

# Checkpointing and Lustre

Kento Sato

*Tokyo Institute of Technology*



# Outline

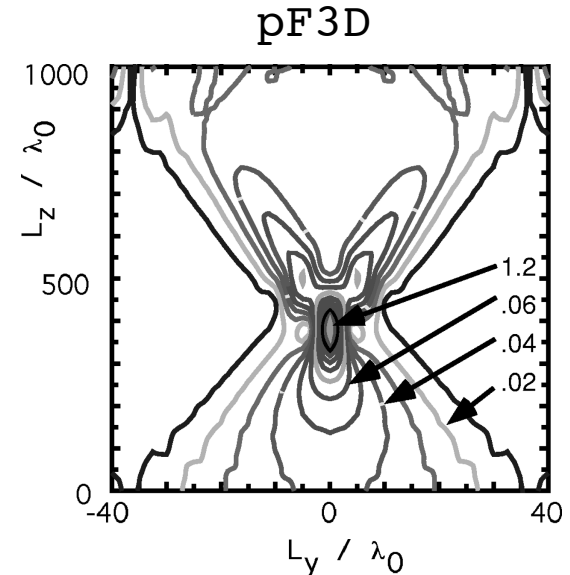
- Failures on HPC systems
- Challenges on Checkpoint/Restart
- Two approaches
  - Multi-level Checkpoint/Restart
  - Storage design
- Summary

# Failures on HPC systems

- System resiliency is critical for future extreme-scale computing
- 191 failures out of 5-million node-hours
  - A production application: Laser-plasma interaction code (pF3D)
  - Hera, Atlas and Coastal clusters @LLNL

Estimated MTBF (If no hardware reliability improvement)

	1,000 nodes	10,000 nodes	100,000 nodes
MTBF	1.2 days	2.9 hours	17 minutes



Source: Berger, R. L., Still, C. H., Williams, E. A. and Langdon, A. B.: On the Dominant and Subdominant Behavior of Stimulated Raman and Brillouin Scattering Driven by Nonuniform Laser Beams (Physics of Plasmas 1998)



- Difficult to continuously run for a long time without fault tolerance

# Checkpoint/Restart

XOR  
checkpoint

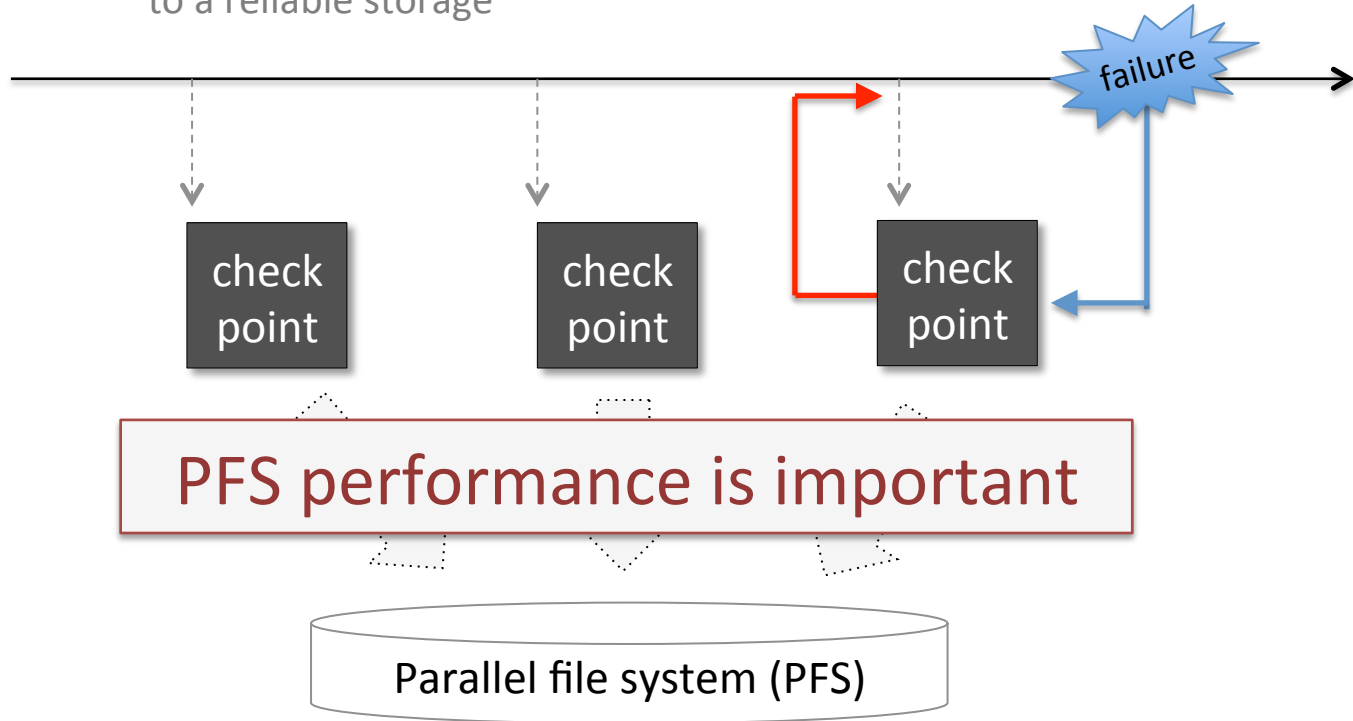
PFS  
checkpoint

## Checkpoint

Periodically save a snapshot of an application state to a reliable storage

## Restart

On a failure, restart the execution from the latest checkpoint

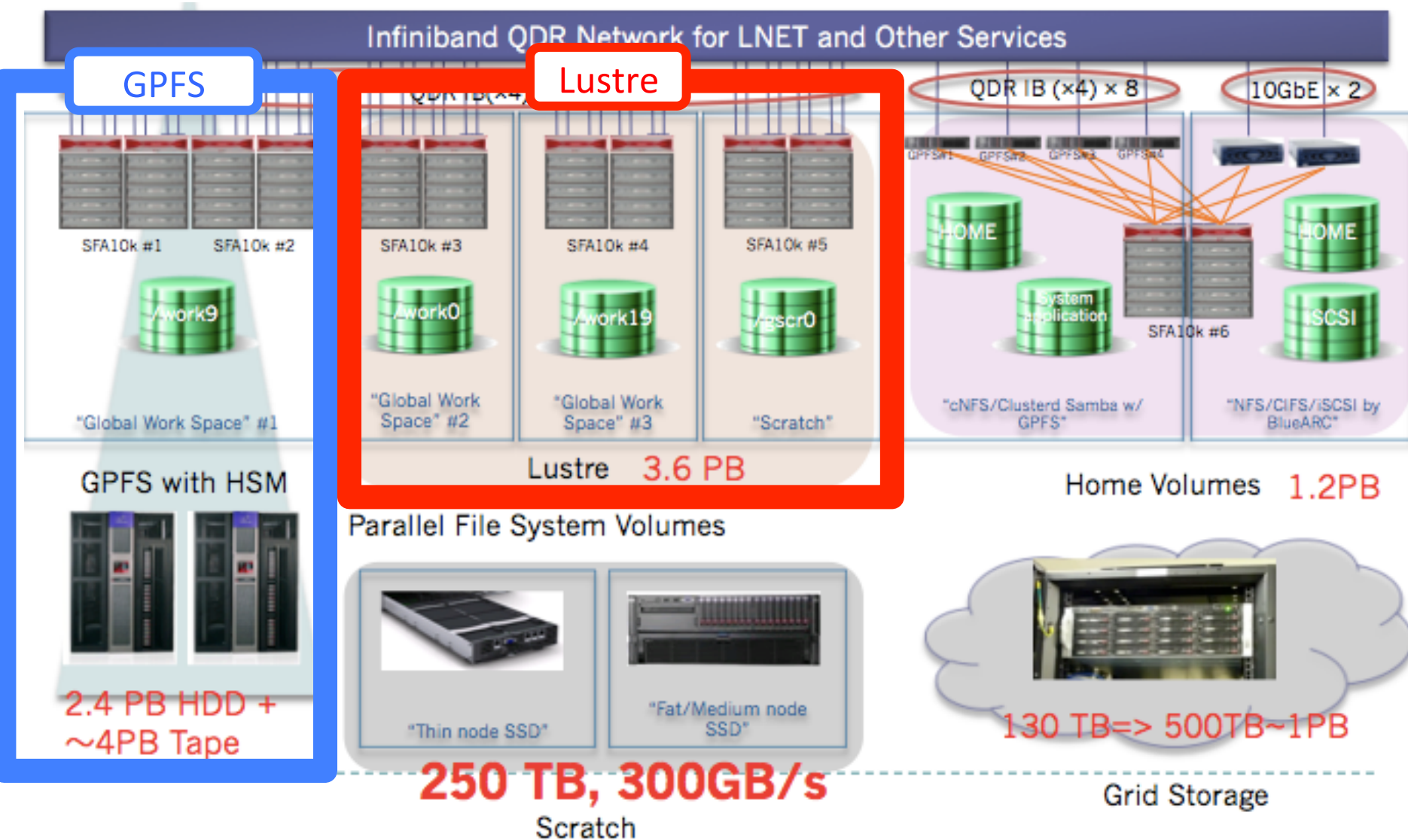


Mostly these checkpoints are stored in a PFS



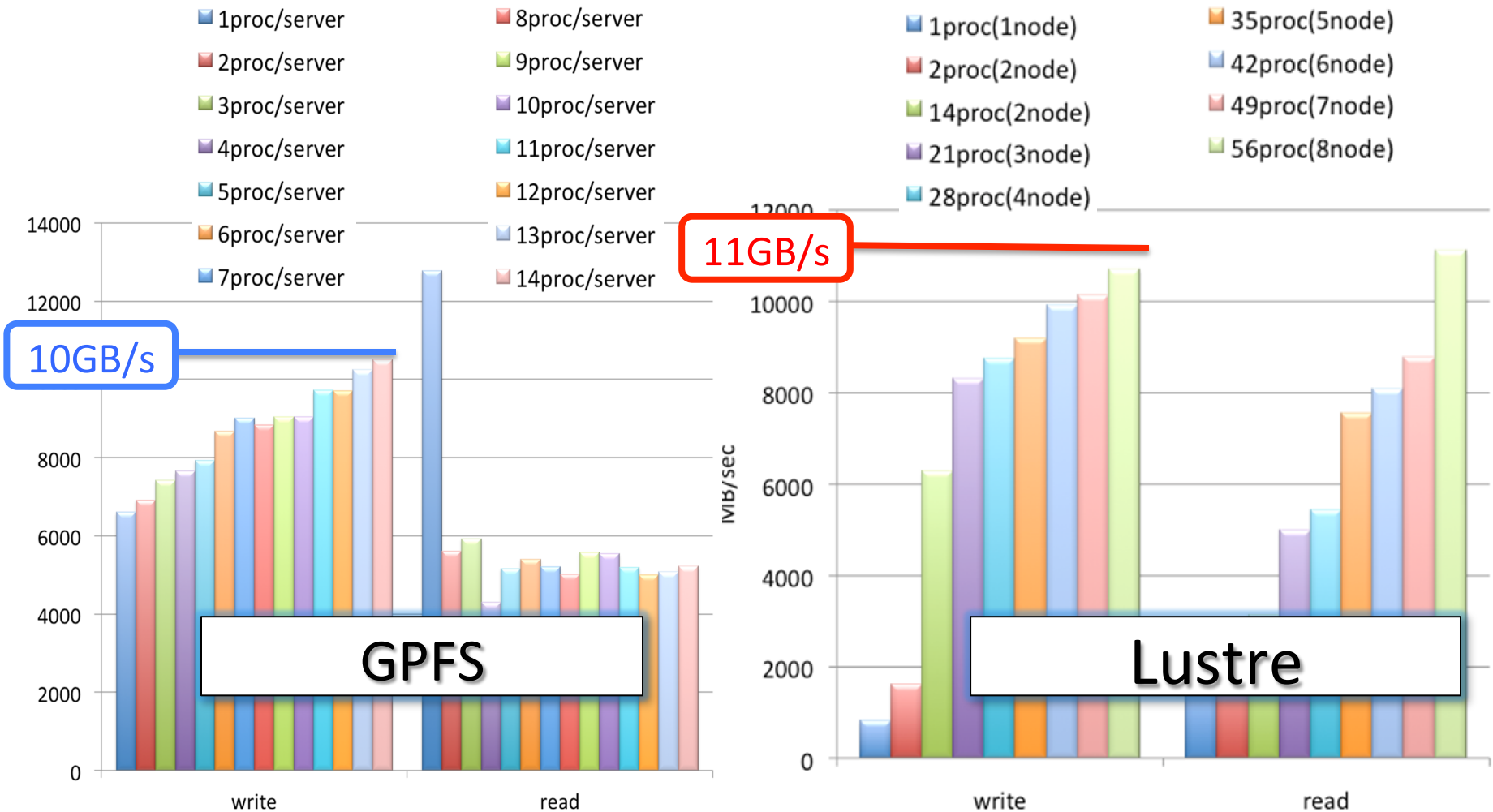
# TSUBAME2.0/2.5 Storage Overview

TSUBAME2.0 Storage 11PB (7PB HDD, 4PB Tape)



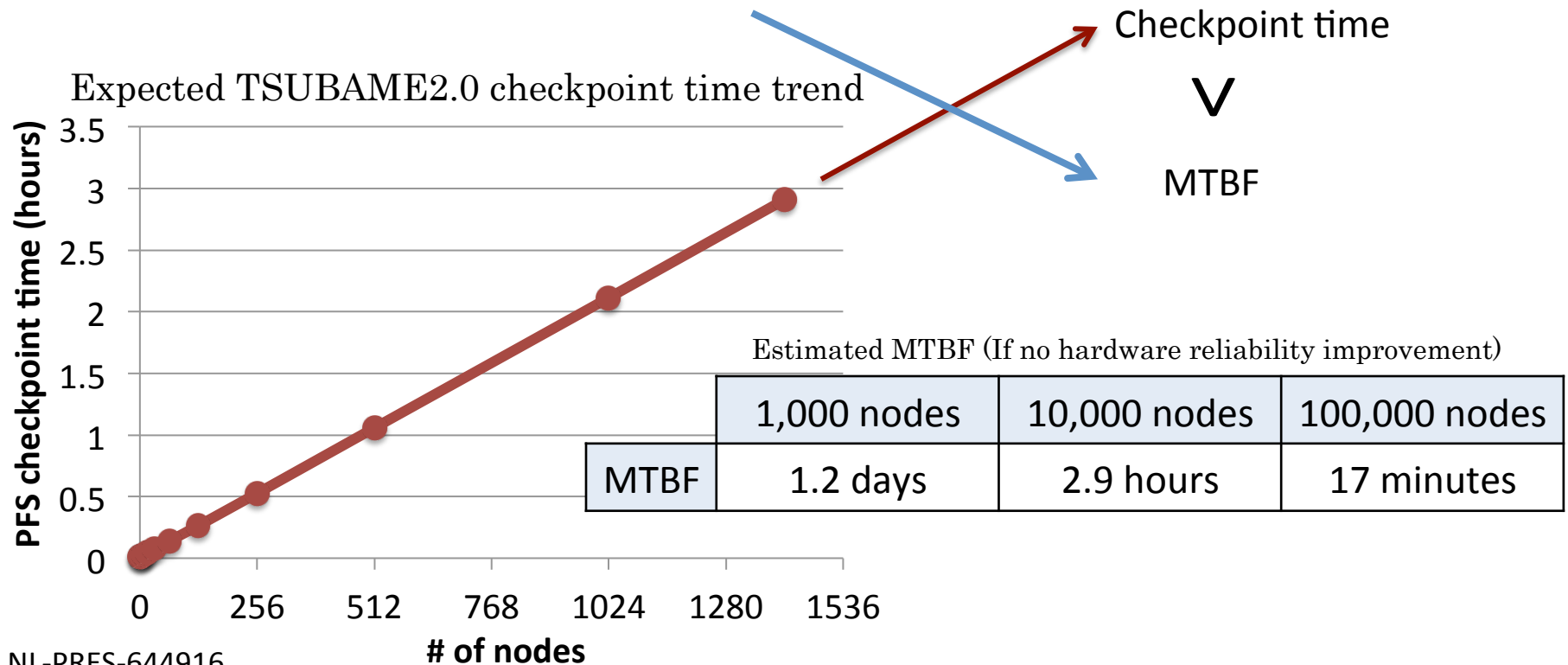
# TSUBAME2.0 PFS Performance

- checkpoint & restart -



# HPC applications require more bandwidth

- We scale out the system, Both checkpointing time and failure rate increases



# For fast checkpointing

- Buy many & fast PFSs



# 10 Lustre file systems at LLNL

- DOE applications sometimes run for days or weeks

OCF File System	1TB/s	70PB	OSS Nodes	OSTs
	Bandwith (GB/s)	Capacity (PB)		
Iscratchrb	18	1.2	16	16
Iscratchc	40	1.8	32	480
Iscratchd	50	2	40	600
Iscratche	18	1.2	16	16
Iscratchv	106	6.7	96	96
SCF File System	Bandwith (GB/s)	Capacity (PB)	OSS Nodes	OSTs
Iscratch1	850	53	768	768
Iscratch2	70	2.7	56	840
Iscratch4	60	2.3	48	720
Iscratch5	80	3.4	64	960
Iscratch6	32	2.4	32	96

# 10 Lustre file systems at LLNL

OCF Maximum Lustre Bandwidths (GB/s)				
OCF System (CZ)	Iscratchc	Iscratchd	Iscratche	Iscratchv*
Ansel	12	12	18	10
Aztec	.125	.125	.125	.125
Cab	40	20	18	10
Edge	10	10	18	10
Herd	1.25	1.25	1.25	1.25
OSLIC	1.25	1.25	1.25	1.25
Sierra	40	20	18	10
Vulcan	–	–	–	106

SCF Maximum Lustre Bandwidths (GB/s)					
SCF System	Iscratch1*	Iscratch2	Iscratch4	Iscratch5	Iscratch6
Coastal	40	15	40	40	32
CSLIC	1.25	1.25	1.25	1.25	1.25
Graph	15	20	15	15	15
Inca	.125	.125	.125	.125	.125
Juno	40	15	40	40	32
Muir	40	15	40	40	32
Sequoia	850	–	–	–	–
Zin	100	15	60	80	32

OCF System (RZ)	Iscratchrzb
RZMerl	18
RZCereal	10
RZGPU	12
RZSLIC	1.25
RZuSeq	12
RZZeus	10

- 22 systems shares 10 Lustre
  - Unstable performance
- Sequoia checkpointing time
  - 1.5 PB memory / 850  $\approx$  5 hours

# For fast checkpointing

- Buy many & fast PFSs

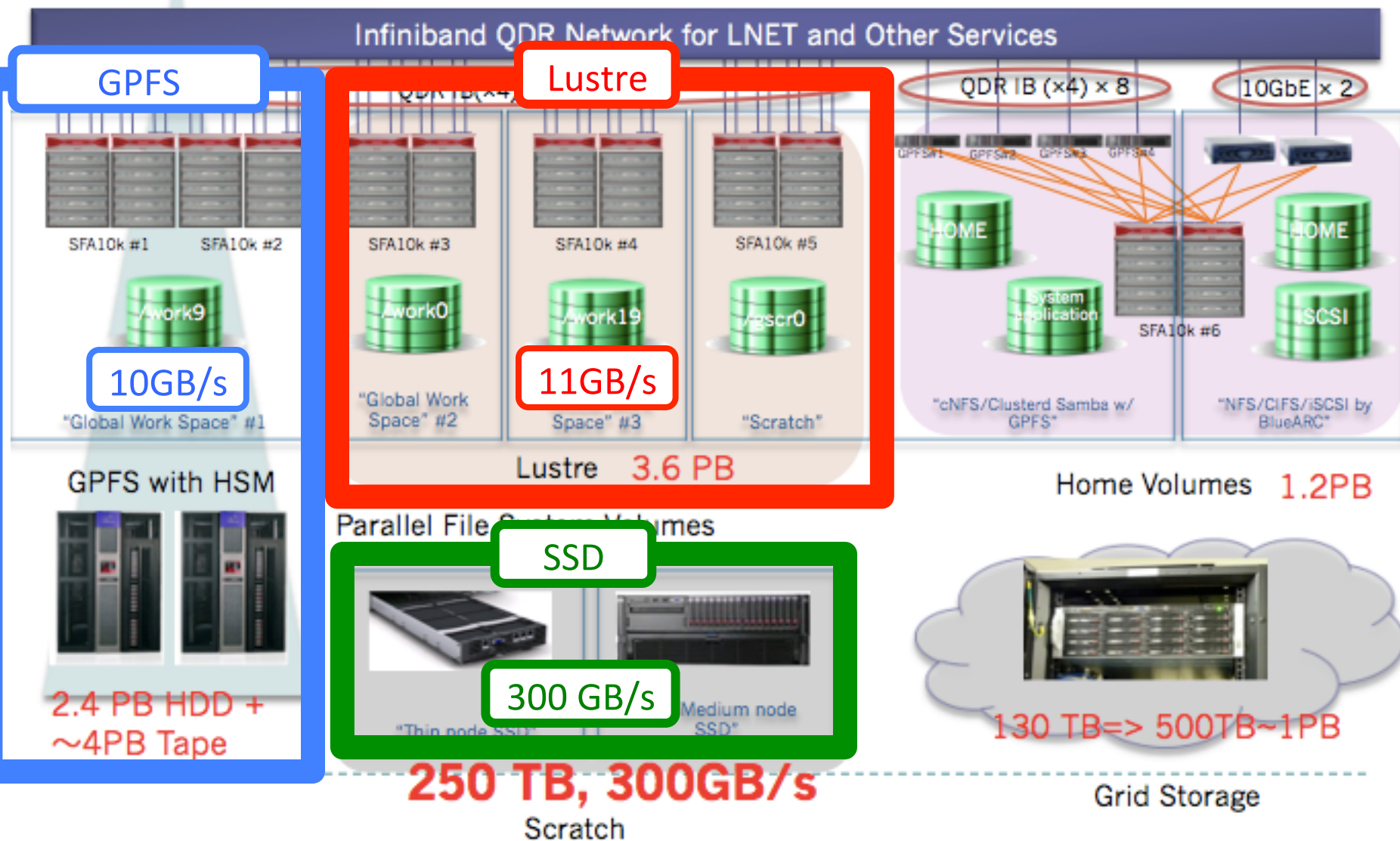


- Local storage



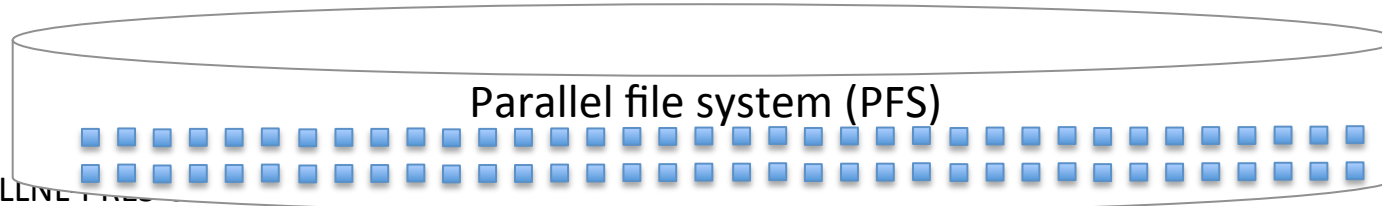
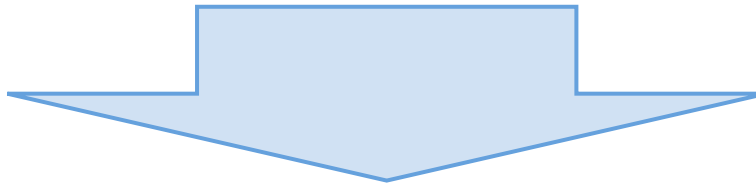
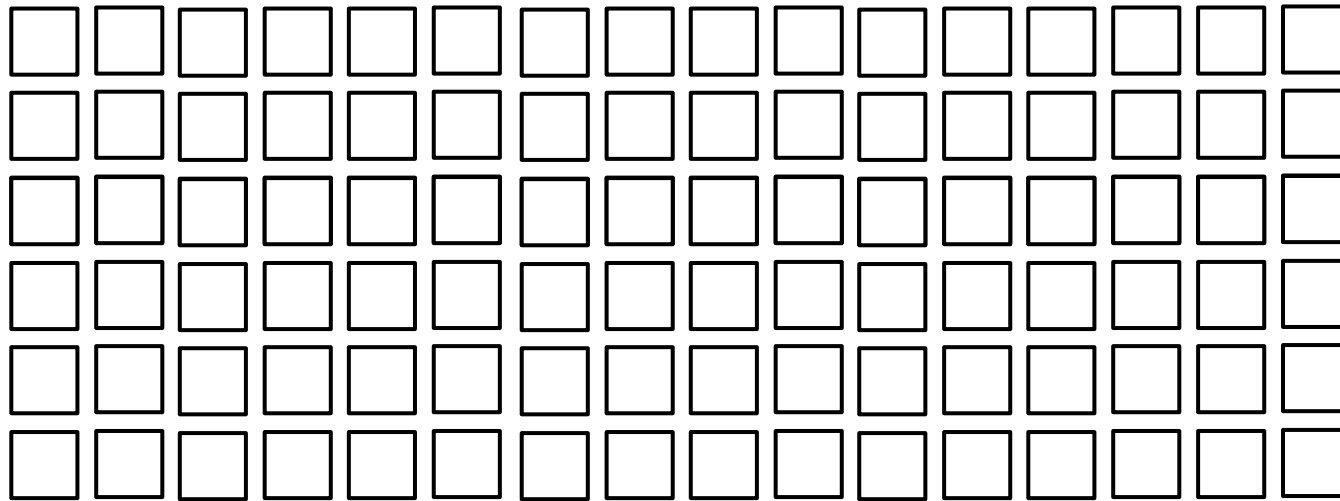
# TSUBAME2.0 & 2.5 Storage Overview

TSUBAME2.0 Storage 11PB (7PB HDD, 4PB Tape)

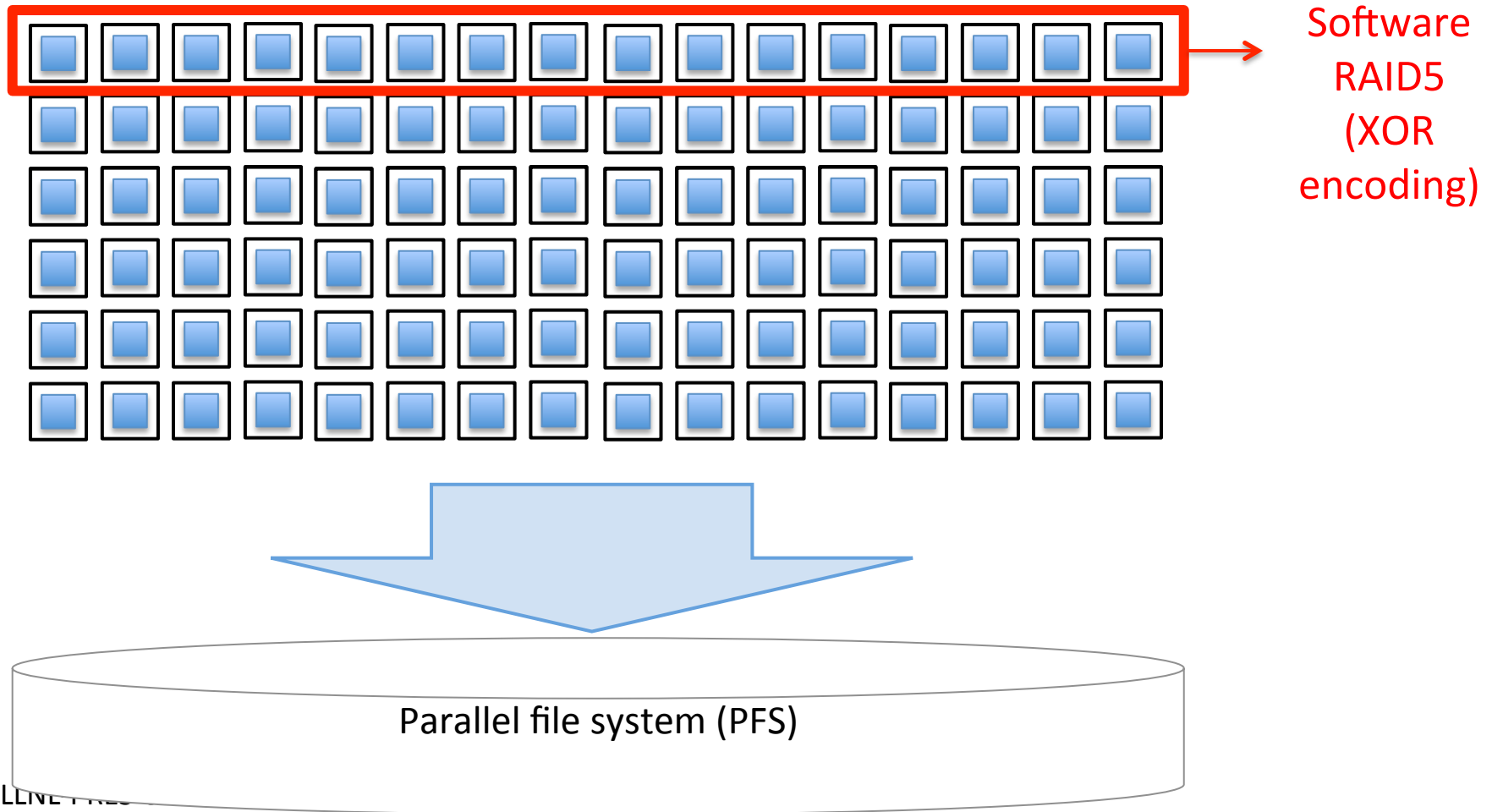




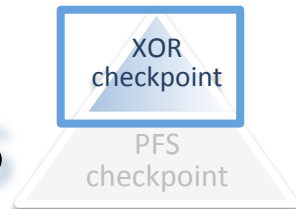
# Checkpointing to Local-storage



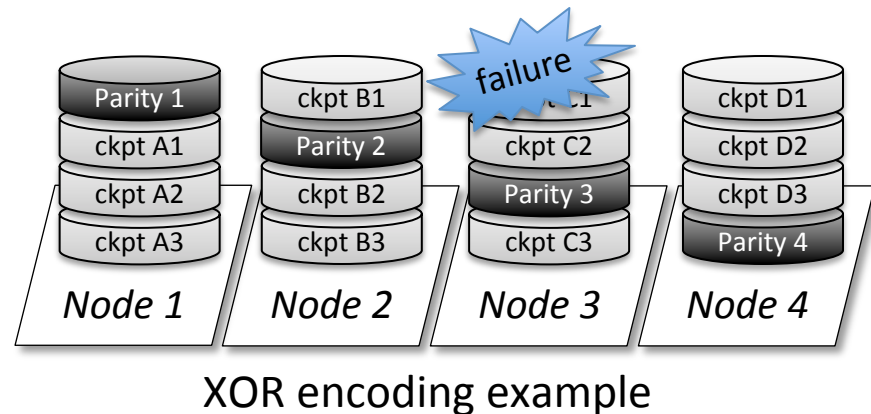
# Checkpointing to Local-storage



# Scalable checkpointing methods



- Diskless checkpoint:
  - Create redundant data across local storages on compute nodes using an encoding technique such as XOR
  - Can restore lost checkpoints on a failure caused by small # of nodes like RAID-5

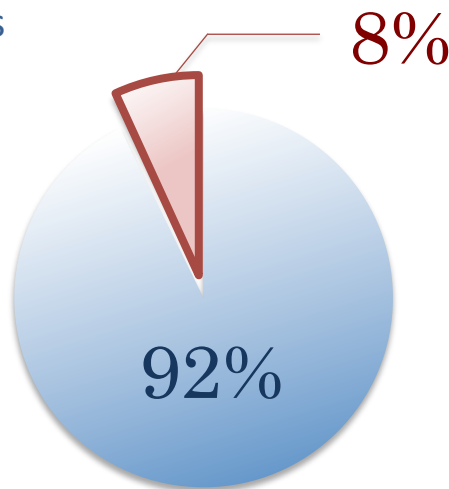


- Most of failures comes from one node, or can recover by XOR checkpoint
  - e.g. 1) TSUBAME2.0: 92% failures
  - e.g. 2) LLNL clusters: 85% failures

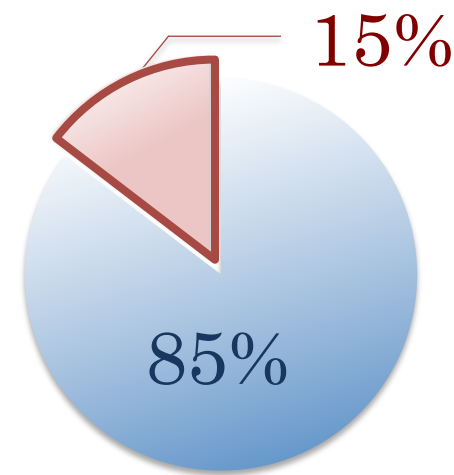
Rest of failures still require a checkpoint on a reliable PFS

LOCAL/XOR/PARTNER checkpoint  
PFS checkpoint

Diskless checkpoint is promising approach

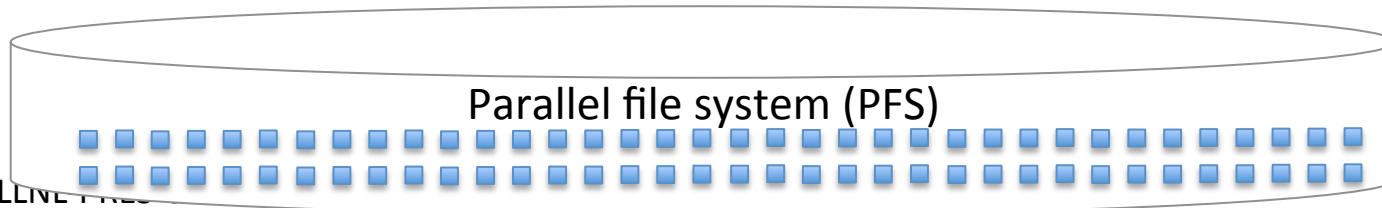
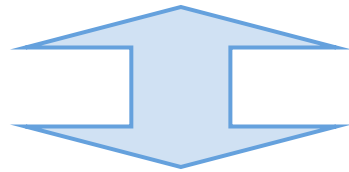
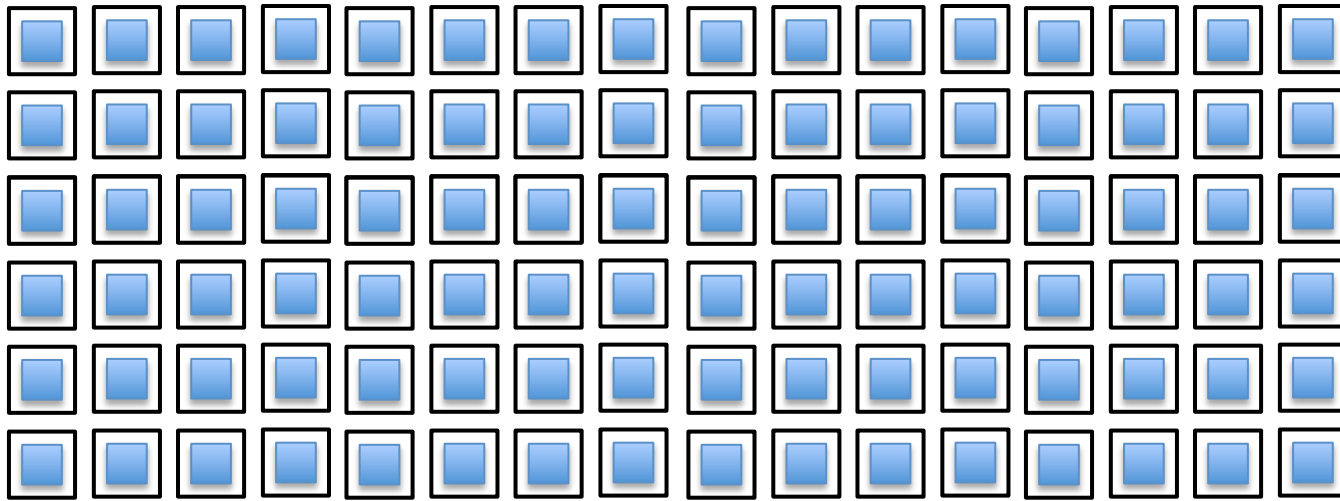


Failure analysis on TSUBAME2.0

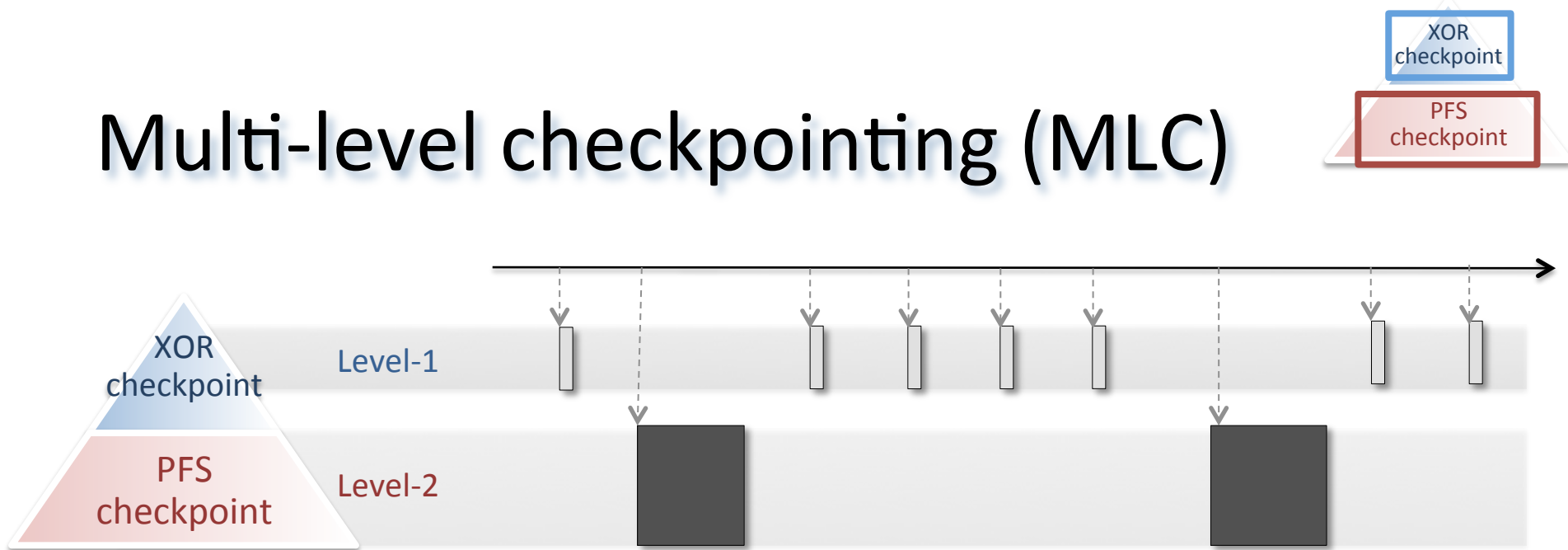


Failure analysis on LLNL clusters

# Local-storage + PFS



# Multi-level checkpointing (MLC)



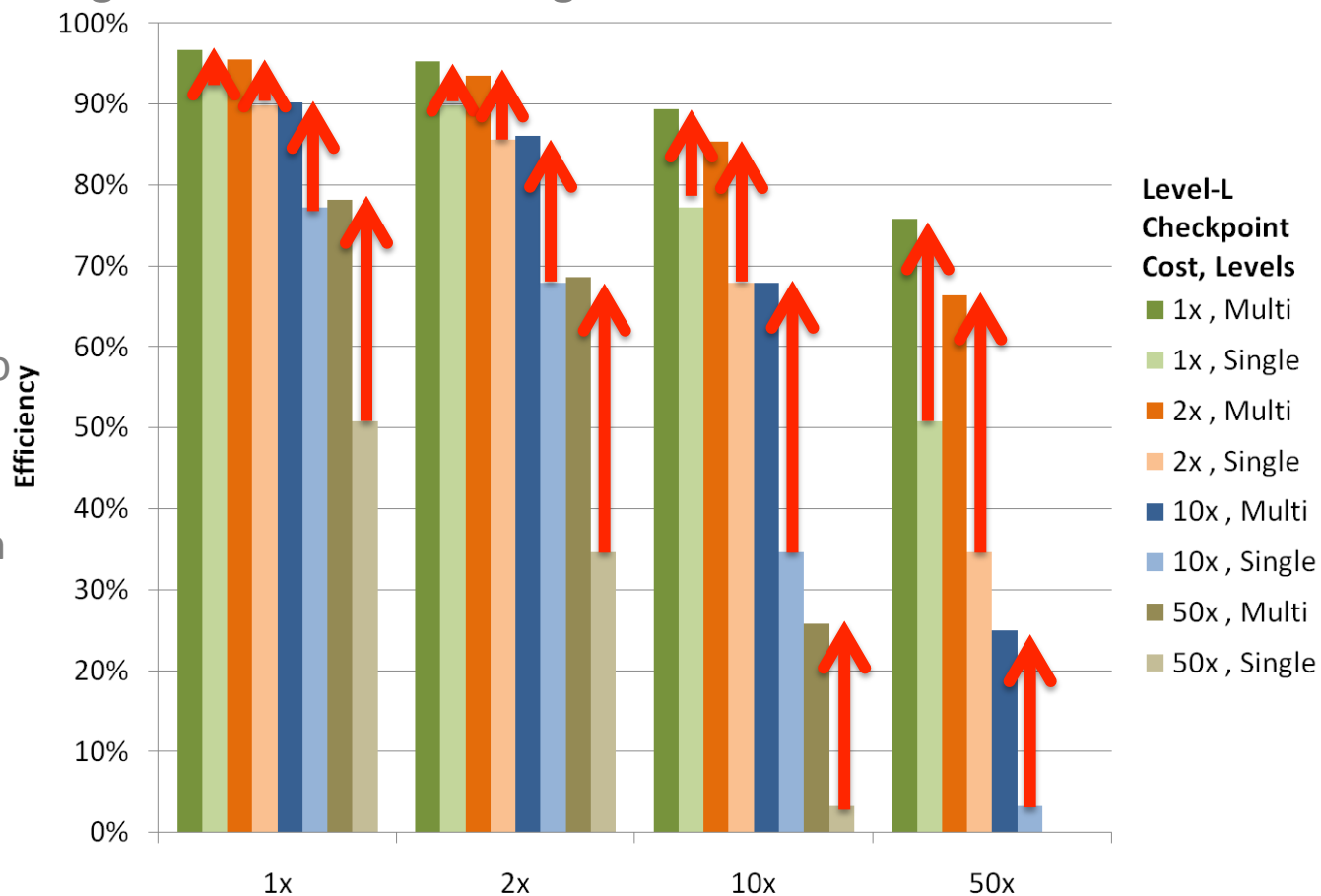
- Use storage levels hierarchically
  - XOR checkpoint: **Frequently**
    - for **one node** or a **few node** failure
  - PFS checkpoint: **Less frequently**
    - for **multi-node** failure



# Multi-level checkpointing (MLC)

- MLC significantly improves system efficiency
  - Increase failure rate up to 50 times, but still high efficiency
  - one order of magnitude in 50 times higher failure rate

- Efficiency compared to single-level checkpointing
- Efficiency is how much ratio an application spend its computation except C/R



Source: A. Moody, G. Bronevetsky, K. Mohror, and B. R. de Supinski, "Design, Modeling, and Evaluation of a Scalable Multi-level Checkpointing System," in Proceedings of the 2010 ACM/IEEE International Conference for High Performance Computing, Networking, Storage and Analysis (SC 10).

# MLC Problems on Petascale or larger

two potential problems

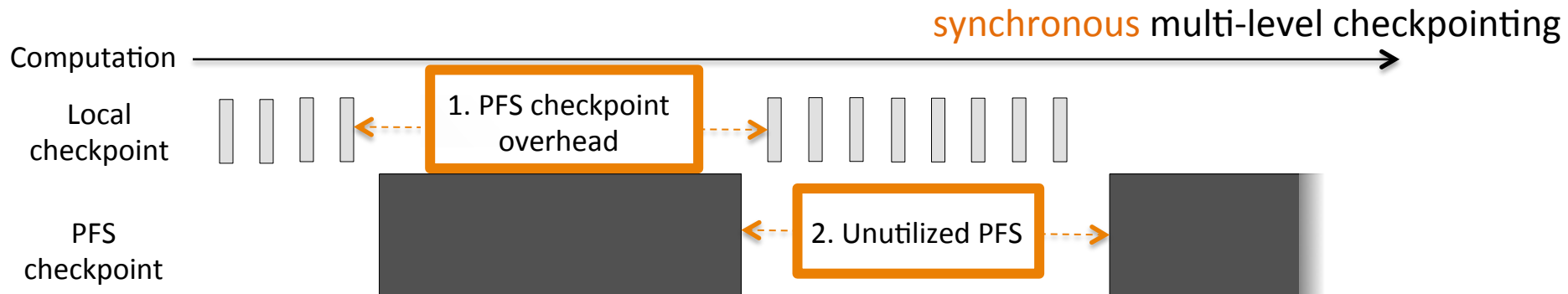
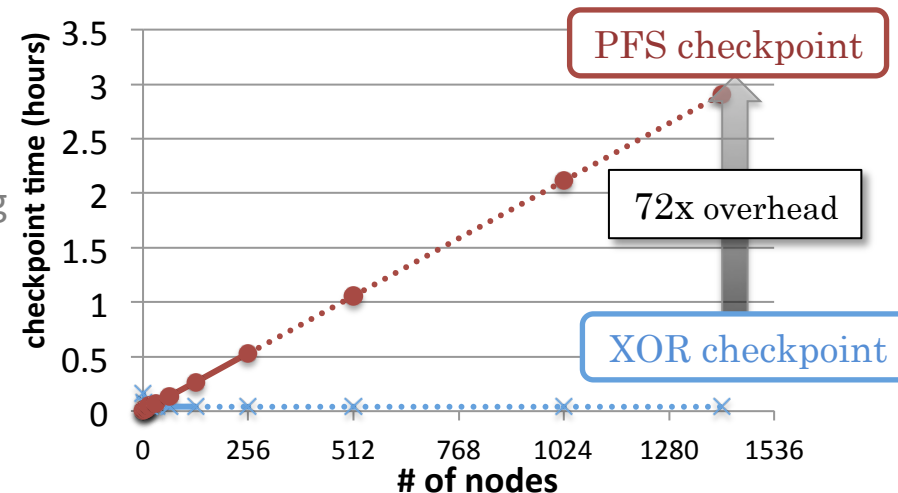
## 1. PFS checkpoint overhead

- Even with MLC, PFS checkpoint still becomes big overhead

## 2. Inefficient PFS utilization

- Time between PFS checkpoints becomes long, PFS is not utilized during XOR checkpoints

TSUBAME2.0 checkpoint time trend

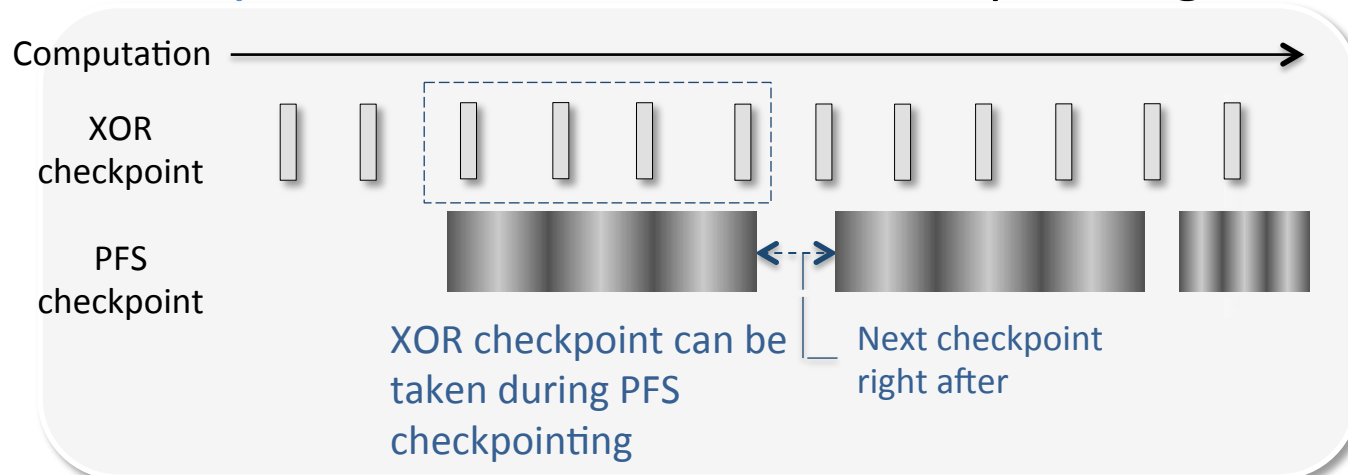


# Asynchronous checkpointing overview

## Synchronous multi-level checkpointing



## Asynchronous multi-level checkpointing

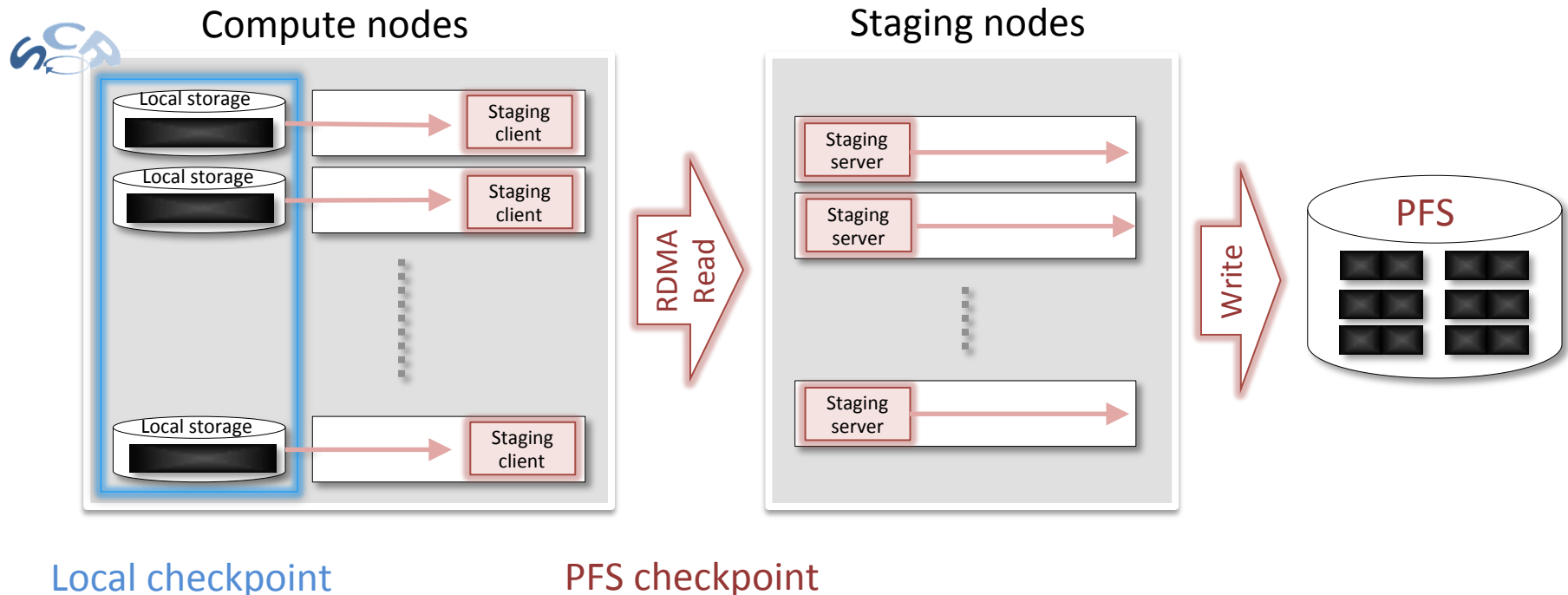


- Write PFS checkpoint in the background, minimize overhead
- By initiating next ckpt right after previous one, increase utilization

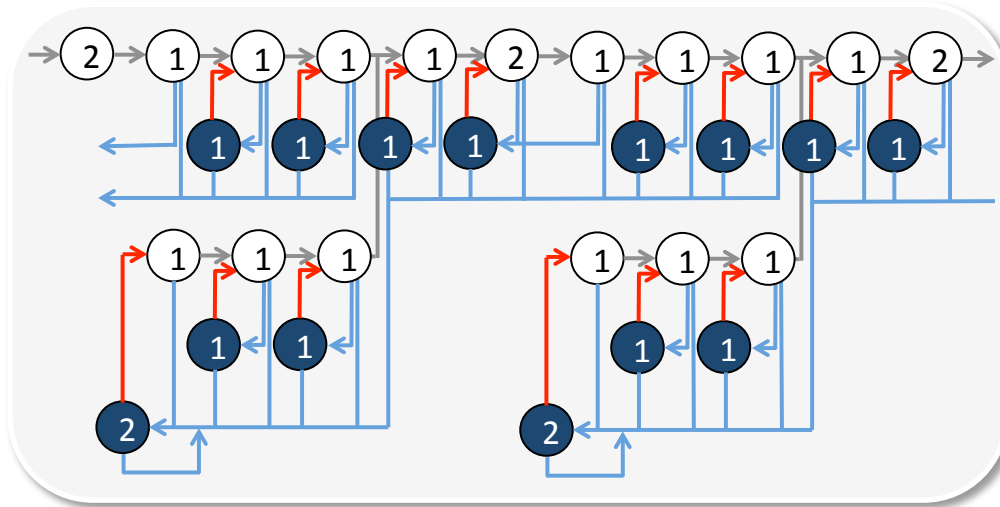


# Asynchronous checkpointing system design overview

- Between compute nodes and PFS, use staging nodes
  - Dedicated extra nodes for transferring local checkpoints
  - Read checkpoints from compute nodes using RDMA, write out to a PFS



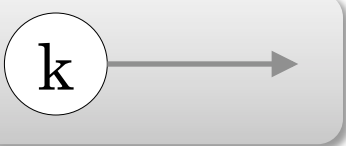
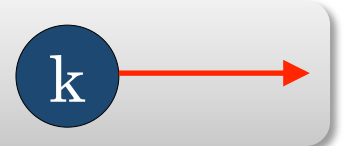
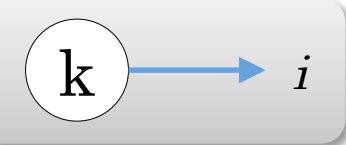
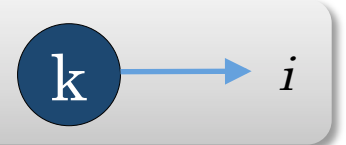
# How to calculate *expected\_runtime* ?



$t$  : Interval

$C_c$  :  $c$ -level checkpoint time

$r_c$  :  $c$ -level recovery time

	Duration	
	$t + c_k$	$r_k$
No failure	 $p_0(t + c_k)$ $t_0(t + c_k)$	 $p_0(r_k)$ $t_0(r_k)$
Failure	 $p_i(t + c_k)$ $t_i(t + c_k)$	 $p_i(r_k)$ $t_i(r_k)$

$$\begin{aligned}
 p_0(T) &= e^{-\lambda T} \\
 t_0(T) &= T \\
 p_i(T) &= \frac{\lambda_i}{\lambda} (1 - e^{-\lambda T}) \\
 t_i(T) &= \frac{1 - (\lambda T + 1) \cdot e^{-\lambda T}}{\lambda \cdot (1 - e^{-\lambda T})}
 \end{aligned}$$

$\lambda_i$  :  $i$ -level checkpoint time

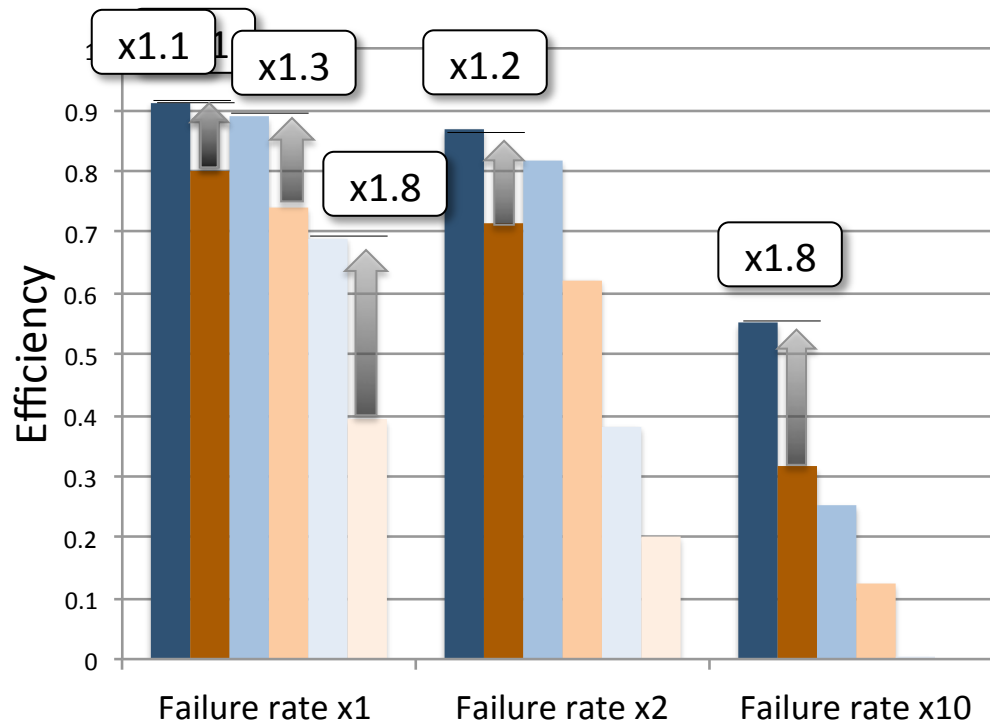
$$\lambda = \sum \lambda_i$$

$p_0(T)$  : No failure for  $T$  seconds  
 $t_0(T)$  : Expected time when  $p_0(T)$

$p_i(T)$  :  $i$ -level failure for  $T$  seconds  
 $t_i(T)$  : Expected time when  $p_i(T)$

# Efficiency: Asynchronous vs. synchronous

The asynchronous method always achieves higher efficiency than the synchronous method



$$Efficiency = \frac{ideal\ runtime}{expected\ runtime}$$

*ideal runtime* : No failure and No checkpoint

*expected runtime* : Computed by the models

- PFS cost x1 / Non-blocking
- PFS cost x1 / Blocking
- PFS cost x2 / Non-blocking
- PFS cost x2 / Blocking
- PFS cost x10 / Non-blocking
- PFS cost x10 / Blocking

# For fast checkpointing

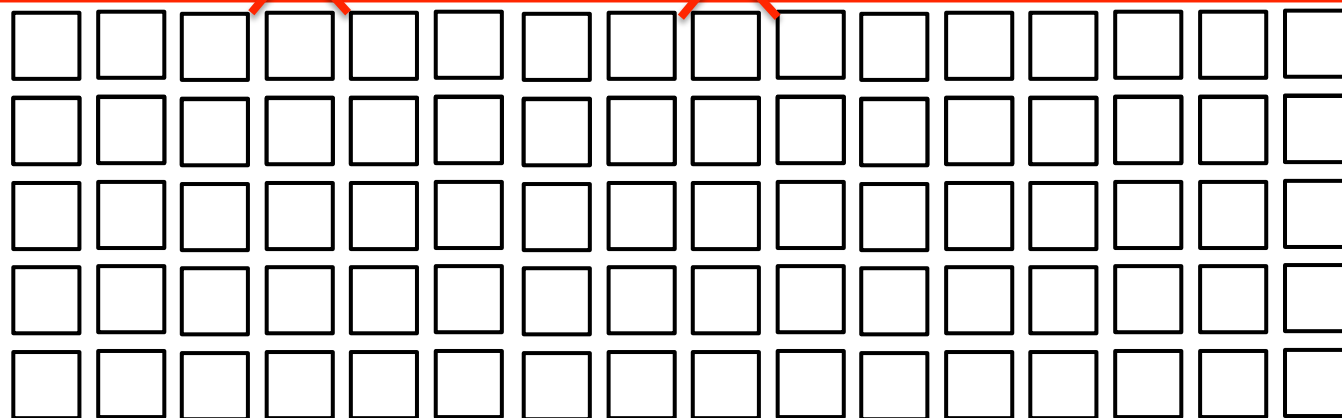
- Buy many & fast PFSs



- Use of Local storage
- Storage design

# Multi-tier storage design

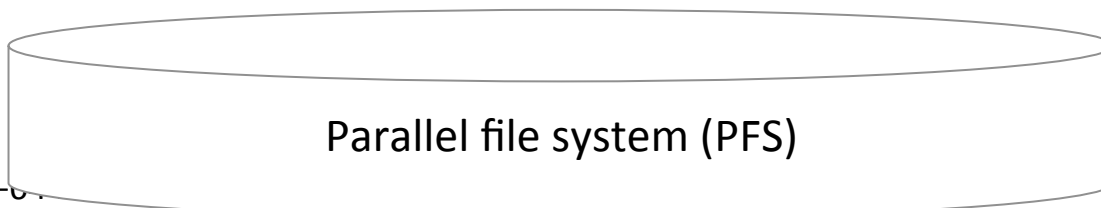
- Even one of checkpoint loss does not work
  - We need an additional tier of storage



Scalable Checkpoint  
Unreliable Checkpoint



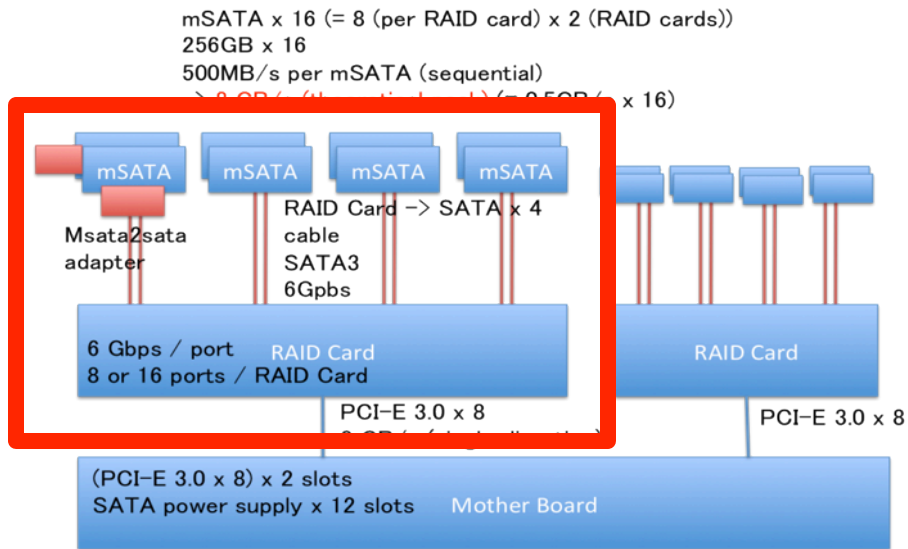
Bust buffer



Reliable Checkpoint  
Not Scalable Checkpoint

# TSUBAME3.0 EBD Prototype

## multi-mSATA High I/O BW, low power & cost

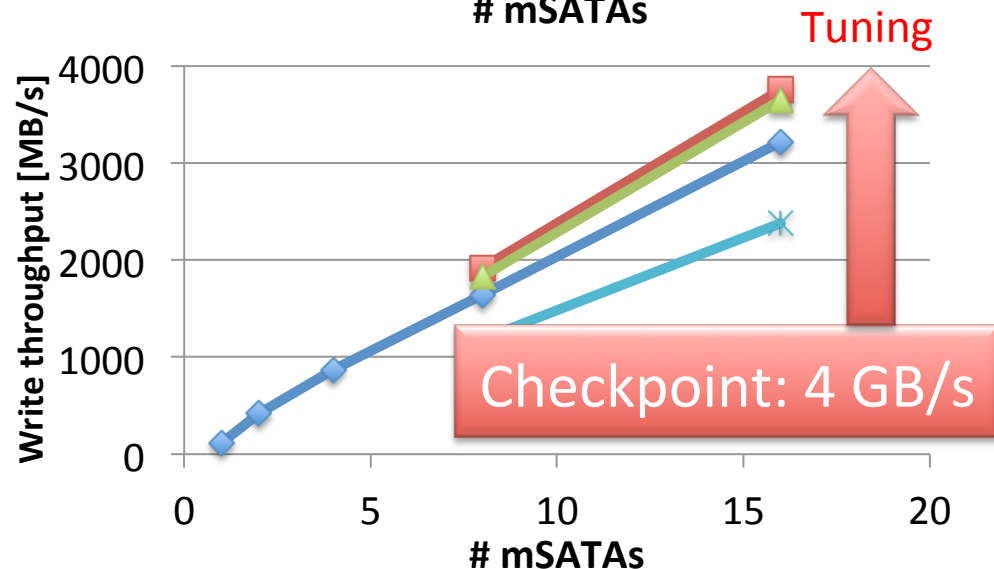
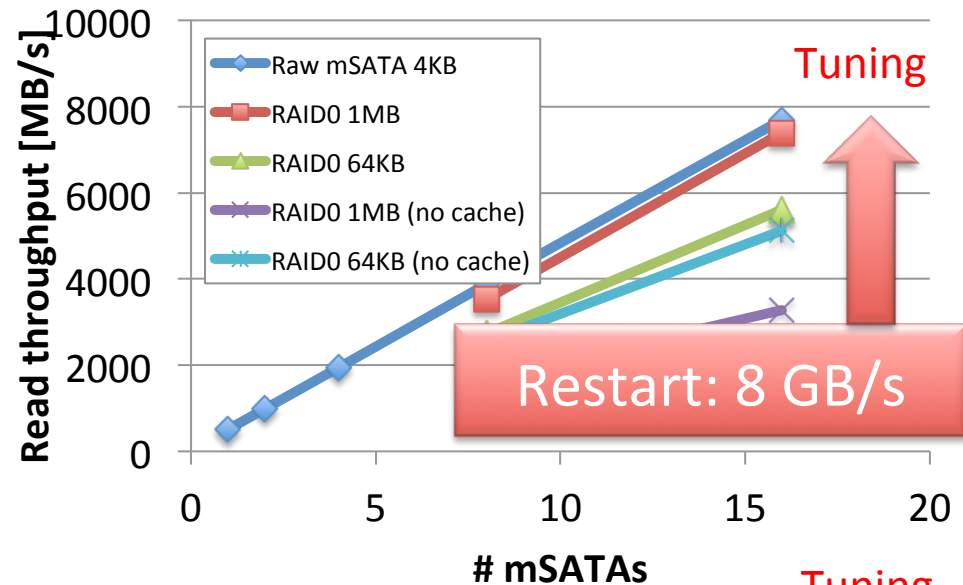


### Node specification

CPU	Intel Core i7-3770K CPU (3.50GHz x 4 cores)
Memory	Cetus DDR3-1600 (16GB)
M/B	GIGABYTE GA-Z77X-UD5H
SSD	Crucial m4 msata 256GB CT256M4SSD3 (Peak read: 500MB/s, Peak write: 260MB/s)
SATA converter	KOUTECH IO-ASS110 mSATA to 2.5" SATA Device Converter with Metal Fram
RAID Card	Adaptec RAID 7805Q ASR-7805Q Single

Source: Shirahata, K., Sato, H. and Matsuoka, S.: Preliminary I/O performance Evaluation on GPU Accelerator and External Memory, IPSJ SIG Technical Reports 2013-HPC-141 (2013).

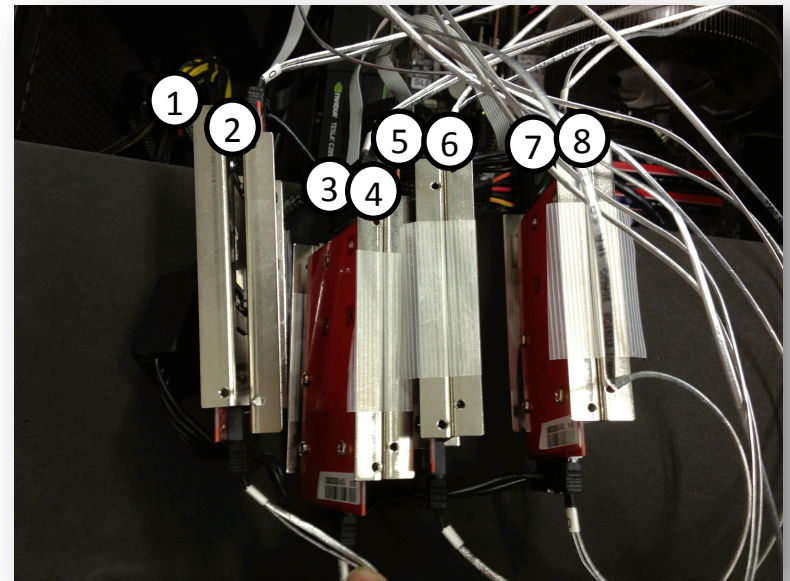
LLNL-PRES-644916



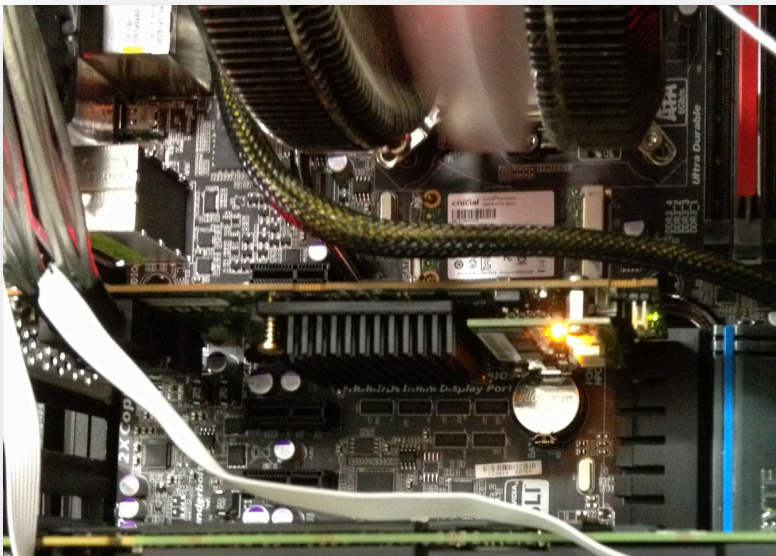




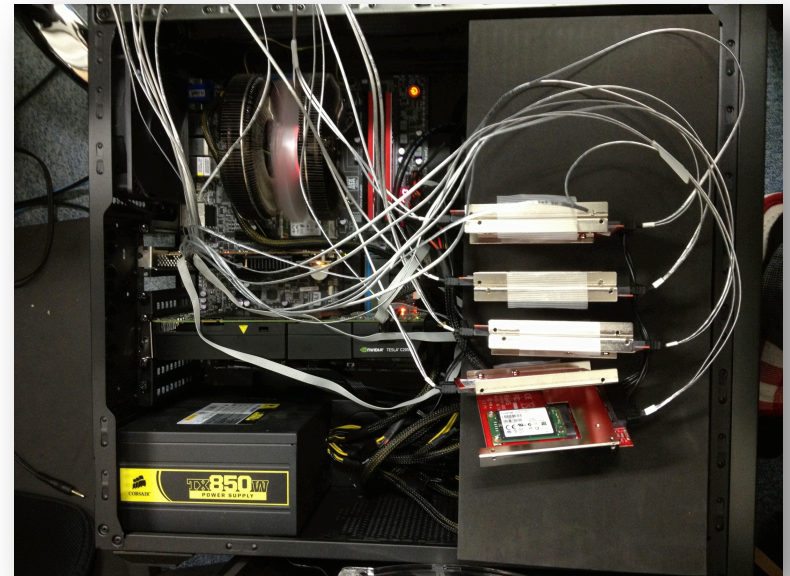
A single mSATA SSD



8 integrated mSATA SSDs



RAID cards



Prototype/Test machine

# Multi-level Asynchronous C/R Model

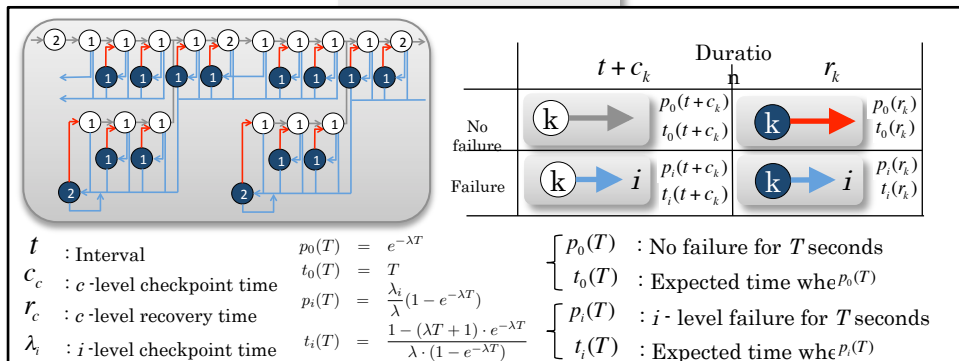
- Compute checkpoint/restart “*Efficiency*” for C/R strategy comparison
  - *Efficiency*: Fraction of time an application spends only in computation in optimal checkpoint interval

$$Efficiency = \frac{ideal\ runtime}{expected\ runtime}$$

*ideal runtime* : No failure and No checkpoint

*expected runtime* : Computed by the models

$$f : (L_{i=1 \dots N}, O_{i=1 \dots N}, R_{i=1 \dots N})$$



- Input: Each level of
  - $L_i$ : Checkpoint Latency
  - $O_i$ : Checkpoint overhead
  - $R_i$ : Restart time
- Output: “*Efficiency*”

## Efficiency

Source: Sato, K., Maruyama, N., Mohror, K., Moody, A., Gamblin, T., de Supinski, B. R. and Matsuoka, S.: Design and Modeling of a Non-Blocking Checkpointing System (SC12)



# Modeling of C/R Strategies

- $L_i$ : Checkpoint Latency
  - Time to complete a checkpoint ( $C_i$ ) and encoding ( $E_i$ )
- $O_i$ : Checkpoint overhead
  - The increased execution time of an application
    - Sync. C/R: Checkpoint overhead ( $O_i$ ) = Checkpoint latency ( $L_i$ )
    - Async. C/R: Initialization time of level  $i$  C/R

$$L_i = C_i + E_i$$

$$O_i = \begin{cases} C_i + E_i & \text{(Sync.)} \\ I_i & \text{(Async.)} \end{cases}$$

- $C_i$  &  $R_i$ : Checkpoint/Restart time

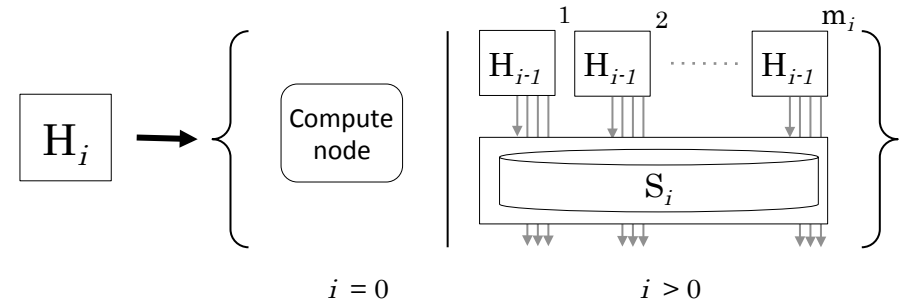
\*  $S_i$ : tier  $i$  storage

$$C_i \text{ or } R_i = \frac{\langle \text{C/R data size / node} \rangle \times \langle \# \text{ of C/R nodes per } S_i^* \rangle}{\langle \text{write perf. ( } w_i \text{ )} \rangle \text{ or } \langle \text{read perf. ( } r_i \text{ )} \rangle}$$

# Recursive Structured Storage Model

- Generalization of storage architectures with "*context-free grammar*"

- A tier  $i$  hierarchical entity ( $H_i$ ), has a storage ( $S_i$ ) shared by ( $m_i$ ) upper hierarchical entities ( $H_{i-1}$ )
- $H_{i=0}$  is a compute node
- $H_N \{m_1, m_2, \dots, m_N\}$



Storage Model:  $H_N \{m_1, m_2, \dots, m_N\}$

$r_i$	Sequential read throughput from compute nodes ( $H_{i=0}$ )
$w_i$	Sequential write throughput from compute nodes ( $H_{i=0}$ )
$m_i$	The number of a upper hierarchical entities ( $H_{i-1}$ ) sharing $S_i$

<# of C/R nodes per  $S_i$ >

||

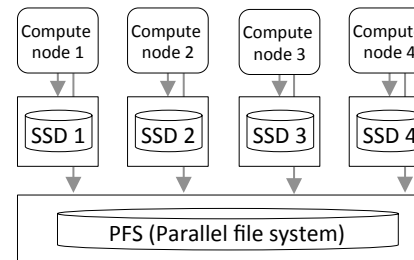
$K^*$

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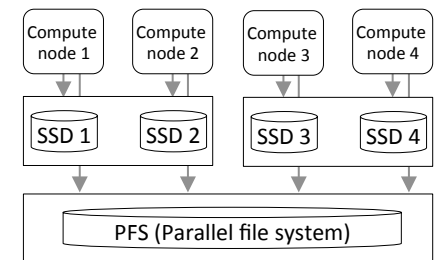
<# of  $S_i$ > ( $= \prod_{k=i+1}^N m_k$ )

*\*K: C/R cluster size*

## Example



Flat buffer system:  $H_2 \{1, 4\}$



Burst buffer system:  $H_2 \{2, 2\}$

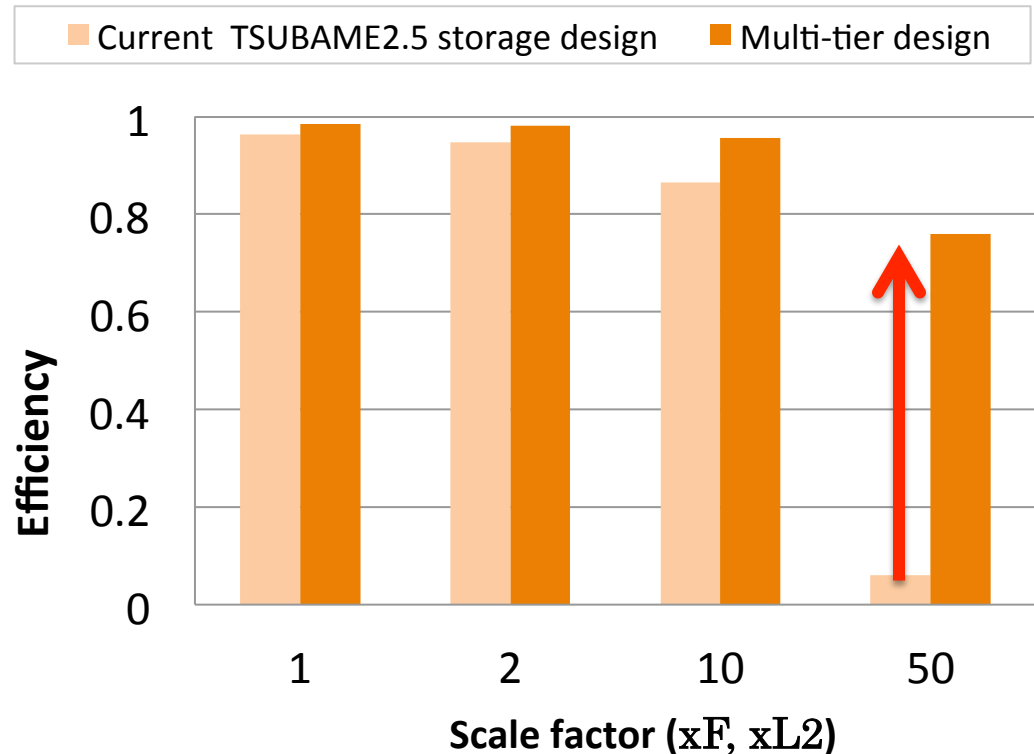
# Efficiency with Increasing Failure Rates and Checkpoint Costs

- The burst buffer system always achieves a higher efficiency

⇒ Stores checkpoints on fewer nodes

- With uncoordinated checkpointing, 70% efficiency even on systems that are two orders of magnitude larger (if logging overhead is 0)

⇒ Partial restart can exploit the bandwidth of both burst buffers and the



# Summary

- Fault tolerance is important
  - Fast and Reliable checkpointing is required
- Lustre provides high bandwidth
  - Checkpointing requires more
- For fast checkpointing
  - Multi-level checkpointing
  - Multi-tier storage design

# Q & A

## Speaker:

Kento Sato (佐藤 賢斗)

kent@matsulab.is.titech.ac.jp

Tokyo Institute of Technology (Tokyo Tech)

*Research Fellow of the Japan Society for the Promotion of Science*

[http://matsu-www.is.titech.ac.jp/~kent/index\\_en.html](http://matsu-www.is.titech.ac.jp/~kent/index_en.html)

## Collaborators

Adam Moody, Kathryn Mohror, Todd Gamblin, Bronis R de. Supinski,  
Naoya Maruyama, Satoshi Matsuoka

