

# Enabling Emerging Scientific Workflows with Converged Cloud and HPC Environments

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# HPC and cloud computing are merging into a seamless, environment that can benefit scientific workflows.



Scheduling and resource management are key components to ensuring the environment is efficient and high-performance.



We are teaming up with experts at major cloud providers to make the environment a force multiplier for scientific workflows and the broader computing community.

# Pre-exascale scientific workflows strain the capabilities of traditional HPC resource managers and schedulers.

Co-scheduling:

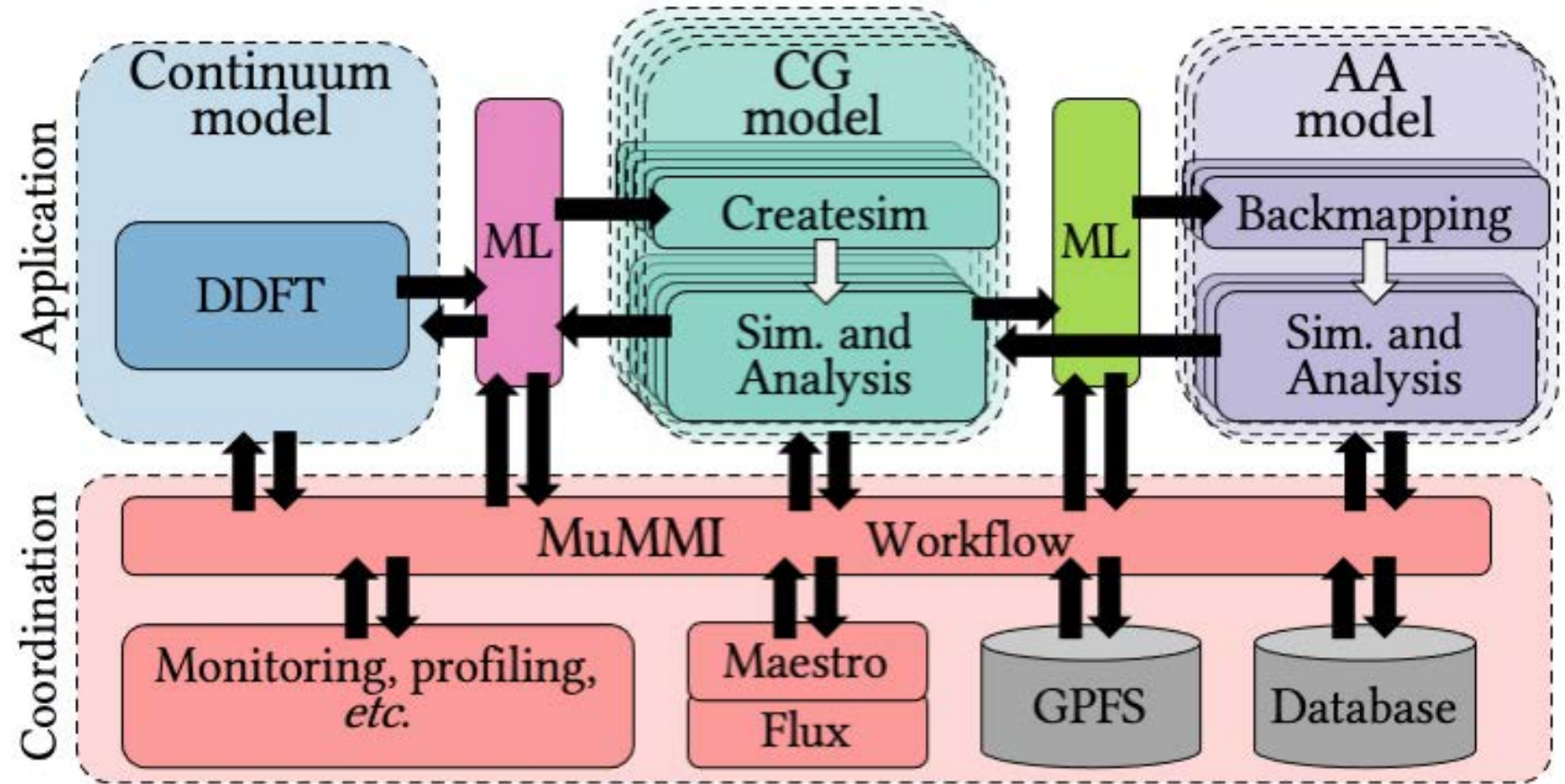
CG, analysis bound to cores nearest PCIe buses

Job comms/coordination:

36,000 concurrent tasks;  
176,000 cores, 16,000 GPUs

Portability:

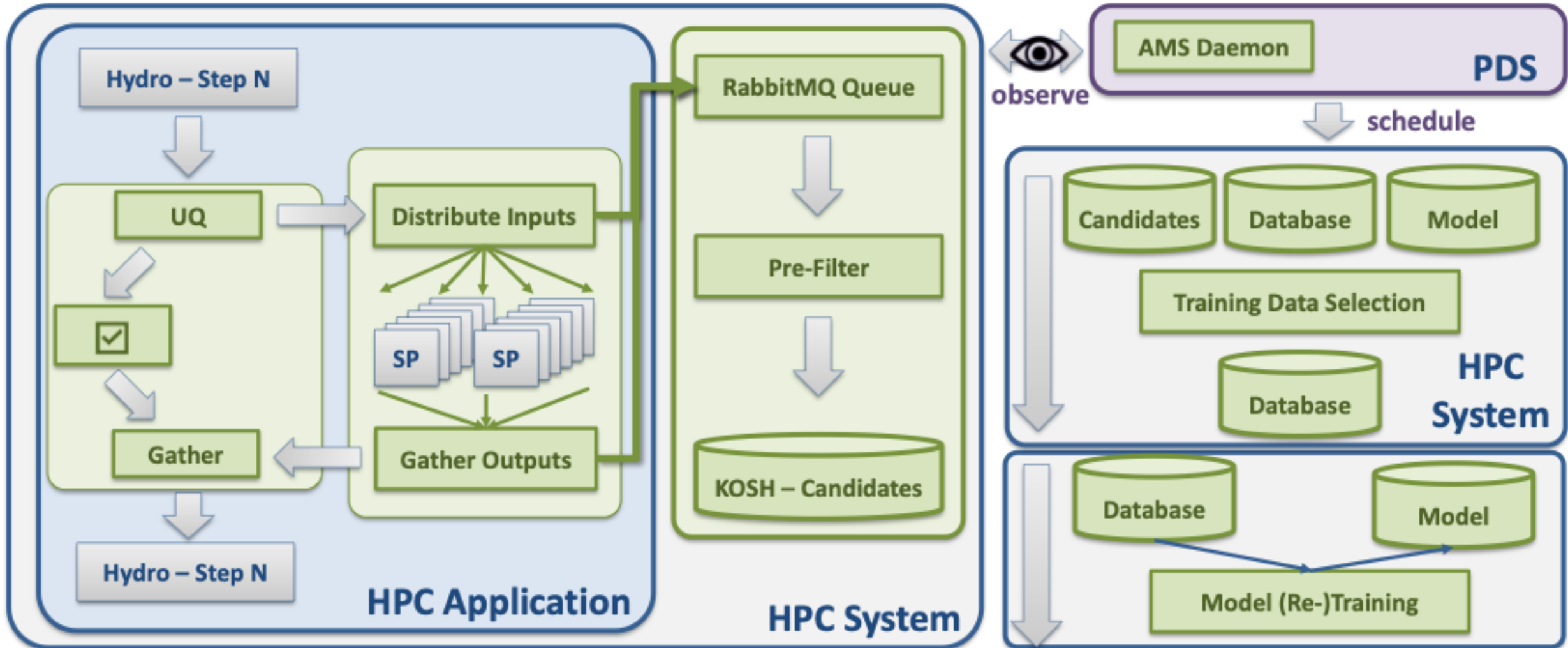
adapt tasks to different  
schedulers/managers



MuMMI: SC'19 best paper, SC'21 paper

## MPI-based simulation with in-situ analysis plus AI/ML

# Autonomous MultiScale (AMS) integrates ensemble techniques, ML surrogate models, services, and databases.



# State-of-the-art, composite workflows run across clusters and integrate the cloud

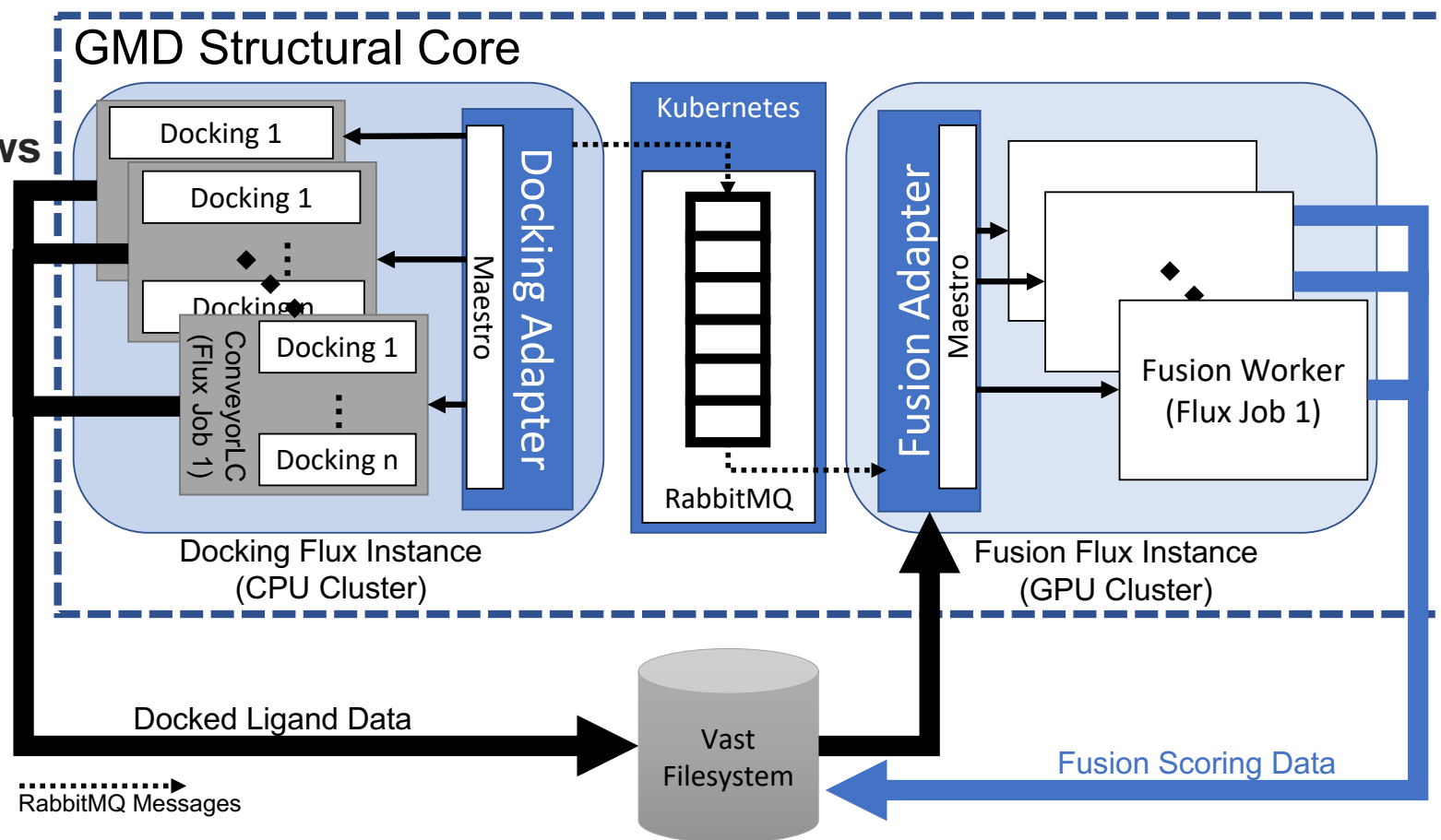
Single-cluster, composite scientific workflows like MuMMI challenge current computing environments

Multi-cluster, cloud enabled workflows emerging at LLNL and beyond

- Coupled MPI-based tasks and deep-learning models (**AHA MoleS**)
- HPC simulation with AI/ML surrogates (**AMS**)

2020 RADIUSS survey found 73% of LLNL workflows interested in cloud, <10% use it

Challenges: resource management, scheduling converged environment



# The what and why of movement to the cloud; it's eating everyone's lunch.

**The cloud is an environment (public, private, both) supporting:**

- Portability, reproducibility
- Resiliency, efficiency, elasticity
- Reduced complexity via automation

**Companies rent this environment; hugely profitable**

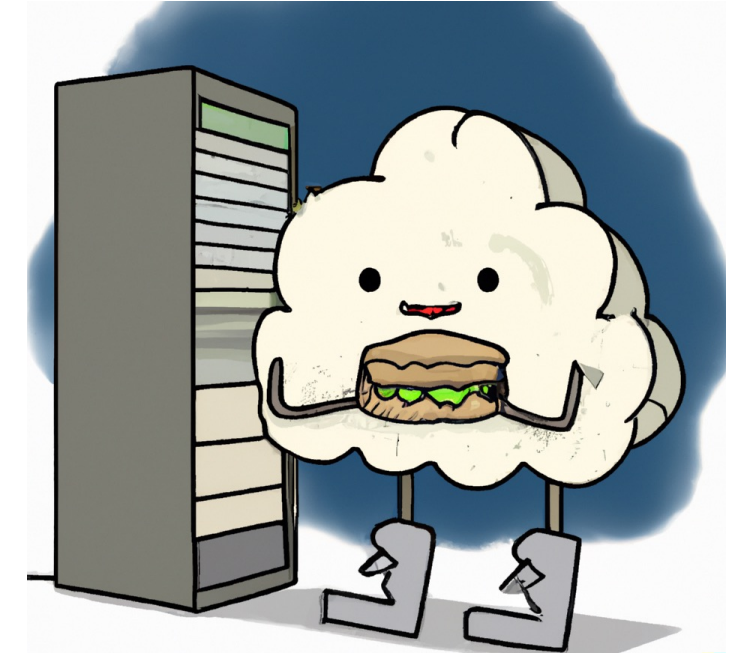
- projected >\$1.1T by 2027, 20% CAGR (22-27)<sup>1</sup>
  - exceed traditional computing in 2025
- vs HPC: \$40B by 2026, 21-26 CAGR 6%<sup>2</sup>

**Thompson, Spanuth, 2021<sup>3</sup>:**  
Computing areas become more distinct, provide fewer benefits to others. **Areas that get left behind:**

- **See little performance benefit**
- **Market too small to justify NRE costs**
- **Cannot coordinate demand**

**Reed, Gannon, Dongarra, 2023<sup>4</sup>**

- **Few HPC vendors build large systems**
- **HPC endothermic, cloud is exothermic**
- **\$500M system/5 yrs little incentive for hyperscalers**



<sup>1</sup>Gartner 2023, <sup>2</sup>Hyperion 2023, <sup>3</sup>*The Decline of Computers as a General Purpose Technology*, CACM March 2021 <sup>4</sup>HPC Forecast: Cloudy and Uncertain, CACM February 2023

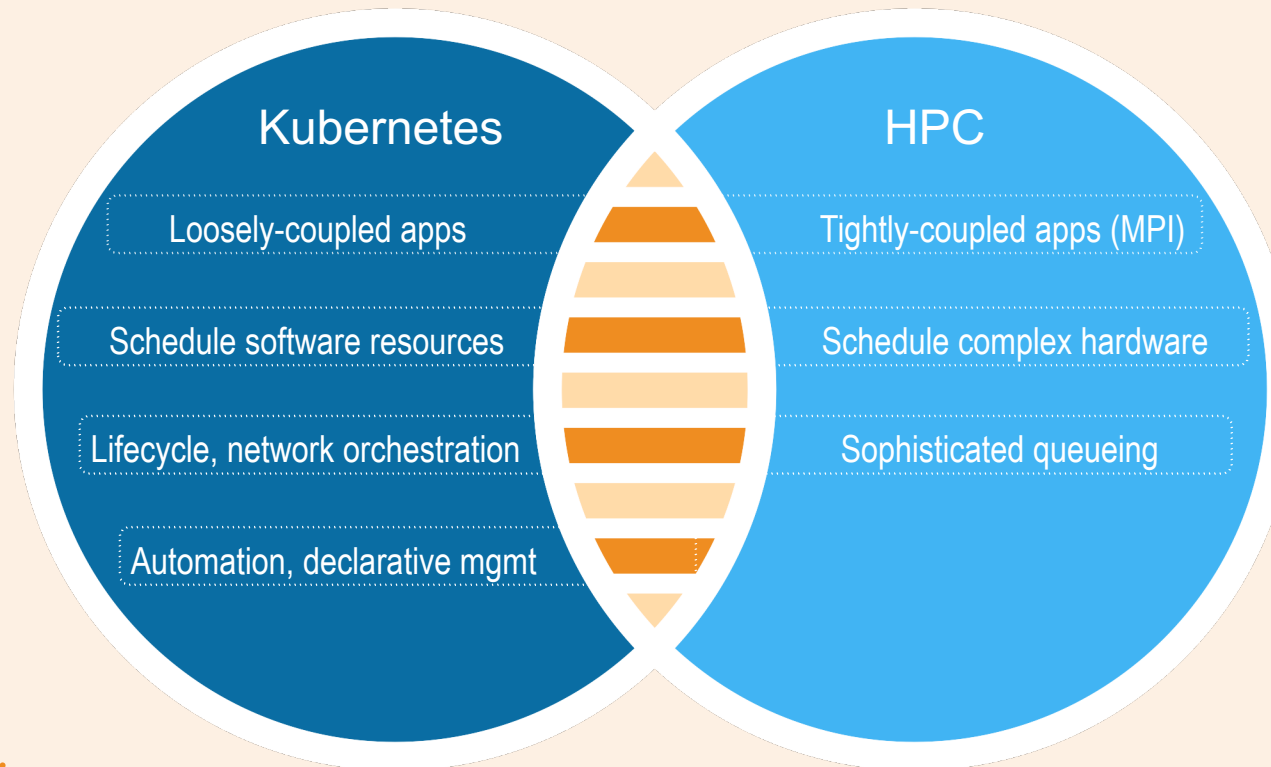
# A key to best-of-both-worlds converged computing is combining HPC with Kubernetes.

## Kubernetes (K8s):

- cloud “OS” with 77K contributors (second largest OSS project ever)
- designed for loosely coupled apps
- not focused on performance (scheduling limitations, throughput...)

## Converged Computing project:

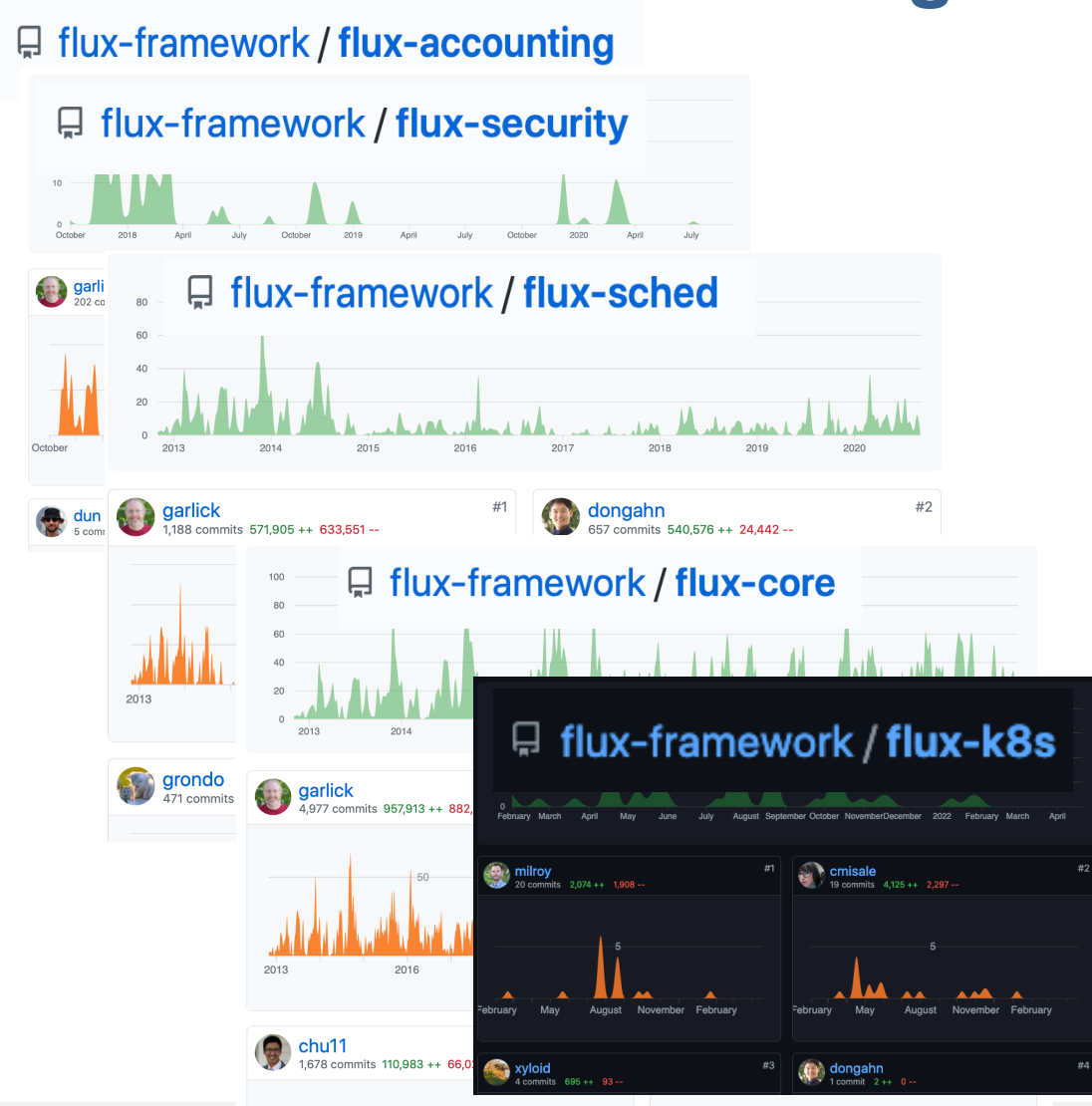
how to create a converged environment composed of the best of both worlds?



## HPC:

- performance is in the name
- very difficult to manage modern workflows
- not designed for dynamism/elasticity

# Flux addresses key technical problems that emerge from exascale and converged computing.

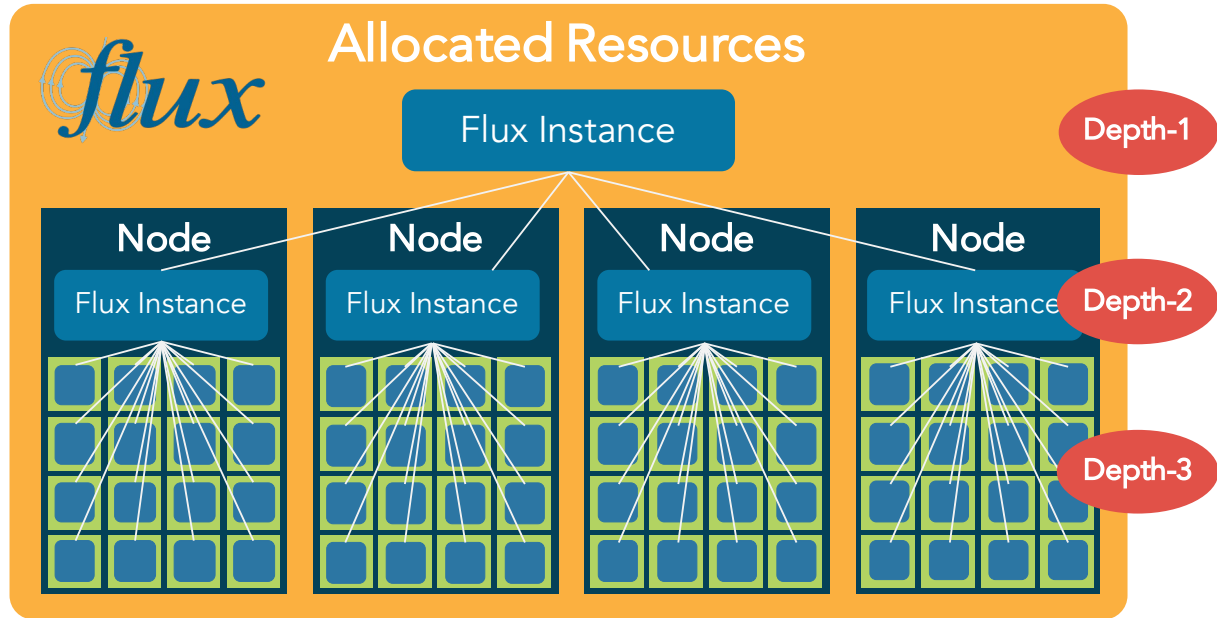


- Open-source project in active development at flux-framework GitHub organization
  - Multiple projects: flux-core, -sched, -security, -accounting, -k8s, -operator etc.
  - Over 15 contributors, including some principal engineers behind Slurm
- Single-user and System instance modes
  - Single-user mode in production for about 5 years
  - System instance on several LLNL Linux clusters
- Deploying on LLNL El Capitan exascale system





# Flux hierarchical management and graph-based scheduling address converged computing challenges.



## Modular, hierarchical design

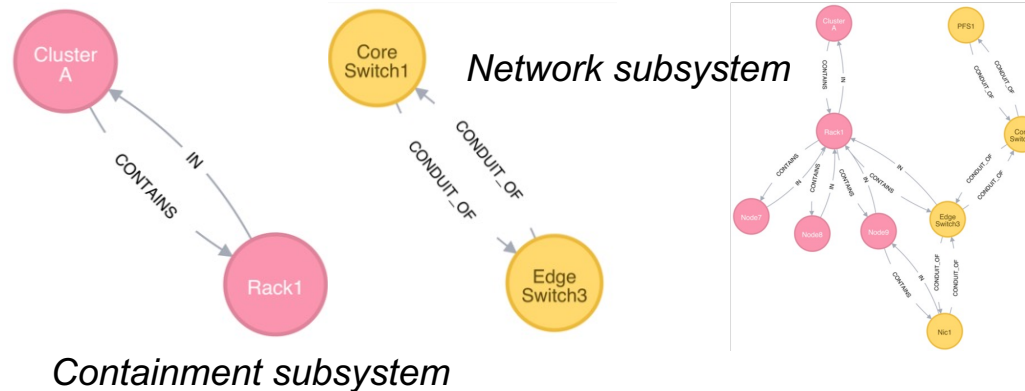
- Hierarchical resource management and scheduling (separate modules)
- Sub-manager with specialized scheduler
- Schedules cloud resources

## Manages resources nearly anywhere

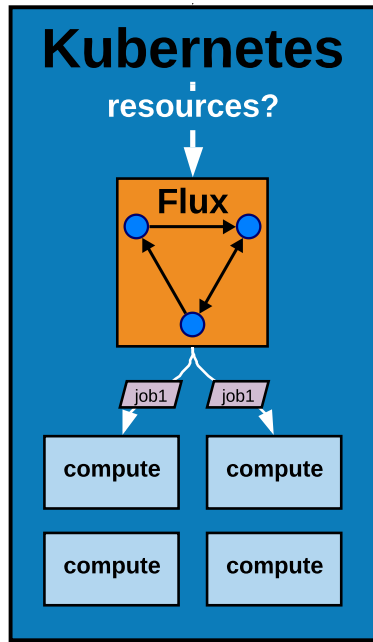
- Bare metal resources, virtual machines in the cloud, HPC resources in another workload manager, pods in Kubernetes
- Workflows only need to program to Flux
- Directed graph resource model expresses complex, dynamic resources

## Rich, well-defined interfaces

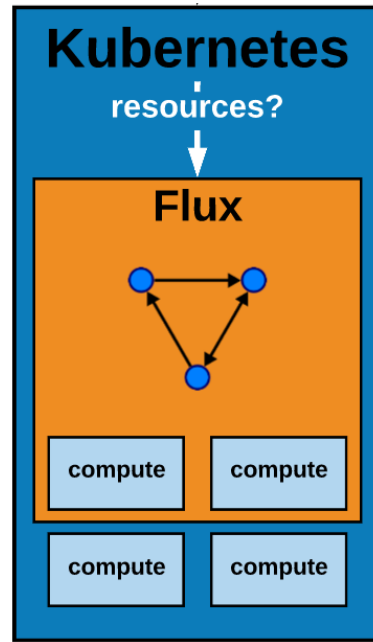
- Facilitate communications and coordination among tasks within a workflow
- CLI, Python, C, C++, Rust, Go, etc.



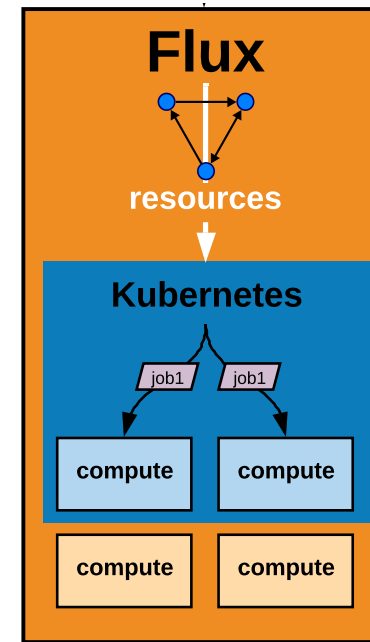
# The converged computing project advances convergence with representative, Flux-based models.



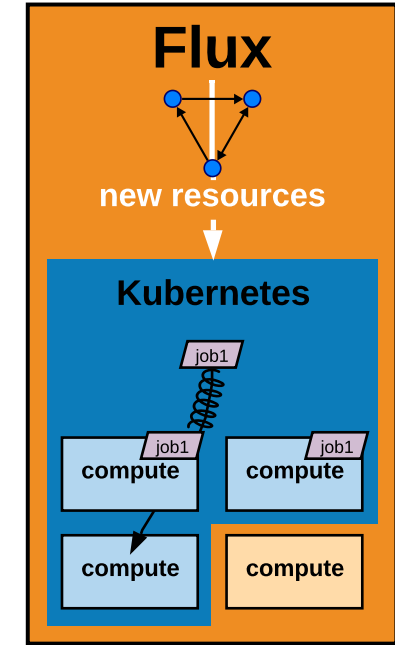
**L1: Flux project** enables portable converged workflows



**L2: Flux Operator.** Enables portable converged workflows



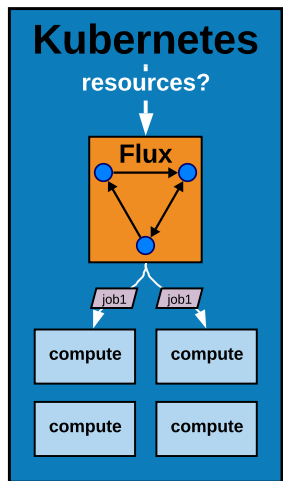
**L3: Flux + Usernetes** reduces software complexity, increases automation, performance



**L4: Elastic cloud nesting model** enables autoscaling and dynamism

**Portability is a component of performance and means of cost control**

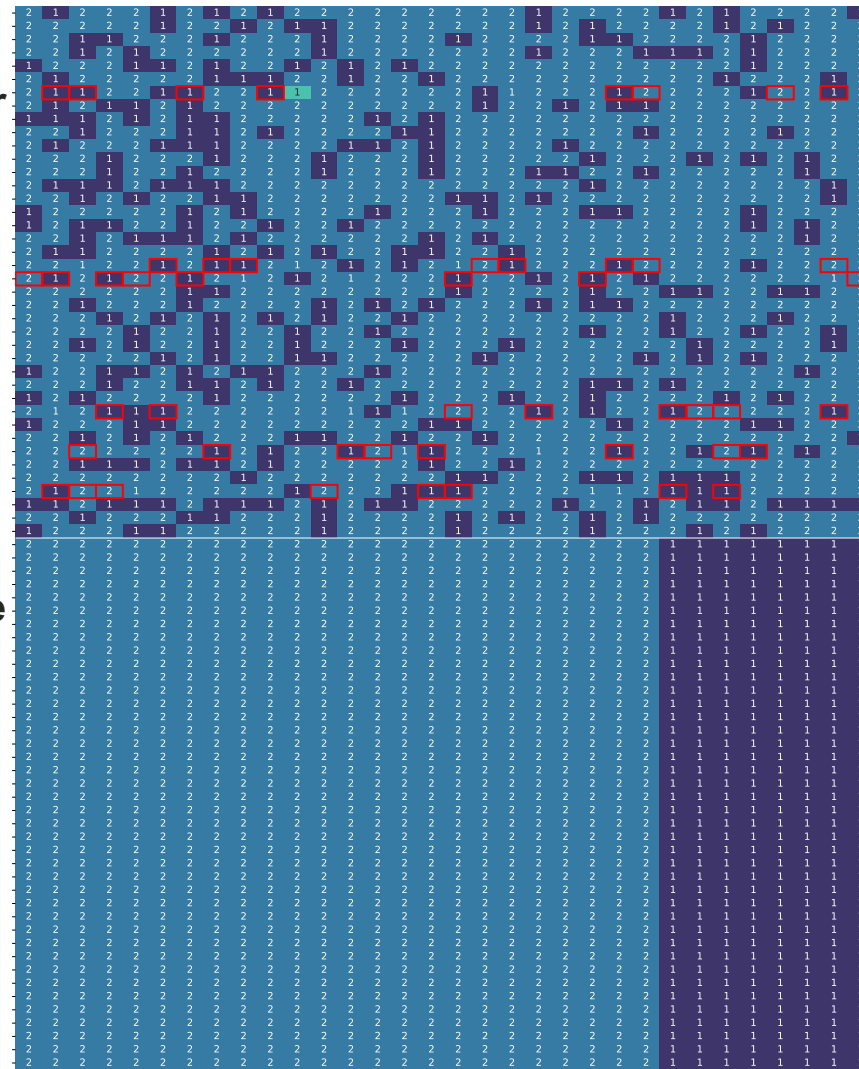
# The scheduler is a big contributor to converged workload performance variability.



## Fluence

- Plug Fluxion into K8s Scheduling Framework
- Enable cloud-native MPI to scale **three orders of magnitude** higher
- Compare CORAL-2 benchmarks scheduled by Fluence, kube-scheduler: **up to 3x** shorter workflow runtimes, much less variability, deterministic placement<sup>1</sup>

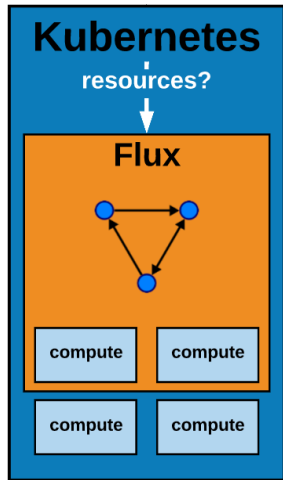
kube-scheduler



<https://github.com/flux-framework/flux-k8s>

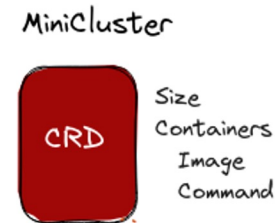
<sup>1</sup>One Step Closer to Converged Computing: Achieving Scalability with Cloud-Native HPC, 2022

# We are improving converged workflow portability and efficiency.

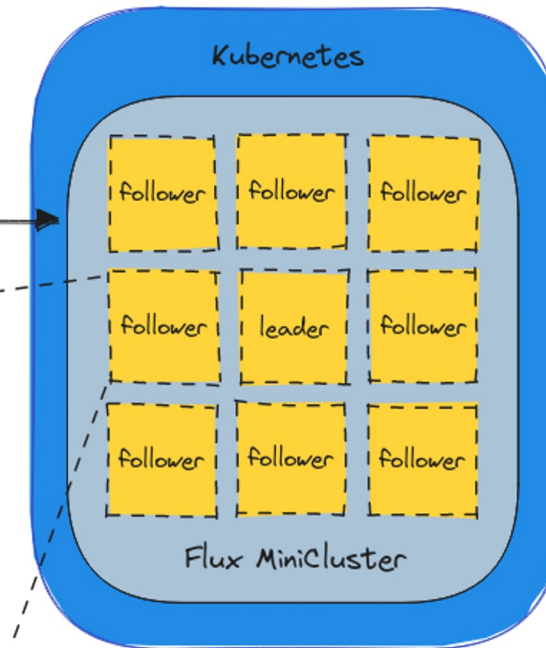
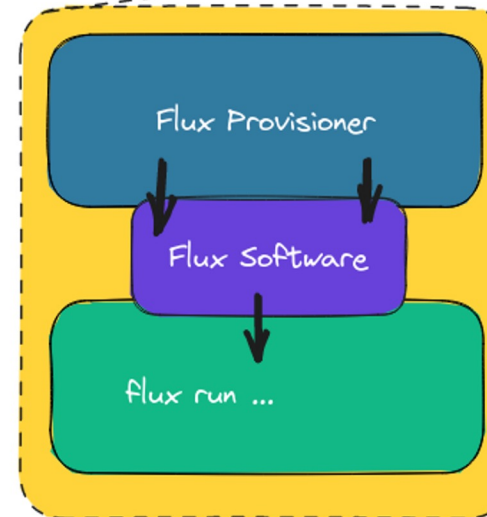


## Flux Operator<sup>1</sup>

- Bootstrap Flux in K8s; hierarchically manage, schedule pods
- Ported 15 proxy apps; **MuMMI in progress**
- Addresses major limitations of K8s: throughput, multiple users, fairness, allocation usage
- Scalable MPI bootstrap
- Autoscaling in progress
- RESTful interface in progress



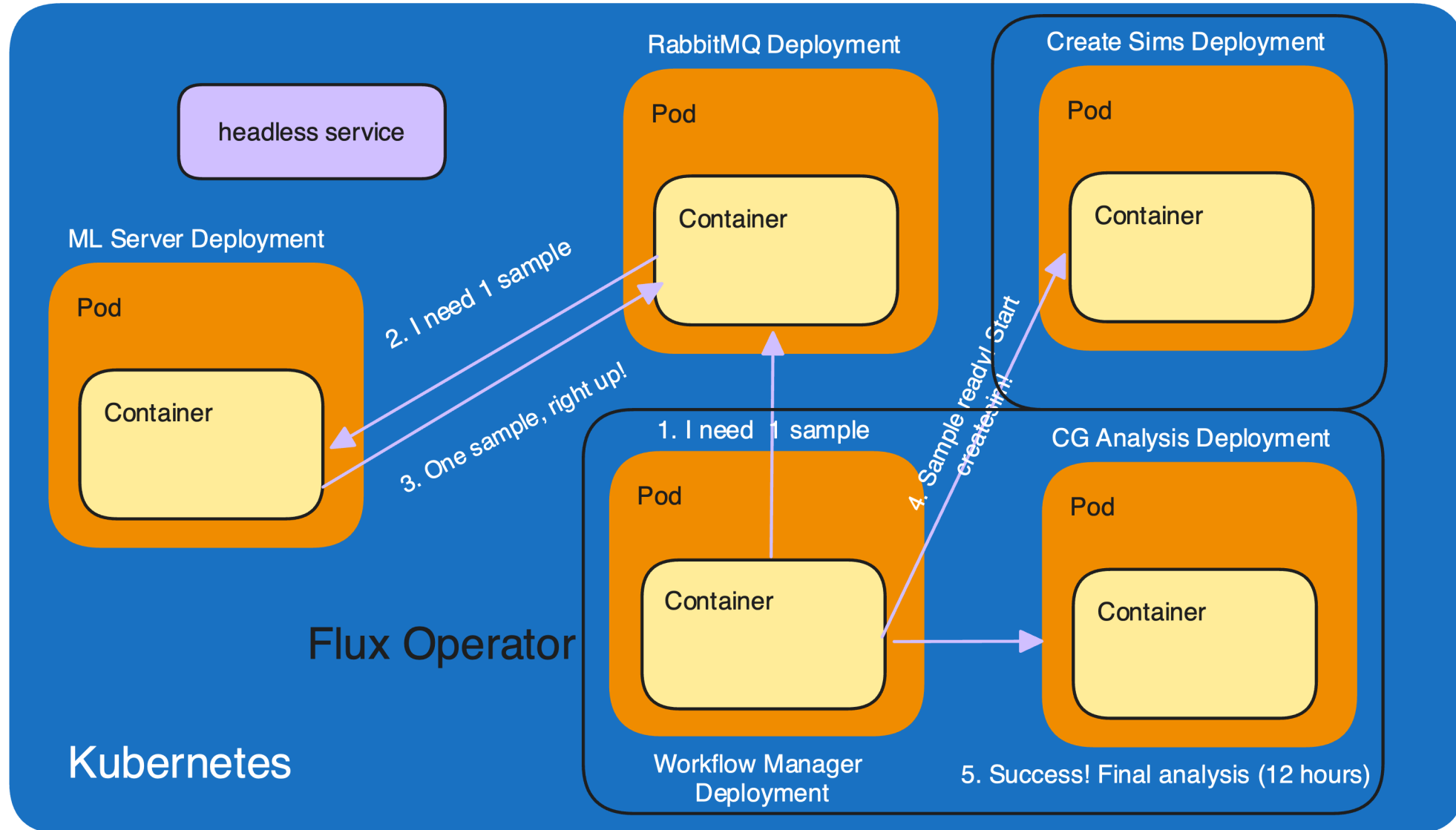
Create MiniCluster



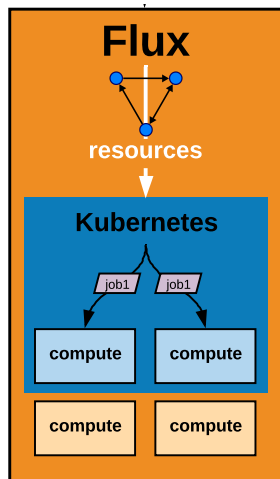
<https://flux-framework.org/flux-operator/>

<sup>1</sup>The Flux Operator, F1000Research, in press 2024

# We are porting updated MuMMI to Kubernetes.



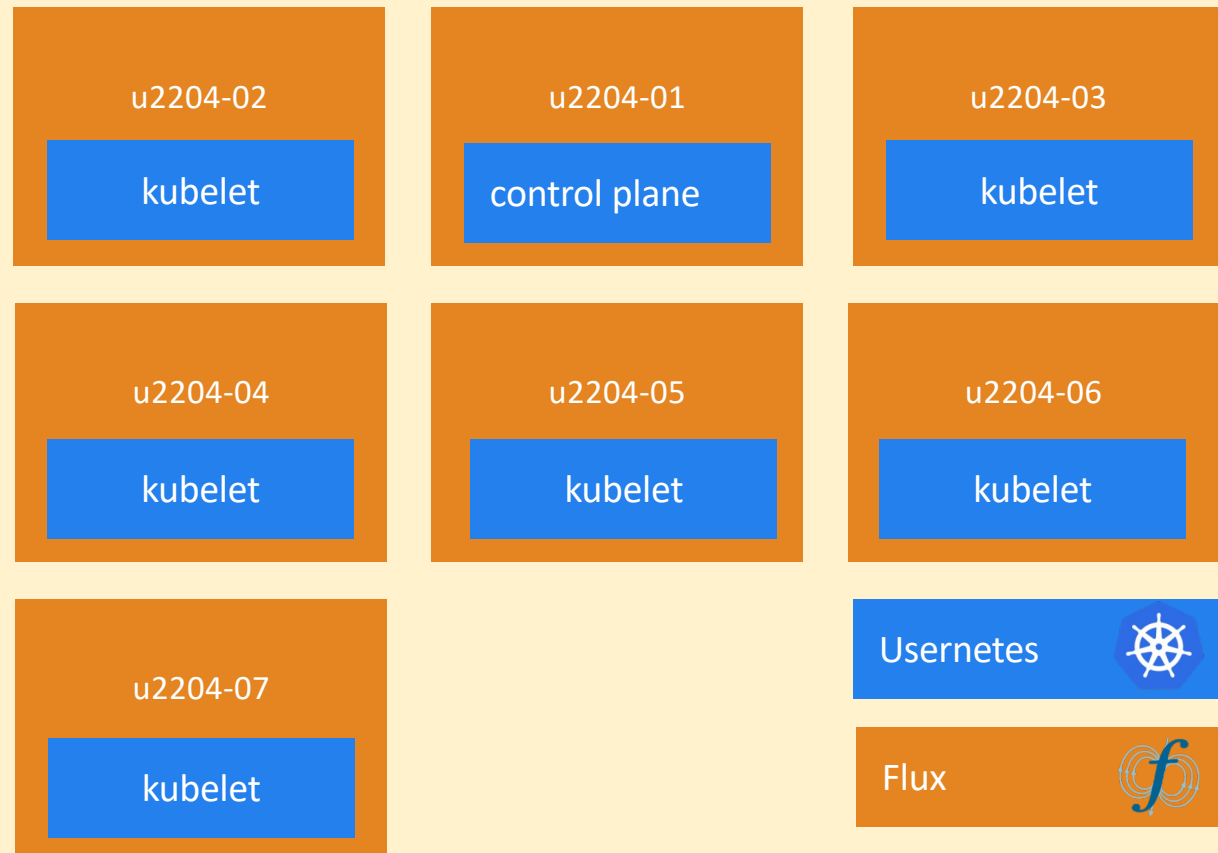
# Testing Flux + Usernetes enables cloud on HPC and further enhances portability.



## Flux + Usernetes

- Bootstrap K8s in Flux
- K8s is restricted to user scope
- Accounts for usage/fairshare
- Solves resource conflict for multiple managers/schedulers
- No measured performance impact (e.g., noisy neighbor)
- Networking bottleneck: order of magnitude lower bandwidth
- Tested simulation + ML model

## Star Trek Cluster (taking HPC where no one's gone before?)



Adapted from V. Sochat, Kubernetes and HPC: Bare-metal bros, FOSDEM '24:  
<https://fosdem.org/2024/schedule/event/fosdem-2024-2590-kubernetes-and-hpc-bare-metal-bros/>  
<https://github.com/converged-computing/flux-usernetes>

# We are collaborating with industry to tackle converged computing, contribute to community, and advocate for HPC.



IBM T.J. Watson Research Center:

- Expertise in K8s Scheduling



Red Hat:

- Developers of OpenShift K8s platform



AWS:

- Largest cloud platform, deep HPC expertise



Starting collaboration with Google!



Starting collaboration with Microsoft!

# Meet the converged computing team!

- Daniel Milroy | scheduling, cloud systems
- Giorgis Georgakoudis | HPC runtimes, network-aware scheduling
- Aniruddha Marathe | instance scheduling, application performance
- Zeke Morton | software development
- Tapasya Patki | graph-based scheduling
- Abhik Sarkar | co-management challenges, performance profiling
- Vanessa Sochat | containers (a creator of Singularity), runtimes, cloud systems, software
- Jae-Seung Yeom | scheduling cloud resources

## Doctoral student:

- Md Rajib Hossen | Flux-Kubernetes co-management performance



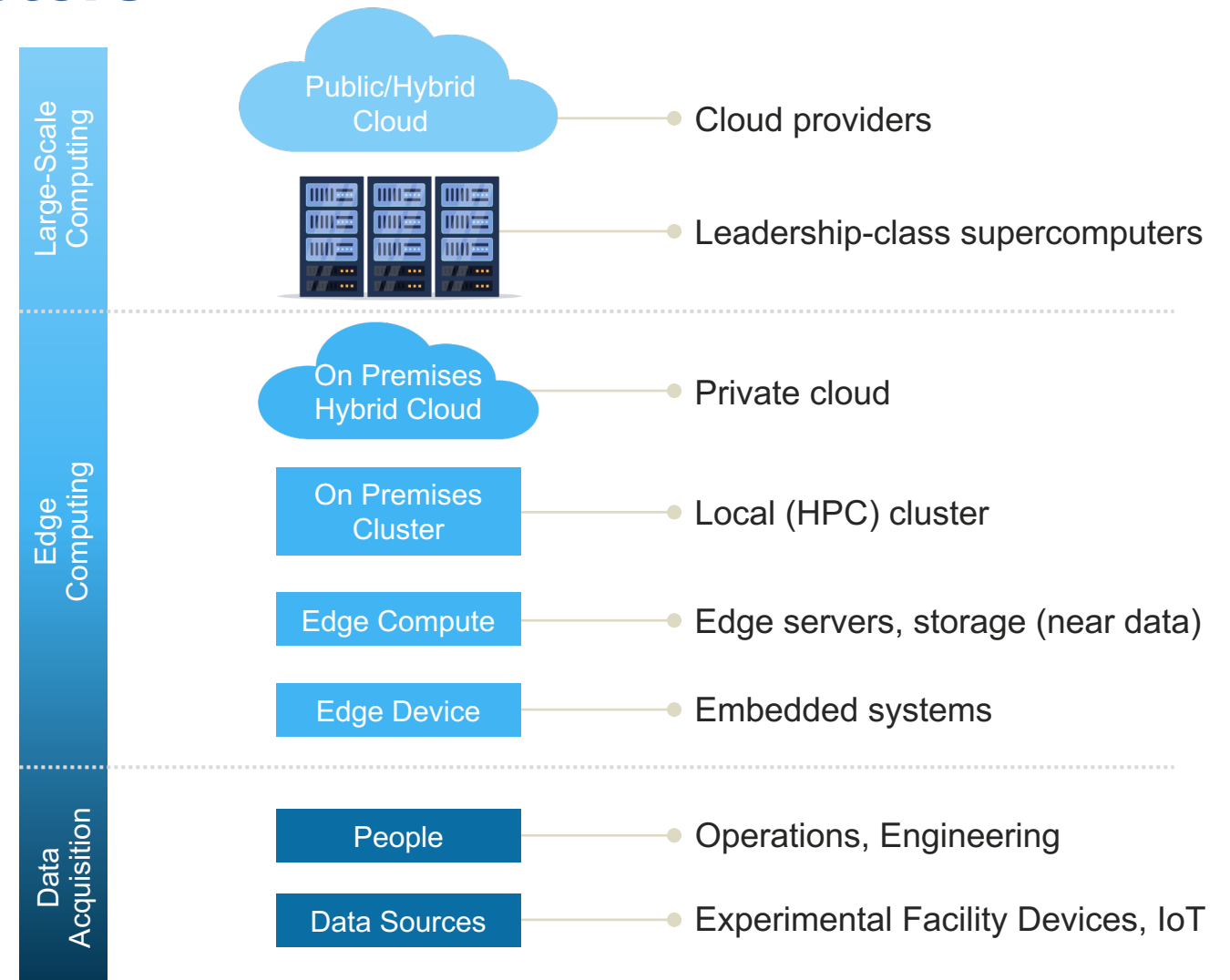
# Next-generation workflows will run on a continuum from sensors to converged clusters.

Full computing continuum already used by industry, e.g., autonomous vehicle control and fleet management

Scientific workflows on the continuum: from sensors on a source beamline to converged compute clusters in another region

Major challenges:

- Resilience of distributed system
- Resource dynamism and elasticity
- Distributed resource management and scheduling



Thank you!  
Questions?