



# A Study of Network Congestion in Two Supercomputing High-Speed Interconnects

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# DOE HPC Facilities

## Pre-Exascale Systems

2012

2016

2018

2020

2021-2023



TITAN  
ORNL  
Cray/AMD/  
NVIDIA



THETA  
ANL  
Cray/Intel



SUMMIT  
ORNL  
IBM/NVIDIA



MIRA  
ANL  
IBM BG/Q



CORI  
LBNL  
Cray/Intel



SEQUOIA  
LLNL  
IBM BG/Q



TRINITY  
LANL/SNL  
Cray/Intel



SIERRA  
LLNL  
IBM/NVIDIA



PERLMUTTER  
LBNL  
Cray/AMD/  
NVIDIA



FRONTIER  
ORNL  
Cray/AMD



AURO  
ANL  
Intel/Cray



CROSSROADS  
LANL/SNL  
TBD



EL CAPITAN  
LLNL  
Cray

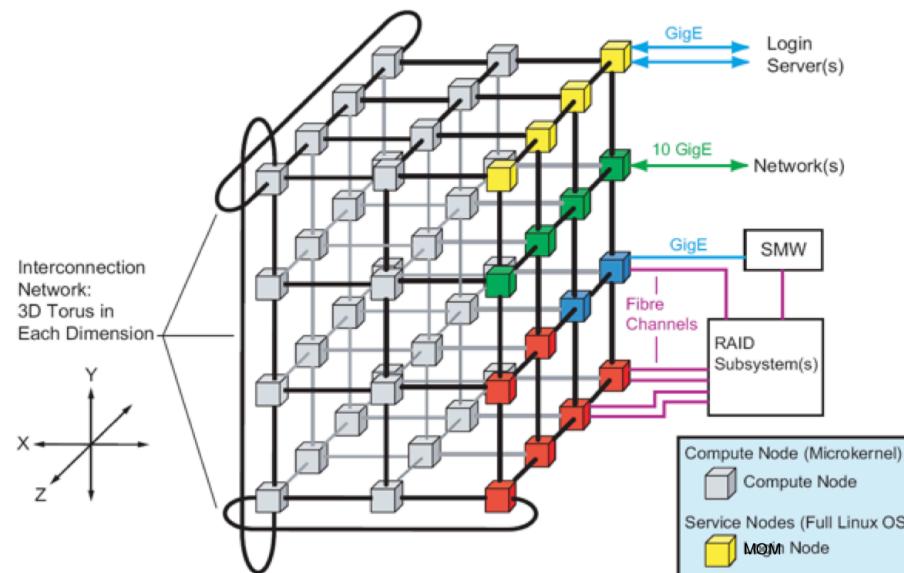
Source: [hpcwire](#)

## HPC interconnect technologies:

- Cray Gemini (3D Torus), Aries (DragonFly), Slingshot (DragonFly)
- Mellanox InfiniBand (Non-blocking Fat Tree)
- IBM BG/Q proprietary technology (5D Torus)

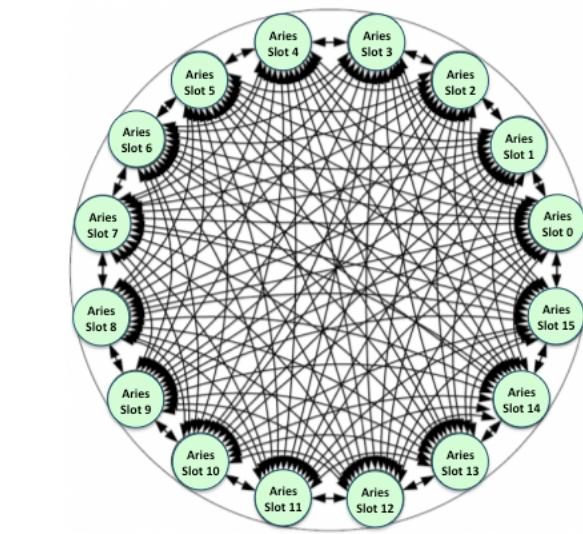
# Studied HPC Systems

## NCSA Blue Waters



Interconnect: Cray Gemini (3-D Torus)

## NERSC Edison

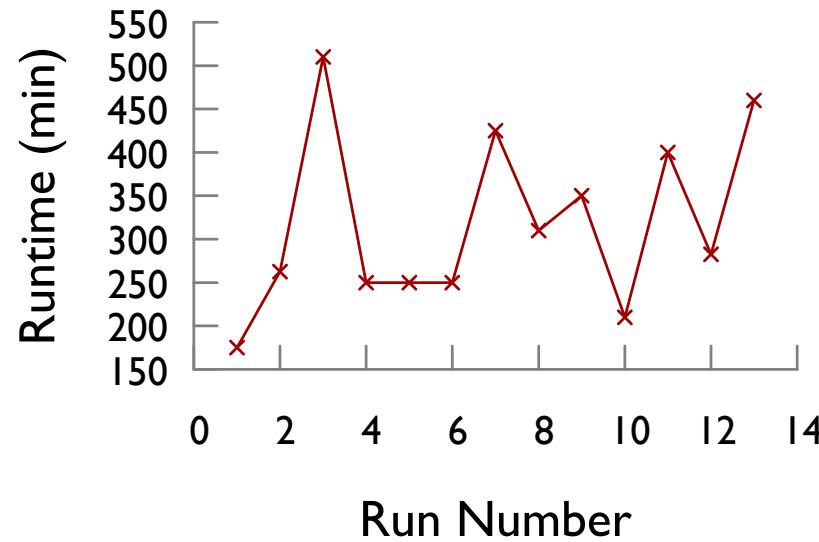


Interconnect: Cray Aries (DragonFly)

# Mystery of Application Performance Variation

Mean Runtime : 318 mins

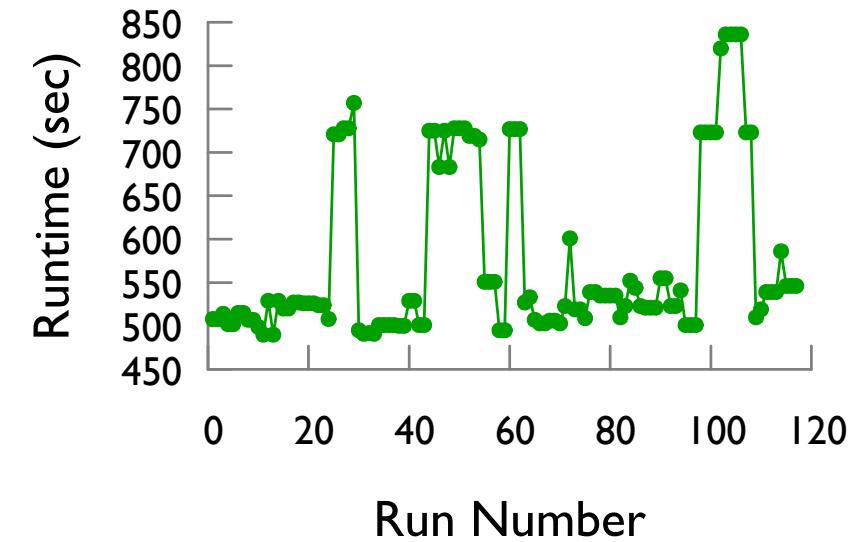
Standard Deviation in Runtime: 103 mins



NAMD Completion Time (*NCSA Blue Waters*)

Mean Runtime : 576 secs

Standard Deviation in Runtime: 100 secs



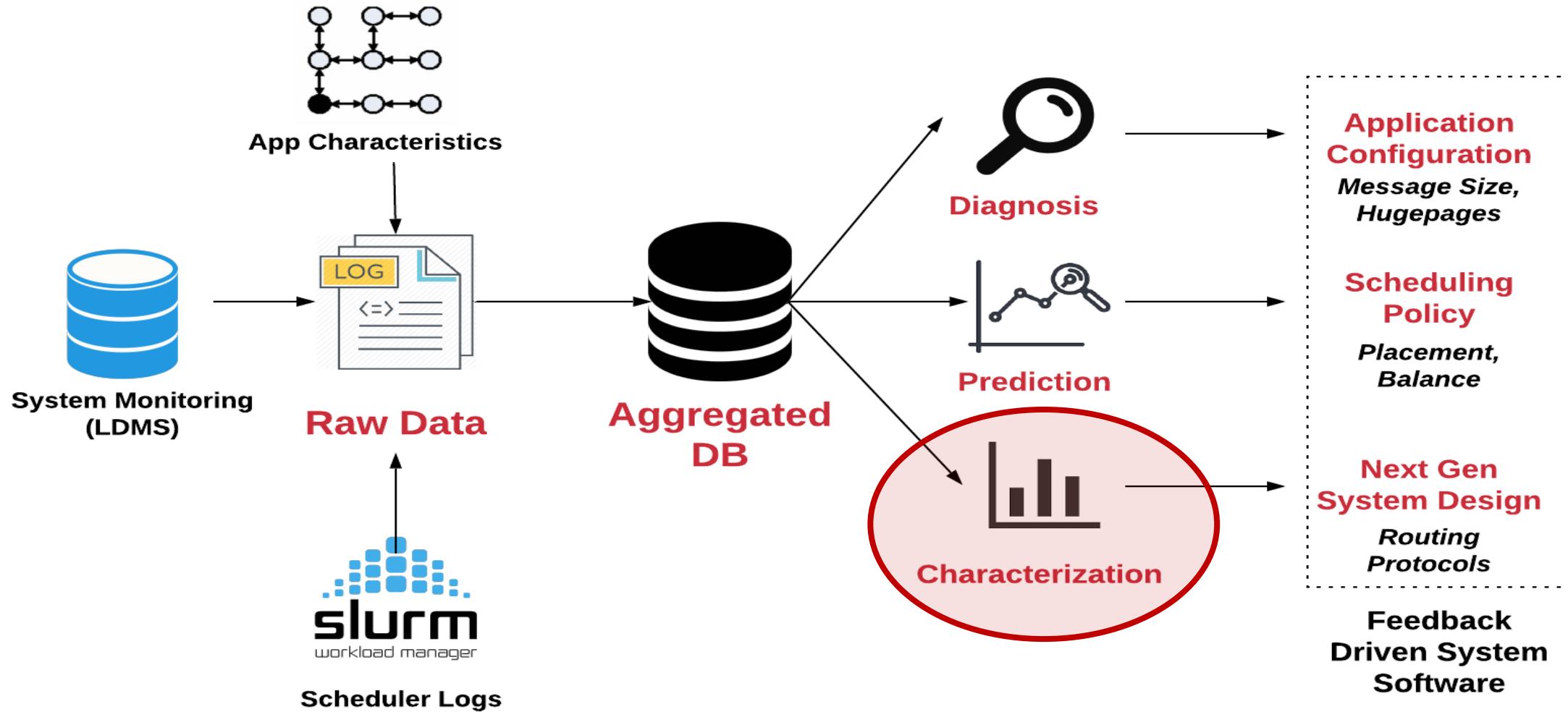
MILC Completion Time (*NERSC Edison*)

Variation caused by

- Interference from other applications
- Non-optimal configuration settings (too many knobs!)  
e.g., huge pages, placement, message size, node sharing



# Monet: End-to-End Interconnect Monitoring Workflow





# Data Measurement and Metrics

- Congestion measured in terms of Percent Time Stalled ( $P_{TS}$ )

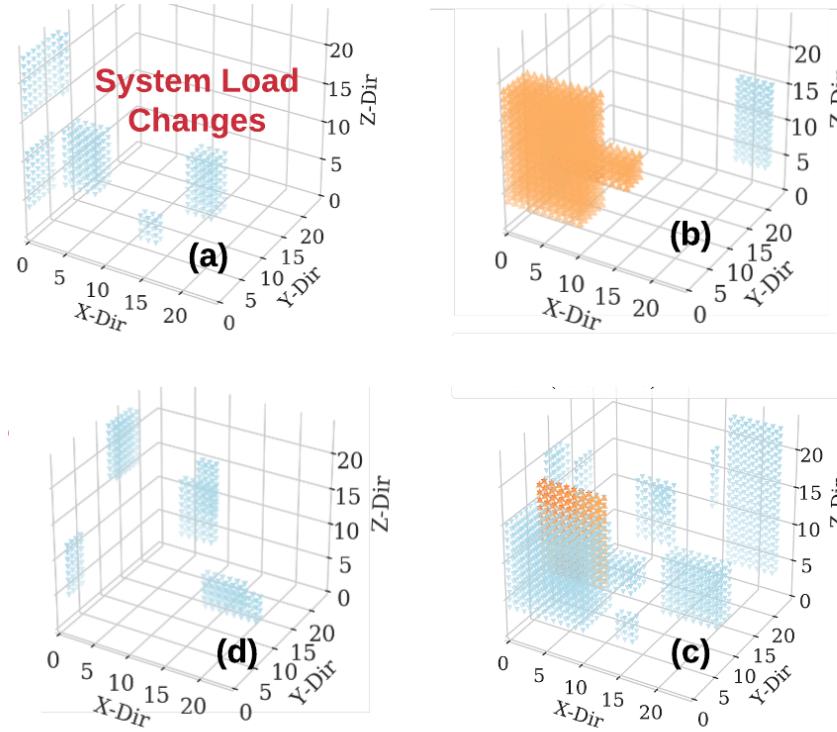
$$P_{TS} = 100 * \frac{T_{is}}{T_i}$$

$T_{is}$  is the time spent in stalled state

$T_i$  is the measurement interval

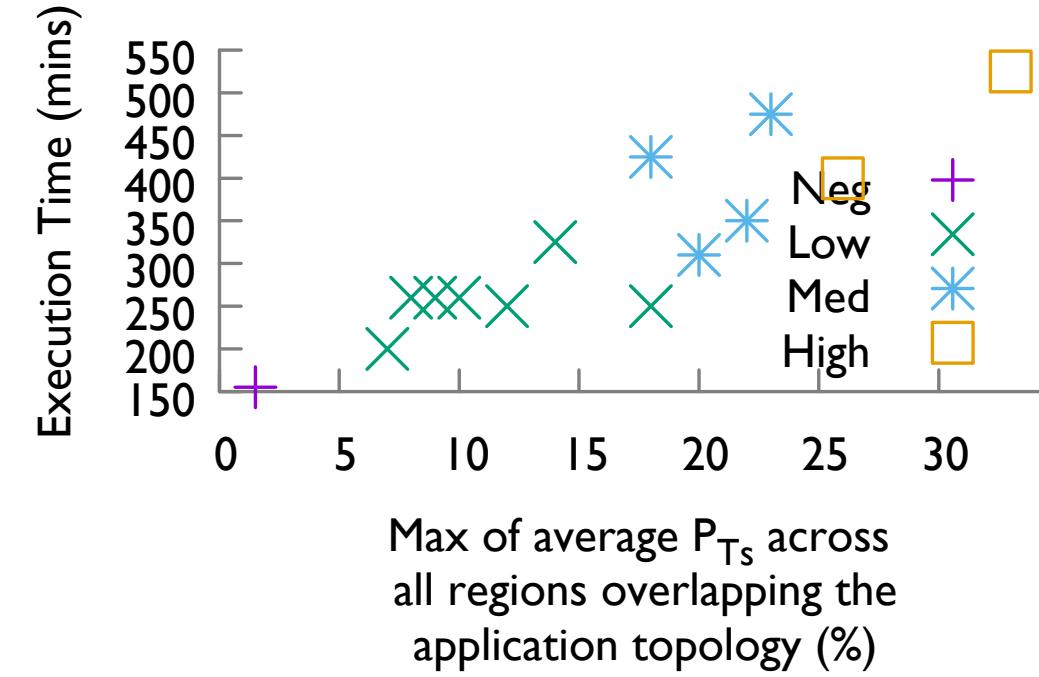
- On Blue Waters:  $T_i$  is 60s, data gathered: ~700 MB/minute
- On Edison:  $T_i$  is 1s, data gathered: ~7.5 GB/minute

# Characterizing Congestion On Toroidal Networks



● Low ● Medium ● High

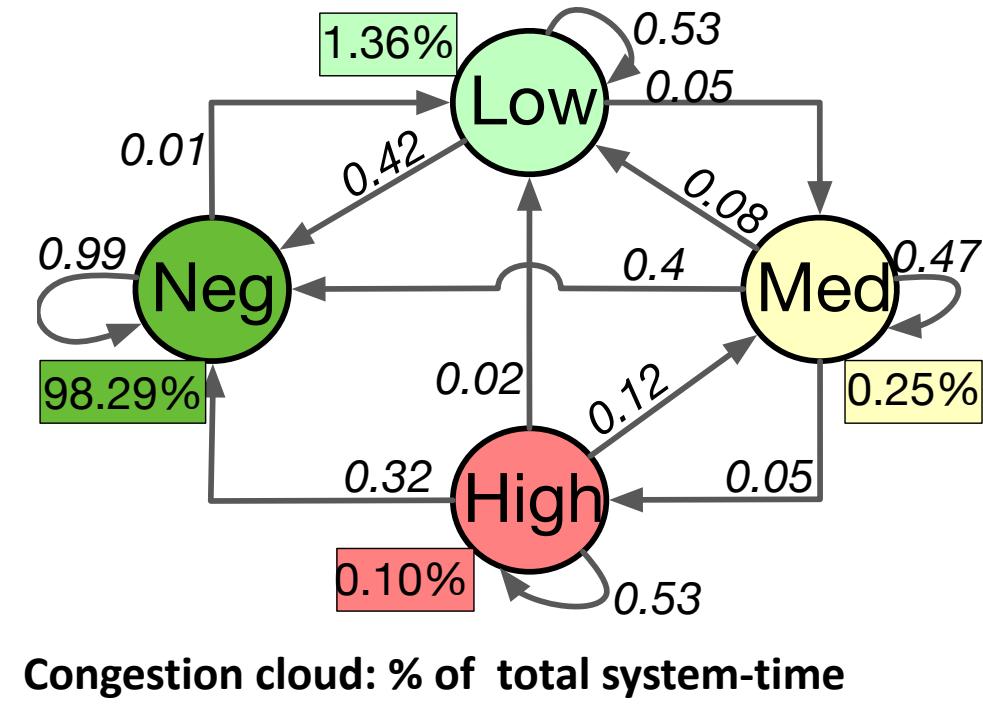
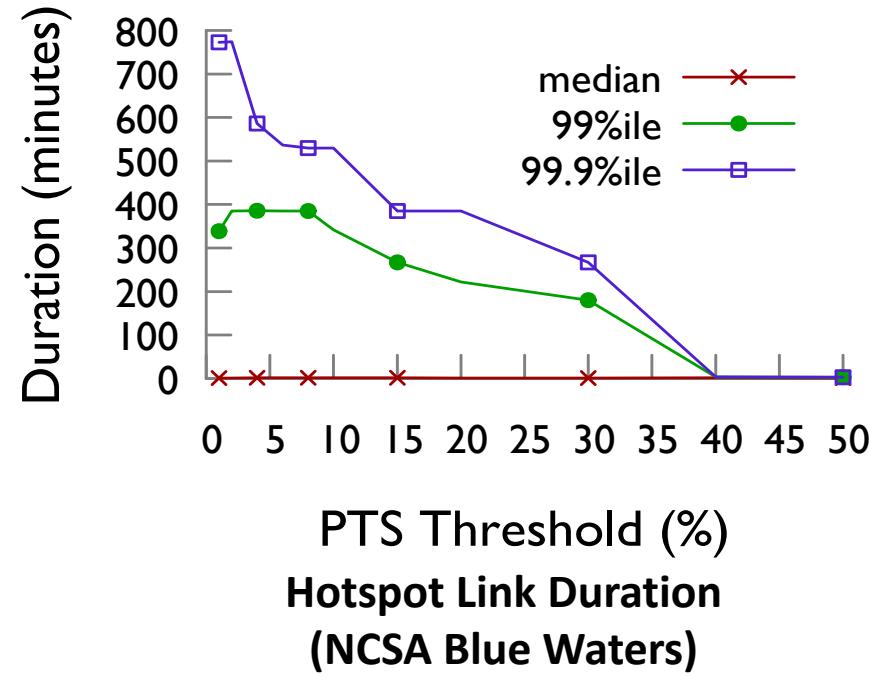
Congestion Cloud (NCSA Blue Waters)



Correlation Between NAMD Completion Time and Network Congestion (NCSA Blue Waters)

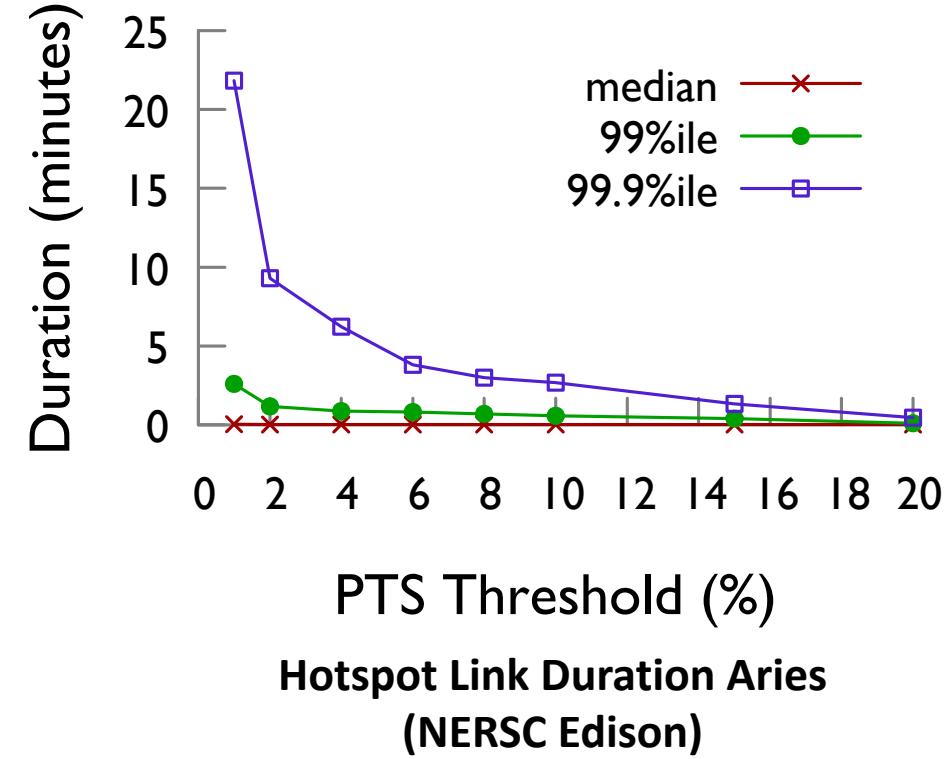
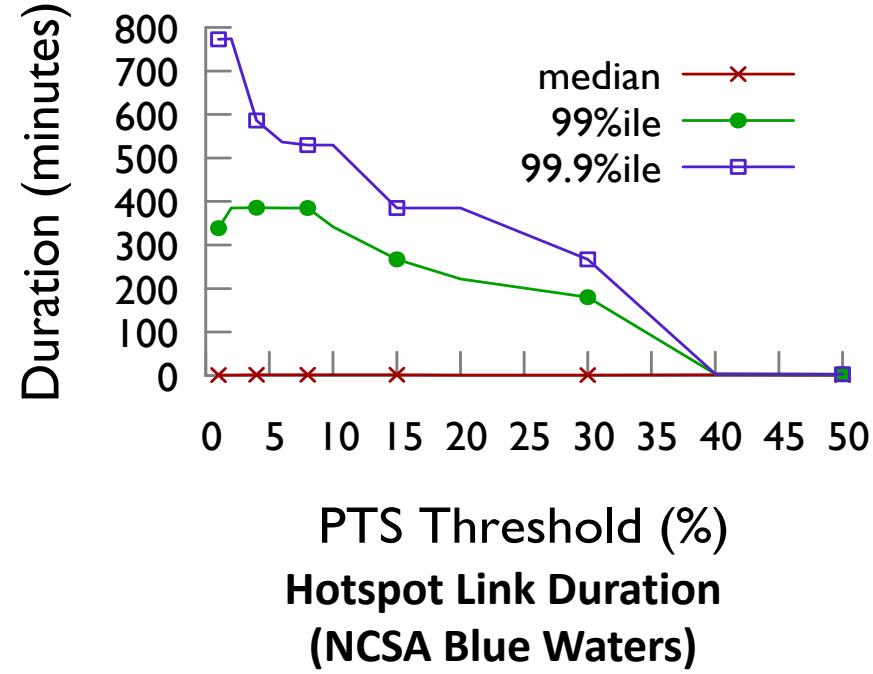
Performance Variation Depends on Duration, Size and Intensity of Congestion Clouds

# Characterizing Congestion On Toroidal Networks



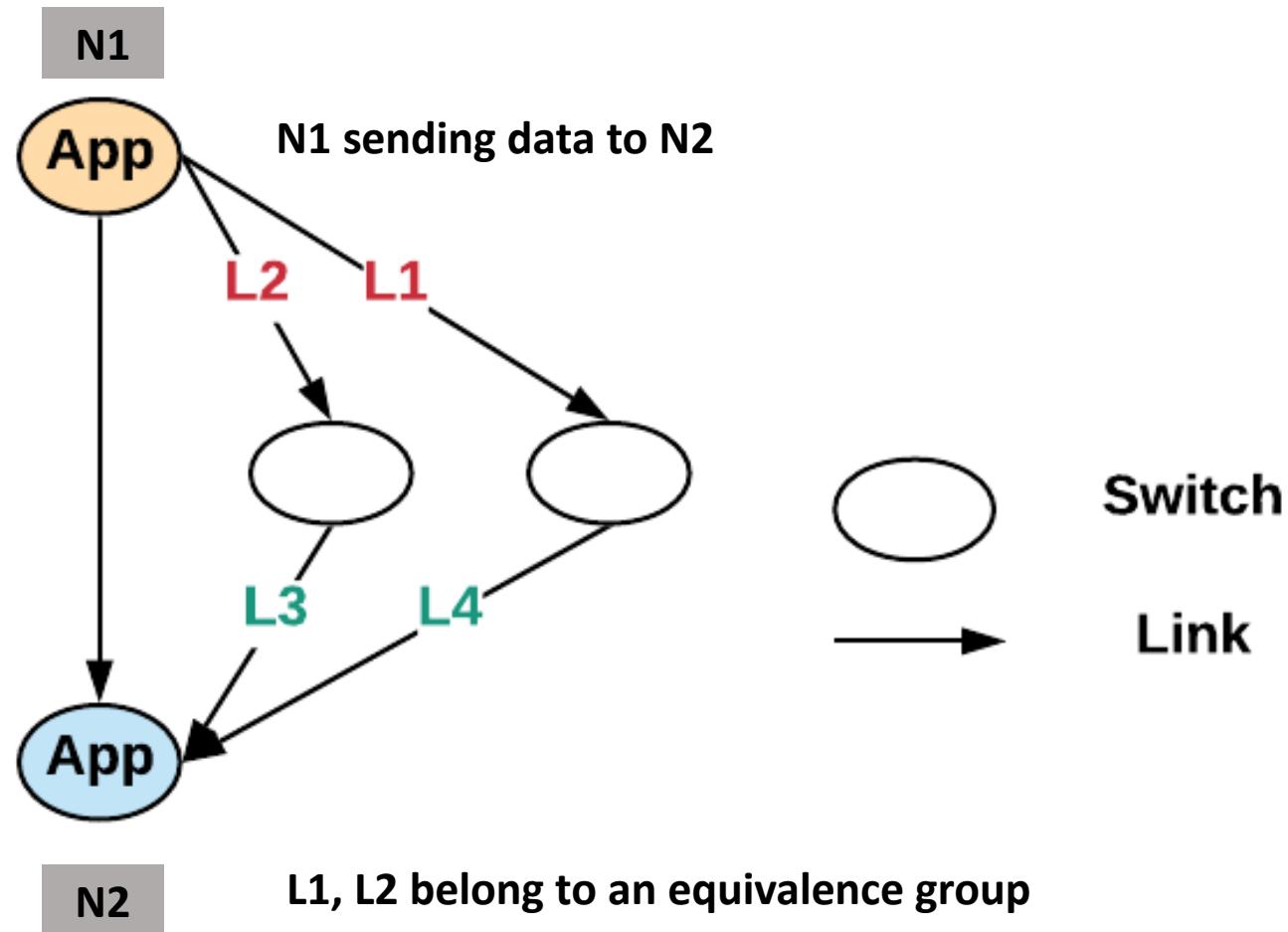
- Continuous presence of highly congested links
- 95% of the operation time contained a region with a min size of 20 links.
- Max size of 6904 (17%) links
- Average congestion duration: 16 minutes, 95th percentile: 16 hours

# Comparing with DragonFly Network – Link Hotspot Characterization



- Duration of continuous congestion on links significantly reduced in DragonFly
- Hotspots continue to exist

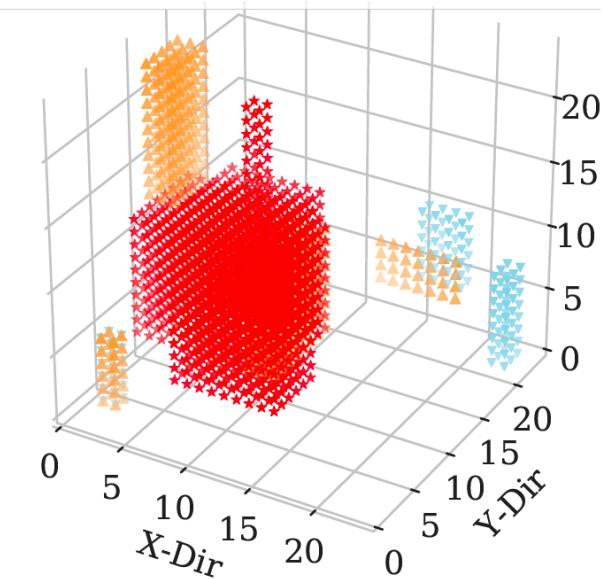
# Measuring Load Imbalance: Equivalence Groups



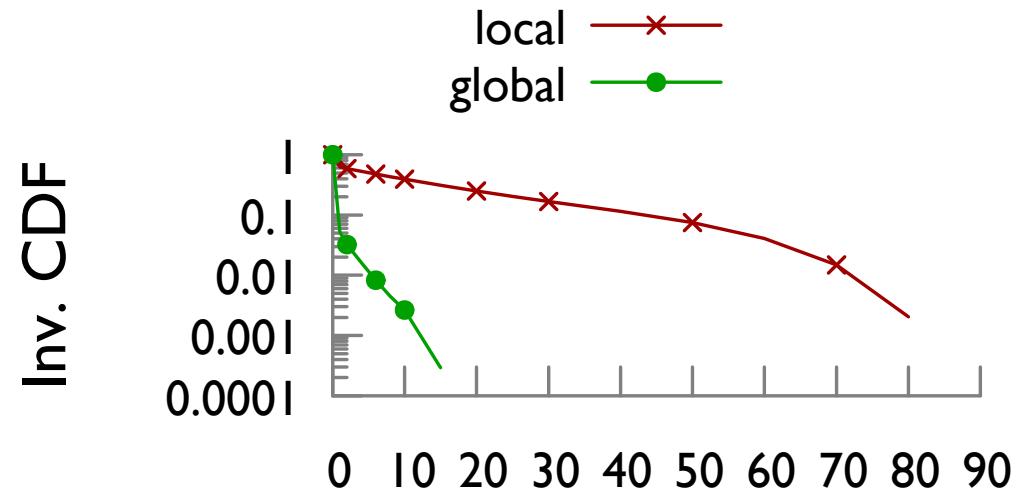
Congestion Imbalanced Scenario	
Link	Congestion (PTS)
L1	20%
L2	10%

Congestion Balanced Scenario (Ideal)	
Link	Congestion (PTS)
L1	15%
L2	15%

# Comparing with DragonFly Network – Load Imbalance Characterization



**Existence of congestion cloud for long duration  
(NCSA Blue Waters)**



**Range of PTS in  
equivalence groups (%)  
(Cray Testbed System)**

- Existence of load imbalance on local links
- Load balance significantly improved on Global links

# Demo – 5 minutes of congestion viz on Edison



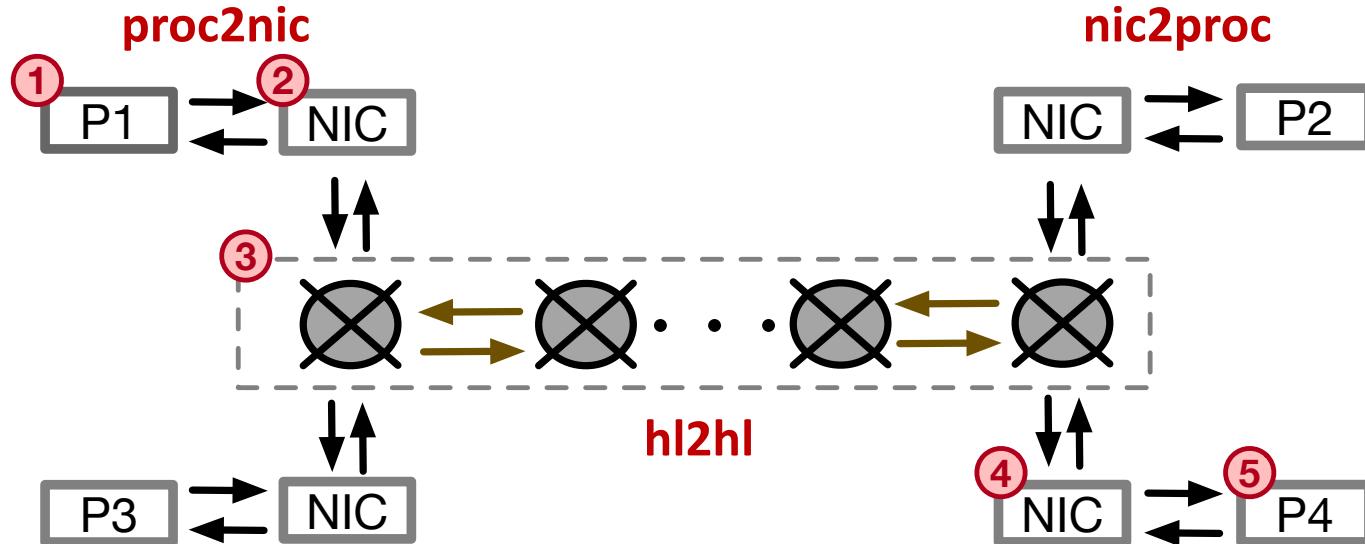
- Duration of congestion hotspots is short
- Hotspots move rapidly and application continues experiencing congestion



# Going Forward: Taking Systems Approach for Minimizing Performance Variation

# Sources of Contention

Traffic flowing from P1 to P4

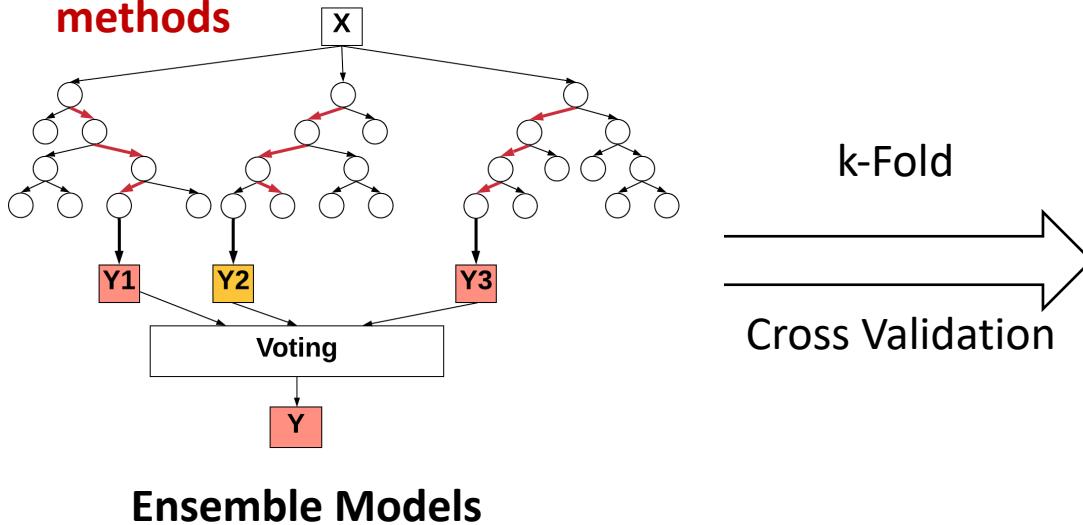


Map	Contention	Reasons
①	<src> processor	Cache conflict, TLB, OS resources
② ④	<src>/<dst> NIC	NIC buffers busy
③	Network Switches	Head of line blocking due to busy buffers
⑤	<dst> processor	<dst> processor not ready to receive data

Multiple sources for contention/congestion

# ML-driven Performance Prediction in Aries

1. Increase observability into system and applications
2. Backpressure model for contention using probabilistic methods
3. Use explainable machine-learning methods



- Diagnosis for understanding performance variation
- Understanding sensitivity to each configuration parameter
- Scheduling policy

Feature Type	Feature List	Avg R2
Application and Scheduler Specific	<i>app,hugepages,placement, balance, avg hops</i>	0.64
Network Specific	<i>nic2proc,proc2nic,hl2 hl PTS &amp; SPF</i>	0.86
All features	All the above	0.91

# Conclusion and Future Work



## Conclusion

- Congestion studies across generations of production systems help improve understanding of
  - App. performance variation – diagnostic models
  - Parameter tuning – selecting optimal parameters
  - Network design - load imbalance continues to be a problem

## Future work

- Characterize and understand upcoming QoS features in Slingshot
- ML-driven scheduling for HPC kernels



# References

- ✉ S. Jha, A. Patke, B. Lim, J. Brandt, A. Gentile, G. Bauer, M. Showerman, L. Kaplan, Z. Kalbarczyk, W. T. Kramer, R. Iyer (2020). [Measuring Congestion in High-Performance Datacenter Interconnects](#). *17th USENIX Symposium on Networked Systems Design and Implementation (NSDI)*.
- ✉ S. Jha, A. Patke, J. Brandt, A. Gentile, M. Showerman, E. Roman, Z. Kalbarczyk», W. T. Kramer, R. Iyer (2019). [A Study of Network Congestion in Two Supercomputing High-Speed Interconnects](#). *2019 IEEE 26th Annual Symposium on High-Performance Interconnects (HOTI)*.
- ✉ S. Jha, J. Brandt, A. Gentile, Z. Kalbarczyk, R. Iyer (2018). [Characterizing Supercomputer Traffic Networks Through Link-Level Analysis](#). *2018 IEEE International Conference on Cluster Computing*
- ✉ Saurabh Jha, Shengkun Cui, Tianyin Xu, Jeremy Enos, Mike Showerman, Mark Dalton, Zbigniew T. Kalbarczyk, William T. Kramer, Ravishankar K. Iyer (2019). [Live Forensics for Distributed Storage Systems](#). *arXiv e-prints*.

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