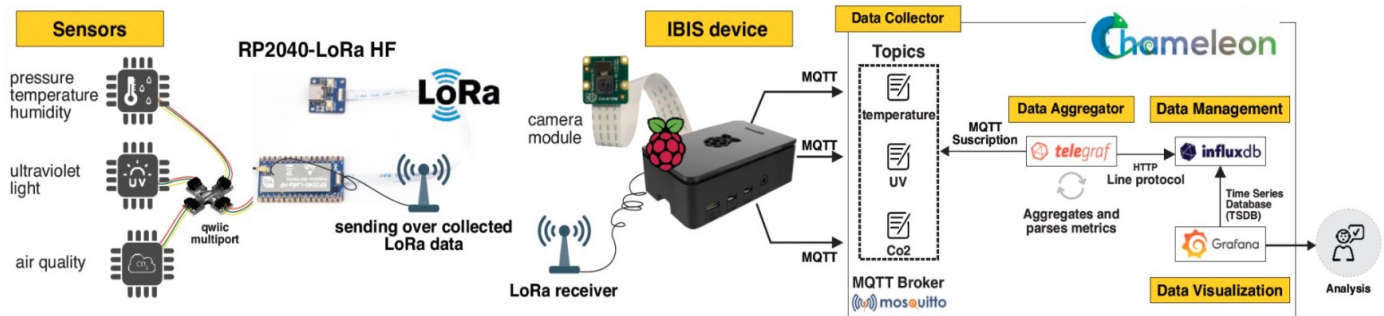
# SENSOR STATIONS FOR MARINE AND COASTAL ECOSYSTEMS

- ▶ Smart buoy system: sensor stations for oceanic data collection (water quality, water movement, water levels, etc.)
- ▶ Collaboration with FIU
- ▶ Integrated multiple environmental sensors with IBIS infrastructure
- ▶ Demo deployment with real and simulated data
- ▶ Implemented cloud-based data visualization system
- ▶ Collaboration with FIU



# NCAR WEATHER SENSING STATIONS

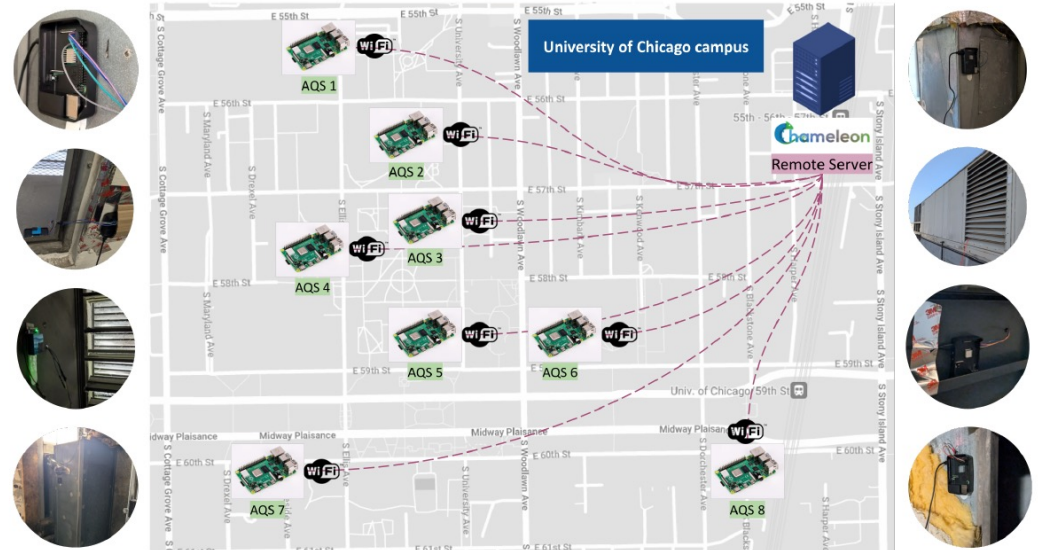
- ▶ openloTwx: NCAR 3D printed weather stations
- ▶ Richer continuum: IBIS SBCs connecting to openloTwx via LoRa
  - ▶ Exploring power (4x factor), connectivity (cellular vs aggregation via LoRa), sensing (additional camera sensors), and processing (to e.g., reduce size of data) trade-offs
- ▶ Future challenges
  - ▶ Image-based weather prediction methods, scaling up to create dense, high-resolution weather monitoring networks, and assessing long-term reliability in diverse outdoor environments



William Fowler, Tufts University

# AIR-QUALITY FORECASTING WITH FEDERATED LEARNING

- ▶ Compare simulation, emulation, and real-world deployments for Federated Learning
- ▶ Deployed 8 Raspberry Pis with air quality sensors on UChicago campus
- ▶ Simulating FL training on a single compute node can accurately reproduce model performance metrics (accuracy), but presents limitations for reproducing system metrics (training time, CPU usage, and communication latency)

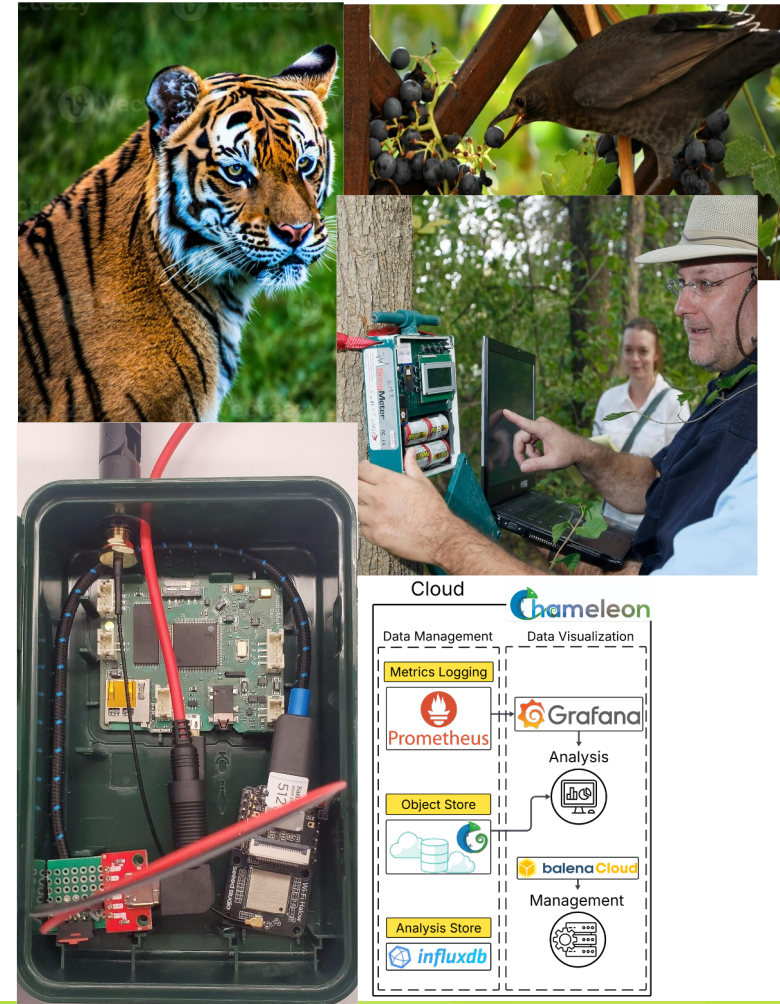


Paper: “On Reproducibility Challenges of Federated Learning: Investigating the Gap between Simulation, Emulation and Real-World Deployments”, **Cédric Prigent**, *Inria, France*



# SOUNDSCAPING

- Using acoustics for biodiversity conservation: tracking wildlife, protecting crops
- Scaling challenge
  - Expensive hardware (~\$1,000 per device)
  - Requires manual data collection and servicing
- How can we
  - Reliably stream and analyze audio in **real-time**
  - From **thousands of Listeners**, not dozens
  - While minimizing hardware and operating **costs** for years-long studies
  - In an environments integrating deployment, visualization, storage, and management
- Architecture: custom low cost/power Listeners and Aggregators combine needs-based sensing with network access with an integrated data analytics framework

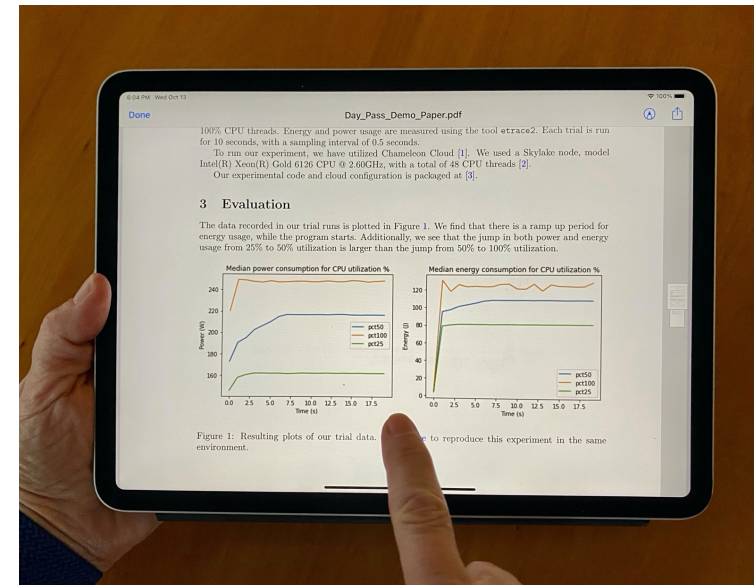




# BUILDING AND REPRODUCING EXPERIMENTS

*Practical reproducibility == feasible enough to be a mainstream method of scientific exploration*

- ▶ Can digital experiments be as sharable as papers are today?
- ▶ Is there a library I can go to and find experiments to play with?
- ▶ Can I simply integrate somebody's model into my research instead of reinventing the wheel and get to a new result faster?
- ▶ Can I discover something new through playing with somebody else's experiment?
- ▶ Can I develop exercises for my class based on most recent research results?



<https://repeto.cs.uchicago.edu>

# WHAT DO WE HAVE?

- ▶ **Open platforms** are essential for sharing
  - especially in computer science
  - ▶ Open, version-controlled hardware
  - ▶ Non-fungible resources
- ▶ **Experimental environment setup**
  - ▶ Disk images, orchestration templates, and other artifacts
  - ▶ Thousands of images, orchestration templates, digital artifacts of various kinds
- ▶ Are we there yet? If not, what is missing?



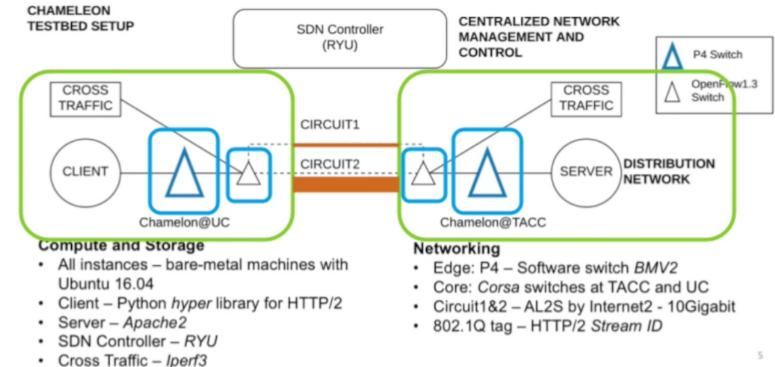
*A car without a road*

*Paper: “The Silver Lining”, IEEE Internet Computing 2020*

# PACKAGING EXPERIMENTAL ENVIRONMENTS

- ▶ **Wide versus narrow interfaces**
- ▶ **Support for declarative methods**
  - ▶ Heat, Terraform, and other mainstream orchestration tools
  - ▶ Hard to introspect and could be tricky for reproducibility
- ▶ **Support for imperative methods**
  - ▶ CLI, python-chi and/or scripts
  - ▶ Potentially via Jupyter integration
  - ▶ Can be re-played incrementally, troubleshooting and making changes as you go

**Package this!**

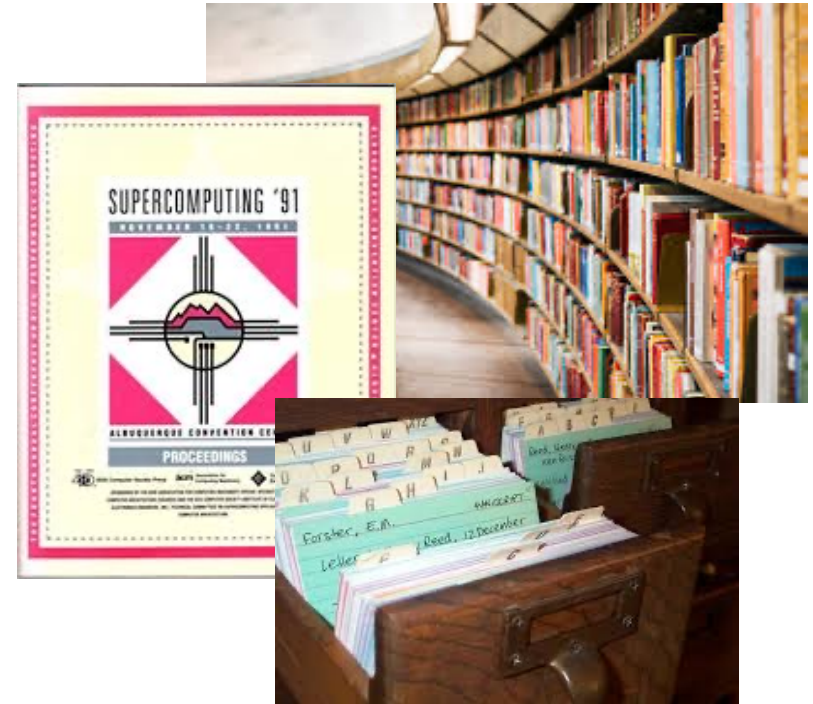


*Complex Experimental containers  
via programmable interfaces*

*Paper: “A Case for Integrating Experimental Containers with Notebooks”, CloudCom 2019*

# TROVI: SHARING, FINDING, AND REPRODUCING

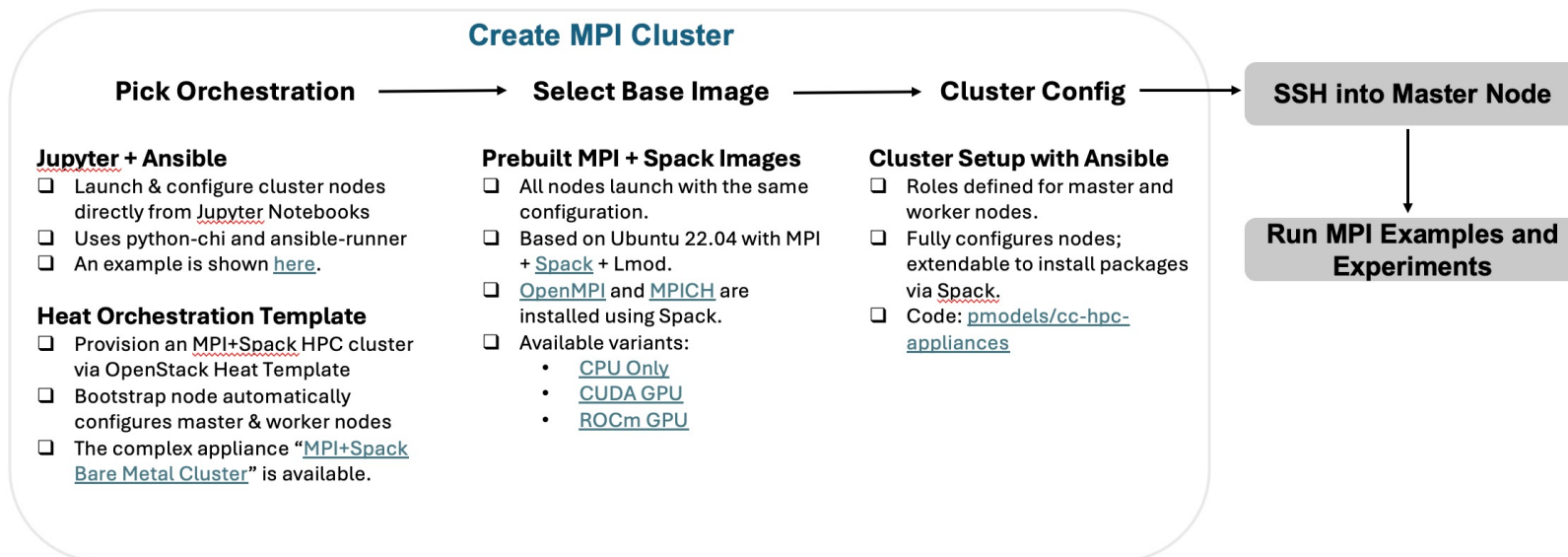
- ▶ A testbed-integrated open experiment sharing repository integrated with **multiple testbeds**
- ▶ Trovi artifacts
  - ▶ Collection of information about all the experiment
  - ▶ **Connected to the testbed** such that the experimental environment is easy to deploy
  - ▶ Artifacts provide **metrics** about usage – interesting to both authors and reviewers
- ▶ Portal to present, browse, filter, and find interesting experiments
- ▶ Open APIs: can be integrated with any testbed



*Paper: “Three Pillars of Reproducibility”, ReWords’23*

# MPICH CLUSTER

Easy to launch MPI clusters on Chameleon:  
standardized, flexible, and ready to run your HPC experiments.



Trovi Artifact: [MPI and Spack Based HPC Cluster Experiment](#)

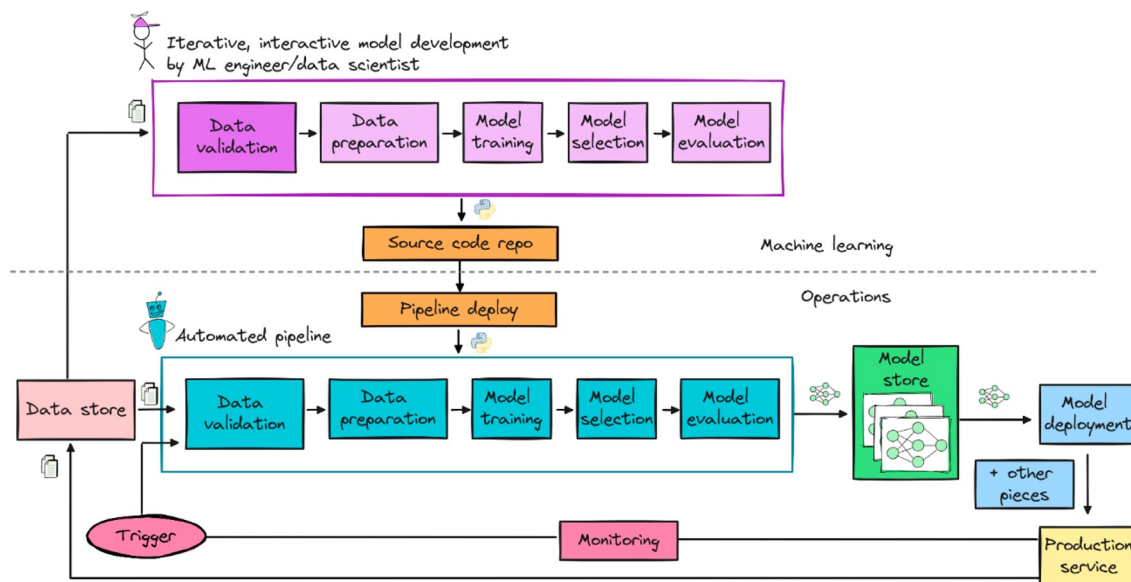


# TEACHING OPERATIONAL ML AT SCALE

NYU Spring 2025 • ~200 Students • Hosted on Chameleon Cloud

**Teaching operational ML is different than teaching ML**

Complete ML operational pipelines  
CI/CD for production ML systems  
Distributed training optimization  
Model serving  
Edge deployment  
Production monitoring at scale



# WHAT INFRASTRUCTURE DO WE NEED FOR THIS TYPE OF EDUCATION?

*Students reserved **VM** (m1.small to m1.xlarge), **bare metal** (GPUs P100, mi100, V100), **network** (floating IPs), and **edge resources** (Raspberry Pi 5) driving exceptional utilization across CHI (even when working in 3-4 person teams to optimize resource usage)*

186K VM Hours

---

18K Bare Metal Hours

---

11TB Total Storage

---

1500+ Leases Created

---

## Why Chameleon?

### Reconfigurable

- Kernel mods for K8s
- GPU latency benchmarks/testing

### Edge

### Computing

- Real edge ML serving

### Reservations

- Creating VM clusters for storage/training
- Trovi lesson modules

Scan to find the  
coursework on  
Trovi!



[www.chameleoncloud.org](http://www.chameleoncloud.org)

Paper: “The Cost of Teaching Operational ML”, EduHPC/SC25

# COMMUNITY WORKSHOP ON REPRODUCIBILITY FOR HIGH PERFORMANCE COMPUTING (HPC)

Attended by **reproducibility practitioners**  
Experiment **packaging checklists** (GitHub)  
Recommendations for authors and reviewers  
Community recommendations: new tools and capabilities that the community needs  
AE organization

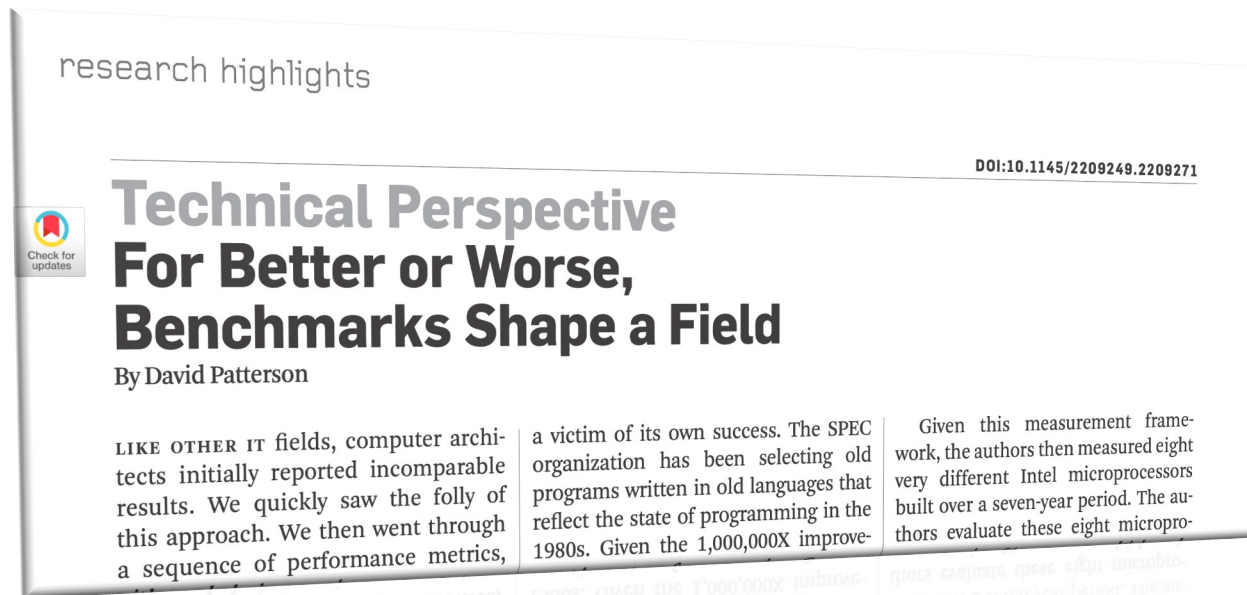


Download the Report



<https://reproduciblehpc.org>

# FOR BETTER OR WORSE, SCIENTIFIC INSTRUMENTS SHAPE A FIELD



We're all snow plough drivers now!



*We're here to change*

[www.chameleoncloud.org](http://www.chameleoncloud.org)



[www.chameleoncloud.org](http://www.chameleoncloud.org)