# Collective Communications inside MPI

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#### Outline

- What is a Collective ?
- Behind Gather
- Overview of algorithms
  - Binomial Tree
  - Barrier Algorithms
  - Allgather
  - ...
- Current state of research

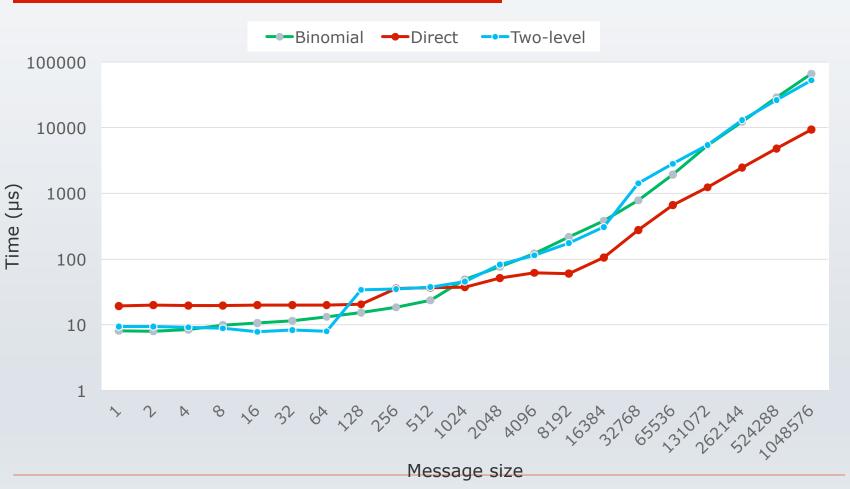
#### What is a Collective?

- Collective communication is a method of communication which involves participation of **all** processes in a communicator.
- MPI-1: Blocking Collectives
- MPI-3: Non-blocking Collectives

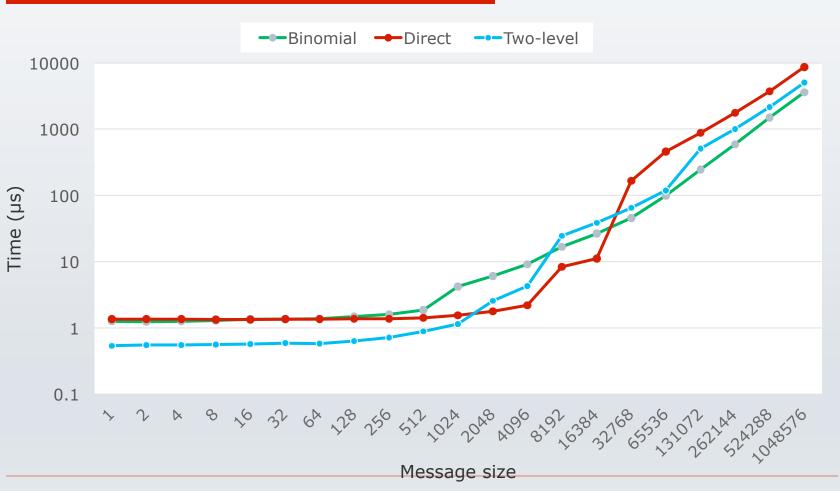
#### Goal of this presentation

- ☐ Why do we need different algorithms?
- Which one is the best? How to do the tuning?
- ☐ Example of algorithms.
- What is the current state of research in this area ?

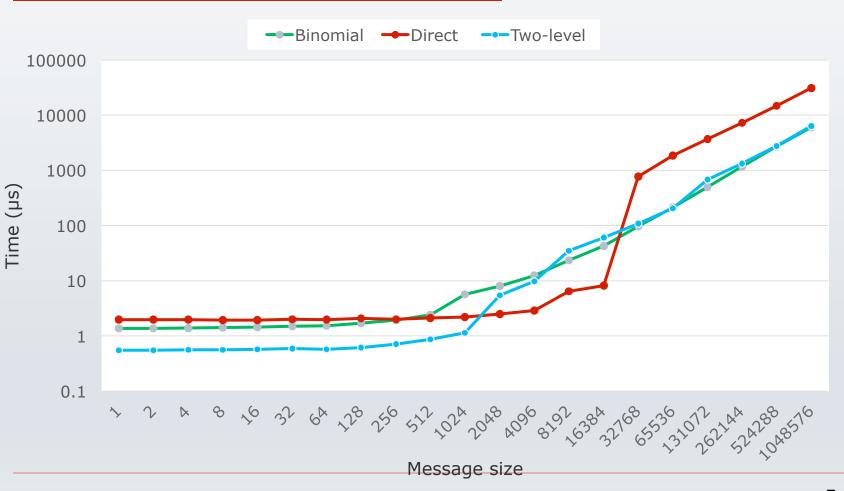
#### Behind Gather (64 cores/IMB)



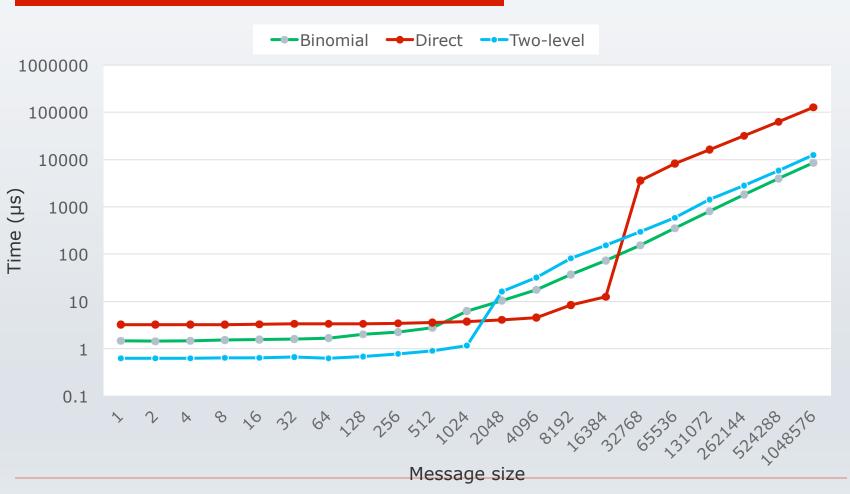
#### Behind Gather (64 cores/OMB)



# Behind Gather (256 cores/OMB)



#### Behind Gather (1024 cores/OMB)



# General Notes on Optimizing Collectives

- 2 components for collective communications – latency and bandwidth
- □ Latency(a) time when the collective completes with the first byte
- Bandwidth(β) rate at which collective proceeds after the first byte transmission
- $\square$  Cost for communication  $a+\beta m$  (Hockney)
- □ Latency is critical for small message sizes and bandwidth for large message sizes

#### MVAPICH Algorithm choices

- □ Depend on Platform
- Depend on system size
- □ Based on OSU Micro Benchmarks (OMB) results
- ☐ For each Platform:

Step 1: Point-to-Point Tuning

Step 2: Collective Tuning

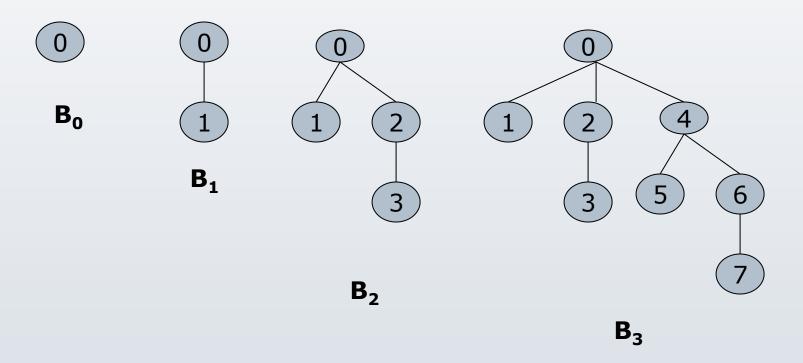
## Overview of algorithms

- □ Binomial Tree
- □ Barrier (Butterfly, Dissemination, Tournament...)
- Allgather
- □ Alltoall
- Reduce-Scatter for commutative operations: Recursive halving algorithm

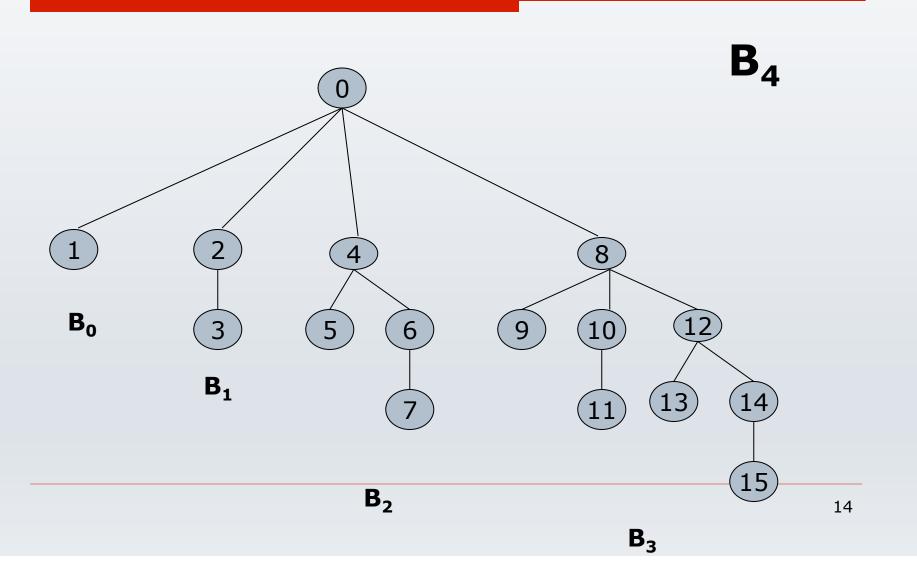
#### **Binomial Tree**

- □ **Definition (Binomial Tree)** The *binomial tree of* order  $k \ge 0$  with root R is the tree  $B_k$  defined as follows
  - 1. If k=0,  $B_k = \{R\}$ . i.e., the binomial tree of order zero consists of a single node, R.
  - 2. If k>0,  $B_k = \{R, B_0, B_1, ... B_{k-1}\}$ . i.e., the binomial tree of order k>0 comprises the root R, and k binomial subtrees,  $B_0 B_{k-1}$ .
- $\square$  B<sub>k</sub> contains 2<sup>k</sup> nodes
- $\square$  The height of  $B_k$  is k
- □ The number of nodes at level I in  $B_k$ , where  $0 \le I \le k$ , is given by the *binomial coefficient*  ${}^kC_I$

# **Binomial Trees**

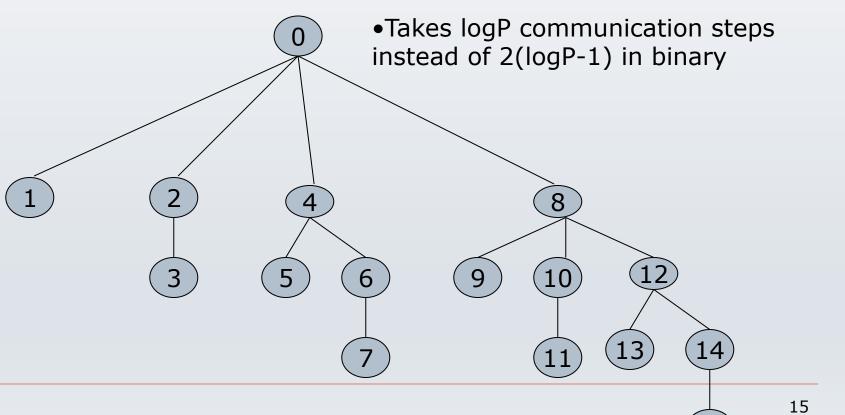


# **Binomial Trees**



#### **Binomial Trees**

•Broadcast, Scatter and Gather usually implemented by binomial



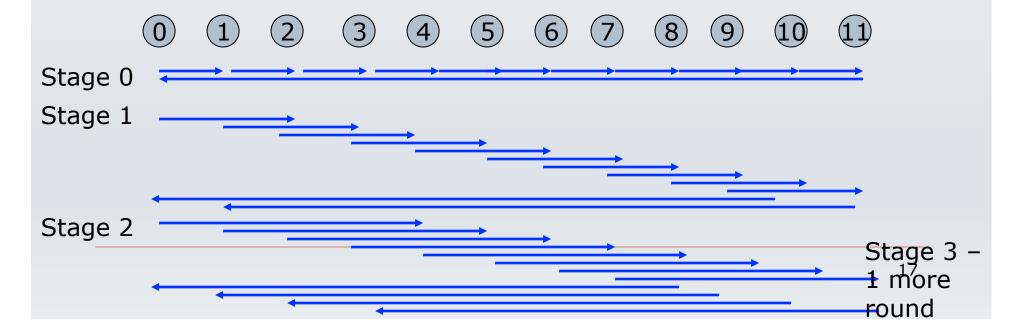
- ☐ **Butterfly barrier** by Eugene Brooks II
- $\square$  In round k, i synchronizes with i $\oplus$  2<sup>k</sup> pairwise.
- ☐ If p not power of 2, existing procs. stand for missing ones.
- Worstcase 2logP pairwise synchronizations by a processor
  - 0 1 2 3 4 5 6 7 8 9 10 11

Stage 2 \_\_\_\_\_\_\_\_\_\_

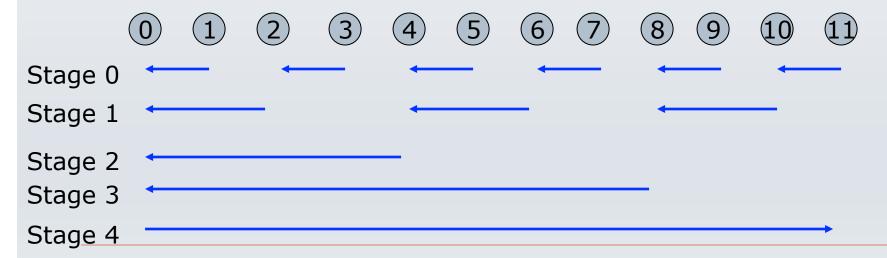
Stage 3 \_\_\_\_\_

Stage 4

- □ **Dissemination barrier** by Hensgen, Finkel and Manser
- □ In round k, i signals (i+2<sup>k</sup>)mod P
- No pairwise synchronization
- ☐ Same as butterfly but with different partners
- □ Almost log(next power of 2 > P) on critical path irrespective of P



- ☐ **Tournament barrier** by Hensgen, Finkel and Manser
- $\square$  In the 1<sup>st</sup> round, each pair of nodes (players) synchronize (play a game)
- The receiver will be considered as the winner of the game
- $\square$  In the 2<sup>nd</sup> round, the winners of the 1<sup>st</sup> round will synchronize (play games)
- ☐ The receiver in the 2<sup>nd</sup> round will advance to the 3<sup>rd</sup> round
- ☐ This process continues till there is 1 winner left in the tournament
- ☐ The single winner then broadcasts a message to all the other nodes
- $\square$  At each round k, proc. j receives a message from proc. i, where i = j  $2^k$



- MVAPICH Barrier (pairwise exchange with recursive doubling)
- □ Same as butterfly barrier.
- If nodes not equal to power, find the nearest power of 2, i.e.  $m = 2^n$
- □ The last surfeit nodes, i.e. surfeit = size m, initially send messages to the first surfeit number of nodes
- ☐ The first m nodes then perform butterfly barrier
- ☐ Finally, the first surfeit nodes send messages to the last surfeit
  - Ode 1
- 2
- 3
- 4
- 5
- 6
- 7
- 9
- 10
- 11

Stage first

Stage 0

Stage 1

Stage 2

Stage last

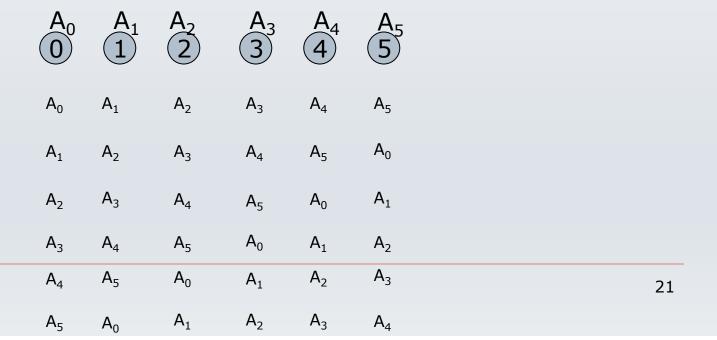
#### Allgather implementation

- In general, optimized allxxx operations depend on hardware topology, network contentions etc.
- Circular/ring allgather
- ☐ Each process receives from left and sends to right
- P steps



# Bruck's Allgather

- □ Similar to dissemination barrier
- □ logP steps



#### AlltoAll

□ The naive implementation

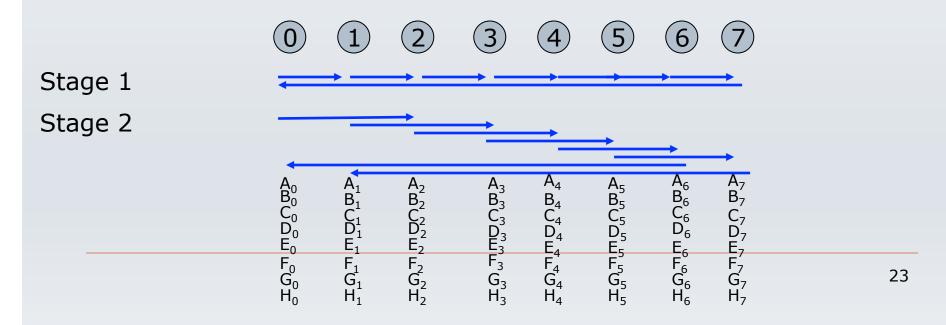
```
for all procs. i in order{
   if i # my proc., then send to i and recv from i
}
```

MPICH implementation – similar to naïve, but doesn't do it in order

```
for all procs. i in order{
  dest = (my_proc+i)modP
  src = (myproc-i+P)modP
  send to dest and recv from src
}
```

#### AlltoAll implementation

- Circular alltoall
- □ For step k in {1..P}, proc. i sends to (i+k)modP and receives from (i-k +P)modP



#### Reduce and AllReduce

- Reduce and allreduce can be implemented with tree algorithms, e.g. binary tree
- But in tree based algorithms, some processors are not involved in computation
- □ Rolf Rabenseifner of Stuttgart algorithms for reduce and allreduce

# Reduce-Scatter for commutative operations: Recursive halving algorithm

- □ Recursive doubling in the first step, communication is with the neighboring process. In each step, the communication distance doubles
- Recursive halving reverse of recursive doubling
- At the first step
  - a process communicates with another process P/2 away
  - sends data needed by the other half
  - Receives data needed by its half
  - Performs operation
- Next step distance P/4 away and so on...
- □ IgP steps

# Reduce-Scatter for noncommutative operations: Recursive doubling algorithm

- □ In the first step, data (all data except the one needed for its result) is exchanged with the neighboring process
- ☐ In the next step, (n-2n/p) data (all except the one needed by it and the one needed by process it communicated with the previous step) is communicated with process that is distance 2 apart
- ☐ In the third step (n-4n/p) data with process that is distance 4 apart and so on...
- ☐ IgP steps

## Example – Broadcast (MPICH)

- □ Binomial Broadcast
  - log p steps
  - Amount of data communicated at each step n
  - $\blacksquare$  cost = log p (a+n $\beta$ )
- scatter and allgather
  - Divide message into p segments
  - Scatter the p segments to p processes using binomial scatter  $log p a + (n/p)(p-1) \beta$
  - Scattered data collected at all processes using ring allgather (p-1) a + (n/p)(p-1)  $\beta$
  - $\blacksquare$  cost = (log p + p-1) a + 2(n/p)(p-1) β
- Hence binomial broadcast for small messages and (scatter+allgather) for long messages

#### Two-level Algorithms of MVAPICH

- □ Take into account the node topology
- Notion of "node leader"
- Inter-node communications are between node leaders
- Intra-node communications are between the node leader and other processes
- ☐ Used for Bcast, Reduce, Gather...

#### MPICH Algorithms

- Allgather
  - Bruck Algorithm (variation of dissemination) (< 80 KB) and non-power-of-two</p>
  - Recursive doubling (< 512 KB) for power-of-2 processes
  - ring (> 512 KB) and (80-512 KB) for any processes
- □ Broadcast
  - Binomial (< 12 KB), binomial scatter + ring allgather (> 512 KB)
- Alltoall
  - Bruck's algorithm (for < 256 bytes)</p>
  - Post all irecvs and isends (for medium size messages. 256 bytes 32 KB)
  - Pairwise exchange (for long messages and power-of-2 processors) p-1 steps. In each step k, each process i exchanges data with (i xor k)
  - For non-power of 2, an algorithm in which in each step, k, process i sends data to (i+k) and receives from (i-k)

#### MPICH Algorithms

- □ Reduce-scatter
  - For commutative operations:
    - □ Recursive halving (< 512 KB), pairwise exchange (> 512 KB; p-1 steps; rank+i at step i)
  - For non-commutative:
    - □ Recursive doubling (< 512 bytes), pairwise exchange (> 512 bytes)
- Reduce
  - Binomial algorithm (< 2 KB), Rabenseifner (> 2 KB)
- AllReduce
  - Recursive doubling (short), Rabenseifner (long messages)

#### Current state of research

- Socket level leaders
- Auto Selection of best algorithms (Tuning)
- Usage of CMA (Cross Memory Attach)
- Support for GPUs and MICs
- □ Topology aware collectives
- Energy Aware collectives
- □ Etc....

#### References

- □ Thakur et. al. Optimization of Collective Communication Operations in MPICH. IJHPCA 2005.
- □ Thakur et. al. Improving the Performance of Collective Operations in MPICH. EuroPVM/MPI 2003.
- http://mvapich.cse.ohio-state.edu/ publications/