

# Accelerating MPI Message Matching and Reduction Collectives For Multi-/Many-core Architectures

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## Adaptive and Dynamic Design for MPI Tag Matching

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### **Current Trends in HPC**



### Supercomputing systems scaling rapidly

- Multi- and Many-core architectures
- High-performance Interconnects



### InfiniBand and Omni-Path are popular HPC Interconnects

- Low-latency and High-bandwidth
- 192 systems (39%) in Jun'17 Top500 use IB

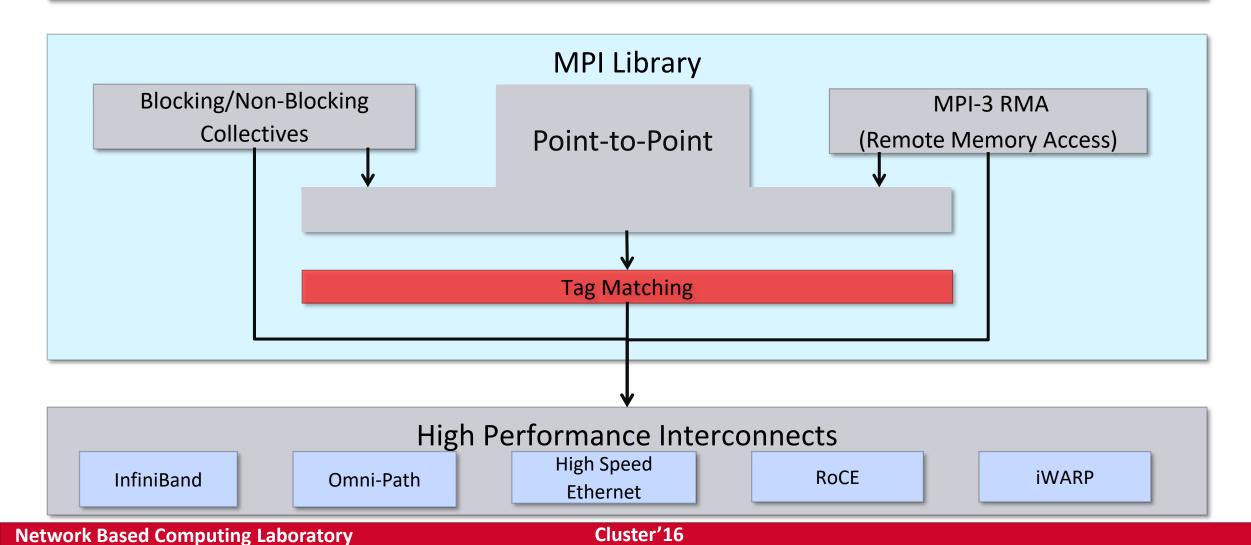


### MPI used by vast majority of HPC applications

- Helping applications scale to thousands of cores
- Large systems exposing new scalability issues

# **Components of an MPI Library**

### **HPC Application**



### MPI Tag Matching 101

- On the receiver side, one needs to match the incoming message with the message that was posted by receiver
- Three parameters should match
  - Context id, Source Rank, Tag
  - Wildcards (MPI\_ANY\_SRC, MPI\_ANY\_TAG) introduce additional complexity
- Two kinds of the queues are involved in the receiver side
  - Posted queue
  - Unexpected queue

### Search Time Analysis of the Default Double Linked List Design

- Most MPI libraries use double linked list for unexpected and posted queues
- Message to be removed could be in any position of the queue
  - Removal time in the best case is O(1) and in the average case is linear O(N)
- Tag matching is in the critical path for point-to-point based operations
- Number of the processes in a job is increasing
  - Future extreme-scale systems are expected to have millions of cores\*
  - Multithreaded programming models
- All can push the search functions to go deeper in the lists
  - Impose significant overhead on the performance

\* Thakur R, Balaji P, Buntinas D, Goodell D, Gropp W, Hoefler T, Kumar S, Lusk E, Träff JL. MPI at Exascale. Proceedings of SciDAC. 2010 Jul;2:14-35.

### **Proposed Adaptive Design**

- Based on the Bin-based and default simple double linked list scheme
- Three phases
  - Starts with the default design
  - Observes the communication pattern for each process during the runtime
  - If all the conditions are held, it begins to convert the default scheme to the Binbased scheme
- Each process can have its own scheme
  - Some may stay at the default scheme, some may need to convert to bin-based scheme

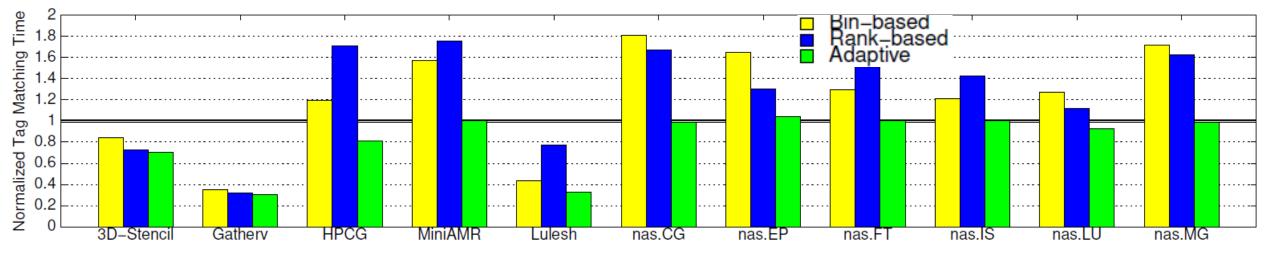
### Proposed Adaptive Design (Cont'd)

- For each of the posted and unexpected queues, we consider the following thresholds
  - Number of the calls to the tag matching functions in the library (CALLS\_NUM)
  - The average number of queue look-up attempts per CALLS\_NUM (MACTCH\_ATTMPS)
- Each process maintains both during the runtime
- If both thresholds are crossed
  - Adaptive design changes from the double linked list scheme to the bin-based scheme

### **Proposed Adaptive Design (Cont'd)**

- Currently, conversion is one way from default to bin-based scheme and may occur only one time through the entire runtime
- These thresholds are fixed through entire runtime and they are configurable
  - We have tuned them based on empirical analysis using OSU micro benchmarks
- We consider two possible sizes for NUM\_BINS
  - ¼ JOB\_SIZE and ½ JOB\_SIZE
  - Based on MATCH\_ATTMPS, we decide which one to choose

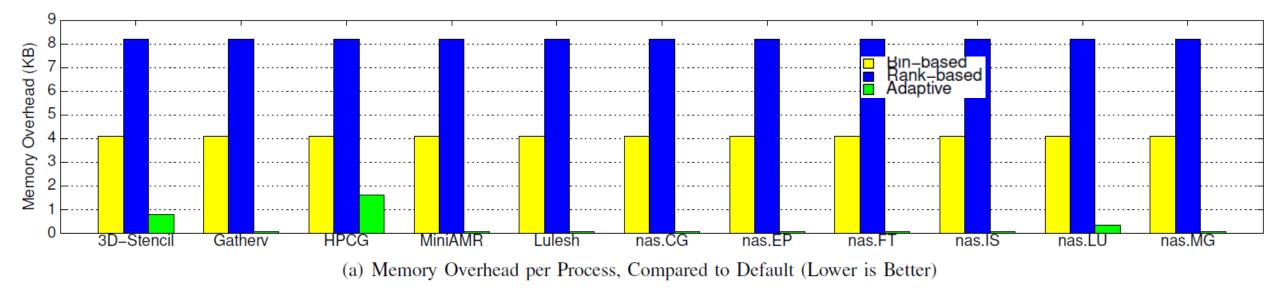
## **Summary of Tag Matching Performance**



(b) Total Tag Matching Time, Normalized to Default (Lower is Better)

- Comparison of different designs/benchmarks at 512 processes on RI
- Adaptive design shows the best performance

# **Summary of Memory Consumed for Tag Matching**



- Comparison of different designs/ benchmarks at 512 processes on RI with default design
- Adaptive design shows minimal memory overhead



### Scalable Reduction Collectives with Data Partitioningbased Multi-Leader Design

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### **MPI Reduction Collectives 101**

- Convenient abstraction to implement group communication operations
- Widely used across various scientific domains
  - Owing to their ease of use and performance portability
- One of the most popular collective operations: MPI\_Allreduce
  - 37% of communication time
- MPI\_Allreduce reduces values from all processes and distribute the result back to all processes

#### Network Based Computing Laboratory

## **Existing Designs for MPI\_Allreduce**

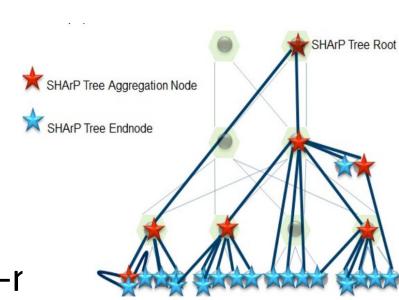
- Hierarchical strategy
- TreeAbasedesteabergiesach
- Nerveuksprff poder og ungehavisraot + inter-r
  - Sealadden Higher bisadi Azeresztion Retage / SHArps de Mellane
    - Wishage Heim and executation of MPI operations in the network by Asime SHARPS are involved in computation

Cluster'16

Bairs distance doubles after each step
 Similar to hierarchical strategy

\* Bloch et al. Scalable Hierarchical Aggregation Protocol (SHArP): A Hardware Architecture for Efficient Data Reduction

• Log (P\*) steps (PI transfer to send everything to same socket



## **Relative Throughput of Different Architectures**

- Using OSU Micro benchmark suite\*
- "Multiple Bandwidth Test"
  - Back-to-back messages
    - Sent to a pair before waiting for receive
- Evaluates the aggregate unidirectional bandwidth between multiple pairs of processes
- 1) Xeon + IB, 2) Xeon + Omni-Path, and 3) KNL + Omni-Path

# **Communication Characteristics of Modern Architectures:** Intra-node Communication

Shared Memory (KNL)

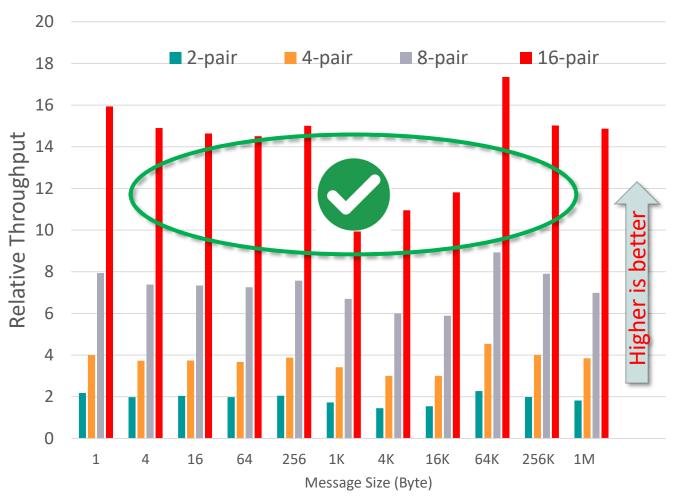


Multiple pair test vs. one pair test

- The relative throughput very close to the number of pairs
- Support many concurrent intra-node communication

### **Communication Characteristics of Modern Architectures: InfiniBand Interconnect**

Xeon (Haswell) + IB (EDR - 100Gbps)



Multiple pair test vs. one pair test

- The relative throughput close to the number of communicating processes per node
- Support many concurrent intranode communication

## **Communication Characteristics of Modern Architectures: Omni-Path Interconnect**

KNL + Omni-Path (100 Gbps)



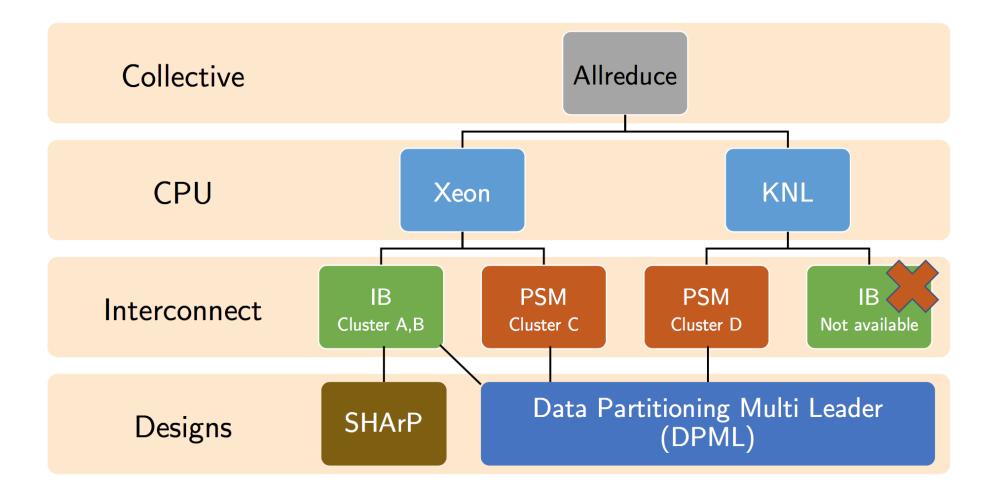
Multiple pair test vs. one pair test

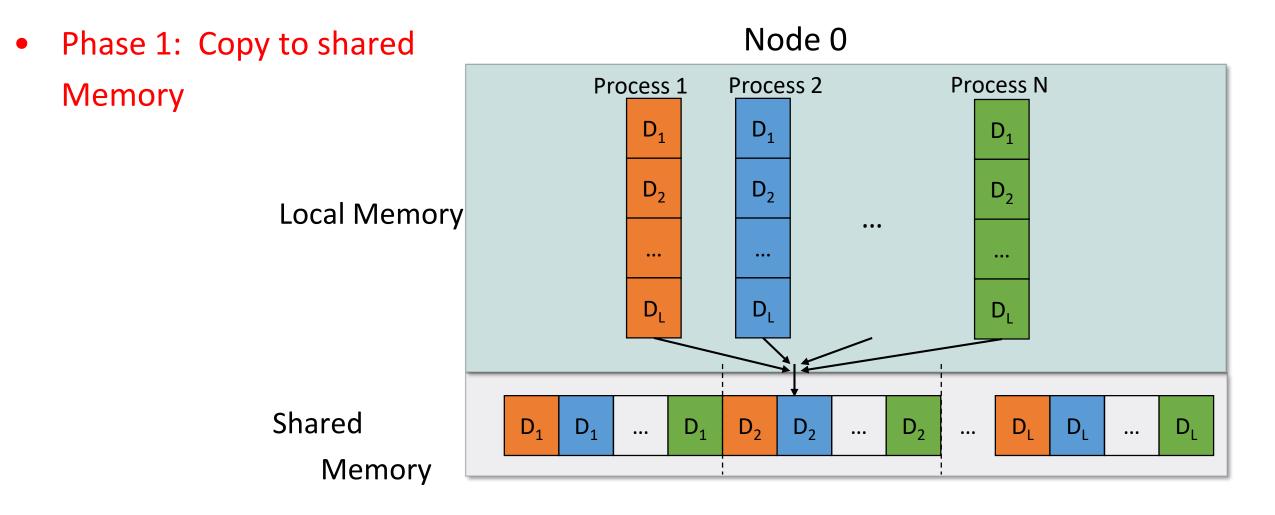
- The relative throughput of one for large messages
- Supports many concurrent communications for small and medium message range
- Similar behavior observed for Xeon + Omni-Path

# **Performance limitations of Existing Designs for MPI\_Allreduce**

- Does not take advantage of large number of cores and high concurrency in communication
- Does not take advantage of shared memory collectives
  - Needs kernel support for zero-copy communication for large messages in same node
- Too many inter-node communication for large PPNs
- Limited performance due to extra QPI transfers
- Limited computing power of switches limits its performance for medium and large message ranges

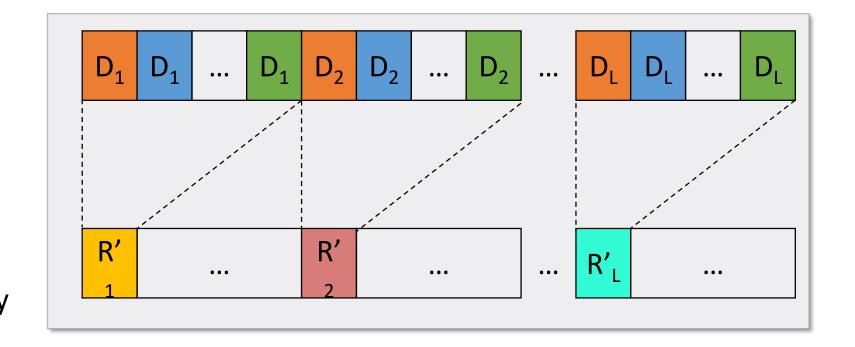
### **Design Outline**



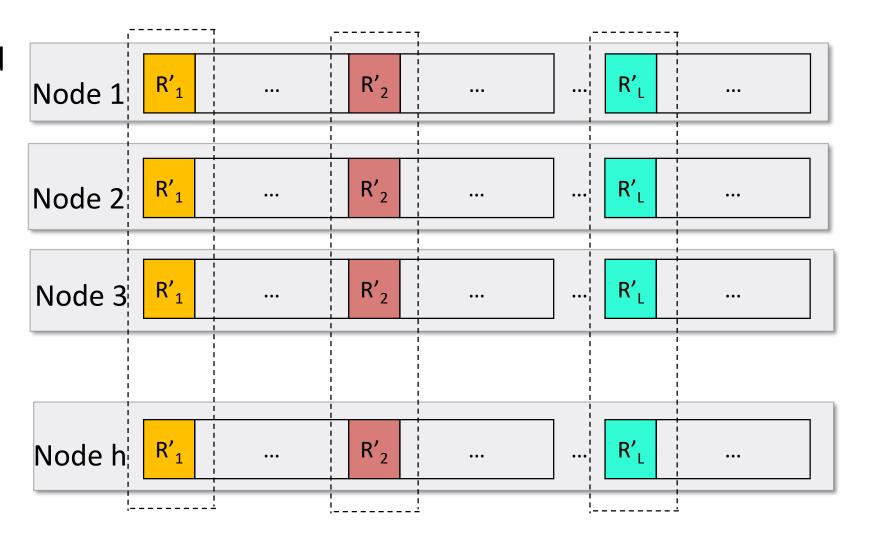


- Phase 1: Copy to shared Memory
- Phase 2: Parallel Intranode reduction by the leaders

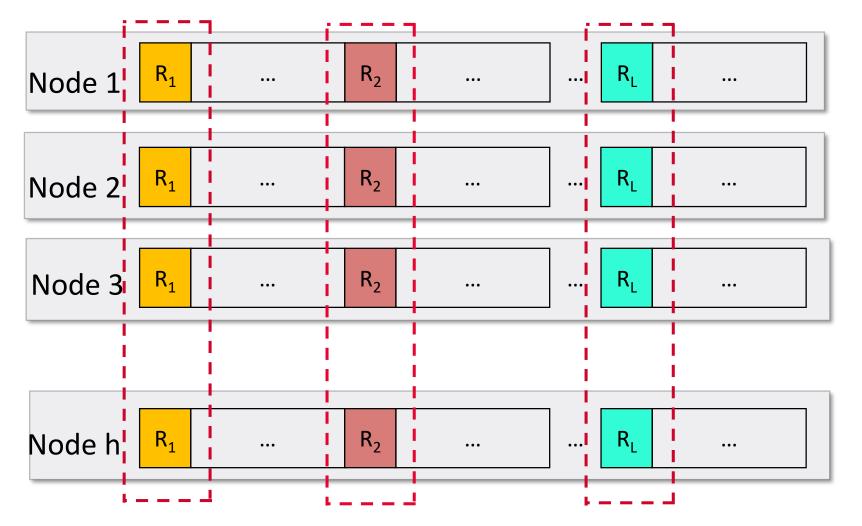
Shared Memory



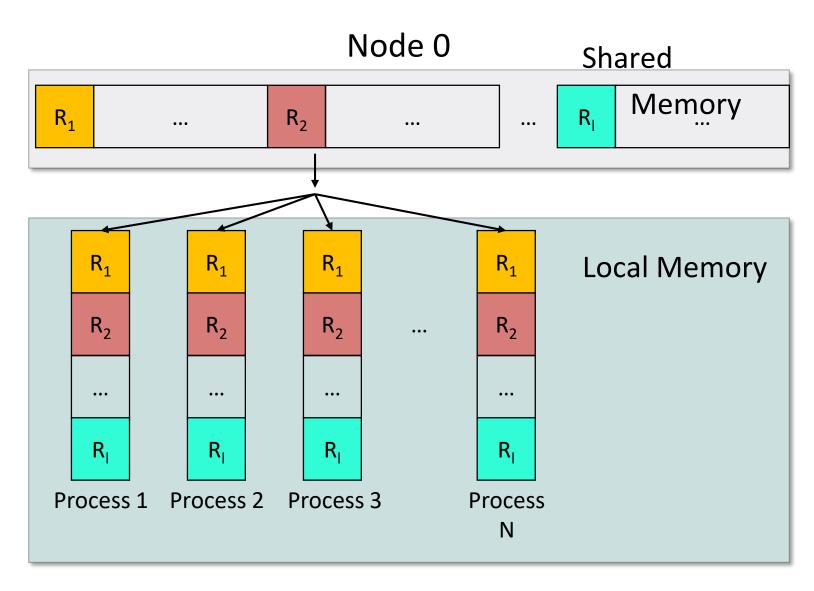
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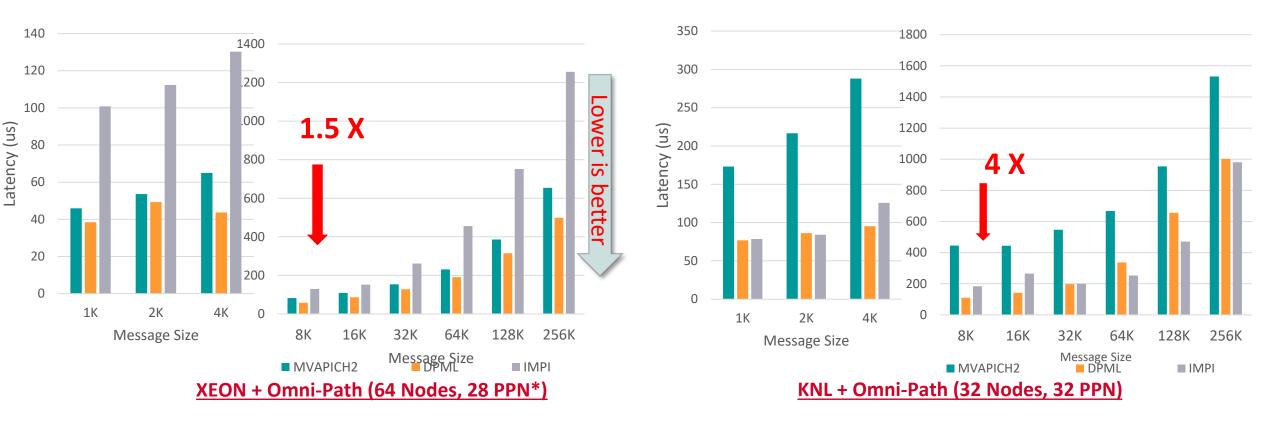
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- Phase 3: Parallel Internode Allreduce by the leaders with same index



- Phase 1: Copy to shared Memory
- Phase 2: Parallel Intranode reduction by the leaders
- Phase 3: Parallel Internode Allreduce by the leaders with same index
- Phase 4: Parallel
  distribution of Allreduce
  results to local buffers



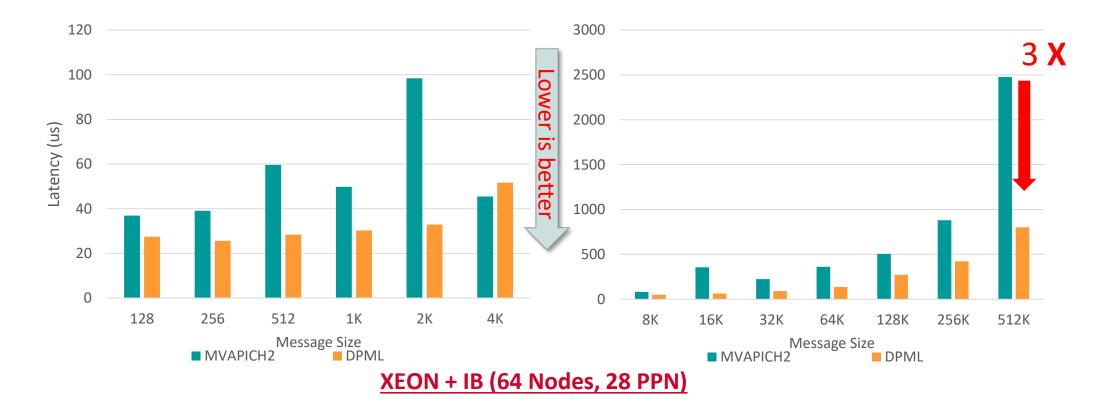
### Performance of MPI\_Allreduce On Omni-Path



- DPML always outperform MVAPICH2 for all medium and large message range
- DPML outperform IMPI in medium message range
- High parallelism of DPML benefits KNL more than XEON

\*Processes Per Node

### Performance of MPI\_Allreduce On InfiniBand



- DPML outperform MVAPICH2 for most of the medium and large message range
  - With 512K bytes, 3X improvement of DPML
- Higher benefits of DPML as the message size increases

### **Conclusions & Future Work**

- Designed multi-leader based collective operations
  - Capable of taking advantage of high-end features offered by modern network interconnects
- Modeled and analyzed proposed design theoretically
- The benefits were evaluated on different architectures
- The DPML design is released as a part of MVAPICH2-X 2.3b! Check out:
  - http://mvapich.cse.ohio-state.edu/overview/#mv2X
- Studied the interplay between communication pattern of applications and different tag matching schemes
- Proposes, designed and implemented a dynamic and adaptive tag matching scheme capable to adapting dynamically to the communication characteristics of applications
- The adaptive approach opens up a new direction to design tag matching schemes for nextgeneration exascale systems