# Introduction to High Performance Computing (HPC)

QLS 612 - 2022 Brent McPherson, PhD







#### The goals of this lecture are to:

- Describe the structure of HPCs and how they differ from other traditional computers and common approaches.
  - Laptops / Desktops
- Introduce the concepts of using High Performance Computing (HPCs).
- How to begin effectively using HPC clusters in your work.

This will reference concepts covered in the "Introduction to the Terminal and Bash" and "Containerization" lectures.

#### Modern NeuroData Science Requires Computers

- No part of our research can progress without access to useful computing resources.
  - Data is acquired and stored on computers.
  - Data preparation and curation is performed on computers.
  - Analysis and modeling require computers.
  - Visualization and reporting or results require computers.
  - The distribution and reporting of results require computers.
- If at any point our work cannot continue in a digital space, it has effectively ended.
- In order to maximize our ability to perform innovative work in a field dependent on modern computational advances, a useful understanding of these machines is necessary.













#### Big Computer on Campus: Universities Graduate to Al Super Systems

Colleges across the U.S. and Europe are embracing high-performance systems to accelerate machine learning across all fields of research and education.

August 17, 2021 by CHERYL MARTIN





## The Concepts of High Performance Computing (HPC)

#### Working on a personal computer (PC)

- Everyone is familiar with this.
  - You're using one now.
- These machines are designed to facilitate the most common needs of the most people.
- However, the limits of these machines can be easily reached when performing modern neuroscience analysis.





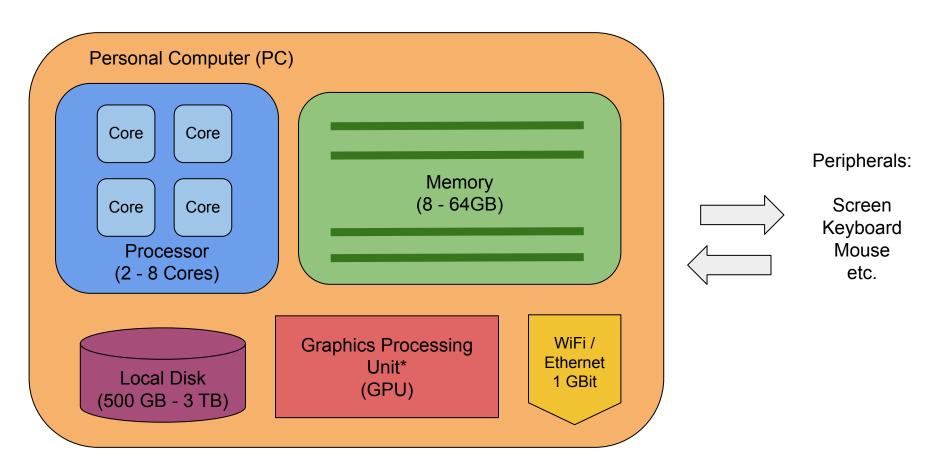
#### Working on an HPC

- These are not "personal" systems, they are multi-user.
- You do not interact with them directly, but over a network connection.
- The interaction with your analysis entails:
  - Transferring data / results.
  - Managing your analysis "jobs".
- There is minimal "interactive" computing performed on a HPC.
  - Typically little to no visualization is performed on HPC systems.
- They almost exclusively run Linux.

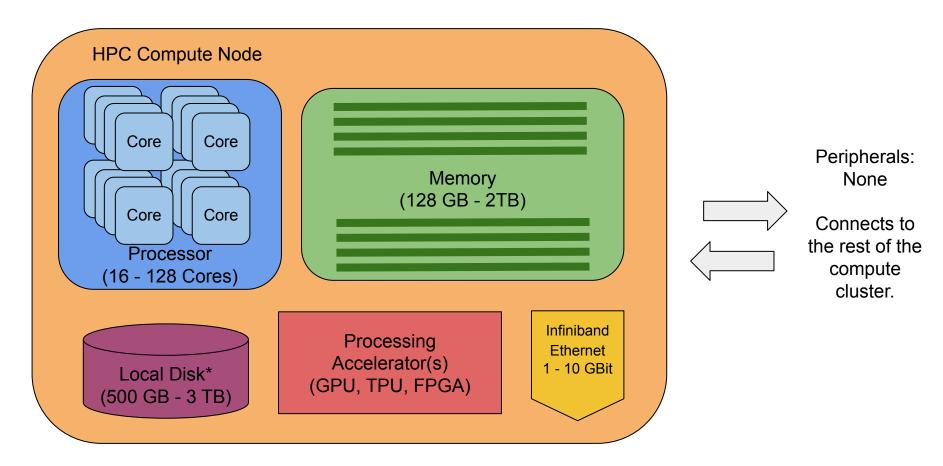




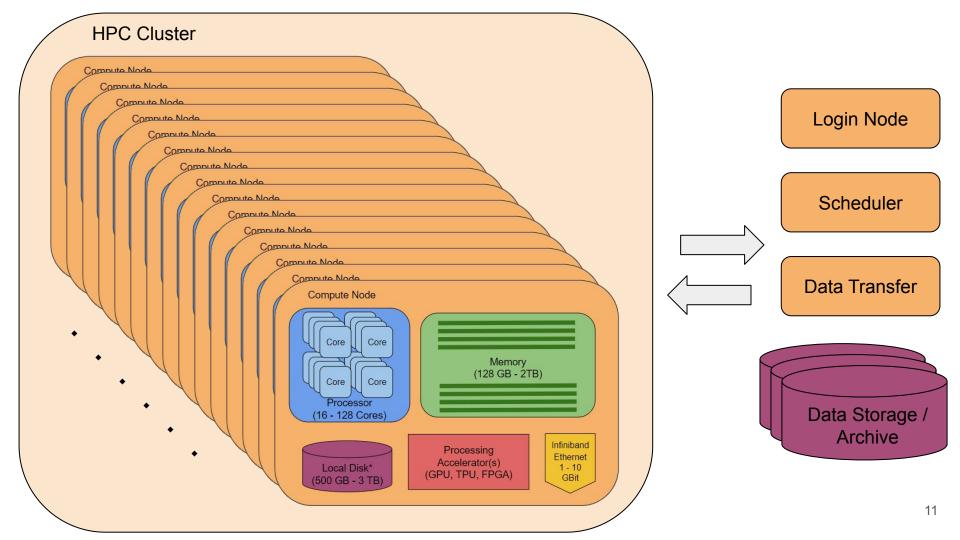
## The Schematic of a Computer



<sup>\*</sup> not necessarily present in all systems (laptops)



<sup>\*</sup> it may be less and / or have higher access speed



#### Other important things to keep in mind

- For a single, small process, an HPC may be slower than your laptop
  - The clock speed of processors is often slower when more cores are present.
  - There is also the overhead of moving / staging data, waiting for walltime, etc.
- Some HPCs have a different system architecture
  - Most PCs are 64-bit (x86) system architectures.
    - ARM is also common for some laptops (Apple M1)
  - Some HPCs do not have an x86 architecture
    - Big Red II (Cray), Longhorn (PPCx64)
  - This may cause challenges for deploying your code.

#### The Anatomy of a Computer

#### **PCs**

- 1 CPU
  - 2 8 cores
  - o 3.5 4.5 GHz
- 8 64 GB RAM
- 500 GB 3 TB Storage
- 1 GPU
  - This may be built into the CPU
- WiFi / 1 GBit Ethernet
- x86 (maybe ARM) architecture
- Single-User System
- Good for most general usage
  - This is likely where you will develop your analysis.

#### **HPCs**

- Multiple CPUs
  - 16 128 cores per CPU
  - o 2.4 3.5 GHz
- 128 GB 2 TB RAM
- 500 GB 3 TB Storage
  - Not for long term storage
- 0 4 Processor Accelerators
  - GPUs w/ double precision CUDA
  - o TPUs, FPGAs, Coprocessors, etc.
- 1 10 GBit Ethernet, Infiniband
- Different architectures (x86, PPC, Cray)
- Multi-User System
- Good for high throughput / large models.

#### Working on the Cloud - An expensive middle ground

- This is most often an option through dedicated research proposals.
- The cloud system can be tailored to fit your specific analysis and data requirements.
  - A large virtual analysis computer
  - Your own dedicated cluster
- The data may be distributed on the cloud already.
  - Many open datasets are already on AWS.
- This will be very expensive for long term use.





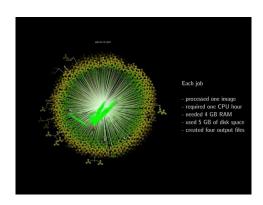


#### The advantages of a HPC over a PC

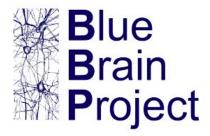
- The ability to handle large datasets in a more time efficient manner.
- The option to "Scale Out" or "Scale Up" an analysis.
  - Scale Out: the ability to analyze independent parts of a dataset simultaneously
    - Independent permutations / cross-validations / simulations.
    - Different subjects through the same preprocessing preparations.
      - "Embarrassingly Parallel"
      - High Throughput Computing
  - Scale Up: create a larger single instance of computing resources to run a larger model, estimation, or analysis.
- We'll be introducing you to "Scaling Out" your analysis in the example today.

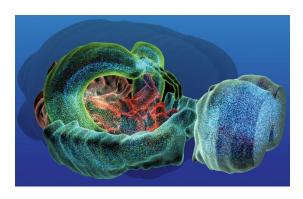
### **Scaling Out**

## biobank



### Scaling Up

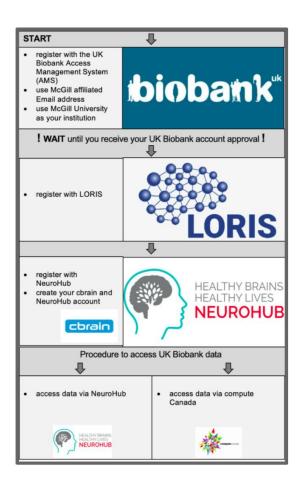




#### **UKBB Data Access**

#### Multi-step process!

- 1. Register with UKBB AMS
- Register with LORIS
  - a. Project and data management platform
- Get a NeuroHub account
  - a. Data and compute management platform
- Get a Compute Canada account
  - a. High performance compute cluster



Thanks Nikhil! 17

## Beginning to use a Cluster Computer

#### Accessing the Cluster

- This is done exclusively through a remote connection.
  - ssh, a remote desktop client, etc.
- You will connect to the Login Node of the cluster.
  - The login in node manages the coordination of user processes on the cluster
  - It also reports the overall status of the system.
- You will submit your jobs and query their status from the Login Node.
  - DO NOT run analyses or do other work on the Login Node.

```
bcmcpher@shodan:~$ ssh bcmcpher@beluga.computecanada.ca
bcmcpher@beluga.computecanada.ca's password:
Last login: Wed Jul 13 05:24:02 2022 from bras-base-10.115.63.223-grc-01-174-88-45-196.dsl.bell.ca
Bienvenue sur Béluga / Welcome to Béluga
                              Aide/Support:
                                              support@tech.alliancecan.ca
                              Globus endpoint: computecanada#beluga-dtn
                              Documentation:
                                              docs.alliancecan.ca
2022-05-31 - Béluga pleinement opérationnel / Béluga fully operational
FR: Le déménagement est maintenant terminé et les services sont de retour.
EN: The relocation is now complete and services are available again.
[bcmcpher@beluga1 ~]$
```

#### Getting your data on the cluster

- I assume your data is on a computer not accessible by the cluster.
- You will use a file transfer tool to move your data from where it is to the data server.
  - o scp, sftp, rsync, FileZilla, mobaXterm, etc.
  - This data server will be accessible to the compute nodes
- This may be done through the Login Node, but there may be a specific Data Transfer Node to move data.
  - Check with the system administrators.



#### Getting your data on the cluster - Things to Remember

- Be aware of the policies of this server!
  - Files are often automatically removed after a (potentially short) window of inactivity.
  - Your analysis code, jobs, and data are probably not backed up on the HPC.
- It is your responsibility to make sure your data and code are securely backed up somewhere else.
- Once your analysis is complete you need to have a plan for storing your data long term.
  - OSF
  - OpenNeuro

#### Getting your software on the cluster

- The cluster administrators will likely need to install it for you.
  - If you are confident you know how the tools works, you may be able to set it up yourself.
- Many tools will be readily available on the cluster through modules.
  - These are an efficient way to add and remove tools installed on the cluster to your session.
  - They are like an interactive venv for any tool.
  - They also allow for easier management of different versions of the same tool.
  - Hopefully, most of the tools you need will already be installed.
- Running your code in containers guarantees you have the tools you need to run your analysis.
  - You do have to a have (or be able to build) a working container of the tool.

#### Getting your software on the cluster - Modules

- How most software is made available to users on a HPC.
- A convenient way to set up basic development environments and change between versions.



- > module load python
- > module load python/3.10.2
- > module unload python
- > module swap python/3.9.6

```
[bcmcpher@beluga4 ~]$ module avail
                 httpproxy/1.0
 etsf io-mpi/1.0.4
                                                                                                                                repasthpc/2.3.0
  abinit/9.2.2
                  (chem)
                                                           mscq/1.7.3.1
                                                                                    (chem)
                                                                                               parsplice/1.1
                                                                                                                                                        (bio,D)
                                                          mumps-metis/5.2.1
  abinit/9.6.2
                  (chem, D)
                             fds/6.7.5
                                                                                               petsc/3.12.4
                                                                                                                                rosetta/3.10
                                                                                                                                                        (chem)
  adol-c/2.7.2
                             fds/6.7.6
                                                           mumps-parmetis/5.3.5
                                                                                               petsc/3.13.6
                                                                                                                                rosetta/3.12
                                                                                                                                                        (chem)
                                                                                               petsc/3.14.1
  apbs/1.3
                  (chem)
                             fds/6.7.7
                                                           ncl/6.6.2
                                                                                    (vis)
                                                                                                                                rosetta/2019.21.60746
                                                                                                                                                        (chem.D)
                             fds/6.7.8
                                                           ncview/2.1.8
                                                                                               petsc/3.15.0
                                                                                                                                scalapack/2.1.0
  berkeleygw/2.1.0 (phys)
                                                                                                                     (t.D)
                                                                                                                                                        (math)
  berkeleygw/3.0.1 (phys,D)
                             fftw-mpi/3.3.8
                                                (math)
                                                           nektar++/5.0.1
                                                                                    (math)
                                                                                               pfft/1.0.8-alpha
                                                                                                                     (math)
                                                                                                                                scotch/6.0.9
                                                                                                                                                        (math)
                                                                                                                                shengbte/1.1.1
  bigdft/1.8.3
                  (chem)
                             ga/5.7.2
                                                           netcdf-c++-mpi/4.2
                                                                                    (io)
                                                                                               phylobayes-mpi/20180420 (bio)
                                                                                                                                                        (phys)
  boost-mpi/1.72.0 (t)
                             globalarrays/5.7.2
                                                           netcdf-c++4-mpi/4.3.1
                                                                                    (io)
                                                                                               phylobayes-mpi/20201026 (bio,D)
                                                                                                                                siesta/4.0.1
                                                                                                                                                        (chem)
                                                          netcdf-fortran-mpi/4.5.2
                                                                                               plumed/2.6.1
                                                                                                                                siesta/4.1-b4
  cdo/1.9.8
                  (geo)
                             globalarrays/5.8
                                                                                    (io)
                                                                                                                      (chem)
                                                                                                                                                        (chem)
  cdo/2.0.4
                  (geo)
                             alost/0.3.1
                                                           netcdf-mpi/4.7.4
                                                                                    (io)
                                                                                               plumed/2.6.2
                                                                                                                      (chem)
                                                                                                                                siesta/4.1-MaX-3.0
                                                                                                                                                        (chem)
                                                                                               plumed/2.7.0
  cdo/2.0.5
                  (geo, D)
                             hdf5-mpi/1.10.6
                                                (io)
                                                           neuron/7.8.2
                                                                                    (bio)
                                                                                                                     (chem)
                                                                                                                                siesta/4.1.5
                                                                                                                                                        (chem, D)
                                                                                               plumed/2.7.1
  cfour-mpi/2.1
                  (chem)
                             hdf5-mpi/1.12.1
                                                (io, D)
                                                           neuron/8.0.0
                                                                                    (bio,D)
                                                                                                                      (chem)
                                                                                                                                slepc/3.14.2
  cgns/3.4.1
                  (phys)
                             hpl/2.3
                                                           nwchem/6.8.1
                                                                                    (chem)
                                                                                               plumed/2.7.3
                                                                                                                      (chem, D)
                                                                                                                                sundials/2.7.0
                                                                                                                                sundials/5.3.0
  cgns/4.1.0
                  (phys)
                             hypre/2.20.0
                                                (math)
                                                           nwchem/7.0.2-p1
                                                                                    (chem, D)
                                                                                               pnetcdf/1.9.0
                                                                                                                      (io)
  cgns/4.1.2
                  (phys, D)
                             ima3/20210120
                                                           octopus/10.1
                                                                                    (chem)
                                                                                               pnetcdf/1.10.0
                                                                                                                      (io)
                                                                                                                                wannier90-abinit/2.0.1.1 (chem)
  combblas/1.6.2
                             lammps-omp/20201029 (chem)
                                                           openfoam-extend/4.1
                                                                                    (phys)
                                                                                               pnetcdf/1.12.2
                                                                                                                      (io, D)
                                                                                                                                wannier90/3.1.0
                                                                                                                                                        (chem)
  cp2k/7.1
                  (chem)
                             lammps-omp/20210929 (chem,D)
                                                           openfoam/6
                                                                                    (phys)
                                                                                               psi4/1.3.2
                                                                                                                      (chem)
                                                                                                                                wps/4.1
                                                                                                                                                        (geo)
  cp2k/8.2
                  (chem)
                             latte/1.2.1
                                                (chem)
                                                           openmolcas/20.10
                                                                                    (chem)
                                                                                               psi4/1.4
                                                                                                                      (chem, D)
                                                                                                                                wps/4.2
                                                                                                                                                        (geo, D)
  cp2k/9.1
                  (chem, D)
                             libcf/1.0.3
                                                           openmx/3.9
                                                                                               quantumespresso/6.5
                                                                                                                      (chem)
                                                                                                                                wrf/4.1.3
                                                                                                                                                        (geo)
  cpmd/4.3
                  (chem)
                             libgridxc-mpi/0.8.0
                                                           openmx/3.9.9
                                                                                               quantumespresso/6.6
                                                                                                                      (chem)
                                                                                                                                wrf/4.2.1
                                                                                                                                                        (geo)
  cslib/20180813
                             met/9.1.1
                                                (phys)
                                                           osu-micro-benchmarks/5.6.2 (t)
                                                                                               quantumespresso/6.7
                                                                                                                      (chem)
                                                                                                                                wrf/4.3.3
                                                                                                                                                        (geo, D)
  dakota/6.13
                             mpas/7.0
                                                           p4est/2.2
                                                                                    (math)
                                                                                               quantumespresso/6.8
                                                                                                                      (chem)
                                                                                                                                vambo/5.0.4
  delft3d/62441
                  (chem)
                             mpi4py/3.0.3
                                                           parallelio/2.5.4
                                                                                               quantumespresso/7.0
                                                                                                                      (chem, D)
                                                                                                                                vaxt/0.9.0
  dl polv4/4.10.0
                  (chem)
                             mpi4py/3.1.2
                                                           paraview-offscreen/5.8.0
                                                                                               raxml/8.2.12
                                                                                                                      (bio)
  elpa/2020.05.001 (math)
                             mpi4pv/3.1.3
                                                (t.D)
                                                           parmetis/4.0.3
                                                                                    (math)
                                                                                               ray/3.0.1
                                                                                                                      (bio)
  esmf/8.0.1
                  (geo)
                             mrbayes/3.2.7
                                                (bio)
                                                           parmgridgen/1.0
                                                                                    (math)
                                                                                               repasthpc/2.2.0
                                                                                                                      (bio)
```

#### Running your analysis - Working with a Scheduler

- With your data and env ready you can run your analysis.
- You will do this by submitting your work as a Job.
- **Jobs** are submitted to the Scheduler to be run.
  - This deploys the analysis onto the compute nodes.
- Your entire analysis will need to be scripted.
  - You cannot interact with or manually input information to a job when it's running.
- Once your analysis script is complete, you create your job script for the analysis.
  - This script describes the resources needed to successfully run your analysis on the cluster.



#### Running your analysis - Creating Job Scripts

- Your job scripts define the system resources required by your analysis.
- The job script will be submitted to the scheduler from the login node to be added to the queue.
  - The scheduler uses your resource requests and your priority to determine what runs when.
- Your outputs, along with logs, will be created for each job you submit.
- The example today will assume you are Scaling Out your analysis.
  - You want to run a common process across many subjects.
  - i.e. fMRIPrep, FreeSurfer, etc.

#### demo subj01.slurm

```
#!/bin/bash
#SBATCH --job-name=demo subj01
                               # job name
#SBATCH --nodes=1
                                          # run on a single node
#SBATCH --ntasks=1
                                          # run on a single CPU
                                          # run on a single core
#SBATCH --cpus-per-task=1
#SBATCH --mem=1gb
                                          # job memory request
#SBATCH --time=00:01:00
                                          # time limit hrs:min:sec
#SBATCH --error=./logs/demo subj01 %j.err # standard error from job
#SBATCH --output=./logs/demo subj01 %j.out # standard output from job
## your job script generalized to a subject ID input
bash ./analysis.sh subj01
```

#### Commands for working with Jobs

- sbatch
  - Submit a job to the scheduler.
  - > > sbatch job.slurm
- squeue
  - Monitor the status of jobs on the cluster.
  - > squeue -u USERNAME
- scancel
  - Cancels a job that hasn't completed.
  - o > scanel JOBID
- sacct
  - Provides a summary of the jobs your have recently submitted.
  - o > sacct
- srun
  - Start an interactive job to test that your job will work correctly.
  - o > srun --nodes=1 --ntasks-per-node=1 --time=01:00:00 --pty bash -i



There are a lot of resources available for learning about HPCs online and in your lab. Find a process that works for you and ASK how others have solved similar problems!

#### Running your analyses - be efficient

- For every job you run, you will have:
  - The input data the same files for each subject
  - The analysis script the same analysis for each subject
  - The job script and logs a separate job for every subject with logs for each attempt
  - The results whatever output your analysis produces that you intend to keep
- Just like your analyses, you should script as much of your cluster work as possible.
  - You should never be individually making or modifying job files for subjects.
  - Having scripts for moving and backing up data is a good idea, too.

#### The Example

- The example today reports back a short log about the system status of the node before waiting.
  - This will let you see the different nodes your jobs ran on.
- The analysis input wants a subject ID as an input
  - This is is likely how you would set up a symmetric analysis across your subjects.
- The goal is to provide a basic working template for your job scripts that you can modify.

```
#!/bin/bash
## create the jobs, logs, and output folders.
mkdir iobs
mkdir jobs/logs
mkdir results
## for every subject, create a job file
for subj in subj01 subj02 subj03 subj04 subj05; do
   cat << EOF > ./jobs/demo ${subj}.slurm
#!/bin/bash
#SBATCH -- job-name=demo ${subj}
                                                 # job name
#SBATCH --nodes=1
                                                # run on a single node
#SBATCH --ntasks=1
                                                # run on a single CPU
#SBATCH --cpus-per-task=1
                                                # run on a single core
#SBATCH --mem=1qb
                                                # job memory request
#SBATCH --time=00:05:00
                                                # time limit hrs:min:sec
#SBATCH --error=./jobs/logs/demo ${subj} %j.err # standard error from job
#SBATCH --output=./jobs/logs/demo ${subj} %j.out # standard output from job
## MODIFY THE RESOURCE REQUSTS ABOVE FOR YOUR JOB
## MODIFY THE CODE BELOW TO CALL YOUR ANALYSIS
## your job script generalized to a subject ID
bash ./analysis.sh ${subj}
EOF
done
```

- 1. Connect to the HPC.
- 2. Move the example scripts to the HPC.
  - 3. Make and submit your jobs.
    - 4. Monitor the job status.
      - 5. Cancel a job.
    - 6. Run an interactive job.
- 7. Modify your resource requests / Explore documentation.
  - 8. Run the script in a container.

#### Commands

```
> ssh USERNAME@beluga.computecanada.ca
> scp /path/to/Lecture11/demo/*.sh USERNAME@beluga.computecanada.ca:~/demo
> cd ~/demo; ./mk_jobs
> find jobs -type f -name "*.slurm" | xargs -n 1 sbatch
> squeue -u USERNAME; watch squeue -u USERNAME
> sacct
> scancel JOBID
```

## **Thanks**