

Parallel Programming with MPI

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Parallel
Programming with
MPI

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Introduction

MPI

Hello world! with
MPI

Communication
techniques

Collective
Communication
Routines

- 1 Introduction
- 2 MPI
- 3 Hello world! with MPI
- 4 Communication techniques
- 5 Collective Communication Routines

- The aim of **Parallel Computing** is to reduce the time required to solve a computational problem using parallel computers that are computers with more that one processor or cluster of computers



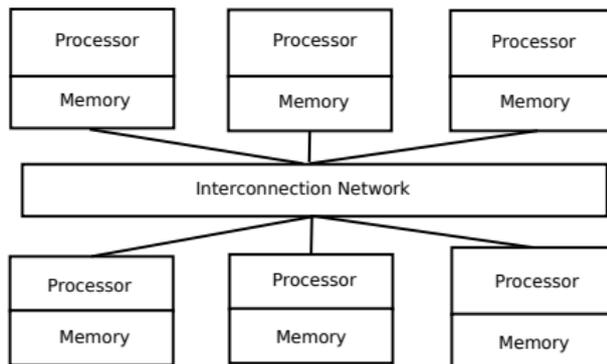
- Parallelism can be exploited in two different way:
 - **Data parallelism:** Same task on different elements of a dataset
 - **Task or functional parallelism:** The same task on the same or different data
- Several ways to write parallel software:
 - Using a compiler that automatically detect the part of code that can be parallelized → not easy to achieve
 - One of the easiest ways is to add functions or compiler directives to an existing sequential language such that a user can explicitly specify which code should be performed in parallel: MPI (these lectures), OpenMP, etc...

Categorization of parallel hardware based on the number of concurrent instruction and data streams:

- **SISD** (Single instruction Single Data): Single uniprocessor machine that can execute a single instruction and fetch single data stream from memory
- **SIMD** (Single instruction Multiple Data): A computer that can issue the same single instruction to multiple data simultaneously such as GPUs
- **MISD** (Multiple instruction Single Data): Uncommon architecture used for fault tolerance. Several systems acts on the same data and must agree
- **MIMD** (Multiple instruction Multiple Data): Multiple processors executing different instruction on different data. These are distributed systems

- **SPMD** (Single Program Multiple Data): A single program is executed by multi-processor machine of cluster
- **MPMD** (Multiple Program Multiple Data): At least two programs are executed by multi-processor machine of cluster

- MPI stands for Message Passing Interface
- The MPI model consist of a communication among processes through messages: *Inter-process communication*



- All the processes execute the same program, but each have an ID so you can select which part should be executed (SPMD - Single program Multiple Data)

- It's a standard API to run application across several computers
- The latest version of the standard is Version 3.1 of 4th June 2015
- <http://www.mpi-forum.org/>
- Two main open source implementations both supporting version 3 of the standard:
 - MPICH
 - → <https://www.mpich.org/>
 - Open MPI
 - → <http://www.open-mpi.org/>
- Written in C, C++ and Fortran
- Used in several science and engineering fields:
 - Atmosphere, Environment
 - Applied-Physics such as condensed matter, fusion etc...
 - Bioscience
 - Molecular sciences
 - Seismology
 - Mechanical engineering
 - Electrical engineering

- **NOTE:** This tutorial is based on OpenMPI v1.8.2, you will use OpenMPI v1.6.5

- To check which version you are running issue:

```
$> ompi_info
```

- You can find the example and exercises at this repository:

```
$> https://afalabel@bitbucket.org/afalabel/mpi_tutorial.git
```

- to get the code:

```
$> git clone https://afalabel@bitbucket.org/afalabel/mpi_tutorial.git
```

- The source code is in :

```
$> mpi_tutorial/1_Hello_world/hello_world.c
```

- You can compile it using the issuing using the Makefile or in general :

```
$> make
```

- it calls *mpicc* which is a wrapper around the gcc compiler
- How to run the code:

```
/usr/bin/mpirun -n 4 ./hello_world  
/usr/bin/mpirun -n 4 --host <host 1>,<host 2>,...<host N> ./  
hello_world
```

- For a full list of option of *mpirun* :
<https://www.open-mpi.org/doc/v1.10/man1/mpirun.1.php>

- Before running the code let's have a look at the code:

```

1  #include <mpi.h>
2  #include <stdio.h>
3  int main(int argc, char** argv) {
4
5      MPI_Init(NULL, NULL);
6
7      int size;
8      MPI_Comm_size(MPI_COMM_WORLD, &size);
9
10     int rank;
11     MPI_Comm_rank(MPI_COMM_WORLD, &rank);
12
13     char processor_name[MPI_MAX_PROCESSOR_NAME];
14     int name_len;
15     MPI_Get_processor_name(processor_name, &name_len);
16
17     printf("Hello world from processor %s, rank %d out of %d processors
18           \n",
19           processor_name, rank, size);
20     MPI_Finalize();
21 }
  
```

- Let's describe the code line by line:
- Includes the MPI functions and type declarations

```
#include <mpi.h>
```

- Perform the initial setup of the system. It must be called before any other MPI function

```
MPI_Init(NULL, NULL)
```

- After the initialization every process become a member of a communicator called *MPI_COMM_WORLD*. A **communicator** is an object that provides the environment for processes communication. Every process in a communicator has a unique **rank** that can be retrieved in this way

```
int rank;  
MPI_Comm_rank(MPI_COMM_WORLD, &rank);
```

- While the total number of processes can be retrieved

```
int size;  
MPI_Comm_size(MPI_COMM_WORLD, &size);
```

- To get the name of the processor name (usually the hostname)

```
char processor_name[MPI_MAX_PROCESSOR_NAME];
int name_len;
MPI_Get_processor_name(processor_name, &name_len);
```

- To free the resources allocated for the MPI execution

```
MPI_Finalize();
```

- To test our *hello_world* example we can run 4 processes on 2 machines

```

1 /usr/bin/mpirun -n 4 --host rd-xeon-02,rd-xeon-04 ./hello_world
2 Hello world from processor rd-xeon-02, rank 1 out of 4 processors
3 Hello world from processor rd-xeon-02, rank 0 out of 4 processors
4 Hello world from processor rd-xeon-04, rank 3 out of 4 processors
5 Hello world from processor rd-xeon-04, rank 2 out of 4 processors

```

- As you can see 4 processes are executed (2 per node)
- The number of processes are not in principle equally distributed among the nodes
- The rank doesn't reflect the creation order presented in the output

Now it's time to write parallel code. Unfortunately there is not a recipe to do it. In his book: *Designing and Building Parallel Programs* Ian Foster outlined some steps to help doing it

- **Partition:** The process of dividing the computation of the dataset in order to exploit the parallelism
- **Communication:** After the computation has been split in several tasks, it may be required a communication between the processes
- **Agglomeration or aggregation:** Tasks are grouped in order to simplify the programming while profiting of the parallelism
- **Mapping:** The procedure of assigning a task to a processor

MPI provide a lot of functions to ease the communication among parallel tasks. In this tutorial we will see a few of them.

- In MPI, communication consists of sending a copy of the data to another process
- On the sender side communication requires the following thing:
 - Who to send the data (the rank of the receiver process)
 - Data type and size (100 integer, 1 char etc.)
 - the location for the message
- The receiver side need to know
 - It is not required to know who is the sender
 - Data type and size
 - A storage location to put the resulting message

MPI defines elementary types, mainly for portability reasons

Name	Type
MPI_CHAR, MPI_SIGNED_CHAR	signed char
MPI_WCHAR	wide char
MPI_SHORT	signed short int
MPI_INT	signed int
MPI_LONG	signed long int
MPI_LONG_LONG	signed long long int
MPI_UNSIGNED_CHAR	unsigned char
MPI_UNSIGNED_SHORT	unsigned short int
MPI_UNSIGNED	unsigned int
MPI_UNSIGNED_LONG	unsigned long int
MPI_UNSIGNED_LONG_LONG	unsigned long long int
MPI_FLOAT	float
MPI_DOUBLE	double
MPI_LONG_DOUBLE	long double
MPI_C_COMPLEX, MPI_C_FLOAT_COMPLEX	float _Complex
MPI_C_DOUBLE_COMPLEX	double _Complex
MPI_C_LONG_DOUBLE_COMPLEX	long double _Complex

Name	Type
MPI_INT8_T	int8_t
MPI_INT16_T	int16_t
MPI_INT32_T	int32_t
MPI_INT64_T	int64_t
MPI_UINT8_T	uint8_t
MPI_UINT16_T	uint16_t
MPI_UINT32_T	uint32_t
MPI_UINT64_T	uint64_t
MPI_BYTE	8 binary digits
MPI_PACKED	data packed or unpacked with MPI_Pack / MPI_Unpack

- MPI standard allow also for the creation of *Derived Datatypes* (not covered here)

- Performs a **blocking** send:

```
int MPI_Send(const void *buf, int count, MPI_Datatype datatype, int
             dest, int tag,
             MPI_Comm comm)
```

- buf, count and datatype define the message buffer
 - dest and comm identify the destination process
 - tag is an optional tag for the message
 - When the function exits it means that the message has been sent and the buffer can be reused
- Blocking receive for a message :

```
int MPI_Recv(void *buf, int count, MPI_Datatype datatype, int source,
             int tag,
             MPI_Comm comm, MPI_Status *status)
```

- This function waits for a message from source and comm is received into the buffer defined by buf, count and datatype
- tag is an optional tag for the message
- status contains additional information such as information, the sender, the actually number of bytes received

- Send and Receive example:

```

int main(int argc, char** argv) {
    // Initialize the MPI environment
    MPI_Init(NULL, NULL);
    // Find out rank, size
    int rank;
    MPI_Comm_rank(MPI_COMM_WORLD, &rank);
    int size;
    MPI_Comm_size(MPI_COMM_WORLD, &size);

    int number;
    if (rank == 0) {
        number = 43523;
        MPI_Send(&number, 1, MPI_INT, 1, 0, MPI_COMM_WORLD);
    } else if (rank == 1) {
        MPI_Recv(&number, 1, MPI_INT, 0, 0, MPI_COMM_WORLD,
                MPI_STATUS_IGNORE);
        printf("Process 1 received number %d from process 0\n", number);
    }
    MPI_Finalize();
}

```

- The program sends a number to from the root node to the second node:

```

int number;
if (rank == 0) {
    number = 43523;
    MPI_Send(&number, 1, MPI_INT, 1, 0, MPI_COMM_WORLD);
} else if (rank == 1) {
    MPI_Recv(&number, 1, MPI_INT, 0, 0, MPI_COMM_WORLD,
            MPI_STATUS_IGNORE);
    printf("Process 1 received number %d from process 0\n", number);
}
  
```

- Selecting the part of the code to run given the rank is typical for MPI programs
- Here the root node (rank= 0) is the sender
- The other node (rank= 1) will receive the number and print the number
- If you run more than 2 processes the ones with rank > 1 do nothing

- Initialize an array of 100 elements
- Perform the sum of the elements sharing the load among 4 processes using MPI_Send and MPI_Recv

● Root processes part

```

1 fraction = (ARRAYSIZE / PROCESSES);
2 if (rank == ROOT){
3     sum = 0;
4     for(i=0; i<ARRAYSIZE; i++) {
5         data[i] = i * 1.0;
6     }
7     offset = fraction;
8     for (dest=1; dest<PROCESSES; dest++) {
9         MPI_Send(&data[offset], fraction, MPI_FLOAT, dest, 0,
10            MPI_COMM_WORLD);
11        printf("Sent %d elements to task %d offset=%d\n", fraction, dest,
12            offset);
13        offset = offset + fraction;
14    }
15    offset = 0;
16    for (i=0; i<fraction; i++){
17        mysum += data[i];
18    }
19    for (i=1; i<PROCESSES; i++) {
20        source = i;
21        MPI_Recv(&tasks_sum, 1, MPI_FLOAT, source, 0, MPI_COMM_WORLD, &
22            status);
23        sum += tasks_sum;
24        printf("Received partial sum %f from task %d\n", i, tasks_sum);
25    }
26    printf("Final sum= %f \n", sum + mysum);
27 }
  
```

- other tasks code

```

1  if (rank > ROOT) {
2
3      source = ROOT;
4      MPI_Recv(&data[offset], fraction, MPI_FLOAT, source, 0,
              MPI_COMM_WORLD, &status);
5
6      for (i=offset; i<(offset+fraction); i++){
7          tasks_sum += data[i];
8      }
9
10     dest = ROOT;
11     MPI_Send(&tasks_sum, 1, MPI_FLOAT, dest, 0, MPI_COMM_WORLD);
12 }

```

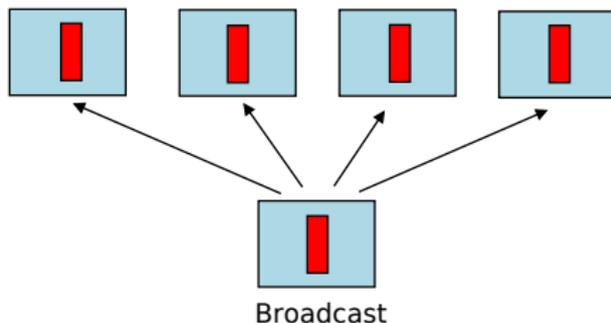
- MPI_Send and MPI_Recv are blocking communication routines
 - Return after completion
 - When they return their buffer can be reused
- MPI_Isend and MPI_Irecv are the non-blocking version
 - Return immediately, the completion must be checked separately
 - Computation and communication can be overlapped

```
int MPI_Isend(const void *buf, int count, MPI_Datatype datatype, int
             dest, int tag,
             MPI_Comm comm, MPI_Request *request)
int MPI_Irecv(void *buf, int count, MPI_Datatype datatype, int source
             int tag, MPI_Comm comm, MPI_Request *request)
```

- In addition to the blocking calls you have an request object as a parameter

- Collective communication involve all the processes within the scope of a communicator
- All processes are by default in the `MPI_COMM_WORLD` communicator, but groups of communicators can be defined
- Collective operations usually require:
 - Synchronization: e.g. `MPI_Barrier`
 - Data Movement: e.g. `MPI_Bcast`, `MPI_Scatter`, `MPI_Gather`, `MPI_Allgather`, `MPI_Alltoall`
 - Collective Computation: e.g. `MPI_Reduce`

- Broadcast a message from the process with rank root to all other processes of the communicator including the root process



```
int MPI_Bcast( void *buffer, int count, MPI_Datatype datatype, int root,
               MPI_Comm comm )
```

```

1  #include <stdio.h>
2  #include <stdlib.h>
3  #include <mpi.h>
4  #include <math.h>
5
6  #define BUFFERSIZE 4
7
8  int main(int argc, char** argv) {
9      int i, size, rank;
10     int buffer[BUFFERSIZE];
11     MPI_Init(&argc, &argv);
12     MPI_Comm_size(MPI_COMM_WORLD, &size);
13     MPI_Comm_rank(MPI_COMM_WORLD, &rank);
14
15     char processor_name[MPI_MAX_PROCESSOR_NAME];
16     int name_len;
17     MPI_Get_processor_name(processor_name, &name_len);
18     //root node
19     if(rank == 0){
20         printf("\nInitializing array on node %s with rank %d\n",
21             processor_name, rank);
22         for(i=0; i<BUFFERSIZE; i++)
23             buffer[i]=i;
24     }

```

```

24 MPI_Bcast(buffer, BUFFERSIZE, MPI_INT, 0, MPI_COMM_WORLD);
25 printf("\nReceived buffer on node %s with rank %d\n", processor_name,
26        rank);
27 for(i=0; i<BUFFERSIZE; i++)
28     printf("%d ", buffer[i]);
29     printf("\n");
30 MPI_Finalize();
    }
    
```

- Generate an array of size N containing random values and create an histogram with $M < N$ bins

```

31 #include <stdio.h>
32 #include <stdlib.h>
33 #include <mpi.h>
34 #include <math.h>
35
36 #define BUFFERSIZE 1000
37 #define MAX 100
38 #define MIN 0
39 #define BINS 10
40
41 int main(int argc, char** argv) {
42
43     int i, counter=0;
44     int size, rank;
45     float buffer[BUFFERSIZE];
46     float bin_size=(float)(MAX-MIN)/BINS;
47
48     MPI_Init(&argc,&argv);
49     MPI_Comm_size(MPI_COMM_WORLD,&size);
50     MPI_Comm_rank(MPI_COMM_WORLD,&rank);
51     if (size==BINS){
52         char processor_name[MPI_MAX_PROCESSOR_NAME];
53         int name_len;
54         MPI_Get_processor_name(processor_name, &name_len);
55         if(rank == 0){
56             printf("\nInitializing array on node %s with rank %d\n",
57                 processor_name, rank);
58             for(i=0;i<BUFFERSIZE;i++){
59                 buffer[i]= rand() % (MAX - MIN - 1) + MIN;
60             }
61         }
62     }
63 }

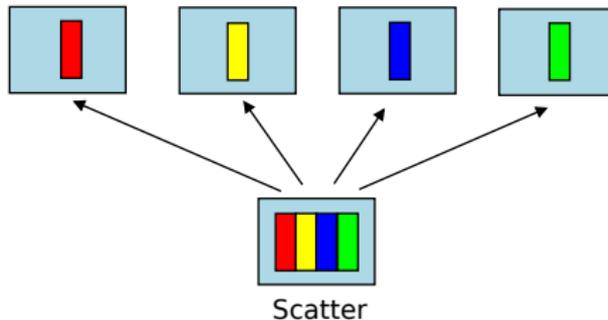
```

```

61 MPI_Bcast(buffer ,BUFFERSIZE ,MPI_FLOAT,0 ,MPI_COMM_WORLD);
62 printf("\nReceived buffer on node  %s with rank %d\n",processor_name ,
    rank);
63
64 for(i=0;i<BUFFERSIZE;i++){
65     if (buffer[i]>=rank*bin_size && buffer[i]<(rank+1)*bin_size)
66         counter++;
67 }
68 printf("\n Bin %d has %d entries\n",rank ,counter);
69 }
70 MPI_Finalize();
71 }
    
```

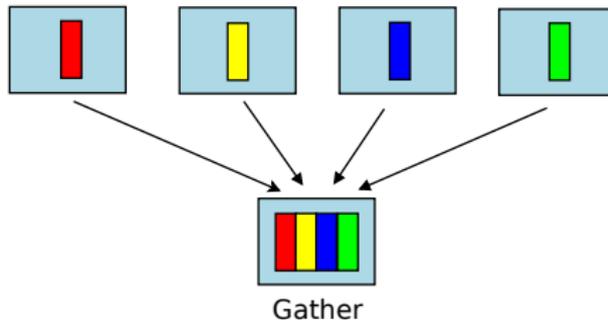
```
> /usr/bin/mpirun -n 10 --host rd-xeon-02,rd-xeon-04 ./broadcast_histo
Initializing array on node rd-xeon-02.cnaf.infn.it with rank 0
Received buffer on node rd-xeon-02.cnaf.infn.it with rank 0
  Bin 0 has 98 entries
Received buffer on node rd-xeon-02.cnaf.infn.it with rank 1
  Bin 1 has 95 entries
Received buffer on node rd-xeon-02.cnaf.infn.it with rank 2
  Bin 2 has 90 entries
Received buffer on node rd-xeon-02.cnaf.infn.it with rank 3
  Bin 3 has 95 entries
Received buffer on node rd-xeon-02.cnaf.infn.it with rank 4
  Bin 4 has 103 entries
Received buffer on node rd-xeon-04.cnaf.infn.it with rank 6
  Bin 6 has 115 entries
Received buffer on node rd-xeon-04.cnaf.infn.it with rank 7
  Bin 7 has 86 entries
Received buffer on node rd-xeon-04.cnaf.infn.it with rank 8
  Bin 8 has 106 entries
Received buffer on node rd-xeon-04.cnaf.infn.it with rank 9
  Bin 9 has 87 entries
Received buffer on node rd-xeon-04.cnaf.infn.it with rank 5
  Bin 5 has 125 entries
```

- When you need to send a fraction of data to each of your nodes you can use *MPI_Scatter*



```
int MPI_Scatter(const void *sendbuf, int sendcount, MPI_Datatype sendtype,
               void *recvbuf, int recvcount, MPI_Datatype recvtype,
               int root, MPI_Comm comm)
```

- When you need to retrieve a portion of data from different processes
MPI_Gather



```
int MPI_Gather(const void *sendbuf, int sendcount, MPI_Datatype sendtype,
              void *recvbuf, int recvcount, MPI_Datatype recvtype,
              int root, MPI_Comm comm)
```

```

#include <stdio.h>
#include <stdlib.h>
#include <mpi.h>

#define ROOT 0
#define DATA_SIZE 4

int main(int argc, char *argv[]){
    int nodes, rank;
    int *partial, *send_data, *recv_data;
    int size, mysize, i, k, j, partial_sum, total;

    MPI_Init(&argc, &argv);
    MPI_Comm_size( MPI_COMM_WORLD, &nodes );
    MPI_Comm_rank(MPI_COMM_WORLD, &rank);

    partial=(int*)malloc(DATA_SIZE*sizeof(int));
    //create the data to be sent
    if(rank == ROOT){
        size=DATA_SIZE*nodes;
        send_data=(int*)malloc(size*sizeof(int));
        recv_data=(int*)malloc(nodes*sizeof(int));
        for(i=0; i<size; i++){
            send_data[i]=i;
        }
    }
    //send different data to each process
    MPI_Scatter(send_data, DATA_SIZE, MPI_INT,
               partial, DATA_SIZE, MPI_INT,
               ROOT, MPI_COMM_WORLD);

```

```

partial_sum=0;
for(i=0;i<DATA_SIZE;i++)
    partial_sum=partial_sum + partial[i];

printf("rank= %d total= %d\n ",rank , partial_sum);

//send the local sums back to the root
MPI_Gather(&partial_sum ,    1,  MPI_INT,
          recv_data ,      1,  MPI_INT,
          ROOT, MPI_COMM_WORLD);

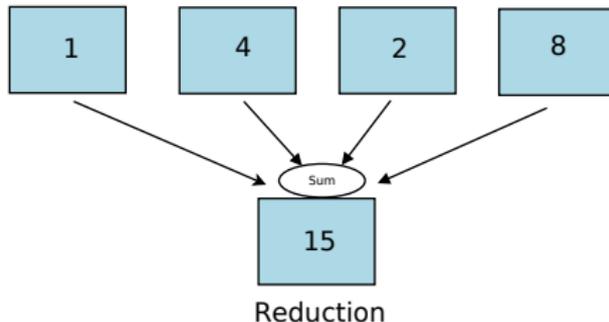
if(rank == ROOT){
    total=0;
    for(i=0;i<nodes;i++)
        total=total+recv_data[i];
    printf("Total is = %d \n ",total);
}
MPI_Finalize();
}
    
```

- For example running the code for two processes

```

/usr/bin/mpirun -n 2 --host rd-xeon-02,rd-xeon-04 ./scatter_gather
rank= 0 total= 6
  Total is = 28
rank= 1 total= 22
    
```

- When you need to retrieve a portion of data from different processes and you want to manipulate them *MPI_Reduce*



```
int MPI_Reduce(const void *sendbuf, void *recvbuf, int count, MPI_Datatype
datatype,
MPI_Op op, int root, MPI_Comm comm)
```

MPI Operation		C Data Types
MPI_MAX	maximum	integer, float
MPI_MIN	minimum	integer, float
MPI_SUM	sum	integer, float
MPI_PROD	product	integer, float
MPI_LAND	logical AND	integer
MPI_BAND	bit-wise AND	integer, MPI_BYTE
MPI_LOR	logical OR	integer
MPI_BOR	bit-wise OR	integer, MPI_BYTE
MPI_LXOR	logical XOR	integer
MPI_BXOR	bit-wise XOR	integer, MPI_BYTE
MPI_MAXLOC	max value and location	float, double and long double
MPI_MINLOC	min value and location	float, double and long double

- The problem is the same as the scatter gather example

```

#include <stdio.h>
#include <stdlib.h>
#include <mpi.h>

#define ROOT 0
#define DATA_SIZE 4

int main(int argc, char *argv[]) {
    int nodes, rank;
    int *partial, *send_data, *recv_data;
    int size, mysize, i, k, j, partial_sum, total;

    MPI_Init(&argc, &argv);
    MPI_Comm_size( MPI_COMM_WORLD, &nodes );
    MPI_Comm_rank(MPI_COMM_WORLD, &rank);

    partial=(int*)malloc(DATA_SIZE*sizeof(int));
    //create the data to be sent on the root
    if(rank == ROOT){
        size=DATA_SIZE*nodes;
        send_data=(int*)malloc(size*sizeof(int));
        recv_data=(int*)malloc(nodes*sizeof(int));
        for(i=0; i<size; i++){
            send_data[i]=i;
        }

        MPI_Scatter(send_data, DATA_SIZE, MPI_INT,
                  partial, DATA_SIZE, MPI_INT,
                  ROOT, MPI_COMM_WORLD);
    }
}

```

- The problem is the same as the scatter gather example

```

partial_sum=0;
for(i=0;i<DATA_SIZE;i++)
    partial_sum=partial_sum + partial[i];

printf("rank= %d total= %d\n ",rank , partial_sum);

MPI_Reduce(&partial_sum , &total , 1,  MPI_INT ,
          MPI_SUM,  ROOT,  MPI_COMM_WORLD);

if(rank == ROOT){
    printf("Total is = %d \n " , total);
}
MPI_Finalize();
}
  
```

- It produces the same output:

```

/usr/bin/mpirun -n 2 --host rd-xeon-02,rd-xeon-04 ./reduce
rank= 0 total= 6
    Total is = 28
rank= 1 total= 22
  
```

- Compute an approximate value of π
- Hint: Use the Taylor series expansion for the *arctan*

$$\arctan\left(\frac{x}{a}\right) = \sum_{n=0}^{\infty} \frac{(-1)^n x^{2n+1}}{2n+1 a}$$

- Note: This is not the fastest way to approximate π

```

1  #include <stdio.h>
2  #include <stdlib.h>
3  #include <math.h>
4  #include <mpi.h>
5
6  #define ROOT 0
7
8  double taylor(const int i, const double x, const double a){
9      if (i>-1 && a !=0){
10         int sign = pow(-1,i);
11         double num = pow(x,2*i+1);
12         double den= a*(2*i +1);
13         return (sign*num/den);
14     }
15     else{
16         printf("\nCheck your parameters!\n");
17         return (-1);
18     }
19 }
20
21
22 int main(int argc, char *argv[]){
23     int nodes,rank;
24     double* partial;
25     double res;
26     double total=0;
27
28     MPI_Init(&argc,&argv);
29     MPI_Comm_size( MPI_COMM_WORLD, &nodes );
30     MPI_Comm_rank(MPI_COMM_WORLD, &rank);

```

```

1
2  res = taylor(rank,1,1);
3  printf("rank= %d total= %f\n ",rank , res);
4
5  MPI_Reduce(&res , &total , 1, MPI_DOUBLE,
6            MPI_SUM, ROOT, MPI_COMM_WORLD);
7
8  if(rank == ROOT){
9      printf("Total is = %f \n " ,4*total);
10 }
11 MPI_Finalize();
12 }

```

Parallel
Programming with
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Antonio Falabella

Introduction

MPI

Hello world! with
MPI

Communication
techniques

Collective
Communication
Routines

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