# PARALLEL PROGRAMMING USING MPI – SPEEDUP AND MEMORY

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**NOVEMBER 4, 2016** 







#### **BEFORE WE BEGIN**

#### □ A FEW THINGS ...

- This is more of an introductory workshop on MPI
- No prior background on MPI is needed
- Some basic background on sequential programming would be assumed.
- Examples will be shown in FORTRAN. The concepts are equally valid for C.
- The codes for the examples are written by the speaker himself. Please be 'aggressive' to point out any 'shabby' coding habits that you come across.
- The remarks and conclusions made hereafter are solely the speaker's personal opinions. The speaker does not represent any of the official implementers of MPI.



# **OUTLINE**

- **❖ PARALLEL PROGRAMMING**
- **❖** GETTING STARTED WITH MPI
- **❖ SPEEDUP**
- **❖ MPI SHARED MEMORY**
- **❖ SUMMARY**



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# WHY PARALLEL PROGRAMMING?

#### ☐ THE BIG PICTURE

Growth of processor clock-rate is slowing down – the main reasons being :

- > size limits of the processor components
- higher power consumption at higher clock rates.

#### What does that mean to us?

- Slow execution of codes and more time to reach solution
- Limit on available memory

But that's limited by processor manufacturing. What do we programmers do?

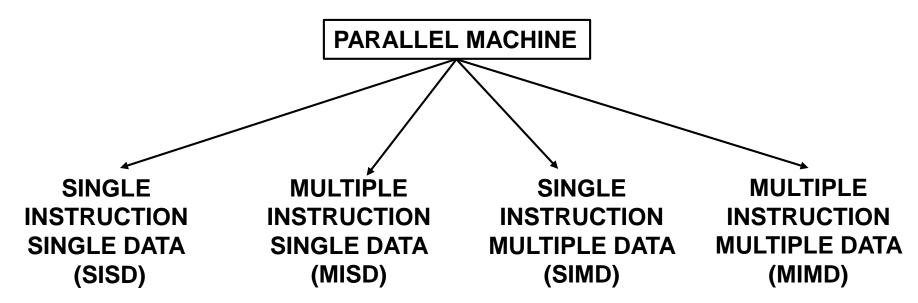
> Simple, use multiple processors



# PARALLEL COMPUTER ARCHITECTURE

T. Rauber and G. Runger, Parallel Programming, Springer 2013

#### ☐ FLYNN'S TAXONOMY



Single processing element, single data memory.

Ex: a sequential computer

Multiple processing element, single data memory.

Ex: No such commercial machine exists

Multiple processing elements - single instruction set (one program memory) and private data memories

Ex: single core computers

Multiple processing elements - private instruction sets and private data memories. Ex: modern clusters.



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#### WHAT IS MPI?

W.P. Petersen and P. Arbenz, Introduction to Parallel Programming
Oxford University Press, 2004

M P M P M
Interconnection network

- Message Passing Interface (MPI) establishes data access between nodes
- MPI is a standard message passing system on both shared and distributed systems
- > A communicator group of processes perform a certain task
- Arbitrary master-slave relation



#### **GETTING ACCESS TO MPI**

#### ■ MPI IMPLEMENTATIONS

MPICH (<a href="http://www.mpich.org/">http://www.mpich.org/</a>), Argonne National Laboratory

MVAPICH ( <a href="http://mvapich.cse.ohio-state.edu/">http://mvapich.cse.ohio-state.edu/</a>), Ohio State University

**OpenMPI** (<a href="https://www.open-mpi.org/">https://www.open-mpi.org/</a> ), U of Tennessee, Los Alamos National Laboratory, Indiana University, and U of Stuttgart

INTEL MPI (<a href="https://software.intel.com/en-us/intel-mpi-library">https://software.intel.com/en-us/intel-mpi-library</a> ), Intel

#### ☐ MPI ON CCR AT UB

module avail intel-mpi module avail mvapich2 module avail openmpi

Different modules available under each of these. Try to use the latest ones to get new features.

Some implementations might have hardware interconnect specific modules. Load the one appropriate for you.



#### FIRST PROGRAM

#### ☐ <u>HELLO WORLD WITH MPI</u>

We want each proc to print its id

```
PROGRAM hello_world
USE mpi
IMPLICIT NONE
                                   Initializes the MPI environment, ierr is
INTEGER :: id, ierr, p ___ almost ubiquitous in MPI FORTRAN,
                                  denotes the error code incase of an error
CALL mpi init(ierr)
CALL mpi_comm_rank (MPI_COMM_WORLD, id, ierr) Gives id of a proc
CALL mpi comm_size (MPI_COMM_WORLD, p, ierr) Gives number of procs
PRINT '(" Total number of procs", i3, " and my id is ", i3)',p, id
CALL mpi finalize(ierr) -
                                          Global Communicator, a predefined
                              Kills MPI
                                                        constant
END PROGRAM hello world
```



#### **BUILDING YOUR CODE WITH MPI**

```
#!/bin/bash
                  module load intel/15.0
                  module load intel-mpi/5.0.2
BUILD
                  which mpiifort
                  export MPIF90=mpiifort
                  $MPIF90 -traceback -g hello world.f90 -o hello.x
                 # count the number of processors
                 np=`srun hostname -s | wc -l`
LAUNCH
                 export I MPI PMI LIBRARY=/usr/lib64/libpmi.so
                 srun -n $np hello.x
                                                  Integrates Intel-MPI to SLURM
                 Total number of procs 8
                                            and my id is
                 Total number of procs 8
                                            and my id is
                 Total number of procs
                                            and my id is
OUTPUT
                 Total number of procs
                                            and my id is
                 Total number of procs 8
                                            and my id is
                 Total number of procs
                                            and my id is
                 Total number of procs
                                            and my id is
                 Total number of procs
                                            and my id is
```



We will only discuss a partial list of commands that are commonly used.

#### □ ENVIRONMENT MANAGEMENT

4 such routines are used and explained in the hello\_world program (slide 10)

□ POINT-TO-POINT COMMUNICATIONS

MPI\_SEND (buf, count, datatype, dest, tag, comm, ierr)

MPI\_RECV (buf, count, datatype, source, tag, comm, status, ierr)

- buf is the data sent (received).
- count is the length of the data (like number of elements in an array)
- dest (source) is which proc id the data is going to (coming from)
- tag is an unique identification to a message. send tag = receive tag (wild card MPI\_ANY\_TAG will receive any message)

Petersen and Arbenz, IPP, Oxford University Press, 2004



#### **EXAMPLE – send and receive**

We want to send the proc ids of each proc to all other procs by point-to-point communication

```
D0 iproc = 1, np
 src = iproc - 1
                                                        src sends its p_id to dest
 D0 jproc = 1, np
                                                     p id is the id of the current proc
   dest = jproc - 1
   IF (p id .EQ. src .AND. .NOT. (dest.EQ.src) ) &
     CALL MPI SEND (p id, 1, MPI INTEGER, dest , 10, MPI COMM WORLD, ierr)
   IF (p id .EQ. dest .AND. .NOT. (dest.EQ.src) ) THEN
      CALL MPI RECV (p id , 1, MPI INTEGER, src , 10, MPI COMM WORLD, MPI STATUS IGNORE, ierr)
      PRINT '(" I am pres" i3, " and my buddy is proc", i3 )',p_id, p_id_
   ENDIF
                                                       dest receives it
   CALL MPI BARRIER(MPI COMM WORLD, ierr)
                                                       note both tags are equal
                                                      p id is the id of the
 ENDD0
                                                      sending proc
         Will come to this in next slide
ENDDO
                                Total number of procs is
       OUTPUT
                                I am proc 0 and my buddy is proc
```

I am proc 1 and my buddy is proc



#### □ COLLECTIVE COMMUNICATIONS – broadcast, barrier, and reduction

#### MPI\_BARRIER (comm, ierr)

Petersen and Arbenz, IPP, Oxford University Press, 2004

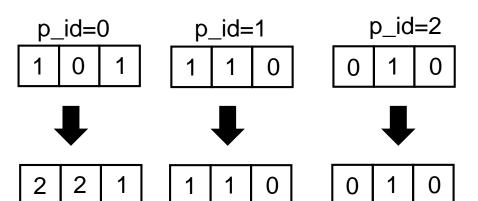
> Each proc in **comm** waits until all of them reach at this step

#### MPI\_BCAST (data, count, datatype, root, comm, ierr)

> Proc root spreads data of length count to all other procs in comm.

#### MPI\_REDUCE (segment, result, count, datatype, operator, root, comm, ierr)

➤ Proc dependent **segment**s are merged as **result** in **root**. The merging is defined by **operator**.





#### □ EXAMPLE – broadcast and barrier

We want one proc to read input and broadcast among others

```
----- Read input arguments
  --- Only one proc reads and then boasts to others
                                          Only p_id = master does the i/o job
IF (p id.EQ.master) THEN
  D0 iiarg = 1, iargc()
   CALL getarg( iiarg, inp string(iiarg) )
  ENDDO
 READ ( inp string(1), *) flag
  READ ( inp string(2), *) m
  READ (inp string(3), *) n
                                         Other procs wait until master is done
ENDIF
CALL mpi barrier (MPI COMM WORLD, ierr)
CALL mpi_bcast(m,1,MPI_INTEGER,master,MPI_COMM_WORLD,ierr)
CALL mpi bcast(n,1,MPI INTEGER,master,MPI COMM WORLD,ierr)
CALL mpi_bcast(flag,10,MPI_CHARACTER,master,MPI_COMM_WORLD,ierr)
```

Input data is broadcasted to other procs



```
□ EXAMPLE – reduction
                                          We want to compute \{c\}_{n\times 1} = [A]_{n\times m}\{b\}_{m\times 1}
     ----- Split sample among procs ------
                        → n is split among np. Each proc gets n_per_proc
  n per proc = n / np
  rest = MOD (n, np)
  IF (p id .LE. (rest - 1)) n per proc = n per proc + 1
                                                           \rightarrow when mod (n, np) \neq 0
  lower bound = n per proc * p id + 1
  IF (p id .GE. rest ) lower bound = (n per proc + 1) * rest + n per proc * (p id - rest) + 1
  upper bound = lower bound + n per proc - 1
                                                          index bounds on each proc
    ------ Compute the proc wise split parts and then reduce to a single proc
  DO i = lower bound, upper bound
    DO j = 1, m
                                                 Each proc computes its own share
       c(i) = c(i) + A(i,j)*b(j)
    ENDDO
                                                    Total \{c\}_{n\times 1} reduced to master
  ENDD0
  CALL mpi barrier (MPI COMM WORLD, ierr)
  CALL mpi reduce (c,c tot,n,MPI FLOAT,MPI SUM,master,MPI COMM WORLD,ierr)
```

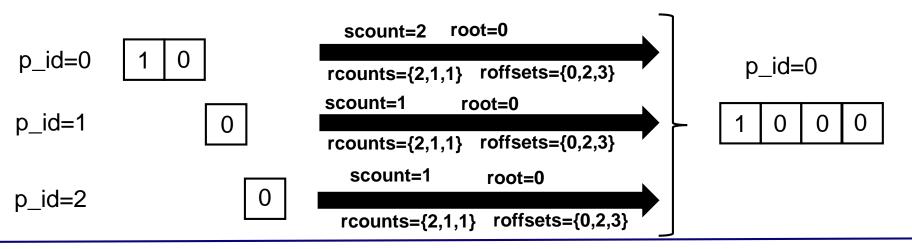


#### □ COLLECTIVE COMMUNICATIONS – scatter(v) and gather(v)

- > MPI\_SCATTER (MPI\_GATHER) distribute (assemble) data segments
- ➤ MPI\_SCATTERV (MPI\_GATHERV) additional features to non-uniformly distribute (assemble) data segments.
- We discuss the latter ones as that would clarify the former ones too.

Petersen and Arbenz, IPP, Oxford University Press, 2004

MPI\_GATHERV (segment, scount, stype, result, rcounts, roffsets, rtype, root, comm, ierr)





#### □ EXAMPLE – gatherv

Again we want to compute  $\{c\}_{n\times 1} = [A]_{n\times m}\{b\}_{m\times 1}$ 

```
D0 i = 1, n per proc
                               Each proc computes its share.
  DO j = 1, m
                               However, note that the size of the vector c in each
     c(i) = c(i) + A(i,j)*b(j)
                               proc is n_per_proc unlike the reduction case where
  ENDDO
                               it was n. Similar argument is valid for the matrix A
ENDDO
counts(:) = 0
                             Each proc gets its own send counts and offsets
offsets(:) = 0
counts(p id+1) = n per proc
offsets(p id+1) = lower bnd - 1
                                     counts and offsets are merged in arrays using
                                      allreduce (all procs get the merged result)
CALL mpi barrier (MPI COMM WORLD, ierr)
CALL mpi_allreduce (counts, all_counts, np, MPI_INTEGER, MPI_SUM, MPI_COMM_WORLD, ierr)
CALL mpi_allreduce (offsets, all_offsets, np, MPI_INTEGER, MPI_SUM, MPI_COMM_WORLD, ierr)
CALL mpi gatherv(c,n per proc,MPI FLOAT,c tot,all counts,all offsets,MPI FLOAT,master,&
                                                                   MPI COMM WORLD, ierr)
      Segments of c are gathered in c_tot
```



#### **MPI DATATYPES**

#### □ COMMONLY USED ELEMENTARY MPI FORTRAN DATATYPES

MPI TYPE	FORTRAN TYPE
MPI_INTEGER	INTEGER(KIND=4)
MPI_INTEGER8	INTEGER(KIND=8)
MPI_FLOAT	REAL (KIND=4)
MPI_DOUBLE	REAL (KIND=8)
MPI_COMPLEX	COMPLEX
MPI_LOGICAL	LOGICAL
MPI_CHARACTER	CHARACTER(LEN=1)

MPI 3.0 Standard <a href="http://mpi-forum.org/docs/mpi-3.0/mpi30-report.pdf">http://mpi-forum.org/docs/mpi-3.0/mpi30-report.pdf</a>



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#### **RULE OF THE GAME**

T. Rauber and G. Runger, Parallel Programming, Springer 2013

# ☐ AMDAHL'S LAW

$$S_p(n) = \frac{1}{f + \frac{1-f}{p}}$$

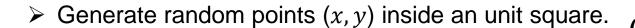
- $\gt S_p(n)$  is the limit in actual speedup of the entire code of a given size n
- $\triangleright$  p is the speed up of the code that benefits from the increase in resources.
- f is the fraction of the total execution time taken by the sequential part of the code

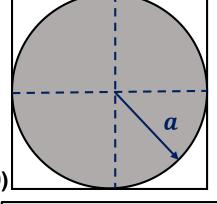
Take home message – Overall speedup is limited by the percentage of the sequential part of the code

☐ Goal – Improve scalability/speedup through optimizing code.



- **Task** Compute the value of  $\pi$  stochastically.
- □ Method –





> Count the fraction of them falling inside an unit circle.

Square area = 
$$4a^2$$

$$\triangleright$$
  $\pi = 4 \times \frac{Points\ inside\ unit\ circle}{Total\ number\ of\ points}$ 

Circle area =  $\pi a^2$ 

- > This is referred to as the dartboard algorithm [Message Passing Interface, B. Barney, LLNL]
- ✓ We would compute this in parallel using MPI in different ways and compare the speedup and accuracy of the calculation.



#### **□** SEQUENTIAL VERSION

```
In-built pseudo random number generator (RNG)

DO i = 1,n

with a period of 2<sup>1024</sup> - 1 (https://gcc.gnu.org/)

Based on XORshift logic.

CALL RANDOM_NUMBER(r1)

CALL RANDOM_NUMBER(r2)

i

a = (r1*r1 + r2*r2)

IF(a.LT.(1.0)) c_ser = c_ser + 1

END DO

PRINT'("Serially calculated Pi = ",f16.10)',4.0D0*float(c_ser)/float(n)
```

#### Output 3.1400

✓ A higher value of the sample size (n) will produce more accurate result.



Same program run on split

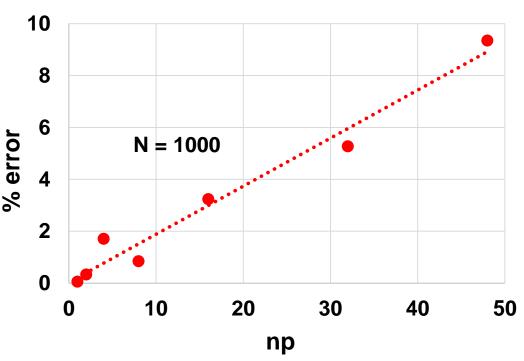
#### □ PARALLEL VERSION 1

Output NOT ACCURATE and ACCURACY DROPS WITH INCREASING NUMBER OF PROCS!



#### □ PARALLEL VERSION 1

- Aliasing among the RNGs in different procs.
- Effective sample size drops
- Poor statistics.
- ➤ For very large number of procs result becomes unreliable.



- For this particular problem you can get away with any significant error simply choosing a very high N
- But think about large problem sizes where you cannot afford to have a high N.



#### □ PARALLEL VERSION 2

```
IF (ip.EQ.master) THEN
 D0 i = 1, n
                                  RNG is called by only one proc to generate all
    CALL RANDOM NUMBER(x)
                                  the random numbers to avoid aliasing.
    r1 \ all(i) = x
    CALL RANDOM NUMBER(x)
    r2 \ all(i) = x
 ENDDO
ENDIF
CALL mpi barrier (MPI COMM WORLD, ierr)
                                      Random numbers are scattered across procs
CALL mpi scattery ( r1 all, all counts, all offsets, MPI DOUBLE, &
                  rl, n per proc, MPI DOUBLE, master, MPI COMM WORLD, ierr)
DO i = 1, n_per_proc 'area' calculation in parallel
                                                                 Good accuracy ©
  a = (r1(i)*r1(i) + r2(i)*r2(i))
                                                      Output
  IF(a.LT.(1.0)) c par = c par + 1
                                                                 Poor (no) speedup 🕾
END DO
                                                                 Amdahl's law in action!
CALL mpi barrier (MPI COMM WORLD, ierr)
CALL mpi allreduce (c par,c par tot,1,MPI INTEGER,MPI SUM,MPI COMM WORLD,ierr)
```



#### ☐ PARALLEL VERSION 3

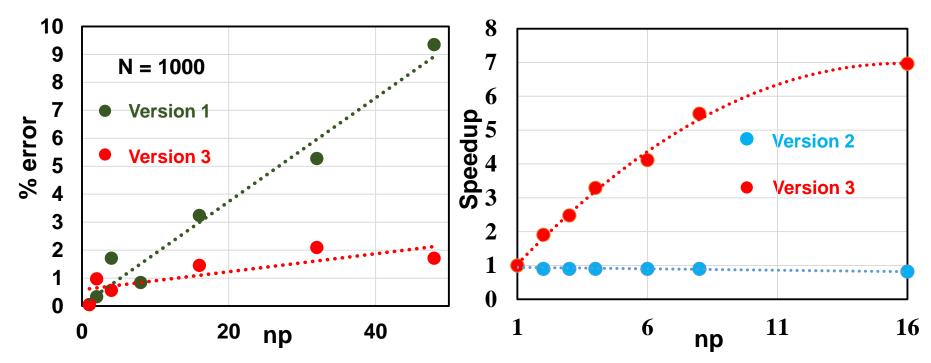
arr is dependent on the proc\_id

#### **Output**

Good accuracy © Good speedup ©



#### □ PERFORMANCE COMPARISON



- ➤ The sample size, N, for speedup comparison is taken to be much higher so that the problem size becomes reasonable to compare the speedup.
- ➤ I use INTEL MKL (<a href="https://software.intel.com/en-us/intel-mkl">https://software.intel.com/en-us/intel-mkl</a> ) RNGs where separate generators can be used for each proc.



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# WHY SHARED MEMORY (SHM)?

#### □ PROBLEM WITH DISTRIBUTED MEMORY (PURE MPI)

- Each proc has its own copy of all the variables.
- > This becomes a problem as array sizes grow and is redundant for SHM procs
- > Total memory requirement exceeds the given node's memory capacity.
- Plus, unnecessary MPI calls among the SHM procs.

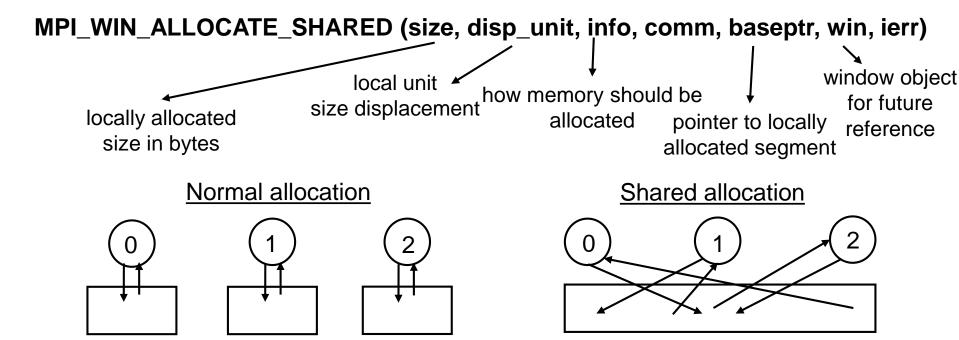
#### ☐ SHARING THE MEMORY AMONG PROCS (HYBRID)

- Allocate a shared memory window in each proc that is accessible to all procs
- > Split the variable among procs, one proc can access other's share.
- > This hybrid approach drastically cuts down the memory requirement
- ➤ Different ways MPI+OpenMP, MPI+MPI-3), etc.

Let's see how this can be done using MPI. You need to use MPI-3 for SHM



#### SHM ALLOCATION



- Programmer's responsibility to make sure that all procs under comm can have a shared memory segment. Will see how.
- → info = MPI\_INFO\_NULL allocates contiguous memory; segments are next to each other. Use ALLOC\_SHARED\_NONCONTIG for non-contiguous memory.

MPI 3.0 Standard <a href="http://mpi-forum.org/docs/mpi-3.0/mpi30-report.pdf">http://mpi-forum.org/docs/mpi-3.0/mpi30-report.pdf</a>



#### **SHM ACCESS**

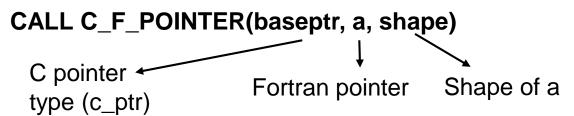
MPI\_WIN\_SHARED\_QUERY (win, rank, size, disp\_unit, baseptr)

i/p

o/p

- > Rank should be the local rank of the target proc
- baseptr points to the local segment in the target proc
- ➤ Often the storing and loading of data from remote target procs are referred to as Remote Memory Access (RMA)
- ➤ FORTRAN only

USE, INTRINSIC :: ISO\_C\_BINDING



Or use Cray pointers. Some compliers may need separate option for Cray pointers during compilation.

MPI 3.0 Standard <a href="http://mpi-forum.org/docs/mpi-3.0/mpi30-report.pdf">http://mpi-forum.org/docs/mpi-3.0/mpi30-report.pdf</a>



#### SPLITING THE COMMUNICATOR

#### ☐ MAKING SURE PROCS HAVE A SHM SEGMENT

- > First job in any SHM program is to split the communicator group into SHM communicator groups (shmcomm)
- > This ensures all procs under shmcomm can have a shared memory segment.
- ➤ If we work on a single node (unusual for big codes), MPI\_COMM\_WORLD and shmcomm are same.

#### **□ EXAMPLE**



# SHM - EXAMPLE

#### ☐ ALLOCATE SHARED MEMORY

We want to store a 2D array  $A_{mk \times nk}$  inside a shared window

```
******** Allocate shared memory. Change MPI INFO NULL to ALLOC SHARED NONCONTIG if you ******
         ************************ want noncontiquous memory segments. *********
                                               loc_size is mk split over np
shape1 = (/loc size, nk/)
size1 = DP_size * shape1(1) * shape1(2)
                                               size1 is the actual size in bytes
IF (p id.LT.my size) PRINT '( " My rank is ", i3, " and local size is ", i3)', my rank, loc size
CALL MPI WIN ALLOCATE_SHARED (size1, 1 , MPI_INFO_NULL, shmcomm, p, smwin, ierr)
CALL C F POINTER(p, a, shapel) ! to assign C pointer target to FORTRAN pointer
                                            fence. Different from MPI_BARRIER.
CALL DD(a)
CALL MPI Win fence (0, smwin, ierr)
                                            Ensures no wrong loading of data during the
CALL DD(a)
                                            RMA operation.
D0 i = 1, loc size
  D0 j = 1, nk
     a(i, j) = FLOAT ( ( p id + my rank + 2) * ( i + j ) )
  ENDDO
                                     Fortran only, DD is just an user defined empty routine
ENDDO
                                     to make sure register copies of a are written back to
CALL DD(a)
                                     memory. See MPI 3.0 Standard (page 638) for more
CALL MPI Win fence (0, smwin, ierr)
CALL DD(a)
                                     details
```



#### SHM - EXAMPLE

□ SHARED QUERY

Next we want to remote access some elements of the array

```
D0 iproc = 1, my size - 1
  IF ( imk.GT.all offsets(iproc) .AND. imk.LE.all offsets(iproc+1) ) THEN
     ipool = iproc - 1
     ipos = imk - all offsets(iproc)
     PRINT '( (/1x), "proc address and local positions are ", 2i3, (/1x))', ipool, ipos
     EXIT
                                                    First find out which proc the asked
  ELSEIF ( imk.GT.all offsets(my size)) THEN
                                                    element belongs to and what is its
                                                    position inside that proc
     ipool = my size - 1
     ipos = imk - all offsets(ipool)
     PRINT '( (/1x), "proc address and local positions are ", 2i3, (/1x))', ipool, ipos
     EXIT
  ENDIF
ENDDO
                               Next access that element through shared query
 ******* Ask for remote proc attributes *****
CALL MPI_WIN_SHARED_QUERY (smwin, ipool, size1, disp1, p1, ierr)
rm shape (2) = \text{shape1}(2)
rm shape (1) = size1 / ( DP_size * rm_shape(2) )
CALL C F POINTER(p1, a1, rm shape)
```



# SHM - EXAMPLE

#### □ <u>OUTPUT</u>

My rank is My rank is	Let's take mk=40, nk=40 with mk of and local size is 14 1 and local size is 13  Let's take mk=40, nk=40 with mk being split among 3 procs
My rank is 2 and local size is	
32.0	
36.0 40.0	Here we double-check the functionality of the code –
44.0 48.0	Definition of A : $A(i,j) = (p_id + my_rank + 2) * (i + j)$
	Now imk=21 belongs to p_id=1 and my_rank=1
176.0 180.0	Local position of imk=21 in p_id=3 should be ipos=(21-14) = 7
184.0 188.0	Hence the array should be $A(21, j) = 4 * (7 + j) \forall j \in [1,40]$
	This is what we see at the output.



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#### SUMMARY AND ACKNOWLEDGEMENT

#### □ <u>SUMMARY</u>

- Parallel programming becomes more important and powerful in scientific computing every passing year.
- MPI is an extremely useful and efficient standard to build parallel codes.
- Speedup in parallel codes is limited by the sequential percentage of the code.
- MPI shared memory provides excellent features to deal with large memory.

#### **□** ACKNOWLEDGEMENT

- Advisor : Dr. Uttam Singisetti
- Center for Computational Research (CCR) at UB
- Science & Engineering Node Services (SENS) at UB
- Electrical Engineering (EE) Department at UB



# **THANK YOU ALL!**

# **HAPPY PARALLEL PROGRAMMING!**

... Enjoy responsibly <sup>(2)</sup>

Cheers,
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https://sites.google.com/site/ghoshportal/