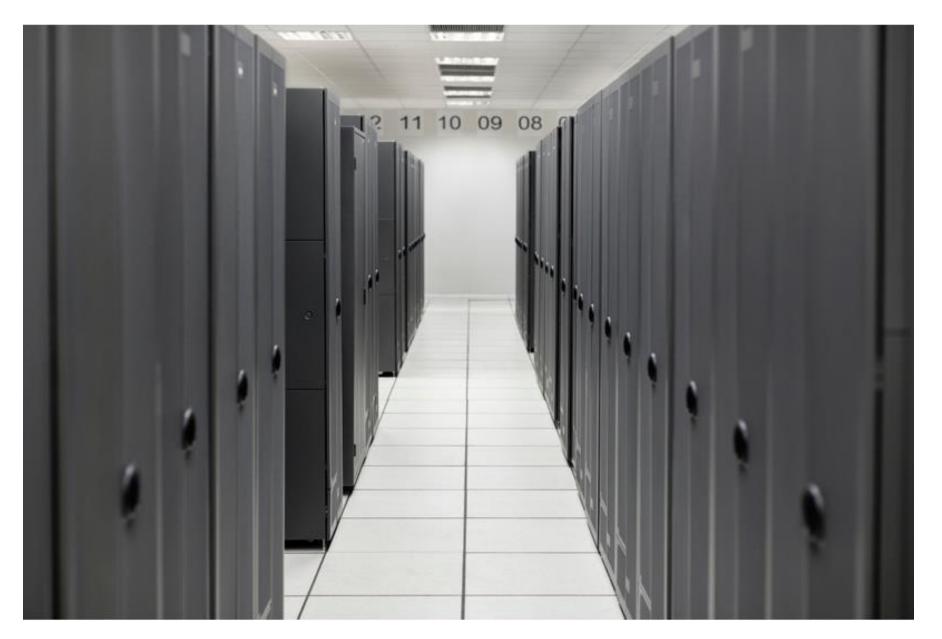
### Designing Topology-Aware Collective Communication Algorithms for Large Scale InfiniBand Clusters: Case Studies with Scatter and Gather

Krishna Kandalla, Hari Subramoni, Abhinav Vishnu and Dhabaleswar K. (DK) Panda

**IPDPS 2010** 

March 6, 2024



Source: hpe.com

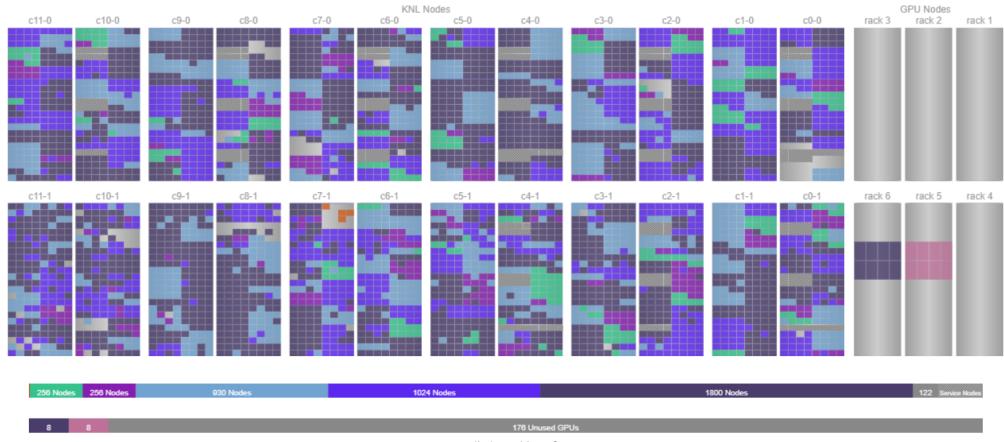




Theta Status 611-0 c8-0 c7-0 c6-0 c5-0 c4-0 c3-0 c2-0 c1-0 c0-0 Running Starting Reservations Queued

|                 | Total Running Jobs: 8 |                |         |            |            |                         |              |        |
|-----------------|-----------------------|----------------|---------|------------|------------|-------------------------|--------------|--------|
|                 | Job Id 🔾              | Project ♦      | Nodes v | Start Time | Run Time ♦ | Walltime $\diamondsuit$ | Queue ♦      | Mode 0 |
|                 | 512304                | EstopSim_2     | 1024    | 9:13:30 AM | 00:12:13   | 16:00:00                | default      | script |
|                 | 512623                | TurbShockWalls | 840     | 7:57:42 AM | 01:28:01   | 1d 00:00:00             | default      | script |
|                 | 498557                | TurbShockWalls | 802     | 9:43:57 PM | 11:41:46   | 1d 00:00:00             | default      | script |
|                 | 513358                | PSFMat_2       | 640     | 8:29:27 AM | 00:56:16   | 12:00:00                | default      | script |
|                 | 511830                | ReconDepth     | 300     | 7:50:53 AM | 01:34:50   | 06:00:00                | default      | script |
|                 | 514000                | HighLumin      | 256     | 8:50:22 AM | 00:35:21   | 06:00:00                | default      | script |
| / 1\            | 514114                | CVD_CityCOVID  | 241     | 1:28:47 AM | 07:56:56   | 1d 12:00:00             | CVD_Research | script |
| a (now retired) | 514178                | FDTD_Cancer_2a | 128     | 8:00:51 AM | 01:24:52   | 03:00:00                | default      | script |
|                 |                       |                |         |            |            |                         |              |        |

### 2023



gpu thetagpu14-gpu3

Total Running Jobs: 8

| Job Id 🗘 | Project ♦           | Nodes ▼ | Start Time ◊ | Run Time 🗘 | Walltime $\diamondsuit$ | Queue ♦          | Mode 🗘 |
|----------|---------------------|---------|--------------|------------|-------------------------|------------------|--------|
| 651326   | TRB                 | 1800    | 9:46:25 PM   | 15:23:19   | 1d 00:00:00             | default          | script |
| 651396   | WallBoundedMHDTurb  | 1024    | 9:46:11 PM   | 15:23:34   | 1d 00:00:00             | default          | script |
| 651447   | 3DWholeGenome       | 930     | 9:46:29 PM   | 15:23:16   | 1d 00:00:00             | default          | script |
| 651582   | PTLearnPhoto        | 256     | 7:43:26 AM   | 05:26:18   | 06:00:00                | default          | script |
| 651541   | QMCPACK_aesp        | 256     | 11:31:38 AM  | 01:38:06   | 06:00:00                | backfill         | script |
| 651605   | Catalyst            | 4       | 12:29:55 PM  | 00:39:49   | 01:00:00                | debug-cache-quad | script |
| 10133030 | datascience         | 1       | 7:48:03 AM   | 05:21:41   | 12:00:00                | full-node        | script |
| 10133042 | Al-based-NDI-Spirit | 1       | 11:14:56 AM  | 01:54:49   | 12:00:00                | bigmem           | script |

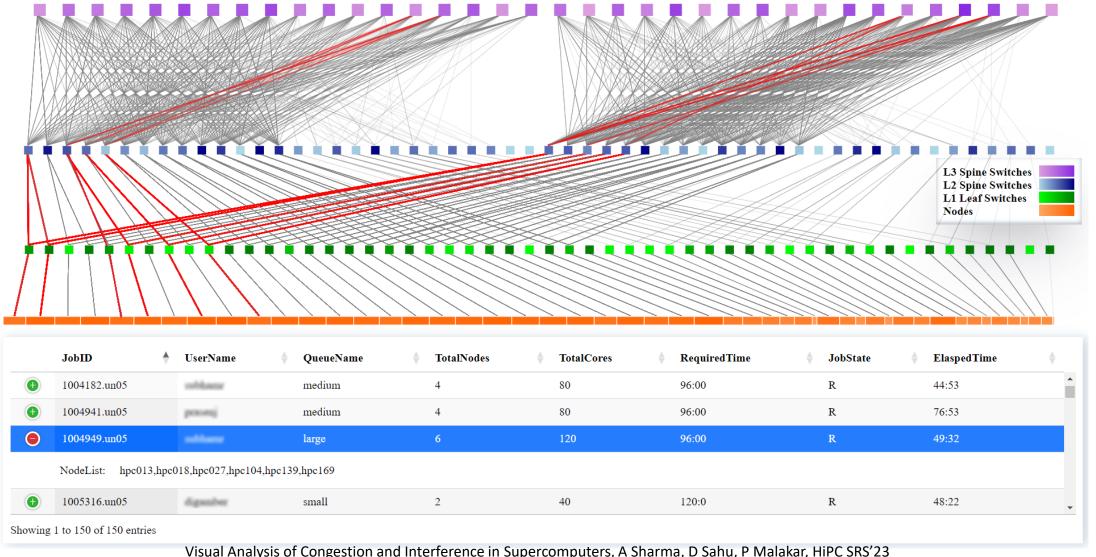
#### Total Queued Jobs:

| Job Id 🛦 | Project ♦        | Score ♦   | Walltime ♦  | Queued Time   | Queue ♦  | Nodes ♦ | Mode 💸      |
|----------|------------------|-----------|-------------|---------------|----------|---------|-------------|
| 488198   | NucStructReact_6 | 40.00     | 06:00:00    | 114d 02:05:56 | backfill | 2048    | script      |
| 488200   | NucStructReact_6 | 40.00     | 06:00:00    | 114d 02:05:33 | backfill | 2048    | script      |
| 488201   | NucStructReact_6 | 40.00     | 06:00:00    | 114d 02:05:15 | backfill | 2048    | script      |
| 488202   | NucStructReact_6 | 40.00     | 06:00:00    | 114d 02:04:52 | backfill | 2048    | script      |
| 488612   | NextGenReac      | 40.00     | 06:00:00    | 110d 10:35:36 | backfill | 1024    | script      |
| 505064   | TurbShockWalls   | 86.10     | 09:00:00    | 33d 20:13:16  | default  | 512     | script      |
| 509215   | ClimateEnergy_4  | 59,231.06 | 01:00:00    | 20d 05:04:52  | default  | 128     | script      |
| 511951   | TurbShockWalls   | 1,074.68  | 1d 00:00:00 | 8d 02:01:15   | default  | 802     | script      |
| 512878   | CSC249ADSE16     | 397.24    | 09:30:00    | 5d 00:47:21   | default  | 1024    | script      |
| 513149   | NanoReactive_3   | 1,120.58  | 14:00:00    | 4d 06:39:18   | default  | 1041    | script      |
| 513267   | TurbShockWalls   | 620.78    | 1d 00:00:00 | 3d 17:12:12   | default  | 840     | script      |
| 513422   | CSC249ADCD08     | 15.44     | 06:00:00    | 3d 03:43:45   | backfill | 256     | script      |
| 513426   | CSC249ADCD08     | 15.39     | 06:00:00    | 3d 03:25:28   | backfill | 256     | script      |
| 513434   | CSC249ADCD08     | 15.18     | 06:00:00    | 3d 02:05:25   | backfill | 256     | script      |
| 513435   | CSC249ADCD08     | 15.18     | 06:00:00    | 3d 02:05:10   | backfill | 256     | script      |
| 513436   | CSC249ADCD08     | 15.18     | 06:00:00    | 3d 02:04:42   | backfill | 256     | script      |
| 513437   | CSC249ADCD08     | 15.18     | 06:00:00    | 3d 02:04:03   | backfill | 256     | script      |
| 513593   | UltrafastMat     | 1,341.82  | 1d 00:00:00 | 2d 02:27:31   | default  | 4096    | interactive |
| 513598   | DirectFusion     | 119.55    | 09:00:00    | 2d 00:23:41   | default  | 520     | script      |
| 513613   | spentFuel        | 51.00     | 01:00:00    | 1d 23:48:13   | default  | 256     | script      |
| 513654   | TurbShockWalls   | 106.47    | 1d 00:00:00 | 1d 16:48:06   | default  | 832     | script      |
| 513656   | TurbShockWalls   | 105.66    | 1d 00:00:00 | 1d 16:36:07   | default  | 832     | script      |
| 513722   | HHPMT_5          | 51.07     | 06:00:00    | 1d 13:40:04   | default  | 256     | script      |
| 513736   | HierChemSep      | 64.65     | 09:00:00    | 1d 13:13:09   | default  | 512     | script      |
| 513758   | PSFMat_2         | 146.57    | 06:00:00    | 1d 12:13:35   | default  | 512     | script      |
| 513759   | PSFMat_2         | 146.44    | 06:00:00    | 1d 12:12:36   | default  | 512     | script      |
| 513760   | PSFMat_2         | 65.85     | 12:00:00    | 1d 12:09:34   | default  | 640     | script      |
| 513768   | IonTransES       | 124.08    | 06:00:00    | 1d 11:42:09   | default  | 409     | script      |
| 513769   | IonTransES       | 79.53     | 09:00:00    | 1d 11:40:36   | default  | 540     | script      |
| 513771   | IonTransES       | 87.89     | 09:00:00    | 1d 11:20:44   | default  | 718     | script      |
| 513823   | HierChemSep      | 122.00    | 03:00:00    | 1d 08:48:33   | default  | 512     | script      |

## Batch Queueing Systems – Features

- Has full knowledge of queued, running jobs
- Has full knowledge of the resource usage
- Typically FCFS with backfilling
- Node allocation may not be contiguous

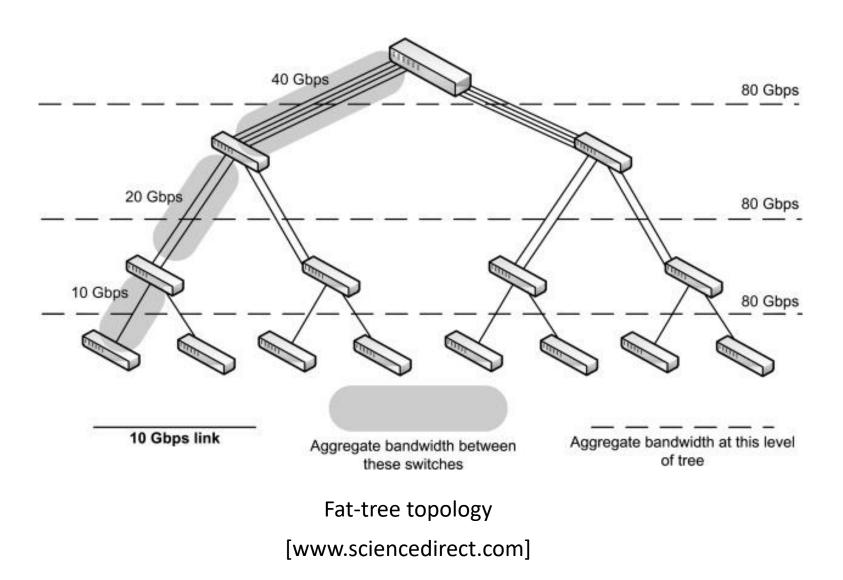
## PARAM Sanganak Real Time Job Path



### Research Questions

- How do we efficiently discover the topology of a large scale InfiniBand cluster?
- What are the challenges involved in designing efficient collective algorithms that are aware of the network topology?
- Can we derive communication cost models for collective operations on large-scale systems with several levels of hierarchies?
- What is the effect of the background traffic on the performance of collective operations? Can we leverage the topology information to design algorithms that are resilient to network contention?

# Network Topology



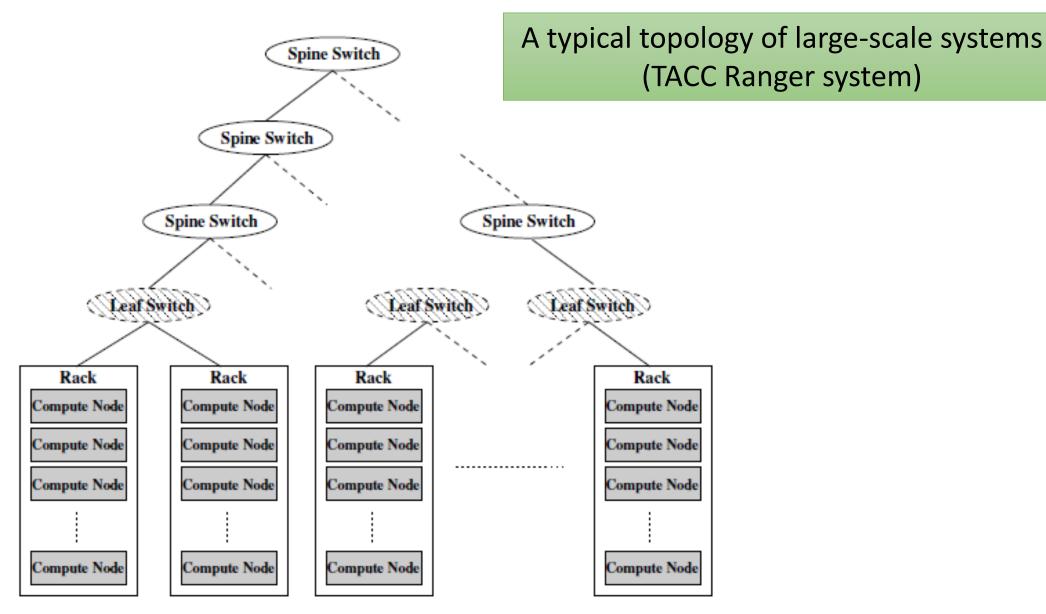
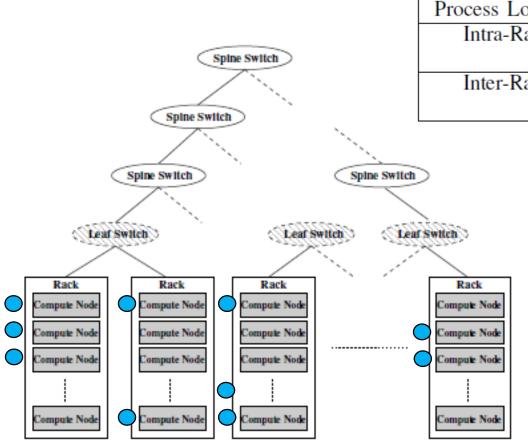


Figure 1. A Typical Topology

## Effect of Topology on Latency



| Process Location |               | Number of Hops             | MPI Latency (us) |
|------------------|---------------|----------------------------|------------------|
| Intra-Rack       | Intra-Chassis | 0 Hops in Leaf Switch      | 1.57             |
|                  | Inter-Chassis | 1 Hop in Leaf Switch       | 2.04             |
| Inter-Rack       |               | 3 Hops Across Spine Switch | 2.45             |
|                  |               | 5 Hops Across Spine Switch | 2.85             |

- Allocated nodes are usually scattered in the system
- Different job request sizes and durations
- Contiguous node allocation may increase queue waiting times

A typical topology of large-scale systems

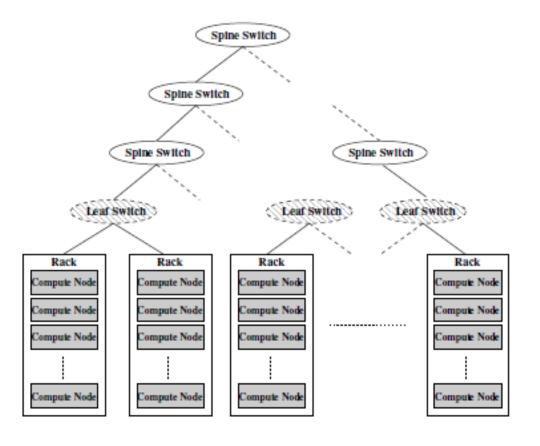
(TACC Ranger system)

## Contribution: Topology-aware Collectives

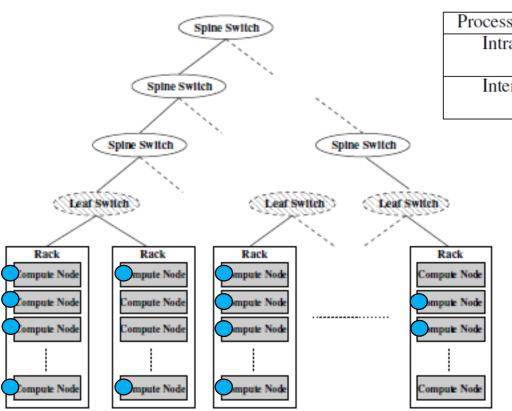
- Topology-aware Gather and Scatter
- Modified communication model
- 54% improvement on micro-benchmarks

## Topology-aware Gather

- Designate a rack leader process
- Rack-leader processes independently perform intra-switch gather
- R rack leaders perform inter-switch gather
- Reduced L and B terms (due to reduction in inter-switch exchanges)



### Create Sub-communicators



| Process Location |               | Number of Hops             | MPI Latency (us) |
|------------------|---------------|----------------------------|------------------|
| Intra-Rack       | Intra-Chassis | 0 Hops in Leaf Switch      | 1.57             |
|                  | Inter-Chassis | 1 Hop in Leaf Switch       | 2.04             |
| Inter-Rack       |               | 3 Hops Across Spine Switch | 2.45             |
|                  |               | 5 Hops Across Spine Switch | 2.85             |

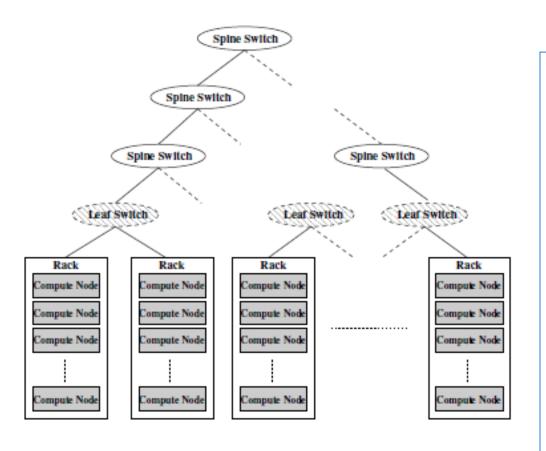
- intra-chassis communicators
- intra-switch communicators
- chassis-leader communicators
- switch-leader communicators

## Discover Topology

- Infiniband tools
  - ibnetdiscover outputs the switch connections / identifiers
  - One-time discovery (in general)
- MPI\_Init
  - Create intra-chassis communicators all nodes in the same chassis
  - Create intra-switch communicators all nodes in the same leaf switch
  - Assign one chassis-leader and one switch-leader
  - Create switch-leader and chassis-leader communicators

### Cost of Communication

 $t_s$ -intra-node <  $t_s$ -intra-switch <  $t_s$ -inter-switch  $t_w$ -intra-node <  $t_w$ -intra-switch <  $t_w$ -inter-switch



Cost involved for communication within the same node

L: t<sub>s</sub>-intra-node

B: t<sub>w</sub>-intra-node

Cost of communication within the same leaf switch

L: t<sub>s</sub>-intra-switch

B: t<sub>w</sub>-intra-switch

Cost involved for an inter-switch communication

L: t<sub>s</sub>-inter-switch

B: t<sub>w</sub>-inter-switch

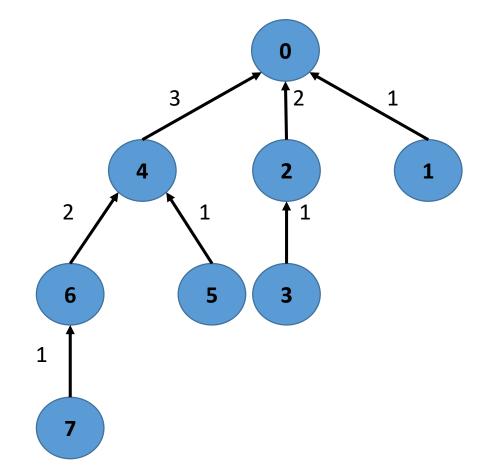
- 1. Actual cost depends on the #hops based on the actual placement of processes
- 2. Contention for intra-node/switch << inter-switch

### Gather Communication Cost

### Binomial tree

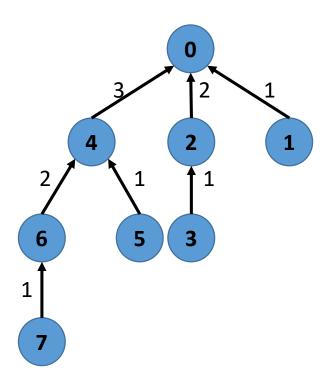
Time:  $(\log p)*L + (p-1)/p*(n/B)$ 

L = latency, B = bandwidth



## Cost Model (Original Gather - Binomial)

Number of racks = R Number of processes = P Message size = N



Number of exchanges at i<sup>th</sup> level: C<sub>i</sub>

 $C_1$  = Number of intra-node transfers

 $C_2$  = Number of intra-switch transfers

 $C_3$  = Number of inter-switch transfers

Switch-level contention:  $\alpha$ 

There's a typo in the paper. Read this as ts-intra-node

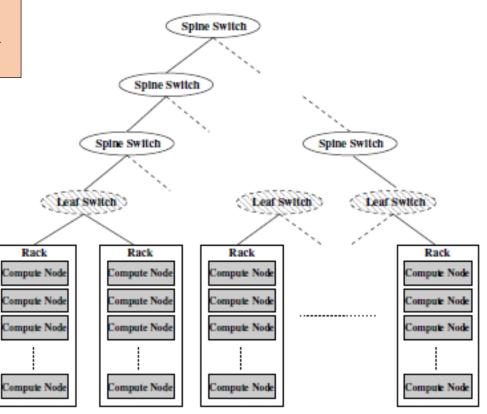
$$T_{binomial} = (t_s\text{-}inter\text{-}node*C_1 + t_s\text{-}intra\text{-}switch*C_2 \\ + \alpha*t_s\text{-}inter\text{-}switch*C_3) + t_w\text{-}intra\text{-}node \\ *(C_1)*(N*\gamma) + t_w\text{-}intra\text{-}switch \\ *(C_2)*(N*\beta) + \alpha*t_w\text{-}inter\text{-}switch \\ *(C_3)*(N*\delta)$$

## Communication Cost for Gather (Binomial)

- The bandwidth term is obtained by adding costs at each level
- $[C_1 * \gamma + C_2 * \beta + C_3 * \delta] * N = (p-1)/p * N$

There's a typo in the paper. Read this as ts-intra-node

$$T_{binomial} = (t_s\text{-}inter\text{-}node*C_1 + t_s\text{-}intra\text{-}switch*C_2 \\ + \alpha*t_s\text{-}inter\text{-}switch*C_3) + t_w\text{-}intra\text{-}node \\ *(C_1)*(N*\gamma) + t_w\text{-}intra\text{-}switch \\ *(C_2)*(N*\beta) + \alpha*t_w\text{-}inter\text{-}switch \\ *(C_3)*(N*\delta)$$



## Communication Cost Comparison

$$T_{binomial} > (\alpha * t_s \text{-inter-switch} * C_3)$$

$$+(\alpha * N * t_w \text{-inter-switch} * C_3 * \delta)$$

$$T_{topo} > (\alpha * t_s\text{-inter-switch} * log(R))$$
  
+ $(\alpha * (1 - 1/R))/(M * t_w\text{-inter-switch})$ 

$$T_{binomial}/T_{topo} = N * \delta * C_3/(M * (1 - 1/R))$$

- 1. The rack-leader processes independently perform an intraswitch gather operation. This phase of the algorithm does not involve any inter-switch exchanges.
- 2. Once the rack-leaders have completed the first phase, the data is gathered at the root through an inter-switch gather operation performed over the *R* rack-leader processes.

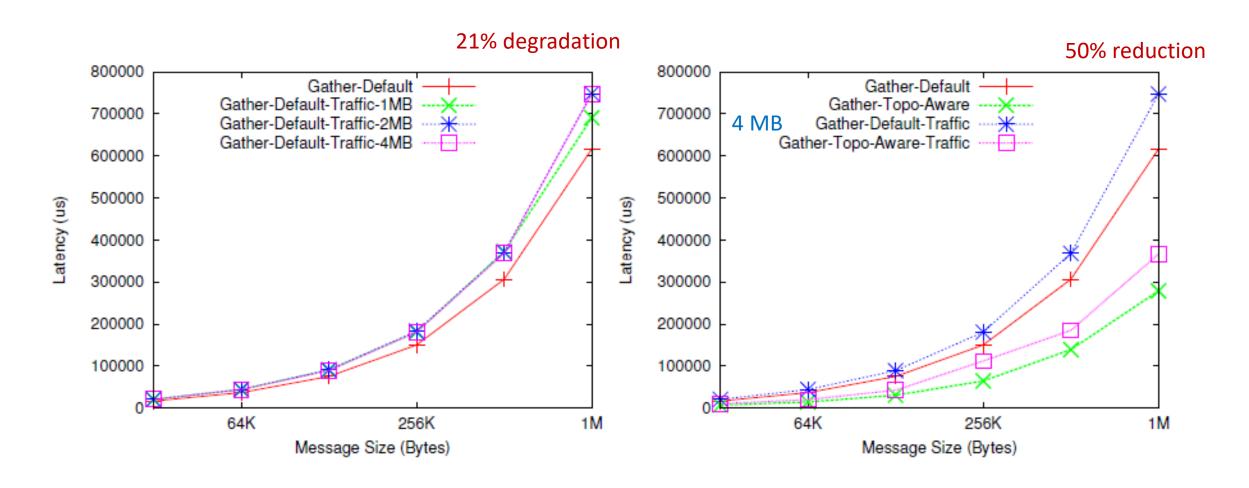
## Experimental Setup

- Three InfiniBand DDR switches A, B and C to create a tree topology.
- Switch A is connected to 8 nodes based on the quad-core, quad-socket AMD Barcelona architecture (4 nodes /64 processes used)
- Switch B is connected to 32 nodes based on the quad-core, dualsocket Intel Clovertown architecture (29 nodes/ 232 processes used)
- Switches A and B are connected to Switch C with two InfiniBand DDR links each.

### Benchmark

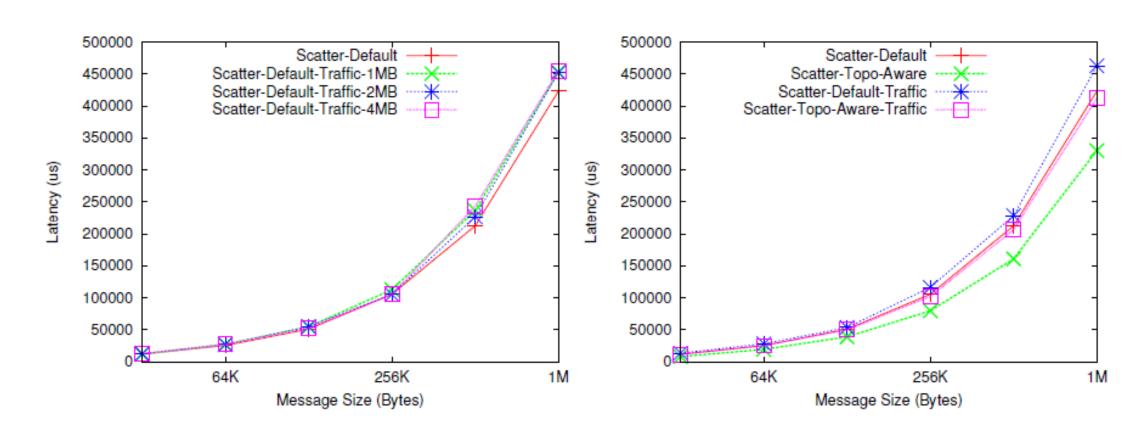
- A simple benchmark code iterates through various message sizes (0 1 MB) and invokes a collective call several times in a loop.
- Measured average time when system is quiet
- AlltoAll is used to create background traffic (K/2 in each switch)
  - Constant traffic K\*M bytes over the switches

# Gather Results (With and Without Traffic)



### Scatter Results

#### Homework: T\_Scatter < T\_Gather?

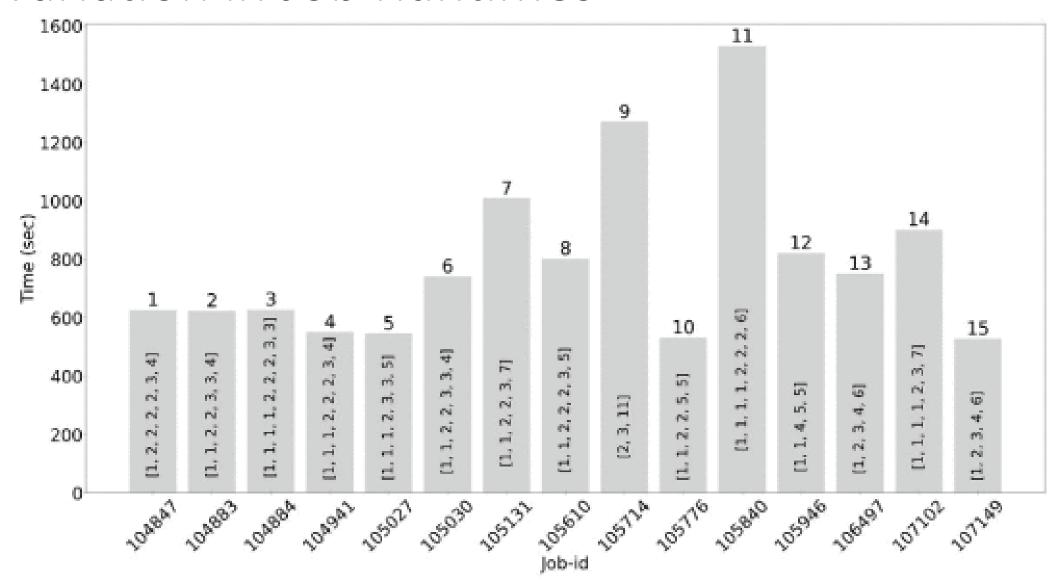


### Conclusions

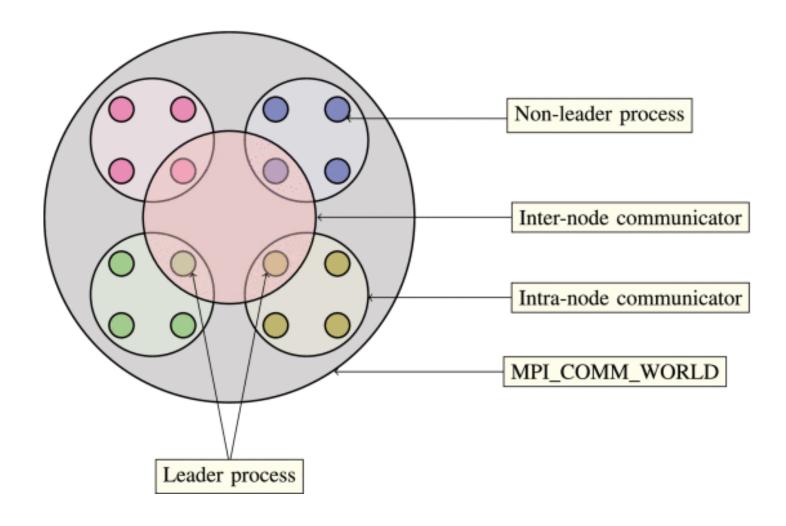
- Presence of background traffic may lead to performance degradation
- Efficient software stack may improve performance
- Topology-aware Gather and Scatter was shown to perform better

Hierarchical Communication Optimization for FFT, M Kumar, P Malakar, SC W HiPar 2022

### Variation in Job Runtimes



## Hierarchical AlltoAll/Sendrecv



### Results

