High Performance, Advanced, and Cloud Research Computing Facilities and Services Available to Windsor Researchers

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• Land Acknowledgement

- SHARCNET, Compute Ontario, and the Alliance
- Resource Overview
- Access, Accounts, and Resources
- Cluster Computing Environment
- Compute Jobs
- 2025 Resource Allocation Competition (RAC)
- Questions, Answers, and Discussion

I am located at the University of Windsor.

The Univesity of Windsor sits on the traditional territory of the **Three Fires Confederacy of First Nations**, which includes the **Ojibwa**, the **Odawa**, and the **Potawatomi**. We respect the longstanding relationships with First Nations people in this 100-mile Windsor-Essex peninsula region and the straits –les detroits– of Detroit.



https://www.uwindsor.ca/indigenous-peoples/

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SHARCNET:

- Shared Hierarchical Academic Research Computing Network.
- provides free access to high performance, advanced, and cloud computing and corresponding **compute**, **cloud**, **and storage** resources and services to researchers
- weekly new user seminars, biweekly webinars, summer school courses, and other training activities

- Started in 2001.
- Founding members:
 - Fanshawe College, University of Guelph, McMaster University, Sheridan College, Western University, Wilfred Laurier University, University of Windsor
- Today's members include:
 - ... Brock, Conestoga, Durham, Lakehead, Laurentian, Nipissing, Ontario College of Art and Design University, Ontario Tech University, Perimeter Institute, Trent, Waterloo, York
- Part of Compute Ontario which is part of the Digital Research Alliance of Canada.
- URL: https://www.sharcnet.ca



Compute Ontario, https://computeontario.ca:

- Plays a key role in coordinating Ontario's advanced research computing and big data focus
- Has these four partners:
 - SHARCNET
 - SciNet
 - Centre for Advanced Computing
 - HPC4Health



Alliance, https://www.alliancecan.ca, regional partners:

- ACENET (New Brunswick, Nova Scotia, P.E.I., Newfoundland and Labrador)
- Calcul Québec (Québec)
- Compute Ontario (Ontario)
- Prairies DRI (Alberta, Saskatchewan, Manitoba)
- BC DRI (British Columbia)

Our resources and services are relevant when:

• computing, cloud, and storage resources are **needed** that **exceed what one has available** at his/her school

Who uses our resources and services across Canada?

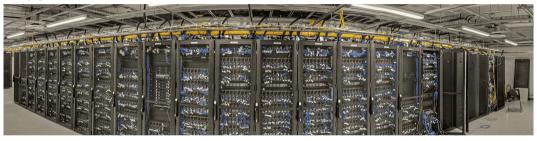
- your **peers** at other universities and colleges
- graduate students and postdocs
- faculty and other researchers

A supercomputer is:

- a networking of many computers in a single location that
- are able to function as a single computer or as many individual/groupings of computers
- high-bandwidth / low-latency interconnects
- lots of **CPU cores** (in each individual system)
- lots of RAM (in each individual system), and,
- lots of disk space

SHARCNET, Compute Ontario, and the Alliance What a Server Room Looks Like

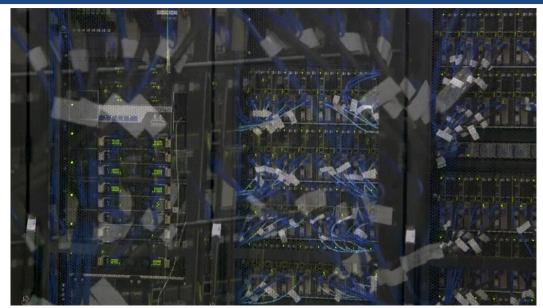
Early picture of Graham server room (at UWaterloo) under construction:



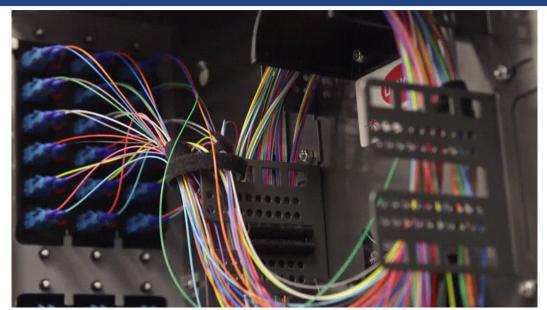
Virtual Online Tour: https://my.matterport.com/show/?m=iRFT4h6dUA3



SHARCNET, Compute Ontario, and the Alliance (Video Slide A)



SHARCNET, Compute Ontario, and the Alliance (Video Slide B)



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Currently, the compute clusters across the country are:

Cluster	Location
beluga.alliancecan.ca	École de technologie supérieure, Québec
cedar.alliancecan.ca	Simon Fraser University, British Columbia
graham.alliancecan.ca	University of Waterloo, Ontario
narval.alliancecan.ca	École de technologie supérieure, Québec
niagara.alliancecan.ca	University of Toronto, Ontario

• The niagara cluster was designed for running "large parallel" CPU jobs.

Currently cluster hardware are (approximately and in aggregate):

Resource	Béluga	Cedar	Graham	Narval	Niagara	Total
Nodes	974	2,272	1,341	1,340	2,024	7,951
RAM	196 TB	489 TB	206 TB	443 TB	409 TB	1,743 PB
CPU cores	38,960	93,712	45,340	83,216	80,960	342,188
GPUs	688	1,352	594	636	n/a	3,270
Storage	25 PB	23 PB	16 PB	19 PB	3.5 PB	86.5 PB

- Amounts may not reflect the actual amount currently in service.
- Storage is online project space only.

By July 2025 the cluster hardware will be:

Resource	Fir (BC)	Graham2 (ON)	Niagara2 (ON)	Rorqual (QC)	Total
CPU cores	165,120	134,400	235,008	131,712	666,240
GPUs	640	280	240	324	1,484
Storage	49 PB	25 PB	29 PB	TBD	

- New hardware will be faster CPUs, GPUs, etc.
- GPUs will be H100s.
- Storage is approximate and for major storage only.
- Graham2 and Niagara2 don't have new names yet.

Currently clouds across the country are:

- arbutus.cloud.alliancecan.ca
- beluga.cloud.alliancecan.ca
- **cedar**.cloud.alliancecan.ca
- graham.cloud.alliancecan.ca

NOTE: There is no default ability to access and/or create a cloud as such requires first submitting a ticket and working with cloud admins to set things up.

Currently available storage (as seen on compute clusters):

Space	Quota	Max Quota	Backed Up	Description
/home	50 GB		Yes	personal data
/project	1 TB	40 TB	Yes	long-term group data
/scratch	20 TB	200 TB	No	files deleted after 60d
nearline				tapes (offline storage)

- Max Quota is the maximum amount of quota that can be *requested*, e.g., without applying for a RAC.
- /project quotas are a group quota -not individual quotas.

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• Cost:

- Access is free to researcher faculty at Canadian academic research institutions.
- We are funded directly and indirectly through various federal and provincial grants.
- Limited to research, e.g., undergraduate course work is not permitted.
- Faculty members (PIs) sponsor some number of users.
- Jobs/activities are associated with a sponsor PI who supervises that research.
- Users can have more than one **sponsor PI**.
- All accounts must be renewed every year to remain active.

New accounts are *not* made later, to **re-activate an inactive account log in to the CCDB web site** and apply for a new role at https://ccdb.alliancecan.ca/



To obtain access, apply for an account by following these instructions:

- go to https://docs.alliancecan.ca
- click on Getting an Account in the left-hand side menu

which will take you to https://alliancecan.ca/en/services/advanced-research-computing/ account-management/apply-account.



If you are a student or doing work under a PI:

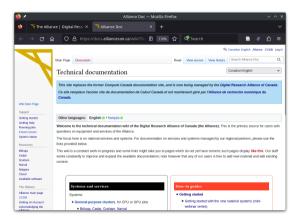
- It is very important that your supervisor/PI **first** acquires/activates their account **before** you can apply for your own account.
- You will **need to know** your supervisor's/PI's **CCRI** number before you can apply for your own account.

Multi-factor Authentication

In order to log in to most resources, you **must** have multifactor authentication configured in your **CCDB** account.

For more information see: https://docs.alliancecan.ca/wiki/Multifactor_authentication





A wiki with a lot of useful technical documentation at https://docs.alliancecan.ca



(preney) graham — Konsole New Tab D Split View Rente O stad Passcode or option (1-1): 1 Success. Logging you in... Last login: Fri Sep 8 00:06:54 2023 from 70.25.8.171 Welcome to The Digital Research Alliance of Canada/SHARCNET cluster Graham. Documentation: https://docs.alliancecan.ca/wiki/Graham Current issues: https://status.alliancecan.ca/ Support: support@tech.alliancecan.ca Graham has several types of GPUs, some of which are available with less wait: 320 p100 2/pode, 1268, original 70 v100 8/node, 16GB, newer, about 50% faster than P100 and with tensor cores 144 t4 4/node, 166B, newer, about half a V188, for compute & AI except much slower FP64 More details: https://docs.alliancecan.ca/wiki/Graham#GPUs on Graham [prenevØgra-login2 ∼]\$

🖙 (preney) graham

Compute cluster login node access via secure shell (SSH).

See documentation at https: //docs.alliancecan.ca/wiki/SSH

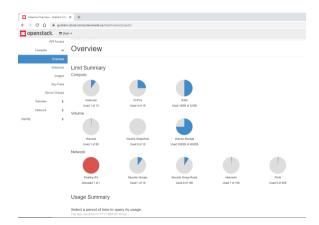




3D-accelerated (Graham cluster only) graphical "gra-vdi" login nodes using TigerVNC.

See documentation at https: //docs.alliancecan.ca/wiki/VNC

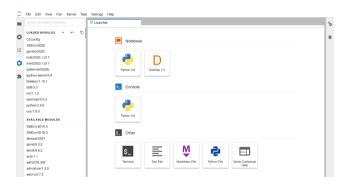




Cloud node management access portals using OpenStack.

See documentation at https://docs.alliancecan.ca/wiki/ Cloud_Quick_Start





JupyterHub web compute cluster portals.

See documentation at https://docs.alliancecan.ca/wiki/ JupyterHub



Resources (con't)



JupyterHub web portals also support graphical desktops.

Use gra-vdi if interactive 3D hardware acceleration is needed.

Resources (con't)

Online training materials and courses at https://training.sharcnet.ca





YouTube channel videos at https://youtube.sharcnet.ca



Compute Ontario

Compute Ontario Summer School

courses at

https://training.computeontario.ca





Compute Ontario weekly webinar videos at https://www.computeontario.ca/

training-colloquia



Support through tickets.

To open a ticket send an email to: support@tech.alliancecan.ca



Support from expert staff via:

- ticketing system
- video conferencing
- direct email (ticketing system is preferred)
- in-person (if at same institution)
- telephone (if needed)

Resources (con't)

S H A R C N E T*

SHARCNET weekly new user / refresher webinar:

• Tuesdays 2pm to 3pm: https://training.sharcnet.ca/ courses/course/view.php?id=34





Researcher Usage Dashboards:

https://dash.alliancecan.ca



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Cluster Computing Environment

- OS: 64-bit Linux
- Supported programming languages include:
 - C, C++, Fortran, Java, Julia, MATLAB, Octave, Python, R, etc.
- A large variety of open source (and some commercial) software packages.
- Parallel development, e.g.,
 - C: multithreading since 2011 standard
 - C++: multithreading since 2011 standard
 - Fortran: since 2003 standard
 - Julia: shared and distributed memory
 - MPI, Chapel: shared and distributed memory systems
 - OpenMP, pthreads: shared memory (single node)
 - CUDA, OpenACC, OpenCL: GPUs
- Data science support:
 - DASK, Julia, Jupyter, Python, R, etc.

- Container technology: Apptainer (Docker cannot be used.)
- Compiler toolchains:
 - GNU Compiler Collection (GCC)
 - Clang/LLVM
 - Intel OneAPI (and legacy)
 - NVIDIA nvhpc

+ one can install additional softwares in one's own account.

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On your own computer:

- You typically run programs/jobs **on-demand** since you are the **only** user.
- Programs/jobs typically have access to all resources (CPUs, GPUs, disk space, etc.).

On clusters:

- There are many users able to submit jobs to run at any time.
 - Unlike your personal computer where there is one user.
- Each submitted job needs to provide:
 - how much RAM (at most) the job requires,
 - how many **CPUs** are required,
 - if needed, how many GPUs are required,
 - how much time (at most) the job will run for, and,
 - which PI **account** the job is to be run under.
- The scheduler then determines **when** the submitted job can be run **with its requirements** in a **fair manner**.
- Jobs run **non-interactively** with no access to a keyboard, mouse, screen, etc.
- Job input and output needs to be from/to files.

- Generally each cluster has a login node and a set of compute nodes.
- Program development, debugging, and testing can be done:
 - within an interactive scheduler (Slurm) job,
 - on login node *if and only if* such does not significantly use resources (time, RAM, or CPUs), or,
 - using your own computer.
- Jobs are typically submitted from a login node.
- Login node access is via SSH.

All jobs are submitted to a queue to run:

- Your research team ideally wants to always have jobs **in the queue** waiting to be run to maximize throughput.
- Every individual and every **team** has fair-share priority.

Available software on our clusters:

• https://docs.alliancecan.ca/wiki/Available_software

Upon request, we work with researchers to help install and use software on our systems.



- You do not have sufficient CPU/GPU cores.
- You do not have sufficient memory (RAM or storage).
- You need a lot of disk space, e.g., hundreds of TBs.
- You need to run a lot of simulations needing hundreds of cores.
- You need to run a large number of simulations in parallel.
- You need to run web services.
- You need to run an SQL database to service compute jobs / cloud resources.
- You need to make use of cloud resources.

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Each year there is a Resource Allocation Competition (RAC):

- Peer-reviewed competition
- For research projects that need resources significantly beyond what is normally available.

There are two competitions:

- Research Platforms and Portals (RPP) which primarily involves using cloud(s).
- **Resources for Research Groups (RRG)** which primarily involves using compute cluster(s).

Key Dates for the 2025 RAC:

- RRG & RPP application deadline: Sept. 24 to Oct. 30, 2024 at 11:59 EST
- General information sessions: Oct. 1 (English), Oct. 2 (French)
- GPU resource request sessions: Oct. 3 (English), Oct. 4 (French)
- Cloud resource request session: Oct. 7 (English)
- RAC 2025 results announcement: Late March 2025
- Start of 2025 RAC allocations: Early July 2025

RAC information at https://alliancecan.ca/en/services/ advanced-research-computing/ accessing-resources/ resource-allocation-competition



RAC application guide information at https://alliancecan.ca/en/services/ advanced-research-computing/ accessing-resources/ resource-allocation-competition/ resource-allocation-competition-application-g



Each 2025 RRG (compute) RAC application must meet at least one of these minimum requirements:

- CPU core years or equivalent: 200
- Reference GPU units (RGPU): 25
- Storage in TB: 41
- Nearline storage (tape) in TB: 101
- A submission is required if any dCache storage is needed.

Each 2025 RPP (cloud) RAC application must meet at least one of these minimum requirements:

- Virtual CPU years (VCPU): 81
- Virtual GPU years (VGPU): 1.3
- Persistent virtual CPU years (VCPU): 26
- Volume and snapshot storage in TB: 11
- Shared filesystem storage in TB: 11
- Object storage in TB: 11

One can request staff interaction for RAC applications by sending an email requesting such to support@tech.alliancecan.ca open a ticket.



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Thank you!

Questions, answers, and discussion.

• Appendix Overview

- Software/Environment Modules on Clusters
- Slurm Scheduler Use
- Julia Set Fractal Example

These appendices are extra slides provided as examples should some questions be asked about the compute clusters and running/compiling code.

• Appendix Overview

• Software/Environment Modules on Clusters

- Slurm Scheduler Use
- Julia Set Fractal Example

- A lot of software programs as well as many versions of those softwares are available on clusters.
- These can be utilized by using the module command.

Some examples:

- module reset: reset loaded modules back to defaults upon login
- module avail: shows names of software packages that are available with the currently loaded modules
- module spider PKGNAME: shows information about PKGNAME and its versions
- module spider PKGNAME/VERSION: shows information about version VERSION of PKGNAME and how it must be loaded
- module load PKGNAME: loads the default version of PKGNAME
- module load PKGNAME/VERSION: loads version VERSION of PKGNAME
- module unload PKGNAME: unloads PKGNAME

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The Slurm scheduler allows one to control and/or query information about non-interactive and interactive jobs with these commands:

- sbatch: submits a job into the scheduler's job queue
- salloc: requests an interactive job (max: 3h)
- scancel: cancels a job
- squeue: see jobs currently in job queue on cluster
- sacct: see history of jobs run

The **sbatch** command is typically invoked like this:

• sbatch --account ACCTNAME jobscript.sh

where:

- ACCTNAME is the name of the PI account the job will run under
- jobscript.sh is the name of the job script to run

An example jobscript.sh to run an instance of a sequential program:

sequential.sh

1	#!/bin/bash	
2	#SBATCHtime=0-05:00	# D-HH::MM, i.e., 5 hours (max)
3	#SBATCHmem=4000M	# i.e., ~4 GB RAM
4		
5	./sequential-program.exe	

An example jobscript.sh to run 100 instances of a sequential program:

An example jobscript.sh to run a single CPU, single GPU program:

_____ gpu-seq.shh _____

1 #!/bin/bash

- 2 #SBATCH --time=0-11:00
- 3 #SBATCH --mem=4000M
- 4 #SBATCH --gpus-per-node=1
- 5
- 6 ./gpu-program.exe

An example jobscript.sh to run a multithreaded program using 10 threads (limited to a single node):

An example jobscript.sh to run an OpenMP program using 10 threads (limited to a single node):

openmp.sh 1 #!/bin/bash 2 #SBATCH --time=0-05:00 # D-HH::MM, i.e., 5 hours (max) 3 #SBATCH --ntasks=1 4 #SBATCH --cpus-per-task=10 5 #SBATCH --mem-per-cpu=1024M # i.e., ~1 GB RAM per CPU 6 7 export OMP_NUM_THREADS=\$SLURM_CPUS_PER_TASK 8 ./openmp-program.exe

An example jobscript.sh to run a six CPU, single GPU OpenMP program:

An example jobscript.sh to run an MPI program using 8 MPI processes:

An example jobscript.sh to run an MPI program using 8 GPUs with 6 CPUs per GPU:

An example jobscript.sh to run a program exclusively on an entire node:

```
whole-node.sh

1 #!/bin/bash

2 #SBATCH --nodes=1

3 #SBATCH --gpus-per-node=p100:2 # i.e., 2 NVIDIA Pascal GPUs

4 #SBATCH --ntasks-per-node=32 # i.e., node needs at least 32 CPUs

5 #SBATCH --mem=0 # i.e., use all memory on node

6 #SBATCH --time=0:03:00

7

8 ./whole-node-gpu-program.exe
```

The **salloc** command is invoked by passing on a single command line all of the SBATCH options needed for the job, e.g.,

• salloc --account ACCTNAME --time=0-03:00 --cpus-per-task=10 --mem-per-cpu=1024M

After a wait for an available machine with those resources, you will be logged in to such.

The scancel command is invoked by passing the job number one wishes to cancel, e.g.,

• scancel 32385923

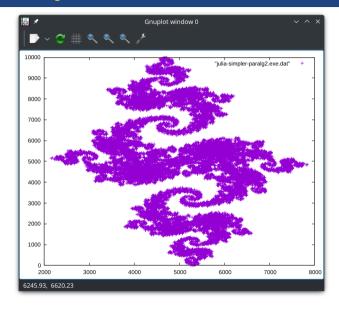
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Let's consider a program that computes the Julia Set, https://en.wikipedia.org/wiki/Julia_set, fractal.

To determine whether or not a particular complex value is in the Julia set, one can map a 2D point, (x, y) to a complex value, z, and then repeatedly compute $z = z^2 + c$, where cis fixed, and check whether or not z escapes some threshold value.

- if the threshold is not exceeded after a maximum number of iterations, then it is in the Julia Set,
- otherwise it is considered not to be in the Julia Set.

Julia Set Fractal Example (con't)



C has built-in complex numbers, e.g., **float** _Complex, which makes this easier to write:

			julia.c
	julia.c	17	<pre>float const scaling = 1.5;</pre>
	<pre>#include <complex.h></complex.h></pre>	18	<pre>float _Complex const c = -0.8f + 0.156f * _Complex_I;</pre>
2	<pre>#include <stdlib.h></stdlib.h></pre>	19	
3	<pre>#include <stdio.h></stdio.h></pre>		fleet could x = cooling * ((fleet)(DTM/2)
4		20	<pre>float const scaled_x = scaling * ((float)(DIM/2) -) ((cont(c)))</pre>
5	<pre>typedef unsigned short pixel_type;</pre>		\leftrightarrow x)/(DIM/2);
	typedef unsigned short coord_type;	21	float const scaled_y = scaling * ((float)(DIM/2) -
-	cypeder disigned short coord_type,		\hookrightarrow y)/(DIM/2);
7	#define DIM 10000	22	<pre>float _Complex z = scaled_x + scaled_y * _Complex_I;</pre>
8		23	
9		24	<pre>for(unsigned short iter = 0; iter < 1000; ++iter)</pre>
10	<pre>inline float cnormf(float _Complex const x)</pre>	25	
11	{		
12	return crealf(x) * crealf(x) + cimaqf(x) * cimaqf(x);	26	z = z * z + c;
13		27	if (cnormf(z) > 1000)
	1	28	return 0;
14	nius] huns inlin(seed huns of second hums of)	29	}
	<pre>pixel_type julia(coord_type x, coord_type y)</pre>	30	return 1;
16	ł	31	· ·
		51	

C++ code equivalent to the C code presented:

	julia.cpp		julia.cpp
1	<pre>#include <atomic></atomic></pre>	16	<pre>pixel_type julia(coord_type const x, coord_type const y)</pre>
2	<pre>#include <chrono></chrono></pre>	17	{
3	<pre>#include <complex></complex></pre>	18	<pre>constexpr float scaling = 1.5f;</pre>
4	<pre>#include <fstream></fstream></pre>	19	<pre>constexpr complex<float> c{-0.8f, 0.156f};</float></pre>
5	<pre>#include <iostream></iostream></pre>	20	
6	<pre>#include <vector></vector></pre>	21	<pre>float scaled_x = scaling * (float(DIM/2) - x)/(DIM/2);</pre>
7	<pre>#include "now.hpp"</pre>	22	<pre>float scaled_y = scaling * (float(DIM/2) - y)/(DIM/2);</pre>
8		23	complex< float > z{scaled_x, scaled_y};
9	using namespace std;	24	
10		25	for (unsigned short i=0; i ≠ 1000; ++i)
11	<pre>using pixel_type = unsigned short;</pre>	26	{
12	<pre>using coord_type = unsigned short;</pre>	27	$z = z^* z + c;$
13		28	if (norm(z) > 1000)
14	<pre>constexpr coord_type DIM = 10000;</pre>	29	return 0;
15		30	}

```
_ iulia.cop
                                                                                                  _ julia.cpp __
31
     return 1:
                                                                          cout << "elapsed time: " <<
32
                                                                     46
                                                                           \leftrightarrow chrono::duration<double>(t1-t0).count() << "
33
34 int main()
                                                                           \hookrightarrow seconds\n";
35
                                                                     47
     vector<pixel_type> v(DIM*DIM):
                                                                           // write output to file...
36
                                                                     48
                                                                           ofstream out("julia.dat"):
37
                                                                     40
                                                                           for (coord_type y = 0; y \neq DIM; ++y)
38
     // "kernel" code to compute the Julia set...
                                                                     50
     auto t0 = now(v.data()); // get start time_point
                                                                            for (coord_type x = 0: x \neq DIM: ++x)
39
                                                                     51
40
     for (coord_type y = 0: y \neq DIM: ++y)
                                                                     52
       for (coord_type x = 0: x \neq DIM: ++x)
                                                                               if (v[v^*DIM+x] = 1)
                                                                     53
41
                                                                                 out \ll x \ll \frac{1}{2} \ll y \ll \frac{1}{n}:
         v[v*DIM+x] = iulia(x,v):
                                                                     54
42
     auto t1 = now(v.data().t0): // get stop time_point
                                                                     55
                                                                             }
43
                                                                     56 }
44
     // output elapsed time in seconds...
45
```

We will not parallelize the julia(x,y) function:

- its code is simple, and,
- the number of loop iterations required for any point (x, y) is unknown.

Instead we will focus on calling julia(x,y) in parallel.

First, let's look at what needs to be done sequentially...

It is important to have a way to benchmark function calls:

```
_ now.hpp
                                                                               now.hnn
 1 #ifndef now_hpp_
                                                                    dno(std::forward<Args>(args)...):
                                                                16
 2 #define now hpp
                                                               17 }
                                                               18
 4 #include <atomic>
                                                                19 template <typename... Args>
 5 #include <chrono>
                                                                20 inline auto now(Args&&... args) ->
 6
                                                                     std::chrono::time_point<std::chrono::steady_clock>
                                                                21
7 // Include Gooale Benchmark
                                                                22
  → (https://github.com/google/benchmark)...
                                                                    using namespace std;
                                                                23
 8 #include <benchmark/benchmark.h>
                                                                    dno(std::forward<Args>(args)...);
                                                               24
 Q
                                                                     auto tp = chrono::steady_clock::now();
                                                               25
10 inline void dno() noexcept { }
                                                                    dno(tp):
                                                               26
11
                                                                27
                                                                     return tp:
12 template <typename Arg, typename... Args>
                                                               28 }
13 inline void dno(Arg arg, Args&&... args)
                                                                29
14
                                                               30 #endif
    benchmark::DoNotOptimize(arg);
15
```

The rest of the program is in main():

```
_ iulia.cop
34 int main()
35
    vector<pixel_type> v(DIM*DIM):
36
37
    // "kernel" code to compute the Julia set...
38
    auto t0 = now(v.data()); // get start time_point
39
    for (coord_type y = 0; y \neq DIM; ++y)
40
      for (coord_type x = 0: x \neq DIM: ++x)
41
        v[v*DIM+x] = iulia(x,v):
42
43
     auto t1 = now(v.data().t0): // get stop time_point
44
45
    // output elapsed time in seconds...
```

```
______ julia.cop _____
     cout << "elapsed time: " <</pre>
46
     \leftrightarrow chrono::duration<double>(t1-t0).count() << "
     \hookrightarrow seconds\n";
47
48
     // write output to file...
     ofstream out("julia.dat");
49
     for (coord_type v = 0: v \neq DIM: ++v)
50
       for (coord_type x = 0: x \neq DIM: ++x)
51
52
        ş
          if (v[v*DIM+x] = 1)
53
            out \ll x \ll \frac{1}{2} \ll y \ll \frac{1}{n}:
54
        }
55
56 }
```

OpenMP code:

```
iulia-openmp.cpp
34 int main()
35
36
    vector<pixel_type> v(DIM*DIM):
37
    // "kernel" code to compute the Julia set...
38
39
     auto t0 = now(v.data()); // get start time_point
    for (coord_type y = 0: y \neq DIM: ++y)
40
      #pragma omp parallel for
41
      for (coord_type x = 0; x < DIM; ++x)
42
        v[v*DIM+x] = julia(x,v):
43
    auto t1 = now(v.data(),t0); // get stop time_point
44
45
```

```
_ iulia-openmp.cpp _
     // output elapsed time in seconds...
46
     cout << "elapsed time: " <</pre>
47
     \leftrightarrow chrono::duration<double>(t1-t0).count() << "
     \hookrightarrow seconds\n":
48
     // write output to file...
49
50
     ofstream out("julia.dat");
     for (coord_type y = 0: y \neq DIM: ++y)
51
        for (coord_type x = 0: x \neq DIM: ++x)
52
53
          if (v[v*DIM+x] == 1)
54
            out \ll x \ll \frac{1}{2} \ll y \ll \frac{1}{n}:
55
        }
56
57 }
```

C++17 Parallel Algorithms v1

C++17 parallel algorithms v1 code:

```
_ julia-paralq1.cpp _____
                                                                  53
  int main()
37
                                                                  54
38
                                                                  55
     vector<pixel_type> v(DIM*DIM);
                                                                  56
39
40
                                                                  57
     // run kernel function to compute the Julia set...
41
                                                                  58
     vector<coord_type> xs(DIM):
42
     iota(xs.begin(), xs.end(), 0);
43
44
                                                                  59
     auto t0 = now(xs.data()); // get start time_point
45
                                                                  60
     for (coord_type v = 0: v \neq DIM: ++v)
46
                                                                  61
47
                                                                  62
       transform(
                                                                  63
48
         execution::par_unseq,
49
                                                                  64
         xs.begin(), xs.end(),
                                                                  65
50
         v.begin()+v*DIM.
51
                                                                  66
         [y](coord_type const x) { return julia(x,y); }
52
                                                                  67
```

```
iulia-paralq1.cpp _____
     );
     3
     auto t1 = now(v.data(),t0); // get stop time_point
     // output elapsed time in seconds...
     cout << "elapsed time: " <</pre>
     \leftrightarrow chrono::duration<double>(t1-t0).count() << "
     \rightarrow seconds\n":
     // write output to file...
     ofstream out("julia.dat"):
     for (coord_type y = 0; y \neq DIM; ++y)
       for (coord_type x = 0: x \neq DIM: ++x)
       ş
         if (v[v*DIM+x] == 1)
           out \ll x \ll ' ' \ll v \ll ' n':
       3
68 }
```

C++17 Parallel Algorithms v2

C++17 parallel algorithms v2 code:

```
_____ iulia-paralg2.cpp
  int main()
                                                                                             julia-paralg2.cpp
37
38
                                                                    54
                                                                        );
     vector<pixel_type> v(DIM*DIM):
                                                                          auto t1 = now(v.data(),t0); // get stop time_point
39
                                                                    55
40
                                                                    56
     // "kernel" code to compute the Julia set...
                                                                         // output elapsed time in seconds...
41
                                                                    57
     vector<pair<coord_type.coord_type>> indices:
                                                                    58
                                                                         cout << "elapsed time: " <<
42
     indices.reserve(DIM*DIM):
                                                                         \hookrightarrow chrono::duration<double>(t1-t0).count() << "
43
     for (coord_type i{}; i \neq DIM; ++i)
                                                                         \hookrightarrow seconds\n":
44
       for (coord_type j{}; j \neq DIM; ++j)
45
                                                                    59
         indices.emplace_back(pair{i,j}):
                                                                         // write output to file...
46
                                                                    60
                                                                         ofstream out("iulia.dat"):
47
                                                                    61
     auto t0 = now(v.data(),indices): // get start
                                                                          for (coord_type y = 0: y \neq DIM: ++y)
48
                                                                    62
                                                                            for (coord_type x = 0: x \neq DIM: ++x)
    → time point
                                                                    63
     transform(
49
                                                                    64
       execution::par_unseq,
                                                                              if (v[v*DIM+x] == 1)
50
                                                                    65
                                                                                out \ll x \ll \frac{1}{2} \ll y \ll \frac{1}{n};
      indices.begin(), indices.end(),
51
                                                                    66
                                                                            }
52
       v.begin().
                                                                    67
       [](auto const& p) constexpr { return
                                                                    68 }
53
       \rightarrow julia(p.first,p.second); }
```

On our clusters, load one of these module sets:

- GCC: module load googlebenchmark gcc tbb
- Clang: module load googlebenchmark clang tbb
- Intel: module load googlebenchmark intel tbb
- NVHPC (CPU): module load googlebenchmark nvhpc
- NVHPC (GPU): module load googlebenchmark nvhpc cuda

Compiling and linking C++ code with GCC:

- Serial: g++ -03
- OpenMP: g++ -03 -fopenmp
- ParAlg: g++ -std=c++17 -03
- ParAlgLink: -ltbb -lbenchmark

Compiling and linking C++ code with Clang:

- Serial: clang++ -03
- OpenMP: clang++ -03 -fopenmp
- ParAlg: clang++ -std=c++17 -03
- ParAlgLink: -ltbb -lbenchmark

Compiling and linking C++ code with Intel OneAPI:

- Serial: icpx -03 -fp-model precise
- OpenMP: icpx -03 -fp-model precise -fopenmp
- ParAlg: icpx -03 -std=c++17 -fp-model precise
- ParAlgLink: -ltbb -lbenchmark

Compiling and linking C++ code with NVIDIA's nvhpc for CPU only:

- Serial: nvc++ -03
- OpenMP: nvc++ -03 -fopenmp
- ParAlg: nvc++ -03 -std=c++17 -stdpar=multicore
- ParAlgLink: -lbenchmark

Compiling and linking C++ code with NVIDIA's nvhpc for CPU & GPU:

- Serial: nvc++ -03
- OpenMP: nvc++ -03 -fopenmp
- ParAlg: nvc++ -std=c++17 -03 -stdpar=gpu -gpu=managed
- ParAlgLink: -lbenchmark

To run on a GPU NVHPC's -stdpar=gpu requires:

- using dynamically allocated memory, e.g., std::vector
- using lambda functions and/or templated function objects that do not capture host state / call stack variables

To generate compiler reports on missed vectorization, add these options when compiling:

- GCC: -fopt-info-vec-missed
- Clang: -Rpass-missed=loop-vectorize
- Intel OneAPI: -qopt-report
- NVHPC: -Minfo

On a standalone workstation that has a 16-core AMD Threadripper CPU with two hyperthreads per core using GCC and -03 -march=native:

- julia-cpp.exe: C++ serial: 8.09s
- julia-openmp-cpp.exe: C++ OpenMP: 1.10s
- julia-paralg2.exe: C++ parallel algorithm (v2 code): 0.3s

(These timings could also have been generated on one of the computer clusters but it is best to have longer running times before doing so; e.g., jobs should take longer to run than a few minutes.)