Command-line genomics

Jelmer Poelstra, MCIC Apr 4, 2023

What I'll talk about today

Today, I will give an overview of the **typical computational environment infrastructure used for genomics projects**.

Most of this can be summarized as "command-line genomics", and I will explain what this entails, and why you need the command line.

Of course, I won't have time to teach you the different components, but I would like to orient you on this topic so that it's not as much of a black box.

This will hopefully give you a starting point for learning more – and I will point you to some specific resources as well.

- Any project in which you generate high-throughput sequencing data, e.g.:
 - → Whole-genome sequencing de novo assembly, pangenomics, "resequencing"
 - → Reduced-representation sequencing (GBS, etc) for population genomics
 - → Microbiomics both shotgun metagenomics and amplicon metabarcoding
 - → Transcriptomics with RNAseq

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• Other genomics projects like **comparative genomics** with publicly available genomes.

But only to some extent to proteomics and metabolomics.

Overview

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- 2. Command-line genomics?
- 3. Ohio Supercomputer Center (OSC) overview
- 4. Command-line software
- 5. The VS Code editor and the whole game

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Command-line genomics

For the purposes of this talk, I will refer to working with the above elements by running command-line programs as "batch jobs" (non-interactively) as **command-line genomics**.

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• **R** or perhaps Python for interactive statistical analysis and visualization. (I won't talk more about this other than showing you how you can use R at OSC)

What is a supercomputer?

A highly interconnected set of many computer processors and storage units. You can think of it simply as a network of computers.

Supercomputers are also commonly referred to as High-Performance Computing (HPC) clusters or simply compute clusters.

Why do I need a supercomputer?

- Your genomics dataset is often too large to be handled efficiently, or even at all, by a laptop or desktop computer.
- To speed up long-running analyses by using more computing power.
- To **speed up repeated analyses**, like the independent mapping of reads for different samples to a reference genome: these can be run in parallel on a supercomputer.
- It's also a great place to store large amounts of data

What is the Unix shell?

A computer's **shell** is also referred to as a *Terminal* or "the command line", and allows you to interact with your computer by **typing commands** rather than pointing-and-clicking.

The *Unix* shell is the shell of Unix-based computers, which include Mac and Linux (but not Windows) operating systems.¹

Host: pitzer.osc.edu

[jelmer@pitzer-login04 ~]\$ mkdir mynewfolder

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• A genomics project usually involves sequentially running a whole array of bioinformatics programs (or "tools").

For instance, an RNAseq project may include: raw read QC => raw read trimming => trimmed read mapping => gene counting

- Many of these tools can only be run through a "command-line interface" (CLI)
 - Even those that have a "graphical user interface" (GUI) are more efficiently and reproducibly run through a CLI:
 - → Efficiency A CLI allows you to write a simple loop to run it in the same way for many samples. (In combination with the computing power of a supercomputer, this in turn allows you to process those hundreds of samples in parallel.)
 - → Reproducibility You can easily save all commands and scripts which would allow you to rerun a project rather straightforwardly.

How/when can I avoid all of this?

If you will often do genomics projects like the ones mentioned above, it's hard to avoid command line genomics as described.

But here are some conditions in which you might reasonably avoid it:

- You're doing a single genomics project, your main research focus is elsewhere
- You have data which can be analyzed with no or a relatively small command-line-based part, such as proteomics/metabolomics/metabarcoding/RNAseq.

In such cases, you might be able to get someone else to do the command line work, or you could try *Galaxy*, a cloud-based bioinformatics platform with a web browser interface and no coding.

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The Ohio Supercomputer Center (OSC)



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OSC has two individual supercomputers/clusters (named Owens and Pitzer), and lots of infrastructure for their usage.



The Ohio Supercomputer Center (OSC)

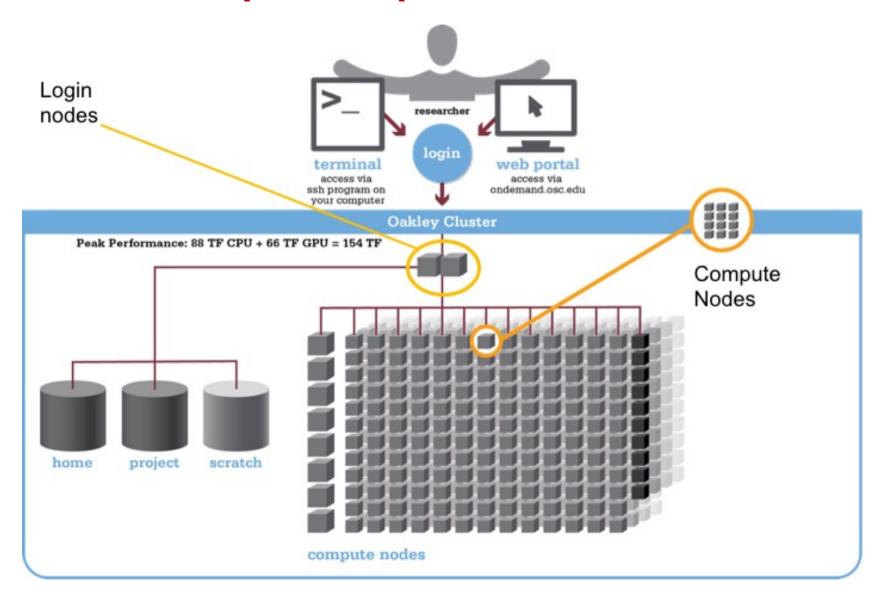
- The Ohio Supercomputer Center (OSC) provides computing resources to researchers (and others) across Ohio.
 - OSC has two individual supercomputers/clusters (named Owens and Pitzer), and lots of infrastructure for their usage.
- Research usage is charged but at heavily subsidized rates, and most or all OSU colleges absorb these costs at the college level (!)
 - Educational usage is entirely free, like for the PAS2250 project you have been added to for this lecture.



Ohio Supercomputer Center

An OH-TECH Consortium Member

Supercomputer overview



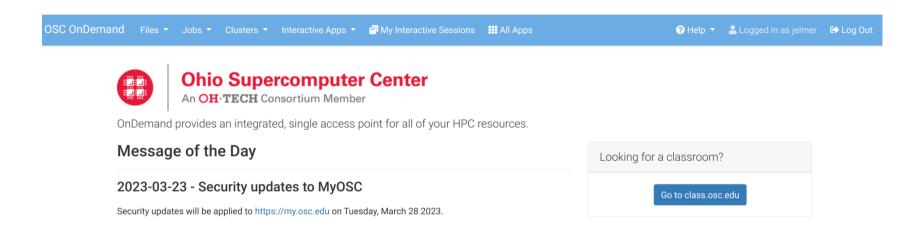
OSC OnDemand

The OSC OnDemand web portal allows you to use a web browser to access OSC resources such as:

- A file browser where you can also create and rename folders and files, and download and upload files. ¹
- A Unix shell
- More than a dozen different "Interactive Apps", or programs with a GUI, such as RStudio, Jupyter, QGIS, and more.

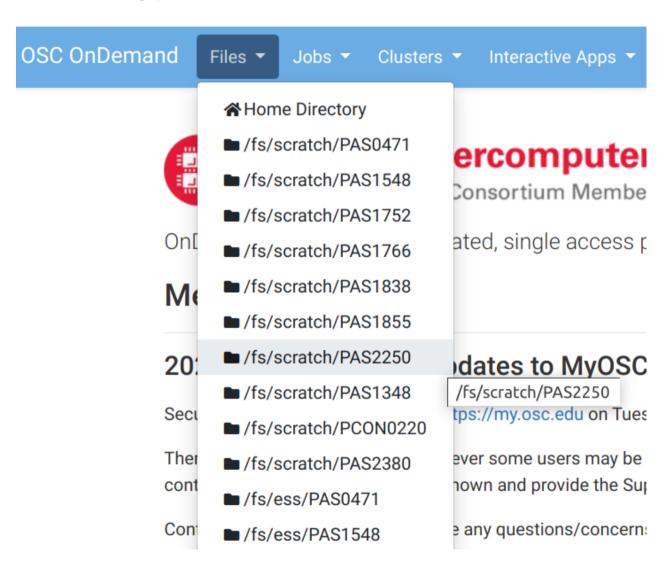
Connecting to OSC with OnDemand

• Go to https://ondemand.osc.edu, and log in with your OSC credentials.



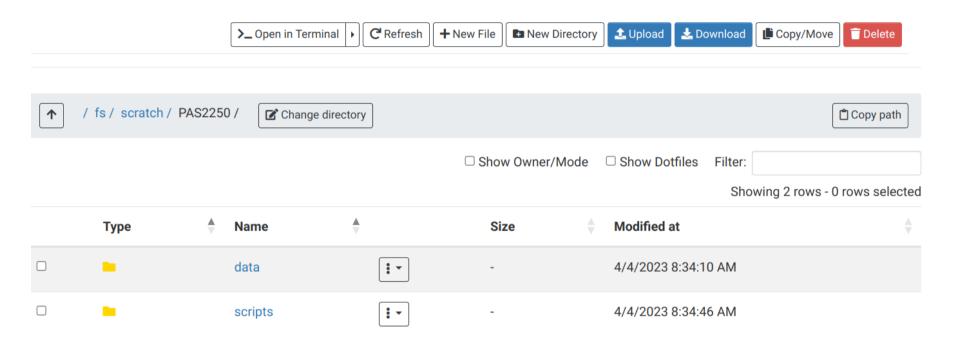
OnDemand "Files" menu

Choose a folder as a starting point for the file browser:



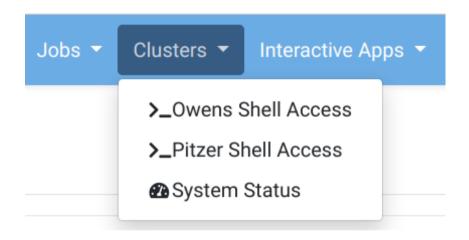
OnDemand "Files" menu

Here you can view, create and rename folders and files, and download and upload files:



OnDemand "Clusters" menu

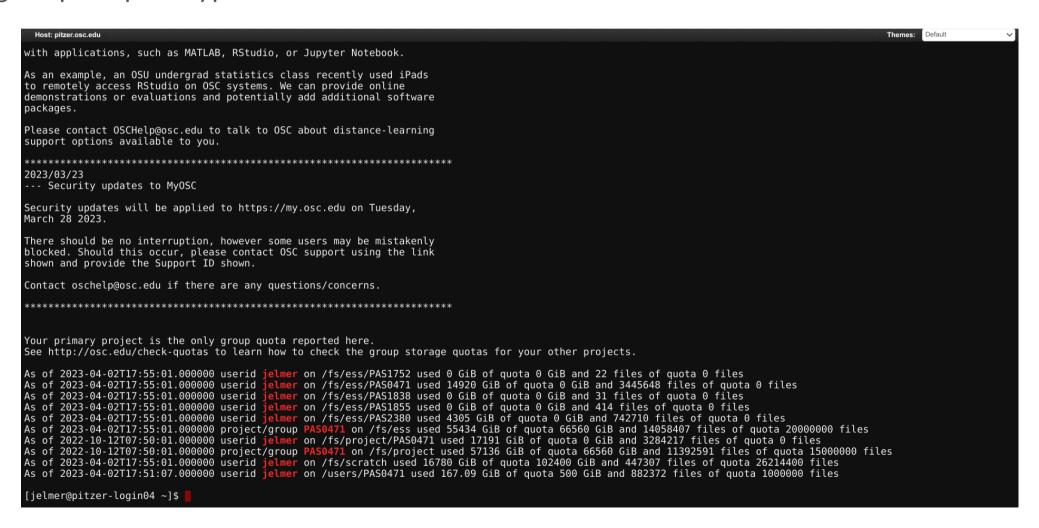
Here you can access a Unix shell on either of the two clusters:



(Since the two clusters share the file systems, and they have fairly similar capabilities, it generally doesn't matter which cluster you connect to).

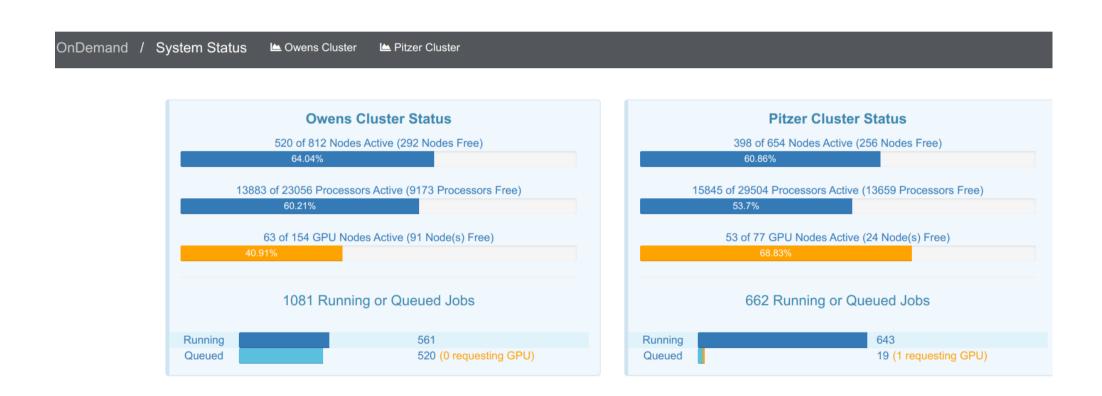
OnDemand "Clusters" menu: Shell

When you click on one of the shell options, a new browser tab with a shell will open. There are some welcome messages, and some storage usage/quota info, and then you get a prompt to type commands:



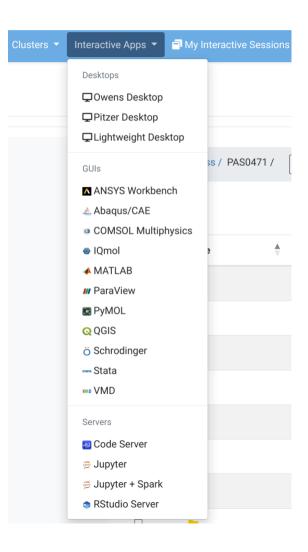
OnDemand "Clusters" menu: System Status

If you click on "System status", you'll get an overview of the current usage of the two clusters:



OnDemand "Interactive Apps" menu

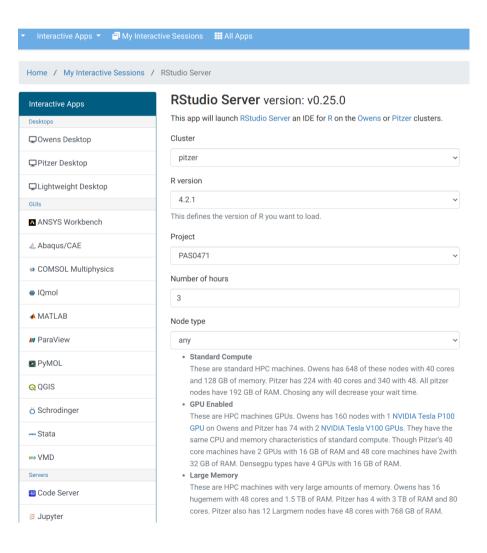
Here you can mostly access programs with a GUI that will run on a compute node. We'll try RStudio Server now (and Code Server a little later).



OnDemand "Interactive Apps": RStudio Form

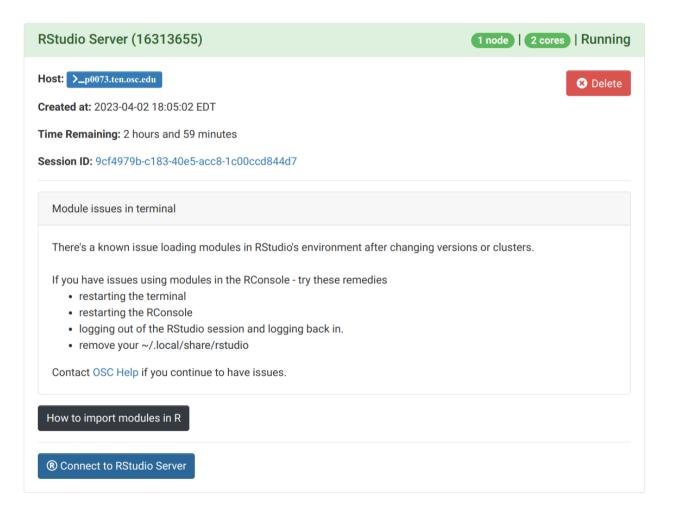
Fill out this form to start an RStudio session.

This will run on a compute node and is therefore charged: for that reason, it needs the OSC account number so as to bill the correct account.



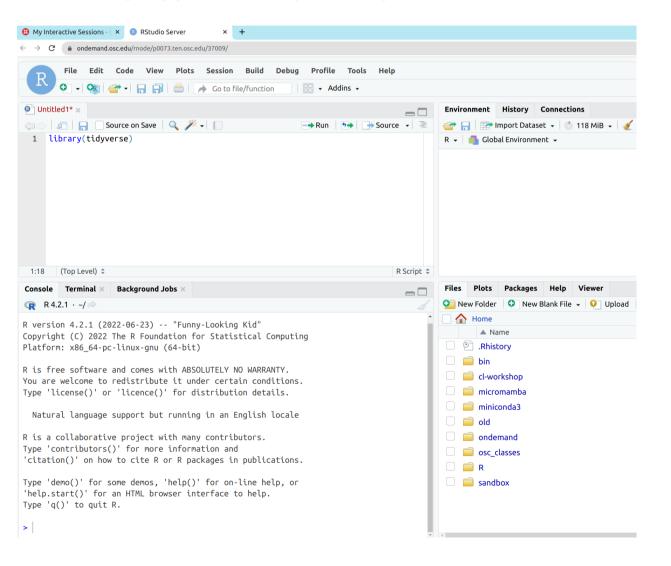
OnDemand "Interactive Apps": RStudio

Once the top bar of the box like the one shown below turns green and says "Running", you can click "Connect to RStudio Server" way at the bottom:



OnDemand "Interactive Apps": RStudio

Now, you'll have RStudio running in your browser! It looks just like the desktop app version you may be familiar with:



Software

Because you don't have administrator rights, and because the system is shared by so many people, you can't install and use software "the regular way".

- → For system-wide installed software, **load it** with module commands.
- → If something is not installed, ask OSC or use *Conda* or containers.

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• "Non-interactive" usage is common, using a job scheduler (SLURM)
You submit your scripts to the SLURM queue and monitor the resulting jobs.

Overview

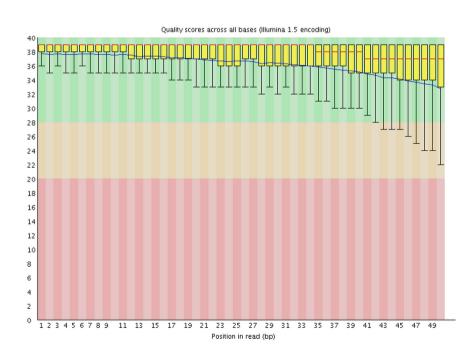
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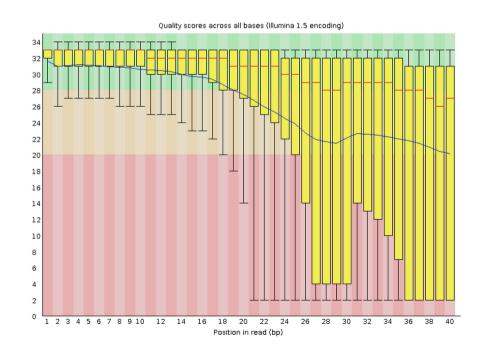
An example of a command-line program

A useful example of a genomics tool with a CLI is **FastQC**, a program for quality control of **FASTQ** files.

It is ubiquitous because nearly all high-throughput sequencing data comes in FASTQ files, and your first step is always to check the quality of the reads.

FastQC produces visualizations and assessments of aspects of your reads such as adapter content, and, as shown below, **mean base quality along the read**:





Running FastQC

Running FastQC

• To run FastQC, you use the command fastqc.

Command-line programs are typically run non-interactively, so we don't fire up the program first, and tell it what to do later, like we would with a program with a GUI.

Instead, we at once issue a complete set of instructions for the program to do what we would like it to.

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Instead, we at once issue a complete set of instructions for the program to do what we would like it to.

• For example, say we want to analyze one of the FASTQ files that I put in /fs/scratch/PAS2250/data, with default FastQC settings.

A complete FastQC command would be:

```
1 [jelmer@owens-login04 ~] $ fastqc /fs/scratch/PAS2250/data/sample1.fastq.qz
```

So, it is simply fastqc followed by a space and the name of the file!

• FastQC is available to us at OSC¹, but we first have to **load it**. Here is what happens when we try to run the program in a fresh shell session at OSC:

```
1 [jelmer@owens-login04 ~]$ fastqc /fs/scratch/PAS2250/data/sample1.fastq.gz
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```

Now, let's try again:

```
[jelmer@owens-login04 ~]$ fastqc /fs/scratch/PAS2250/data/sample1.fastq.gz

# > Started analysis of sample1.fastq.gz

# > Approx 5% complete for sample1.fastq.gz

# > Approx 10% complete for sample1.fastq.gz

# > Approx 15% complete for sample1.fastq.gz

# > Itruncated
```

Success!

Something is missing here

I mentioned earlier that one benefit of running programs at the command-line is reproducibility – but how do we save the commands that we run?

- We need to not just save them, but to keep a detailed digital notebook that will enable us to redo our analysis.
- We also need to wrap these commands in little scripts, so that we can run programs non-interactively and in parallel.

For all of this, we will need a good **text editor**.

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The VS Code text editor

VS Code (in full, "Visual Studio Code") is a nice modern GUI-based text editor. ¹ We can use a version of this editor (often referred to as *Code Server*) in our browser through OSC OnDemand.

Because it also has an integrated terminal to access a Unix shell, this setup effectively combines the 3 aspects of command-line genomics:

- Supercomputer
- Unix shell
- Text editor

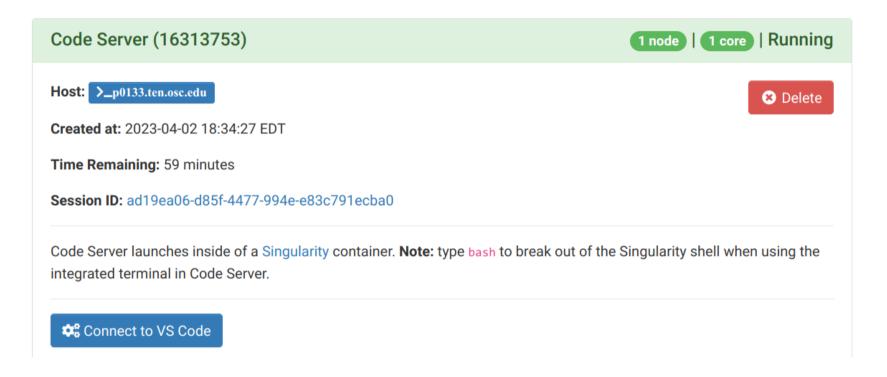
(And while I personally prefer RStudio for R, you can also run that through VS Code).

- 1. Log in to OSC's OnDemand portal at https://ondemand.osc.edu.
- 2. In the blue top bar, select Interactive Apps and then near the bottom of the dropdown menu, click Code Server.
- 3. In the form that appears on a new page:
 - Select project PAS2250
 - No need to change "Number of hours" and "Working Directory"
 - Make sure the "Codeserver Version" is 4.8.
- 4. On the next page, once the top bar of the box has turned green and says Runnning, click Connect to VS Code.

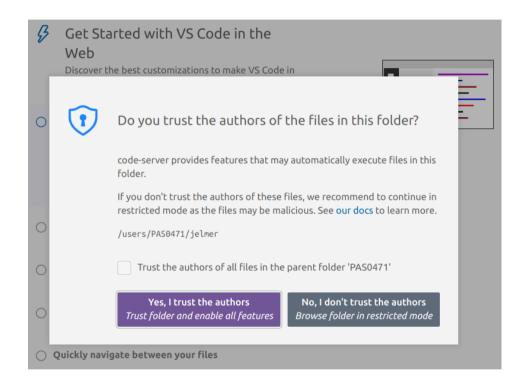
Code Server version: v0.7.0

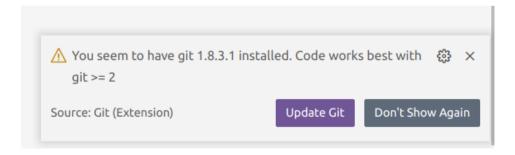
This app will launch a VS Code server using Code Server on the Pitzer cluster. **Project** PAS2250 Number of hours **Working Directory** Select your project directory; defaults to \$HOME Select Path Codeserver Version 4.8 Launch

Once the session is running, you can click "Connect to VS Code":

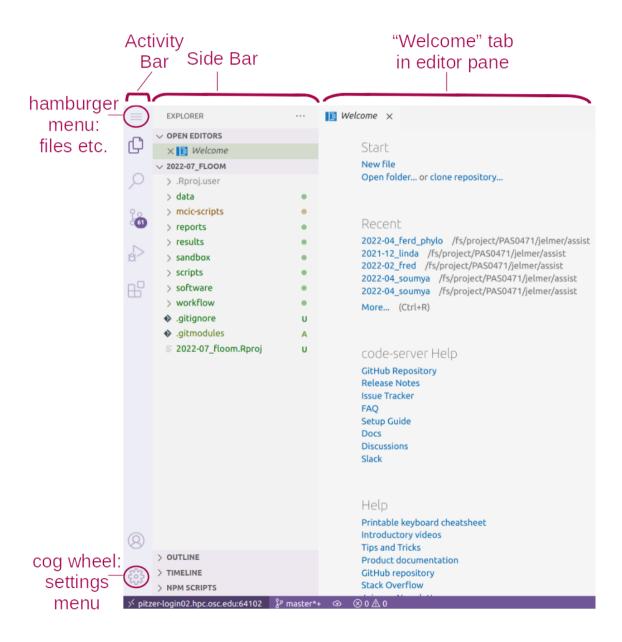


You'll likely get these two pop-ups – click "Yes" and "Don't Show Again", respectively:





VS Code Basics: Side bar with file browser



VS Code Basics: Editor pane

The main part of the VS Code is the editor pane.

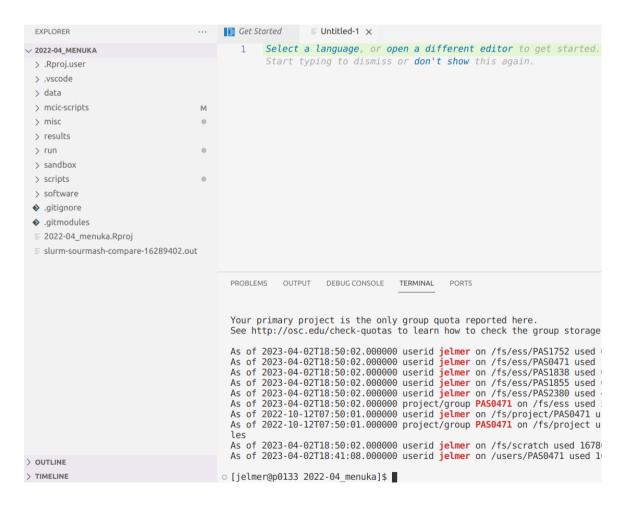
Whenever you open VS Code, a editor pane tab with a Get Started document is automatically opened. We can use this document to open a new text file by clicking New file below Start, which opens as a second tab in the editor pane.



VS Code Basics: Terminal

Open a terminal with a Unix shell by clicking \equiv => Terminal => New Terminal.

The great thing with this setup is that we can keep notes and write shell scripts in the same window as our shell and a file browser!



I've shown you the main pieces of the computational infrastructure for "command-line genomics". We've seen a very basic example of loading and running a command-line tool at OSC.

The missing pieces for a fuller example of how such tools are run in the context of an actual genomics project are (if we stay with FastQC):

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- **Submitting the script** to the SLURM scheduler queue as a "batch job". (At its most basic, this involves putting **sbatch** in front of the script name.)
- To make use of the capabilities of the supercomputer and speeding up our analysis, we can **submit multiple jobs** *in parallel* **using a loop**.

• The core skills:

- → Unix shell basics the commonly used commands
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 - → Using conda or containers for software
 - → Unix data tools (grep, sed, awk, etc)
- When you want to become proficient in applied bioinformatics:
 - → Version control with git
 - → More advanced: formal workflow/pipeline management tools (e.g. Nextflow)
 - → More advanced: Python (or advanced R) for custom data processing

Resources for further learning: OSC

- Tutorials and courses!
 - https://khill42.github.io/OSC_IntroHPC/
 - https://osc.catalog.instructure.com/

 OSC regularly has online introductory sessions, both overviews and more hands-on sessions – see the OSC Events page: https://www.osc.edu/events.
 They also have weekly office hours.

• There is also some good introductory material at their *Getting Started* pages (https://www.osc.edu/resources/getting_started), as well as more specific "HOWTO" pages (https://www.osc.edu/resources/getting_started/howto).

Resources for further learning: OSU

- OSU courses and workshops
 - Jonathan Fresnedo Ramirez's "Genome Analytics" course (HCS 7004)
 - Microbiome Informatics (MICRBIO 8161)
 - The online materials for the workshop "Command line basics for genomic analysis at OSC" that myself and Mike Sovic gave last August: https://mcic-osu.github.io/cl-workshop-22/
 - I have a course "Practical Computing Skills for Omics Data" (PLNTPTH 5006) that I am planning to teach in in Spring 2024. All materials for the 2021 version of this course ("Practical Computing Skills for Biologists") are at: https://mcicosu.github.io/pracs-sp21/

Resources for further learning: OSU

Some particularly useful books:

- The Linux Command Line (William Shotts, 2019)
- Bioinformatics Data Skills (Vince Buffalo, 2015)
- Computing Skills for Biologists: A Toolbox (Wilmes & Allesino, 2019)
- A Primer for Computational Biology (Shawn T. O' Neil, 2019)
 https://open.oregonstate.education/computationalbiology/

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 - In some cases, I do run analyses for instance, with RNAseq and metabarcoding I can run a **standardized**, **nearly automated workflow** to get count data such that you can skip the "command-line genomics" part and work with R on your laptop.

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- What the MCIC gets in return is a bioinformatics membership fee and in case of significant contributions, authorship.
- You can contact me at poelstra.1@osu.edu though I will be away most of the rest of this month.

Any questions?

Bonus: Submitting FastQC batch jobs

Due to time constraints, I have skipped over the details of these steps. But an example shell script to run FastQC can be found at

/fs/scratch/PAS2250/scripts/fastqc.sh, which contains the following code:

```
#!/bin/bash
   #SBATCH --account=PAS2250
   # Load the software
   module load fastqc
   # Bash strict settings
   set -euo pipefail
 9
   # Copy the placeholder variables
   input file=$1
   output dir=$2
13
   # Create the output dir if needed
   mkdir -p "$output dir"
16
   # Run FastOC
   fastqc --outdir="$output dir" "$input file"
```

- Indicate it's a Bash script and tell SLURM which OSC account to use
- Strict settings make the script stop on failure
- The script takes "arguments", which are stored as placeholder variables \$1 and \$2. This allows us to run the script for different files

Bonus: Submitting FastQC batch jobs

Here is how I would submit that script as a batch job to analyze one FASTQ file:

```
1 fastq_file=/fs/scratch/PAS2250/data/sample1.fastq.gz
2 sbatch /fs/scratch/PAS2250/scripts/fastqc.sh "$fastq_file" results_jelmer
3 #> Submitted batch job 16323144
```

And how you can loop over all FASTQ files to submit as many jobs in parallel as you have FASTQ files:

```
for fastq_file in /fs/scratch/PAS2250/data/*.fastq.gz; do
    sbatch /fs/scratch/PAS2250/scripts/fastqc.sh "$fastq_file" results_jelmer

done

4  #> Submitted batch job 16323145

5  #> Submitted batch job 16323146

6  #> Submitted batch job 16323147

7  #> Submitted batch job 16323148

8  #> Submitted batch job 16323149

9  #> Submitted batch job 16323110

10  #> Submitted batch job 16323111

11  #> Submitted batch job 16323112
```