

# SSD Provisioning for Exascale Storage Systems

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# SSDs: The Good, the bad and the Ugly

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High performance for random workloads

Low power consumption

Shock resistant

Write-endurance

High cost per Byte

**Can we build an  
exascale storage  
system out of SSDs?**

# Write Endurance

# Is SSD write-endurance a problem for HPC?

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Projected SSD storage space: ~5-10 PB

If building blocks are typical 256 GB SSDs

Number of SSDs in the system = 20,000

5 year warranty for max. 40GB write per day\*

Allowed write amount: 600TB write per day

\*Samsung 840 Pro Data Sheet

[http://www.samsung.com/us/pdf/memory-storage/840PRO\\_25\\_SATA\\_III\\_Spec.pdf](http://www.samsung.com/us/pdf/memory-storage/840PRO_25_SATA_III_Spec.pdf)

# Is SSD write-endurance a problem for HPC?

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Assuming write amplification factor = 1.3

Allowed user written data = ~460TB per day

Write-endurance becomes a roadblock if an application dumps even 10% of system memory as checkpointing data every hour

**System-level checkpointing easy on the programmer, hard on SSD-based storage system**

# Is SSD write-endurance a problem for HPC?

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Assuming write amplification factor = 1.3

Allowed user written data = ~460TB per day

OLCF: S3D 360 TB per day; GTC 240 TB per day

NERSC: <100 TB per day (Darshan instrumented)

ALCF: most jobs moving <100 TB

Carns et al., Understanding and improving computational science storage access through continuous characterization, ACM Transactions on Storage, 2011

Computational Requirements of Leadership Computing

[http://www.olcf.ornl.gov/wp-content/uploads/2010/03/ORNL\\_TM-2007\\_44.pdf](http://www.olcf.ornl.gov/wp-content/uploads/2010/03/ORNL_TM-2007_44.pdf)

# Is SSD write-endurance a problem for HPC?

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Even 1TB SSD as a building block will allow up to 150TB write per day

At higher price, up to 3 full writes per day

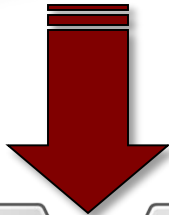
Write-endurance improving at a fast speed

**Reducing the checkpointing size is the key to alleviating SSD write-endurance issue (application-level checkpointing strategies)**



# **Where in the System? And, how much?**

# SSDs as a burst buffer in HPC



SSD Burst Buffer

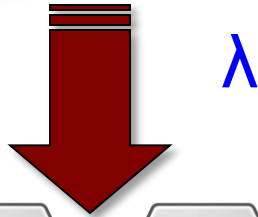


Permanent Storage

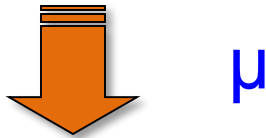
$\lambda$  = Data production rate

$\mu$  = Bandwidth to Permanent Storage System

# SSDs as a burst buffer in HPC



SSD Burst Buffer



Permanent Storage

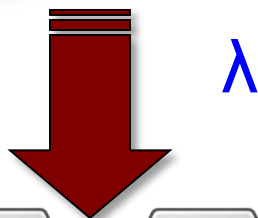
If  $\lambda > \mu$  :

SSD burst buffer capacity is unbounded

Intuition:

Higher incoming flux than outgoing flux will burst the pipe  
Never enough time to drain out

# SSDs as a burst buffer in HPC



$\lambda$



SSD Burst Buffer



$\mu$



Permanent Storage

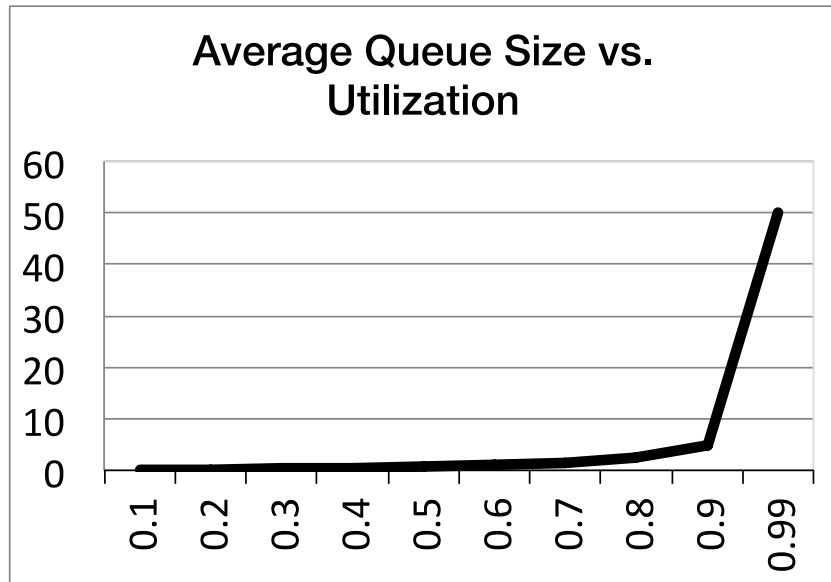
Implications:

Not all the data from burst buffer can be copied just in time

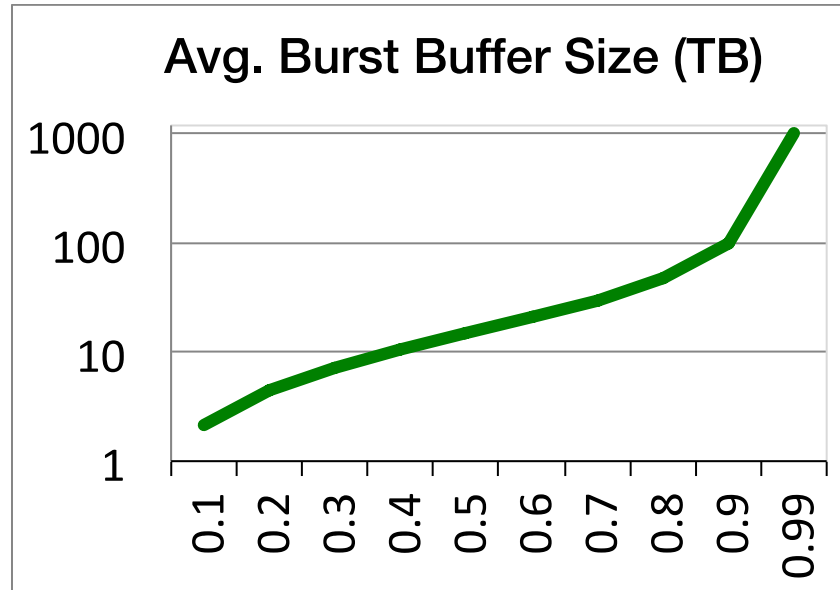
PFS Bandwidth still critical

Utilization = production rate/achievable PFS bandwidth =  $\lambda/\mu$

# SSDs as a burst buffer in HPC



Utilization =  $\lambda/\mu$

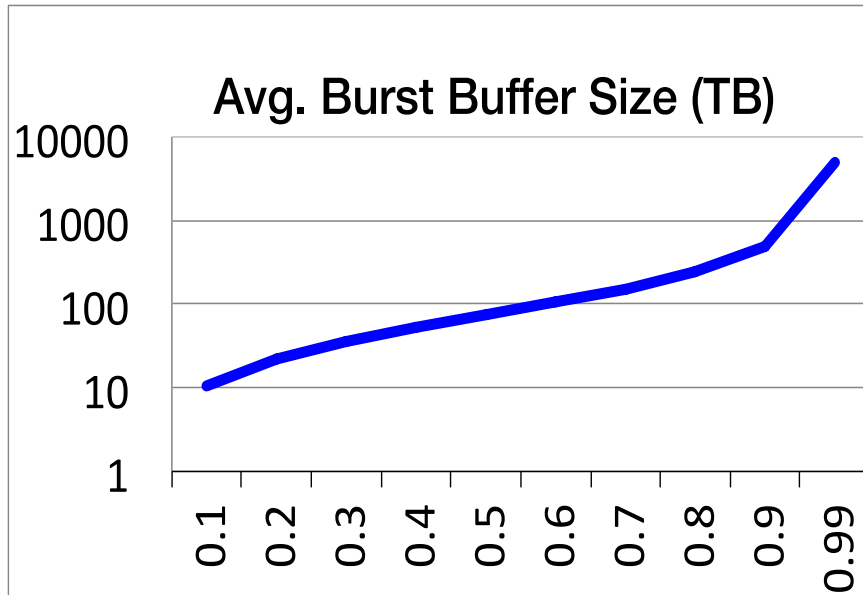


Utilization =  $\lambda/\mu$

Output data size at once = 20TB

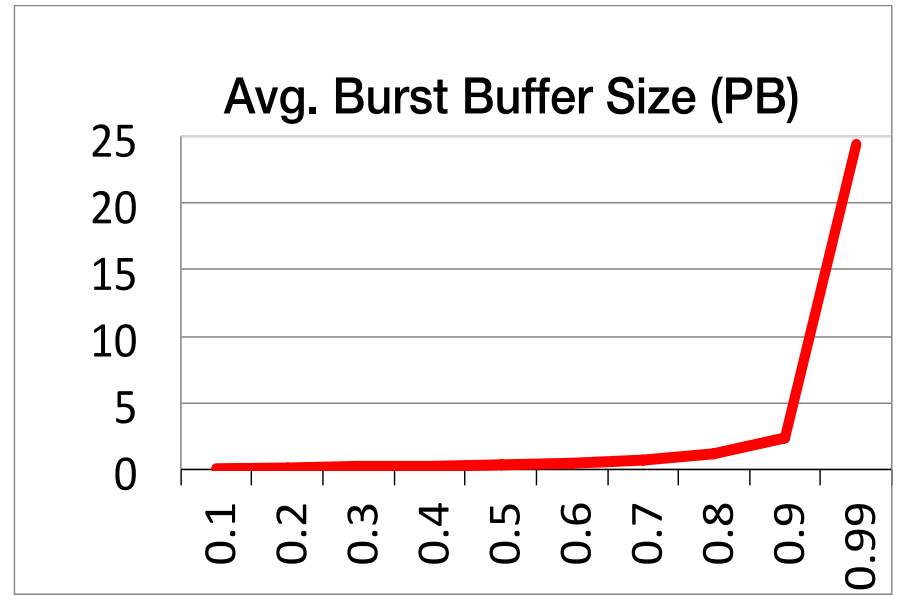
Queuing models suggest that avg. queue size (burst buffer size) increases exponentially with the increase in utilization

# SSDs as a burst buffer in HPC



Utilization =  $\lambda/\mu$

Output data size at once = 100TB

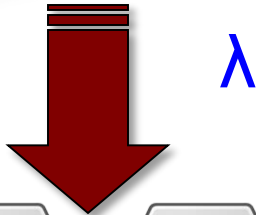


Utilization =  $\lambda/\mu$

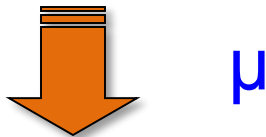
Output data size at once = 200TB

1-5 PB of SSD storage may suffice depending on the amount of data being produced at each step

# SSDs as a burst buffer in HPC



SSD Burst Buffer

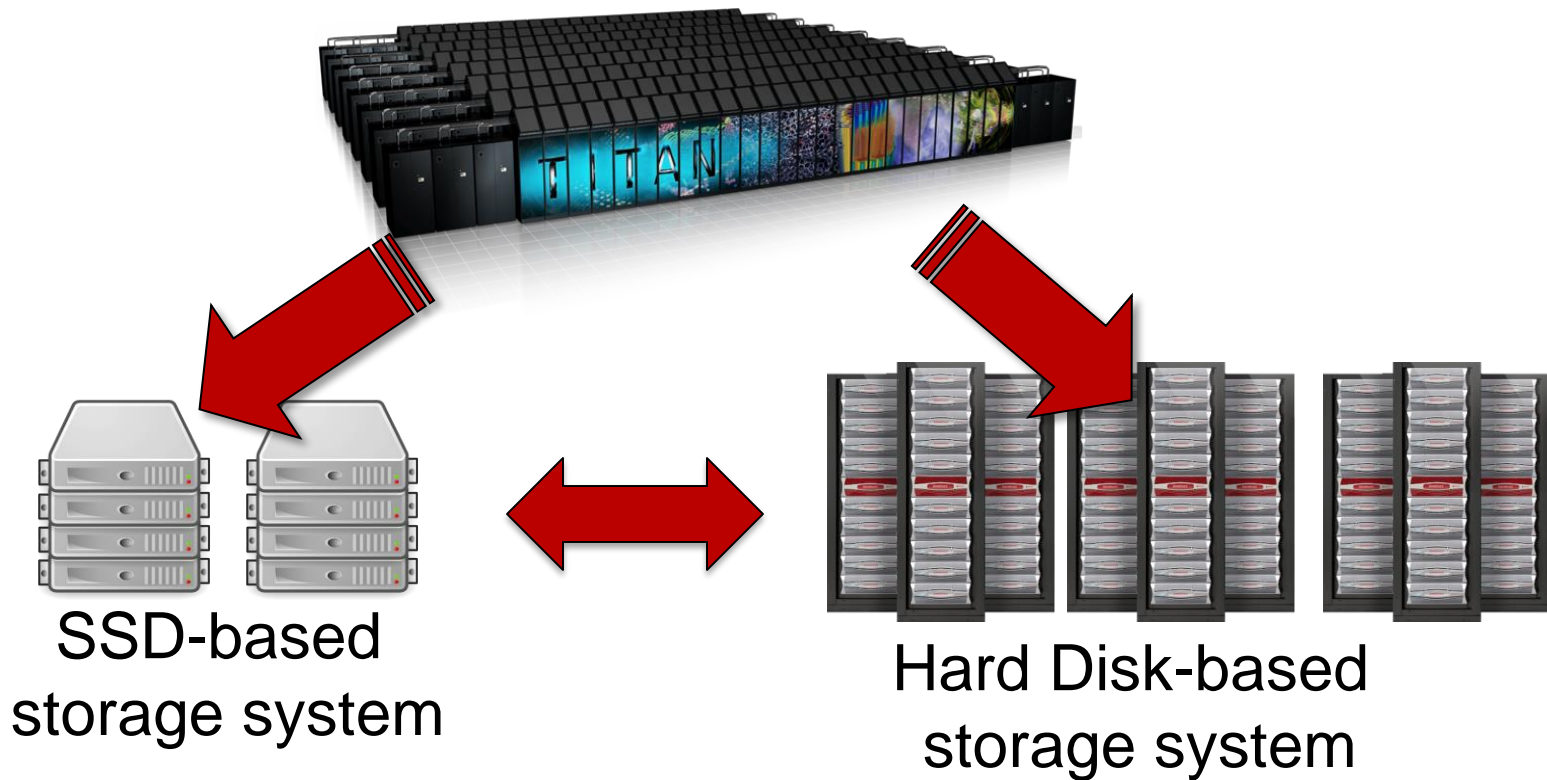


Permanent Storage

This model causes excessive data-movement

We are using SSDs for draining writes, something they are fundamentally not good at.

# SSD in Exascale System Architecture



Users will be charged differently for different kind of storage system they use

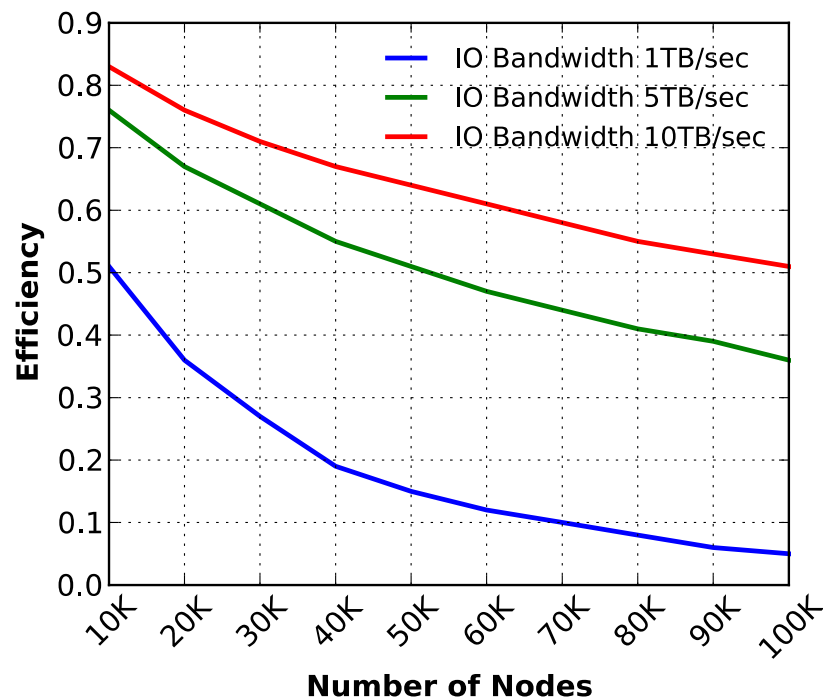
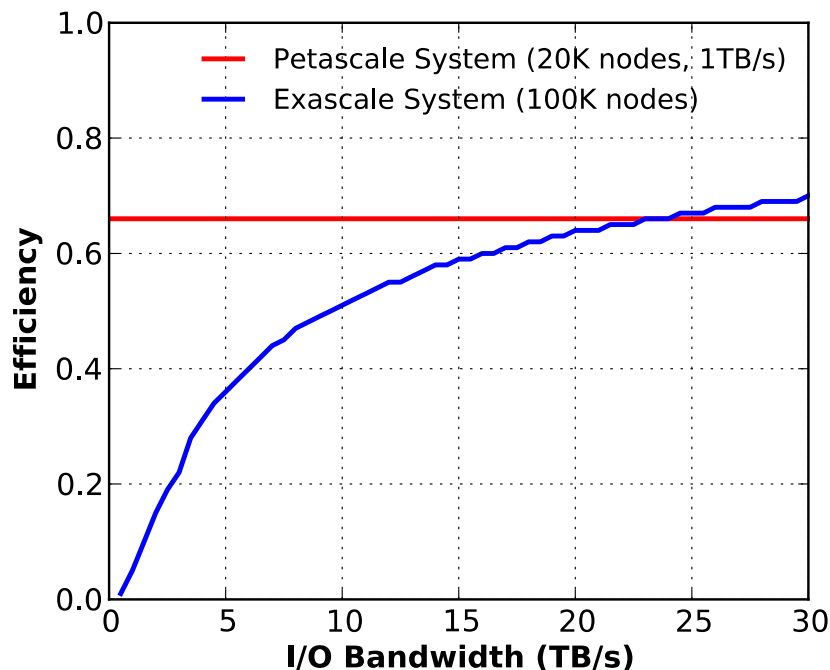
Disk system will become archival storage



Amount of waste work increases at larger scale system if we don't have a fast enough storage system to quickly take a checkpoint

Capital investment in more expensive storage system promises higher pay-off during operation

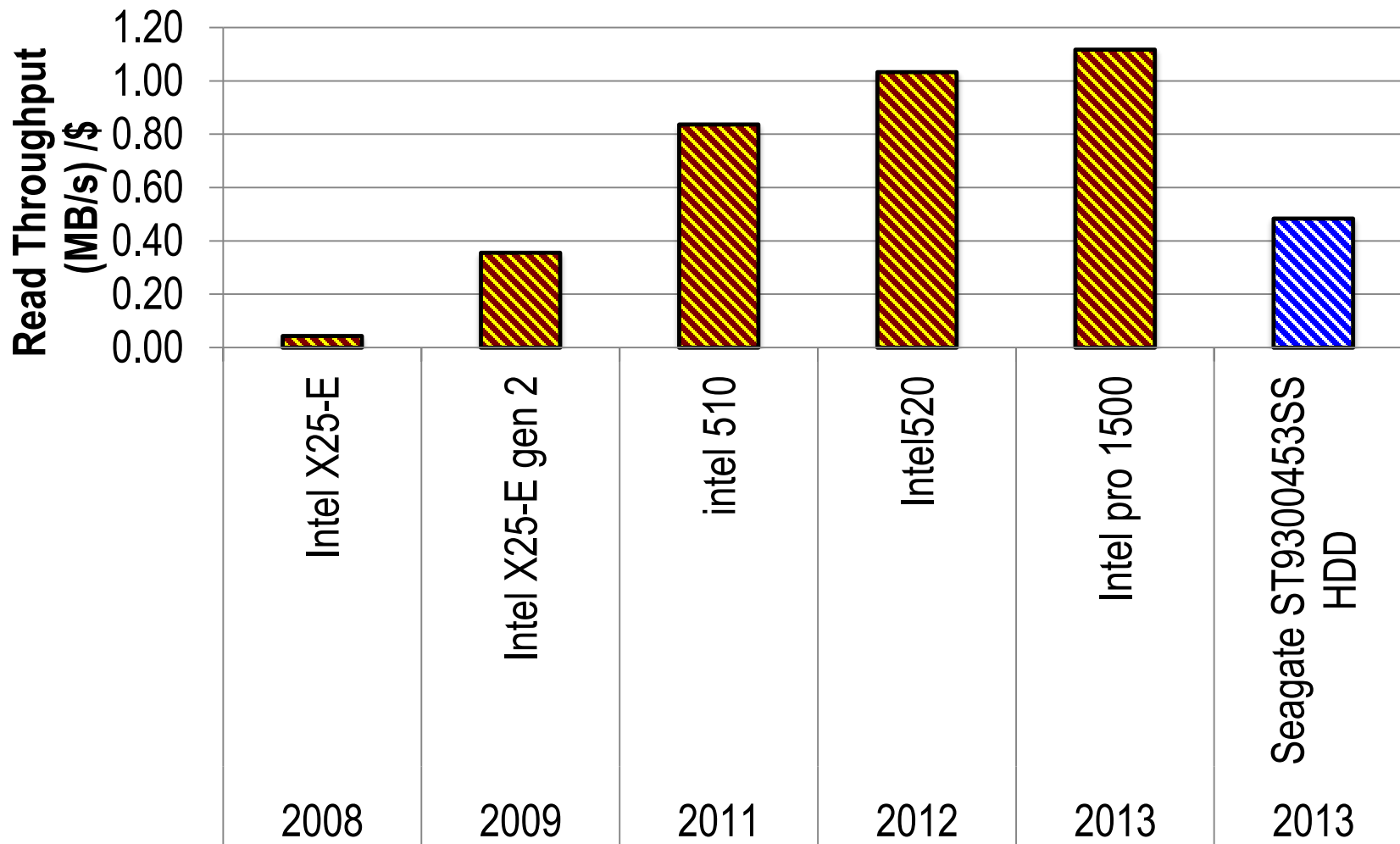
# Storage System Bandwidth



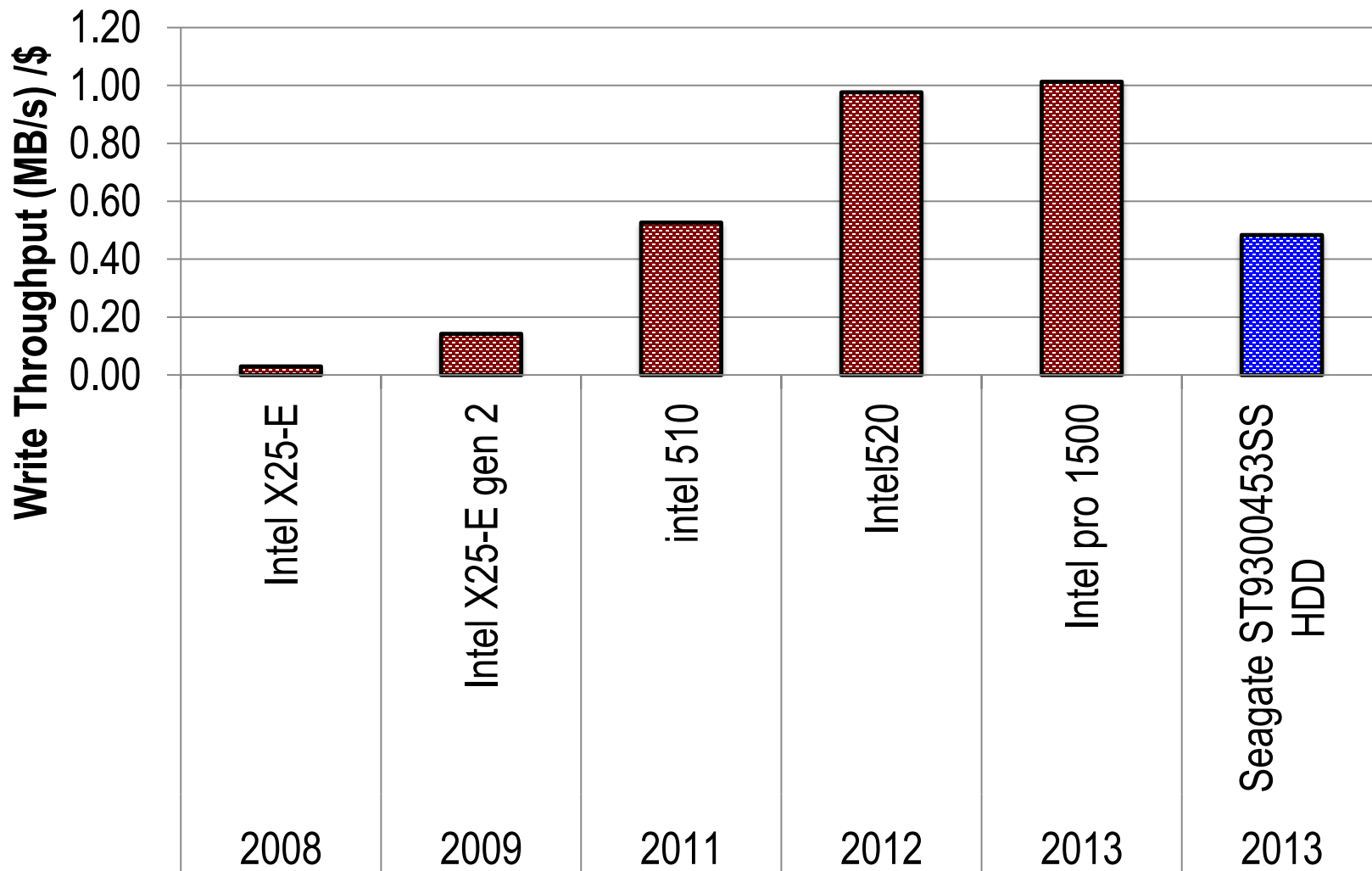
Storage system bandwidth determines the overall efficiency (i.e., amount of lost work due to failures)

Based on Daly's optimal checkpointing frequency (MTBF and time to checkpoint).

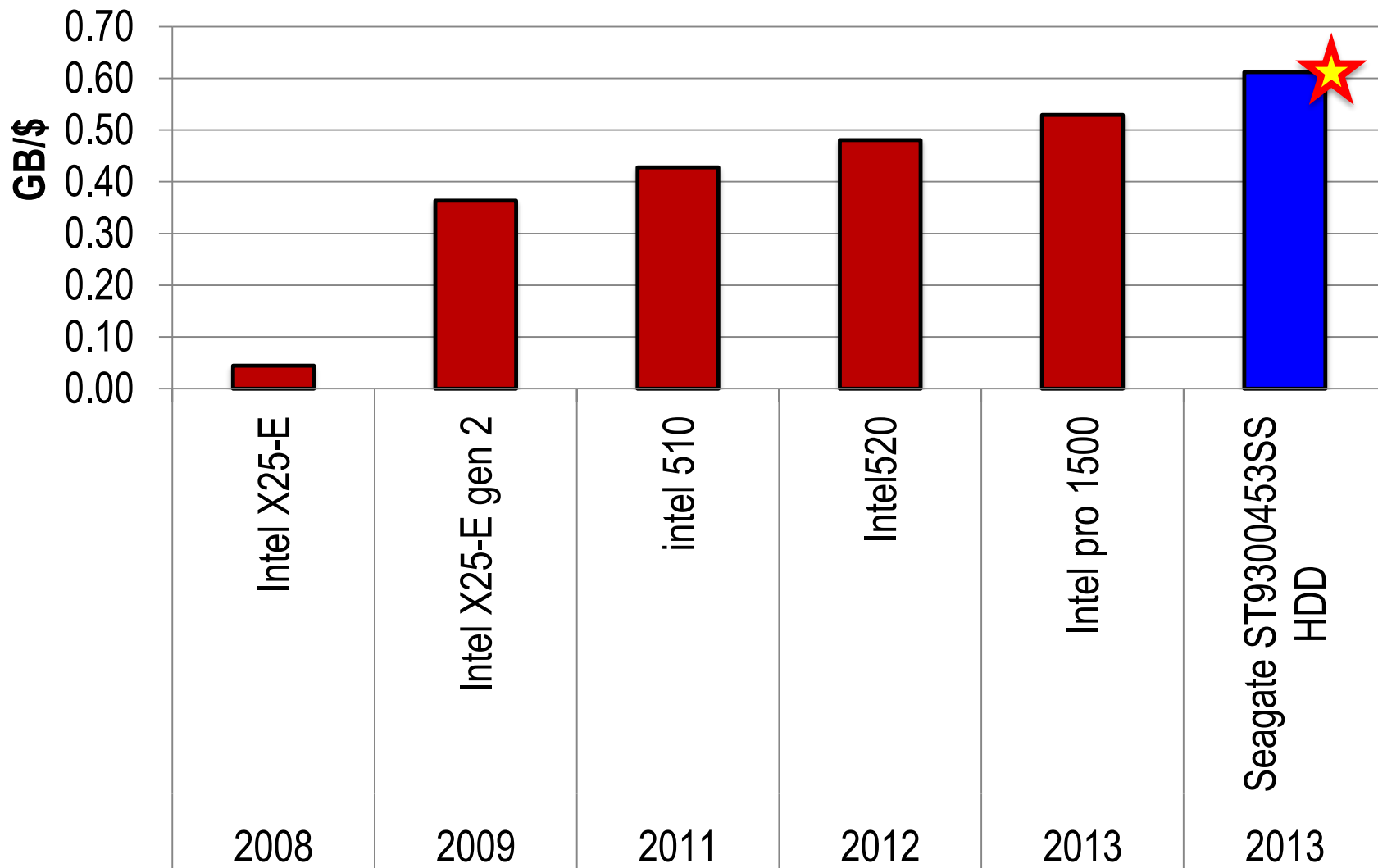
# SSD vs HDD



# SSD vs HDD



# SSD vs HDD



# Building a HPC Storage System

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Building blocks (cost factors):

SSD/Hard Disk

I/O Controller

JBOD I/O module

Enclosure

Power and cooling

RAID and firmware cost

Our preliminary study focuses on SSD/Hard disk and controllers costs.

# Building a HPC Storage System

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- HDD 1TB \$200, 4TB \$500, performance\* 200MB/s
- SSD 256GB \$250, 1TB \$1000, performance\* 500MB/s
- A pair of mid-scale controllers: throughput 8GB/s, \$8K
  
- Each shelf can hold up to 60 drives
- 40 hard-disks saturate one pair of controllers
- 16 SSDs saturate one pair of controllers

\*depends on the workload, lost on the route etc.

How to build a cost-effective high performance/high capacity HPC storage system?

# Building a HPC Storage System

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If planning to build a high capacity system:

GB/\$ for SSDs is too low

Controller and other components do not matter

Hard-disks tend to become cheaper as density increases,  
but not true for SSDs



# Building a HPC Storage System

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Building 10TB/s system\*

1280 pairs of controllers = ~\$10million

**Hard-disk based system** 1280\*40 (1TB) hard disks

disks cost =  $1280 * 40 * \$200 = \sim \$10\text{million}$

capacity = 50 PB, total cost = ~\$20million

**SSD based system** 1280\*40 (1TB) hard disks

disks cost =  $1280 * 16 * \$250 = \sim \$5\text{million}$

capacity = 5 PB, total cost = ~\$15million

\*numbers here only represent the trend, and are not (un)official quotes from WarpMechanics

# Building a HPC Storage System

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Controller cost very important factor in deciding the total capital cost of the system

This is fundamentally different from enterprise computing that focuses on per drive IOPS

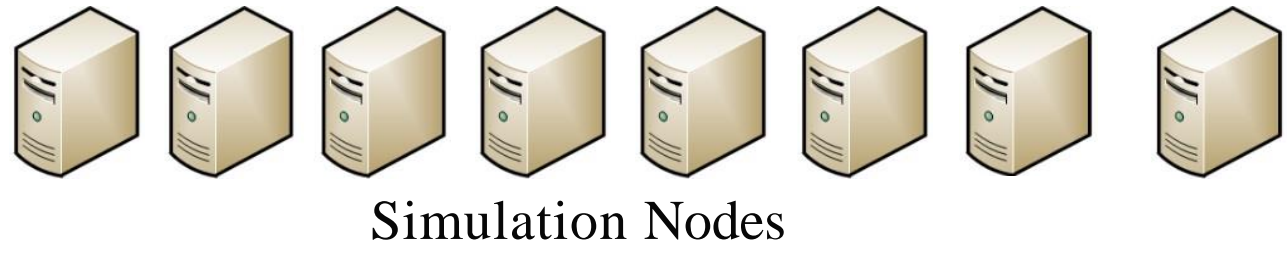
Need to account firmware, and other hardware cost

On-going work: workload characterization to explore a hybrid storage system, random vs. sequential performance, Lustre and RAID overhead etc.

# What else can SSDs do for us?

Tiwari et al., Active Flash: Towards Energy-Efficient, In-Situ Data Analytics on Extreme-Scale Machines, USENIX FAST 2013.

# Traditional Scientific Data Analysis Approach

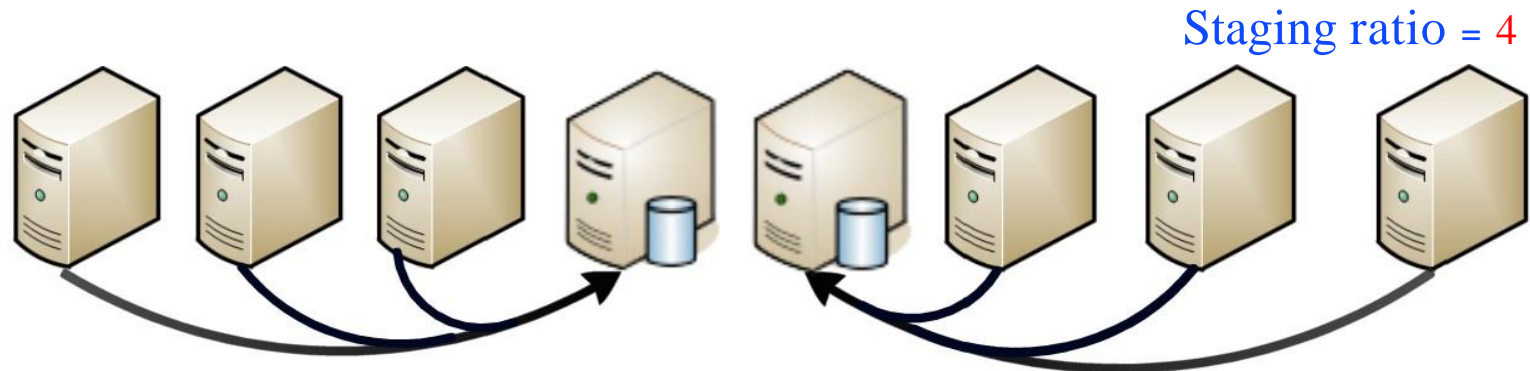


Regex matching,  
statistics collection,  
clustering,  
compression, etc.

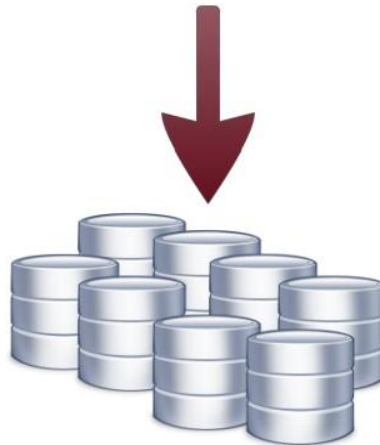
"Energy-cost for data movement at Exascale is likely to be of the same order of computation cost, if not more!"

-- Exascale Computing Study, 2008  
Principle Investigator: Peter Kogge

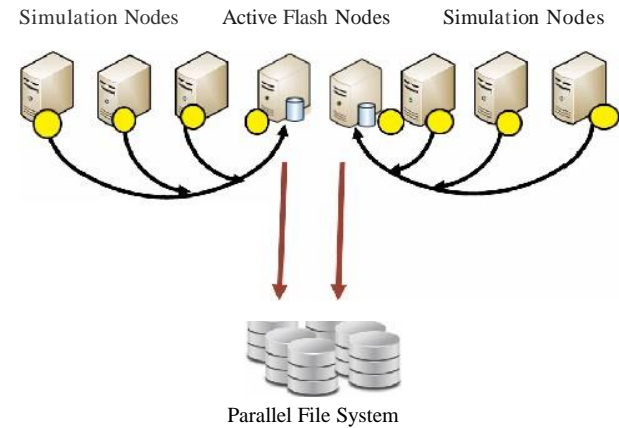
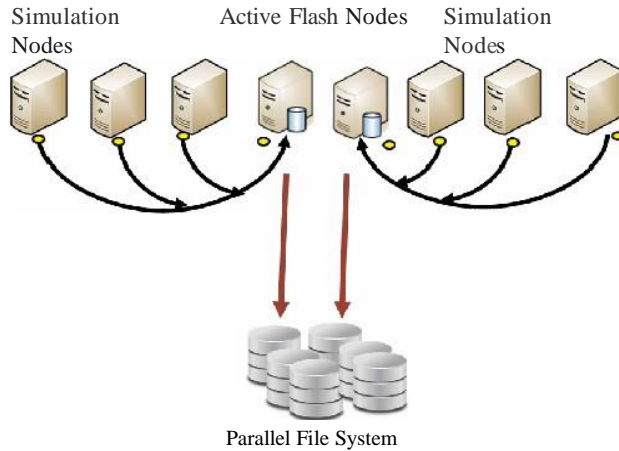
# Active Computation on SSDs



Scientific data analysis performed on SSD controllers in-parallel with simulation without affecting it



Parallel File System



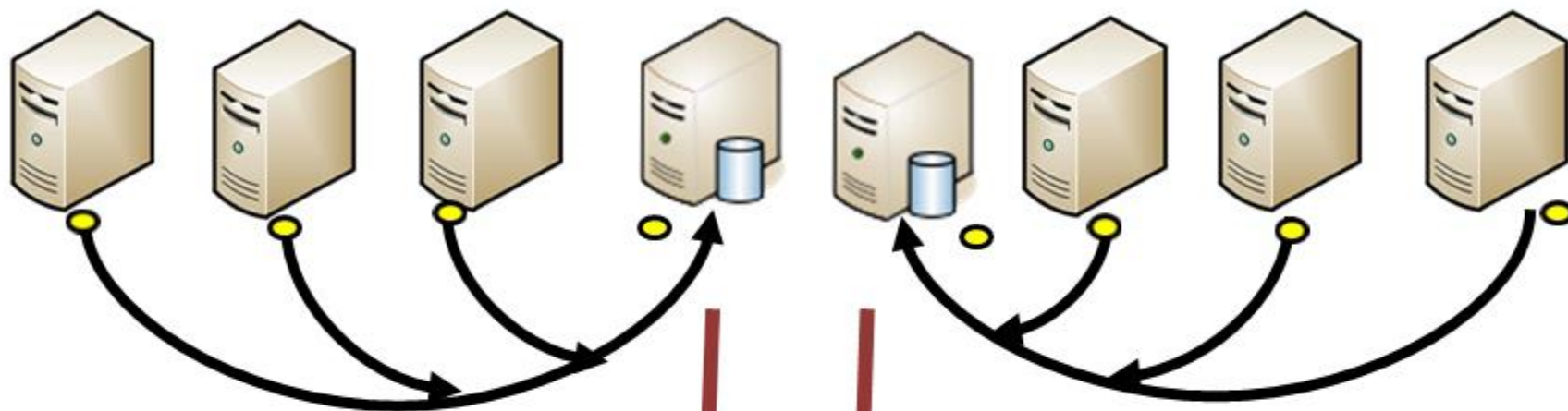
**An analysis kernel needs to meet a "threshold compute throughput" to be placed on SSD controllers**


$$T_{SSD\_k} > \frac{\lambda_a \cdot R_{SSD}}{1 - \lambda_a \cdot R_{SSD} \cdot \left( \frac{1}{BW_{fm2c}} + \frac{1}{BW_{c2m}} \right) - \frac{N \cdot (\alpha \cdot \lambda_a + \lambda_c)}{BW_{PFS}} - \frac{t_i}{t_{iter}}}$$


Simulation Nodes

Active Flash Nodes

Simulation Nodes



 Simulation Output (per unit time)

 Data Analysis Kernel  
(high compute intensive)  
Low compute throughput

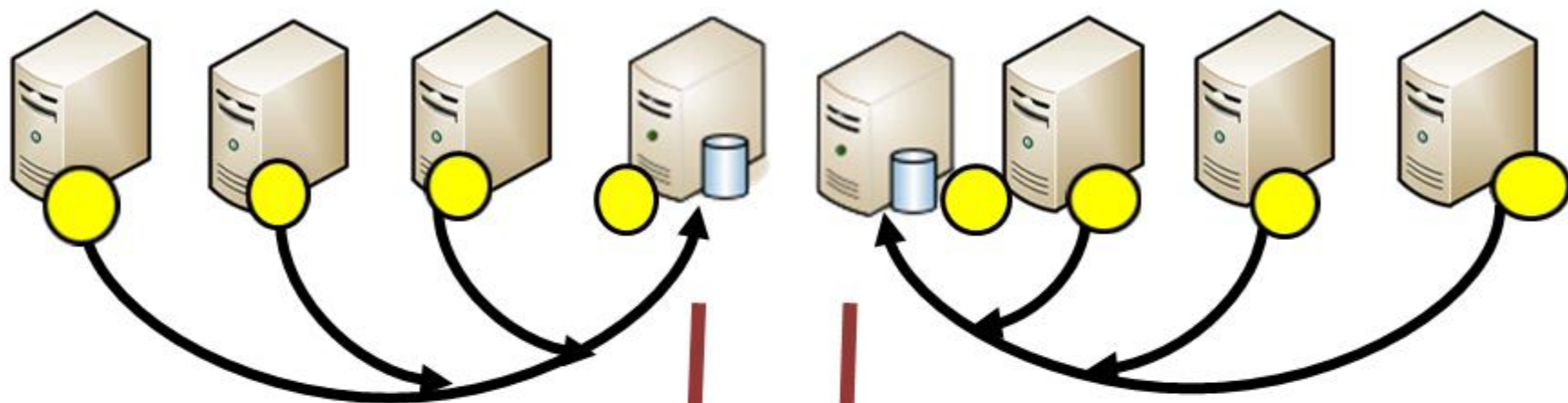
Parallel File System





Simulation Nodes

Active Flash Nodes

Simulation Nodes

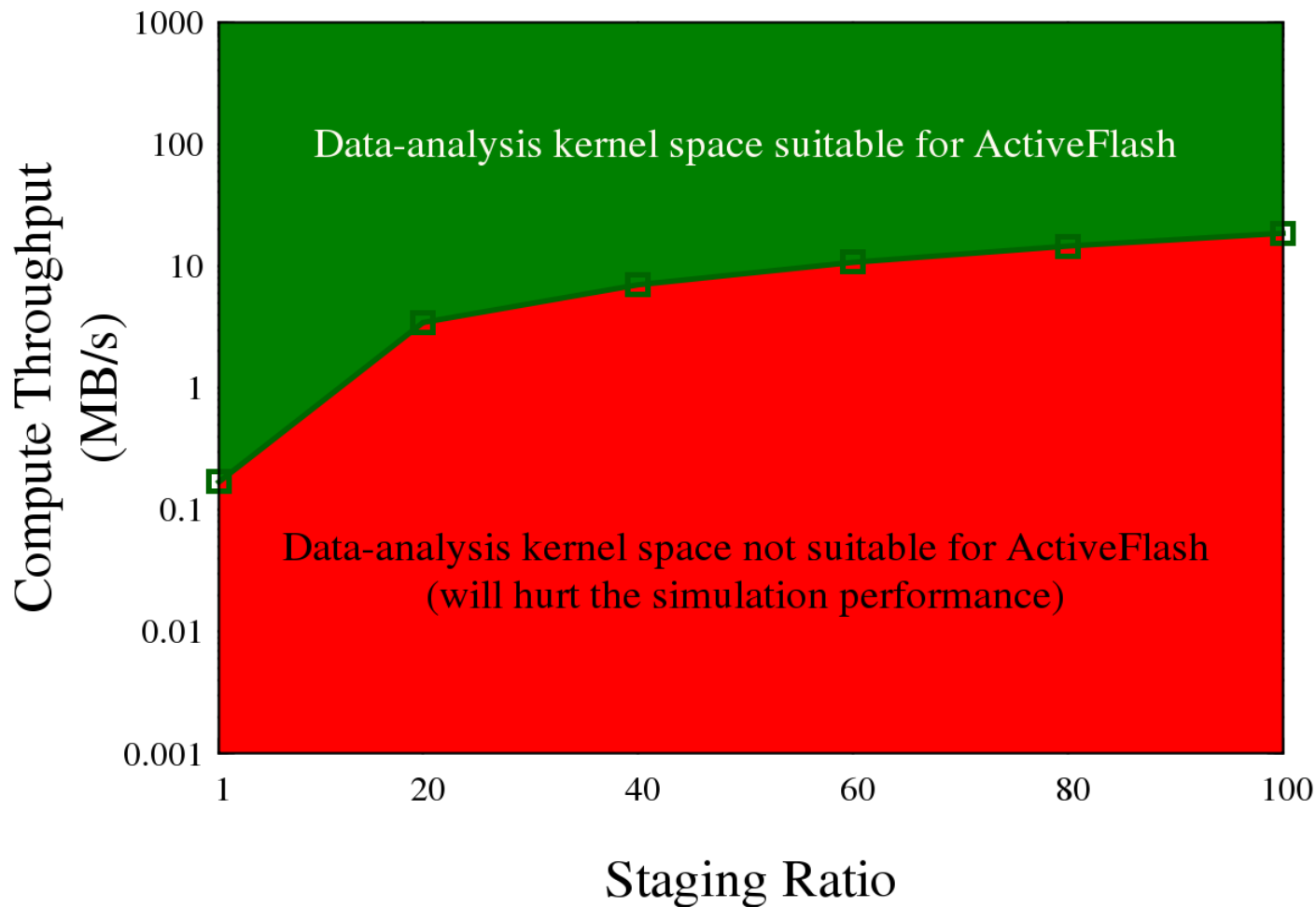


 Simulation Output (per unit time)

 Data Analysis Kernel  
(less compute intensive)  
High compute throughput

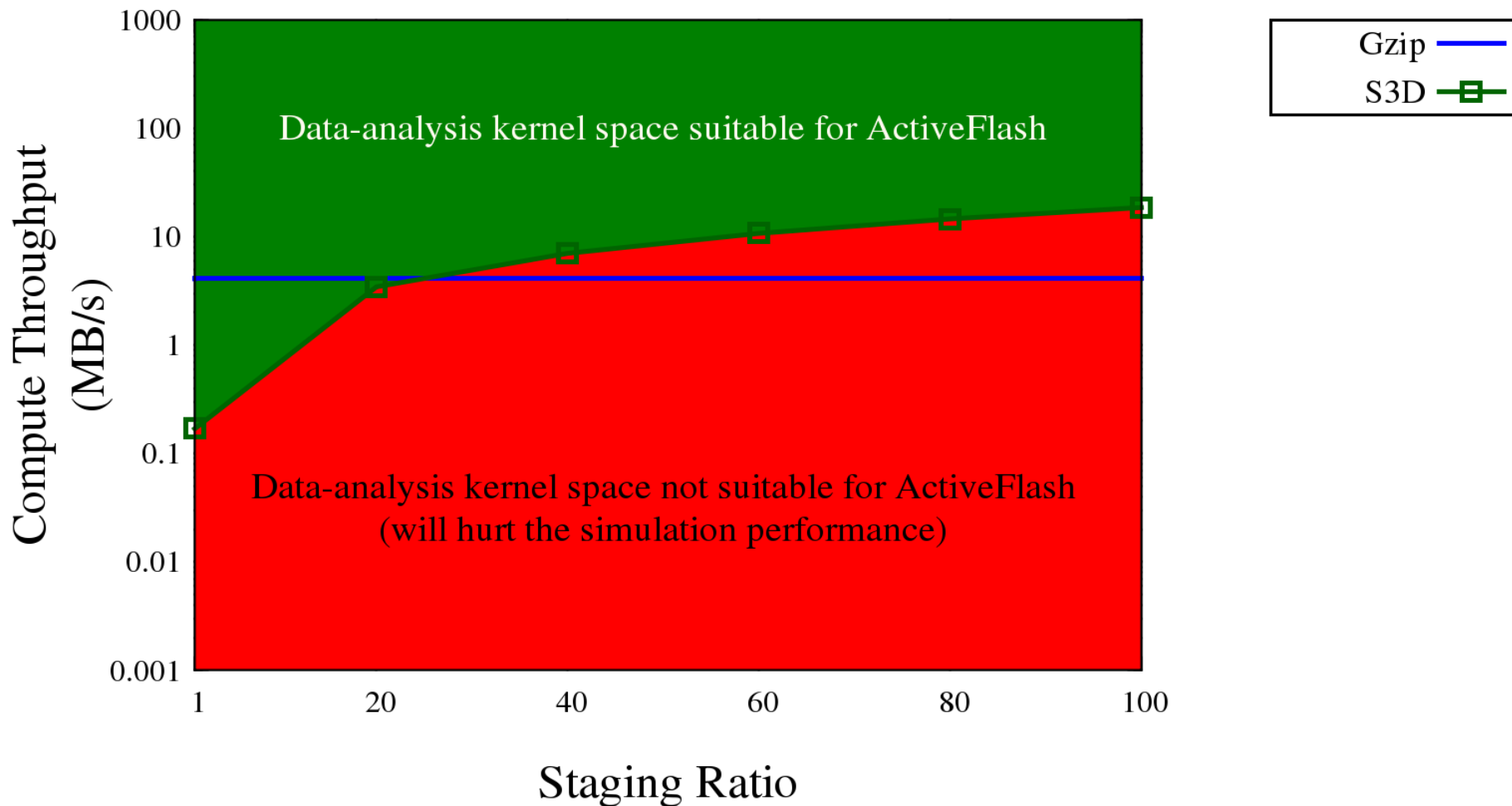
Parallel File System

# Feasibility of Active Flash Approach

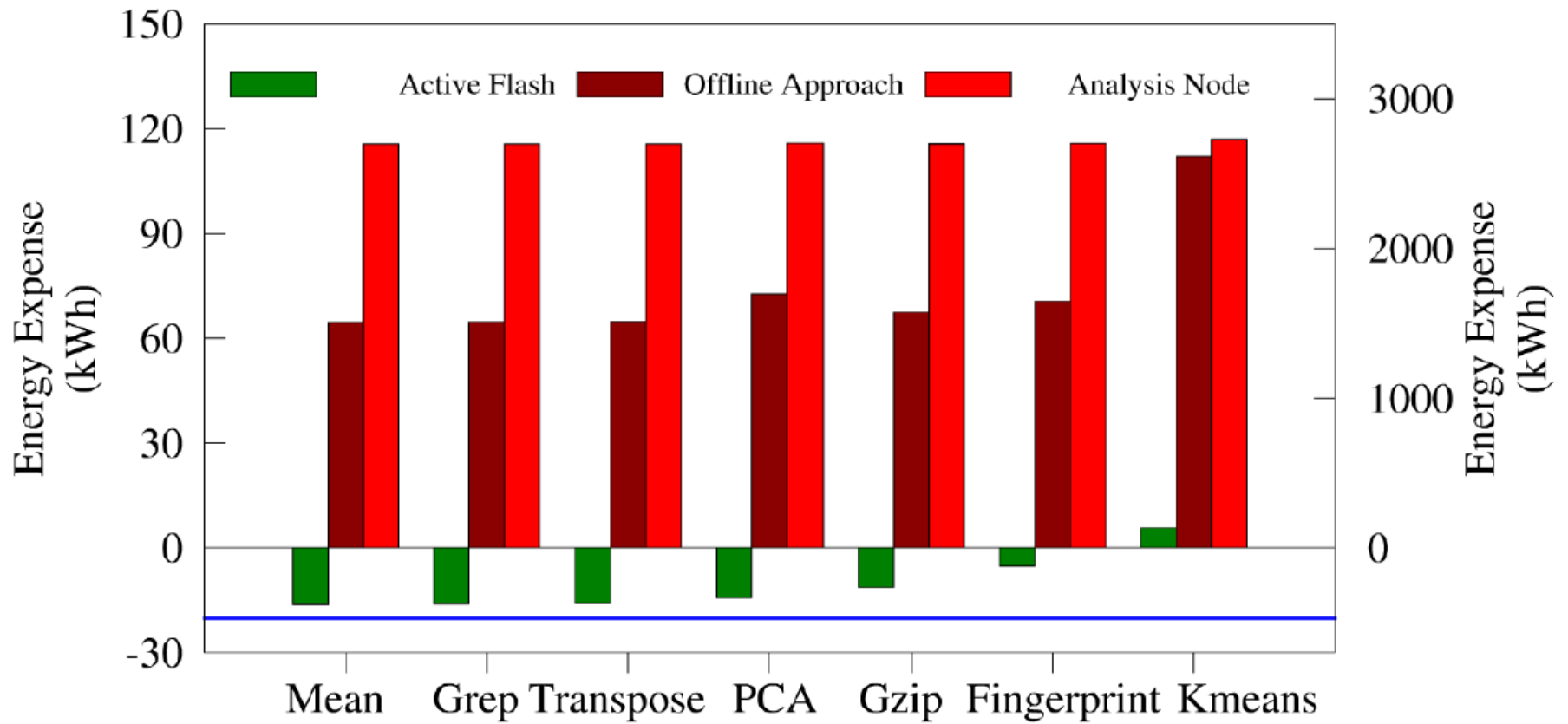


S3D

# Feasibility of Active Flash Approach



## Application: POP



**Finding:** Most data analysis kernels  
can be placed on SSD controllers  
without degrading simulation  
performance

Tiwari et al., Active Flash: Towards Energy-Efficient, In-Situ Data Analytics on Extreme-Scale Machines, USENIX FAST 2013.

**Finding:** Additional SSDs are not required for supporting in-situ data analysis on SSDs, beyond what is needed for sustaining the I/O requirements of scientific applications

Tiwari et al., Active Flash: Towards Energy-Efficient, In-Situ Data Analytics on Extreme-Scale Machines, USENIX FAST 2013.

# ActiveFlash Prototype based on OpenSSD Platform

Prototype demonstrates the viability of our approach

Changes only in the FTL, no hardware changes

Preemption based scheduling

See USENIX paper for the details and evaluation results

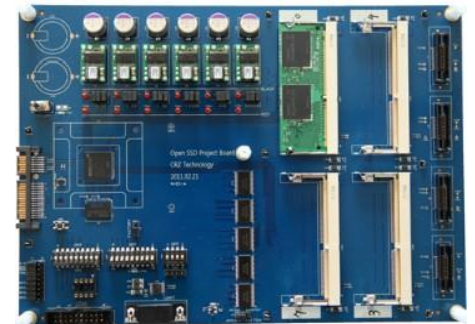
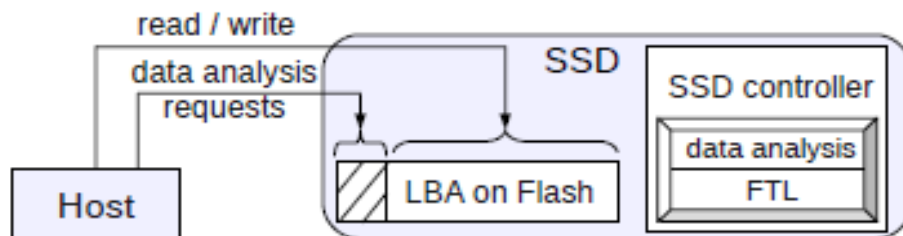


Figure courtesy: open-ssd project



# Contact

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