#### Programmazione di Sistemi <del>Embedded e</del> Multicore

Teacher: Daniele De Sensi

#### Recap

- MPI SPMD Model
- How to to compile an MPI program (mpicc) and run N processes in parallel (mpirun)
- How to retrieve the number of running processes (MPI\_Comm\_size)
- How to retrieve my ID (MPI\_Comm\_rank)
- How to send (MPI\_Send) and receive (MPI\_Recv) data
- How to structure a parallel application

 On the 3 hours lectures, we'll have lesson + hands-on sessions (bring the laptop)

#### Recap

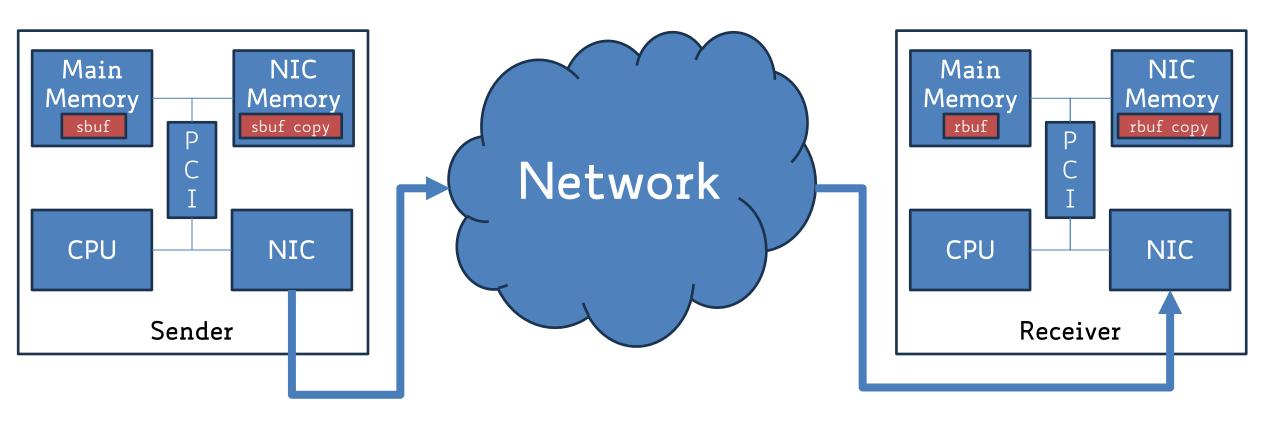
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#### What happens when you do a Send?

MPI\_Send(sbuf, ...)

MPI\_Recv(rbuf, ...)



#### What happens when you do a Send?

```
MPI_Send(buf, 100, ...)
MPI_Send(buf + 100, 100,...)
```

VS.

MPI\_Send(buf, 200,...)

1 Send of 200 bytes better than 2 Sends of 100 bytes each

#### Chapter 5.7-5.9

# MULTICORE AND GPU PROGRAMMING AN INTEGRATED APPROACH

**GERASSIMOS BARLAS** 

#### Point-to-Point Communication Modes

- MPI\_Send uses the so called standard communication mode. MPI decides based on the size of the message, whether to block the call until the destination process collects it or to return before a matching receive is issued. The latter is chosen if the message is small enough, making MPI\_Send locally blocking.
- There are three additional communication modes:
  - Buffered: in buffered mode the sending operation is always locally blocking,
    i.e. it will return as soon as the message is copied to a buffer. The second
    difference with the standard communication mode is that the buffer is userprovided.
  - Synchronous: in synchronous mode, the sending operation will return only after the destination process has initiated and started the retrieval of the message. This is a proper globally blocking operation. Why?
    - Sender can be sure of the point where the receiver is without any further explicit communication
  - Ready: the send operation will succeed only if a matching receive operation
    has been initiated already. Otherwise the function returns with an error code.
    The purpose of this mode is to reduce the overhead of handshaking operations.

#### Point-to-Point Communication Modes

```
int [ MPI_Bsend | MPI_Ssend | MPI_Rsend ] (void *buf, int count, ←
    MPI_Datatype datatype, int dest, int tag, MPI_Comm comm);
```

Questions?

# Non-Blocking Communication

- Buffered sends are considered bad for performance, because the caller has to block, waiting for the copy to take place.
- Non-blocking or immediate functions, maximize concurrency by returning immediately upon initiating a transfer, allowing communication and computation to overlap.
  - i.e., while the copying is being done and/or the NIC is sending/receiving the data, I can compute something else
- There are both send and receive immediate variants.

# Non-Blocking Communication

- The downside is that the completion of the operations for both end-points, has to be queried explicitly:
  - For senders so that they can re-use or modify the message buffer.
  - For receivers so that they can extract the message contents.
- Non-blocking communications can be coupled with any communication mode: MPI\_Isend, MPI\_Ibsend, MPI\_Issend, etc.

# Non-Blocking Send

```
// Address of data buffer (OUT)
int MPI_Isend(void
                           count, // Number of data items (IN)
              int
              MPI_Datatype datatype, // Same as in MPI_Send (IN)
                           source, // Rank of destination proc. (IN)
              int
                                    // Label identifying the type
              int
                           tag,
                                       of message (IN)
                                    // Identifies the communicator
              MPI\_Comm
                           comm,
                                         context of 'source' (IN)
                                       Used to return a handle for
              MPI_Request
                           *req
                                         checking status (OUT)
```

• The MPI\_Request that is returned, is a handle that allows a query on the status of the operation to take place

# Non-Blocking Recv

```
// Address of receive buff. (OUT)
int MPI_Irecv(void
                          *buf,
                                  // Buffer capacity in items (IN)
                         count,
             int
             MPI_Datatype datatype, // Same as in MPI_Send (IN)
             int
                         source, // Rank of sending process (IN)
                                  // Label identifying the type
             int
                         tag,
                                   // of message expected (IN)
                                   // Identifies the communicator
             MPI Comm
                          comm,
                                   // context of 'source' (IN)
             MPI_Request *req
                                   // Used to return a handle for
                                       checking status (OUT)
```

- The MPI\_Request that is returned, is a handle that allows a query on the status of the operation to take place.
- In MPI\_Irecv the MPI\_Status parameter is replaced by a MPI\_Request one.

# Check for Completion

• Blocking (destroys handle):

• Non-blocking (destroys handle if operation was successfull i.e. \*flag=1):

# Check for Completion (2)

Several variants available (check man):

- Waitall
- Waitany
- Testany
- etc...

# Non-Blocking Comm. Example

• *Problem*: **Ring**: Each rank sends something to left/right rank, and receives something from them

# Non-Blocking Comm. Example

• Problem: Ring: Each rank sends something to left/right rank, and receives something from them



```
#include "mpi.h"
#include <stdio.h>
int main(void) {
   int numtasks, rank, next, prev, buf[2];
   MPI Request reqs[4]; // required variable for non-blocking calls
   MPI Status stats[4]; // required variable for Waitall routine
    MPI Init (NULL, NULL);
   MPI Comm size (MPI COMM WORLD, &numtasks);
   MPI Comm rank (MPI COMM WORLD, &rank); // determine left and right neighbors
    prev = (rank-1) % numtasks;
    next = (rank+1) % numtasks;
   // post non-blocking receives and sends for neighbors
   MPI Irecv(&buf[0], 1, MPI INT, prev, 0, MPI COMM WORLD, &reqs[0]);
   MPI Irecv(&buf[1], 1, MPI INT, next, 0, MPI COMM WORLD, &reqs[1]);
   MPI Isend(&rank, 1, MPI INT, prev, 0, MPI COMM WORLD, &reqs[2]);
   MPI Isend(&rank, 1, MPI INT, next, 0, MPI COMM WORLD, &reqs[3]);
   // do some work while sends/receives progress in background
   // wait for all non-blocking operations to complete
   MPI Waitall(4, regs, stats);
    // continue - do more work
   MPI Finalize();
```

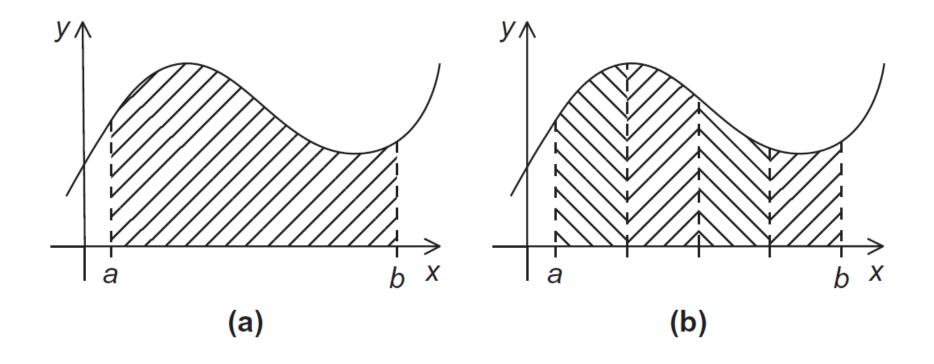
#### Point-to-point Communication Summary

A sending process	Function
must block until the message is delivered	${ t MPI\_Ssend}$
should wait only until the message is buffered	$\mathtt{MPI\_Bsend}$
should return immediately without ever blocking	$\mathtt{MPI\_Isend}$

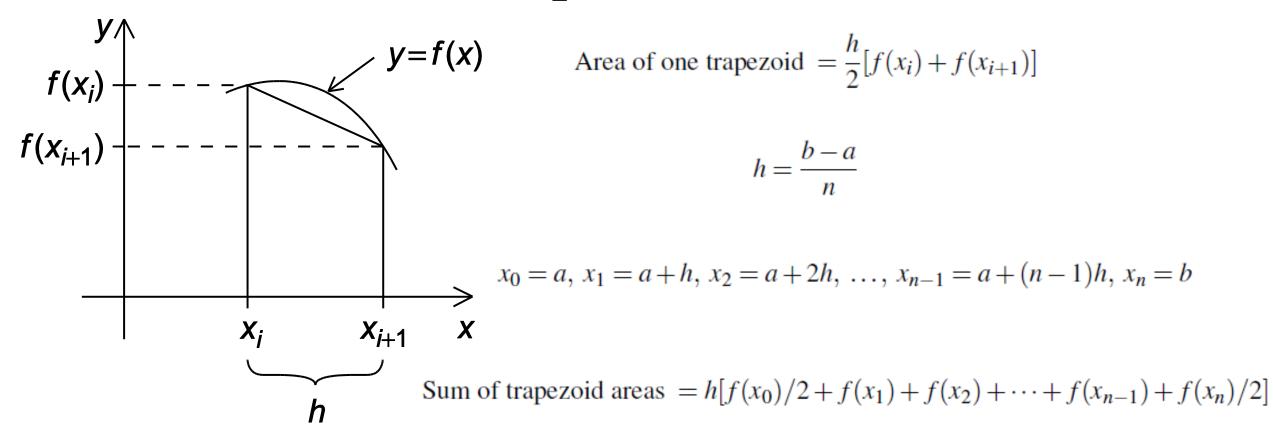
Questions?

Example: Trapezoidal rule in MPI

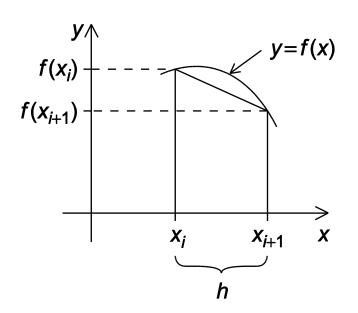
# The Trapezoidal Rule



# The Trapezoidal Rule



# Pseudo-code for a serial program

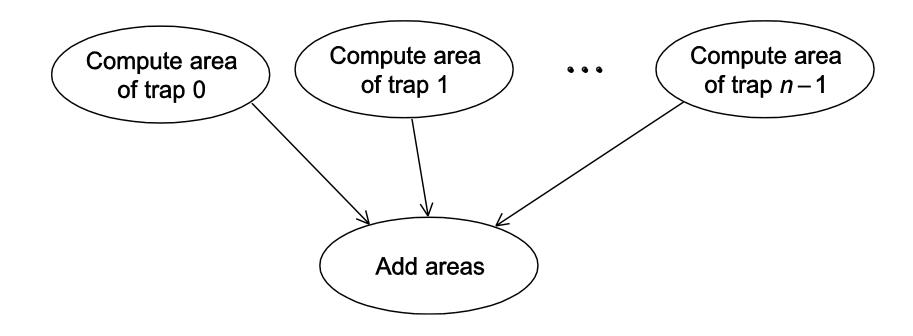


```
/* Input: a, b, n */
h = (b-a)/n;
approx = (f(a) + f(b))/2.0;
for (i = 1; i <= n-1; i++) {
    x_i = a + i*h;
    approx += f(x_i);
}
approx = h*approx;</pre>
```

# Parallelizing the Trapezoidal Rule

- 1. Partition problem solution into tasks.
- 2. Identify communication channels between tasks.
- 3. Aggregate tasks into composite tasks.
- 4. Map composite tasks to cores.

#### Tasks and communications for Trapezoidal Rule



To which pattern does it look like?

# Parallel pseudo-code

```
Get a, b, n;
     h = (b-a)/n;
     local_n = n/comm_sz;
     local_a = a + my_rank*local_n*h;
     local_b = local_a + local_n*h;
6
      local_integral = Trap(local_a, local_b, local_n, h);
      if (my_rank != 0)
         Send local integral to process 0;
      else /* my_rank == 0 */
10
         total integral = local integral;
11
         for (proc = 1; proc < comm sz; proc++) {
12
            Receive local_integral from proc;
13
            total_integral += local_integral;
14
15
16
      if (my_rank == 0)
17
         print result;
```

#### First version (part 1)

```
int main(void) {
      int my rank, comm sz, n = 1024, local n;
      double a = 0.0, b = 3.0, h, local_a, local_b;
      double local int, total int;
      int source;
      MPI Init(NULL, NULL);
      MPI Comm rank (MPI COMM WORLD, &my rank);
      MPI_Comm_size(MPI_COMM_WORLD, &comm_sz);
10
      h = (b-a)/n; /* h is the same for all processes */
11
      local n = n/comm sz; /* So is the number of trapezoids */
13
14
      local_a = a + my_rank*local_n*h;
15
     local b = local a + local n*h;
      local int = Trap(local a, local b, local n, h);
17
18
      if (my rank != 0) {
19
         MPI Send(&local int, 1, MPI DOUBLE, 0, 0,
20
               MPI COMM WORLD);
```

# First version (part 2)

```
} else {
         total_int = local_int;
         for (source = 1; source < comm_sz; source++) {</pre>
24
            MPI Recv(&local int, 1, MPI DOUBLE, source, 0,
                   MPI_COMM_WORLD , MPI_STATUS_IGNORE );
26
            total int += local int;
27
29
      if (my_rank == 0) 
30
31
         printf("With n = %d trapezoids, our estimate \n", n);
32
         printf("of the integral from %f to %f = %.15e\n",
33
             a, b, total int);
34
35
      MPI Finalize();
36
      return 0:
37
     /* main */
```

#### First version (part 3)

```
double Trap(
         double left_endpt /* in */,
         double right_endpt /* in */,
         int trap_count /* in */,
         double base_len /* in */) {
      double estimate, x;
     int i:
      estimate = (f(left_endpt) + f(right_endpt))/2.0;
      for (i = 1; i <= trap_count -1; i++) {
10
        x = left endpt + i*base len;
12
        estimate += f(x);
13
14
      estimate = estimate * base len;
15
     return estimate;
   } /* Trap */
```

Questions?

#### Input

- Most MPI implementations only allow process O in MPI\_COMM\_WORLD access to stdin.
- Process O must read the data (scanf) and send to the other processes.

```
MPI_Comm_rank(MPI_COMM_WORLD, &my_rank);
MPI_Comm_size(MPI_COMM_WORLD, &comm_sz);
Get_data(my_rank, comm_sz, &a, &b, &n);
h = (b-a)/n;
. . .
```

#### Function for reading user input

```
void Get_input(
             my_rank /* in */,
     int
          comm_sz /*in */,
     int
     double* a_p /* out */,
     double* b_p /* out */,
             n_p /* out */) {
     int*
  int dest;
  if (my_rank == 0) {
     printf("Enter a, b, and n\n");
     scanf("%lf %lf %d", a_p, b_p, n_p);
     for (dest = 1; dest < comm sz; dest++) {
        MPI_Send(a_p, 1, MPI_DOUBLE, dest, 0, MPI_COMM_WORLD);
        MPI_Send(b_p, 1, MPI_DOUBLE, dest, 0, MPI_COMM_WORLD);
        MPI Send(n p, 1, MPI INT, dest, 0, MPI COMM WORLD);
  else { /* my\_rank != 0 */}
     MPI_Recv(a_p, 1, MPI_DOUBLE, 0, 0, MPI_COMM_WORLD,
           MPI STATUS IGNORE);
     MPI_Recv(b_p, 1, MPI_DOUBLE, 0, 0, MPI_COMM_WORLD,
           MPI_STATUS_IGNORE);
     MPI_Recv(n_p, 1, MPI_INT, 0, 0, MPI_COMM_WORLD,
           MPI STATUS IGNORE);
  /* Get_input */
```

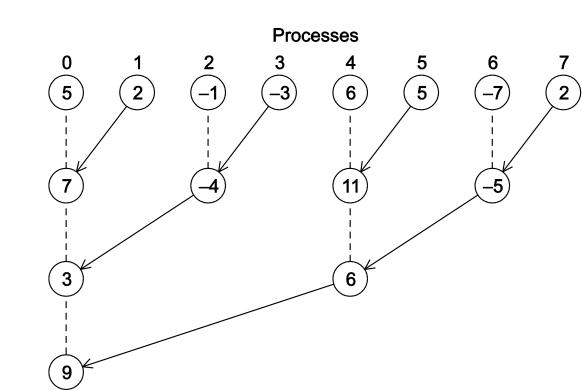
#### Issues with the trapezoidal rule implementation (1)

When doing the global sum, p-1 processes send their data to one process, which then computes all the sums. Unbalance! How long does it take?

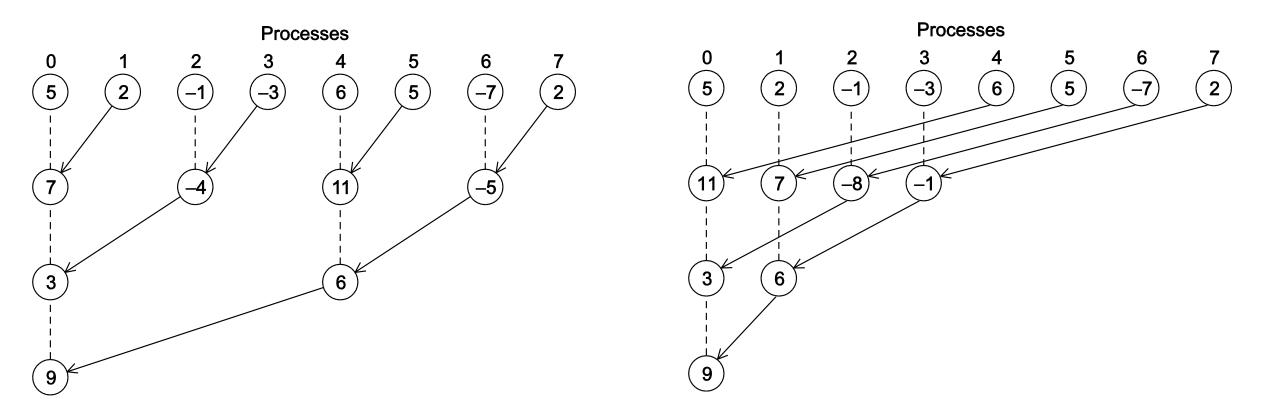
- For process 0:  $(p-1)*(T_{sum} + T_{recv})$
- For all the other processes:  $T_{send}$

#### Alternative

- For process 0:  $log2(p)*(T_{sum} + T_{recv})$ 



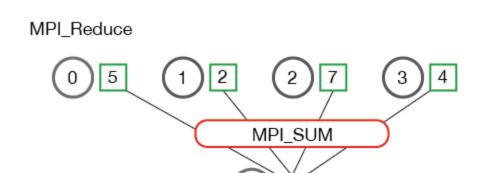
#### Different valid trees



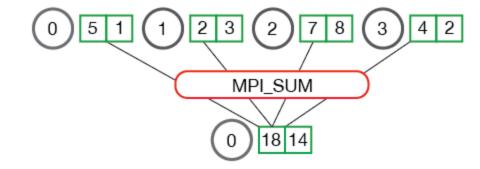
- The optimal way to compute a global sum depends on the number of processes, the size
  of the data, and the system we are running on (how many NICs, how the nodes are
  connected, etc...)
- Having a native way to express the global sum would simplify programming and improve performance

#### Collective Communication

#### MPI\_Reduce







#### MPI\_Reduce

```
\label{eq:mpi_reduce} \begin{split} \texttt{MPI\_Reduce}(\&\texttt{local\_int}\,,\,\,\&\texttt{total\_int}\,,\,\,1\,,\,\,\texttt{MPI\_DOUBLE}\,,\,\,\texttt{MPI\_SUM}\,,\,\,0\,,\\ \texttt{MPI\_COMM\_WORLD}\,); \end{split}
```

#### MPI\_Reduce

One call for all the processes

```
int main(void) {
  int my_rank, comm_sz, n, local_n;
  double a, b, h, local a, local b;
   double local_int, total_int;
  MPI_Init(NULL, NULL);
  MPI_Comm_rank(MPI_COMM_WORLD, &my_rank);
  MPI Comm_size(MPI_COMM_WORLD, &comm_sz);
  Get input(my rank, comm sz, &a, &b, &n);
  h = (b-a)/n; /* h is the same for all processes */
  local n = n/comm sz; /* So is the number of trapezoids */
  /* Length of each process' interval of
   * integration = local n*h. So my interval
   * starts at: */
  local a = a + my rank*local n*h;
  local b = local a + local n*h;
  local int = Trap(local a, local b, local n, h);
  /* Add up the integrals calculated by each process */
  MPI Reduce(&local int, &total int, 1, MPI DOUBLE, MPI SUM, 0, MPI COMM WORLD);
  /* Print the result */
  if (my rank == 0) {
     printf("With n = %d trapezoids, our estimate\n", n);
     printf("of the integral from %f to %f = %.15e\n",
          a, b, total_int);
  /* Shut down MPI */
  MPI Finalize();
   return 0:
} /* main */
```

# MPI\_Reduce Operators

Operation Value	Meaning	
MPI_MAX	Maximum	
MPI_MIN	Minimum	
MPI_SUM	Sum	
MPI_PROD	Product	
MPI_LAND	Logical and	
MPI_BAND	Bitwise and	
MPI_LOR	Logical or	
MPI_BOR	Bitwise or	
MPI_LXOR	Logical exclusive or	
MPI_BXOR	Bitwise exclusive or	
MPI_MAXLOC	Maximum and location of maximum	
MPI_MINLOC	Minimum and location of minimum	

Questions?

### Caveats

- All the processes in the communicator must call the same collective function.
- For example, a program that attempts to match a call to MPI\_Reduce on one process with a call to MPI\_Recv on another process is erroneous, and, in all likelihood, the program will hang or crash.
- The arguments passed by each process to an MPI collective communication must be "compatible."
- For example, if one process passes in O as the dest\_process and another passes in 1, then the outcome of a call to MPI\_Reduce is erroneous, and, once again, the program is likely to hang or crash.
- The output\_data\_p argument is only used on dest\_process.
- However, all of the processes still need to pass in an actual argument corresponding to output\_data\_p, even if it's just NULL.
- Point-to-point communications are matched on the basis of tags and communicators, collective communications don't use tags.
- They're matched solely on the basis of the communicator and the order in which they're called.

# Matching Example

All the following calls are done on MPI\_COMM\_WORLD, have O as destination, and MPI\_SUM as operator

Time	Process 0	Process 1	Process 2
0	a = 1; c = 2	a = 1; c = 2	a = 1; c = 2
1	MPI_Reduce(&a, &b,)	MPI_Reduce(&c, &d,)	MPI_Reduce(&a, &b,)
2	MPI_Reduce(&c, &d,)	MPI_Reduce(&a, &b,)	MPI_Reduce(&c, &d,)

Questions?

### Issues with the trapezoidal rule implementation (2)

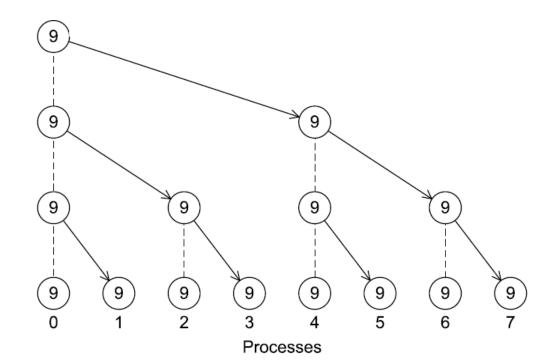
```
void Get_input(
              my_rank
                        /* in */,
      int
      int
              comm sz
                      /* in */,
     double* a_p
                       /* out */,
     double* b_p
                  /* out */,
                   /* out */) {
     int*
              n p
  int dest;
  if (my rank == 0) {
     printf("Enter a, b, and n\n");
     scanf("%lf %lf %d", a_p, b_p, n_p);
     for (dest = 1; dest < comm_sz; dest++) {</pre>
        MPI_Send(a_p, 1, MPI_DOUBLE, dest, 0, MPI_COMM_WORLD);
        MPI_Send(b_p, 1, MPI_DOUBLE, dest, 0, MPI_COMM_WORLD);
        MPI_Send(n_p, 1, MPI_INT, dest, 0, MPI_COMM_WORLD);
    else { /* my\_rank != 0 */
     MPI_Recv(a_p, 1, MPI_DOUBLE, 0, 0, MPI_COMM_WORLD,
           MPI_STATUS_IGNORE);
     MPI_Recv(b_p, 1, MPI_DOUBLE, 0, 0, MPI_COMM_WORLD,
           MPI_STATUS_IGNORE);
     MPI_Recv(n_p, 1, MPI_INT, 0, 0, MPI_COMM_WORLD,
           MPI_STATUS_IGNORE);
   /* Get_input */
```

When doing the global sum, p-1 processes recv the data from one process. Unbalance! How long does it take?

For process 0:  $(p-1)*(T_{send})$ For all the other processes:  $T_{recv}$ 

#### Alternative

- For process 0:  $log2(p)*(T_{send})$ 



#### MPI\_Bcast

 Data belonging to a single process is sent to all of the processes in the communicator.

#### MPI\_Bcast

```
void Get input(
     int my_rank /* in */,
     int comm_sz /* in */,
     double * a_p /* out */,
     double* b_p /* out */,
     int * n_p /* out */) {
  if (my rank == 0) 
     printf("Enter a, b, and n\n");
     scanf("%lf %lf %d", ap, bp, np);
  MPI_Bcast(a_p, 1, MPI_DOUBLE, 0, MPI_COMM_WORLD);
  MPI_Bcast(b_p, 1, MPI_DOUBLE, 0, MPI_COMM_WORLD);
  MPI_Bcast(n_p, 1, MPI_INT, 0, MPI_COMM_WORLD);
\} /* Get_input */
```

Questions?

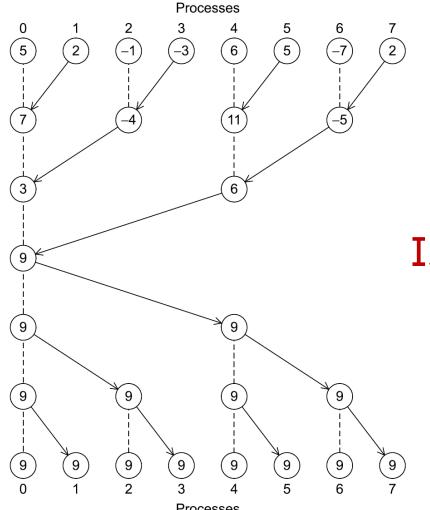
#### MPI\_Allreduce

• Conceptually, an MPI\_Reduce followed by MPI\_Bcast (i.e., compute a global sum and distribute the result to all the processes)

The argument list is identical to that for MPI\_Reduce, except that there is no dest\_process since all the processes should get the result.

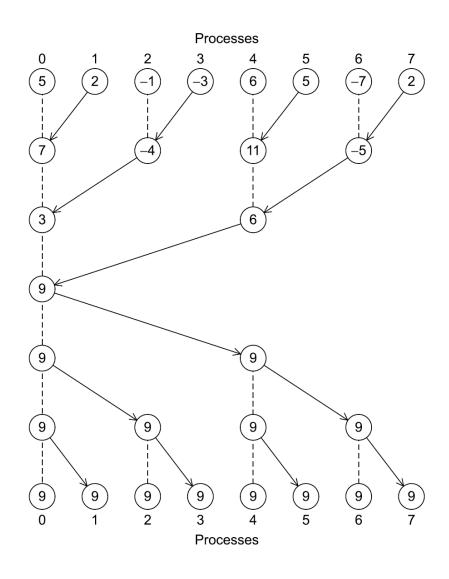
#### MPI\_Allreduce

 Conceptually, an MPI\_Reduce followed by MPI\_Bcast (i.e., compute a global sum and distribute the result to all the processes)

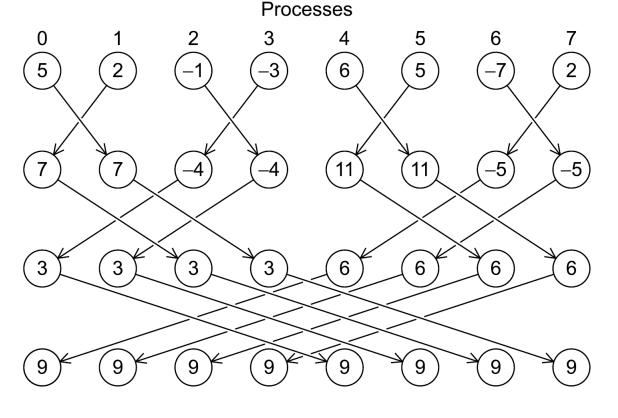


Is this the best way of doing it?

### MPI\_Allreduce



$$T = 2*log2(p)*T_{send}$$



This is also known as **butterfly** pattern (sometimes as recursive distance doubling)

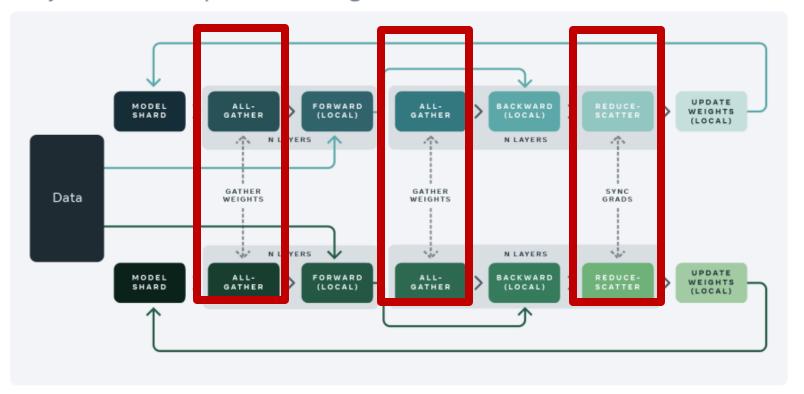
 $T = log2(p)*(T_{send})$  (Assuming send and recv happen at the same time)

2x faster (other algos might be better depending on the data size)

### Relevance of collective algorithms

- Widely used in large-scale parallel applications from many domains
- Account for a large fraction of the total runtime
- Highly relevant for distributed training of deep-learning models, e.g., Meta's FSDP training system:

Fully sharded data parallel training



### Relevance of collective algorithms

- That's the reason why all the big players are designing their own collective communication library. E.g.,
  - NCCL (NVIDIA)
  - RCCL (AMD)
  - OneCCL (Intel)
  - MSCCL (Microsoft)
  - **—** ....
- Given a collective (e.g., MPI\_Reduce), how to select the best algorithm?
  - Automatically through heuristic
  - Manually
  - MPI implementations such as Open MPI do not make assumption on the underlying hardware, \*CCL does
- Active research area, both from algorithmic and implementations standpoints

**3.2.** Suppose we toss darts randomly at a square dartboard, whose bullseye is at the origin, and whose sides are 2 feet in length. Suppose also that there's a circle inscribed in the square dartboard. The radius of the circle is 1 foot, and it's area is  $\pi$  square feet. If the points that are hit by the darts are uniformly distributed (and we always hit the square), then the number of darts that hit inside the circle should approximately satisfy the equation

```
\frac{\text{number in circle}}{\text{total number of tosses}} = \frac{\pi}{4},
```

i.e., number in circle: pi = total number of tosses: 4 Remember that if origin (0,0), the circle must respect the condition  $x^2+y^2=r^2$ We can use this formula to estimate the value of with a random number generator:

```
number_in_circle = 0;
for (toss = 0; toss < number_of_tosses; toss++) {
    x = random double between -1 and 1;
    y = random double between -1 and 1;
    distance_squared = x*x + y*y;
    if (distance_squared <= 1) number_in_circle++;
}
pi_estimate = 4*number_in_circle/((double) number_of_tosses);</pre>
```

This is called a "Monte Carlo" method, since it uses randomness (the dart tosses). Write an MPI program that uses a Monte Carlo method to estimate  $\pi$ .

**3.2.** Modify the trapezoidal rule so that it will correctly estimate the integral even if  $comm_sz$  doesn't evenly divide n. (You can still assume that  $n \ge comm_sz$ )

**3.4.** Modify the program that just prints a line of output from each process (*mpi\_output.c*) so that the output is printed in process rank order: process Os output first, then process 1s, and so on.

**3.1.** Use MPI to implement the histogram program. Have process O read in the input data and distribute it among the processes. Also have process O print out the histogram.

- **3.3.** Write an MPI program that computes a tree-structured global sum. First write your program for the special case in which *comm\_sz* is a power of two. Then, after you've gotten this version working, modify your program so that it can handle any *comm\_sz*
- **3.9.** Write an MPI program that implements multiplication of a vector by a scalar and dot product. The user should enter two vectors and a scalar, all of which are read in by process O and distributed among the processes. The results are calculated and collected onto process O, which prints them. You can assume that n, the order of the vectors, is evenly divisible by comm sz.
- **3.13.** MPI Scatter and MPI Gather have the limitation that each process must send or receive the same number of data items. When this is not the case, we must use the MPI functions MPI Gatherv and MPI Scatterv. Look at the man pages for these functions, and modify your vector sum, dot product program so that it can correctly handle the case when *n* isn't evenly divisible by comm sz.