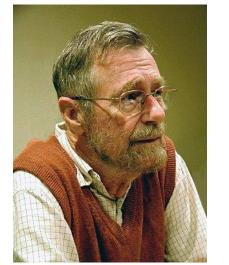
"as long as there were no machines, programming was no problem at all;

when we had a few weak computers, programming became a mild problem, and

now we have gigantic computers, programming has become an equally gigantic problem."



pic: https://en.wikipedia.org/wiki/Edsger\_W.\_Dijkstra

- Edgar Dijkstra, 1972 Turing Award Lecture

## A Gigantic Computer

System 360 / Model 91



Source: https://www.ibm.com/ibm/history/exhibits/mainframe/mainframe\_PP2091.html

## **HPC Clusters and Programming**

NSM Nodal Center for Training in HPC and AI, IIT Madras

Nikhil Hegde, IIT Dharwad

March 20, 2021

#### What is a Cluster?

- Gigantic computer
  - from interconnecting several smaller computers



VIRGO Super Cluster, IIT Madras. Source: https://cc.iitm.ac.in/node/184

#### What is a Cluster?

- Gigantic computer
  - from interconnecting several smaller computers
- Compute power in the order of 10<sup>15</sup> floating point operations per second (Peta\* FLOPS)
  - Your i7-based personal computer few Giga FLOPs (109)

#### What is a Cluster?

- Gigantic computer
  - from interconnecting several smaller computers
- Compute power in the order of 10<sup>15</sup> floating point operations per second (Peta\* FLOPS)
  - Your i7-based personal computer few Giga FLOPs (10<sup>9</sup>)
- E.g.
  - Chandra (IIT Palakkad), Virgo (IIT Madras), AnantGanak (IIT Dharwad) etc.

# Why Clusters?



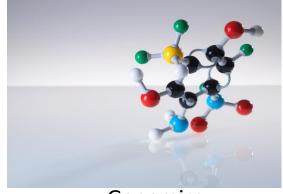
**Financial Analysis** 



**Design Simulation** 



Oil Exploration



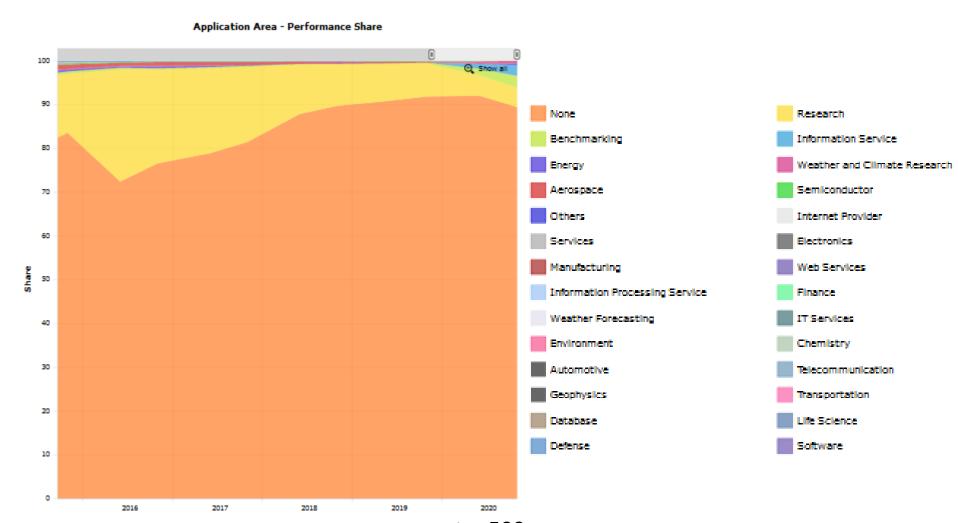
Genomics





**Weather Prediction** 

## Why Clusters? Application Areas



source: top500.org

## **Terminology - Cluster Elements**

- Processing Element
  - Core, CPU, Node, GPU, Virtual CPUs
- Storage
- Interconnect
- Partition
- Job and Job Scheduler
- Operating System (OS), Software Development Tools, Applications
- Infrastructure power, cooling,

**Hardware** 

**Software** 

#### Node

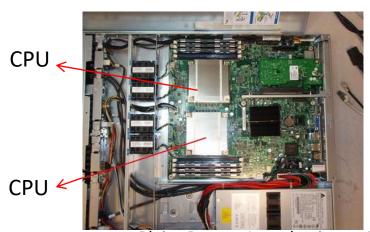
- Standalone computer
- Comprised of multiple CPUs/Processors/Cores, memory, network interfaces.



Each Green dot is a Node

 Master / Log-in node: is what end user interacts with (think: operator's console)

- CPU/Processor and Socket
  - No consensus on terminology. Some vendors call multicore CPUs as sockets.

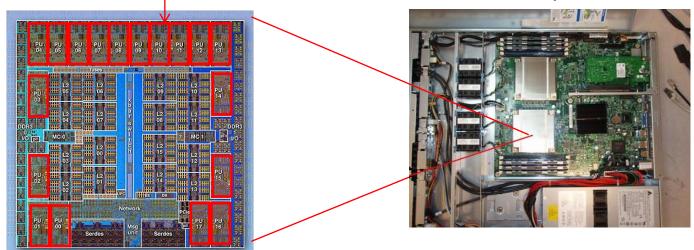


source: Blaise Barney, Introduction to Parallel Computing, https://hpc.llnl.gov/training/tutorials/introduction-parallel-computing-tutorial

 Socket can also be a place to plug a CPU. E.g. dual-socket motherboard in pic.

#### Core

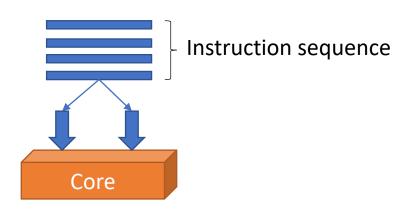
• Each PU shown is a core. Pic: IBM BG/Q with 18 Cores



source: Blaise Barney, Introduction to Parallel Computing, https://hpc.llnl.gov/training/tutorials/introduction-parallel-computing-tutorial

 In the past, each CPU (with just one core) was a single execution unit. Now, each core is an independent execution unit.

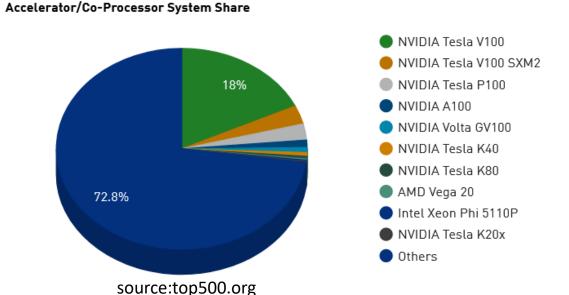
- Thread (hardware)
  - Pathway for flow of instruction within a core
  - When exposed to the OS, the OS gives an illusion to the programmer that multiple cores exist ("HyperThreading")



#### Virtual CPUs

- A term that you often get to hear when working with 'Cloud' hosted systems
- Virtual Machine (VM) assigned to a single physical core
  - A VM is an abstraction/emulation of a computer

- GPU (Graphics Processing Unit) Add-on devices
  - Traditionally: accelerate image creation
  - Now: GPGPUs for large-scale modeling, genetic programming



#### **Cluster Elements**

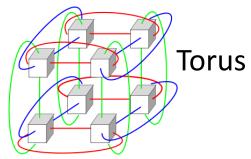
- Interconnect
  - Nvidia-Mellanox Switch



source: https://www.nvidia.com/en-in/networking/infiniband-switching/

Cabling (determines topology)





source: https://en.wikipedia.org/wiki/Torus\_interconnect

#### **Cluster Elements**

- Storage
  - \$HOME
    - Landing directory when you log in to the master node
  - \$SCRATCH and/or Parallel File System
    - A fast memory where you should keep all the data needed for executing the task
    - E.g. Lustre, BeeGFS, etc.
  - (Optionally) storage may be available on each compute node e.g. /tmp
  - (Optionally) archival storage (e.g. LTO-6, Storage Server (e.g. IBM DS3512))

#### Cluster Elements - Software

#### Job

- A task performed by the cluster
- Represented by a set of commands to the cluster, captured in a script, to precisely tell how to execute the task
- Usually, the set of commands do not require your intervention i.e. non-interactive
  - You issue the commands (read: "submit a job") and go for coffee..

## <u>Cluster Elements - Software</u>

- Batch System Job Scheduler and Resource manager
  - 1. Provide a user interface to submit, monitor, and run jobs
  - Manage the computational resources mentioned previously
  - 3. Implement the usage policies set by HPC Admin
- E.g. SLURM (Simple Linux Utility for Resource Management), PBS (Portable Batch System) – Torque, Moab.

#### Cluster Elements - Software

#### Partitions/Queues

- A logical grouping of (a subset of) nodes in the cluster
- Single node can belong to multiple partitions (not done in practice)
- Define attributes (and limits) for a job submitted to a Q
   E.g.
  - A job submitted to a specific partition runs with low priority
  - A job can request a maximum of 4 cores
  - etc.

#### Cluster Elements - Software

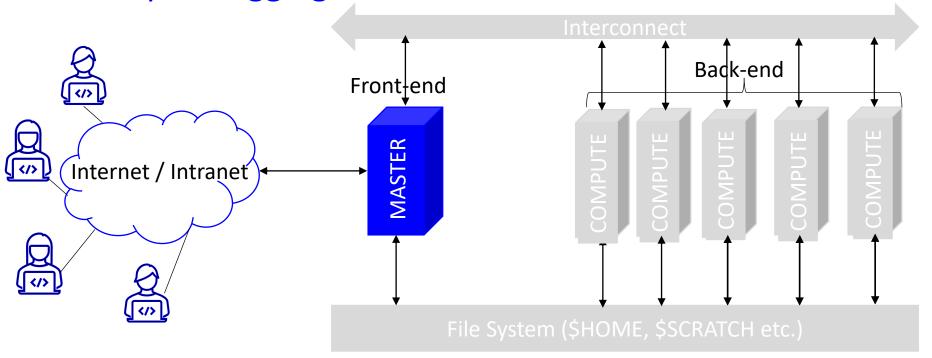
- Operating System (OS), Software Development Tools, Applications
  - Linux-based OS in 100% of the supercomputing clusters in top500.org (2015 onwards)
  - Compiler tool chains, Runtime systems, Profilers
  - E.g. GCC, ICC, MPICH, JDK, Docker, Matlab, Intel Parallel Studio, NVProf, Tau etc.

#### Recap

 Clusters Interconnect Badk-end Frontend COMPUTE COMPUTE COMPUTE COMPUTE COMPUTE MASTER Internet / Intranet File System (\$HOME, \$SCRATCH etc.)

#### Clusters

• Step 1: Logging-in



### Logging-in

- Logging into remote Linux system (master node) requires you to use SSH ("Secure Shell Protocol")
  - Login credentials are encrypted
  - SSH server must be running on the system that you are logging into; Happens on most Linux systems by default.
  - SSH client, another piece of software, is used to authenticate and connect to the SSH server
    - Client software is available for all platforms (OSs)

- Powershell on Windows 10
  - Press (Windows + R) -> Type "powershell"
  - Type "ssh <username>@<masternode\_IP\_address>
  - Type 'Yes' when prompted (only first time)
  - Provide log-in credentials

```
Windows PowerShell

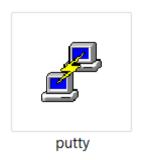
Windows PowerShell

Copyright (C) Microsoft Corporation. All rights reserved.

Try the new cross-platform PowerShell https://aka.ms/pscore6

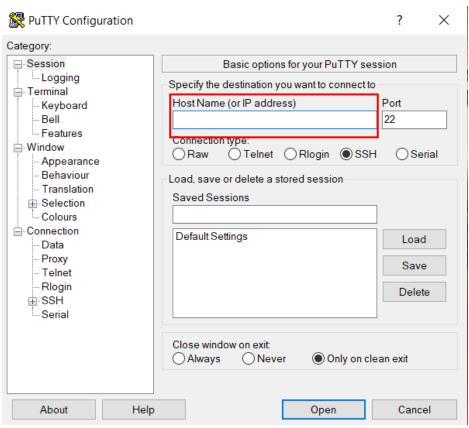
PS C:\Users\ndheg> ssh nikhilh@10.250.101.100_
```

- PuTTY SSH client Windows
  - Download PuTTY from <a href="https://www.chiark.greenend.org.uk/~sgtatham/putty/latest.html">https://www.chiark.greenend.org.uk/~sgtatham/putty/latest.html</a> (64-bit .exe)
  - Double click on the

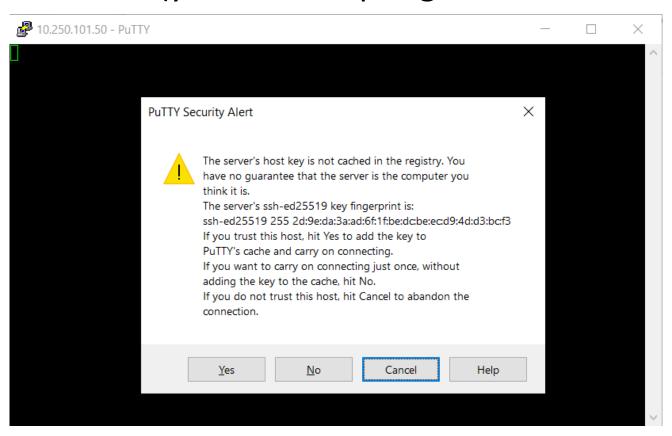


icon after downloading

Type in the Host Name / IP address and click 'Open'



Click on 'Yes' (you are accepting the server host key)



Enter log-in credentials

```
login as: nikhilh
nikhilh@10.250.101.100's password:

Last login: Wed Mar 17 09:53:33 2021 from 10.196.7.237

Intel(R) Parallel Studio XE 2020 Update 2 for Linux*

Copyright 2009-2020 Intel Corporation.
[nikhilh@iitdhmaster ~]$
```

## Logging-in MAC

 Open the 'Terminal' program on MAC (Go -> Applications -> Terminal)

```
Last login: Sun Mar 7 11:35:13 on ttys000

The default interactive shell is now zsh.

To update your account to use zsh, please run `chsh -s /bin/zsh`.

For more details, please visit https://support.apple.com/kb/HT208050.

apples-MacBook-Pro:~ apple$
```

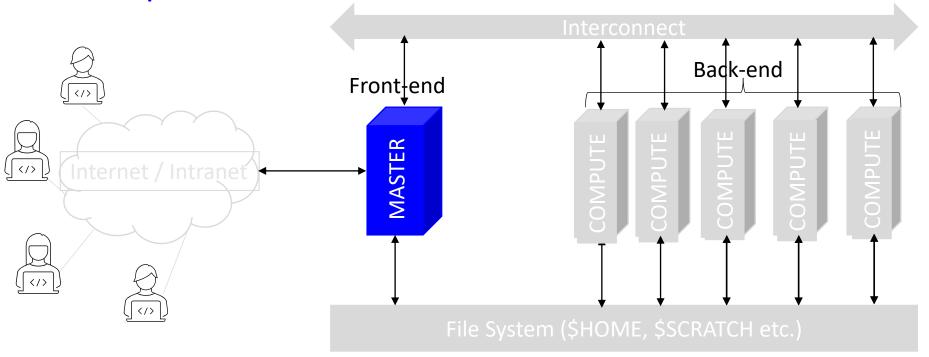
- Type "ssh <username>@<masternode\_IP\_address>
- Type 'Yes' when prompted (only first time)
- Provide log-in credentials

## Logging-in Linux

- If you are a Linux user, you know what a 'Terminal' is ©
- Type "ssh <username>@<masternode\_IP\_address>
- Type 'Yes' when prompted (only first time)
- Provide log-in credentials

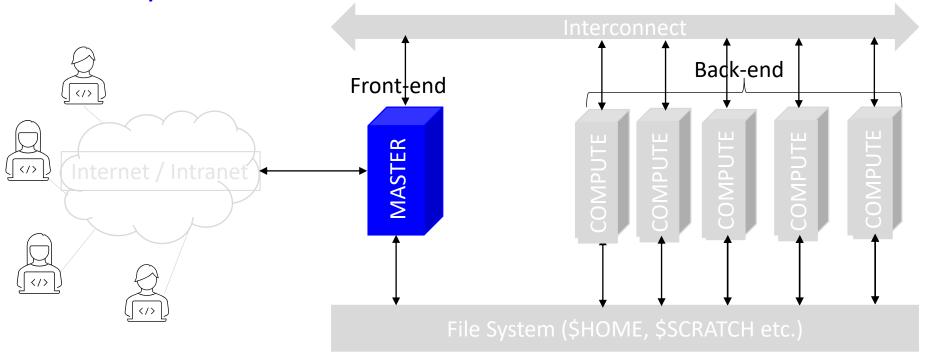
#### Clusters

Step 2: Activities on the Master Node



#### Clusters

Step 2: Activities on the Master Node



Master node runs Linux-OS. Let's review useful Linux commands

#### **Useful Linux Commands**

```
cat
ls, ls -1
                        less
man
                         head, tail
mkdir
                        vi, vim, emacs, nano, pico
cd
                        gzip, tar, zip
pwd
                        who
ср
                        cut
mv
                        WC
scp
                         hc
rm //use with caution!
                        echo
```

Type "man <command\_name\_here>" on the Linux terminal to get help info

## Useful Linux Commands - scp

scp - To move files back and forth between master node and your local system

```
PS C:\Temp> scp README.txt nikhilh@10.250.101.100:
nikhilh@10.250.101.100's password:

PS C:\Temp> scp nikhilh@10.250.101.100:pscp.exe .
nikhilh@10.250.101.100's password:
pscp.exe

PS C:\Temp>

100% 137 19.4KB/c 00:00

100% 669KB 3.9MB/s 00:00

PS C:\Temp>
```

from Master node to your system

scp <user\_name>@<master\_node\_ip>:file1 .

## Useful Linux Commands — zip, unzip

zip, unzip - To compress/uncompress folders/directories

```
zip -r compressed.zip workshop_files/
unzip compressed.zip
```

-r for recursively applying the compression to folders within

```
Windows PowerShell
PS C:\Temp\Nikhil\Courses\Others\HPC>|zip -r workshop_files.zip workshop_files
updating: workshop_files/ (192 bytes security) (stored 0%)
updating: workshop_files/HPC_101_1.pptx (172 bytes security) (deflated 3%)
updating: workshop_files/README.txt (172 bytes security) (stored 0%)
  adding: workshop_files/test_combination.out (172 bytes security) (deflated 57%)
 adding: workshop_files/test_complex.out (172 bytes security) (deflated 75%) adding: workshop_files/test_expr.out (172 bytes security) (deflated 72%)
 adding: workshop_files/test_if.out (172 bytes security) (deflated 61%)
 adding: workshop_files/test_mult.out (172 bytes security) (deflated 53%)
PS C:\Temp\Nikhil\Courses\Others\HPC> unzip workshop_files.zip
Archive: workshop_files.zip
replace workshop_files/HPC_101_1.pptx? [y]es, [n]o, [A]ll, [N]one, [r]ename: A
inflating: workshop_files/HPC_101_1.pptx extracting: workshop_files/README.txt
 inflating: workshop_files/test_combination.out
 inflating: workshop_files/test_complex.out
  inflating: workshop_files/test_expr.out
  inflating: workshop_files/test_if.out
 inflating: workshop_files/test_mult.out
PS C:\Temp\Nikhil\Courses\Others\HPC>
```

### Useful Linux Commands – tar

```
tar - Tape Archive to compress/uncompress
folders/directories
tar -cvf workshop.tar workshop files/
tar -xvf workshop.tar
Type man tar to know about flags
tar followed by gzip compression:
tar -czvf workshop.tar.gz workshop files/
tar -xzvf workshop.tar.gz
```

### Useful Linux Commands - man

type man <command> and hit Enter key to get help

```
Inikhilh@iitdhmaster:~
[nikhilh@iitdhmaster ~]$ man wc
```

type q to quit. Use arrows to scroll

```
Obuntu inkhih@iitdhmaster:

(Cs406WC(1) User Communication

NAME

wc - print newline, word, and byte counts for each file

SYNOPSIS

wc [OPTION]... [FILE]...

wc [OPTION]... --files0-from=F

DESCRIPTION

Print newline, word, and byte counts for each FILE, and a towhen FILE is -, read standard input. A word is a non-zero-le options below may be used to select which counts are printled.
```

### **Useful Linux Commands**

### Other utility commands

```
cd HPC → change directory to HPC
cd .. → change directory to parent
vim hello.txt → open a file hello.txt for editing. See vi commands
ls → list files in the current directory
head hello.txt → display the first few lines of hello.txt
cat hello.txt → display entire content of hello.txt
pwd → display the name of the present working directory
who → display the names of all users who have currently logged-in
```

## stdout, stdin, stderr in Linux

- stdout
  - Output that is printed to screen (terminal)
- stdin
  - Keyboard input
- stderr
  - Error messages printed to screen (terminal)

also called streams (input stream, output stream, error stream)

## redirects and pipes in Linux

```
//redirect standard output to file1.txt
• echo "hello world" > file1.txt

//feed input to the cat command from file1.txt rather
than keyboard input.
• cat < file1.txt</pre>
```

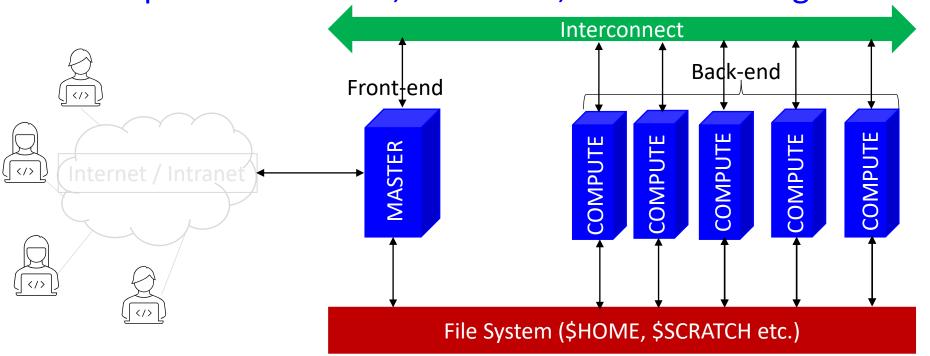
//create a pipeline, where the output of echo

command is fed to input of bc command.

• echo "100+200" | bc

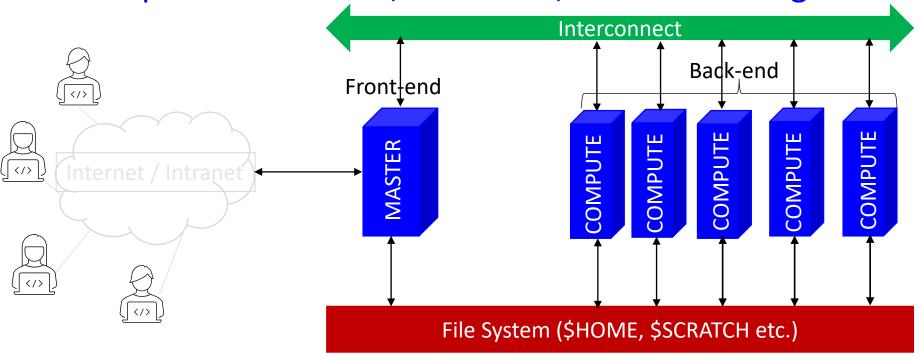
### Clusters

Step 3: Job creation, execution, and monitoring



### Clusters

Step 3: Job creation, execution, and monitoring



User must go through the **Batch System** for this step

### Life of a Job

- Four Phases
  - 1. Creation
  - 2. Submission
  - 3. Execution
  - 4. Completion

### Life of a Job - Creation

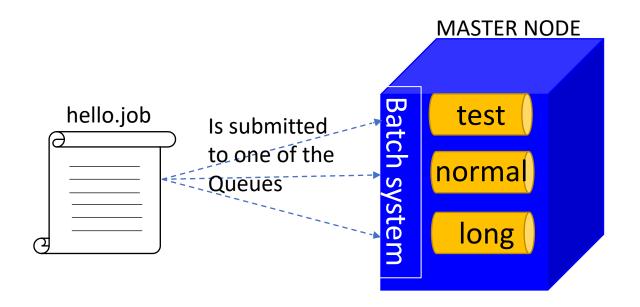
- Job creation specifies:
  - 1. What resources are needed (at least the following)
    - Maximum number of nodes and cores needed
    - Maximum amount of time needed
    - Maximum amount of memory needed
    - Whether exclusive access to a node is needed i.e. jobs from other users should run on the node simultaneously or not.
    - The partition or queue to run the job in
  - 2. What commands will be run in the job (actual task)
    - ./a.out
    - mpirun –np 10 helloworld
    - etc.
  - **3. Output:** Job script



### Life of a Job - Submission

- Successful submission implies:
  - No syntax errors in the specification
  - Amount of resources requested could possibly be allocated
  - A job object is created in the queue in which it would be executed
  - A job ID is returned to the user for reference
- Once the job is submitted (and before it is executed), you can change resource requirements (part 1) but not the actual task (part 2)

### Life of a Job - Submission



- E.g. command: sbatch hello.job
- test, normal, and long are the names of queues/partitions on my cluster

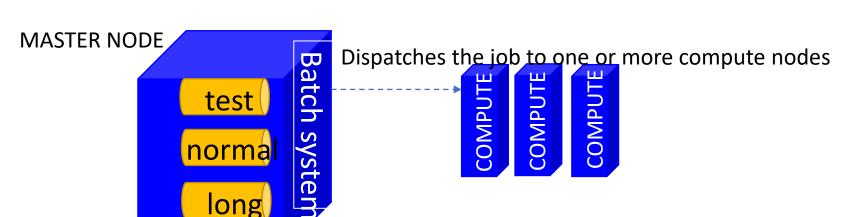
## Queues / Partition

• E.g. command: sinfo

```
[nikhi]h@iitdhmaster ~]$ sinfo
PARTITION AVAIL
                            NODES
                                   STATE NODELIST
                              1 idle cn01
4 idle cn[02-05]
                     30:00
test
             up
             up 6-00:00:00
long
                              26 idle cn[06-31]
             up 12:00:00
normal*
            up 12:00:00
                                    idle dgx
gpu
[nikhilh@iitdhmaster ~]$
```

### Life of a Job - Execution

- When requested resources become available
  - Job is launched on the compute nodes
  - The commands specified in part 2 are executed in sequence
- Neither the job resources nor the actual task can be changed at this time. If job exceeds requested resources, it is terminated and a notification is sent.



## Job Monitoring

check the status (squeue)

```
nikhilh@iitdhmaster hpc101]$ squeue

JOBID PARTITION NAME USER ST TIME NODES NODELIST(REASON)

851 normal sh nikhilh R 1:08 1 cn06

Inikhilh@iitdhmaster hpc101|$
```

delete the job if required (scancel)

```
nikhilh@iitdhmaster:/iitdh/faculty/nikhilh/hpc101
[nikhilh@iitdhmaster hpc101]$ squeue
             JOBID PARTITION
                                 NAME
                                           USER ST
                                                          TIME
                                                                NODES NODELIST(REASON)
[nikhilh@iitdhmaster hpc101]$ salloc -N 1 -p normal bash
salloc: Granted job allocation 852
[nikhi]h@iitdhmaster hpc101]$ squeue
             JOBID PARTITION
                                  NAME
                                            USER ST
                                                                 NODES NODELIST(REASON)
                                                          TIME
               852
                      normal
                                  bash nikhilh R
                                                          0:07
                                                                     1 cn06
[nikhi]h@iitdhmaster hpc101]$ scance] 852
salloc: Job allocation 852 has been revoked.
[nikhi]h@iitdhmaster hpc101]$ squeue
             JOBID PARTITION
                                                          TIME NODES NODELIST(REASON)
                                            USER ST
                                  NAME
[nikhilh@iitdhmaster hpc101]$
```

- Can happen because of normal completion of execution, abnormal termination, or job exceeding requested resources
- Output (stdout/err) stored in file
  - At the same location where job was submitted (default)
  - At a location mentioned in the job script
- All resources are reclaimed at this point and allocated to other jobs if needed

job exceeding requested time

```
nikhilh@iitdhmaster:/iitdh/faculty/nikhilh/hpc101
salloc: Granted job allocation 854
[nikhilh@iitdhmaster hpc101]$ sinfo
PARTITION AVAIL TIMELIMIT NODES
                               STATE NODELIST
                                 idle cn01
           up 6-00:00:00
                                 idle cn[02-05]
normal*
                                 mix cn[06-07]
normal*
                                idle cn[08-31]
                                idle dax
[nikhi]h@iitdhmaster hpc101]$\squeue
           JOBID PARTITION
                                                   TIME NODES NODELIST(REASON)
                              bash nikhilh R
                   normal
[nikhilh@iitdhmaster hoc101]§ salloc: Job 854 has exceeded its time limit and its allocation has been revoked,
```

- mix indicates non-exclusive access
- two nodes (indicated by –N 2) cn06 and cn07 are requested

job completing normally

- slurm-855.out contains the output of the program written to terminal (stdout)
  - In case of error you would have seen a file mwttest\_large.job.e855 and mwttest\_large.job.o855

Checking the status of completed job (qstat in PBS)

In SLURM (sacct)

```
|nikhilh@iitdhmaster hpc101|$ sacct -j 855
                                                 AllocCPUS
       JobID
                JobName
                          Partition
                                        Account
                                                                 State ExitCode
855
                                                             COMPLETED
             mwttest 1+
                             normal
                                                        40
                                           root
                                                                             0:0
855.batch
                   batch
                                           root
                                                             COMPLETED
                                                                             0:0
855.0
             hydra bst+
                                           root
                                                             COMPLETED
                                                                             0:0
[nikhilh@iitdhmaster hpc101]$
```

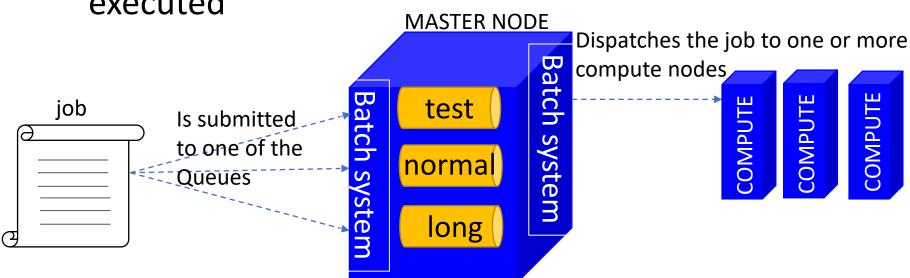
## Recap - SLURM Commands

- sbatch → to submit a job to the queue for later execution (batch mode)
- scancel → to cancel a queued or running job
- sinfo  $\rightarrow$  report system info (queues, nodes, etc.)
- squeue → report job status
- srun → to create a job and execute
- sattach → to connect stdin/out/err to an existing job
- **sreport**  $\rightarrow$  report resource usage by user, account etc.
- salloc → to create a job and start a shell to use it (interactive mode)
- sstat  $\rightarrow$  report accounting info about currently running jobs

# **Batch System** (SLURM and PBS)

- Runs continuously (daemon) and monitors resources
- Scans the <u>queues</u> repeatedly
  - user jobs are submitted to queues

Determines when and where the jobs are to be executed



### **SLURM and PBS**

- Provide exclusive or non-exclusive access to compute nodes
- Provide a set of user-commands for
  - job control
  - node control
  - accounting
  - Many other things ...

```
[nikhilh@iitdhmaster hpc101]$ cat mwttest_large.job
#!/bin/bash
#SBATCH -p normal
#SBATCH -t 00:30:00
#SBATCH -N 8
#SBATCH --ntasks-per-node 5
#echo commands to stdout
#set -x
#run MPI program
mpirun -np 40 /iitdh/faculty/nikhilh/Nikhil_test/exes/MWT
```

```
[nikhilh@iitdhmast #!/bin/bash two characters are # and !. This line two characters are # and !. This line means that the job would be starting in job owner's login shell environment. In this case the shell is 'bash' #set -x

#run MPI program mpirun -np 40 /iitdh/faculty/nikhilh/Nikhil_test/exes/MWT
```

```
[nikhilh@iitdhmaster hpc101]$ cat mwttest large.job
#!/bin/bash
#SBATCH -p normal
#SBATCH -t 00:30:00
#SBATCH -N 8
#SBATCH --ntasks-per-node 5
#echo commands to stdout
#set -x
#run MPI program
mpirun -np 40 /iitdh/faculty/nikhilh/Nikhil_test/exes/MWT
```

```
[nikhilh@iitdhmaster hpc101]$ cat mwttest_large.job
#!/bin/bash
#SBATCH -p normal
#SBATCH -t 00:30:00
#SBATCH -N 8
#SBATCH --ntasks-per-node 5
#echo commands to stdout
#set -x
#run MPI program
mpirun -np 40 /iitdh/faculty/nikhilh/Nikhil_test/exes/MWT
```

```
[nikhilh@iitdhmaster hpc101]$ cat mwttest_large.job
#!/bin/bash
#SBATCH -p normal
#SBATCH -t 00:30:00
#SBATCH -N 8
                                Means that the 5 cores on each
#SBATCH --ntasks-per-node 5
                                of the nodes requested are
#echo commands to stdout
                                needed. Remaining cores on the
#set -x
                                nodes can be given away to
#run MPI program
                                other jobs (because of non-
mpirun -np 40 /iitdh/faculty/n:
                                exclusive access)
```

```
[nikhilh@iitdhmaster hpc101]$ cat mwttest_large.job
#!/bin/bash
#SBATCH -p normal
#SBATCH -t 00:30:00
#SBATCH -N 8
#SBATCH --ntasks-per-node 5
#echo commands to stdout
#set -x
#run MPI program
mpirun -np 40 /iitdh/faculty/
batch system SLURM
Any line beginning with a # is a
'comment' in a shell program.
Previous lines have #SBATCH,
which is interpreted by the
batch system SLURM
```

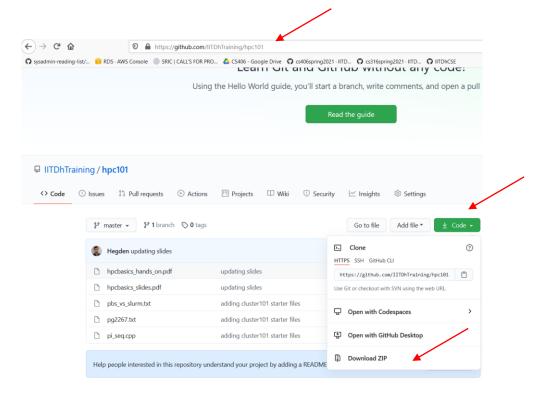
```
[nikhilh@iitdhmaster hpc101]$ cat mwttest_large.job
#!/bin/bash
#SBATCH -p normal
#SBATCH -t 00:30:00
#SBATCH -N 8
#SBATCH --ntasks-per-node
#echo commands to stdout
#set -x
#run MPI program
mpirun -np 40 /iitdh/faculty/nikhilh/Nikhil_test/exes/MWT
```

## SLURM/PBS Environment Variables

- \$SLURM\_JOB\_ID
- \$SLURM\_JOB\_NAME
- \$SLURM\_SUBMIT\_DIR
- \$SLURM\_NTASKS
- \$SLURM\_NTASKS\_PER\_NODE
- \$SLURM\_JOB\_NUM\_NODES
- \$PBS\_NODEFILE
  - (in SLURM you will have to do srun hostname)

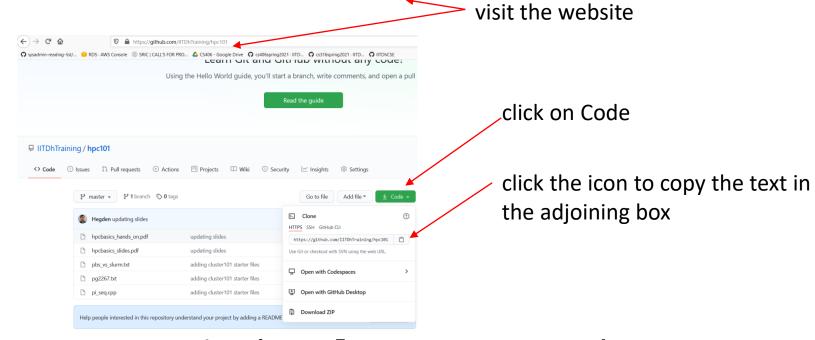
### Hands-on Session

visit <a href="https://github.com/IITDhTraining/hpc101">https://github.com/IITDhTraining/hpc101</a> and download the repository as .zip file to get started



### Hands-on Session

 You could also 'clone' the repository <a href="https://github.com/IITDhTraining/hpc101">https://github.com/IITDhTraining/hpc101</a> to get started



Type on terminal: git clone <paste the text copied>

## Clusters – How are they programmed?

- Programming for clusters is (all) about exploiting massive amount of hardware parallelism!
- Program needs to be executed
- Processes and Threads are units of execution

### Threads and Processes

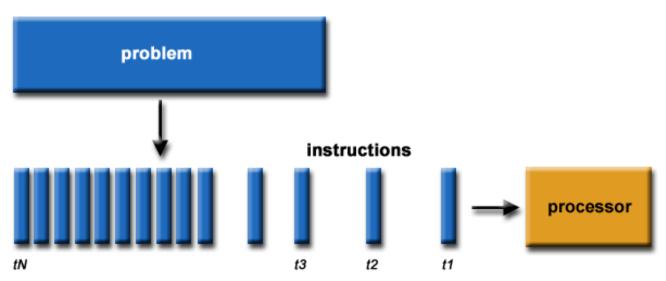
- Abstraction provided by OS
- Process
  - Self-contained i.e. has its own private resources to execute/run programs. E.g. of a resource: memory.
  - Is an instance of a running program.
  - Have an illusion that entire computer is for itself.

#### Thread

- Belongs to a process. Share memory and other resources among threads of the same process.
- Have an illusion that entire processor is for itself.
- Can be considered as a subroutine in the main program

## Clusters – How are they programmed?

- It's (all) about parallelism!
- Sequential Program single sequence of instructions single-threaded.



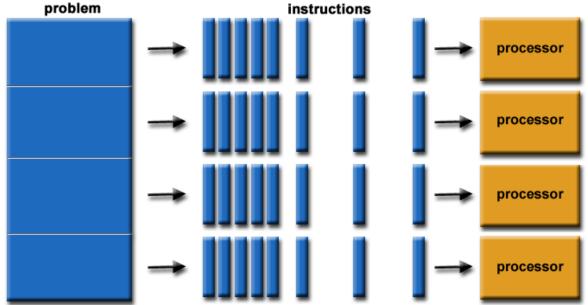
source: Blaise Barney, Introduction to Parallel Computing, https://hpc.llnl.gov/training/tutorials/introduction-parallel-computing-tutorial

# Clusters – How are they programmed?

- It's (all) about parallelism!
- Sequential Program single sequence of instructions single-threaded.
- Concurrent Program Multiple sequence of instructions
   executing concurrently. Instructions from one sequence may
   communicate and interfere with other.
  - How are they (multi-threads) executing?
    - Multiprogramming threads multiplexing their execution on one processor
    - Multiprocessing threads multiplexing their execution on multiprocessor or multicores
    - Distributed Processing processes multiplexing their executions on multiple nodes

# Clusters – How are they programmed?

- Parallel Program a concurrent program designed to execute on parallel hardware
  - Multiple processors in a computer (multiprocessing),
  - Multiple computers in a network (distributed processing)



source: Blaise Barney, Introduction to Parallel Computing, https://hpc.llnl.gov/training/tutorials/introduction-parallel-computing-tutorial

- Flynn's taxonomy categories of computing systems
  - Based on how processing elements see instruction and data

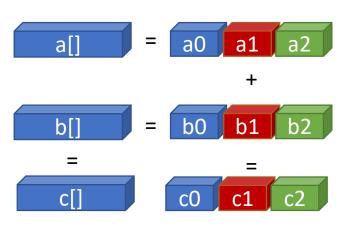
	Single Data (SD)	Multiple Data (MD)
Single Instruction (SI)	SISD	SIMD
Multiple Instruction (MI)	MISD	MIMD

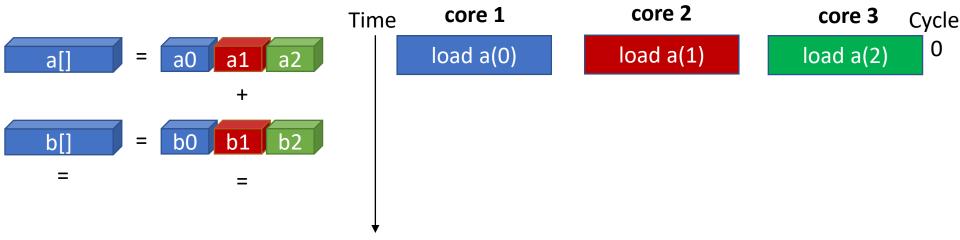
- Flynn's taxonomy categories of computing systems
  - Based on how processing elements see instruction and data

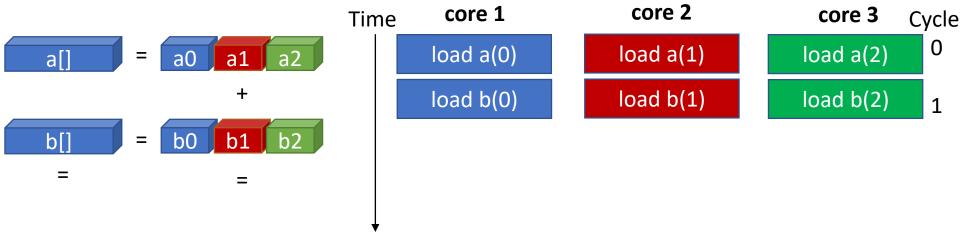
	Single Data (SD)	Multiple Data (MD)
Single Instruction (SI)	SISD	SIMD
Multiple Instruction (MI)	MISD	MIMD

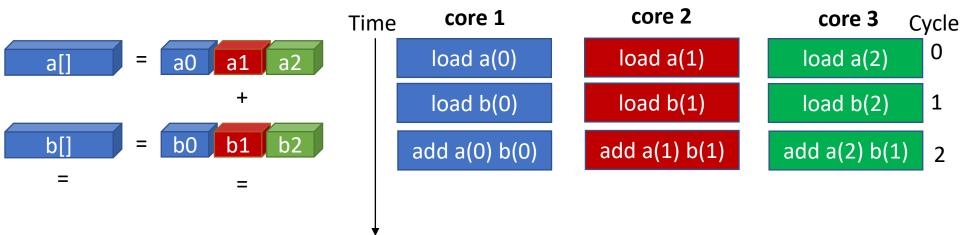
Clusters belong to this category

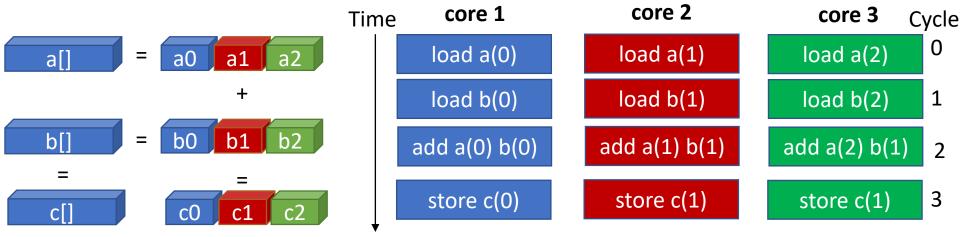
- Single stream of instructions and single stream of data
- E.g. single-core computer (without "hyperthreading")

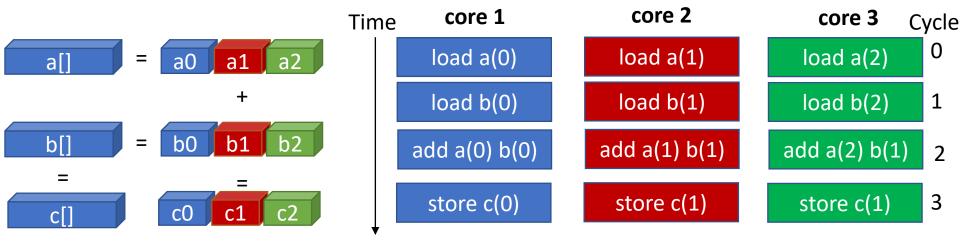












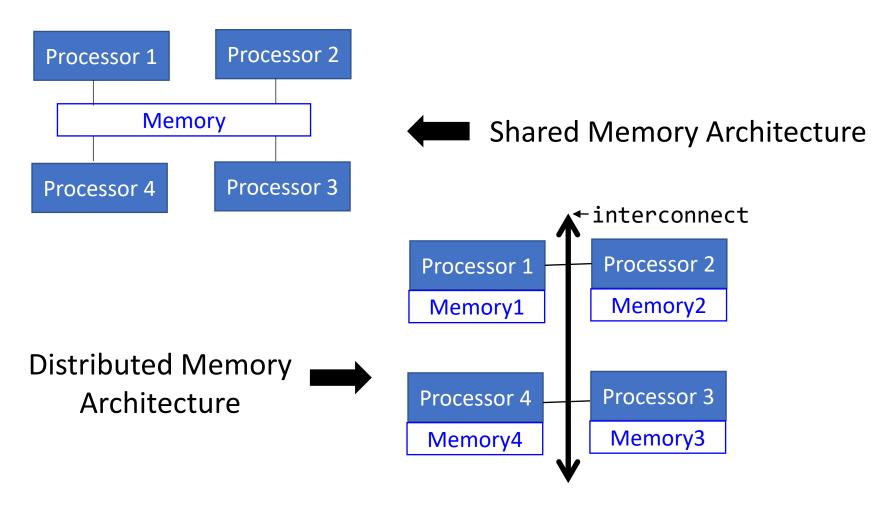
- All cores execute same instruction in a clock cycle. But operate on different data
- E.g. GPUs. Modern CPUs also have SIMD subcomponents.

- Most common type of parallel computer
- Every core may be executing a different instruction and data stream
- The cores may or may not go lock-step (synchronous or asynchronous)
- E.g. Clusters, Supercomputers, multi-core PCs.
  - MIMD computers can have SIMD subcomponents

- Categorization based on how processing elements see system memory
  - Shared Memory
  - Distributed Memory
  - Distributed-Shared Memory

- Categorization based on how processing elements see system memory
  - Shared Memory
  - Distributed Memory
  - Distributed-Shared Memory

Most clusters belong to this category



#### Data and Control Parallelism

- Threads executing the same function but with different data – data parallelism
  - E.g. two construction workers laying bricks to build walls of different parts of a house
- Threads executing different functions control parallelism.
  - E.g. A carpenter getting a window frame ready while a mason is laying bricks in the wall

## What is OpenMP

- An open standard for shared-memory programming in C/C++ and Fortran
- Supported by IBM, Intel, GNU and others
- Same program running on multiple threads each operating on different data (single program multiple data – SPMD)

## Need for Open MP

- Allows seamless scaling automatically add more processors and you will not have to rewrite the program to utilize available processors
  - (pthreads) programs are not performance portable

Open MP (multiprocessing) / OMP provides a scalable and portable alternative to data-parallel computing on *shared-memory architectures* 

```
#pragma omp parallel

{

compiler directives

#pragma omp for

for(i=0;i<N;i++)

fruits[i].Energy();

}
```

- #pragma parallel
   executes as many threads as there are processors
- #pragma omp for divides the whole work among available threads

```
#pragma omp parallel
{
    #pragma omp for
    for(i=0;i<N;i++)
        fruits[i].Energy();
}</pre>
```

- Example of loop parallelism
  - Common in scientific codes
- Programmer is still responsible for handling data races.

//code region 0

Master thread

Execution begins with a master thread

 Master thread creates / forks worker threads (threads execute code region 1)

```
//code region 0
#pragma omp parallel
{
    //code region 1
    #pragma omp for
    for(i=0;i<N;i++) {
        //code region 2
    }
}</pre>
Thread Number: 1 2 3 4 5 ... P
Workers
Workers

**Thread Number: 1 2 3 4 5 ... P
Workers

**Thread Number: 1 2 3 4 5 ... P

**Synchronization point / barrier*

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**Thread Number: 1 2 3 4 5 ... P
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**Thread Number: 1 2 3 4 5 ... P

**Thread Number: 1 2 3 4 5 ... P

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**Thread Number: 1 2 3 4 5 ...
```

- Implicit barriers hinder worker threads' free run
  - Worker threads all begin to execute code region 2 at the same time

```
//code region 0
#pragma omp parallel
{
    //code region 1
    #pragma omp for
    for(i=0;i<N;i++) {
        //code region 2
    }
    //code region 3
}</pre>
Thread Number:1 2 3 4 5 ... P
Workers
Workers
Workers

- Synchronization point / barrier
```

- Worker threads cross another implicit barrier
  - Start executing code region 3 all at the same time

```
//code region 0
                                                      Master thread
#pragma omp parallel
                                                              Workers
                              Thread Number: 1 2 3 4 5
    //code region 1
    #pragma omp for
                                                              Workers
    for(i=0;i<N;i++) {
        //code region 2
                                                              Workers
    //code region 3
                                                      Master thread
                               Synchronization point
//code region 4
                             / barrier
```

- Worker threads join master thread
  - Master thread continues executing code region 4

```
//code region 0
                                                      Master thread
#pragma omp parallel
                                                              Workers
                              Thread Number/1 2 3 4 5
    //code region 1
    #pragma omp for
                                                              Workers
    for(i=0;i<N;i++) {
        //code region 2
                                                              Workers
    //code region 3
                                                      Master thread
                               Synchronization point
//code region 4
                             / barrier
```

- Execution begins with a master thread
- 2. Master thread creates / forks worker threads
- 3. Worker threads join master thread

fork / join parallelism

- How many workers? / threads?
  - = number of processors by default. Can also be set with omp\_set\_num\_threads(P)
  - Can query the number of processors available on a machine with omp get num procs()
  - Each thread has an ID returned by omp\_get\_thread\_num()

• Example – *sum of array elements* 

$$sum = \sum_{i=0}^{i=9} a_i$$

• Example – *sum of array elements* 

sum is initialized to 0 by master

# Worker 1 Worker 2 $\sum_{i=0}^{i=4} a_i = sum1$ $\sum_{i=5}^{i=9} a_i = sum2$ $\sup = \operatorname{sum} + \operatorname{sum} 1$ $\sup = \operatorname{sum} + \operatorname{sum} 2$

correct value of sum seen by master

• Example – *sum of array elements* 

sum is initialized to 0 by master

sum is shared among workers. Only one worker should update at a time.

$$\sum_{i=0}^{a_i} \frac{a_i - sumz}{i=5}$$

$$sum = sum + sum1$$
  $sum = sum + sum2$ 

correct value of sum seen by master

• Example – *sum of array elements* 

sum1 and sum2 are initialized to 0 by master

Worker 1 Worker 2 
$$\sum_{i=0}^{i=4} a_i = sum1$$
 
$$\sum_{i=5}^{i=9} a_i = sum2$$

master computes sum = sum1+sum2

• Example – *sum of array elements* 

sum1 and sum2 are initialized to 0 by master

Joulean 1 Monteau 2

Workers don't race to update a shared variable. Can work independently. Master, in the end, does accumulating of partial sums and computing the sum.

$$\iota=0$$
  $\iota=5$ 

master computes sum = sum1+sum2

• Example – reductions (sum of array elements)

sum is initialized to 0 by master

# Worker 1 Worker 2 $\sum_{i=0}^{i=4} a_i = sum1$ $\sum_{i=5}^{i=9} a_i = sum2$ $\sup = \operatorname{sum} + \operatorname{sum} 1$ $\sup = \operatorname{sum} + \operatorname{sum} 2$

correct value of sum seen by master

Example – reductions (sum of array elements)

sum is initialized to 0 by master

Reductions rid programmer of need to 'serialize' updates to sum

correct value of sum seen by master

Example – reductions (sum of array elements)

- Other operations supported in reductions:
  - +: addition
  - \*: multiplication
  - |: bitwise OR
  - &: bitwise AND
  - ^: bitwise exclusive OR
  - ||: logical OR
  - &&: logical AND

Note the *commutative nature* of these operations

#### Programming in OpenMP - Summary

- Open MP provides a way to specify what parts of program execute in parallel with one another
- How the work is distributed across different cores
- Whether to serialize (atomic) accesses to memory

All while providing *portable performance* 

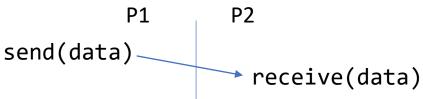
# Distributed Memory Programming

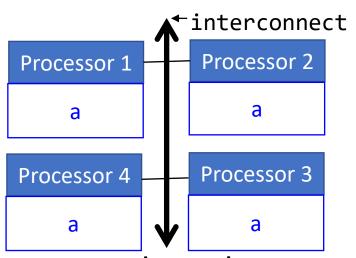
- Program executes as a collection of processes
   Distributed Processing processes multiplex their executions on multiple machines
- Each process / processor has its own memory
  - Total memory available for an MPI program is the combined memory space of all processors
  - Exchanging data requires cooperation between two processors

# Distributed Memory Programming

Data exchange requires explicit communication:

Programmer must set up communication channels and exchange data





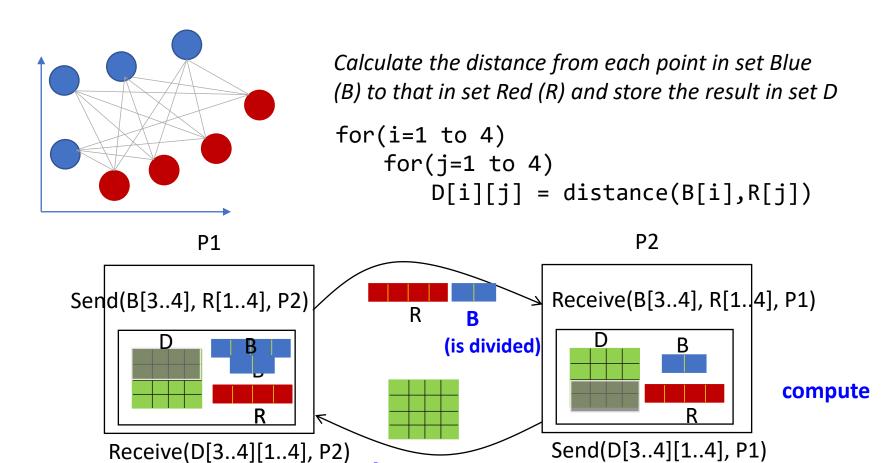
Value of a in P1 may be different from that in P2. Why?

- 1) P1 sends a copy of a to P2,
- 2) P2 receives the copy, stores it in its data region.
- Every data element must belong to one of the memory spaces Programmer must decide where to place data

# Distributed Memory Programming

- More complex than shared-memory programming model
- Most programs are written in Single Program Multiple Data (SPMD) model
- Computing power and cost scaling is better than with shared memory – e.g. rack mounted blades
- E.g. weather forecasting, simulating dynamics of gases and fluids where to put exhaust fans in a basement parking? can an ATV topple while wading through body of water?

# Distributed Memory Programming - Example



**Aggregate** 

# Distributed Memory Programming - Example

```
Processor P1
//initialize B, R, and D
Send(B[3..4], R[1..4], P2)
for(i=1 to 2)
    for(j=1 to 3)
        D[i][j] = distance(B[i], R[j])
Receive(D[3..4][1..4], P2)

Processor P2
//initialize B, R, and D
Receive(B[3..4], R[1..4], P1)

For(i=3 to 4)
    for(j=1 to 3)
        D[i][j] = distance(B[i], R[j])
Send(D[3..4][1..4], P1)
```

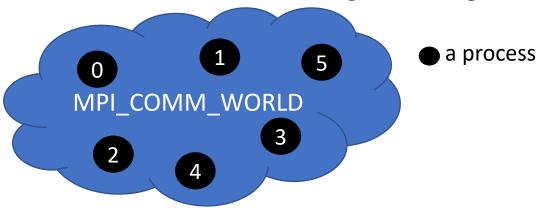
- How is work divided among processors?
- What does it mean for send and receive to complete?
- How does a receiver interpret data that a sender sends?

Initialization and Termination

```
#include<mpi.h>
int main(int argc, char* argv[]) {
    MPI_Init(&argc,&argv); //initializes MPI Environment
    //all other code here

    MPI_Finalize(); //releases system resources
}
```

- Environment
  - 0,1,...5 ranks / process numbers
  - MPI\_COMM\_WORLD communicator / group of processes that are allowed to exchange messages



MPI\_Init initializes the communicator.

 Rank and Size: obtaining process number and number of processes in the execution environment

```
#include<mpi.h>
int main(int argc, char* argv[]) {
    int rank, size;
    MPI_Init(&argc,&argv);
    MPI_Comm_size(MPI_COMM_WORLD, &size);
    MPI_Comm_rank(MPI_COMM_WORLD, &rank);
    MPI_Finalize();
}
```

Divide the work and compute

```
#include<mpi.h>
int main(int argc, char* argv[]) {
    int rank, size;
    float d[NUMPOINTS][NUMPOINTS], b[NUMPOINTS], r[NUMPOINTS];
    //initialize b and r arrays from input
    MPI_Init(&argc,&argv);
    MPI_Comm_size(MPI_COMM_WORLD, &size);
    MPI_Comm_rank(MPI_COMM_WORLD, &rank);
    for(i=rank*NUMPOINTS/size; i<(rank*NUMPOINTS/size)+NUMPOINTS/size; i++)
        for(j=0;j<NUMPOINTS;j++)
        d[i][j] = distance(b[i], r[j]);
    MPI_Finalize();
}</pre>
```

Aggregate the results at master – MPI\_Send, MPI\_Recv

```
#include<mpi.h>
int main(int argc, char* argv[]) {
    int rank, size;
    float d[NUMROWS][NUMROWS], b[NUMROWS], r[NUMROWS];
    //initialize b and r arrays from input
    MPI Init(&argc,&argv);
    MPI Comm size(MPI COMM WORLD, &size);
    MPI_Comm_rank(MPI_COMM_WORLD, &rank);
    //compute d[i][j] as before
    if(rank !=0){
     for(int i=rank*NUMPOINTS/size;i<(rank*NUMPOINTS/size + NUMPOINTS/size);i++</pre>
        MPI_Send(d[i], NUMPOINTS, MPI_FLOAT, 0, MY_MESSAGE_TAG, MPI_COMM_WORLD)
    else
     for(int i=NUMPOINTS/size;i<NUMPOINTS;i++)</pre>
        MPI_Recv(d[i], NUMPOINTS, MPI_FLOAT, MPI_ANY_SOURCE, MPI ANY TAG,
MPI_COMM_WORLD, &status);
    MPI Finalize();
```

Aggregate the results at master – MPI\_Send, MPI\_Recv

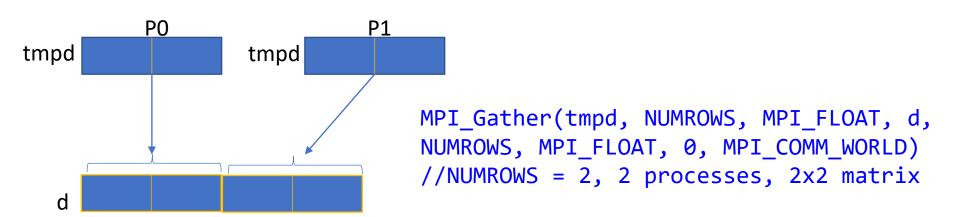
```
#include<mpi.h>
int main(int argc, char* argv[]) {
    int rank, size;
    float d[NUMROWS][NUMROWS], b[NUMROWS], r[NUMROWS];
    //initialize b and r arrays from input
                             Data type
                                             Destination
                                                          Message ID
Send bufferomm size
                                             process ID
    if(rank !=0){
     for(int i=rank*NUMPOINTS/size;i<(rank*NUMPOINTS/size + NUMPOINTS/size);i++
        MPI_Send(d[i], NUMPOINTS, MPI_FLOAT, 0, MY_MESSAGE_TAG, MPI_COMM_WORLD)
    else
     for(int i=NUMPOINTS/size;i<NUMPOINTS;i++)</pre>
        MPI_Recv(d[i], NUMPOINTS, MPI_FLOAT, MPI_ANY_SOURCE, MPI ANY TAG,
MPI_COMM_WORLD, &status);
    MPI_Finalize(); Recv buffer Recv count any Message
                                                           From any Source
                                                           Process
                                            ID
```

Aggregate the results at master (collectives) – MPI\_Gather

```
#include<mpi.h>
int main(int argc, char* argv[]) {
    int rank, size;
    float d[NUMROWS][NUMROWS], tmpd[NUMROWS], b[NUMROWS], r[NUMROWS];
Send bufficial Gount of a rarays from input
    MPI_Init(sent items rgv); of sent
    MPI_Comm_size(MPI_COMM_itemsD, &size);
    MPI_Comm_rank(MPI_COMM_WORLD, &rank);
    //compute distance into tmpd[NUMROWS];

    MPI_Gather(tmpd, NUMROWS, MPI_FLOAT, d, NUMROWS, MPI_FLOAT, 0,
MPI_COMM_WORLD)
    MPI_Finalize();
    Recv buffer Recv count
}
```

collectives – MPI\_Gather



#### MPI Programming - Collectives

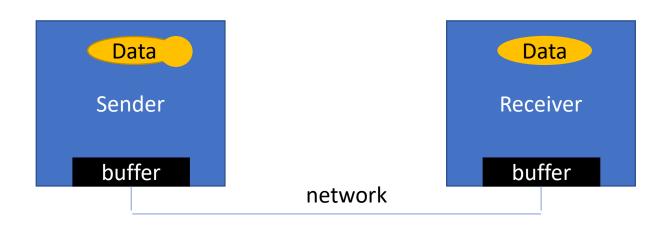
- MPI\_Barrier all processes wait at that line of code a synchronization point
- MPI\_Bcast Broadcasting data from one process
- MPI\_Scatter Distribute data from master to all processes
- MPI\_Gather Collect data from all processes at master
- MPI\_Allgather Same as gather but all processes collect results
- MPI\_Reduce Aggregate results at master (recall reduction in OMP)
- MPI\_Allreduce Aggregate results at all processes refer <a href="https://computing.llnl.gov/tutorials/mpi/">https://computing.llnl.gov/tutorials/mpi/</a> for API details

# MPI Programming – Point-to-Point

- In most MPI programs, communication is between a pair of processors.
  - Think other types of communication: Broadcast (one-to-all), Reduce(All-to-one), Scatter (one-to-several),
     Gather(several to one), All-to-All
- When is send/receive complete?
  - Synchronous / Asynchronous
  - Blocking / non-blocking
  - Buffered

#### MPI Programming – Point-to-Point

- Synchronous vs. Asynchronous
  - Synchronous: sender notified when message is received
  - Asynchronous: sender only knows that the message is sent



# MPI Programming – Point-to-Point

- Blocking vs. Non-blocking
  - Blocking:
    - Sender waits until message is transmitted buffer is empty
    - Receiver waits until message is received buffer is full
  - Non-blocking
    - sender continues execution immediately after calling send