#### **MSST 2018: NON-VOLATILE MEMORY API SESSION**



#### INCORPORATING NVM INTO DATA-INTENSIVE SCIENTIFIC COMPUTING



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Advanced Photon Source

(Under construction: APS upgrade)



Argonne Leadership Computing Facility

IBM Blue Gene/Q (Mira) Cray XC40 (Theta)

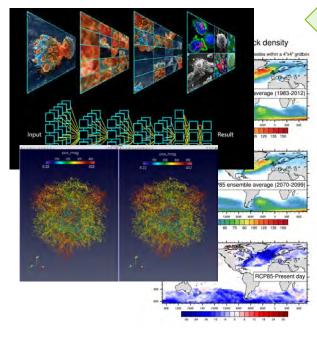
(Under construction: A21 exascale system)





# THE ROLE OF ANL/MCS DATA-INTENSIVE SCIENCE RESEARCH

(one perspective)



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Techniques, algorithms, and software to bridge the "last mile" between scientific applications and storage systems

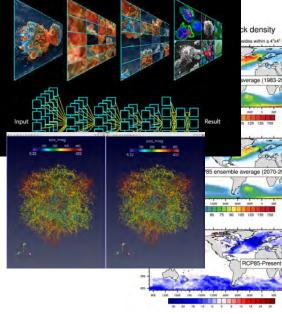
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#### THE ROLE OF ANL/MCS DATA-INTENSIVE **SCIENCE RESEARCH**

(one perspective)



This entails:

- Characterizing access
- Modeling architectures
- Optimizing data services
- **Incorporating new** technology such as NVM





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## DATA-INTENSIVE SCIENTIFIC COMPUTING

**Constraints on NVM** integration from an end-user perspective

- Efficiency
  - CPU hours (and storage) are a scarce commodity
  - This has a direct impact on scientific time to solution
- Portability
  - Applications must execute on multiple platforms
  - The science itself will outlive all of those platforms
- Ease of use
  - Scientists would like to focus on their problem domain
  - Not the mysterious ways of vendor\_api\_write\_foo()



## DATA-INTENSIVE SCIENTIFIC COMPUTING

Potential solutions in the storage design space

- Efficiency
- Portability

Ease of use

- 1. A global parallel file system
  - POSIX is portable and easy to use (or at least well understood)
  - Re-engineering needed to address latency shifting by orders of magnitude
  - Semantics and API make this challenging
- 2. "Here are some NVM devices: have fun!"
  - Dedicated developers will always be able to maximize efficiency with this approach
  - Not enough ninja programmers for this to be a viable long term option
- 3. Specialized data services
  - There are challenges and opportunities
  - NVM APIs can help





## WHAT DO WE MEAN BY SPECIALIZED DATA SERVICES?





## **SPECIALIZED DATA SERVICES**

- Semantics and capabilities tailored to a problem domain
- Provisioned and instantiated on-demand
- Abstracting storage technology from the application
- Target more than just checkpointing
- A way to leverage NVM characteristics by bypassing conventional storage software infrastructure

Examples are already common in HPC!





#### **AN ECOSYSTEM OF DATA SERVICES**

#### Science Workflow

Executables and Libraries

SPINDLE

Checkpoints SCR FTI Input and Intermediate Data Products DataSpaces MDHIM

Performance Data

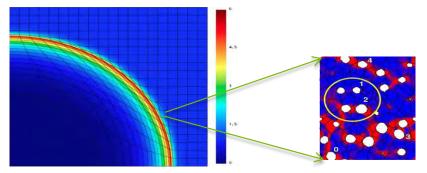
Darshan LMT

There is an opportunity to extend this concept to domain-specific scientific data models as well.





#### A SCIENTIFIC DATA MODEL EXAMPLE: MULTI-SCALE SIMULATION

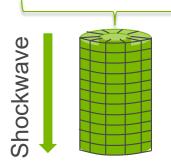


**Coarse-scale model** 

Fine-scale model

Multi-scale models simulate across multiple time and length scales.

This example is a hydrodynamics unstructured mesh with an FFT-based PDE solver.



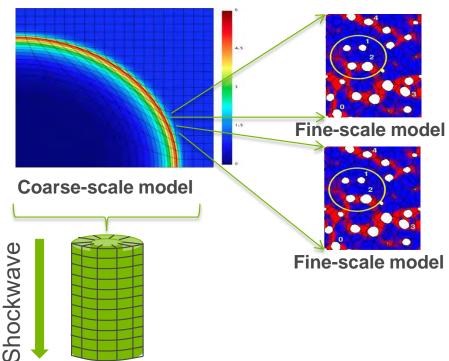
R. Lebensohn et al, Modeling void growth in polycrystalline materials, Acta Materialia, http://dx.doi.org/10.1016/j.actamat.2013.08.004

We will use it to illustrate a motif that occurs in other problem domains as well and highlights the need for reusable building blocks.





#### A SCIENTIFIC DATA MODEL EXAMPLE: MULTI-SCALE SIMULATION



- Phenomena such as shock waves propagate through coursescale model
- This sometimes requires recomputation of similar (or identical) fine-scale models

If the fine-scale model is expensive, then we should cache fine-scale results for later use.

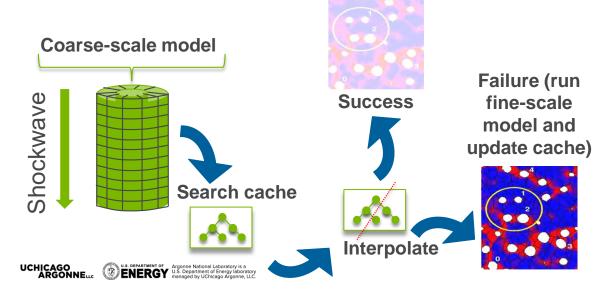






### COMPUTATIONAL CACHING AS A SPECIALIZED DATA SERVICE

- Search cache for nearest neighbors in parameter space, interpolate, and check error bounds
- Could be a distributed data service that leverages low latency, byte-addressable NVMs



This isn't a standard file system or database.

NVM APIs:

- Give us building blocks for new data models
- Let us differentiate classes of memory

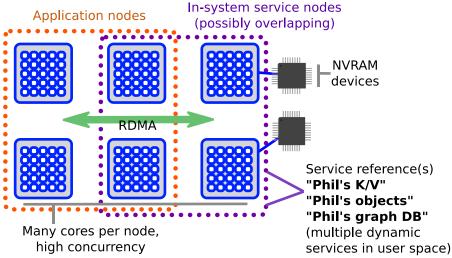


#### TECHNICAL CHALLENGES FOR SPECIALIZED DATA SERVICES IN HPC

- Where is the NVM?
  - Local to compute nodes, remote access, or remote access via fabric?
- Integration with custom HPC networks
  - Dragonfly, torus, fat tree, exotic APIs
- Concurrency
  - Applications with > 100 thousand processes
- Access mode

 User-space access helps to enable dynamic services on time-shared systems

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The Mochi Project ANL, LANL, CMU, HDFG https://www.mcs.anl.gov/research/projects/mochi



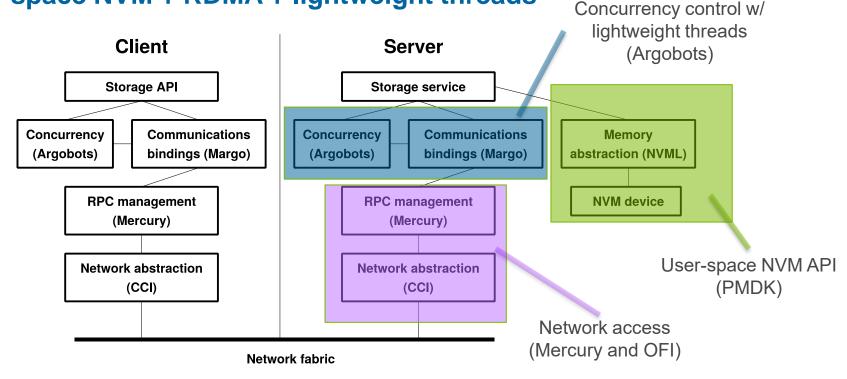
#### BUILDING SPECIALIZED DATA SERVICES WITH NVM





### ARCHITECTING AN NVM-BACKED DATA SERVICE

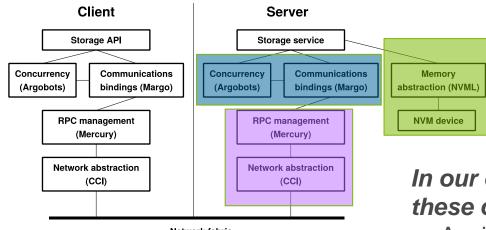
#### **User space NVM + RDMA + lightweight threads**





## ARCHITECTING AN NVM-BACKED DATA SERVICE

#### User space NVM + RDMA + lightweight threads



Network fabric

Modularity helps with extensibility, portability, and reuse, but is this too many layers/components?

# *In our experience, no. We prioritize these optimizations instead:*

- Avoiding privileged mode transitions
- Avoiding context switches in general
- Avoiding memory copies
- Reducing CPU load

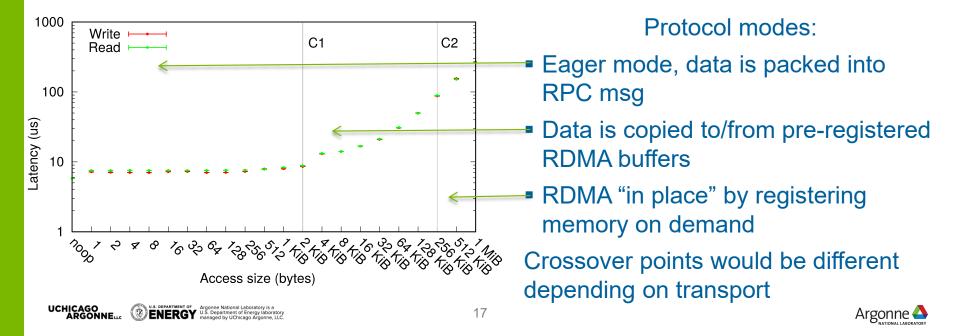




## ACCESS LATENCY

How much latency do those software layers add?

- RAM in place of pmem
- No busy polling
- Each access is at least 1 network round trip, 1 libpmem access, and 1 new thread



## ACCESS LATENCY

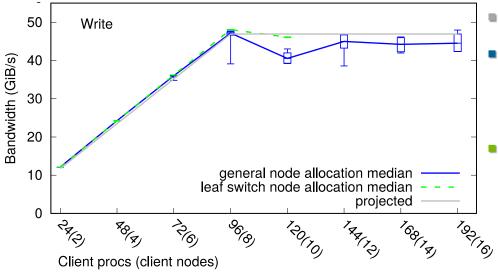
#### **Observations and questions**

- Single digit microsecond access latencies: could it be tuned further?
  - Consider adaptive polling
  - Optimize memory allocation
  - OFI providers (and others) are improving rapidly
- What about the long tail?
  - Previous slide shows confidence interval for 10,000 samples at each point, and the intervals are quite narrow
  - But there are outliers: worst noop sample was > 70 microseconds
  - This leads to the dreaded jitter problem in HPC
- The cost of memory copy vs. registration is a key factor in optimization





### AGGREGATE BANDWIDTH



- Same system as in previous example
- 8 servers (1 per node)
- Up to 192 application processes (12 per node)

Grey line is projected maximum

- Blue line is a normal allocation
  - Whiskers (min and max) show significant variance
- Green line is an allocation with all nodes on one leaf switch
  - Whiskers (min and max) show very little variance

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# AGGREGATE BANDWIDTH

#### **Observations and questions**

- New problems arise when storage latency isn't the longest pole in the tent:
  - E.g., network topology (In this example, internal switch routing)
  - Consider dynamic routing and congestion-avoidance algorithms?
  - Better internal service instrumentation?
  - Make the storage system topology-aware?
- The service can saturate aggregate bandwidth relatively easily
- PMDK atomics help avoid serialization
  - Especially when creating and destroying objects
- How does this software architecture hold up at larger scales?



# COMMENTARY ON THE ROLE OF NVM APIS IN SCIENTIFIC COMPUTING

- We surely appreciate faster file systems and databases, but there are many other possibilities to consider
- NVM is easier to integrate into HPC if it gets along with our other technologies
  RDMA networks, user-space provisioning, lightweight concurrency
- Bottlenecks aren't where they used to be
- Some degree of standardization is helpful
  - Minimize burden on developers for portability
- What is the role of PMoF?
  - Important technology, but not a full solution for concurrency and flow control
- Right now focus is on "get it to work, fast!", but focus will shift over time: characterization, elasticity, multi-objective optimization, and more







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