

# NERSC Director's Perspective



Sudip Dosanjh

Director, NERSC

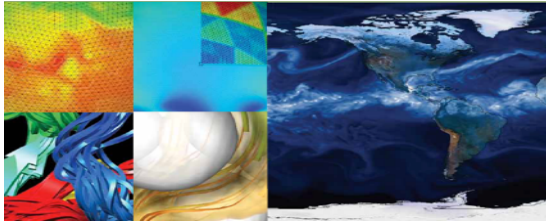
# NERSC: the Mission HPC Facility for DOE Office of Science Research



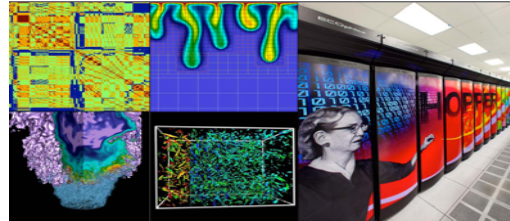
U.S. DEPARTMENT OF  
**ENERGY**

Office of  
Science

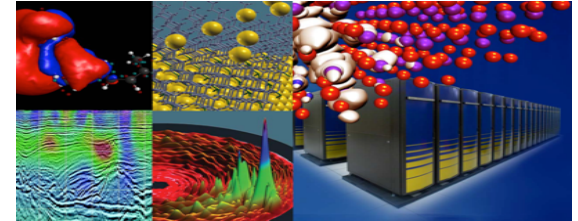
Largest funder of physical  
sciences research in the U.S.



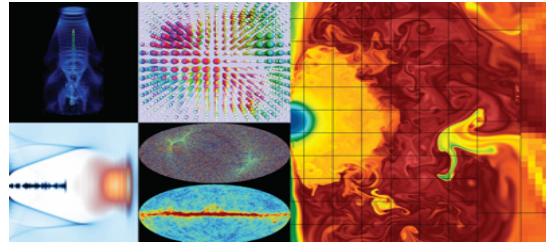
Bio Energy, Environment



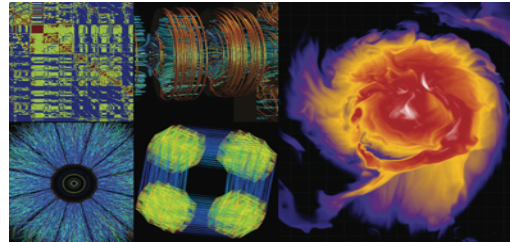
Computing



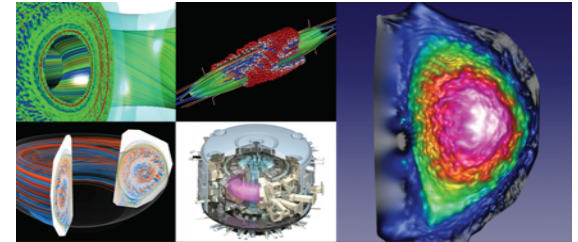
Materials, Chemistry, Geophysics



Particle Physics, Astrophysics



Nuclear Physics



Fusion Energy, Plasma Physics



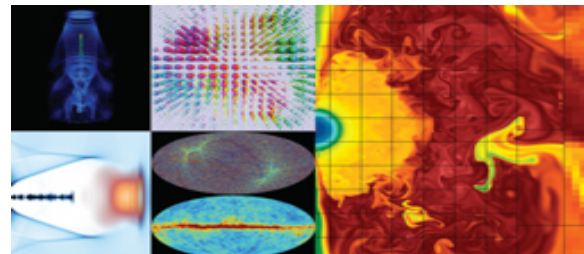
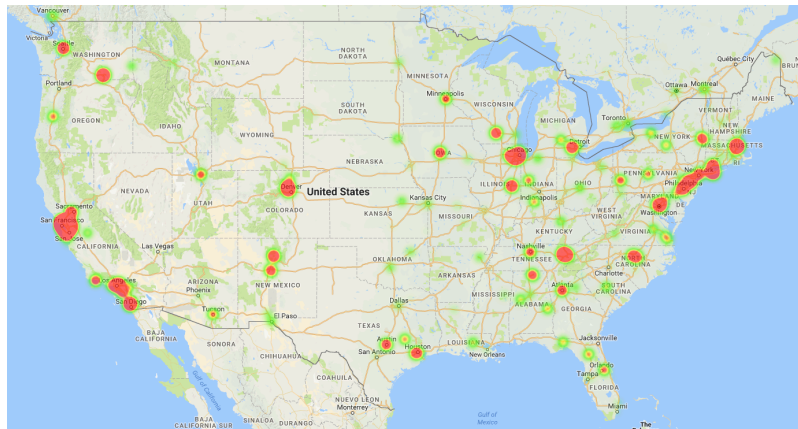
U.S. DEPARTMENT OF  
**ENERGY**

Office of  
Science



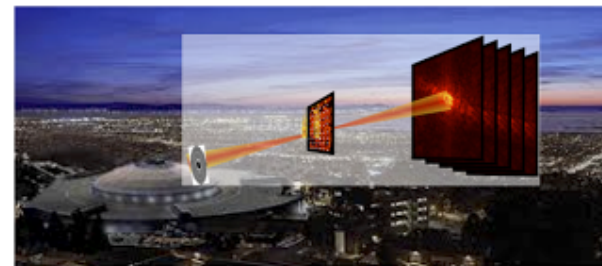


# NERSC supports a broad user base

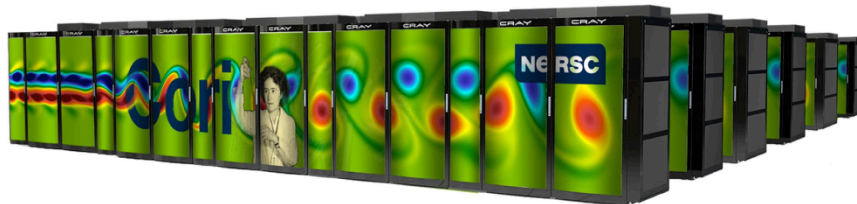


Simulations at scale

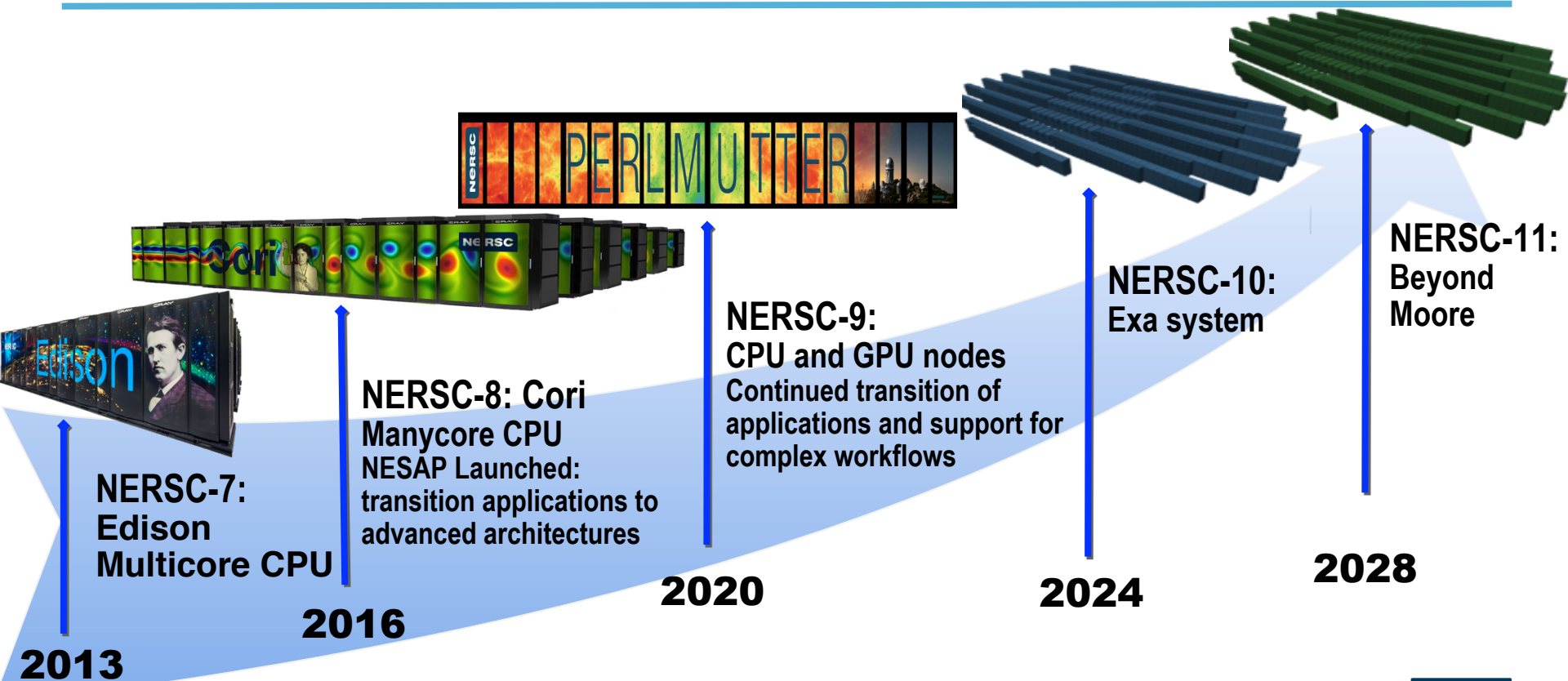
7,000 Users  
800 Projects  
700 Codes  
~2000 publications per year



Data analysis support for  
DOE's experimental and  
observational facilities  
Photo Credit: CAMERA



# NERSC Systems Roadmap



U.S. DEPARTMENT OF  
**ENERGY**

Office of  
Science



BERKELEY LAB  
Lawrence Berkeley National Laboratory



# What's changing?

---

- **Applications need to adapt to new systems**
- **Increasing engagement from Experimental and Observational Facilities**
- **More emphasis on data analysis, AI and Deep Learning**

# NERSC-9: A System Optimized for Science



- Cray Shasta System providing 3-4x capability of Cori system
- First NERSC system designed to meet needs of both large scale simulation and data analysis from experimental facilities
  - Includes both NVIDIA GPU-accelerated and AMD CPU-only nodes
  - Cray Slingshot high-performance network will support Terabit rate connections to system
  - Optimized data software stack enabling analytics and ML at scale
  - All-Flash filesystem for I/O acceleration
- Robust readiness program for simulation, data and learning applications and complex workflows
- Delivery in late 2020

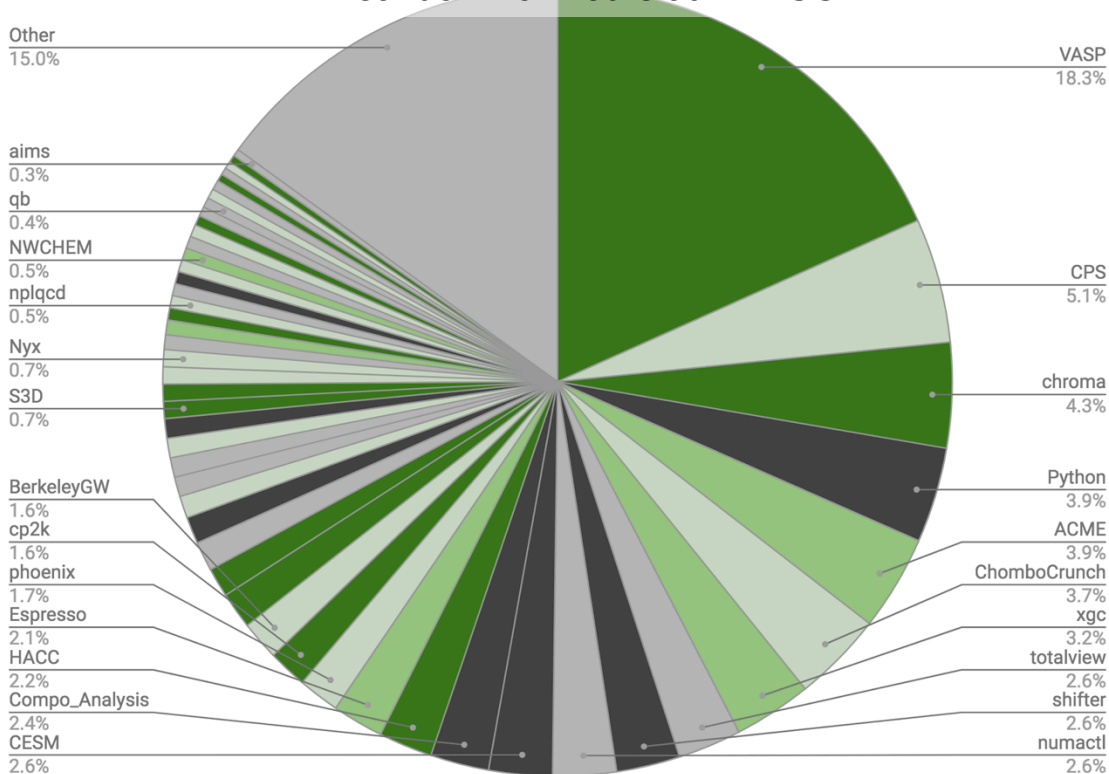




# GPU Readiness Among NERSC Codes



Breakdown of Hours at NERSC



GPU Status & Description	Fraction
<b>Enabled:</b> Most features are ported and performant	32%
<b>Kernels:</b> Ports of some kernels have been documented.	10%
<b>Proxy:</b> Kernels in related codes have been ported	19%
<b>Unlikely:</b> A GPU port would require major effort.	14%
<b>Unknown:</b> GPU readiness cannot be assessed at this time.	25%

**A number of applications in NERSC workload are GPU enabled already.**

**We will leverage existing GPU codes from CAAR + Community**

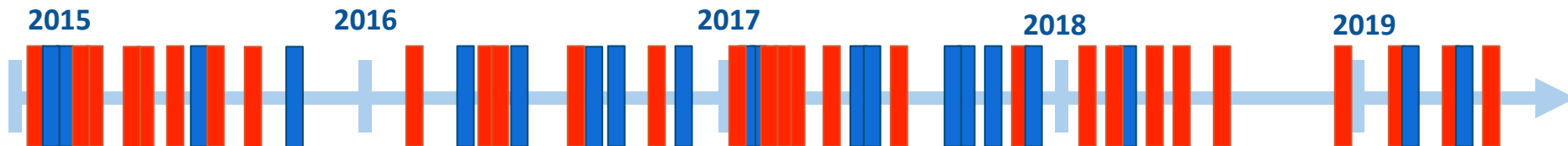


# Hack-A-Thons and App Perf. Training

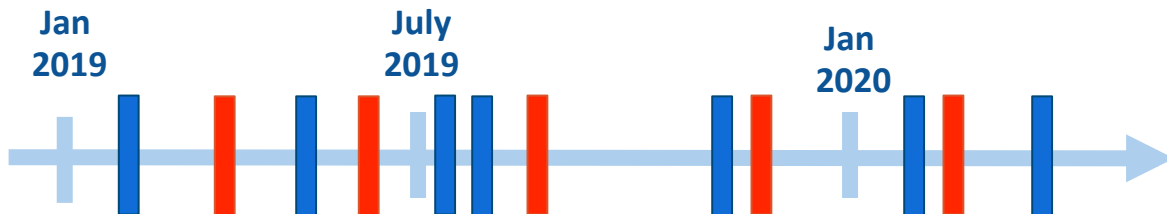


Community Training  
Hack-a-Thon

## KNL Targeted Events



## GPU Targeted Events





# NESAP for Perlmutter



**Simulation**  
**12 Apps**

**Data Analysis**  
**8 Apps**

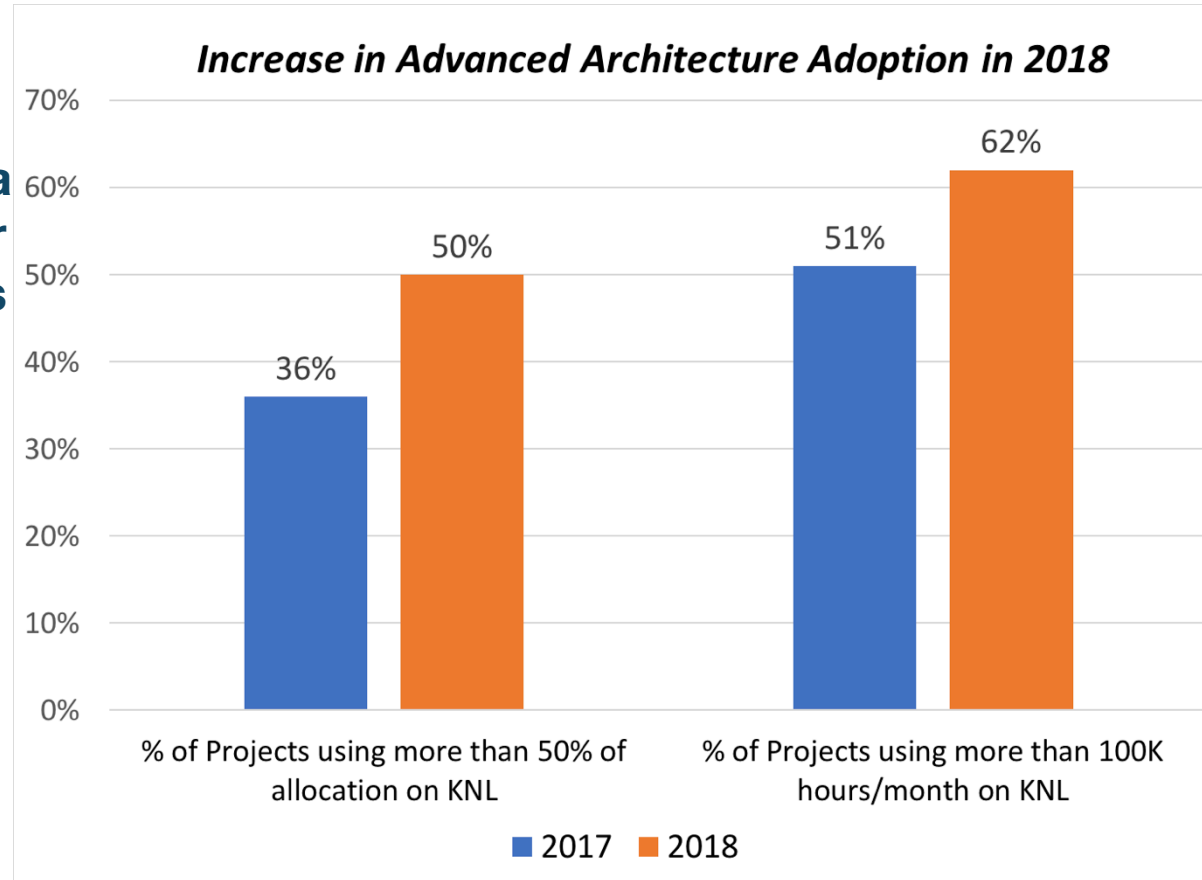
**Learning**  
**5 Apps**

- 5 ECP Apps Jointly Selected (Participation Funded by ECP)
- 20 additional teams selected through Open call for proposals.
  - <https://www.nersc.gov/users/application-performance/nesap/nesap-projects/>
- Access to Cori GPU rack for application readiness efforts.

# Transition of the entire NERSC workload to advanced architectures

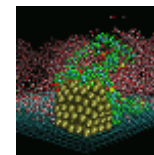
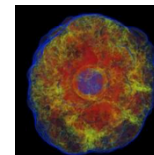
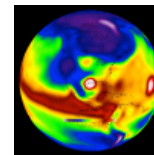
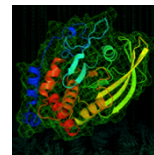
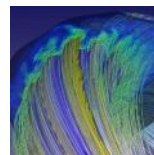
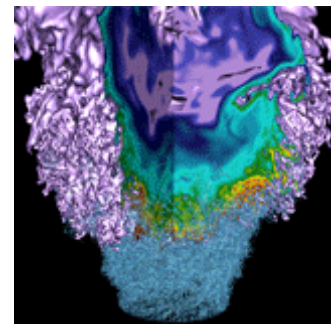


To effectively use Cori KNL, users must exploit parallelism, manage data locality and utilize longer vector units. All features that will be present on exascale era systems





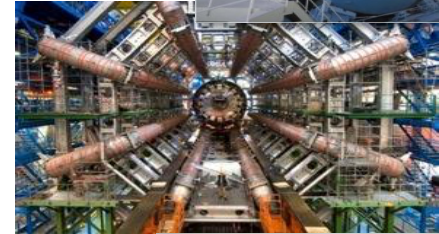
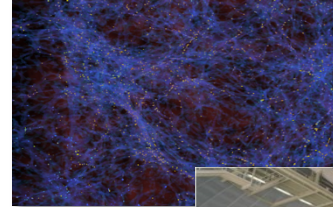
# Engagement with Experiments



# What's different?



- **Proliferation of data from DOE user facilities**
- **Scientific workflows have become more complex**
  - Streaming data to HPC facilities
  - Real-time/Interactive access
  - Rich 'Data' stack
- **Important scientific problems are requiring both simulation and data analytics**
  - Advanced Machine Learning and Statistics methods + tools required

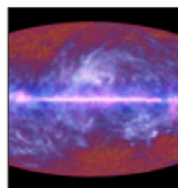




# NERSC supports a large number of users and projects from DOE SC's experimental and observational facilities



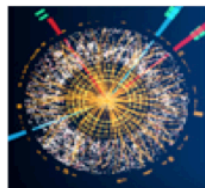
Palomar Transient Factory Supernova



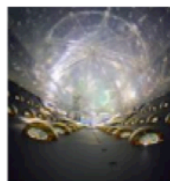
Planck Satellite Cosmic Microwave Background Radiation



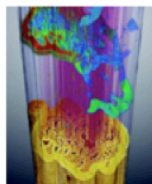
Star Particle Physics



Atlas Large Hadron Collider



Dayabay Neutrinos



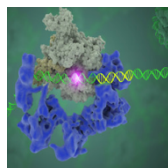
ALS Light Source



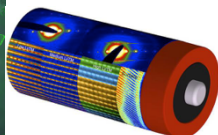
LCLS Light Source



Joint Genome Institute Bioinformatics



Cryo-EM



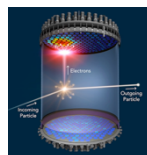
NCEM



DESI

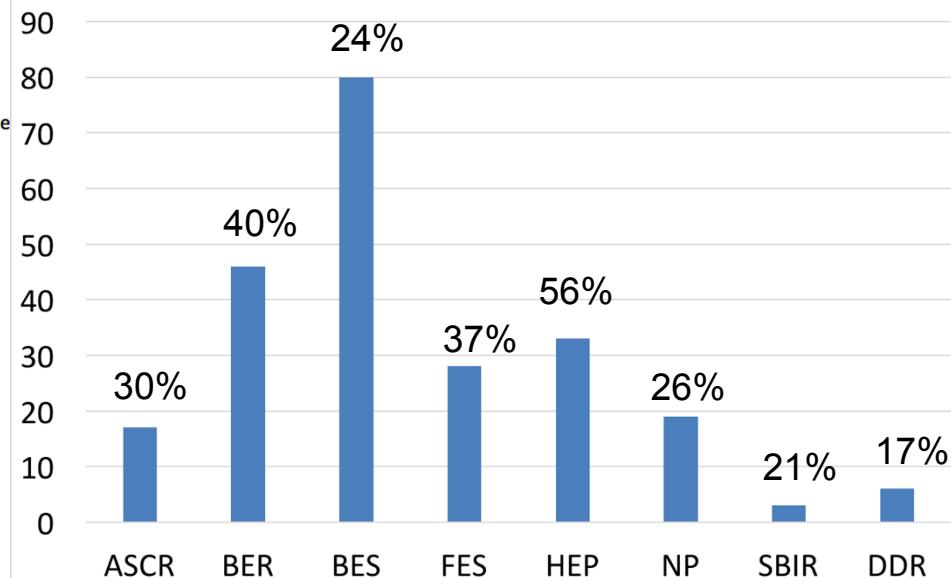


LSST-DESC



LZ

*# of Projects Analyzing Experimental Data or Combining Modeling and Experimental Data by SC Office*



~35% (235) of ERCAP projects self identified as confirming the primary role of the project is to 1) analyze experimental data or; 2) create tools for experimental data analysis or; 3) combine experimental data with simulations and modeling

# Requirements reviews and users from experimental facilities describe numerous pain points



NERSC

- **Workflows** require manual intervention and custom implementations
  - Difficult to surge experimental pipelines at HPC facility in ‘**real-time**’
  - I/O performance, storage space and access methods for **large datasets** remain a challenge
  - Searching, publishing and sharing **data** are difficult
  - **Analysis codes** need to be adapted to advanced architectures
  - Lack of **scalable analytics software**
- 
- **Resilience strategy** needed for fast-turnaround analysis needs
    - including: coordinating maintenances, fault tolerant pipelines, rolling upgrades, alternative compute facilities...
  - No **federated identity** between experimental facilities and NERSC
  - Not all scientists want command-line access.

Research

Policy

# Science Engagements



High-rate detectors use NERSC for real-time experimental feedback, data processing/management, and comparison to simulation



Complex multi-stage workflow to analyse response of soil microbes to climate change



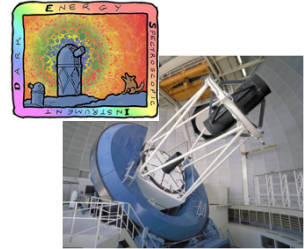
Processing streaming alerts (from NCSA) for detection of supernova and transient gravitational lensing events



4D STEM data streamed to NERSC, used to design ML algorithm for future deployment on FPGAs close to detector



High-rate detectors use ESnet and NERSC for real-time experimental feedback and data processing



Nightly processing of galaxy spectra to inform next night's telescope targets



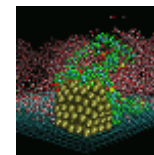
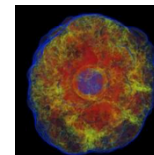
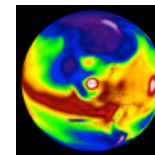
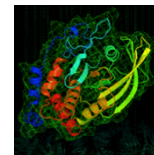
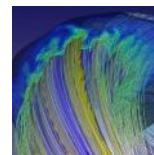
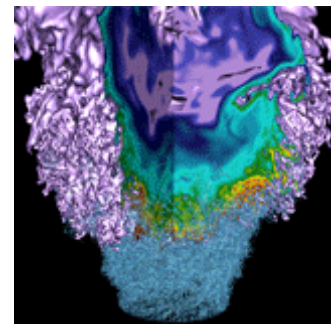
# Needs from NERSC



Experiment	What runs at NERSC?	What runs elsewhere?
LCLS	5-10% of experiments that require >32PF compute in 2021 (~3% >128PF in 2027)	All other experiments at LCLS
ALS	2-3 beamlines with large computing requirements, i.e. tomography and ptychography (~200MB/s)	Other ~40 ALS beamlines
NCEM	Stream super high-rate (>400 Gb/s) detector data to NERSC for algorithm design	Low data-rate microscopes do not use NERSC
LSST-DESC	Large-scale cosmology and instrument simulations (NESAP team); Supernova alert processing draws on multiple PB-scale data sources	Small-scale analysis done at home institutions
DESI	Short-turnaround compute needs for rapid analysis, co-location of data and simulation	Small-scale analysis done at home institutions
LZ	Combination of large-scale simulations and relatively small data coming from the experiment	Mirror data processing in UK; small-scale analysis done at home institutions
JGI/FICUS	Complex multi-stage workflow with some large MPI components (FICUS); Large-scale assembly pipelines (hipmer)	JGI exploring appropriate compute options for some workloads

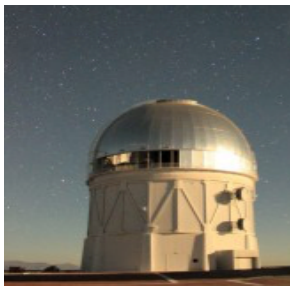


# Data, AI and Deep Learning

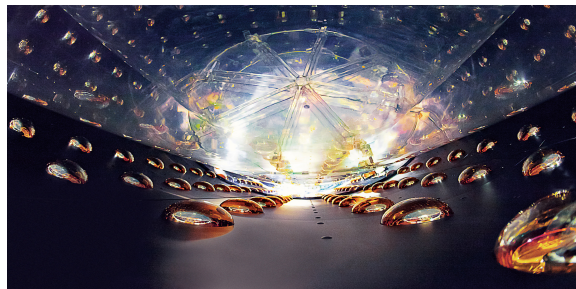


	HEP			BER		BES		NP	FES
	Astronomy	Cosmology	Particle Physics	Climate	Genomics	Light Sources	Materials	Heavy Ion Colliders	Plasma Physics
<b>Classification</b>	X		X	X	X	X	X	X	X
<b>Regression</b>		X			X	X	X	X	X
<b>Clustering</b>		X	X	X	X	X	X	X	X
<b>Dimensionality Reduction</b>				X				X	
<b>Surrogate Models</b>	X	X	X				X	X	X
<b>Design of Experiments</b>		X		X			X		X
<b>Feature Learning</b>	X	X	X	X	X	X	X	X	X
<b>Anomaly Detection</b>	X		X	X		X		X	

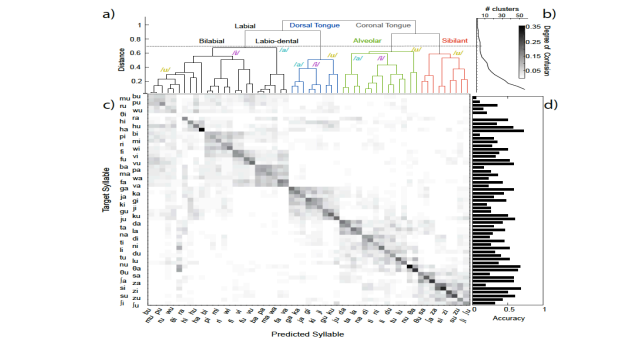
# Deep Learning for Science



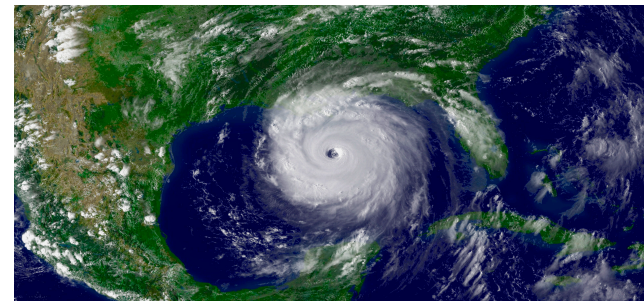
Modeling galaxy shapes



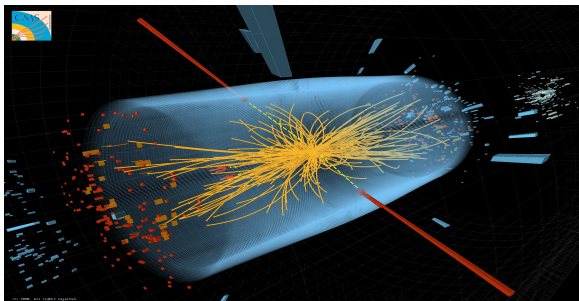
Clustering Daya Bay events



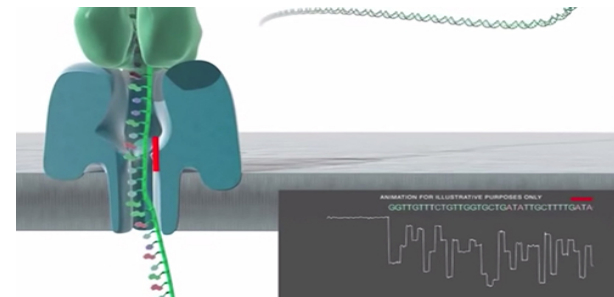
Decoding speech from ECoG



Detecting extreme weather

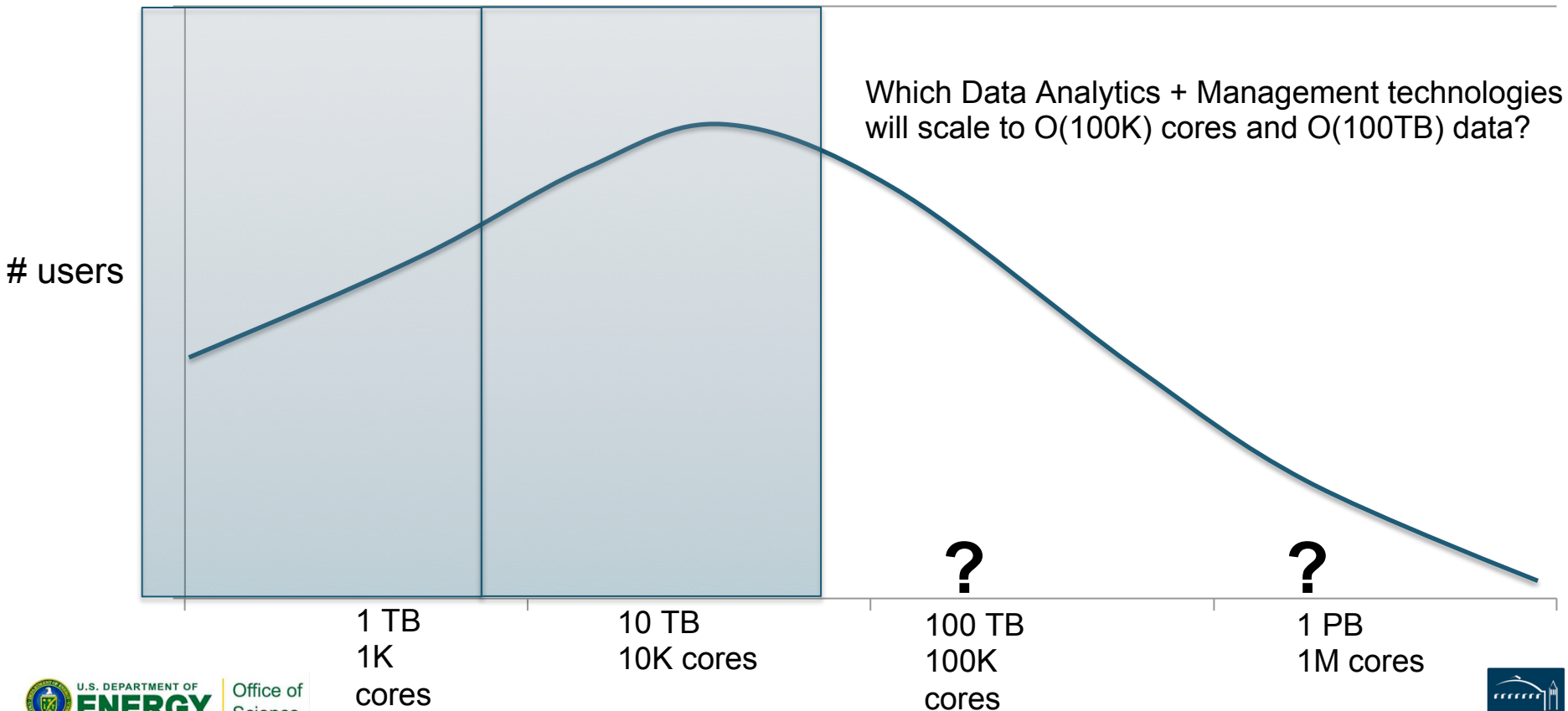


Classifying LHC events



Oxford Nanopore sequencing

# Big Data Center collaboration with Cray and Intel





# Enabling Precision Analytics for Climate Science



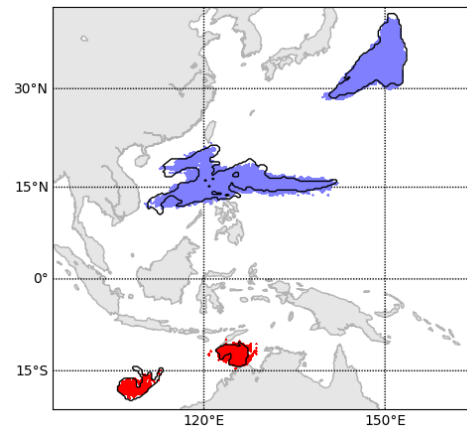
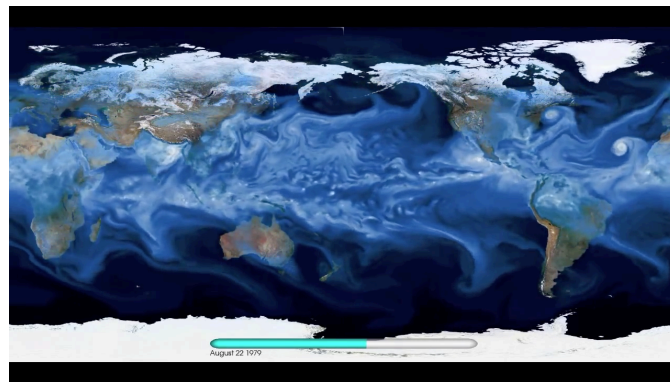
Climate projections employ coarse analytics on high fidelity model output

- Mean temperature increase, sea level rise
- Characterizing impact of extreme weather requires precision analytics

Our Goal



























- Analyze complex datasets with high spatio-temporal resolution
- Extract high quality segmentation masks leveraging state-of-the-art Deep Learning models (Deeplabv3+)

Gordon Bell Prize for achieving over an Exaflop (FP16) on Summit

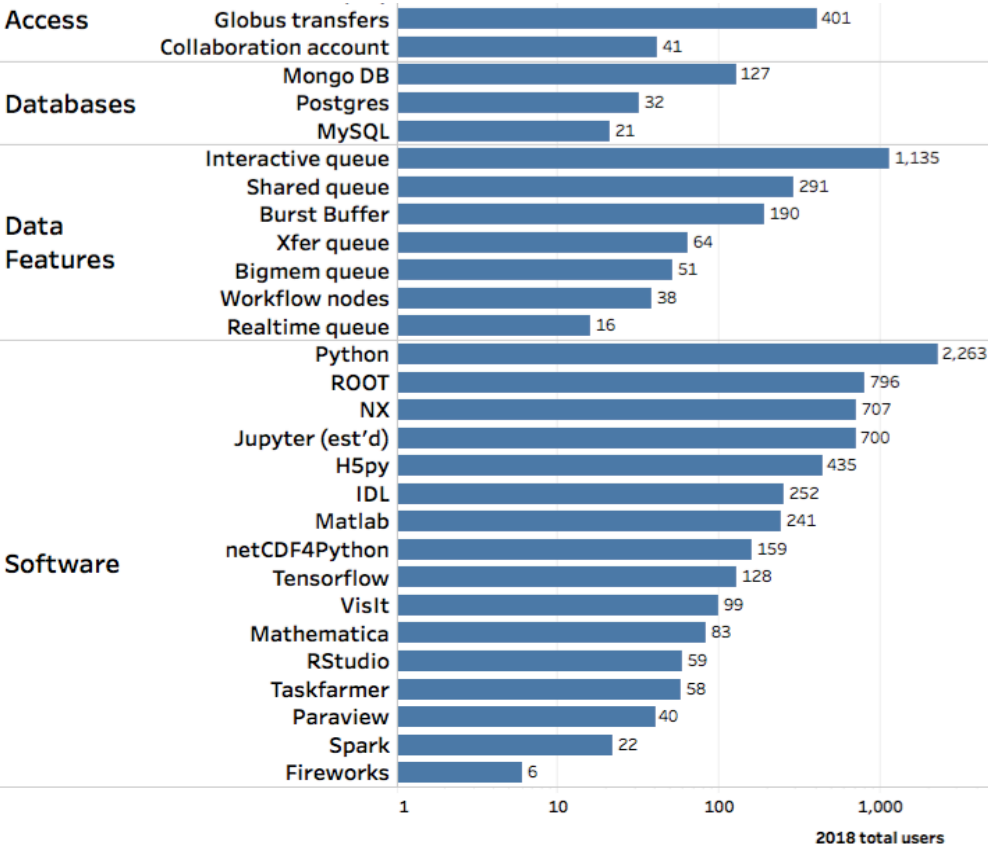


# NERSC Big Data Stack

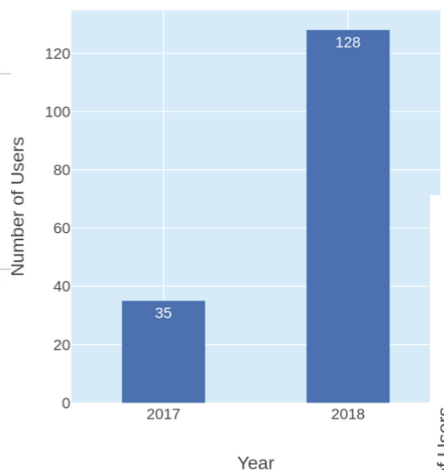


Capabilities	Technologies
Data Transfer + Access	     
Workflows	 
Data Management	     
Data Analytics	         
Data Visualization	 

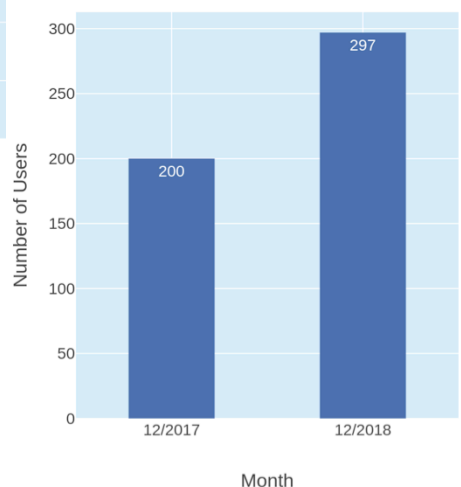
# Strong Adoption of Data Software Stack

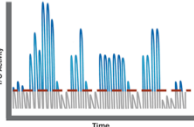
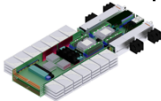


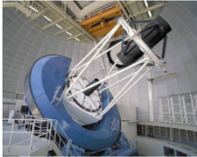

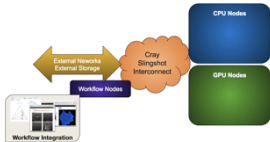
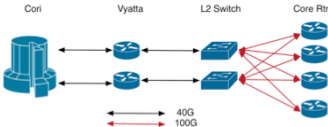
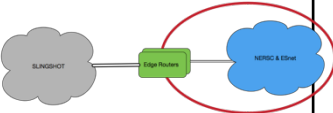


TensorFlow Usage on NERSC Systems



Jupyter Usage on NERSC Systems



Data Features	Cori experience	N9 enhancements
<h2>I/O and Storage</h2>	<p>Burst Buffer</p> 	<p>All-flash file system: performance with ease of data management</p> 
<h2>Analytics</h2> <ul style="list-style-type: none"> <li>- Production stacks</li> <li>- Analytics libraries</li> <li>- Machine learning</li> </ul>	<p>User defined images with Shifter NESAP for data</p>  <p>New analytics and ML libraries</p> 	<p>Benchmark Production Analytics workflows. Data apps in NESAP at outset</p>  <p>Optimised analytics libraries and deep learning application benchmarks</p>
<h2>Workflow integration</h2>	<p>SchedMD</p>  <p>Real-time queues</p>	<p>SLURM co-scheduling Workflow nodes integrated</p> 
<h2>Data transfer and streaming</h2>	<p>SDN</p> 	<p>Slingshot ethernet-based converged fabric</p> 

# NERSC Community Engagements



## Jupyter Community Workshop

June 11-13, 2019 • NERSC and Berkeley Institute for Data Science, Berkeley, CA

## GPUs for Science Day

July 2-3, 2019 • NERSC, Berkeley, CA

## Deep Learning for Science Summer School

July 15-19, 2019 • NERSC, Berkeley, CA

## Monterey Data Conference

August 5-8, 2019 • Monterey Marriott, Monterey, CA

## Tutorials Lead at SC18, ECP19, GTC19 and ISC19:

Parallel I/O in Practice (SC18)

Exascale I/O Technologies (ECP19)

Deep Learning at Scale (SC18, ECP19, ISC19)

Getting Started with Containers on HPC (ISC19)

OpenMP Common Core: a “Hands-On” Exploration (SC18)

Managing HPC Software Complexity with Spack (SC18, ECP19)

Container Computing for HPC and Scientific Workflows (SC18, ECP19)

Performance Tuning of Scientific Codes with the Roofline Model (SC18, ECP19, ISC19, GTC19)



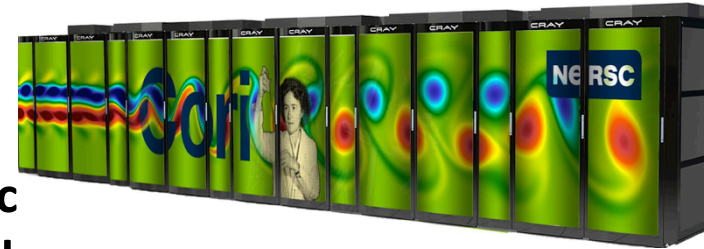


- **We are very excited about Perlmutter**
  - Significant increase in capabilities over Cori
  - NESAP is a key to broad adoption of GPU technologies
  - 1<sup>st</sup> NERSC system designed with data in mind from the very beginning
    - All flash file system, new interconnect, big data stack
- **Demand from Experimental and Observational Facilities is increasing dramatically**
- **NERSC has made a significant investment in data, AI and deep learning**

**Questions?**

# Cori: Pre-Exascale System for DOE Science

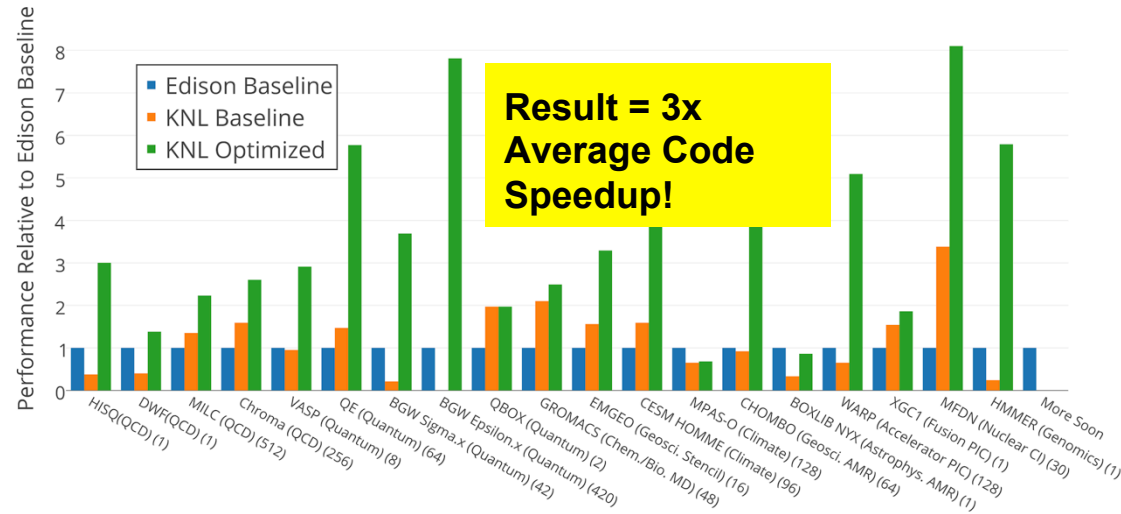
- Cray XC System - heterogeneous compute architecture
- 9600 Intel KNL compute nodes
  - 68 cores, 4 HW threads/core, AVX-512, 16GB HBM, 96GB DRAM
- >2000 Intel Haswell nodes
- Cray Aries Interconnect
- NVRAM Burst Buffer, 1.6PB and 1.7TB/sec
- Lustre file system 28 PB of disk, >700 GB/sec
- Investments to support large scale data analysis
  - High bandwidth external connectivity to experimental facilities from compute nodes
  - Virtualization capabilities (Shifter/Docker)
  - More login nodes for managing advanced workflows
  - Support for real time and high-throughput queues



# NERSC Exascale Scientific Application Program (NESAP)



- Prepare DOE SC users for advanced architectures like Cori
- Partner closely with ~20 application teams and apply lessons learned to broad NERSC user community.
- $> \frac{1}{2}$  of projects have used  $> \frac{1}{2}$  their time on Cori KNL



# NESAP ECP Engagement

NESAP For Cori Included the Following ECP Apps

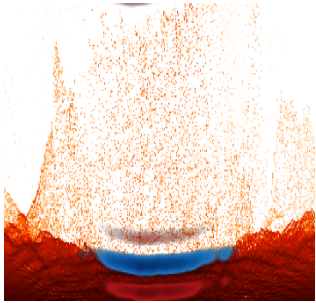
LatticeQCD	<i>WDMApp</i>	E3SM
NWChemEX	<i>WarpX</i>	Urban
GAMESS	Exastar	ExaSGD
<b>EXAALT</b>	Exasky	CANDLE
ExaAm	EQSIM	<i>ExaFEL</i>
QMCPACK	SubSurface	ExaSMR
Combustion	<i>Exabiome</i>	MFIX

ECP NESAP for Cori Codes
ECP Codes Used at NERSC

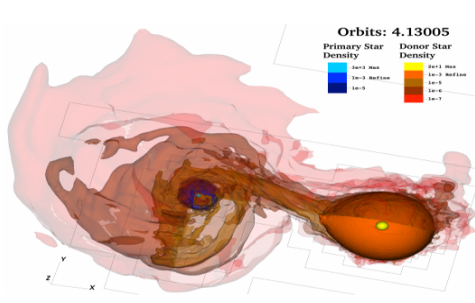
**EXAALT, WDMApp, WarpX, Exabiome, ExaFEL** are Pre-Selected for NESAP for Perlmutter. More apps to be announced Feb. 2019.



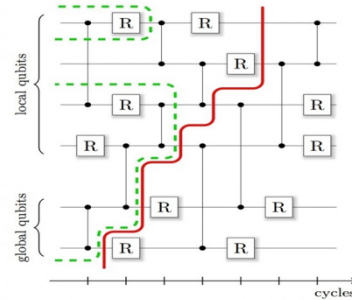
# Users Demonstrate Groundbreaking Science Capability



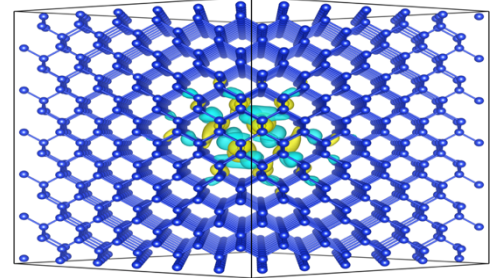
Large Scale Particle in Cell Plasma Simulations



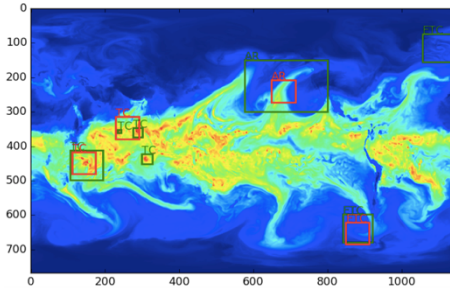
Stellar Merger Simulations with Task Based Programming



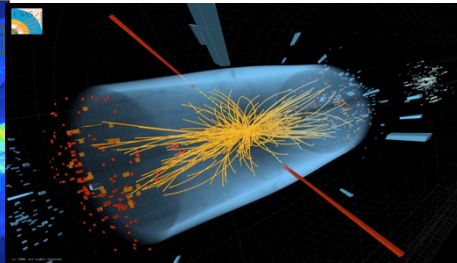
Largest Ever Quantum Circuit Simulation



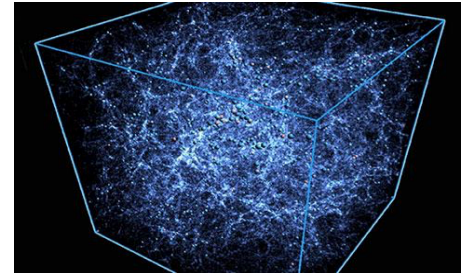
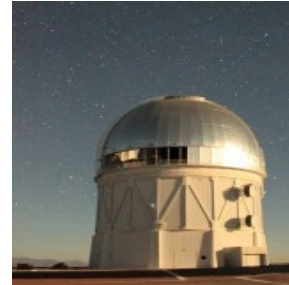
Largest Ever Defect Calculation from Many Body Perturbation Theory > 10PF



Deep Learning at 15PF (SP) for Climate and HEP



Celeste: 1<sup>st</sup> Julia application to achieve 1 PF



Galactos: Solved 3-pt correlation analysis for Cosmology @9.8PF

# Compute Node Details



- **CPU only nodes**
  - Next Generation AMD CPUs
  - CPU only cabinets will provide approximately same capability as *full* Cori system (~8B hours) > 4000 nodes
  - Efforts to optimize codes for KNL will translate to NERSC-9 CPU only nodes
- **CPU + GPU nodes**
  - Next Generation NVIDIA GPUs with Tensor cores, high bandwidth memory and NVLINK-3
  - Unified Virtual Memory for improved programmability
  - 4 to 1 GPU to CPU ratio
  - (> 16B hours)

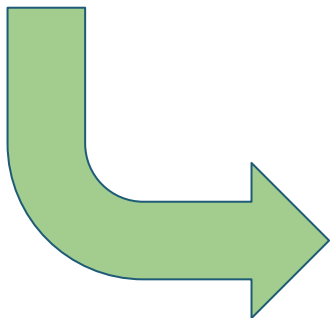


## Commodity based

- Ethernet physical layer
  - Native support for generic Linux Sockets
- Traffic Class (QoS levels)
- Converged fabric

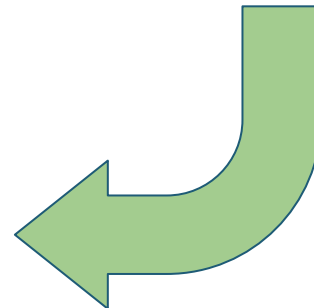
## Optimized for HPC

- Low latency
- MPI and collective offload
- Congestion control
- Adaptive routing



## Commodity + HPC

- 64-port Rosetta Switches
- 25GBps Cray NIC (200Gbps)



# NESAP for Perlmutter



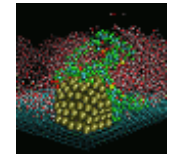
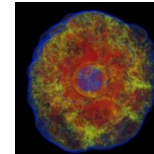
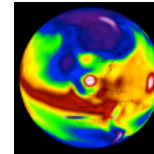
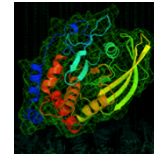
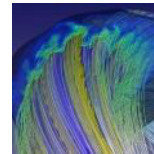
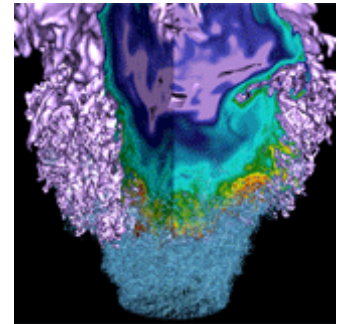
**Simulation**  
**~12 Apps**

**Data Analysis**  
**~8 Apps**

**Learning**  
**~5 Apps**

- 5 ECP Apps Jointly Selected (Participation Funded by ECP)
- Open call for proposals.
  - **App selection will contain multiple applications from each SC Office and algorithm area**
  - **Additional applications (beyond 25) will be selected for second tier NESAP with access to vendor/training resources and early access**

# Workflows and Data Analytics





# NERSC-9: A System Optimized for Science



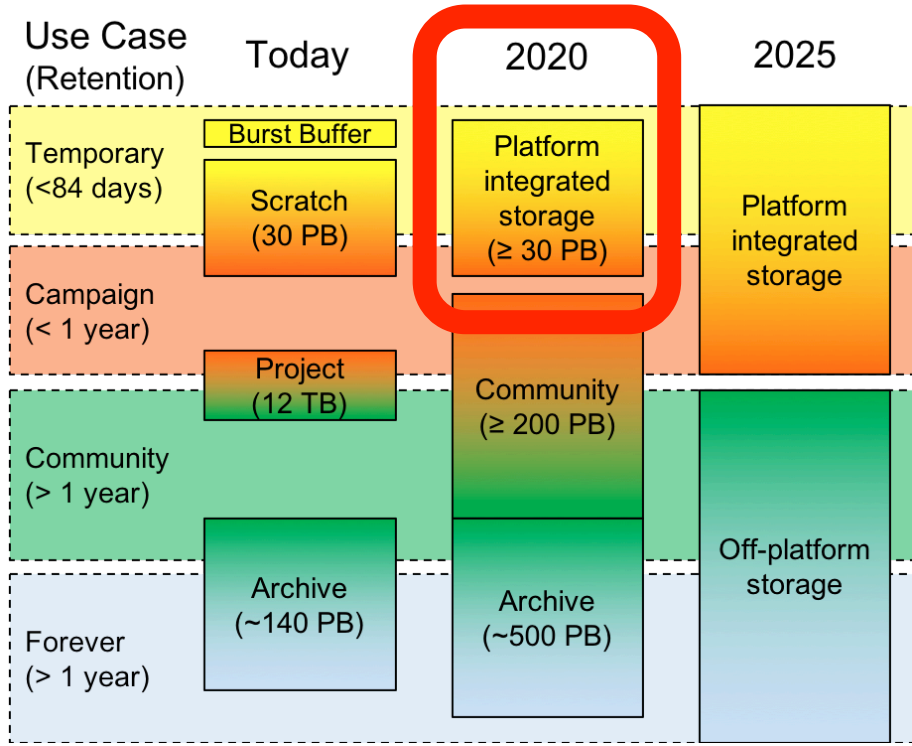
- Cray Shasta System providing 3-4x capability of Cori system
- First NERSC system designed to meet needs of both large scale simulation and data analysis from experimental facilities
  - Includes both NVIDIA GPU-accelerated and AMD CPU-only nodes
  - Cray Slingshot high-performance network will support Terabit rate connections to system
  - Optimized data software stack enabling analytics and ML at scale
  - All-Flash filesystem for I/O acceleration
- Robust readiness program for simulation, data and learning applications and complex workflows
- Delivery in late 2020



# Platform Storage System Design Goals



- **Meet the needs of users**
  - Support high IOPS & metadata rates for data analysis
  - Retain benefits of burst buffer
  - Collapse performance tiers
- **Prepare for the future**
  - Prove Lustre optimizations for all-flash performance world



“Storage 2020: A Vision for the Future of HPC Storage,” Berkeley, CA, 2017.  
Available online: <https://escholarship.org/uc/item/7444781n>

**Simulation**  
**~12 Apps**

**Data Analysis**  
**~8 Apps**

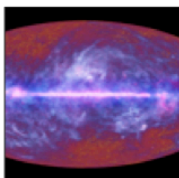
**Learning**  
**~5 Apps**

- 5 ECP Apps Jointly Selected (Participation Funded by ECP)
- Open call for proposals.
  - **App selection will contain multiple applications from each SC Office and algorithm area**
  - **Additional applications (beyond 25) will be selected for second tier NESAP with access to vendor/training resources and early access**

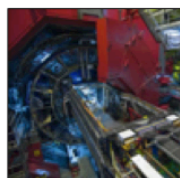
# NERSC already supports a large number of users and projects from DOE SC's experimental and observational facilities



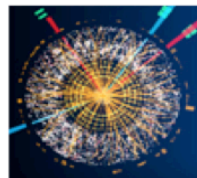
Palomar Transient Factory Supernova



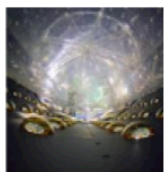
Planck Satellite Cosmic Microwave Background Radiation



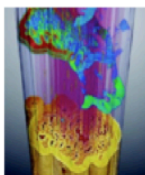
Alice Large Hadron Collider



Atlas Large Hadron Collider



Dayabay Neutrinos



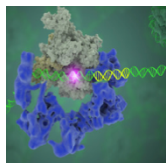
ALS Light Source



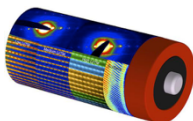
LCLS Light Source



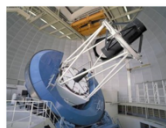
Joint Genome Institute Bioinformatics



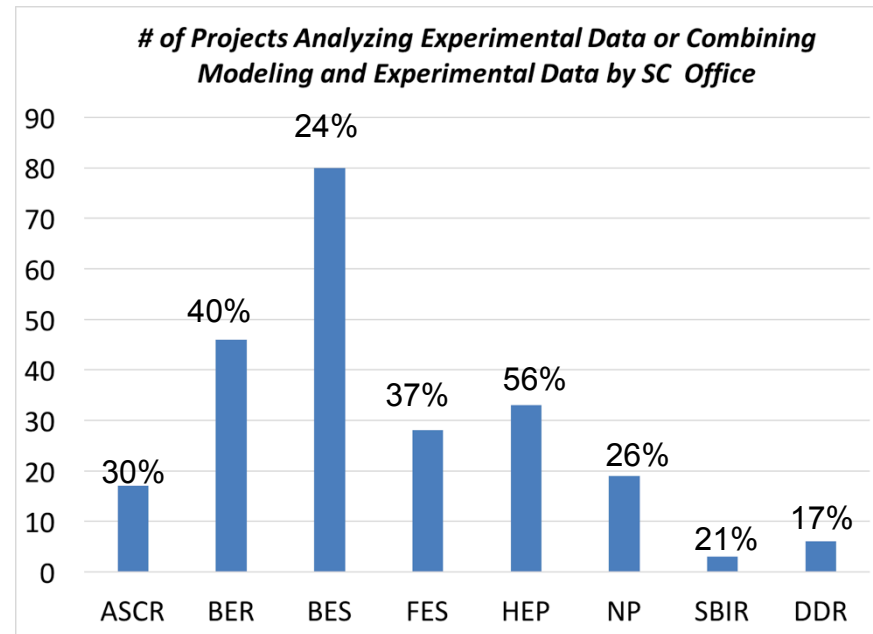
Cryo-EM



NCEM



DESI

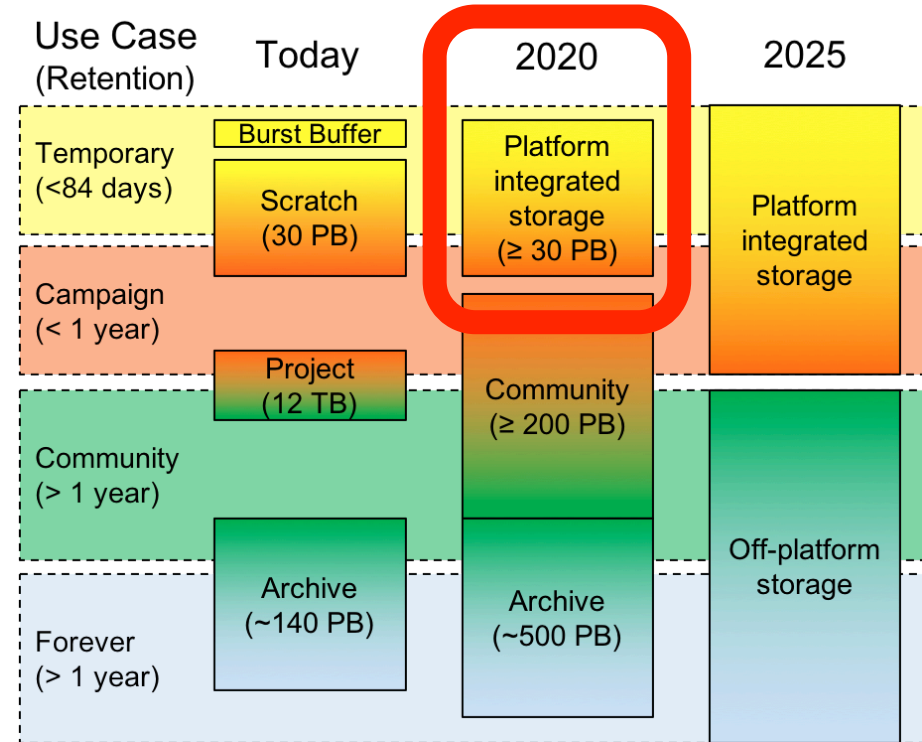


~35% (235) of ERCAP projects self identified as confirming the primary role of the project is to 1) analyze experimental data or; 2) create tools for experimental data analysis or; 3) combine experimental data with simulations and modeling

# Platform Storage System Design Goals



- **Meet the needs of users**
  - Support high IOPS & metadata rates for data analysis
  - Retain benefits of burst buffer
  - Collapse performance tiers
- **Prepare for the future**
  - Prove Lustre optimizations for all-flash performance world



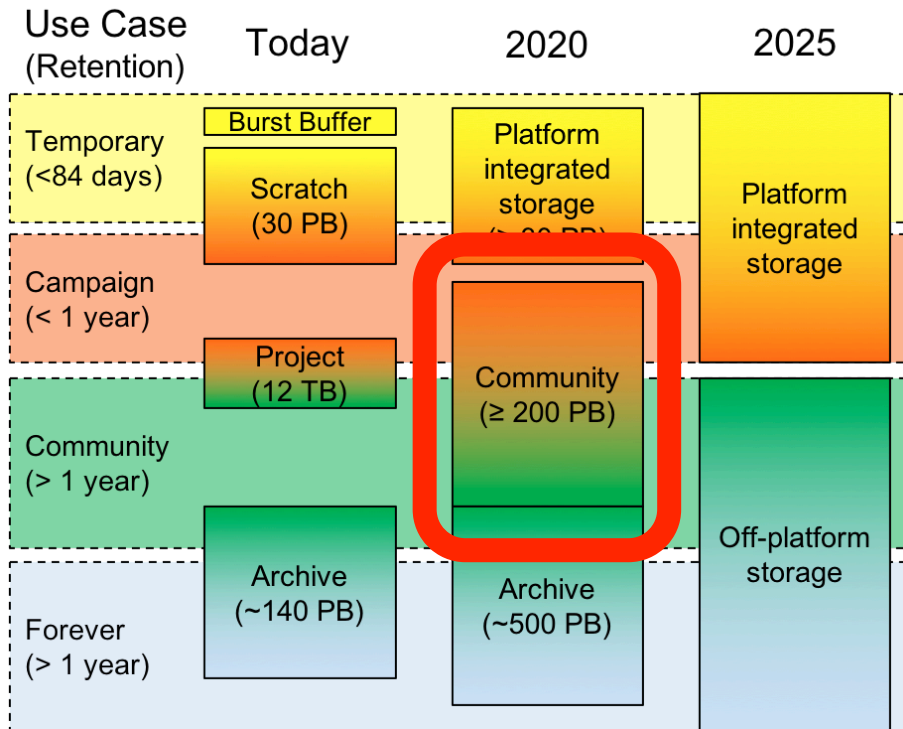
“Storage 2020: A Vision for the Future of HPC Storage,” Berkeley, CA, 2017.

Available online: <https://escholarship.org/uc/item/7444781p>



# Community File System: High-capacity storage


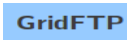














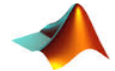







- **NERSC-9 scratch for hot, short-term data**
- **Community file system for cooler, longer-term data**
  - Replace project file system
  - ~50 PB initially
  - Grow to > 200 PB for N9
  - Emphasis on data management, access, and sharing



“Storage 2020: A Vision for the Future of HPC Storage,” Berkeley, CA, 2017.  
Available online: <https://escholarship.org/uc/item/7444797p>

# NERSC Big Data Stack



Capabilities	Technologies
Data Transfer + Access	     
Workflows	 
Data Management	     
Data Analytics	       
Data Visualization	 

# NERSC-9 System Deployment Timeline

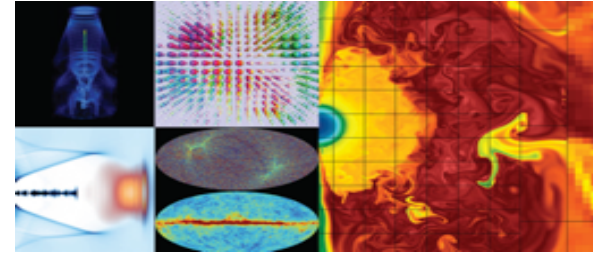


Milestone	Date
NESAP Call for Proposals Due	Dec. 2018
GPU Rack on Cori available for NESAP Users	Dec. 2018
NERSC-9 System Delivery	Oct. 2020
System Integration with NERSC Complete	Dec. 2020
Acceptance Testing Begins	Dec. 2020
NESAP Teams on NERSC-9 System	Jan. 2021
All users enabled on NERSC-9 System	Apr. 2021
System Acceptance	Aug. 2021

# NERSC-9 System Optimized for Simulation and Data Users

In order to meet science requirements and demonstrate exascale-era technologies accelerator technology was essential

- Significant fraction of NERSC workload can now use GPUs
  - GPU programming has matured
  - Improved software environment
  - Increases in GPU memory capacity improve programmability
- System contains large number of CPU-only nodes for applications that are not yet ready



System designed to meet needs of data analysis from experimental facilities

- System well balanced between network and FLOPS
- Optimized network for data ingest from experimental facilities
- Real-time scheduling capabilities
- Supported analytics stack including latest ML/DL software
- System software supporting rolling upgrades for improved resilience

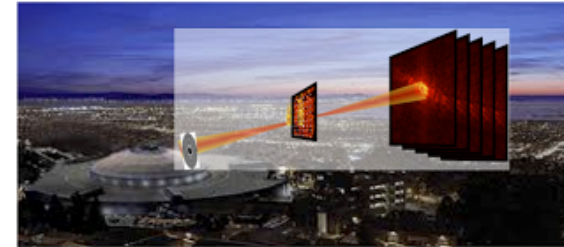
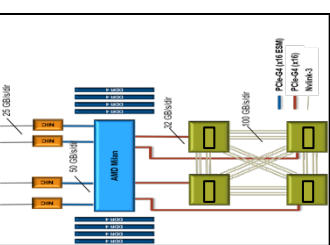
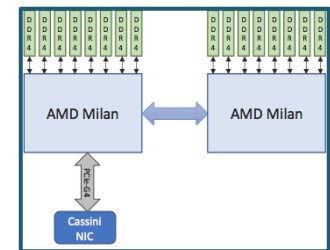


Photo Credit: CAMERA

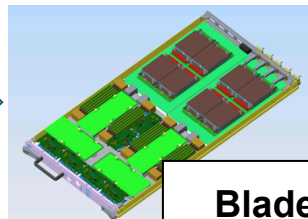
# NERSC-9 at a glance



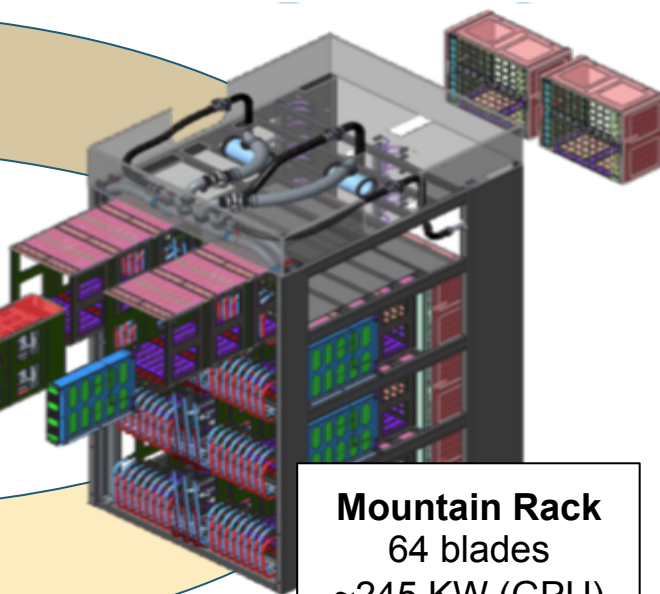
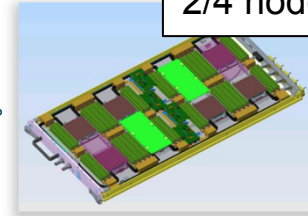
**GPU Node**  
1 CPU: 4 GPU  
>30 TF  
>128 GiB DDR  
>128 GiB HBM  
4 NICs



**CPU Node**  
2 CPU  
~4 TF  
>256 GiB DDR  
1 NIC



**Blade**  
2/4 nodes



**Mountain Rack**  
64 blades  
~245 KW (GPU)

**System**  
X CPU racks  
Y GPU racks  
3-4x Cori

## A new approach for System-to-Center integration

- Ethernet compatible Slingshot allows for seamless connectivity
  - blurs the line of what is “inside” or “outside” the system
- Slingshot on Rosetta Switches to Ethernet on Edge Routers
- Using a pair of Edge Routers with 400Gb ports
  - 1.9 Tb/s sustained bandwidth across a converged fabric
  - ~4x increase in bandwidth from what is available to Cori
  - provides integration point for N9, the Center and the WAN



# Transitioning From KNL to AMD Processors



**Codes optimized on Xeon Phi (KNL) will run well on Perlmutter**

**Many KNL architecture features are present on Perlmutter CPUs**

- Many-Core

- MPI+OpenMP Programming Model Will Continue

**Easier Onramp to “Many-Core” with Perlmutter CPUs than with KNL**

- More Traditional Cores

- Single Memory Technology

# GPU Transition Path for CPU Apps



## NESAP for Perlmutter will extend activities from NESAP for Cori

1. Identifying and exploiting on-node parallelism - threads + vector
2. Understanding and improving data-locality within the cache-memory hierarchy

## What's New?

1. Heterogeneous compute elements
2. Identification and exploitation of even more parallelism
3. Emphasis on performance-portable programming approach:

## Programming Models Supported

CUDA, CUDA FORTRAN, OpenACC, Kokkos, Raja, OpenMP NRE with PGI/

# Engaging around Performance Portability



NRE with PGI to enable OpenMP GPU acceleration



Directives for Accelerators

NERSC will pursue membership in OpenACC

The screenshot shows the Performance Portability website. The top navigation bar includes 'Performance Portability / Measurements / Measurement Techniques' and a search box. The left sidebar lists navigation options: 'Performance Portability', 'Introduction', 'Office of Science Facilities', 'Performance Portability', 'Overview', 'Definition', 'Measurements', 'Measurement Techniques', 'Collecting Roofline on KNL', 'Collecting Roofline on GPUs', 'Strategy', 'Approaches', 'Case Studies', 'Summary', and 'Other Resources'. The main content area is titled 'speed and vector/instruction-sets' and contains the following text: 'The application or algorithm may be fundamentally limited by *different* aspects of the system on different HPC system. As an example, an implementation of an algorithm that is limited by memory bandwidth may be achieving the best performance it theoretically can on systems with different architectures but could be achieving widely varying percentage of peaks FLOPS on the different systems. Instead we advocate for one of two approaches for defining performance against expected or optimal performance on the system for an algorithm: 1. Compare against a known, well-recognized (potentially non-portable), implementation. Some applications, algorithms or methods have well-recognized optimal (often hand-tuned) implementations on different architectures. These can be used as a baseline for defining relative performance of portable versions. Our Chroma application case-study shows this approach. See [here](#). Many performance tools exist at ALCF, NERSC and OLCF for the purposes of profiling



N9 will also have compiler support for Kokkos and RAJA

NERSC leading development of [performanceportability.org](http://performanceportability.org)

Doug Doerfler leading performance portability workshop at SC18, and 2019 DOE COE perf. port. meeting

