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***Practical Computing and
Bioinformatics for
Conservation and
Evolutionary Genomics***



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Preface

This is a collection of blurbs Eric started writing in the last year to help remind himself and others of some useful things to know for bioinformatics.

It was started during an extended government shutdown, when it seemed like writing a book might be in order. Fortunately, the shutdown ended eventually. It is not clear whether a book will ever come of it, but these notes shall be up on the web indefinitely, so feel free to use them!



0

Introduction

Nothing here yet.



0

Eric's Notes of what he might do

This is where I am going to just throw out ideas and start to organize them. My thought was that while I am actually doing bioinformatics, etc. in my normal day-to-day work I will analyze what I am doing and figure out all the different tools that I am using and organize that or pedagogy.

- Note: I am going to make a companion repository called `mega-bioinf-pop-gen-examples` that will house all of the data sets and things for exercises.
-

0.1 Table of topics

Man! There is going to be a lot to get through. My current idea is to meet three times a week. The basic gist of those three sessions will be like this:

1. **Fundamental Tools / Environments:** I am thinking 5 weeks on Unix, 1 Week on HPC, 6 Weeks on R/Rstudio, and 3 on Python from within Rstudio (so that students know enough to run python modules like moments.)
2. **Theory and Background:** Population-genetic and bioinformatic theory. Alignment and BW transforms, the coalescent, Fst, etc. Basically things that are needed to understand (to some degree) what various programs/analyses are doing under the hood.
3. **Application and Practice:** Getting the students to get their feet wet and their fingers dirty actually doing it. This time should be entirely practical, with students doing an exercise (in pairs or groups, possibly) with me (or someone else, maybe CH) overseeing.

Week	Fundamental Tools	Theory and Background	Application and Practice
1	<i>Unix Intro:</i> filesystem; absolute and relative paths, everything is a file; readable, writable, executable; PATH; .bashrc — hack everyone's to get the time and directory; TAB-completion; cd, ls (colored output), cat, head, less; stdout and stderr and file redirection of either with > and 2>; the ; vs &. Using TextWrangler with edit and we need a PC equivalent...	<i>Data Formats:</i> fasta, fastq, SAM, BAM, VCF, BCF	Command line drills

Week	Fundamental Tools	Theory and Background	Application and Practice
2	Programs, binaries, compiling, installing, package management; software distribution; GitHub and sourceforge; admin privileges and sudo, and how you probably won't have that on a cluster.	Fundamental programming concepts; Scripts vs binaries (i.e. compiled vs interpreted languages); dependencies: headers and libraries; Modularization; Essential algorithms; compression;	samtools, vcftools, bcftools. hands on, doing stuff with them, reading the man pages, exercises.
3	<i>Programming on the shell:</i> variables and variable substitution; Globbing and path expansion; variable modifications; loops; conditionals;		
4	<i>sed, awk, and regular expressions</i>		
5	<i>HPC:</i> clusters; nodes; cores; threads. SGE and/or SLURM; qsub; qdel; qacct; myjobs; job arrays.		



Part I

Part I: Essential Computing Skills



1

Overview of Essential Computing Skills

What up with this? It appears that bookdown does not let you write things at the beginning of a Part without putting it under a chapter heading. Oh well.



2

Essential Unix/Linux Terminal Knowledge

Unix was developed at AT&T Bell Labs in the 1960s. Formally “UNIX” is a trademarked operating system, but when most people talk about “Unix” they are talking about the *shell*, which is the text-command-driven interface by which Unix users interact with the computer.

The Unix shell has been around, largely unchanged, for many decades because it is *awesome*. When you learn it, you aren’t learning a fad, but, rather, a mode of interacting with your computer that has been time tested and will likely continue to be the lingua franca of large computer systems for many decades to come.

For bioinformatics, Unix is the tool of choice for a number of reasons: 1) complex analyses of data can be undertaken with a minimum of words; 2) Unix allows automation of tasks, especially ones that are repeated many times; 3) the standard set of Unix commands includes a number of tools for managing large files and for inspecting and manipulating text files; 4) multiple, successive analyses upon a single stream of data can be expressed and executed efficiently, typically without the need to write intermediate results to the disk; 5) Unix was developed when computers were extremely limited in terms of memory and speed. Accordingly, many Unix tools have been well optimized and are appropriate to the massive genomic data sets that can be taxing even for today’s large, high performance computing systems; 6) virtually all state-of-the-art bioinformatic tools are tailored to run in a Unix environment; and finally, 7) essentially every high-performance computer cluster runs some variant of Unix, so if you are going to be using a cluster for your analyses (which is highly likely), then you have gotta know Unix!

2.1 Getting a bash shell on your system

A special part of the Unix operating system is the “shell.” This is the system that interprets commands from the user. At times it behaves like an interpreted programming language, and it also has a number of features that help to minimize the amount of typing the user must do to complete any particular

tasks. There are a number of different “shells” that people use. We will focus on one called “bash,” which stands for the “Bourne again shell.” Many of the shells share a number of features.

Many common operating systems are built upon a Unix or upon Linux—an open-source flavor of Unix that is, in many scenarios, indistinguishable. Hereafter we will refer to both Unix and Linux as “Unix” systems). For example all Apple Macintosh computers are built on top of the Berkeley Standard Distribution of Unix and bash is the default shell. Many people these days use laptops that run a flavor of Linux like Ubuntu, Debian, or RedHat. Linux users should ensure that they are running the bash shell. This can be done by typing “bash” at the command line, or inserting that into their profile. To know what shell is currently running you can type:

```
echo $0
```

at the Unix command line. If you are running `bash` the result should be

```
-bash
```

PCs running Microsoft Windows are something of the exception in the computer world, in that they are not running an operating system built on Unix. However, Windows 10 now allows for a Linux Subsystem to be run. For Windows, it is also possible to install a lightweight implementation of bash (like Git Bash). This is helpful for learning how to use Unix, but it should be noted that most bioinformatic tools are still difficult to install on Windows.

2.2 Navigating the Unix filesystem

Most computer users will be familiar with the idea of saving documents into “folders.” These folders are typically navigated using a “point-and-click” interface like that of the Finder in Mac OS X or the File Explorer in a Windows system. When working in a Unix shell, such a point-and-click interface is typically not available, and the first hurdle that new Unix users must surmount is learning to quickly navigate in the Unix filesystem from a terminal prompt. So, we begin our foray into Unix and its command prompt with this essential skill.

When you start a Unix shell in a terminal window you get a *command prompt* that might look something like this:

```
my-laptop:~ me$
```

or, perhaps something as simple as:

```
$
```

or maybe something like:

```
/~/--%
```

We will adopt the convention in this book that, unless we are intentionally doing something fancier, the Unix command prompt is given by a percent sign, and this will be used when displaying text typed at a command prompt, followed by output from the command. For example

```
% pwd  
/Users/eriq
```

shows that I issued the Unix command `pwd`, which instructs the computer to print working directory, and the computer responded by printing `/Users/eriq`, which, on my Mac OS X system is my *home directory*. In Unix parlance, rather than speaking of “folders,” we call them “directories;” however, the two are essentially the same thing. Every user on a Unix system has a home directory. It is the domain on a shared computer in which the user has privileges to create and delete files and do work. It is where most of your work will happen. When you are working in the Unix shell there is a notion of a *current working directory*—that is to say, a place within the hierarchy of directories where you are “currently working.” This will become more concrete after we have encountered a few more concepts.

The specification `/Users/eriq` is what is known as an *absolute path*, as it provides the “address” of my home directory, `eriq`, on my laptop, starting from the *root* of the filesystem. Every Unix computer system has a root directory (you can think of it as the “top-most” directory in a hierarchy), and on every Unix system this root directory always has the special name, `/`. The address of a directory relative to the root is specified by starting with the root (`/`) and then naming each subsequent directory that you must go inside of in order to get to the destination, each separated by a `/`. For example, `/Users/eriq` tells us that we start at the root (`/`) and then we go into the `Users` directory (`Users`) and then, from there, into the `eriq` directory. Note that `/` is used to mean the root directory when at the beginning of an absolute path, but in the remainder of the path its meaning is different: it is used merely as a separator

between directories nested within one another. Figure 2.1 shows an example hierarchy of some of the directories that are found on the author’s laptop.

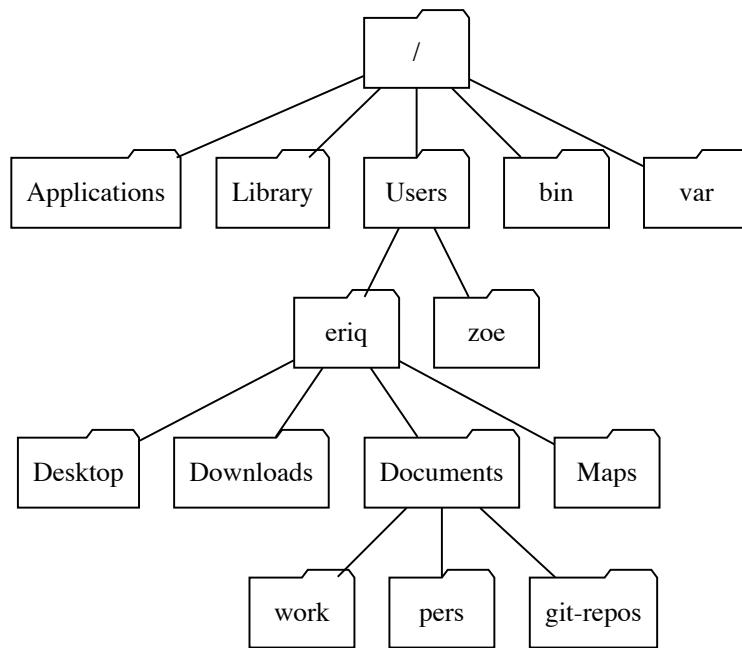


FIGURE 2.1: A partial view of the directories on the author’s laptop.

From this perspective it is obvious that the directory `eriq` lives inside `Users`, and also that, for example, the absolute path of the directory `git-repos` would be `/Users/eriq/Documents/git-repos`.

Absolute paths give the precise location of a directory relative to the root of the filesystem, but it is not always convenient, nor appropriate, to work entirely with absolute paths. For one thing, directories that are deeply nested within many others can have long and unwieldy absolute path names that are hard to type and can be difficult to remember. Furthermore, as we will see later in this book, absolute paths are typically not *reproducible* from one computer’s filesystem to another. Accordingly, it is more common to give the address of directories using *relative paths*. Relative paths work much like absolute paths; however, they do not start with a leading `/`, and hence they do not take as their starting point the root directory. Rather, their starting point is implicitly taken to be the current working directory. Thus, if the current

working directory is `/Users/eriq`, then the path `Documents/pers` is a relative path to the `pers` directory, as can again be seen in Figure 2.1.

The special relative path symbol `..` means “the directory that is one level higher up in the hierarchy.” So, if the current working directory were `/Users/eriq/Documents/git-repos`, then the path `..` would mean `/Users/eriq/Documents`, the path `../work` gives the directory `/Users/eriq/Documents/work`, and, by using two or more `..` symbols separated by forward slashes, we can even go up multiple levels in the hierarchy: `../../../../zoe` is a relative path for `/Users/zoe`, when the current working directory is `/Users/eriq/Documents/git-repos`.

When naming paths, another useful Unix shorthand is `~` (a tilde) which denotes the user’s home directory. This is particularly useful since most of your time in a Unix filesystem will be spent in a directory within your home directory. Accordingly, `~/Documents/work` is a quick shorthand for `/Users/eriq/Documents/work`. This is essential practice if you are working on a large shared computing resource in which the absolute path to your home directory might be changed by the system administrator when restructuring the filesystem.



A useful piece of terminology: in any path, the “final” directory name is called the *basename* of the path. Hence the basename of `/Users/eriq/Documents/git-repos` is `git-repos`. And the basename of `../../../../Users` is `Users`.

2.2.1 Changing the working directory with `cd`

When you begin a Unix terminal session, the current working directory is set, by default, to your home directory. However, when you are doing bioinformatics or otherwise hacking on the command line, you will typically want to be “in another directory” (meaning you will want the current working directory set to some other directory). For this, Unix provides the `cd` command, which stands for `c`hange `d`irectory. The syntax is super simple:

```
cd path
```

where `path` is an absolute or a relative path. For example, to get to the `git-repos` directory from my home directory would require a simple command `cd Documents/git-repos`. Once there, I could change to my `Desktop` directory with `cd ../../Desktop`. Witness:

```
% pwd  
/Users/eriq
```

```
% cd Documents/git-repos/  
% pwd  
/Users/eriq/Documents/git-repos  
% cd ../../Desktop  
% pwd  
/Users/eriq/Desktop
```

Once you have used `cd`, the working directory of your current shell will remain the same no matter how many other commands you issue, until you invoke the `cd` command another time and change to a different directory.

If you give the `cd` command with no path specified, your working directory will be set to your home directory. This is super-handy if you have been exploring the levels of a Unix filesystem above your home directory and cannot remember how to get back to your home directory. Just remember that

```
% cd
```

will get you back home.

Another useful shortcut is to supply `-` (a hyphen) as the path to `cd`. This will change the working directory back to where you were before your last invocation of `cd`, and it will tell you which directory you have returned to. For example, if you start in `/Users/eriq/Documents/git-repos` and then `cd` to `/bin`, you can get back to `git-repos` with `cd -` like so:

```
% pwd  
/Users/eriq/Documents/git-repos  
% cd /bin/  
% pwd  
/bin  
% cd -  
/Users/eriq/Documents/git-repos  
% pwd  
/Users/eriq/Documents/git-repos
```

Note the output of `cd -` is the newly-returned-to current working directory.

2.2.2 Updating your command prompt

When you are buzzing around in your filesystem, it is often difficult to remember which directory you are in. You can always type `pwd` to figure that out,

but the bash shell also provides a way to print the current working directory *within your command prompt*.

For example, the command:

```
PS1='[\W]--% '
```

redefines the command prompt to be the basename of the current directory surrounded by brackets and followed by --%:

```
% pwd  
/Users/eriq/Documents/git-repos  
% PS1='[\W]--% '  
[git-repos]--% cd ../  
[Documents]--% cd ../  
[~]--% cd ../  
[Users]--%
```

This can make it considerably easier to keep track of where you are in your file system.

We will discuss later how to invoke this change automatically in every terminal session when we talk about customizing environments in Section 2.5.

2.2.3 TAB-completion for paths

Let's be frank...typing path names in order to change from one directory to another can feel awfully tedious, especially when your every neuron is screaming, "Why can't I just have a friggin' Finder window to navigate in!" Do not despair. This is a normal reaction when you first start using Unix. Fortunately, Unix file-system navigation can be made much less painful (or even enjoyable) for you by becoming a master of *TAB-completion*. Imagine the Unix shell is watching your every keystroke and trying to guess what you are about to type. If you type the first part of a directory name after a command like `cd` and then hit the TAB key, the shell will respond with its best guess of how you want to complete what you are typing.

Take the file hierarchy of Figure 2.1, and imagine that we are in the root directory. At that point, if we type `cd A`, the shell will think "Ooh! I'll bet they want to change into the directory `Applications` because that is the only directory that starts with `A`. Sure enough, if you hit TAB, the shell adds to the command line so that `cd A` becomes `cd Applications/` and the cursor is still waiting for further input at the end of the command. Boom! That was way easier (and more accurate) than typing all those letters after `A`.

Developing a lightning-fast TAB-completion trigger finger is, quite seriously, essential to surviving and thriving in Unix. Use your left pinky to hit TAB. Hone your skills. Make sure you can hit TAB with your eyes closed. TAB early and TAB often!

Once you can hit TAB instantly from within the middle of any phrase, you will also want to understand a few simple rules of TAB completion:

1. If you try TAB-completing a word on the command line that is not at the beginning of the command line (i.e., you are typing a word after a command like `cd`), then the shell tries to complete the word with a *directory name* or a *file name*.
2. The shell will only complete an *entire* directory or file name if the name *uniquely* matches the first part of the path that has been entered. In our example, there were no other directories than `Applications` in `/` that start with A, so the shell was certain that we must have been going for `Applications`.
3. If there is more than one directory or file name that matches what you have already typed, then, the first time you hit TAB, nothing happens, but the *second* time you hit TAB, the shell will print a list of names that match what you have written so far. For example, in our Figure 2.1 example, hitting TAB after typing `cd ~/D` does nothing. But the second time we hit TAB we get a list of matching names:

```
% cd ~/D  
Desktop/ Documents/ Downloads/
```

So, if we are heading to `Documents` we can see that adding `oc` to our command line, to create `cd Doc` would be sufficient to allow the shell to uniquely and correctly guess where we are heading. `cd Doc` will TAB-complete into `cd Documents/`

4. If there are multiple directory or file names that match the current command line, and they share more letters than those currently on the command line, TAB-completion will complete the name to the end of the shared portion of the name. An example helps: let's say I have the following two directories with hideously long names in my `Downloads` folder:

```
WIFL.rep_indiv_est.mixture_collection.count.gr8-results  
WIFL.rep_indiv_est.mixture_collection.count-results
```

Then, TAB completing on ~/Downloads/WIFL.rep will partially complete so that the prompt and command look like:

```
% cd ~/Downloads/WIFL.rep_indiv_est.mixture_collection.count
```

and hitting TAB twice gives:

```
% cd ~/Downloads/WIFL.rep_indiv_est.mixture_collection.count
WIFL.rep_indiv_est.mixture_collection.count-results
WIFL.rep_indiv_est.mixture_collection.count.gr8-results
```

At this point, adding - and TAB completing will give the first of those directories.

The last example shows just how much typing TAB completion can save you. So, don't be shy about hitting that TAB key. When navigating your filesystem (or writing longer command lines that require paths of files) you should consider hitting TAB after every 1 or 2 letters. In routine work on the command line, probably somewhere around 25% or more of my keystrokes are TABs. Furthermore, a TAB is never going to execute a command, and it typically won't complete to a path that you don't want (unless you got the first part of its name wrong), so there isn't any risk to hitting TAB all the time.

2.2.4 Listing the contents of a directory with ls

So far we have been focusing mostly on directories. However, directories themselves are not particularly interesting—they are merely containers. It is the *files* inside of directories that we typically work on. The command **ls** lists the contents—typically files or other directories—within a directory.

Invoking the **ls** command without any other arguments (without anything after it) returns the contents of the current working directory. In our example, if we are in **/Users** then we get:

```
% ls
eriq zoe
```

By default, **ls** gives output in several columns of text, with the directory contents sorted lexicographically. For example, the following is output from the **ls** command in a directory on a remote Unix machine:

```
% ls
bam map-sliced-fastqs/etc.sh
bam-slices play
bwa-run-list.txt REDOS-map-sliced-fastqs/etc.sh
fastq-file-prefixes.txt sliced
fqslice-22.error slice-fastqs.sh
fqslice-22.log slicer-lines.txt
map-etc.sh Slicer-Logs-summary.txt
```

The first line shows the command prompt and the command: `% ls`, and the remainder is the output of the command.

Invoked without any further arguments, the `ls` command simply lists the contents of the current working directory. However, you can also direct `ls` to list the contents of another directory by simply adding the path (absolute or relative) of that directory on the command line. For example, continuing with the example in Figure 2.1, when we are in the home directory (`eriq`) we can see the directories/files contained within `Documents` like so:

```
[~]--% ls Documents
git-repos/ pers/ work/
```

If you give paths to more than one directory as arguments to `ls`, then the contents of each directory are listed after a heading line that gives the directory's path (as given as an argument to `ls`), followed by a colon. For example:

```
[~]--% ls Documents/git-repos Documents/work
Documents/git-repos:
ARCHIVED_mega-bioinf-pop-gen.zip lowergranite_0.0.1.tar.gz
AssignmentAdustment/ mega-bioinf-pop-gen-examples/
CKMRsim/ microhaps_np/

Documents/work:
assist/ maps/ oxford/ uw_days/
courses_audited/ misc/ personnel/
```

You might also note in the above example, that some of the paths listed within each of the two directories are followed by a slash, `/`. This `ls` customization denotes that they are directories themselves. Much like your command prompt, `ls` can be customized in ways that make its output more informative. We will return to that in Section 2.5.

If you pass the path of a file to `ls`, and that file exists in your filesystem, then `ls` will respond by printing the file's path:

```
% ls Documents/git-repos/lowergranite_0.0.1.tar.gz  
Documents/git-repos/lowergranite_0.0.1.tar.gz
```

If the file does not exist you get an error message to that effect:

```
% ls Documents/try-this-name  
ls: Documents/try-this-name: No such file or directory
```

The multi-column, default output of `ls` is useful when you want to scan the contents of a directory, and quickly see as many files as possible in the fewest lines of output. However, this output format is not well structured. For example, you don't know how many columns are going to be used in the default output of `ls` (that depends on the length of the filenames and the width of your terminal), and it offers little information beyond the names of the files.

You can tell the `ls` command to provide more information, by using it with the `-l` option. Appropriately, with the `-l` option, the `ls` command will return output in *long* format:

```
2019-02-08 21:09 /osu-chinook/--% ls -l  
total 108  
drwxr-xr-x 2 eriq kruegg 4096 Feb 7 08:26 bam  
drwxr-xr-x 14 eriq kruegg 4096 Feb 8 15:56 bam-slices  
-rw-r--r-- 1 eriq kruegg 17114 Feb 7 20:16 bwa-run-list.txt  
-rw-r--r-- 1 eriq kruegg 824 Feb 6 14:14 fastq-file-prefixes.txt  
-rw-r--r-- 1 eriq kruegg 0 Feb 7 20:14 fqslice-22.error  
-rw-r--r-- 1 eriq kruegg 0 Feb 7 20:14 fqslice-22.log  
-rwxr--r-- 1 eriq kruegg 1012 Feb 7 07:59 map-etc.sh  
-rwxr--r-- 1 eriq kruegg 1138 Feb 7 20:56 map-sliced-fastqs-etc.sh  
drwxr-xr-x 3 eriq kruegg 4096 Feb 7 13:01 play  
-rwxr--r-- 1 eriq kruegg 1157 Feb 8 15:08 REDOS-map-sliced-fastqs-etc.sh  
drwxr-xr-x 14 eriq kruegg 4096 Feb 8 15:49 sliced  
-rwxr--r-- 1 eriq kruegg 826 Feb 7 20:09 slice-fastqs.sh  
-rw-r--r-- 1 eriq kruegg 1729 Feb 7 16:11 slicer-lines.txt
```

Each row contains information about only a single file. The first column indicates what kind of file each entry is, and also tells us which users have permission to do certain things with the file (more on this in a few sections). The third and fourth columns show that the owner of each file is `eriq`, who is a user in the group called `kruegg`. After that is the size of the file (in bytes) and the date and time it was last modified.

There are a few options to `ls` that are particularly useful. One is `-a`, which causes `ls` to include in its listing all files, even *hidden* ones. In a Unix file

system, any file whose name starts with a `.` is considered a *hidden* file. Commonly, such files are configuration files or other files used by programs that you typically don't interact with directly. (We will see an example of this when we start working with `git` for version control, Section 9.2.) The `-d` option for `ls` is also quite handy. Recall that when you provide the name of a directory as an argument to `ls`, the default behavior is to list the contents of the directory. This can be troublesome when you are listing the contents of a subdirectory: `ls ~/Documents/git-repos/*` lists the contents (which can be substantial) of each of the directories in my directory, but I might only want to know the name of each of those directories, rather than their full contents. `ls -d ~/Documents/git-repos` will do that for you. Finally, the `-R` option to `ls` will cause the operating system to drill down, *recursively* into all the subdirectories of the one you supplied to the command, and list their contents, as well.

2.2.5 Globbing

If you have ever had to move a large number of files of a certain type from one folder to another in a Finder window, you know that individually clicking and selecting each one and then dragging them can be a tedious task (not to mention the disaster that ensues if you slip on your mouse and end up dropping all the files some place you did not intend). Unix provides a wonderful system called *filename expansion* or “globbing” for quickly providing the names of a large number of files and paths which let's you operate on multiple files quickly and efficiently. In short, globbing allows for *wildcard matching* in path names. This means that you can specify multiple files that have names that share a common part, but differ in other parts.

The most widely used (and the most permissive) wildcard is the asterisk, `*`. It matches anything in a file name. So, for example:

- `*.vcf` will expand to any files in the current directory with the suffix `.vcf`.
- `D*s` will expand to any files that start with an uppercase D and end with an s.
- `*output-*.txt` will expand to any files that include the phrase `output-` somewhere in their name and also end with `.txt`.
- `*` will expand to all files in the current working directory.
- `/usr/local/**/*.sh` will expand to any files ending in `.sh` that reside within any directory that is within the `/usr/local` directory.



Actually, there is some arcana here: Names of files or directories that start with a dot (a period) will not expand unless the dot is included explicitly. Files with names starting with a dot are “hidden” files in Unix. You

also will not see them in the results of `ls`, unless you use the `-a` option: `ls -a`.

After the asterisk, the next most commonly-used wildcard is the question mark, `?`. The question mark denotes any single character in a file name. For example. If you had a series of files that looked like `AA-file.txt`, `AB-file.txt`, ..., `AZ-file.txt`. You could get all those by using `A?-file.txt`. This would not expand to, for example, `AAZ-file.txt`, if that were in the directory.

You can be more specific in globbing by putting things within `[` and `]`. For example: `A[A-D]*` would pick out any files starting with, AA, AB, AC, or AD. Or you could have said `A[a-d]*` which would get any files starting with Aa, Ab, Ac, or Ad. And you can also do it with numbers: `[0-9]`. You can also negate the contents of the `[]`, with `^`. Thus, `100_[^ABC]*` picks out all files that start with `100_` followed by anything that is *not* and A, B, or a C.

Finally, you can be really specific about replacements in file names by iterating over different possibilities with a comma-separated list within curly braces. For example, `img.{png,jpg,svg}` will iterate over the values in curly braces and expand to `img.png img.jpg img.svg`. Interestingly, with curly braces, this forms all those file names whether they exist or not. So, unlike `*` it isn't really matching available file names.

The last thing to note about all of these globbing constructs is that they are not intimately associated with the `ls` command. Rather, they simply provide expansions on the command line, and the the `ls` command is listing all those files. For example, try `echo *.txt`.

2.2.6 What makes a good file-name?

If the foregoing discussion suggests to you that it might not be good to use an actual `*`, `?`, `[`, or `{` in names that you give to files and directories on your Unix system, then congratulations on your intuition! Although you can use such characters in your filenames, they have to be preceded by a backslash, and it gets to be a huge hassle. So don't use them in your file names. Additionally, characters such as `#`, `|`, and `:` do not play well for file names. Don't use them!

Another pet peeve of mine (and anyone who uses Unix) are file names that have spaces in them. In Windows and on a Mac it is easy to create file names that have spaces in them. In fact, the standard Windows system comes with such space-containing directory names as `My Documents` or `My Pictures`. Yikes! Please *don't ever do that in your Unix life!* One can deal with spaces in file names, but there is really no reason to include spaces in your file names, and having spaces in file names will typically break a good many scripts. Rather

than a space, use an underscore, `_`, or a dash, `-`. You've gotta admit that, not only does `My-Documents` work better, but it actually looks better too!

However, should you have to deal with files having spaces in their name, you can address them by either backslash escaping the spaces, or putting the whole file name in quotation marks (single or double quotation marks will work). If you have a file called `dumb file name.jpg`, you can address it on the command line as either of the following three:

```
dumb\ file\ name.jpg
"dumb file name.jpg"
'dumb file name.jpg'
```

To make your life easier, however, the bottom line is that you should name your files on a Unix system using only upper- and lowercase letters (Unix file systems are case-sensitive), numerals, and the following three punctuation characters: `.`, `-`, and `_`. Though you can use other punctuation characters, they often require special treatment, and it is better to avoid them altogether.

2.3 The anatomy of a Unix command

Nearly every Unix command that you might invoke follows a certain pattern. First comes the `command` itself. This is the word that tells the system the name of the command that you are actually trying to do. After that, often, you will provide a series of *options* that will modify the behavior of the command (for example, as we have seen, `-l` is an option to the `ls` command). Finally, you might then provide some *arguments* to the functions. These are typically paths to files or directories that you would like the command to operate on. So, in short, a typical Unix command invocation will look like this:

`command options arguments`

Of course, there are exceptions. For example, when invoking Java-based programs from your shell, arguments might be supplied in ways that make them look like options, etc. But, for the most part, the above is a useful way of thinking about Unix commands.

Sometimes, especially when using `samtools` or `bcftools`, the `command` part of the command line might include a command and a subcommand, like `samtools view` or `bcftools query`. This means that the operating system is calling the program `samtools` (for example), and then `samtools` interprets the next token (`view`) to know that it needs to run the `view` routine, and interpret all following options in that context.

We will now break down each element in “`command options arguments`”.

2.3.1 The `command`

When you type a command at the Unix prompt, whether it is a command like `ls` or one like `samtools` (Section ??), the Unix system has to search around the filesystem for a file that matches the command name and which provides the actual instructions (the computer code, if you will) for what the command will actually do. It cannot be stressed enough how important it is to understand where and how the bash shell searches for these command files. Understanding this well, and knowing how to add directories that the shell searches for executable commands will alleviate a lot of frustration that often arises with Unix.

In brief, all Unix shells (and the bash shell specifically) maintain what is called an *environment variable* called `PATH` that is a colon-separated list of pathnames where the shell searches for commands. You can print the `PATH` variable using the `echo` command:

```
echo $PATH
```

On a freshly installed system without many customizations the `PATH` might look like:

```
/usr/bin:/bin:/usr/sbin:/sbin
```

which is telling us that, when bash is searching for a command, it searches for a file of the same name as the command first in the directory `/usr/bin`. If it finds it there, then it uses the contents of that file to invoke the command. If it doesn’t find it there, then it next searches for the file in directory `/bin`. If it’s not there, it searches in `/usr/sbin`, and finally in `/sbin`. If it does not find the command in any of those directories then it returns the error `command not found`.

When you install programs on your own computer system, quite often the installer will modify a system file that specifies the `PATH` variable upon startup. Thus after installing some programs that use the command line on a Mac system, the “default” `PATH` might look like:

```
/usr/local/bin:/usr/bin:/bin:/usr/sbin:/sbin:/opt/X11/bin:/Library/TeX/texbin
```

2.3.2 The *options*

Sometimes these are called flags, and they provide a convenient way of telling a Unix command how to operate. We have already seen a few of them, like the `-a`, `-l` or `-d` options to `ls`.

Most, but not all, Unix tools follow the convention that options specified by a single letter follow a single dash, while those specified by multiple letters follow two dashes. Thus, the `tar` command takes the single character options `-x`, `-v`, and `-f`, but also takes an option named like `--check-links`. Some utilities also have two different names—a single-letter name and a long name—for many options. For example, the `bcftools view` program uses either `-a` or `--trim-alt-alleles` to invoke the option that trims alternate alleles not seen in a given subset of individuals. Other tools, like BEAGLE, are perfectly happy with options that are named with multiple letters following just a single dash.

Sometimes options take parameter values, like `bcftools view -g het`. In that case, `het` is a parameter value. Sometimes the parameter values are added to the option with an equals-sign.

With some unix utilities' single-letter options can be bunched together following a single dash, like, `tar -xvf` being synonymous with `tar -x -v -f`. This is not universal, and it is not recommended to expect it.

Holy Cow! This is not terribly standardized, and probably won't make sense till you really get in there and starting playing around in Unix...

2.3.3 Arguments

These are often file names, or other things that are not preceded by an option flag. For example, in the `ls` command:

```
ls -lrt dir3
```

`-lrt` is giving `ls` the options `-l`, `-r`, and `-t` and `dir3` is the *argument*—the name of the directory whose contents you should list.

2.3.4 Getting information about Unix commands

Zheesh! The above looks like a horrible mish-mash. How do we find out how to use/invoke different commands and programs in Unix? Well, most programs are documented, and you have to learn how to read the documentation.

If a utility is properly installed, you should be able to find its manual page with the `man` command. For example, `man ls` or `man tar`. These “man-pages”,

as the results are called, have a fairly uniform format. They start with a summary of what the utility does, then show how it is invoked and what the possible options are by showing a skeleton in the form:

“*command options arguments*”

and usually square brackets are put around things that are not required. This format can get quite ugly and hard to parse for an old human brain, like mine, but stick with it.

If you don’t have a man-page for a program, you might try invoking the program with the `--help` option, or maybe with no option at all.

2.4 Handling, Manipulating, and Viewing files and streams

In Unix, there are two main types of files: *regular files* which are things like text files, figures, etc.—Anything that holds data of some sort. And then there are “special” files, which include *directories* which you’ve already seen, and *symbolic links* which we will talk about later.

2.4.1 Creating new directories

You can make a new directory with:

```
mkdir path
```

where `path` is a path specification (either absolute or relative). Note that if you want to make a directory within a subdirectory that does currently not exist, for example:

```
mkdir new-dir/under-new-dir
```

when `new-dir` does not already exist, then you have to either create `new-dir` first, like:

```
mkdir new-dir  
mkdir new-dir/under-new-dir
```

or you have to use the `-p` option of `mkdir`, which creates all necessary parent directories as well, like:

```
mkdir -p new-dir/under-new-dir
```

If there is already a file (regular or directory) with the same path specification as a directory you are trying to create, you will get an error from `mkdir`.

2.4.2 Fundamental file-handling commands

For the day-to-day business of moving, copying, or removing files in the file system, the three main Unix commands are:

- `mv` for moving files and directories
- `cp` for copying files and directories
- `rm` for removing files and directories

These obviously do different things, but their syntax is somewhat similar.

2.4.2.1 mv

`mv` can be invoked with just two arguments like:

```
mv this there
```

which moves the file (or directory) from the path `this` to the path `there`.

- If `this` is a regular file (i.e. not a directory), and:
 - `there` is a directory, `this` gets moved inside of `there`.
 - `there` is a regular file that exists, then `there` will get overwritten, becoming a regular file that holds the contents of `this`.
 - `there` does not exist, it will be created as regular file whose contents are identical to those of `this`.
- If `this` is a directory and:
 - `there` does not exist in the filesystem, the directory `there` will be made and its contents will be the (former) contents of `this`
 - if `there` already exists, and is a directory, then the directory `this` will be moved inside of the directory `there` (i.e. it will become `there/this`).
 - if `there` already exists, but is not a directory, then nothing will change in the filesystem, but an error will be reported. In all cases, whatever used to exist at path `this` will no longer be found there.

And `mv` can be invoked with multiple arguments, in which case the last one must be a directory *that already exists* that receives all the earlier arguments inside it. So, if you already have a directory named `dest_dir` then you can move a lot of things into it like:

```
mv file1 file2 dir1 dir2 dest_dir
```

You can also write that as as

```
mv file1 file2 dir1 dir2 dest_dir/
```

which makes its meaning a little more clear, but there is no requirement that the final argument have a trailing /.

Note, if any files in `dest_dir` have the same name as the files you are moving into `dest_dir` they *will* get overwritten.

So, you have gotta be careful not to overwrite stuff that you don't want to overwrite.

2.4.2.2 cp

This works much the same way as `mv` with two different flavors:

```
cp this there
```

and

```
cp file1 file2 dest_dir  
# or  
cp file1 file2 dest_dir/
```

The result is very much like that of `mv`, but instead of moving the file from one place to another (an operation that can actually be done without moving the data within the file to a different place on the hard drive), the `cp` command actually makes a full copy of files. Note that, if the files are large, this can take a long time.

2.4.2.3 rm

Finally we get to the very spooky `rm` command, which is short for “remove.” If you say “`rm myfile.txt`” the OS will remove that file from your hard drive’s directory. The data that were in the file might live on for some time on your hard drive—in other words, by default, `rm` does not wipe the file off your hard drive, but simply “forgets” where to look for that file. And the space that file took up on your hard drive is no longer reserved, and could easily be overwritten the next time you write something to disk. (Nonetheless, if you do `rm` a file, you should never expect to be able to get it back). So, be very careful

about using `rm`. It takes an `-r` option for recursively removing directories *and* all of their contents.

When used in conjunction with globbing, `rm` can be very useful. For example, if you wanted to remove all the files in a directory with a `.jpg` extension, you would do `rm *.jpg` from within that directory. However, it's a disaster to accidentally remove a number of files you might not have wanted to. So, especially as you are getting familiar with Unix, it is worth it to experiment with your globbing using `ls` first, to see what the results are, and only when you are convinced that you won't remove any files you really want should you end up using `rm` to remove those files.

2.4.3 “Viewing” Files

In a typical GUI-based environment, when you interact with files on your computer, you typically open the files with some application. For example, you open Word files with Microsoft Word. When working on the Unix shell, that same paradigm does not really exist. Rather, (apart from a few cases like the text editors, `nano`, `vim` and `emacs`, instead of opening a file and letting the user interact with it the shell is much happier just streaming the contents of the file to the terminal.

The most basic of such commands is the `cat` command, which *catenates* the contents of a file into a very special *data stream* called `stdout`, which is short for “standard output.” If you don’t provide any other instruction, data that gets streamed to `stdout` just shoots by on your terminal screen. If the file is very large, it might do this for a long time. If the file is a *text file* then the data in it can be written out in letters that are recognizable. If it is a *binary file* then there is no good way to represent the contents as text letters, and your screen will be filled with all sorts of crazy looking characters.

It is generally best not to `cat` very large files, especially binary ones. If you do and you need to stop the command from continuing to spew stuff across your screen, you can type `cntrl-c` which is the universal Unix command for “kill the current process happening on the shell.” Usually that will stop it.



A note regarding terminals: On a Mac, the Terminal app is quite fast at spewing text across the screen. Megabytes of text or binary gibberish can flash by in seconds flat. This is not the case with the terminal window within RStudio, which can be abysmally slow, and usually doesn't store many lines of output.

Sometimes you want to just look at the top of a file. The `head` command shows you the first 10 lines of a file. That is valuable. The `less` command

shows a file one screenful at a time. You can hit the space bar to see the next screenful, and you can hit **q** to quit viewing the file.

Try navigating to a file and using **cat**, **head**, and **less** on it.

One particularly cool thing about **cat** is that if you say

```
cat file1 file2
```

it will concatenate the contents of both files, in order, to *stdout*.

Now, one Big Important Unix fact is that many programs written to run in the Unix shell behave in the same way regarding their output: they write their output to *stdout*. We have already seen this with **ls**: its output just gets written to the screen, which is where *stdout* goes by default.

2.4.4 Redirecting standard output: **>** and **>>**

Unix starts to get really fun when you realize that you can “redirect” the contents of *stdout* from any command (or group of commands...see the next chapter!) to a file. To do that, you merely follow the command (and all its options and arguments) with **> path** where **path** is the path specifying the file into which you wish to redirect *stdout*.

Witness, try this:

```
# echo three lines of text to a file in the /tmp directory
echo "bing
bong
boing" > /tmp/file1

# echo three more lines of text to another file
echo "foo
bar
baz" > /tmp/file2

# now view the contents of the first file
cat /tmp/file1

# and the second file:
cat /tmp/file2
```

It is important to realize that when you redirect output into a file with **>**, any contents that previously existed in that file will be deleted (wiped out!). So be

careful about redirecting. Don't accidentally redirect output into a file that has valuable data in it.

The `>>` redirection operator does not delete the destination file before it redirects output into it. Rather, `>> file` means "append `stdout` to the contents that already exist in `file`." This can be very useful sometimes.

2.4.5 `stdin`, `<` and `|`

Not only do most Unix-based programs deliver output to standard output, but most utilities can also receive input from a file stream called `stdin` which is short for "standard input."

If you have data in a file that you want to send into standard input for a utility, you can use the `<` like this:

```
command < file
```

But, since most Unix utilities also let you specify the file as an argument, this is not used very much.

However, what is used all the time in Unix, and it is one of the things that makes it super fun, is the pipe, `|`, which says, "take `stdout` coming out of the command on the left and redirect it into `stdin` going into the command on the right of the pipe.

For example, if I wanted to count the number of files and directories stored in my `git-repos` directory, I could do

```
% ls -dl Documents/git-repos/* | wc  
174      1566    14657
```

which pipes the output of `ls -dl` (one line per file) into the `stdin` for the `wc` command, which counts the number of lines, words, and letters sent to its standard input. So, the output tells me that there are 174 files and directories in my directory `Documents/git-repos`.

Note that pipes and redirects can be combined in sequence over multiple operations or commands. This is what gives rise to the terminology of making "Unix pipelines:" the data are like streams of water coming into or out of different commands, and the pipes hook up all those streams into a pipeline.

2.4.6 stderr

While output from Unix commands is often written to *stdout*, if anything goes wrong with a program, then messages about that get written to a different stream called *stderr*, which, you guessed it! is short for “standard error”. By default, both *stdout* and *stderr* get written to the terminal, which is why it can be hard for beginners to think of them as separate streams.

But, indeed, they are. Redirecting *stdout* with `>`, that does **not** redirect *stderr*.

For example. See what happens when we ask `ls` to list a file that does not exist:

```
[~]--% ls file-not-here.txt  
ls: file-not-here.txt: No such file or directory
```

The error message comes back to the screen. If you redirect the output it still comes back to the screen!

```
[~]--% ls file-not-here.txt > out.txt  
ls: file-not-here.txt: No such file or directory
```

If you want to redirect *stderr*, then you need to specify which stream it is. On all Unix systems, *stderr* is stream #2, so the `2>` syntax can be used:

```
[~]--% ls file-not-here.txt 2> out.txt
```

Then there is no output of *stderr* to the terminal, and when you `cat` the output file, you see that it went there!

```
[~]--% cat out.txt  
ls: file-not-here.txt: No such file or directory
```

Doing bioinformatics, you will find that there will be failures of various programs. It is essential when you write bioinformatic pipelines to redirect *stderr* to a file so that you can go back, after the fact, to sleuth out why the failure occurred. Additionally, some bioinformatic programs write things like progress messages to *stderr* so it is important to know how to redirect those as well.

2.4.7 Symbolic links

Besides regular files and directories, a third type of file in Unix is called a *symbolic link*. It is a special type of file whose contents are just an absolute or

a relative path to another file. You can think of symbolic links as “shortcuts” to different locations in your file system. There are many useful applications of symbolic links.

Symbolic links are made using the `ln` command with the `-s` option. For example, if I did this in my home directory:

```
[~]--% ln -s /Users/eriq/Documents/git-repos/srsStuff srs
```

then `srs` becomes a file whose full listing (from `ls -l srs`) looks like:

```
lrwxrwxr-x 1 eriq staff 40B Jan 9 19:24 srs@ -> /Users/eriq/Documents/git-repos/srsS
```

2.4.8 File Permissions

Unix systems often host many different users. Some users might belong to the same research group, and might like to be able to read the files (and/or use the programs) that their colleagues have in their accounts.

The Unix file system uses a system of permissions that gives rights to various classes of users to read, write, or execute files. The permissions associated with a file can be viewed using `ls -l`. They are captured in the first column which might look something like `-rwxr-xr-x`. When you first start looking at these, they can be distressingly difficult to visually parse. But you will get better at it! Let’s start breaking it down now.

The file description string, in a standard Unix setting, consists of 10 characters.

- The first tells what kind of file it is: `-` = regular file, `d` = directory, `l` = symbolic link.
- The next group of three characters denote whether the owner/user of the file has permission to either read, write, or execute the file.
- The following two groups of three characters are the same thing for users within the users group, and for all other users, respectively.

Here is a figure from the web¹ that we can talk about:



Permissions can be changed with the chmod command. We will talk in class about how to use it with the octal representation of permissions.

2.4.9 Editing text files at the terminal

Sometimes you might need to edit text files at the command line.

The easiest text editor to use on the command line is nano. Try typing nano a-file.txt and type a few things. It is pretty self explanatory.

¹<https://unix.stackexchange.com/questions/183994/understanding-unix-permissions-and-file-types>

2.5 Customizing your Environment

Previously we saw how to modify your command prompt to tell you what the current working directory is (remember `PS1='[\W]\--% '`). The limitation of giving that command on the command line is that if you logout and then log back in again, or open a new Terminal window, you will have to reissue that command in order to achieve the desired look of your command prompt. Quite often a Unix user would like to make a number of customization to the look, feel, and behavior of their Unix shell. The bash shell allows these customization to be specified in two different files that are read by the system so as to invoke the customization. The two files are hidden files in the home directory: `~/.bashrc` and `~/.bash_profile`. They are used by the Unix system in two slightly different contexts, but for most purposes, you, the user, will not need or even want to distinguish between the different contexts. Managing two separate files of customization is unnecessary and requires duplication of your efforts, and can lead to inconsistent and confusing results, so here is what we will do:

1. Keep all of our customization in `~/.bashrc`.
2. Insert commands in `~/.bash_profile` that say, "Hey computer! If you are looking for customization in here, don't bother, just get them straight out of `~/.bashrc`.

We take care of #2, by creating the file `~/.bash_profile` to have the following lines in it:

```
if [ -f ~/.bashrc ]; then
    source ~/.bashrc
fi
```

Taking care of #1 is now just a matter of writing commands into `~/.bashrc`. In the following are some recommended customization.

2.5.1 Appearances matter

Some customization just change the way your shell looks or what type of output is given from different commands. Here are some lines to add to your `~/.bashrc` along with some discussion of each.

```
export PS1='[\W]--% '
```

This gives a tidier and more informative command prompt. The `export` command before it tells the system to pass the value of this *environment variable*, `PS1`, along to any other shells that get spawned by the current one.

```
alias ls='ls -GFh'
```

This makes it so that each time you invoke the `ls` command, you do so with the options `-G`, `-F`, and `-h`. To find out on your own what those options do, you can type `man ls` at the command line and read the output, but briefly: `-G` causes directories and different file types to be printed in different colors, `-F` causes a `/` to be printed after directory names, and other characters to be printed at the end of the names of different file types, and `-h` causes file sizes to be printed in an easily human-readable form when using the `-l` option.

2.5.2 Where are my programs/commands at?!

We saw in Section 2.3.1 that bash searches the directories listed in the `PATH` variable to find commands and executables. You can modify the `PATH` variable to include directories where you have installed different programs. In doing so, you want to make sure that you don't lose any of the other directories in `PATH`, so there is a certain way to go about redefining `PATH`. If you want to add the path `/a-new/program/directory` to your `PATH` variable you do it like this:

```
PATH=$PATH:/a-new/program/directory
```

2.6 A Few More Important Keystrokes

If a command “gets stuck” or is running longer than it should be, you can usually kill/quit it by doing `ctrl-c`.

Once you have given a command, it gets stored in your bash history. You can use the up-arrow key to cycle backward through different commands in your history. This is particularly useful if you are building up complex pipelines on the command line piece by piece, looking at the output of each to make sure

it is correct. Rather than re-typing what you did for the last command line, you just up-arrow it.

Once you have done an up-arrow or two, you can cycle back down through your history with a down-arrow.

Finally, you can search through your bash history by typing **cntrl-r** and then typing the word/command you are looking for. For example, if, 100 command lines back, you used a command that involved the program **awk**, you can search for that by typing **cntrl-r** and then typing **awk**.

One last big thing to note: the **#** is considered a *comment character* in bash. This means that any text following a **#** (unless it is backslash-escaped or inside quotation marks), until the next line ending, will be ignored by the shell.

2.7 A short list of additional useful commands.

Everyone should be familiar with the following commands, and the options that follow them on each line below. One might even think of scanning the manual page for each of these:

- **echo**
- **cat**
- **head, -n, -c**
- **tail, -n**
- **less**
- **sort, -n -b -k**
- **paste**
- **cut, -d**
- **tar, -cvf, -xvf**
- **gzip, -c**
- **du, -h -C,**
- **wc**
- **date**
- **uniq**
- **chmod, u+x, ug+x**
- **grep**

2.8 Two important computing concepts

2.8.1 Compression

Most file storage types (like text files) are a bit wasteful in terms of file space: every character in a text file takes the same number of bytes to store, whether it is a character that is used a lot, like `s` or `e`, or whether it is a character that is seldom seen in many text files, like `^`. *Compression* is the art of creating a code for different types of data that uses fewer bits to encode “letters” (or “chunks” of data) that occur frequently and it reserves codewords of more bits to encode less frequently occurring chunks in the data. The result is that the total file size is smaller than the uncompressed version. However, in order to read it, the file must be decompressed.

In bioinformatics, many of the files you deal with will be compressed, because that can save many terabytes of disk space. Most often, files will be compressed using the `gzip` utility, and they can be uncompressed with the `gunzip` command. Sometimes you might want to just look at the first part of a compressed file. If the file is compressed with `gzip`, you can decompress to `stdout` by using `gzcat` and then pipe it to `head`, for example.

A central form of compression in bioinformatics is called `bgzip` compression which compresses files into a series of blocks of the same size, situated in such a way that it is possible to *index* the contents of the file so that certain parts of the file can be accessed without decompressing the whole thing. We will encounter indexed compressed files a lot when we start dealing with BAM and `vcf.gz` files.

2.8.2 Hashing

The final topic we will cover here is the topic of hashing, an in particular the idea of “fingerprinting” files on one’s computer. This process is central to how the git version control system works, and it is well worth knowing about.

Any file on your computer can be thought of as a series of bits, 0’s and 1’s, as fundamentally, that is what the file is. A *hashing algorithm* is an algorithm that maps a series of bits (of arbitrary length) to a short sequence of bits. The SHA1 hashing algorithm maps arbitrary sequences of bits to a sequence of 160 bits.

There are $2^{160} \approx 1.46 \times 10^{48}$ possible bit sequences of length 160. That is a vast number. If your hashing algorithm is well randomized, so that bit sequences are hashed into 160 bits in a roughly uniform distribution, then it is exceedingly

unlikely that any two bit sequences (i.e. files on your filesystem) will have the same hash (“fingerprint”) unless they are perfectly identical. As hashing algorithms are often quite fast to compute, this provides an exceptionally good way to verify that two files are identical.

The SHA1 algorithm is implemented with the `shasum` command. In the following, as a demonstration, I store the recursive listing of my `git-repos` directory into a file and I hash it. Then I add just a single line ending to the end of the file, and hash that, to note that the two hashes are not at all similar even though the two files differ by only one character:

```
[~]--% ls -R Documents/git-repos/* > /tmp/gr-list.txt
[~]--% # how many lines is that?
[~]--% wc /tmp/gr-list.txt
      93096    88177  2310967 /tmp/gr-list.txt
[~]--% shasum /tmp/gr-list.txt
1396f2fec4eebdee079830e1eff9e3a64ba5588c  /tmp/gr-list.txt
[~]--% # now add a line ending to the end
[~]--% (cat /tmp/gr-list.txt; echo) > /tmp/gr-list2.txt
[~]--% # hash both and compare
[~]--% shasum /tmp/gr-list.txt /tmp/gr-list2.txt
1396f2fec4eebdee079830e1eff9e3a64ba5588c  /tmp/gr-list.txt
23bff8776ff86e5ebbe39e11cc2f5e31c286ae91  /tmp/gr-list2.txt
[~]--% # whoa! cool.
```

2.9 Unix: Quick Study Guide

This is just a table with quick topics/commands/words in it. You should understand each and be able to tell a friend a lot about each one. Cite it as [2.1](#)

TABLE 2.1: Terms/ideas/etc. to know forward and backward

bash	absolute path	relative path
/ at beginning of path	/ between directories	home directory
~	current working directory	<code>pwd</code>
<code>cd</code>	.	..
<code>cd -</code>	basename	PS1
TAB-completion	<code>ls (-a, -d, -R)</code>	globbing
*	?	[0-9]
[a-z]	[^CDcd]	{png,jpg,pdf}

TABLE 2.1: Terms/ideas/etc. to know forward and backward

echo	<i>man command</i>	mkdir
mv	cp	rm
cat	head	less
<i>stdout</i>	<i>stdin</i>	<i>stderr</i>
>	<	
ln -s	symbolic link	PATH
-rw-r--r--	.bashrc	.bash_profile
sort, -n -b -k	paste	cut, -d
tar, -cvf, -xvf	gzip	du, -h -C,
wc	date	uniq
ctrl-c	ctrl-r	#
up-arrow/down-arrow	chmod, ug+x, 664	grep



3

Shell programming

In our first foray into Unix and the shell, we restricted ourselves mostly to navigating the file system, handling files, and working with streams of data (via redirection and pipes). These are all crucial skills, but the bash shell becomes truly powerful when we start to adopt it as a sort of programming language. That's right, even though the functionality of bash is geared toward running jobs and calling commands, it still exhibits most of the features expected in a programming language, like variables, iteration and flow control.

We start this section by taking a look at a short bash program (typically called a *script*) that the author wrote in order to efficiently download (clone, really) repositories from GitHub that have been submitted by students to GitHub Classroom. The program is not long, but exhibits many useful features of bash as a programming language. If you are reading this, not in the context of a class with lectures, just go ahead and read through it and see if you can figure out what is going on in each line of the script. Afterward, we will address many features of bash by referencing different parts of the script.

The script, which happens to be stored in a file called `clone-classroom-repos.sh` is printed below, with linenumbers, since we will be referring back to specific sections of the script later.

```
1 #!/bin/bash
2
3 # define a function to print the usage or "help" for the script
4 function usage {
5     echo Syntax:
6     echo " $(basename $0) GH_Prefix Repo_Prefix Branch Dir"
7
8     GH_Prefix: the URL of the GitHub site where the repository exists.
9     Repo_Prefix: the prefix of the name of each repository to be cloned.
10    Branch: the name of the branch to create and switch to in the repository,
11        once the repo has been cloned.
12    Dir: path to the directory (will be created if necessary) to clone all
13        the repositories to.
14
15 Example:
```

```
16      $(basename $0)  https://github.com/CSU-con-gen-bioinformatics-2020 illumina-video-q
17      "
18      echo
19  }
20
21
22 # test for right number of required args. If not, print usage message
23 if [ $# -ne 4 ]; then
24     usage;
25     exit 1;
26 fi
27
28 # copy positional parameters into other variables
29 GHP=$1
30 RP=$2
31 BRANCH=$3
32 DD=$4
33
34 # assign string with student GitHub handles into a variable
35 GHNAMES="AmandaCicchino
BrennaF
CaitlinWells
EllenMCampbell
FayDong
LibbyGH
NathanPhipps
RGCheek
Ronan17
abeulke
carolazari
cbossu
ccolumbu
elenacorrea
eriqande
jenleon07
kimhoke
kruegg
lauracgoetz
mdrodi110
mgdesaix
raven-wings
seamus100
taylorbobowski
wcfunk"
```

```
60
61 # assign my GitHub username to the variable USER
62 USER=eriqande
63
64 # assign the current working directory to the variable RUNDIR
65 RUNDIR=$PWD
66
67 # make a new directory named whatever the user wanted for the output directory
68 mkdir -p $DD
69
70 # make variables to hold log and error file names
71 LOG=${PWD}/${RP}log
72 ERR=$LOG.stderr
73
74 # print the date/time when the process is starting
75 echo "STARTING at $(date)"
76
77 # make a clean slate. remove any files with the name
78 # of the error output file
79 rm -f $ERR
80
81 # cycle over the student GitHub names, and for each one *do*
82 # the commands that appear before the *done* keyword. Indenting
83 # is used to make it easier to read, but is not essential.
84 for L in $GHNAMES; do
85
86     echo "Working on $L, starting at $(date)" # print a progress line to stdout
87     REPO=$GHP/${RP}$L # combine variables into new variables that
88     echo $REPO # hold the URL for the repository to be
89     DEST=$DD/$L # cloned and the path where it should be cloned to
90
91     # store the commands themselves into variables. Note the
92     # use of double quotes.
93     CLONE_IT="git clone ${REPO}/github.com/$USER@github.com} $DEST"
94     BRANCH_IT="git checkout -B $BRANCH"
95     PUSH_IT="git push -u origin $BRANCH"
96
97     # now, run those commands, chained together by exit-status-AND
98     # operators (so it will stop if any one part fails), while
99     # all the while appending error statements to the Error file. Run it
100    # all within an "if" statement so you can deliver a report as to
101    # whether the whole shebang succeeded or failed.
102
103    if $CLONE_IT 2>> $ERR && \
```

```

104      cd $DEST && \
105      $BRANCH_IT 2>> $ERR && \
106      $PUSH_IT 2>> $ERR && \
107      cd $RUNDIR # at the very end make sure to return to the original working directo
108  then
109      echo "FULL SUCCESS $L"
110  else
111      echo "FAILURE SOMEWHERE WITHIN $L"
112      cd $RUNDIR # get back to the working directory from which the original command wa
113                      # so we are ready to handle the next student repo.
114  fi
115
116 done # signifies the end of the for loop we are cycling over

```

If my current working directory is where the script resides, I can run it like this:

```
% ./clone-classroom-repos.sh
```

And if I wanted to be fancy, I could put the script in a directory (like `~/bin` perhaps) that I have included in my `PATH` variable. In which case I could run it like:

```
% clone-classroom-repos.sh
```

from anywhere on my computer.

When I run the script in any of those two ways, because I have not provided the proper number of *arguments* to the command, it returns a message telling me what syntax is required to use it (i.e., its *usage syntax*):

```

% clone-classroom-repos.sh
Syntax:
clone-classroom-repos.sh GH_Prefix Repo_Prefix Branch Dir

GH_Prefix: the URL of the GitHub site where the repository exists.
Repo_Prefix: the prefix of the name of each repository to be cloned.
Branch: the name of the branch to create and switch to in the repository,
        once the repo has been cloned.
Dir: path to the directory (will be created if necessary) to clone all
     the repositories to.

```

Example:

```
clone-classroom-repos.sh https://github.com/CSU-con-gen-bioinformatics-2020 illumina-video-questions
```

That is handy, and the code to do it exists in the script itself. Looking at the output, how many arguments do you think the script is expecting?

Now, if I wanted to clone all of the student GitHub repos associated with the `illumina-video-questions` homework set, and then, once cloned, set up a new git `branch` called `eric-edits` so that I can make edits and/or comments and send those to students via a pull request, here is the command I would give (remembering, again that the % signifies the command prompt, here):

```
% clone-classroom-repos.sh https://github.com/CSU-con-gen-bioinformatics-2020 illumina-video-questions
```

And when I do, I see output like this:

```
STARTING at Thu Feb 13 06:02:05 MST 2020
Working on AmandaCicchino, starting at Thu Feb 13 06:02:05 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-AmandaCicchino
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS AmandaCicchino
Working on BrennaF, starting at Thu Feb 13 06:02:07 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-BrennaF
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS BrennaF
Working on CaitlinWells, starting at Thu Feb 13 06:02:08 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-CaitlinWells
FAILURE SOMEWHERE WITHIN CaitlinWells
Working on EllenMCampbell, starting at Thu Feb 13 06:02:09 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-EllenMCampbell
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS EllenMCampbell
Working on FayDong, starting at Thu Feb 13 06:02:10 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-FayDong
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS FayDong
Working on LibbyGH, starting at Thu Feb 13 06:02:12 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-LibbyGH
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS LibbyGH
Working on NathanPhipps, starting at Thu Feb 13 06:02:14 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-NathanPhipps
Branch erics-edits set up to track remote branch erics-edits from origin.
```

```
FULL SUCCESS NathanPhipps
Working on RGCheek, starting at Thu Feb 13 06:02:15 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-RGCheek
Branch erics-edits set up to track remote branch erics-edits from origin.

FULL SUCCESS RGCheek
Working on Ronan17, starting at Thu Feb 13 06:02:17 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-Ronan17
Branch erics-edits set up to track remote branch erics-edits from origin.

FULL SUCCESS Ronan17
Working on abeulke, starting at Thu Feb 13 06:02:19 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-abeulke
Branch erics-edits set up to track remote branch erics-edits from origin.

FULL SUCCESS abeulke
Working on carolazari, starting at Thu Feb 13 06:02:21 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-carolazari
Branch erics-edits set up to track remote branch erics-edits from origin.

FULL SUCCESS carolazari
Working on cbossu, starting at Thu Feb 13 06:02:23 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-cbossu
Branch erics-edits set up to track remote branch erics-edits from origin.

FULL SUCCESS cbossu
Working on ccolumbu, starting at Thu Feb 13 06:02:25 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-ccolumbu
Branch erics-edits set up to track remote branch erics-edits from origin.

FULL SUCCESS ccolumbu
Working on elenacorrea, starting at Thu Feb 13 06:02:26 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-elenacorrea
Branch erics-edits set up to track remote branch erics-edits from origin.

FULL SUCCESS elenacorrea
Working on eriqande, starting at Thu Feb 13 06:02:28 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-eriqande
Branch erics-edits set up to track remote branch erics-edits from origin.

FULL SUCCESS eriqande
Working on jenleon07, starting at Thu Feb 13 06:02:29 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-jenleon07
FAILURE SOMEWHERE WITHIN jenleon07

Working on kimhoke, starting at Thu Feb 13 06:02:30 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-kimhoke
FAILURE SOMEWHERE WITHIN kimhoke

Working on kruegg, starting at Thu Feb 13 06:02:30 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-kruegg
FAILURE SOMEWHERE WITHIN kruegg

Working on lauracgoetz, starting at Thu Feb 13 06:02:30 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-lauracgoetz
FAILURE SOMEWHERE WITHIN lauracgoetz
```

```

Working on mdrod110, starting at Thu Feb 13 06:02:31 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-mdrod110
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS mdrod110

Working on mgdesaix, starting at Thu Feb 13 06:02:32 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-mgdesaix
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS mgdesaix

Working on raven-wings, starting at Thu Feb 13 06:02:34 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-raven-wings
FAILURE SOMEWHERE WITHIN raven-wings

Working on seamus100, starting at Thu Feb 13 06:02:34 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-seamus100
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS seamus100

Working on taylorbobowski, starting at Thu Feb 13 06:02:36 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-taylorbobowski
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS taylorbobowski

Working on wcfunk, starting at Thu Feb 13 06:02:37 MST 2020
https://github.com/CSU-con-gen-bioinformatics-2020/illumina-video-questions-wcfunk
Branch erics-edits set up to track remote branch erics-edits from origin.
FULL SUCCESS wcfunk

```

From that report, it is clear that it takes about 1 to 2 seconds to handle each repository. If I were doing each repository by hand, (i.e. cloning and branching through a GUI interface like RStudio's) each repository would probably take me about 30 seconds to a minute, with a lot of copying and pasting and chance for errors, and I would have destroyed my wrists with all the repetitive tasks. So, this is a HUGE deal.

It is also easy to scan through the results and see, “Holy Moly! These are some dedicated students!” Everyone has successfully submitted their homework repositories (and thus we were **SUCCESS-ful** in cloning them), except for a handful who were traveling or otherwise occupied and had warned me they wouldn’t be able to do the assignment.

When all is said and done, I have the following git repositories on my laptop which I can peruse at my leisure:

```
% ls /tmp/illumina-questions/
AmandaCicchino/ FayDong/      RGCheek/        carolazari/      elenacorrea/      mgdesaix/
BrennaF/          LibbyGH/       Ronan17/        cbossu/         eriqande/       seamus100/
EllenMCampbell/  NathanPhipps/ abeulke/        ccolumbu/      mdrod110/       taylorbobowski/
```

Additionally, in the directory where I ran the command, I have a file called

`illumina-video-questions-log.stderr` that gives me a more detailed report of things when they worked or failed.

If you are new to Unix, then the above script likely appears a bit daunting. Our goal by the end of the chapter is to have described every little piece of bash syntax needed, so that you will be able to read and understand the above script. You will thus also be in a good position to start writing your own scripts to automate tasks and analyses on your computer.

We will start with an overview of the structure of a script and then delve into specific areas of syntax. For each area of syntax, we will provide some examples, and then leave some openings for you, the reader, to try your own hand at implementing each pattern that you see.

3.1 The Structure of a Bash Script

A bash script is merely a text file that is a collection of different command lines, one after the next, which the bash shell will run in sequence—one after the other. If you want to run the script, you must make sure you have set its permissions to include execute permissions (i.e., `chmod ug+x script.sh`).

It is important to point out however, that the bash programming syntax that we will be describing in this chapter is not solely useful in the context of scripts that are stored in files. Rather, all the programming syntax can still be used directly on the shell command line itself! This means you can employ all the little tricks you will learn in this chapter while directly “hacking away” at the command line. In this context, it is worth noting that if you want to write multiple distinct commands on a single line, *as if they were on separate lines*, you can separate them with a semicolon, ;. For example:

```
echo "Put this in a file! (and catenate it later...twice!)" > tmp.txt
cat tmp.txt
cat tmp.txt
```

```
## Put this in a file! (and catenate it later...twice!)
## Put this in a file! (and catenate it later...twice!)
```

Is equivalent to:

```
echo "Put this in a file! (and catenate it later...twice!)" > tmp.txt; cat tmp.txt; cat tm
```

```
## Put this in a file! (and catenate it later...twice!)
```

```
## Put this in a file! (and catenate it later...twice!)
```

Sometimes when you are writing a script, (or even working on the command line) you might want a very long expression to be treated as being all part of the same command line, even though you would like to break it up over multiple lines. A backslash (\) immediately followed by a line ending (i.e., the “return” key) has the effect of treating the lines that it separates as all being on the same line.

```
# this:
clone-classroom-repos.sh \
    https://github.com/CSU-con-gen-bioinformatics-2020 \
    illumina-video-questions- \
    erics-edits \
    /tmp/illumina-questions

# is the same as this:
clone-classroom-repos.sh https://github.com/CSU-con-gen-bioinformatics-2020 illumina-vid
```

Using backslashes (and indenting) in this way can sometimes dramatically improve readability of your scripts.

You might also notice a number of lines or statements in the script above that start with a #. The # is known as a *comment character*. When the bash interpreter is reading the script, it *ignores* the comment character *and anything following it* until the *end of the line*. This makes it quite convenient to pepper your scripts with notes to yourselves or others that can be *extremely* helpful when you come back to a piece of code and are trying to remember what it does! Example:

```
# this might report an error if there is no file
# named SillyRidiculous.what
ls -l SillyRidiculous.what
```

```
## ls: SillyRidiculous.what: No such file or directory
```

(Note: each line of the the *output* shown above follows two # symbols. This is not commenting. It is just the convention that the ‘bookdown’ package uses to signify that what it is showing you is output, rather than input. No relation, really, to commenting...)

In the `clone-classroom-repos.sh` script, listed above, on the very top line (line 1) you will see a special statement that follows a # comment character. This is one of the few cases you will see when the contents after a comment character are *not* ignored (the other place you will see this is when preparing additional statements for schedulers for high-performance computing sys-

tems!). In this case the combination `#!` on the first line is telling Unix to get ready to learn how to interpret the contents of the script:

```
#!/bin/bash
```

The part after the `#!` is just the path to the program `bash` that implements the bash shell. It is telling Unix how to run the script. While it is common practice to put this top line on a script, on most systems, if the line is absent, Unix will interpret the script using `bash`, anyway.

If you ever find yourself having a hard time remembering the order of those first two symbols (i.e., is it `#!` or `!#?`), just remember that it is sometimes called the *shebang*. You know the first part should be a comment character so the line is treated a little differently, but then that has to be followed by the “bang” which is `!`.

3.1.1 A bit more on ; and &

Recall the semicolon: it provides a way to combine multiple commands on a single line. In fact, when you think of putting multiple commands on different lines, you could think of each one being followed by a semicolon. Like this:

```
# this
echo one
echo two

# is the same as
echo one;
echo two;

# is the same as
echo one; echo two;
```

However, there is another character, beyond the semicolon, with which you might follow commands. It is the *single* `&` symbol. Thus, you could use it like a semicolon, writing and executing this:

```
echo one & echo two &
```

But, if you do that on your Unix system, you should see some numbers and a report about jobs, like this:

```
[1] 1007
[2] 1008
one
```

```
two
[1]- Done                  echo one
[2]+ Done                  echo two
```

Whoa! What the heck is going on there? The & symbol means, “run the command that came before it, but don’t bother waiting for it to be done before running the next one.” As a consequence of this, when you run a command followed by a &, the computer returns to you the job ID numbers for the jobs that have been started, and when they are done, it also tells you that the jobs that have completed.

If you want to run multiple jobs on your own computer, the & syntax can be helpful. But, most of the time as a bioinformatician, you will be vying with countless others to run jobs on a large server or cluster. In those cases there are more refined systems for allocating jobs, and, as a consequence, you may rarely use the single & syntax when working on a high performance computing system.

3.2 Variables

When your goal is to script up repetitive tasks, one of the main ingredients to your success is bash’s ability to *assign values* to *variables*, and then later, retrieve those values and replace a variable in your script with its value, a process known as *variable substitution*. Both *variable assignment* and *variable substitution* happen all over the `clone-classroom-repos.sh` script, in lines like:

```
USER=eriqande
LOG=${PWD}/${RP}log
ERR=$LOG.stderr
```

We are going to break this down because it is of central importance.

3.2.1 Assigning values to variables

The syntax to assign a value to a variable is, “put the variable on the left, follow it with an equals sign **with absolutely no spaces around it**, and then put the value on the right,” like this:

```
VAR=value
HUNGRY="My cat, Oliver"
SWEET="A chocolately treat"
MY_FILE=/Users/eriq/Documents/git-repos/eca-bioinf-handbook/eca-bioinf-handbook.Rproj
lowercase_variables_work_too="oh yeah."
Or_even_MIXtures_of_cases=boing
```

Identify the variables and the values in the above.

The names of variables must start with either an upper- or lowercase letter or an underscore. After that initial character, valid variable names can then include any combination of underscores, upper- and lowercase letters and numerals.

In the following, identify the variable names that are valid and those that are not on each line. After you have made your choices, paste all these lines into your terminal to see which ones work and which do not.

```
vaRiAbLe=value
1_tough_cookie="hard to eat with false teeth"
 _bring_it_on="A fine musical"
PLATE.FIFTEEN=/home/me/labwork/plate_15
```

Ha! That is a pretty easy task because syntax highlighter in ‘bookdown’ colors variables differently than other parts of a script. Oh well, you still get the point!

The value of the variable, on the other hand can be pretty much any string (as long as it doesn’t confuse the shell with characters like &, ;, or !). The shell typically understands that strings are delimited by whitespace, so, if your string (value) should include multiple words separated by spaces, you must enclose them in quotation marks:

```
NAME="Eric C. Anderson"
```

You can use either pairs of single quotes ('this is single-quoted') or double quotes ("this is double-quoted"), but the shell treats these very differently, as we will see. Most of the time, in bioinformatics, you will want to be using double quotes.

If you want to include, in a variable’s value, characters that have special meaning to the shell, like *, [, {, &, and ;, among others, you must enclose the string inside quotation marks to assign it to your variable:

```
FOO="bar&grill" # works
FOO=bar&grill    # won't work the way you want it to
```

3.2.2 Accessing values from variables

This is called “variable substitution.” Remember, when you want something from someone, (or even just from a variable) it might cost you some money. Which is how you can remember that you need to use the \$ to access values from variables. The \$ tells the shell that you want the value of the variable, in a process called *variable substitution*. It is called that, because if you write \$VAR, somewhere in a command line, then the shell will happily go along and substitute the *value* of the variable \$VAR in place of the variable itself, *after* which the shell will evaluate the command line.

If you have a variable called VAR, the writing \$VAR substitutes its value on the command line. The same occurs if you write \${VAR}. The latter is a little more formal, but is also, in some sense a little more flexible, because it lets you append text immediately after the variable:

```
FIRST_PART=oxy

# this works:
echo "I like the word ${FIRST_PART}moron"

# this doesn't
echo "I like the word $FIRST_PARTmoron"

# but this would
echo "Remove the stain with $FIRST_PART-clean"

## I like the word oxymoron
## I like the word
## Remove the stain with oxy-clean
```

In the case above that does not work, the shell is substituting the value of the variable FIRST_PARTmoron which actually does not exist, so it substitutes nothing (and doesn’t even give you an error). This type of mistake typically occurs when you forget the underscore is part of a valid variable name, like:

```
GENUS=Oncorhynhus
SPECIES=mykiss
```

```
cd $GENUS_${SPECIES} # Fail!
cd ${GENUS}_${SPECIES} # Works!
```

Now it is your turn: save your three favorite foods into the variables ONE, TWO, and THREE, and then use the echo command to print My three favorite foods are... where you include those foods via variable substitution:

Are we starting to feel the power of Unix scripting yet?

3.2.3 What does the shell do with the value substituted for a variable?

This is a great question, and it gets at the heart of why Unix is so powerful for scripting. Recall that variable substitution occurs before command evaluation. So, basically, after variable substitution, the shell has a command line that includes the values instead of the variables. Then it just evaluates that command line. So, what happens to the values that have been substituted for the variables depends on what context they appear in, in the command line!

Follow along with this example:

```
# Start by assigning to DIR the absolute path of a directory you often go to
# Note, you should use a path from your own computer!
DIR=/Users/eriq/Documents/git-repos/eca-bioinf-handbook

# Now, note that we can do different things with that variable
# depending on how/where we put it in a command line.

# print it
echo $DIR

# list its contents
ls $DIR

# from your home directory (reached with `cd` and nothing after it)
# you can go directly to DIR like so:
cd
cd $DIR
```

```
# If you just put $DIR on the command line by itself, the shell
# interprets it as a command, and tries to execute it, which give an error:
$DIR

# On the other hand, if you wanted to make a new variable:
GODIR="cd $DIR"

# then, that would work as a command on its own:
cd
$GODIR
```

Oh! Now I am getting excited. Notice that in the `clone-classroom-repos.sh` script I did this quite a bit, making a few different command lines...

```
# store the commands themselves into variables. Note the
# use of double quotes.
CLONE_IT="git clone ${REPO/github.com/$USER@github.com} $DEST"
BRANCH_IT="git checkout -B $BRANCH"
PUSH_IT="git push -u origin $BRANCH"
```

...that I would then call later:

```
$CLONE_IT 2>> $ERR && \
cd $DEST && \
$BRANCH_IT 2>> $ERR && \
$PUSH_IT 2>> $ERR && \
cd $RUNDIR
```

3.2.4 Double and Single Quotation Marks and Variable Substitution

Quite often you will want to save a value to a variable that, itself, includes other variables. In other words, you want to do variable substitution on the value you are assigning to the variable. Double quote let you do this: variable substitution will proceed within double quotes:

```
FOO=sandwiches
BAR="I like $FOO"
echo $BAR

## I like sandwiches
```

However, inside single quotes, variable substitution will not occur:

```
FOO=sandwiches
BAR=' I like $FOO'
echo $BAR
```

```
## I like $FOO
```

Each behavior has its uses, but most of the time, as I said, you will be wanting to use double quotes.

Now it is your turn: Save three pairs of foods that you like (for example, “cookies & cream” or “bananas & walnuts”) into three variables, PAIR_ONE, PAIR_TWO, and PAIR_THREE. Then combine those into a variable called SENTENCE and print it with echo, so that the result looks something like: “I like cookies & cream, and bananas & walnuts, and rooibos and milk.”

3.2.5 One useful, fancy, variable-substitution method

Bash is full of fancy variable-substitution embellishments. One that I use all the time replaces strings in a variable with other strings. Check this out:

```
FILE=my_picture.jpg
echo $FILE
echo ${FILE/jpg/png}
echo ${FILE/my/your}
```

```
## my_picture.jpg
## my_picture.png
## your_picture.jpg
```

That turns out to be some powerful stuff.

3.3 Evaluate a command and substitute the result on the command line

Sometimes what you want to put on a command line isn’t just a variable you have previously defined but rather the result of a command that is executed. We see this in `clone-classroom-repos.sh` around line 75:

```
echo "STARTING at $(date)"
```

In general, if you put a command inside a `$()`, like `$(command)` it means take the output of the command and insert it into the command line.

You can even assign the result to a variable, like `RESULT=$(command)`.

For example, try this:

```
# what do you think this is doing?  
HOME_LIST=$(ls -l ~)  
  
# what about this?  
echo $HOME_LIST
```

Whoa! What happened to all my carriage returns? The results gets put onto the command line and parsed there. The command line parser sometimes treats line endings as just more whitespace, and it converts all runs of whitespace to a single space...

3.4 Grouping/Collecting output from multiple commands

()

3.5 Advanced repetition

I want to get constructs like `{1..20}` and `{csv, pdf, jpg}` in here too.

3.6 Variables

3.7 looping

3.8 Further reading

An excellent chapter on the development of Unix ([Raymond, 2003](#))

3.9 reading files line by line

This is handy. Note the line can be broken into a shell array:

```
cat bwa-run-list.txt straggler-bwa-run-list.txt | while read -r line; do
    A=($line);
    file=${A[1]};
    num=${A[2]};
    du -h bam-slices/$file/${num}-sorted.bam;
done

2.3G  bam-slices/chinook_Battle.Creek.Sacramento.River_Schluter_GBC_001_CH1-2011_Male/00
2.2G  bam-slices/chinook_Battle.Creek.Sacramento.River_Schluter_GBC_001_CH1-2011_Male/00
2.2G  bam-slices/chinook_Battle.Creek.Sacramento.River_Schluter_GBC_001_CH1-2011_Male/00
2.3G  bam-slices/chinook_Battle.Creek.Sacramento.River_Schluter_GBC_001_CH1-2011_Male/00
2.2G  bam-slices/chinook_Battle.Creek.Sacramento.River_Schluter_GBC_001_CH1-2011_Male/00
2.2G  bam-slices/chinook_Battle.Creek.Sacramento.River_Schluter_GBC_001_CH1-2011_Male/00
```

Note that this is not how you want to rip through files, typically, because it is slow and awk is a much better bet. But, if you want to do a system call for each line, it ends up being a decent way forward.

3.10 More stuff

In here, let's also talk about compression with gzip (and using `stuff | gzip -c > this.gz` to gzip and send to stdout.)



4

Sed, awk, and regular expressions

In the course of doing bioinformatics, you will be dealing with myriad different *text* files. As we noted in the previous chapters, Unix, with its file I/O model, piping capabilities, and numerous utilities, is well-suited to handling large text files. Two utilities found on every Unix installation—**awk** and **sed**—merit special attention in this context. **awk** is a lightweight scripting language that lets you write succinct programs to operate line-by-line on the contents of text files. It is particularly useful for handling text files that have columns of data separated by white spaces or tabs. **sed** on the other hand, is particularly useful for automating “find-and-replace” operations on text files. Each of them is optimized to handle large files without storing a lot of information in memory, so they can be useful for quick operations on large bioinformatic data sets. Neither is a fully-featured programming language that you would want to write large, complex programs in; however they do share many of the useful text-manipulation capabilities of such languages, such as Perl and Python. Additionally, **awk** and **sed** are deployed in a consistent fashion across most Unix operating systems, and they don’t require much time to learn to use effectively for common text-processing tasks. As a consequence **awk** and **sed** are a useful addition to the bioinformatician’s toolbox.

Both **awk** and **sed** rely heavily on *regular expressions* to describe *patterns* in text upon which some operation should be performed. You can think of regular expressions as providing a succinct language for performing very advanced “find” operations in a text file.



5

Working on remote servers

5.1 Accessing remote computers

The primary protocol for accessing remote computers in this day and age is `ssh` which stands for “Secure Shell.” In the protocol, your computer and the remote computer talk to one another and then choose to have a “shared secret” which they can use as a key to encrypt data traffic from one to the other. The amazing thing is that the two computers can actually tell each other what that shared secret is by having a conversation “in the open” with one another. That is a topic for another day, but if you are interested, you could read about it here¹.

At any rate, the SSH protocol allows for secure access to a remote server. It involves using a username and a password, and, in many cases today, some form of two-factor authentication (i.e., you need to have your phone involved, too!). Different remote servers have different routines for logging in to them, and they are also all configured a little differently. The main servers we are concerned about in these teaching materials are:

1. The Hummingbird cluster at UCSC, which is accessible by anyone with a UCSC blue username/password.
2. The Summit Supercomputer at CU Boulder which is accessible by all graduate students and faculty at CSU.
3. The Sedna cluster housed at the National Marine Fisheries Service, Northwest Fisheries Science Center. This is accessible only by those Federal NMFS employees whom have been granted access.

Happily, all of these systems use SLURM for job scheduling (much more about that in the next chapter); however are a few vagaries to each of these systems that we will cover below.

¹https://en.wikipedia.org/wiki/Diffie%E2%80%93Hellman_key_exchange

5.1.1 Windows

If you are on a Windows machine, you can use the `ssh` utility from your Git Bash shell, but that is a bit of a hassle from RStudio. And a better terminal emulator is available if you are going to be accessing remote computers. It is recommended that you install and use the program PuTTy². The steps are pretty self-explanatory and well documented. Instead of using `ssh` on a command line you put a host name into a dialog box, etc.

5.1.2 Hummingbird

Directions for UCSC students and staff to login to Hummingbird are available at <https://www.hb.ucsc.edu/getting-started/>. If you are not on the UCSC campus network, you need to use the UCSC VPN to connect.

By default, this cluster uses `tcsh` for a shell rather than `bash`. To keep things consistent with what you have learned about `bash`, you will want to automatically switch to `bash` upon login. You can do this by adding a file `~/.tcshrc` whose contents are:

```
setenv SHELL /usr/bin/bash
exec /usr/bin/bash --login
```

Then, configure your `bash` environment with your `~/.bashrc` and `~/.bash_profile` as described in Chapter 2.5.

The `tmux` settings (See section 5.3) in hummingbird are a little messed up as well, making it hard to set window names that don't get changed the moment you make another command. Therefore, you must make a file called `~/.tmux.conf` and put this line in it:

```
set-option -g allow-rename off
```

5.1.3 Summit

To get an account on Summit, see <https://www.acns.colostate.edu/hpc/summit-get-started/>. Account creation is automatic for graduate students and faculty. This setup requires that you get an app called Duo on your phone for doing two-factor authentication.

Instructions for logging into Summit are at <https://www.acns.colostate.edu/hpc/#remote-login>.

²<https://www.ssh.com/ssh/putty>

On your local machine (i.e., laptop), you might consider adding an alias to your `.bashrc` that will let you type `summit` to issue the login command. For example:

```
alias summit='ssh csu_eid@colostate.edu@login.rc.colorado.edu'
```

where you replace `csu_eid` with your actual CSU eID.

5.1.4 Sedna

To connect to this cluster you must be on the NMFS network, or connected to it via the VPN, then `ssh` with, for example:

```
ssh eanderson@sedna.nwfsc2.noaa.gov
```

but using your own username.

5.2 Transferring files to remote computers

5.2.1 sftp

5.2.2 git

Most remote servers you work on will have `git` by default. If you are doing all your work on a project within a single repository, you can use `git` to keep scripts and other files version-controlled on the server. You can also push and pull files (not big data or output files!) to GitHub, thus keeping things backed up and version controlled, and providing a useful way to synchronize scripts and other files in your project between the server and your laptop.

Example:

1. write and test scripts on your laptop in a repo called `my-project`
2. commit scripts on your laptop and push them to GitHub in a repo also called `my-project`
3. pull `my-project` from GitHub to the server.
4. Try running your scripts in `my-project` on your server. In the process, you may discover that you need to change/fix some things so they will run correctly on the server. Fix them!
5. Once things are fixed and successfully running on the server, commit those changes and push them to GitHub.

6. Update the files on your laptop so that they reflect the changes you had to make on the server, by pulling `my-project` from GitHub to your laptop.

5.2.2.1 Configuring git on the remote server

In order to make this sort of workflow successful, you first need to ensure that you have set up git on your remote server. Doing so involves:

1. establishing your name and email that will be used with your git commits made from the server.
2. Ensuring that git password caching is set up so you don't always have to type your GitHub password when you push and pull.
3. configuring your git text editor to be something that you know how to use.

It can be useful give yourself a git name on the server that reflects the fact that the changes you are committing were made on the server.

For example, for my own setup on the Summit cluster at Boulder, I might do my git configurations by issuing these commands on the command line on the server:

```
git config --global user.name "Eric C. Anderson (From Summit)"
git config --global user.email eriq@rams.colostate.edu
git config --global credential.helper cache
git config --global core.editor nano
```

In all actuality, I would set my editor to be `vim` or `emacs`, because those are more powerful editors and I am familiar with them; however, if you are new to Unix, then `nano` is an easy-to-use editor.

You should set configurations on your server appropriate to yourself (i.e., with your name and email and preferred text editor). Once these configurations are set, you are ready to start cloning repositories from GitHub and then pushing and pulling them, as well.

To this point, we have always done those actions from within RStudio. On a remote server, however, you will have to do all these actions from the command line. That is OK, it just requires learning a few new things.

The first, and most important, issue to understand is that if you want to push new changes back to a repository that is on your GitHub account, GitHub needs to know that you have privileges to do so. One way to do this is by making sure, when you initially clone the repository, that you do so whilst letting GitHub know that you are the user that “owns” your GitHub account.

This is done by inserting your GitHub username into your `git clone` request with the following syntax:

```
git clone https://username@github.com/username/repository.git
```

For example, if I want to `clone` a repository whose URL is:

```
https://github.com/eriqande/alignment-play
```

I would issue this command:

```
git clone https://eriqande@github.com/eriqande/alignment-play
```

This clones the repository to my server, and makes a note of the fact that you did so as the GitHub user `eriqande`, so that if I try to push something back to that GitHub repository, it will ask me for my proper `eriqande` GitHub password.

5.2.2.2 Using git on the remote server

When on the server, you don't have the convenient RStudio interface to git, so you have to use git commands on the command line. Fortunately these provide straightforward, command-line analogies to the RStudio GUI git interface you have become familiar with.

Instead of having an RStudio Git panel that shows you files that are new or have been modified, etc., you use `git status` in your repo to give a text report of the same.

For example, imagine that Figure 5.1 shows an RStudio project Git window describing the status of files in the repository.

That view is merely showing you a graphical view of the output of the `git status` command run at the top level of the repository which looks like this:

```
% git status
On branch master
Changes not staged for commit:
  (use "git add <file>..." to update what will be committed)
  (use "git checkout -- <file>..." to discard changes in working directory)

    modified:   .gitignore
    modified:   002-homeologue-permutation-with-bedr.Rmd

Untracked files:
  (use "git add <file>..." to include in what will be committed)

    002-homeologue-permutation-with-bedr.nb.html
```

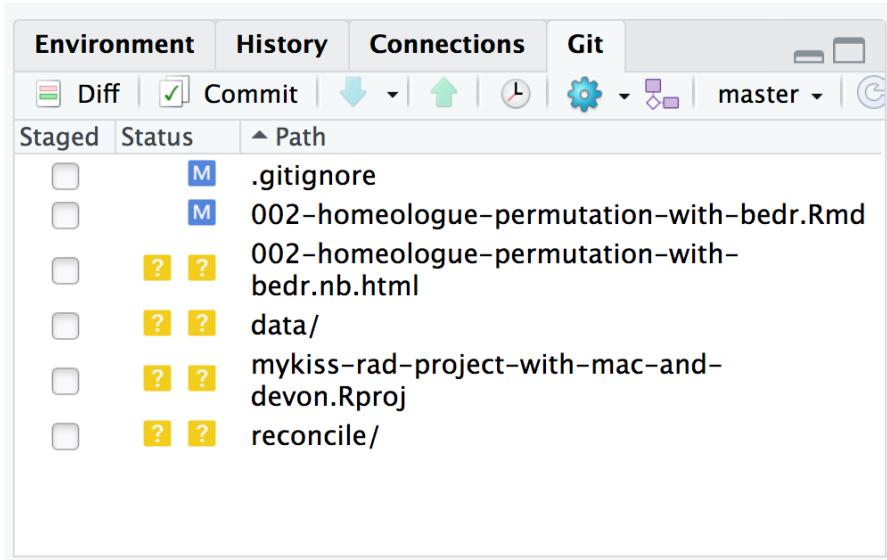


FIGURE 5.1: An example of what an RStudio git window might look like.

```

data/
mykiss-rad-project-with-mac-and-devon.Rproj
reconcile/

no changes added to commit (use "git add" and/or "git commit -a")

```

Aha! Be sure to read that and understand that the output tells you which files are tracked by git and Modified (blue M in RStudio) and which are untracked (Yellow ? in RStudio).

If you wanted to see a report of the changes in the files relative to the currently committed version, you could use `git diff`, passing it the file name as an argument. We will see an example of that below...

Now, recall, that in order to commit files to `git` you first must *stage* them. In RStudio you do that by clicking the little button to the left of the file or directory in the Git window. For example, if we clicked the buttons for the `data/` directory, as well as for `.gitignore` and `002-homeologue-permutation-with-bedr.Rmd`, we would have staged them and it would look like Figure 5.2.

In order to do the equivalent operations with `git` on the command line you would use the `git add` command, explicitly naming the files you wish to *stage* for committing:

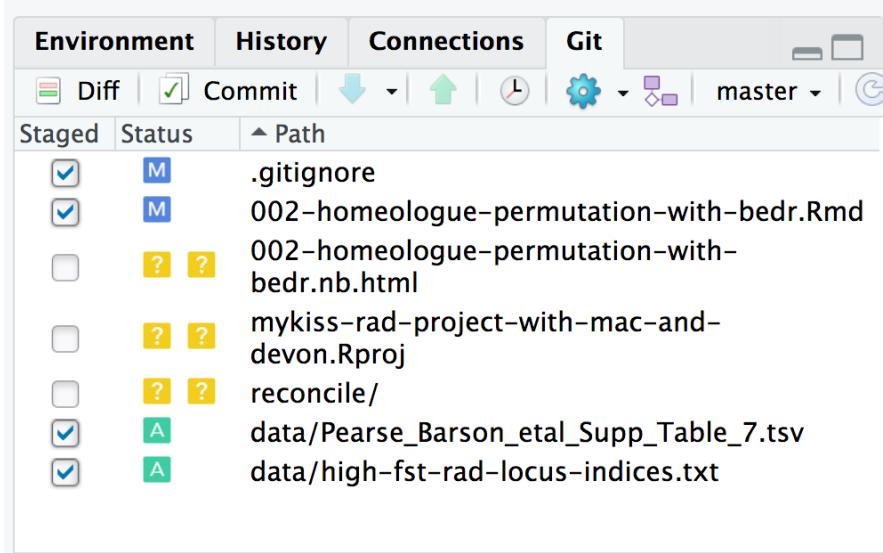


FIGURE 5.2: An example of what an RStudio git window might look like.

```
git add .gitignore 002-homeologue-permutation-with-bedr.Rmd data
```

Now, if you check `git status` you will see:

```
% git status
On branch master
Changes to be committed:
  (use "git reset HEAD <file>..." to unstage)

    modified:   .gitignore
    modified:   002-homeologue-permutation-with-bedr.Rmd
    new file:   data/Pearse_Barson_etal_Supp_Table_7.tsv
    new file:   data/high-fst-rad-locus-indices.txt

Untracked files:
  (use "git add <file>..." to include in what will be committed)

    002-homeologue-permutation-with-bedr.nb.html
    mykiss-rad-project-with-mac-and-devon.Rproj
    reconcile/
```

It tells you which files are ready to be committed!

In order to commit the files to git you do:

```
git commit
```

And then, to push them back to GitHub (if you cloned this repository from GitHub), you can simply do:

```
git push origin master
```

That syntax is telling git to push the `master` branch (which is the default branch in a git repository), to the repository labeled as `origin`, which will be the GitHub repository if you cloned the repository from GitHub. (If you are working with a different git branch than master, you would need to specify its name here. That is not difficult, but is beyond the scope of this chapter.)

Now, assuming that we cloned the `alignment-play` repository to our server, here are the steps involved in editing a file, committing the changes, and then pushing them back to GitHub. The command in the following is written as `[alignment-play]--%` which is telling us that we are in the `alignment-play` repository.

```
# check git status
[alignment-play]--% git status

# On branch master
nothing to commit, working directory clean

# Aha! That says nothing has been modified.
# But, now we edit the file alignment-play.Rmd
[alignment-play]--% nano alignment-play.Rmd

# In this case I merely added a line to the YAML header.

# Now, check status of the files:
[alignment-play]--% git status

# On branch master
# Changes not staged for commit:
#   (use "git add <file>..." to update what will be committed)
#   (use "git checkout -- <file>..." to discard changes in working directory)
#
#       modified:   alignment-play.Rmd
#
no changes added to commit (use "git add" and/or "git commit -a")
```

```
# We see that the file has been modified.

# Now we can use git diff to see what the changes were
[alignment-play]--% git diff alignment-play.Rmd

diff --git a/alignment-play.Rmd b/alignment-play.Rmd
index 9f75ebb..b389fae 100644
--- a/alignment-play.Rmd
+++ b/alignment-play.Rmd
@@ -3,6 +3,7 @@ title: "Alignment Play!"
    output:
      html_notebook:
        toc: true
+      toc_float: true
---

# The output above is a little hard to parse, but it shows
# the line that has been added: " toc_float: true" with a
# "+" sign.

# In order to commit the changes, we do:
[alignment-play]--% git add alignment-play.Rmd
[alignment-play]--% git commit

# after that, we are bumped into the nano text editor
# to write a short message about the commit. After exiting
# from the editor, it tells us:
[master 001e650] yaml change
 1 file changed, 1 insertion(+)

# Now, to send that new commit to GitHub, we use git push origin master
[alignment-play]--% git push origin master
Password for 'https://eriqande@github.com':


Counting objects: 5, done.
Delta compression using up to 24 threads.
Compressing objects: 100% (3/3), done.
Writing objects: 100% (3/3), 325 bytes | 0 bytes/s, done.
Total 3 (delta 2), reused 0 (delta 0)
remote: Resolving deltas: 100% (2/2), completed with 2 local objects.
To https://eriqande@github.com/eriqande/alignment-play
 0c1707f..001e650  master -> master
```

When pushing to a GitHub repository for the first time from your remote

server you will be asked for your GitHub password. Once you have successfully provided your password, if you set password caching up correctly, then you should not have to provide your password for subsequent pushes.

Finally, if after pushing those changes to GitHub, we then pull them down to our laptop, and make more changes on top of them and push those back to GitHub, we can retrieve from GitHub to the server those changes we made on our laptop with `git pull origin master`. In other words, from the server we simply issue the command:

```
[alignment-play]--% git pull origin master
```

5.2.3 Globus

5.2.4 Interfacing with “The Cloud”

Increasingly, data scientists and tech companies alike are keeping their data “in the cloud.” This means that they pay a large tech firm like Amazon, Dropbox, or Google to store their data for them in a place that can be accessed via the internet. There are many advantages to this model. For one thing, the company that serves the data often will create multiple copies of the data for backup and redundancy: a fire in a single data center is not a calamity because the data are also stored elsewhere, and can often be accessed seamlessly from those other locations with no apparent disruption of service. For another, companies that are in the business of storing and serving data to multiple clients have data centers that are well-networked, so that getting data onto and off of their storage systems can be done very quickly over the internet by an end-user with a good internet connection.

Five years ago, the idea of storing next generation sequencing data might have sounded a little crazy—it always seemed a laborious task getting the data off of the remote server at the sequencing center, so why not just keep the data in-house once you have it? To be sure, keeping a copy of your data in-house still can make sense for long-term data archiving needs, but, today, cloud storage for your sequencing data can make a lot of sense. A few reasons are:

1. Transferring your data from the cloud to the remote HPC system that you use to process the data can be very fast.
2. As above, your data can be redundantly backed up.
3. If your institution (university, agency, etc.) has an agreement with a cloud storage service that provides you with unlimited storage and free network access, then storing your sequencing data in the cloud will cost considerably less than buying a dedicated large system of hard drives for data backup. (One must wonder if service agreements

might not be at risk of renegotiation if many researchers start using their unlimited institutional cloud storage space to store and/or archive their next generation sequencing data sets. My own agency's contract with Google runs through 2021...but I have to think that these services are making plenty of money, even if a handful of researchers store big sequence data in the cloud. Nonetheless, you should be careful not to put multiple copies of data sets, or intermediate files that are easily regenerated, up in the cloud.)

4. If you are a PI with many lab members wishing to access the same data set, or even if you are just a regular Joe/Joanna researcher but you wish to share your data, it is possible to effect that using your cloud service's sharing settings. We will discuss how to do this with Google Drive.

There are clearly advantages to using the cloud, but one small hurdle remains. Most of the time, working in an HPC environment, we are using Unix, which provides a consistent set of tools for interfacing with other computers using SSH-based protocols (like `scp` for copying files from one remote computer to another). Unfortunately, many common cloud storage services do not offer an SSH based interface. Rather, they typically process requests from clients using an HTTPS protocol. This protocol, which effectively runs the world-wide web, is a natural choice for cloud services that most people will access using a web browser; however, Unix does not traditionally come with a utility or command to easily process the types of HTTPS transactions needed to network with cloud storage. Furthermore, there must be some security when it comes to accessing your cloud-based storage—you don't want everyone to be able to access your files, so your cloud service needs to have some way of authenticating people (you and your labmates for example) that are authorized to access your data.

These problems have been overcome by a utility called `rclone`, the product of a comprehensive open-source software project that brings the functionality of the `rsync` utility (a common Unix tool used to synchronize and mirror file systems) to cloud-based storage. (Note: `rclone` has nothing to do with the R programming language, despite its name that looks like an R package.) Currently `rclone` provides a consistent interface for accessing files from over 35 different cloud storage providers, including Box, Dropbox, Google Drive, and Microsoft OneDrive. Binaries for `rclone` can be downloaded for your desktop machine from <https://rclone.org/downloads/>. We will talk about how to install it on your HPC system later.

Once `rclone` is installed and in your PATH, you invoke it in your terminal with the command `rclone`. Before we get into the details of the various `rclone` subcommands, it will be helpful to take a glance at the information `rclone` records when it configures itself to talk to your cloud service. To do so, it creates a file called `~/.config/rclone/rclone.conf`, where it stores infor-

mation about all the different connections to cloud services you have set up. For example, that file on my system looks like this:

```
[gdrive-rclone]
type = drive
scope = drive
root_folder_id = 1I2EDV465N5732Tx1FFAiLW0qZRJcAzUd
token = {"access_token": "bs43.94cUF0e6SjjkofZ", "token_type": "Bearer", "refresh_token": "1/Mr
client_id = 2934793-oldk97lh1ld88d1kh301hd.apps.googleusercontent.com
client_secret = MMq3jdsjdjgKTGH4rNV_y-NbbG
```

In this configuration:

- `gdrive-rclone` is the name by which `rclone` refers to this cloud storage location
- `root_folder_id` is the ID of the Google Drive folder that can be thought of as the root directory of `gdrive-rclone`. This ID is not the simple name of that directory on your Google Drive, rather it is the unique name given by Google Drive to that directory. You can see it by navigating in your browser to the directory you want and finding it after the last slash in the URL. For example, in the above case, the URL is:
`https://drive.google.com/drive/u/1/folders/1I2EDV465N5732Tx1FFAiLW0qZRJcAzUd`
- `client_id` and `client_secret` are like a username and a shared secret that `rclone` uses to authenticate the user to Google Drive as who they say they are.
- `token` are the credentials used by `rclone` to make requests of Google Drive on the basis of the user.

Note: the above does not include my real credentials, as then anyone could use them to access my Google Drive!

To set up your own configuration file to use Google Drive, you will use the `rclone config` command, but before you do that, you will want to wrangle a `client_id` from Google. Follow the directions at <https://rclone.org/drive/#making-your-own-client-id>. Things are a little different from in their step by step, but you can muddle through to get to a screen with a `client_ID` and a client secret that you can copy onto your clipboard.

Once you have done that, then run `rclone config` and follow the prompts. A typical session of `rclone config` for Google Drive access is given here³. Don't choose to do the advanced setup; however do use "auto config," which will bounce up a web page and let you authenticate `rclone` to your Google account.

It is worthwhile first setting up a config file on your laptop, and making sure that it is working. After that, you can copy that config file to other remote servers you work on and immediately have the same functionality.

³<https://rclone.org/drive/>

5.2.4.1 Encrypting your config file

While it is a powerful thing to be able to copy a config file from one computer to the next and immediately be able to access your Google Drive account. That might (and should) also make you a little bit uneasy. It means that if the config file falls into the wrong hands, whoever has it can gain access to everything on your Google Drive. Clearly this is not good. Consequently, once you have created your rclone config file, and well before you transfer it to another computer, you must encrypt it. This makes sense, and fortunately it is fairly easy: you can use `rclone config` and see that encryption is one of the options. When it is encrypted, use `rclone config show` to see what it looks like in clear text.

The downside of using encryption is that you have to enter your password every time you make an rclone command, but it is worth it to have the security.

Here is what it looks like when choosing to encrypt one's config file:

```
% rclone config
Current remotes:

Name          Type
====          ====
gdrive-rclone    drive

e) Edit existing remote
n) New remote
d) Delete remote
r) Rename remote
c) Copy remote
s) Set configuration password
q) Quit config
e/n/d/r/c/s/q> s
Your configuration is not encrypted.
If you add a password, you will protect your login information to cloud services.
a) Add Password
q) Quit to main menu
a/q> a
Enter NEW configuration password:
password:
Confirm NEW configuration password:
password:
Password set
Your configuration is encrypted.
c) Change Password
```

```

u) Unencrypt configuration
q) Quit to main menu
c/u/q> q
Current remotes:

Name          Type
====          ====
gdrive-rclone    drive

e) Edit existing remote
n) New remote
d) Delete remote
r) Rename remote
c) Copy remote
s) Set configuration password
q) Quit config
e/n/d/r/c/s/q> q

```

Once that file is encrypted, you can copy it to other machines for use.

5.2.4.2 Basic Maneuvers

The syntax for use is:

```
rclone [options] subcommand parameter1 [parameter 2...]
```

The “subcommand” part tells **rclone** what you want to do, like **copy** or **sync**, and the “parameter” part of the above syntax is typically a path specification to a directory or a file. In using rclone to access the cloud there is not a root directory, like `/` in Unix. Instead, each remote cloud access point is treated as the root directory, and you refer to it by the name of the configuration followed by a colon. In our example, **gdrive-rclone:** is the root, and we don’t need to add a `/` after it to start a path with it. Thus **gdrive-rclone:this_dir/that_dir** is a valid path for **rclone** to a location on my Google Drive.

Very often when moving, copying, or syncing files, the parameters consist of:

```
source-directory destination-directory
```

One very important point is that, unlike the Unix commands **cp** and **mv**, rclone likes to operate on directories, not on multiple named files.

A few key subcommands:

- `ls`, `lsd`, and `lsl` are like `ls`, `ls -d` and `ls -l`

```
rclone lsd gdrive-rclone:  
rclone lsd gdrive-rclone:NOFU
```

- `copy`: copy the *contents* of a source *directory* to a destination *directory*. One super cool thing about this is that `rclone` won't re-copy files that are already on the destination and which are identical to those in the source directory.

```
rclone copy bams gdrive-rclone:NOFU/bams
```

Note that the destination directory will be created if it does not already exist.
- `sync`: make the contents of the destination directory look just like the contents of the source directory. *WARNING* This will delete files in the destination directory that do not appear in the source directory.

A few key options:

- `--dry-run`: don't actually copy, sync, or move anything. Just tell me what you would have done.
- `-P`, `-v`, `-vv`: give me progress information, verbose output, or super-verbose output, respectively.
- `--tpslimit 10`: don't make any more than 10 transactions a second with Google Drive (should always be used when transferring files)
- `--fast-list`: combine multiple transactions together. Should always be used with Google Drive, especially when handling lots of files.
- `--drive-shared-with-me`: make the "root" directory a directory that shows all of the Google Drive folders that people have shared with you. This is key for accessing folders that have been shared with you.

For example, try something like:

```
rclone --drive-shared-with-me lsd gdrive-rclone:
```

5.2.4.3 filtering: Be particular about the files you transfer

`rclone` works a little differently than the Unix utility `cp`. In particular, `rclone` is not set up very well to copy individual files. While there is a `copy` command known as `copyto` that will allow you copy a single file, you cannot (apparently) specify multiple, individual files that you wish to copy.

In other words, you can't do:

```
rclone copyto this_file.txt that_file.txt another_file.bam gdrive-rclone:dest_dir
```

In general, you will be better off using `rclone` to copy the *contents* of a directory to the inside of the destination directory. However, there are options in `rclone` that can keep you from being totally indiscriminate about the files you transfer. In other words, you can *filter* the files that get transferred. You can read about that at <https://rclone.org/filtering/>.

For a quick example, imagine that you have a directory called `Data` on your Google Drive that contains both VCF and BAM files. You want to get only the VCF files (ending with `.vcf.gz`, say) onto the current working directory on your cluster. Then something like this works:

```
rclone copy --include *.vcf.gz gdrive-rclone:Data ./
```

Note that, if you are issuing this command on a Unix system in a directory where the pattern `*.vcf.gz` will expand (by globbing) to multiple files, you will get an error. In that case, wrap the pattern in a pair of single quotes to keep the shell from expanding it, like this:

```
rclone copy --include '*.vcf.gz' gdrive-rclone:Data ./
```

5.2.4.4 Feel free to make lots of configurations

You might want to configure a remote for each directory-specific project. You can do that by just editing the configuration file. For example, if I had a directory deep within my Google Drive, inside a chain of folders that looked like, say, `Projects/NGS/Species/Salmon/Chinook/CentralValley/WinterRun` where I was keeping all my data on a project concerning winter-run Chinook salmon, then it would be quite inconvenient to type `Projects/NGS/Species/Salmon/Chinook/CentralValley/WinterRun` every time I wanted to copy or sync something within that directory. Instead, I could add the following lines to my configuration file, essentially copying the existing configuration and then modifying the configuration name and the `root_folder_id` to be the Google Drive identifier for the folder `Projects/NGS/Species/Salmon/Chinook/CentralValley/WinterRun` (which one can find by navigating to that folder in a web browser and pulling the ID from the end of the URL.) The updated configuration could look like:

```
[gdrive-winter-run]
type = drive
scope = drive
root_folder_id = 1Mj0rclmP1udhx0TvLWDHFBVET1dF6CIn
```

```
token = {"access_token": "bs43.94cUF0e6SjjkofZ", "token_type": "Bearer", "refresh_token": "1/Mr  
client_id = 2934793-oldk97lhld88dlkh301hd.apps.googleusercontent.com  
client_secret = MMq3jdsjdjgKTGH4rNV_y-NbbG
```

As long as the directory is still within the same Google Drive account, you can re-use all the authorization information, and just change the [name] part and the `root_folder_id`. Now this:

```
rclone copy src_dir gdrive-winter-run:
```

puts items into `Projects/NGS/Species/Salmon/Chinook/CentralValley/WinterRun` on the Google Drive without having to type that God-awful long path name.

5.2.4.5 Installing rclone on a remote machine without sudo access

The instructions on the website require root access. You don't have to have root access to install rclone locally in your home directory somewhere. Copy the download link from <https://rclone.org/downloads/> for the type of operating system your remote machine uses (most likely Linux if it is a cluster). Then transfer that with `wget`, unzip it and put the binary in your PATH. It will look something like this:

```
wget https://downloads.rclone.org/rclone-current-linux-amd64.zip  
unzip rclone-current-linux-amd64.zip  
cp rclone-current-linux-amd64/rclone ~/bin
```

You won't get manual pages on your system, but you can always find the docs on the web.

5.2.4.6 Setting up configurations on the remote machine...

Is as easy as copying your config file to where it should go, which is easy to find using the command:

```
rclone config file
```

5.2.4.7 Some other usage tips

Following an email exchange with Ren, I should mention how to do an md5 checksum on the remote server to make sure that everything is correctly there.

5.2.5 Getting files from a sequencing center

Very often sequencing centers will post all the data from a single run of a machine at a secured (or unsecured) http address. You will need to download those files to operate on them on your cluster or local machine. However some of the files available on the server will likely belong to other researchers and you don't want to waste time downloading them.

Let's take an example. Suppose you are sent an email from the sequencing center that says something like:

Your samples are AW_F1 (female) and AW_M1 (male).
 You should be able to access the data from this
 link provided by YCGA: <http://sysg1.cs.yale.edu:3010/51n09bs3zfa8L0hESfsYfq3Dc/061719/>

You can easily access this web address using `rclone`. You could set up a new remote in your `rclone` config to point to `http://sysg1.cs.yale.edu`, but, since you will only be using this once, to get your data, it makes more sense to just specify the remote on the command line. This can be done by passing `rclone` the URL address via the `--http-url` option, and then, after that, telling it what protocol to use by adding `:http:` to the command. Here is what you would use to list the directories available at the sequencing center URL:

```
# here is the command
% rclone lsd --http-url http://sysg1.cs.yale.edu:3010/51n09bs3zfa8L0hESfsYfq3Dc/061719/ :h

# and here is the output
      -1 1969-12-31 16:00:00          -1 sjg73_fqs
      -1 1969-12-31 16:00:00          -1 sjg73_supernova_fqs
```

Aha! There are two directories that might hold our sequencing data. I wonder what is in those directories? The `rclone tree` command is the perfect way to drill down into those directories and look at their contents:

```
% rclone tree --http-url http://sysg1.cs.yale.edu:3010/51n09bs3zfa8L0hESfsYfq3Dc/061719/ :
/
      sjg73_fqs
```

```

AW_F1
    AW_F1_S2_L001_I1_001.fastq.gz
    AW_F1_S2_L001_R1_001.fastq.gz
    AW_F1_S2_L001_R2_001.fastq.gz
AW_M1
    AW_M1_S3_L001_I1_001.fastq.gz
    AW_M1_S3_L001_R1_001.fastq.gz
    AW_M1_S3_L001_R2_001.fastq.gz
ESP_A1
    ESP_A1_S1_L001_I1_001.fastq.gz
    ESP_A1_S1_L001_R1_001.fastq.gz
    ESP_A1_S1_L001_R2_001.fastq.gz
sjg73_supernova_fqs
    AW_F1
        AW_F1_S2_L001_I1_001.fastq.gz
        AW_F1_S2_L001_R1_001.fastq.gz
        AW_F1_S2_L001_R2_001.fastq.gz
    AW_M1
        AW_M1_S3_L001_I1_001.fastq.gz
        AW_M1_S3_L001_R1_001.fastq.gz
        AW_M1_S3_L001_R2_001.fastq.gz
    ESP_A1
        ESP_A1_S1_L001_I1_001.fastq.gz
        ESP_A1_S1_L001_R1_001.fastq.gz
        ESP_A1_S1_L001_R2_001.fastq.gz

```

8 directories, 18 files

Whoa! That is pretty cool!. From this output we see that there are subdirectories named `AW_F1` and `AW_M1` that hold the files that we want. And, of course, the `ESP_A1` samples must belong to someone else. It would be great if we could just download the files we wanted, excluding the ones in the `ESP_A1` directories. It turns out that there is! `rclone` has an `--exclude` option to exclude paths that match certain patterns (see Section 5.2.4.3, above). We can experiment by giving `rclone copy` the `--dry-run` command to see which files will be transferred. If we don't do any filtering, we see this when we try to dry-run copy the directories to our local directory `Alewife/fastq`:

```
% rclone copy --dry-run --http-url http://sysg1.cs.yale.edu:3010/5ln09bs3zfa8L0hESfsYfq3D0
2019/07/11 10:33:43 NOTICE: sjg73_fqs/ESP_A1/ESP_A1_S1_L001_I1_001.fastq.gz: Not copying a
2019/07/11 10:33:43 NOTICE: sjg73_fqs/ESP_A1/ESP_A1_S1_L001_R1_001.fastq.gz: Not copying a
2019/07/11 10:33:43 NOTICE: sjg73_fqs/ESP_A1/ESP_A1_S1_L001_R2_001.fastq.gz: Not copying a
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/AW_M1/AW_M1_S3_L001_I1_001.fastq.gz: Not co
```

```
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/AW_M1/AW_M1_S3_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/AW_M1/AW_M1_S3_L001_R2_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/AW_F1/AW_F1_S2_L001_I1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/AW_F1/AW_F1_S2_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/AW_F1/AW_F1_S2_L001_R2_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/ESP_A1/ESP_A1_S1_L001_I1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/ESP_A1/ESP_A1_S1_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_supernova_fqs/ESP_A1/ESP_A1_S1_L001_R2_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_fqs/AW_F1/AW_F1_S2_L001_I1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_fqs/AW_F1/AW_F1_S2_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_fqs/AW_F1/AW_F1_S2_L001_R2_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_fqs/AW_M1/AW_M1_S3_L001_I1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_fqs/AW_M1/AW_M1_S3_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:33:43 NOTICE: sjg73_fqs/AW_M1/AW_M1_S3_L001_R2_001.fastq.gz: Not copying as
```

Since we do not want to copy the `ESP_A1` files we see if we can exclude them:

```
% rclone copy --exclude */ESP_A1/* --dry-run --http-url http://sysg1.cs.yale.edu:3010/5ln09bs
2019/07/11 10:37:22 NOTICE: sjg73_fqs/AW_F1/AW_F1_S2_L001_I1_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_fqs/AW_F1/AW_F1_S2_L001_R2_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_fqs/AW_F1/AW_F1_S2_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_fqs/AW_M1/AW_M1_S3_L001_I1_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_fqs/AW_M1/AW_M1_S3_L001_R2_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_fqs/AW_M1/AW_M1_S3_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_supernova_fqs/AW_F1/AW_F1_S2_L001_I1_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_supernova_fqs/AW_F1/AW_F1_S2_L001_R2_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_supernova_fqs/AW_F1/AW_F1_S2_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_supernova_fqs/AW_M1/AW_M1_S3_L001_I1_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_supernova_fqs/AW_M1/AW_M1_S3_L001_R1_001.fastq.gz: Not copying as
2019/07/11 10:37:22 NOTICE: sjg73_supernova_fqs/AW_M1/AW_M1_S3_L001_R2_001.fastq.gz: Not copying as
```

Booyah! That gets us just what we want. So, then we remove the `--dry-run` option, and maybe add `-v -P` to give us verbose output and progress information, and copy all of our files:

```
% rclone copy --exclude */ESP_A1/* -v -P --http-url http://sysg1.cs.yale.edu:3010/5ln09bs
```

5.3 tmux: the terminal multiplexer

Many universities have recently implemented a two-factor authentication requirement for access to their computing resources (like remote servers and clusters). This means that every time you login to a server on campus (using `ssh` for example) you must type your password, and also fiddle with your phone. Such systems preclude the use of public/private key pairs that historically allowed you to access a server from a trusted client (i.e., your own secured laptop) without having to type in a password. As a consequence, today, opening multiple sessions on a server using `ssh` and two-factor authentication requires a ridiculous amount of additional typing and phone-fiddling, and is a huge hassle. But, when working on a remote server it is often very convenient to have multiple separate shells that you are working on and can quickly switch between.

At the same time. When you are working on the shell of a remote machine and your network connection goes down, then, typically the bash session on your remote machine will be forcibly quit, killing any jobs that you might have been in the middle of (however, this is not the case if you submitted those jobs through a job scheduler like SLURM. Much more on that in the next chapter.). And, finally, in a traditional `ssh` session to a remote machine, when you close your laptop, or put it to sleep, or quit the Terminal application, all of your active bash sessions on the remote machine will get shut down. Consequently, the next time you want to work on that project, after you have logged onto that remote machine you will have to go through the laborious steps of navigating to your desired working directory, starting up any processes that might have gotten killed, and generally getting yourself set up to work again. That is a serious buzz kill!

Fortunately, there is an awesome utility called `tmux`, which is short for “terminal multiplexer” that solves most of the problems we just described. `tmux` is similar in function to a utility called `screen`, but it is easier to use while at the same time being more customizable and configurable (in my opinion). `tmux` is basically your ticket to working *way* more efficiently on remote computers, while at the same time looking (to friends and colleagues, at least) like the full-on, bad-ass Unix user.

In full confession, I didn’t actually start using `tmux` until some five years after a speaker at a workshop delivered an incredibly enthusiastic presentation about `tmux` and how much he was in love with it. In somewhat the same fashion that I didn’t adopt RStudio shortly after its release, because I had my own R workflows that I had hacked together myself, I thought to myself: “I have public/private key pairs so it is super easy for me to just start another terminal window and login to the server for a new session. Why would I need `tmux`?” I

also didn't quite understand how `tmux` worked initially: I thought that I had to run `tmux` simultaneously on my laptop and on the server, and that those two processes would talk to one another. That is not the case! You just have to run `tmux` on the server and all will work fine! The upshot of that confession is that you should *not* be a bozo like me, and you should learn to use `tmux` *right now!* You will thank yourself for it many times over down the road.

5.3.1 An analogy for how `tmux` works

Imagine that the first time you log in to your remote server you also have the option of speaking on the phone to a super efficient IT guy who has a desk in the server room. This dude never takes a break, but sits at his desk 24/7. He probably has mustard stains on his dingy white T-shirt from eating ham sandwiches non-stop while he works super hard. This guy is Tmux.

When you *first* speak to this guy, you have to preface your commands with `tmux` (as in, "Hey Tmux!"). He is there to help you manage different terminal windows with different bash shells or processes going on in them. In fact, you can think of it this way: you can ask him to set up a terminal (i.e., like a monitor), right there on his desk, and then create a bunch of windows on that terminal for you—each one with its own bash shell—without having to do a separate login for each one. He has created all those windows, but you still get to use them. It is like he has a miracle-mirroring device that lets you operate the windows that are on the terminal he set up for you on his desk.

When you are done working on all those windows, you can tell Tmux that you want to *detach* from the special terminal he set up for you at the server. In response he says, "Cool!" and shuts down his miracle-mirroring device, so you know longer see those different windows. However, he *does not* shut down the terminal on his desk that he set up for you. That terminal stays on, and any of your processes happening on it keep chugging away...even after you logout from the server entirely, throw the lid down on your laptop, have drinks with your friends at Social, downtown, watch an episode of Parks and Rec, and then get a good night sleep.

All through the night, Tmux is munching ham sandwiches and keeping an eye on that terminal he set up for you. When you log back onto the server in the morning, you can say "Hey Tmux! I want to attach back to that terminal you set up for me." He says, "No problem!", turns his miracle-mirroring device back on, and in an instant you have all of the windows on that terminal back on your laptop with all the processes still running in them—in all the same working directories—just as you left it all (except that if you were running jobs in those windows, some of those jobs might already be done!).

Not only that, but, further, if you are working on the server, when a local thunderstorm fries the motherboard on your laptop, you can get a new laptop,

log back into the server and ask Tmux to reconnect you to that terminal and get back to all of those windows and jobs, etc. as if you didn't get zapped. The same goes for the case of a backhoe operator accidentally digging up the fiber optic cable in your yard. Your network connection can go down completely. But, when you get it up and running again, you can say "Hey Tmux! Hook me up!" and he'll say, "No problem!" and reconnect you to all those windows you had open on the server.

Finally, when you are done with all the windows and jobs on the terminal that Tmux set up for you, you can ask him to kill it, and he will shut it down, unplug it, and, straight out of Office Space, chuck it out the window. But he will gladly install a new one if you want to start another *session* with him.

That dude is super helpful!

5.3.2 First steps with *tmux*

The first thing you want to do to make sure Tmux is ready to help you is to simply type:

```
% which tmux
```

This should return something like:

```
/usr/bin/tmux
```

If, instead, you get a response like `tmux: Command not found.` then `tmux` is apparently not installed on your remote server, so you will have to install it yourself, or beg your sysadmin to do so (we will cover that in a later chapter). If you are working on the Summit supercomputer in Colorado or on Hummingbird at UCSC, then `tmux` is installed already. (As of Feb 16, 2020, `tmux` was not installed on the Sedna cluster at the NWFSC, but I will request that it be installed.)

In the analogy, above, we talked about Tmux setting up a terminal in the server room. In `tmux` parlance, such a "terminal" is called a *session*. In order to be able to tell Tmux that you want to reconnect to a session, you will *always* want to name your sessions so you will request a new session with this syntax:

```
% tmux new -s froggies
```

You can think of the `-s` as being short for "session." So it is basically a short way of saying, "Hey Tmux, give me a new session named `froggies`." That creates a new session called `froggies`, and you can imagine we've named it that because we will use it for work on a frog genomics project.

The effect of this is like Tmux firing up a new terminal in his server room, making a window on it for you, starting a new bash shell in that window, *and then giving you control of this new terminal*. In other words, it is sort of like he has opened a new shell window on a terminal for you, and is letting you see and use it on your computer at the same time.

One very cool thing about this is that you just got a new bash shell without having to login with your password and two-factor authentication again. That much is cool in itself, but is only the beginning.

The new window that you get looks a little different. For one thing, it has a section, one line tall, that is green (by default) on the bottom. In our case, on the left side it gives the name of the session (in square brackets) and then the name of the current *window* within that session. On the right side you see the *hostname* (the name of the remote computer you are working on) in quotes, followed by the date and time. The contents in that green band will look something like:

[froggies] 0:bash*

"login11" 20:02 15-Feb-20

This little line of information is the sweet sauce that will let you find your way around all the new windows that tmux can spawn for you.



If you are working on a cluster, please pay special attention to the hostname. (In the above case the hostname is `login11`). Many clusters have multiple *login* or *head* nodes, as they are called. The next time you login to the cluster, you might be assigned to a different login node which will have no idea about your tmux sessions. If that were the case in this example I would have to use `slogin login11` and authenticate again to get logged into `login11` to reconnect to my tmux session, `frooggies`. Or, if you were a CSU student and wanted to login specifically to the `login11` node on Summit the next time you logged on you could do `ssh username@colostate.edu@login11.rc.colorado.edu`. Note the specific `login11` in that statement.

Now, imagine that we want to use this *window* in our `frooggies` session, to look at some frog data we have. Accordingly, we might navigate to the directory where those data live and look at the data with `head` and `less`, etc. That is all great, until we realize that we also want to edit some scripts that we wrote for processing our froggy data. These scripts might be in a directory far removed from the data directory we are currently in, and we don't really want to keep navigating back and forth between those two directories within a single bash shell. Clearly, we would like to have two windows that we could switch between: one for inspecting our data, and the other for editing our scripts.

We are in luck! We can do this with `tmux`. However, now that we are safely working in a *session* that `tmux` started for us, we no longer have to shout “Hey Tmux!” Rather we can just “ring a little bell” to get his attention. In the default `tmux` configuration, you do that by pressing `<ctrl>-b` from anywhere within a `tmux` window. This is easy to remember because it is like a “b” for the “bell” that we ring to get our faithful servant’s attention. `<ctrl>-b` is known as the “prefix” sequence that starts all requests to `tmux` from within a session.

The first thing that we are going to do is ask `tmux` to let us assign a more descriptive, name—`data` to be specific—to the current window. We do this with

```
<ctrl>-b ,
```

(That’s right! It’s a control-b and then a comma. `tmux` likes to get by on a minimum number of keystrokes.) When you do that, the green band at the bottom of the window changes color and tells you that you can rename the current window. We simply use our keyboard to change the name to “`data`”. That was super easy!

Now, to make a new window with a new bash shell that we can use for writing scripts we do `<ctrl>-b c`. Try it! That gives you a new *window* within the `froggies` session and switches your focus to it. It is as if Tmux (in his mustard-stained shirt) has created a new window on the `froggies` terminal, brought it to the front, and shared it with you. The left side of the green `tmux` status bar at the bottom of the screen now says:

```
[froggies] 0:data- 1:bash*
```

Holy Moly! This is telling you that the `froggies` session has two windows in it: the first numbered 0 and named `data`, and the second numbered 1 and named `bash`. The `-` at the end of `0:data-` is telling you that `data` is the window you were previously focused on, but that now you are currently focused on the window with the `*` after its name: `1:bash*`.

So, the name `bash` is not as informative as it could be. Since we will be using this new window for editing scripts, let’s rename it to `edit`. You can do that with `<ctrl>-b ,`. Do it!

OK! Now, if you have been paying attention, you probably realize that `tmux` has given us two windows (with two different bash shells) in this session called `froggies`. Not only that but it has associated a single-digit number with each window. If you are all about keyboard shortcuts, then you probably have already imagined that `tmux` will let you switch between these two windows with `<ctrl>-b` plus a digit (0 or 1 in this case). Play with that. Do `<ctrl>-b 0` and `<ctrl>-b 1` and feel the power!

Now, for fun, imagine that we want to have another window and a bash shell

for launching jobs. Make a new window, name it `launch`, and then switch between those three windows.

Finally. When you are done with all that, you tell Tmux to detach from this session by typing:

```
<ctrl>-b d
```

(The `d` is for “detach”). This should kick you back to the shell from which you first shouted “Hey Tmux!” by issuing the `tmux a -t froggies` command. So, you can’t see the windows of your `froggies` session any longer, *but do not despair!* Those windows are still on the monitor Tmux set up for you, casting an eerie glow on his mustard stained shirt.

If you want to get back in the driver’s seat with all of those windows, you simply need to tell Tmux that you want to be attached again via his miracle-mirroring device. Since we are no longer in a `tmux` window, we don’t use our `<ctrl-b>` bell to get Tmux’s attention. We have to shout:

```
% tmux attach -t froggies
```

The `-t` flag stands for “target.” The `froggies` session is the target of our attach request. Note that if you don’t like typing that much, you can shorten this to:

```
% tmux a -t froggies
```

Of course, sometimes, when you log back onto the server, you won’t remember the name of the `tmux` session(s) you started. Use this command to list them all:

```
% tmux ls
```

The `ls` here stands for “list-sessions.” This can be particularly useful if you actually have multiple sessions. For example, suppose you are a poly-taxa genomicist, with projects not only on a frog species, but also on a fish and a bird species. You might have a separate session for each of those, so that when you issue `tmux ls` the result could look something like:

```
% tmux ls
birdies: 4 windows (created Sun Feb 16 07:23:30 2020) [203x59]
fishies: 2 windows (created Sun Feb 16 07:23:55 2020) [203x59]
froggies: 3 windows (created Sun Feb 16 07:22:36 2020) [203x59]
```

That is enough to remind you of which session you might wish to reattach to.

Finally, if you are all done with a `tmux` session, and you have detached from it, then from your shell prompt (not within a `tmux` session) you can do, for example:

```
tmux kill-session -t birdies
```

to kill the session. There are other ways to kill sessions while you are in them, but that is not so much needed.

Table 5.1 reviews the minimal set of `tmux` commands just described. Though there is much more that can be done with `tmux`, those commands will get you started.

TABLE 5.1: A bare bones set of commands for using `tmux`. The first column says whether the command is given within a `tmux` session rather than at the shell outside of a `tmux` session

Within <code>tmux</code> ?	Command	Effect
N	<code>tmux ls</code>	List any <code>tmux</code> sessions the server knows about
N	<code>tmux new -s name</code>	Create a new <code>tmux</code> session named “name”
N	<code>tmux attach -t name</code>	Attach to the existing <code>tmux</code> session “name”
N	<code>tmux a -t name</code>	Same as “attach” but shorter.
N	<code>tmux kill-session -t name</code>	Kill the <code>tmux</code> session named “name”
Y	<code><cntrl>-b ,</code>	Edit the name of the current window
Y	<code><cntrl>-b c</code>	Create a new window
Y	<code><cntrl>-b 3</code>	Move focus to window 3
Y	<code><cntrl>-b &</code>	Kill current window
Y	<code><cntrl>-b d</code>	Detach from current session
Y	<code><cntrl>-l</code>	Clear screen current window

5.3.3 Further steps with `tmux`

The previous section merely scratched the surface of what is possible with `tmux`.

Indeed, that is the case with this section. But here I just want to leave you with a taste for how to configure `tmux` to your liking, and also with the ability

to create different *panes* within a window within a session. You guessed it! A pane is made by splitting a *window* (which is itself a part of a *session*) into two different sections, each one running its own bash shell.

Before we start making panes, we set some configurations that make the establishment of panes more intuitive (by using keystrokes that are easier to remember) and others that make it easier to quickly adjust the size of the panes. So, first, add these lines to `~/.tmux.conf`:

```
# splitting panes
bind \ split-window -h -c '#{pane_current_path}'
bind - split-window -v -c '#{pane_current_path}'

# easily resize panes with <C-b> + one of j, k, h, l
bind-key j resize-pane -D 10
bind-key k resize-pane -U 10
bind-key h resize-pane -L 10
bind-key l resize-pane -R 10
```

Once you have updated `~/.tmux.conf` you need to reload that configuration file in `tmux`. So, from within a `tmux` session, you do `<ctrl>-b :.` This lets you type a `tmux` command in the lower left (where the cursor has become active). Type `source-file ~/.tmux.conf`

The comments show what each line is intended to do, and you can see that the configuration “language” for `tmux` is relatively unintimidating. In plain language, these configurations are saying that, after this configuration is made active, `<ctrl>-b /` will split a window (or a pane), vertically, in to two panes. (Note that this is easy to remember because on an American keyboard, the `\` and the `/`, share a key. The latter looks like a vertical separator, and would thus be a good key stroke to split a screen vertically, but why force ourselves to hit the shift key as well?). Likewise, `<ctrl>-b -` will split a window (or a pane) into two panes.

What do we mean by splitting a window into multiple panes? A picture is worth a thousand words. Figure 5.3 shows a `tmux` window with four panes. The two vertical ones on the left show a `yaml` file and a shell script being edited in `vim`, and the remaining two house shells for looking at files in two different directories.

This provides almost endless opportunities for customizing the appearance of your terminal workspace on a remote machine for maximum efficiency. Of course, doing so requires you know a few more keystrokes for handling panes. These are summarized in Table 5.2.



6

High Performance Computing (HPC) Environments

Hey Eric! You might consider breaking this into two separate chapters: 1 = working on remote computers and 2 = high-performance computing. The first could include all the stuff about scp, globus, rclone, and google drive.

This is going to be a chapter on using High Performance Computing clusters.

There is a lot to convey here about using queues and things.

I know SGE pretty well at this point, but others might use slurm.

Here is a good page with a comparison: <https://confluence.csiro.au/display/SC/Reference+Guide%3A+Migrating+from+SGE+to+SLURM>

And here is a good primer on SGE stuff: <https://confluence.sj.edu/display/HPC/Monitoring+your+Jobs>

I guess I'll have to see what the CSU students have access to.

6.1 Activating/Installing software

6.1.1 Modules

This is if your sys admin has made it easy.

6.1.2 Miniconda

This is how one will probably want to do it

6.1.2.1 Testing this on Summit

I just want to quickly try this:

```

ssh eriq@colostate.edu@login.rc.colorado.edu

# get on compile nodes
ssh scompile

# I checked modules and found no samtools, bcftools, etc.

# Now install miniconda
mkdir conda_install
cd conda_install/
wget https://repo.anaconda.com/miniconda/Miniconda3-latest-Linux-x86_64.sh
chmod u+x Miniconda3-latest-Linux-x86_64.sh
./Miniconda3-latest-Linux-x86_64.sh

# then you follow the prompts and agree to the license and the
# default install location.

## NOTE: Might want to install to a different location if there
## are serious caps on hard disk usage in home directory..

source ~/.bashrc

# after that I have it!
(base) [eriq@colostate.edu@shas0136 conda_install]$

```

Now, let's see if we can get samtools. Just google "samtools conda" to get an idea of how to do it:

```
conda install -c bioconda samtools
```

After that, it just works! Cool!

```

(base) [eriq@colostate.edu@shas0136 ~]$ samtools

Program: samtools (Tools for alignments in the SAM format)
Version: 1.9 (using htslib 1.9)

Usage:   samtools <command> [options]

Commands:
-- Indexing
dict      create a sequence dictionary file
faidx    index/extract FASTA

```

```
fqidx      index/extract FASTQ
index      index alignment
...
...
```

All right! That is amazing. Next steps:

1. Tell students about establishing different environments.
2. Learn about how to make a minimal environment for a project and how to record that and be able to distribute/propagate it.

Along those lines, I want to see if, when I install samtools into a new environment, it re-downloads it or not...

```
conda create --name quick-test
conda activate quick-test

# i also made an environment in a specified directory (you
# could put these within a project directory)
conda create --prefix ./test-envs-dir
conda activate ./test-envs-dir

# now, let's install bcftools there
conda install -c bioconda bcftools

# note that it doesn't re-download the dependencies, as far as I can tell.
conda activate base
bcftools # not found in environment base

conda activate ./test-envs-dir
bcftools # it is found in this environment. Cool.

conda activate quick-test
bcftools # it ain't here
```

Now, after that, bcftools is in ./test-envs-dir/bcftools

So, what if we install it into another environment. Does it symlink it?

```
conda activate base
conda install -c bioconda bcftools
bcftools
```

```

# whoa! That errored out!
bcftools: error while loading shared libraries: libcrypto.so.1.0.0: cannot open shared obj

# that is a serious problem.

# Can I get it in my other environment?
conda activate quick-test
conda install -c bioconda bcftools
bcftools

# that totally works, but it still doesn't in base...

# so, what if we add samtools to our other environments?
# that works fine.

```

But, samtools/bcftools dependency issues are a known problem: <https://github.com/sunbeam-labs/sunbeam/issues/181> Basically they rely on different versions of some ssh libs.

Note that installing bcftools first things work. But what if we make another environment and install samtools first again?

```

conda create --name samtools-first
conda activate samtools-first
conda install -c bioconda samtools # this didn't download anything new
conda install -c bioconda bcftools

# BOOM! THIS CREATES A FAIL. SO, YOU GOTTA INSTALL BCFTOOLS
# FIRST. FAR OUT.

```

6.1.3 Exporting environments

Looks like we should be able to do this. Let's do the one that works:

```

(quick-test) [~]--% conda env export > quick-test-env.yml

(quick-test) [~]--% cat quick-test-env.yml
name: quick-test
channels:
  - bioconda
  - defaults
dependencies:

```

```
- _libgcc_mutex=0.1=main
- bcftools=1.9=ha228f0b_4
- bzip2=1.0.8=h7b6447c_0
- ca-certificates=2019.5.15=1
- curl=7.65.3=hbc83047_0
- htslib=1.9=ha228f0b_7
- krb5=1.16.1=h173b8e3_7
- libcurl=7.65.3=h20c2e04_0
- libdeflate=1.0=h14c3975_1
- libedit=3.1.20181209=hc058e9b_0
- libgcc-ng=9.1.0=hdf63c60_0
- libssh2=1.8.2=h1ba5d50_0
- libstdcxx-ng=9.1.0=hdf63c60_0
- ncurses=6.1=he6710b0_1
- openssl=1.1.1c=h7b6447c_1
- samtools=1.9=h10a08f8_12
- tk=8.6.8=hbc83047_0
- xz=5.2.4=h14c3975_4
- zlib=1.2.11=h7b6447c_3
prefix: /home/eriq@colostate.edu/miniconda3/envs/quick-test

# OK, that is cool. Now, if we wanted to email that to someone,
# we could, and then they could do this:
conda env create --name dupie-quick -f quick-test-env.yml

# that environment then has samtools and bcftools

# note that it probably would try to name it quick-test if we didn't
# pass in the name there...
```

6.2 Boneyard

This is a variant of rsync that lets you sync stuff up to google drive. It might be a better solution than rcp for getting stuff onto and off of google drive. Here is a link: <https://rclone.org/>. I need to evaluate it. It might also be a good way to backup some of my workstuff on my laptop to Google Drive (and maybe also for other people to create replicas and have a decent backup if they have unlimited Google Drive storage).

I got this working. It is important to set your own OAuth client ID: <https://forum.rclone.org/t/very-slow-sync-to-google-drive/6903>

After that I did like this:

```
rclone sync -vv --tpslimit 10 --fast-list Otsh_v1.0_genomic.fna gdrive-rclone:spoogee-spo
```

which did 2 Gb of fasta into the spoogee-spoogee directory pretty quickly.

But, with something that has lots of files, it took longer:

```
# this is only about 100 Mb but took a long time
rclone copy -P --tpslimit 10 --fast-list rubias gdrive-rclone:rubias
```

However, once that is done, you can sync it and it finds that parts that have changed pretty quickly.

it appears to do that by file modification times:

```
2019-04-19 23:21 /Otsh_v1.0/--% rclone sync -vv --tpslimit 10 --fast-list Otsh_v1.0_genomic
2019/04/19 23:21:36 DEBUG : rclone: Version "v1.47.0" starting with parameters ["rclone" ""]
2019/04/19 23:21:36 DEBUG : Using config file from "/Users/eriq/.config/rclone/rclone.conf"
2019/04/19 23:21:36 INFO  : Starting HTTP transaction limiter: max 10 transactions/s with
2019/04/19 23:21:37 DEBUG : GCF_002872995.1_Otsh_v1.0_genomic.gff.gz: Excluded
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.dict: Excluded
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.fna.amb: Excluded
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.fna.ann: Excluded
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.fna.bwt: Excluded
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.fna.fai: Excluded
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.fna.pac: Excluded
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.fna.sa: Excluded
2019/04/19 23:21:37 INFO  : Google drive root 'spoogee-spoogee': Waiting for checks to fin
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.fna: Size and modification time the same (di
2019/04/19 23:21:37 DEBUG : Otsh_v1.0_genomic.fna: Unchanged skipping
2019/04/19 23:21:37 INFO  : Google drive root 'spoogee-spoogee': Waiting for transfers to
2019/04/19 23:21:37 INFO  : Waiting for deletions to finish
2019/04/19 23:21:37 INFO  :
Transferred:          0 / 0 Bytes, -, 0 Bytes/s, ETA -
Errors:               0
Checks:              1 / 1, 100%
Transferred:          0 / 0, -
Elapsed time:         1.3s

2019/04/19 23:21:37 DEBUG : 5 go routines active
2019/04/19 23:21:37 DEBUG : rclone: Version "v1.47.0" finishing with parameters ["rclone" ""]
```

So, for moving big files around that might be a good way forward. I will have to do a test with some big files.

And I need to test it with team drives so that multiple individuals can pull stuff off of the Bird Genoscape drive for example.

It would be nice to have safeguards so people don't trash stuff accidentally....

6.2.0.1 rclone on Hoffman

Their default install script expects sudo access to put it in /usr/local but I don't on hoffman, obviously, so I just downloaded the the install script and edited the section for Linux to look like this at the relevant part

```
case $OS in
  'linux')
    #binary
    cp rclone ~/bin/rclone.new
    chmod 755 ~/bin/rclone.new
    #chown root:root /usr/bin/rclone.new
    mv ~/bin/rclone.new ~/bin/rclone
    #manuals
    #mkdir -p /usr/local/share/man/man1
    #cp rclone.1 /usr/local/share/man/man1/
    #mandb
  ;;
;
```

I don't get man pages, but I get it in ~/bin no problem.

To set up the configuration, check where it belongs:

```
% rclone config file
Configuration file doesn't exist, but rclone will use this path:
/u/home/e/eriq/.config/rclone/rclone.conf
```

And then I just put my config file from my laptop on there. I just pasted the stuff in whilst emacsing it. Holy cow! That is super easy.

Note that the config file is where you can also set default options like tpslimit and fast-list I think.

So, the OAuth stuff is all stored in that config file. And if you can set it up on one machine you can go put it on any others that you want. That is awesome.

When it was done, I tested it:

```
% rclone sync -vv --drive-shared-with-me gdrive-rclone:BaselinePaper BaselinePaper_here
2019/04/29 14:49:24 DEBUG : rclone: Version "v1.47.0" starting with parameters ["rclone"
2019/04/29 14:49:24 DEBUG : Using config file from "/u/home/e/eriq/.config/rclone/rclone.c
2019/04/29 14:49:25 INFO  : Local file system at /u/home/e/eriq/BaselinePaper_here: Waiting
2019/04/29 14:49:25 INFO  : Local file system at /u/home/e/eriq/BaselinePaper_here: Waiting
2019/04/29 14:49:26 DEBUG : Local file system at /u/home/e/eriq/BaselinePaper_here: File t
2019/04/29 14:49:26 DEBUG : BaselinePaper_Body.docx: Failed to pre-allocate: operation not
2019/04/29 14:49:26 INFO  : BaselinePaper_Body.docx: Copied (new)
2019/04/29 14:49:26 DEBUG : BaselinePaper_Body.docx: Updating size of doc after download t
2019/04/29 14:49:26 INFO  : BaselinePaper_Body.docx: Copied (Rcat, new)
2019/04/29 14:49:27 DEBUG : Local file system at /u/home/e/eriq/BaselinePaper_here: File t
2019/04/29 14:49:27 DEBUG : ResponseToReviewers_eca.docx: Failed to pre-allocate: operation
2019/04/29 14:49:27 INFO  : ResponseToReviewers_eca.docx: Copied (new)
2019/04/29 14:49:27 DEBUG : ResponseToReviewers_eca.docx: Updating size of doc after downl
2019/04/29 14:49:27 INFO  : ResponseToReviewers_eca.docx: Copied (Rcat, new)
2019/04/29 14:49:27 INFO  : Waiting for deletions to finish
2019/04/29 14:49:27 INFO  :
Transferred:      193.543k / 193.543 kBBytes, 100%, 79.377 kBBytes/s, ETA 0s
Errors:          0
Checks:          0 / 0, -
Transferred:     4 / 4, 100%
Elapsed time:    2.4s

2019/04/29 14:49:27 DEBUG : 6 go routines active
2019/04/29 14:49:27 DEBUG : rclone: Version "v1.47.0" finishing with parameters ["rclone"
```

That was fast and super solid.

6.2.0.2 Encrypt the config file

You can use `rclone config edit` to set a password for the config file. Then it encrypts that so no one is able to run wild if they just get that file. You have to provide your password to do any of the rclone commands. If you want to see the config file use `rclone config show`. You could always copy that elsewhere, and then re-encrypt it.

Here is some nice stuff for summarizing all the information from the different runs from the chinook-wgs project:

```
qacct -o eriq -b 09271925 -j ml | tidy-qacct
```

Explain scratch space and how clusters are configured with respect to storage, etc.

Strategies—break names up with consistent characters:

- dashes within population names
- underscores for different groups of chromosomes
- periods for catenating pairs of pops

etc. Basically, it just makes it much easier to split things up when the time comes.

6.3 The Queue (SLURM/SGE/UGE)

6.4 Modules package

6.5 Compiling programs without admin privileges

Inevitably you will want to use a piece of software that is not available as a module or is not otherwise installed on they system.

Typically these software programs have a frightful web of dependencies.

Unix/Linux distros typically maintain all these dependencies as libraries or packages that can be installed using a `rpm` or `yum`. However, the simple “plug-and-play” approach to using these programs requires have administrator privileges so that the software can be installed in one of the (typically protected) paths in the root (like `/usr/bin`).

But, you can use these programs to install packages into your home directory. Once you have done that, you need to let your system know where to look for these packages when it needs them (i.e., when running a program or *linking* to it whilst compiling up a program that uses it as a dependency).

Hoffman2 runs CentOS. Turns out that CentOS uses `yum` as a package manager.

Let's see if we can install `llvm` using `yum`.

```
yum search all llvm # <- this got me to devtoolset-7-all.x86_64 : Package shipping all available packages
# a little web searching made it look like llvm-toolset-7-5.0.1-4.el7.x86_64.rpm or devtoolset-7-5.0.1-4.el7.x86_64.rpm
```

```
# might be what we want. The first is a dependency of the second...
mkdir ~/centos
```

Was using instructions at <https://stackoverflow.com/questions/36651091/how-to-install-packages-in-linux-centos-without-root-user-with-automatic-depen>

Couldn't get yum downloader to download any packages. The whole thing looked like it was going to be a mess, so I thought I would try with miniconda.

I installed miniconda (python 2.7 version) into /u/nobackup/kruegg/eriq/programs/miniconda/ and then did this:

```
# probably could have listed them all at once, but wanted to watch them go
# one at a time...
conda install numpy
conda install scipy
conda install pandas
conda install numba

# those all ran great.

conda install pysnptools

# that one didn't find a match, but I found on the web that I should try:
conda install -c bioconda pysnptools

# that worked!
```

Also we want to touch briefly on LD_PATH (linking failures—and note that libraries are often named libxxx.a) and CPATH (for failure to find xxxx.h), etc.

6.6 Job arrays

Definitely mention the eval keyword in bash for when you want to print command lines with redirects.

Show the routine for it, and develop a good approach to efficiently orchestrating redos. If you know the taskIDs of the ones that failed then it is pretty easy to write an awk script that picks out the commands and puts them in a new

file. Actually, it is probably better to just cycle over the numbers and use the `-t` option to launch each. Then there is now changing the job-ids file.

In fact, I am starting to think that the `-t` option is better than putting it into the file.

Question: if you give something on the command line, does that override the directive in the header of the file? If so, then you don't even need to change the file. Note that using the `qsub` command line options instead of the directives really opens up a lot of possibilities for writing useful scripts that are flexible.

Also use short names for the jobs and have a system for naming the redos (append numbers so you know which round it is, too) possibly base the name on the ways things failed the first time. Like, `fsttf1` = "Fst run for things that failed due to time limits, 1". Or structure things so that redos can just be done by invoking it with `-t` and the jobid.

6.7 Writing `stdout` and `stderr` to files

This is always good to do. Note that `stdbuf` is super useful here so that things don't get buffered super long. (PCAngsd doesn't seem to write anything till the end...)

6.8 Breaking stuff down

It is probably worth talking about how problems can be broken down into smaller ones. Maybe give an example, and then say that we will be talking about this for every step of the way in bioinformatic pipelines.

One thing to note—sometimes processes go awry for one reason or another. When things are in smaller chunks it is not such a huge investment to re-run it. (Unlike stuff that runs for two weeks before you realize that it ain't working right).



Part II

Part II: Reproducible Research Strategies



7

Introduction to Reproducible Research

(Pritchard et al., 2000)

And let's again try to pitch it in there: (Pritchard et al., 2000).

Let's try chucking it in without parens: Pritchard et al. (2000)



8

Rstudio and Project-centered Organization

Somewhere talk about here::here(): https://github.com/jennybc/here_here

8.1 Organizing big projects

By “big” I mean something like the chinook project, or your typical thing this is a chapter in a dissertation or a paper.

I think it is useful for number things in order on a three-digit system, and at the top of each make directories `outputs` and `intermediates`, like this:

```
dir.create(file.path(c("outputs", "intermediates"), "203"), recursive = TRUE, showWarnings = TRUE)
```

I had previously used two variables `output_dir` and `interm_dir` to specify these in each notebook, but now I think it would be better to just hardwire those, for a few reasons:

- Sometimes you are working on two notebooks at once in the same environment and you don’t want to get confused about where things should get written.
- You can’t use those variables in shell blocks of code, where you will just have to write the paths out anyway.
- Hard-wiring the paths forces you to think about the fact that once you establish the name for something, you should not change it, ever.
- Hard-wiring the paths makes it easy to identify access to those different files. In particular you can write an R script that rips through all the lines of code in the Rmds (and R files) in your project and records all the instances of writing and reading of files from the outputs and intermediates directories. If you do this, you can make a pretty cool dependency graph so that you can visualize what you need to keep to clean things up for a final reproducible project. *Note: I should write a little R package that can analyze such dependencies in a project. Unless there is already something like that. (Note*

that these are not package dependencies, but, rather, internal project dependencies. Note that if one is consistent with using readr functions it would be pretty easy to find all those instances of `read_` and `write_*` and that makes it clear why standardized syntax like that is so useful.* Hey! Notice that this type of analysis would be made simple if we just focused on dependencies between different Rmds. That is probably the level we want to keep it at as well. Ideally you can make a graph of all files that are output from one Rmd and read into another. That would be a fun graph to make of the Chinook project.

- Note. You should keep 900-999 as 100 slots for Rnotebooks for the final reproducible project to go with a publication. So, you can pare down all the previous notebooks and things.
- Hey! Sometimes you are going to want to write or read files that have been auto-produced. For example, if you are cycling over chromosomes, you might have output files that start something like: `outputs/302/chromo_output_`. So, when generating those names, make sure that the full prefix is in there, and has a trailing underscore. Then you can still find it with a regex search, and also recognize it as a signifying a class of output files.

9

Version control

9.1 Why use version control?

9.2 How git works

9.3 git workflow patterns

9.4 using git with Rstudio

9.5 git on the command line



10

A fast, furious overview of the tidyverse

Basically want to highlight why it can be so useful for bioinformatic data (and also some of the limitations with really large data sets).

(But, once you have whittled bams and vcfs down to things like GWAS results and tables of theta values, they dplyr is totally up for the job.)

A really key concept here is going to be the relational data model (e.g. tidy data) and how it is so much better for handling data.

A superpowerful example of this is provided by `tidytree`¹ which allows one to convert from phylo objects to a tidy object: Shoot! that is so much easier to look at! This is a great example of how a single approach to manipulating data works so well for other things that have traditionally not been manipulated that way (and as a consequence have been completely opaque for a long time to most people.)

Cool. I should definitely have a chapter on tidy trees and `ggtree`.

What I really want to stress is that the syntax of the tidyverse is such that it makes programming a relaxing and enjoyable experience.

¹<https://cran.r-project.org/web/packages/tidytree/vignettes/tidytree.html>



11

Authoring reproducibly with Rmarkdown

11.1 Notebooks

Here is a pro-tip. First, number your notebooks and have outputs and intermediates directories associated with them. And second, always save the R object that is a ggplot in the outputs so that if you want to tweak it without re-generating all the underlying data, you can do that easily.

11.2 References

Science, as an enterprise, has proceeded with each new generation of researchers building upon the discoveries and achievements of the previous. Scientific publication honors this tradition with the stringent requirement of diligent citation of previous work. Not only that, but it is incumbent upon every researcher to identify all current work by others that is related to their own, and discuss its similarities and differences. As recently as the early 90s, literature searches involved using an annual index *printed on paper!* And, if you found a relevant paper you had to locate it in a bound volume in the library stacks and copy it page by page at a Xerox machine (or send an undergraduate intern to do that...)

Today, of course, the Internet, search services like Google Scholar, and even Twitter, have made it far easier to identify related work and to keep abreast of the latest developments in your field. But, this profusion of new literature leads to new challenges with managing all this information in a way that makes it easy for you to access, read, and cite papers while writing your own publications. There are many reference management systems available today, to help you with this task. Some of these are proprietary and paid products like EndNote. Many institutions (like Colorado State University) have licenses that provide their students a no-cost way to obtain EndNote, but the license

will not extend to updates to the program, once the student has graduated. (CHECK THIS!!!).

An alternative citation manager is Zotero. It is an open source project that has been funded not by publishing companies (like its non-open-source competitors, Mendeley and ReadCube) but by the non-profit Corporation for Digital Scholarship. As an open-source project, outside contributors have been enabled to develop workflows for integrating Zotero with reproducible research authoring modalities like Rmarkdown, including RStudio integration that lets you drop citations from Zotero directly into your Rmarkdown document where they will be cited and included in the references list in the format of just about any journal you might want to choose from. Accordingly, I will describe how to use Zotero as a citation manager while writing Rmarkdown documents.

Install Zotero and be sure to install the connector for Chrome, Firefox, or Safari

11.2.1 Zotero and Rmarkdown

Zotero has to be customized slightly to integrate with Rmarkdown and RStudio, you must install the R package `citr`, and you should make some configurations:

1. First, you have to get a Zotero add-on that can translate your Zotero library into a different format called BibTeX format (which is used with the TeX typesetting engine and the LaTeX document preparation system). Do this by following the directions at <https://retorque.re/zotero-better-bibtex/installation/>.
2. When you restart Zotero, you can choose all the default configurations in the BetterBibTeX start-up wizard.
3. Then, configure the BetterBibTeX preferences by going to the Zotero preferences, choosing BetterBibTeX, and then selecting “Export” button. That yields a page that gives you a place to omit certain reference fields. Your life will be easier if you omit fields that are often long, or which are not needed for citation. I recommend filling that field with:

```
abstract,copyright,file,pmid
```

And, you probably should restart Zotero after doing that.

4. Install the R package `citr`. It is on CRAN, but it is probably best

to first try the latest development version. Install it from within R using:

```
devtools::install_github("crsh/citr")
```

For more information about this package check out <https://github.com/crsh/citr>.

5. Once that package is installed. Quit and re-open RStudio. Now, if you go to the “Addins” menu (right under the name panel at the top of the RStudio window) you will see the option to “Insert citations.” Choosing that brings up a dialog box. You can choose the Zotero libraries to connect to. It might take a while to load your Zotero library if it is large. Once it is loaded though, you just start typing the name of the author or part of an article title, and *boom!* if that article is in your library it appears as an option. If you select it, you get a markdown citation in your text.
6. To avoid having to go to the “Addins” menu, you can set a keyboard shortcut for “Insert citations” by choosing the “Code” section of RStudio’s preferences and, under the “Editing” tab, clicking the “Modify Keyboard Shortcuts” command, searching for “Insert citations” and then selecting the keyboard shortcut area of the row and keying in which keys you would like to give you the shortcut (for example, Shift-CMD-I).

After those steps, you are set up to draw from your Zotero library or libraries to insert citations into your R markdown document.

Pretty cool, but there are some things that are sort of painful—namely the Title vs. Sentence casing. Fortunately, citr just adds things to your references.bib, it doesn’t re-overwrote references.bib each time, so you can edit references.bib to put titles in sentence case. Probably want to export without braces protecting capitals. Then it should all work. See this discussion¹. Just be sure to version control references.bib and commit it often. Though, you might want to go back and edit stuff in your Zotero library.

(Barson et al., 2015)

¹<https://forums.zotero.org/discussion/61715/prevent-extra-braces-in-bibtex-export>

11.3 Bookdown

Whoa! Bookdown has figured out how to do references to sections and tables and things in a reasonable way that just isn't there for the vanilla Rmarkdown. But you can use the bookdown syntax for a non-book too. Just put something like this in the YAML:

```
output:
  bookdown::word_document2: default
  bookdown::pdf_document2:
    number_sections: yes
  bookdown::html_document2:
    df_print: paged
```

11.4 Google Docs

This ain't reproducible research, but I really like the integration with Zotero. Perhaps I need a chapter which is separate from this chapter that is about disseminating results and submitting stuff, etc.

12

Using python

Many people live and breathe python. Most conservation geneticists and most biologists in general are probably more familiar and comfortable with R. Nonetheless, there are some pieces of software that are available in python and it behooves us to know at least enough to crack those open and start using them.

Happily, the makers of RStudio have made it very easy to use python within the RStudio IDE. This makes the transition considerably easier.

Topics:

- conda and installing and setting up python environments. (What are they under the hood?)
- the reticulate package
- step-by-step instructions.
- An example: 2Dsf and the moments package.



Part III

Part III: Bioinformatic Analyses



13

Overview of Bioinformatic Analyses

This is going to be sequence based stuff and getting to variants.

Part IV will be “bioinformaticky” analyses that you might encounter once you have your variants.

I think now that I will insert QC relevant to each step in that section.

Hey Eric! Find a place to put a section about bedtools in there. It is pretty cool what you can do with it, even on VCF files, like coverage of a VCF file in windows to get a sliding window of variant density.



14

DNA Sequences and Sequencing

To understand the fundamentals of alignment of DNA sequence to a reference genome, and all the intricacies that such a process entails, it is important to know a few important facts about DNA and how the sequence of a DNA molecule can be determined. This section may be review for some, but it presents the minimal set of knowledge needed to understand how DNA sequencing works, today.

14.1 DNA Stuff

In bioinformatics, we are primarily going to be interested in representing DNA molecules in text format as a series of nucleotide bases (A, C, G, T). For the most part, we don't want to stray from that very simple representation; however, it is important to understand a handful of things about *DNA directionality* and the action of DNA polymerase during the process of *DNA replication* to understand next generation sequencing and DNA alignment conventions.

DNA typically occurs as a double-helix of two *complementary* strands. Each strand is composed of a *backbone* of phosphates and deoxyribose molecules, to which DNA *bases* are attached. Figure 14.1 shows this for a fragment of *double-stranded* DNA of four nucleotides.

The orange parts show the ribose molecules in the backbone, while the four remaining colors denote the nucleotide bases of adenine (A), cytosine (C), guanine (G), and thymine (T). Each base on one strand is associated with its *complement* on the other strand. The hydrogen bonds between complements is what holds the two strands of DNA together. A and T are complements, and C and G are complements. (I remember this by noting that C and G are curvy and A and T are sharp and angular, so the pairs go together...).

Immediately this raises two challenges that must be resolved for making a simple, text-based representation of DNA:

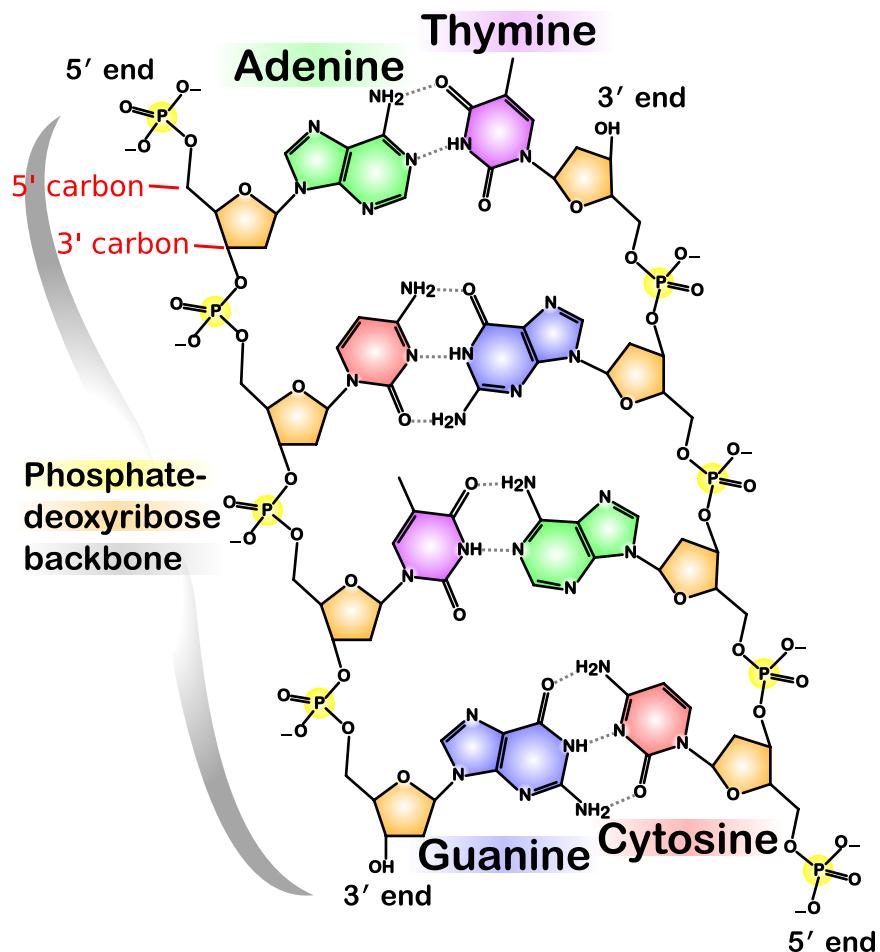


FIGURE 14.1: Schematic of the structure of DNA.
 (Figure By Madprime (talk—contribs) CC BY-SA 3.0,
<https://commons.wikimedia.org/w/index.php?curid=1848174>)

1. When describing a sequence of DNA bases, which direction will we read it in?
2. Which strand will we read off of?

We leave the second question until later. But note that the order in which DNA sequence is read is, by convention, from the 5' to the 3' end of the molecule. The terms 3' and 5' refer to different carbon atoms on the ribose backbone molecules. In the figure above, each little “kink” in the ribose molecule ring (and in the attached lines) is a carbon molecule. If you count clockwise from the oxygen in ribose, you see that the third carbon (the 3' carbon) is the carbon atom that leads to a phosphate group, and through the phosphate, to an attachment with the 5' carbon atom of the next ribose. The 3' and 5' carbon atoms are labelled in red on the top-left ribose molecule in Figure 14.1.

Notice that when we speak of reading a DNA sequence, we are implicitly talking about reading the sequence of one of the two strands of the double-stranded DNA molecule. I'll say it again: a DNA sequence is always the sequence of one *strand* of the molecule. But, if that DNA were “out living in the wild” it would have been in double-stranded form, and would have been paired with its complement sequence. For now, just note that any DNA sequence always has a complement which is read in the reverse direction. Thus, if we have a sequence like:

5'--ACTCGACCT--3'

Then, paired with its complement it would look like:

5'--ACTCGACCT--3'
|||||||
3'--TGAGCTGGA--5'

and, if you were to write its complement in standard 5' to 3' order, you would have to reverse it like so:

5'--AGGTCGAGT--3'

14.1.1 DNA Replication with DNA Polymerase

So, why do we read DNA sequence from 5' to 3'? Is it just because geneticists are wacky, backwards folks and thought it would be fun to read in a direction that sounds, numerically, to be backwards? No! It is because 5' → 3' is the direction in which a new strand of DNA is synthesized during DNA replication.

When Watson and Crick (1953) published the first account of the double helical structure of DNA, they noted that the double-helix (i.e., two-stranded) nature of the molecule immediately suggested a copying mechanism (Figure 14.2).

It has not escaped our notice that the specific pairing we have postulated immediately suggests a possible copying mechanism for the genetic material.

Full details of the structure, including the conditions assumed in building it, together with a set of co-ordinates for the atoms, will be published elsewhere.

We are much indebted to Dr. Jerry Donohue for constant advice and criticism, especially on interatomic distances. We have also been stimulated by a knowledge of the general nature of the unpublished experimental results and ideas of Dr. M. H. F. Wilkins, Dr. R. E. Franklin and their co-workers at

FIGURE 14.2: Excerpt from Crick and Watson (1953).

(I've also included, in the excerpt, the inadequate acknowledgment of the centrality of Rosalind Franklin's pioneering X-ray crystallography results to Crick and Watson's conclusions—an issue in scientific history about which much has been written, see, for example, this article¹ in *The Guardian*.)

Figure 14.3 shows a schematic of what DNA looks like during the replication process.

Essentially, during DNA replication, a *DNA polymerase* molecule finds nucleotide bases (attached to three phosphate groups) to build a new strand that is complementary to the DNA *template* strand, and it guides those *nucleotide triphosphates* to the appropriate place in the complementary strand and helps them be incorporated into that growing, complementary strand. The newly synthesized strand is a *reverse complement* of the template strand. However, DNA polymerase is not capable of "setting up shop" anywhere upon a template strand and simply stuffing complementary bases in wherever it wants. In fact, DNA polymerase is only able to add new bases to a growing strand if it can attach the new nucleotide triphosphate to a *free 3' hydroxyl* that is on the end of the growing strand (the 3' hydroxyl is just a hydroxyl group attached to the 3' carbon). In Figure 14.3, the template strand is the strand on the right of the figure, and the growing complementary strand is on the left side. There is a free 3' hydroxyl group on the ribose attached to the cytosine base. That is what is needed for DNA polymerase to be able to place a thymine triphosphate (complementary to adenine on the template strand) in the currently vacant position. If that thymine comes with a free 3' hydroxyl

¹<https://www.theguardian.com/science/2015/jun/23/sexism-in-science-did-watson-and-crick-really-steal-rosalind-franklins-data>

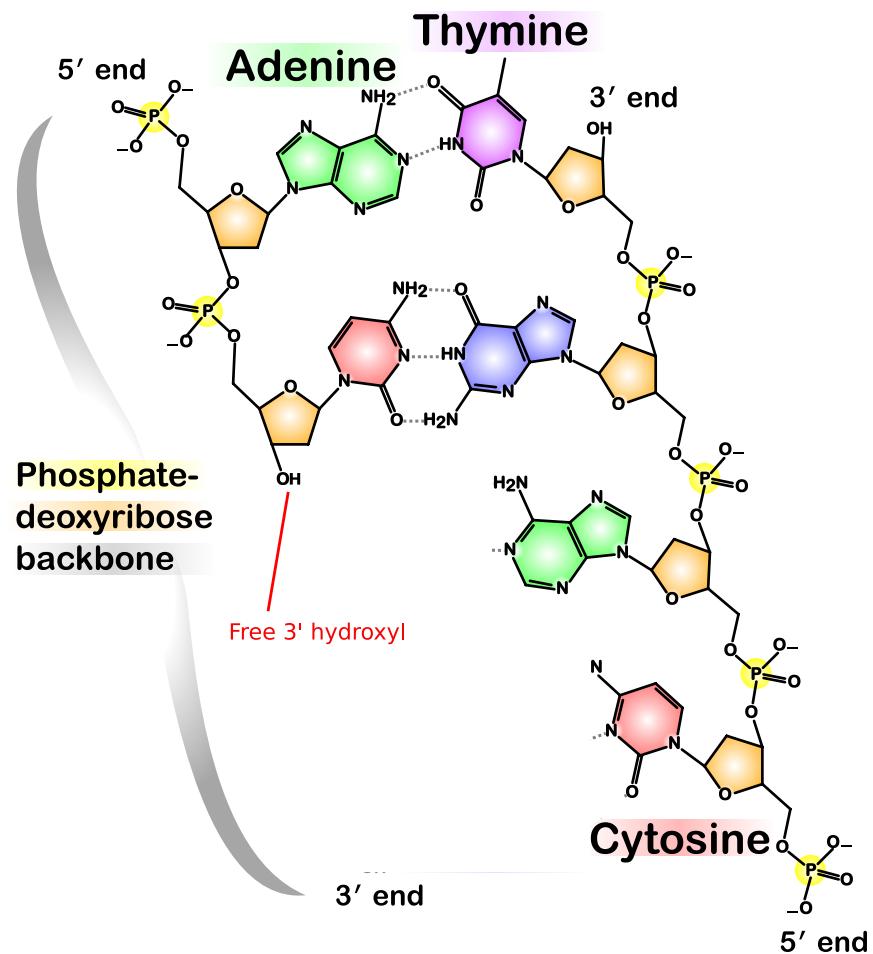


FIGURE 14.3: DNA during replication. (Figure adapted from the one by Madprime (talk—contribs) CC BY-SA 3.0, <https://commons.wikimedia.org/w/index.php?curid=1848174>)

group, then DNA polymerase will next place a guanine (complementary to the cytosine on the template strand) on the growing chain. And so forth. Thus, we see how the new strand of DNA is synthesized from the 5' to the 3' end *of the growing chain*.

Of course, some people find it easier to think about a new strand of DNA being synthesized in the 3' to 5' direction *along the template strand*. This is equivalent. However, if you just remember that “free three” rhymes, and that DNA polymerase needs a free 3' hydroxyl to add a new base to the growing strand, you can always deduce that DNA must “grow” in a 5' to 3' direction.

14.1.2 The importance of the 3' hydroxyl...

It would be hard to overstate the importance to molecular biology of DNA polymerase's dependence upon a free 3' hydroxyl group for new strand synthesis. This simple fact plays a central role in:

1. polymerase chain reaction (PCR)—the PCR primers are little oligonucleotides that attach to a template strand and provide a free 3' hydroxyl group for the initiation of synthesis.
2. a ddNTP is a nucleotide attached to a ribose molecule that lacks a hydroxyl group on its 3' carbon. Incorporation of such a ddNTP into a growing DNA strand terminates further DNA extension, and forms the basis for Sanger sequencing (we'll explore this below).
3. Some medications are designed to interfere with viral DNA replication. For example, AZT, or azino-thymine, is an anti-retroviral drug used to slow the progression of AIDS. It is a thymine nucleotide with an azino (N_3) group (instead of a hydroxyl group) attached to the 3' carbon. Azino-thymine is used preferentially by reverse transcriptase when synthesizing DNA. Incorporation of it into a growing chain terminates DNA synthesis.

The reversible inhibition of DNA extension also plays an important role in sequencing by synthesis as used by Illumina platforms. We will discuss this in a moment, but first we take a stroll down memory lane to refresh our understanding of *Sanger sequencing* so as to understand how radically different *next-generation sequencing* technologies are.

14.2 Sanger sequencing

It is hard to imagine that the first public human genome was sequenced almost entirely by Sanger sequencing. We discuss the Sanger sequencing method here so we can contrast it with what happens on, say, an Illumina machine today.

To perform Sanger sequencing, first it was necessary to do PCR to create numerous copies of a double stranded DNA fragment that was to be sequenced. For example let's say that one wanted to sequence the 20-mer shown below, represented as double stranded DNA.

```
5'--AGGCTCAAGCTTCGACCGT--3'  
3'--TCCGAGTTCGAAGCTGGCA--5'
```

For Sanger sequencing, first, one would do PCR to create bazillions of copies of that double-stranded DNA. Then four separate further PCR reactions would be done, each one having been “spiked” with a little bit of one of four different ddNTPs which, if incorporated into the growing strand allow no further extension of it.

For example, if PCR were done as usual, but with the addition of ddATP, then occasionally, when a ddATP (an A lacking a 3' hydroxyl group) is incorporated into the growing strand that strand will grow no more. Consequently, the products of that PCR (incorporating an appropriate concentration of ddATPs), once filtered to retain only the top strand from above, will include the fragments

```
## [1] "A*"                  "AGGCTCA*"  
## [3] "AGGCTCAA*"          "AGGCTCAAGCTTCGA*"
```

Where the * follows the sequence-terminating base.

Likewise, in a separate reaction, occasional incorporation of a ddCTP will yield products:

```
## [1] "AGGC*"              "AGGCTC*"  
## [3] "AGGCTCAAGC*"        "AGGCTCAAGCTTC*"  
## [5] "AGGCTCAAGCTTCGAC*" "AGGCTCAAGCTTCGACC*"
```

And in another reaction, occasional incorporation of ddGTP yields:

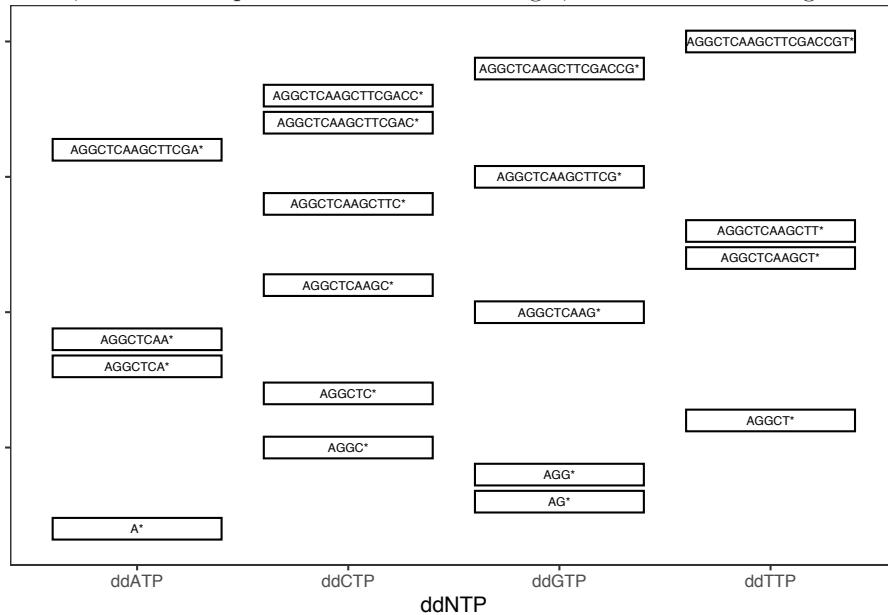
```
## [1] "AG*"                 "AGG*"  
## [3] "AGGCTCAAG*"         "AGGCTCAAGCTTCG*"  
## [5] "AGGCTCAAGCTTCGACCG*"
```

And in a final, separate reaction, incorporation of ddTTP would give:

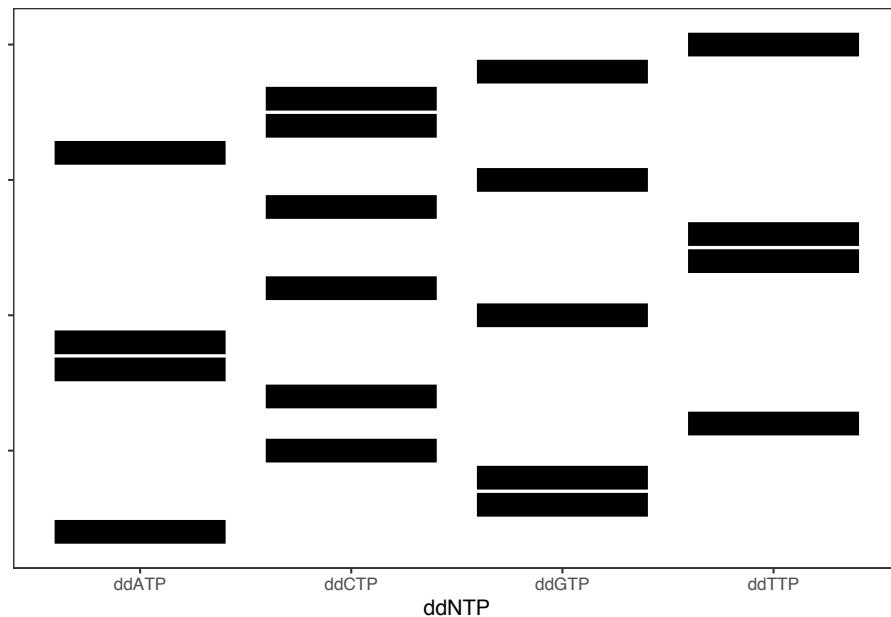
```
## [1] "AGGCT*"             "AGGCTCAAGCT*"
```

```
## [3] "AGGCTCAAGCTT*"      "AGGCTCAAGCTTCGACCGT*"
```

Each of these fragments is of a different length, so they can be separated on an electrophoretic gel. The secret to Sanger sequencing is that the products of all four separate reactions can be run side by side in separate lanes of the gel (or, as was done later, in separate capillaries...), so that the gel, with small fragments running faster than large fragments, from the top to the bottom of the gel, would look like Figure ??:



In reality, a gel like that in Figure ??, won't bear the name of each sequence fragment. In fact, it will look much more like what you see in Figure ??.



However, even with the DNA fragment sequences obscured, their sequences can be determined by working from the bottom to the top and adding a different DNA base according to which column the band is in. Try it out.

Some very important points must be made about Sanger sequencing:

1. The signal obtained from sequencing is, in a sense, a mixture of the starting templates. So, if you have DNA from an individual, you have two copies of each chromosome, and they might carry slightly different sequences. At heterozygous sites, it is impossible to tell which allele came from which chromosome.
2. To conduct this procedure, it was typical that specific PCR primers were used to sequence only a single fragment of interest. Extending the sequencing beyond that region often involved a laborious process of “walking” primers further out in either direction. Very tedious.
3. Each sequencing reaction was typically carried out for just a single individual at once.
4. Until a little over a decade ago, this is how sequencing was done in conservation genetics.

14.3 Illumina Sequencing by Synthesis

Illumina paired-end sequencing is currently the leading technology in conservation genomics.

They say that a picture is worth a thousand words, so a video may well be worth ten thousand. Illumina has a very informative video about sequencing by synthesis.

I have used some code (I found on GitHub) to provide captions to the video. These captions include comments, as well as questions that form part of this week's homework. (Yay!)

You can see the video at <https://eriqande.github.io/erics-captioned-vids/vids/illumina-sbs/>

The main take-home messages I want everyone to get about Illumina sequencing is:

1. The signal obtained from each cluster is the sequence of a single, *single-stranded DNA fragment*
 2. In paired-end sequencing, sequence from both ends of the fragment (but not necessarily the middle) is obtained.
 3. The technique lends itself to sequencing millions of “anonymous” chunks of DNA.
 4. The indexes, or “barcodes” allow DNA from multiple individuals to be sequenced in a single run.
 5. This is how most high-throughput sequencing is done today.
-

14.4 Library Prep Protocols

Gotta mention here about how barcodes work.

How you prepare your libraries dictates what type of data you get.

14.4.1 WGS

14.4.2 RAD-Seq methods

14.4.3 Amplicon Sequencing

14.4.4 Capture arrays, RAPTURE, etc.



15

Bioinformatic file formats

Almost all the high-throughput sequencing data you will deal with should arrive in just a few different formats. There are some specialized formats (like those output by the program TASSEL, etc.) but we will largely ignore those, focusing instead on the formats used in production by the 1000 genomes and 10K vertebrate genomes projects. In a sentence, the most important are: FASTA, FASTQ, SAM, BAM, and VCF.

Plan: Go over these, and for each, pay special attention to compressed and indexed forms and explain why that is so important. I think that we should probably talk about the programs that are available for manipulating each of these, as well, but I won't add that until we all have access to an HPC or other proper Unix environment.

I was originally going to do tools for manipulating files in the different formats, but I will do that in a separate chapter(s) later.

15.1 Sequences

15.2 FASTQ

The FASTQ format is the standard format for lightly-processed data coming off an Illumina machine. If you are doing whole genome sequencing, it is typical for the Illumina processing pipeline to have separated all the reads with different barcodes into different, separate files. Typically this means that all the reads from one library prep for one sample will be in a single file. The barcodes and any associated additional adapter sequence is typically also removed from the reads. If you are processing RAD data, the reads may not be separated by barcode, because, due to the vagaries of the RAD library prep, the barcodes might appear on different ends of some reads than expected.

A typical file extension for FASTQ files is `.fq`. Almost all FASTQ files you get

15.2.1 Line 1: Illumina identifier lines

The identifier line can be just about any string that starts with an @, but, from Illumina data, today, you will typically see something like this:

```
@K00364:64:HTYYCBBXX:1:1108:4635:14133/1
```

The colons (and the /) are field separators. The separate parts of the line above are interpreted something along the lines as follows (keeping in mind that Illumina occasionally changes the format and that there may be additional optional fields):

@	: mandatory character that starts the ID line
K00364	: Unique sequencing machine ID
64	: Run number on instrument
HTYYCBBXX	: Unique flow cell identifier
1	: Lane number
1108	: Tile number (section of the lane)
4635	: x-coordinate of the cluster within the tile
14133	: y-coordinate of the cluster within the tile
1	: Whether the sequence is from read 1 or read 2

Question: For paired reads, do you expect the x- and y-coordinates for read 1 and read 2 to be the same?

15.2.2 Line 4: Base quality scores

The base quality scores give an estimate of the probability that the base call is incorrect. This comes from data the sequencer collects on the brightness and compactness of the cluster radiance, other factors, and Illumina's own models for base call accuracy. If we let p be the probability that a base is called incorrectly, then Q , the Phred-scaled base quality score, is:

$$Q = \lfloor -10 \log_{10} p \rfloor,$$

where $\lfloor x \rfloor$ means "the largest integer smaller than x .

To get the estimate of the probability that the base is called incorrectly from the Phred scaled score, you invert the above equation:

$$p = \frac{1}{10^{Q/10}}$$

Base quality scores from Illumina range from 0 to 40. The easiest values to use as guideposts are $Q = 0, 10, 20, 30, 40$, which correspond to error probabilities of 1, 1 in 10, 1 in 100, 1 in 1,000, and 1 in 10,000, respectively.

All this is fine and well, but when we look at the quality score line above

we see something like 7JJF-<JAFJJ<F<AJAJF. What gives? Well, from a file storage and parsing perspective, it makes sense to only use a single character to store the quality score for every base. So, that is what has been done: each of those single characters represents a quality score—a number between 0 and 40, inclusive.

The values that have been used are the *decimal representations of ASCII text characters* minus 33.

The decimal representation of each character can be found in Figure 15.1.

The decimal representation is in the upper left of each character's rectangle.

Find the characters corresponding to base quality scores of 0, 10, 20, 30, and 40. Remember that the base quality score is the character's decimal representation *minus 33*.

Here is another question: why do you think the scale starts with ASCII character 33?

15.2.3 A FASTQ ‘tidyverse’ Interlude

Here we demonstrate some R code while exploring FASTQ files. First, in order to do these exercises you will want to download and launch the RStudio project, `big-fastq-play`, that has the data in it. Please work within that RStudio project to do these exercises. Here is a direct download link to it: https://docs.google.com/uc?export=download&id=1iD8tz_KSOHDBpXvXssqo3noPZAm1Qsjp

Note that this might stress out older laptops as it loads 100s of Mb of sequence data into memory.

15.2.3.1 Reading FASTQs with `read_lines`

Load packages:

```
library(tidyverse)

# if you don't have this package, get it
# install.packages("viridis")
library(viridis)
```

Read the FASTQ, make it a matrix, then make it a tibble

ASCII CONTROL CODE CHART

b7	0	0	0	1	1	0	1	0	1	1	1	
b6	0	0	1	0	1	1	0	0	1	1	0	
b5	0	0	1	0	1	1	0	0	1	1	1	
BITS	CONTROL			SYMBOLS NUMBERS			UPPER CASE			LOWER CASE		
b4 b3 b2 b1	0	NUL	16 DLE	32 SP	48 0	64 @	80 P	96 ‘	112 p	112	160	
0 0 0 0	0	0	0 10 20	20 40 30	60 40 40	100 50	120 60	140 70	70 160			
0 0 0 1	1	SOH	DC1 !	33 49	65 81	81 97	121 61	141 71	113 161			
0 0 1 0	2	STX	DC2 ”	34 50	66 82	82 98	122 62	142 72	114 162			
0 0 1 1	3	ETX	DC3 #	35 51	67 83	83 99	123 63	143 73	115 163			
0 1 0 0	4	EOT	DC4 \$	36 52	68 84	84 100	124 64	144 74	116 164			
0 1 0 1	5	ENQ	NAK %	37 53	69 85	85 101	125 65	145 75	117 165			
0 1 1 0	6	ACK	SYN &	38 54	70 86	86 102	126 66	146 76	118 166			
0 1 1 1	7	BEL	ETB ’	39 55	71 87	87 103	127 67	147 77	119 167			
1 0 0 0	8	BS	CAN (40 56	72 88	88 104	130 68	150 78	120 170			
1 0 0 1	9	HT	EM)	41 57	73 89	89 105	131 69	151 79	121 171			
1 0 1 0	10	LF	SUB *	42 58	74 90	90 106	132 6A	152 7A	122 172			
1 0 1 1	11	VT	ESC +	43 59	75 91	91 107	133 6B	153 7B	123 173			
1 1 0 0	12	FF	FS ,	44 60	76 92	92 108	134 6C	154 7C	124 174			
1 1 0 1	13	CR	GS =	45 61	77 93	93 109	135 6D	155 7D	125 175			
1 1 1 0	14	SO	RS .	46 62	78 94	94 110	136 6E	156 7E	126 176			
1 1 1 1	15	SI	US /	47 63	79 95	95 111	137 6F	157 7F	127 177			

LEGEND:

dec	CHAR
hex	oct

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FIGURE 15.1: This lovely ASCII table shows the binary, hexadecimal, octal and decimal representations of ASCII characters (in the corners of each square; see the legend rectangle at bottom. Table produced from TeX code written and developed by Victor Eijkhout available at <https://ctan.math.illinois.edu/info/ascii-chart/ascii.tex>

```

# use read_lines to read the R1 fastq file line by line;
# then make a 4 column matrix, filling by rows
# then drop column 3, which corresponds to the "+" line
R1 <- read_lines("data/Battle_Creek_01_chinook_R1.fq.gz") %>%
  matrix(ncol = 4, byrow = TRUE) %>%
  .[, -3]

# add colnames
colnames(R1) <- c("ID", "seq", "qual")

# now make a tibble out that. We will assign
# it back to the variable R1, to note carry
# extra memory around
R1 <- as_tibble(R1)

# Look at it:
R1

# OK, 1 million reads.

```

Look at the first ID line:

```
©E00430:101:HKT7WCCXY:1:1101:6411:1204 1:N:0:NGATGT
```

Aha! This is a slightly different format than the above. The part after the space has colon-separated fields that are:

```

1      : which read of the pair
N      : has this been filtered (Y/N)
0      : control number (always 0 on HiSeq and NextSeq)
NGATGT : barcode on the read

```

OK, our mission is to actually look at the locations of these reads on different tiles. To do that we will want to access the x and y coordinates and the tiles, etc. In the tidyverse, this means giving each of those things its own column.

15.2.3.2 `tidy::separate()`

How do we break those colon-separated fields into columns? This is a job for `tidy::separate` which breaks a text string on user-defined separators into columns in a tibble.

Here we can use it to break the ID into two parts split on the space, and then break the first part of the ID into its constituent parts:

```
# first we break on the space,
# then we break the ID on the colons, but keep the original "id" for later
R1 %>%
  separate(ID, into = c("id", "part2"), sep = " ") %>%
  separate(
    id,
    into = c("machine", "run", "flow_cell", "lane", "tile", "x", "y"),
    sep = ":",
    remove = FALSE
  )
```

Wow! That was cool. Now, your mission is to pipe that (with `%>%`) into another `separate()` command that breaks part2 into `read`, `filter`, `cnum`, and `barcode`, and save that into `R1_sep`

Here is a starter:

```
R1_sep <- R1 %>%
  separate(ID, into = c("id", "part2"), sep = " ") %>%
  separate(
    id,
    into = c("machine", "run", "flow_cell", "lane", "tile", "x", "y"),
    sep = ":",
    remove = FALSE
  ) %>%
  ...your code here...

# when you are done with that, look at it
R1_sep
```

Doh! There is one thing to note. Look at the first few columns of that:

```
# A tibble: 1,000,000 x 11
  id      machine run flow_cell lane tile   x     y
  <chr>    <chr>  <chr> <chr>    <chr> <chr> <chr> <chr>
1 @E00430:10... @E00430 101 HKT7WCCXY 1     1101  6411  1204
2 @E00430:10... @E00430 101 HKT7WCCXY 1     1101  7324  1204
3 @E00430:10... @E00430 101 HKT7WCCXY 1     1101  8582  1204
4 @E00430:10... @E00430 101 HKT7WCCXY 1     1101  9841  1204
5 @E00430:10... @E00430 101 HKT7WCCXY 1     1101  10186 1204
```

The x- and the y-coordinates are listed as characters (`<chr>`) but they should be numeric. This shows the default behavior of `separate()`: it just breaks each

field into a column of strings. However, you can ask `separate()` to make a good-faith guess of the type of each column and convert it to that. This works suitably in this situation, so, let's repeat the last command, but convert types automatically:

```
R1_sep <- R1 %>%
  separate(ID, into = c("id", "part2"), sep = " ") %>%
  separate(
    id,
    into = c("machine", "run", "flow_cell", "lane", "tile", "x", "y"),
    sep = ":",
    remove = FALSE,
    convert = TRUE
  ) %>%
  separate(part2, into = c("read", "filter", "cnum", "barcode"), sep = ":" , convert = TRUE)
```

15.2.3.3 Counting tiles

Let's see how many tiles these reads came from. Basically we just want to count the number of rows with different values for tile. Read the documentation for `dplyr::count` with

```
?count
```

and when you are done count up the number of reads in each tile:

```
R1_sep %>%
  ...your code here...
```

Turns out they are all from the same tile...

15.2.3.4 Parsing quality scores

Now, we want to turn the quality-score ASCII-characters into Phred-scaled qualities, ultimately taking the average over each sequence of those.

Check out this function:

```
utf8ToInt("!*JGH")
## [1] 33 42 74 71 72
```

We can use that to get Phred-scaled values by subtracting 33 from the result. Let's check:

```
utf8ToInt("!+5?IJ") - 33
```

```
## [1] 0 10 20 30 40 41
```

Note that J seems to be used for “below 1 in 10,000” as it is the highest I have ever seen.

So, what we want to do is make a new column called `mean_qual` that gives the mean of the Phred-scaled qualities. Any time you need to make a new column in a tibble, where the result in each row depends only on the values in current columns in that same row, that is a job for `mutate()`.

However, in this case, because the `utf8ToInt()` function doesn't take vector input, computing the `mean_qual` for every row requires using one of the `map()` family of functions. It is a little beyond what we want to delve into at the moment. But here is what it looks like:

```
R1_sepq <- R1_sep %>%
  mutate(mean_qual = map_dbl(.x = qual, .f = function(x) mean(utf8ToInt(x) - 33)))
```

Check out the distribution of those mean quality scores:

```
ggplot(R1_sepq, aes(x = mean_qual)) +
  geom_histogram(binwidth = 1)
```

15.2.3.5 Investigating the spatial distribution of reads and quality scores

Now, use the above as a template to investigate the distribution of the x-values:

```
ggplot(R1_sepq, aes(...your code here...)) +
  geom_histogram(bins = 500)
```

And, do the same for the y-values.

```
# Dsn of y
ggplot(R1_sepq, aes(x = y)) +
  geom_histogram(bins = 500) +
  coord_flip()
```

Hmm... for fun, make a 2-D hex-bin plot

```
ggplot(R1_sepq, aes(x = x, y = y)) +
  geom_hex(bins = 100) +
  scale_fill_viridis_c()
```

That is super interesting. It looks like the flowcell or camera must have a mild issue where the smears are between $y = 20,000$ and $30,000$.

It is natural to wonder if the quality scores of the reads that did actually get recovered from those regions have lower quality scores. This makes a hexbin plot of the mean quality scores:

```
# hexbin of the mean quality score
ggplot(R1_sepq, aes(x = x, y = y, z = mean_qual)) +
  stat_summary_hex(bins = 100) +
  scale_fill_viridis_c()
```

Cool.

15.2.4 Comparing read 1 to read 2

One question that came up in class is whether the quality of read 2 is typically lower than that of read 1. We can totally answer that with the data we have. It would involve,

1. reading in all the read 2 reads and separating columns.
2. computing the read 2 mean quality scores
3. joining (see `left_join()`) on the `id` columns and then making a scatter plot.

Go for it...

15.3 FASTA

The FASTQ format, described above, is tailored for representing short DNA sequences—and their associated quality scores—that have been generated from high-throughput sequencing machines. A simpler, leaner format is used to represent longer DNA sequences that have typically been established from

a lot of sequencing, and which no longer travel with their quality scores. This is the FASTA format, which you will typically see storing the DNA sequence from *reference genomes*. FASTA files typically use the file extensions `.fa`, `.fasta`, or `.fna`, the latter denoting it as a FASTA file of nucleotides.

In an ideal world, a reference genome would contain a single, uninterrupted sequence of DNA for every chromosome. While the resources for some well-studied species include “chromosomal-level assemblies” which have much sequence organized into chromosomes in a FASTA file, even these genome assemblies often include a large number of short fragments of sequence that are known to belong to the species, but whose location and orientation in the genome remain unknown.

More often, in conservation genetics, the reference genome for an organism you are working on might be the product of a recent, small-scale, assembly of a *low-coverage genome*. In this case, the genome may be represented by thousands, or tens of thousands, of *scaffolds*, only a few of which might be longer than one or a few megabases. All of these scaffolds go into the FASTA file of the reference genome.

Here are the first 10 lines of the FASTA holding a reference genome for Chinook salmon:

```
>CM008994.1 Oncorhynchus tshawytscha isolate JC-2011-M1
AGTGTAGTAGTATCTTACCTATAGGGGACAGTGTAGTAGTATCTTACTTATTTGGGGACAATGCTCTAGTGTAGTAG
AATCTTACCTTATAGGGGACAGTGCTGGAGTCAGTGTATCTTACCTATAGGGGACAGTGTGGAGTGTAGTAGTG
TCTCGGCCACAGCCGGCAGGCCCTCAGTCTTAGTTAGACTCTCCACTCCATAAGAAAGCTGGTACTCCATCTGGACAGG
ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGAACAGCATATACCAAGA
TGTGTGGTACATGTTTACAGAGAAGGAGtatattaaaaacagaaaactgTTTGttgaaatattttttgtctgaAG
CCCGAAAAACACATGAAATTCAAAGATAATTGACCTACGCACTAACTAGGCTTTCAAGCAGCTCAACTACTGCCGTT
TATTGATCTACTGTACTGCAACACATATGTACTCACACAACAGACTATATTGGATTCAAGCAGGACCTATAGGTTACCA
TGCTTCCTCTACAGGACCTATAGGTTACCATGCTTCCTCTACAAGGTCTATAGGTTACCATGCGTCCTCTACAG
GACCTATAGGTTACCATGCTTCCTCTACAGGGCCTATAGGTTACCATGCTTCCTCTACAGGGACCTGTAGGTTACCA
```

The format is straightforward: any line starting with `>` is interpreted as a line holding the identifier of the following sequence. In this case, the identifier is `CM008994.1`. The remainder of the line (following the first white space) are further comments about the sequence, but will not typically be carried through downstream analysis (such as alignment) pipelines. In this case `CM008994.1` is the name of an assembled chromosome in this reference genome. The remaining lines give the DNA sequence of that assembled chromosome.

It is convention with FASTA files that lines of DNA sequence should be less than 80 characters, but this is inconsistently enforced by different analysis programs. However, most of the FASTA files you will see will have lines that are 80 characters long.

In the above fragment, we see DNA sequence that is either upper or lower

case. A common convention is that the lowercase bases are segments of DNA that have been inferred (by, for example RepeatMasker) to include repetitive DNA. It is worth noting this if you are trying to design assays from sequence data! However, not all reference genomes have repeat-sequences denoted in this fashion.

Most reference genomes contain gaps. Sometimes the length of these gaps can be accurately known, in which case each missing base pair is replaced by an N. Sometimes gaps of unknown length are represented by a string of N's of some fixed length (like 100).

Finally, it is worth reiterating that the sequence in a reference-genome FASTA file represents the sequence only one strand of a double-stranded molecule. In chromosomal-scale assemblies there is a convention to use the strand that has its 5' end at the telomere of the short arm of the chromosome ([Cartwright and Graur, 2011](#)). Obviously, such a convention cannot be enforced in a low-coverage genome in thousands of pieces. In such a genome, different scaffolds will represent sequence on different strands; however the sequence in the FASTA file, whichever strand it is upon, is taken to be the reference, and that sequence is referred to as the *forward* strand of the reference genome.

15.3.1 Genomic ranges

Almost every aspect of genomics or bioinformatics involves talking about the “address” or “location” of a piece of DNA in the reference genome. These locations within a reference genome can almost universally be described in terms of genomic range with a format that looks like:

SegmentName:start-stop

For example,

CM008994.1:1000001-1001000

denotes the 1 Mb chunk of DNA starting from position 1000001 and proceeding to (and including!) position 1001000. Such nomenclature is often referred to as the *genomic coordinates* of a segment.

In most applications we will encounter, the first position in a chromosome labeled 1. This is called a *base 1 coordinate system*. In some genomic applications, a *base 0 coordinate system* is employed; however, for the most part such a system is only employed internally in the guts of code of software that we will use, while the user interface of the software consistently uses a base 1 coordinate system.

15.3.2 Extracting genomic ranges from a FASTA file

Commonly (for example, when designing primers for assays) it is necessary to pick out an precise genomic range from a reference genome. This is something that you should *never* try to do by hand. That is too slow and too error prone. Rather the software package `samtools` (which will be discussed in detail later) provides the `faidx` utility to *index* a FASTA file. It then uses that index to provide lightning fast access to specific genomic coordinates, returning them in a new FASTA file with identifiers giving the genomic ranges. Here is an example using `samtools faidx` to extract four DNA sequences of length 150 from within the Chinook salmon genome excerpted above:

```
# assume the working directory is where the fasta file resides

# create the index
samtools faidx GCA_002831465.1_CHI06_genomic.fna

# that created the file: GCA_002831465.1_CHI06_genomic.fna.fai
# which holds four columns that constitute the index

# now we extract the four sequences:
samtools faidx \
    GCA_002831465.1_CHI06_genomic.fna \
    CM009007.1:3913989-3914138 \
    CM009011.1:2392339-2392488 \
    CM009013.1:11855194-11855343 \
    CM009019.1:1760297-1760446

# the output is like so:
>CM009007.1:3913989-3914138
TTACCGATggaacatttgaaaaacacaaCAATAAGCCTTGTGTCCTATTGTTGTATT
TGCTTCGTGCTGTTAATGGTAGttgcacttgattcagcagccgtAGGCCGGGAAGcag
tgttcccattttgaaaaaTGTCATGTCTGA
>CM009011.1:2392339-2392488
gatgcctctagcactgaggatgccttagaccgctgtgccactcgggaggcctcaGCCTA
ACTCTAACTGTAAGTAAATTGTGTATTGGTACATTCGCTGGTCCCCACAAGGG
GAAAGggctatTTtaggttagggtaagg
>CM009013.1:11855194-11855343
TGAGGTTCTGACTTCATTTCAATTCACAGCAGTTACTGTATGCCTCGGTCAAATTGAAA
GGAAAGTAAAGTAACCATGTGGAGCTGtatggtgtactgtactgtactgtattgtactgt
attgtgtGGACGTGAGGCAGGTCCAGATA
>CM009019.1:1760297-1760446
ttcccagaatctctatgttaaccaaggtttgcaaatgtAACATCAGTAGGGAGAGAG
```

```
aggaaataaagggggaagaggtatTTTactgtcataaacctaccCCTcaggccaacgt
catgacactcccgttaatcacacagactGG
```

15.3.3 Downloading reference genomes from NCBI

Gotta write a blurb here about how much nicer it is to use the ftp link: <ftp://ftp.ncbi.nlm.nih.gov/genomes/genbank/>. More on this, eventually...

15.4 Alignments

A major task in bioinformatics is *aligning* reads from a sequencing machine to a reference genome. We will discuss the operational features of that task in a later chapter, but here we treat the topic of the SAM, or Sequence Alignment Map, file format which is widely used to represent the results of sequence alignment. We attempt to motivate this topic by first considering a handful of the intricacies that arise during sequence alignment, before proceeding to a discussion of the various parts of the SAM file that are employed to handle the many and complex ways in which DNA alignments can occur and be represented. This will necessarily be an incomplete and relatively humane introduction to SAM files. For the adventurous a more complete—albeit astonishingly terse—description of the SAM format specification¹ is maintained and regularly updated.

15.4.1 How might I align to thee? Let me count the ways...

We are going to consider the alignment of very short (10 bp) paired reads from the ends of a short (50 bp) fragment from the fourth line of the FASTA file printed above. In other words, those 80 bp of the reference genome are:

5' ACATAGACAGGGACCACCTGCAGGACACACACCGCAGGTTACTAAGGGTTACTCAACACAGTGAACAGCATATACCAGA 3'

And we will be considering double-stranded DNA occupying the middle 50 base pairs of that piece of reference genome. That piece of double stranded DNA looks like:

5' ACCTGCAGGACACACACCGCAGGTTACTAAGGGTTACTCAACACAGTGA 3'
|||||||||||||||||||||||||||||||||||||||||||||

¹<https://samtools.github.io/hts-specs/SAMv1.pdf>

3' TGGACGTCCCTGTGTGCGTCCAAATGATTCCCAAATGAGTTGTGTCACT 5'

If we print it alongside (underneath, really) our reference genome, we can see where it lines up:

```
5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGAACAGCATATACCAGA 3'
      5' ACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGA 3'
           ||||||| ||||||| ||||||| ||||||| ||||||| ||||||| |||
      3' TGGACGTCCCTGTGTGCGTCCAAATGATTCCCAAATGAGTTGTGTCACT 5'
```

Now, remember that any template being sequenced on an Illumina machine is going to be single-stranded, and we have no control over which strand, from a double-stranded fragment of DNA, will get sequenced. Furthermore, recall that for this tiny example, we are assuming that the reads are only 10 bp long. Ergo, if everything has gone according to plan, we can expect to see two different possible *templates*, where I have denoted the base pairs that do not get sequenced with -'s

either:

5' ACCTGCAGGA-----AACACAGTGA 3'

or:

3' TGGACGTCCCT-----TTGTGTCACT 5'

If we see the top situation, we have a situation in which the template that reached the lawn on the Illumina machine comes from the strand that is represented in the reference genome. This is called the *forward strand*. On the other hand, the bottom situation is one in which the template is from the reverse complement of the strand represented by the reference. This is called the *reverse strand*.

Now, things start to get a little more interesting, because we don't get to look at the entire template as one contiguous piece of DNA in the 5' to 3' direction. Rather, we get to "see" one end of it by reading Read 1 in the 5' to 3' direction, and then we "see" the other end of it by reading Read 2, also in the 5' to 3' direction, *but Read 2 is read off the complementary strand*.

So, if we take the template from the top situation:

the original template is:

5' ACCTGCAGGA-----AACACAGTGA 3'

So the resulting reads are:

Read 1:	5' ACCTGCAGGA 3'	--> from 5' to 3' on the template
Read 2:	5' TCACTGTGTT 3'	--> the reverse complement of the read on the 3' end of the template

And if we take the template from the bottom scenario:

the original template is:

3' TGGACGTCCT-----TTGTGTCACT 5'

So the resulting reads are:

Read 1: 5' TCACTGTGTT 3' --> from 5' to 3' on the template
 Read 2: 5' ACCTGCAGGA 3' --> the reverse complement of the
 read on the 3' end of the template

Aha! Regardless of which strand of DNA the original template comes from, sequences must be read off of it in a 5' to 3' direction (as that is how the biochemistry works). So, there are only two possible sequences you will see, and these correspond to reads from 5' to 3' off of each strand. So, the only difference that happens when the template is from the forward or the reverse strand (relative to the reference), is whether Read 1 is from the forward strand and Read 2 is from the reverse strand, or whether Read 1 is from the reverse strand and Read 2 is from the forward strand. The actual pair of sequences you will end up seeing is still the same.

So, to repeat, with a segment of DNA that is a faithful copy of the reference genome, there are only two read sequences that you might see, and as we will show below *Read 1 and Read 2 must align to opposite strands of the reference*.

What does a faithful segment from the reference genome look like in alignment?
 Well, in the top case we have:

```
Read 1: 5' ACCTGCAGGA 3'  

5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTAACACAGTGAACAGCATATACCAGA 3'  

forward-strand  

||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||  

reverse-strand  

3' TGTATCTGTCCCTGGTGGACGTCCGTGTGTGCGTCAAATGATTCCAAATGAGTTGTGTCACTTGTGTATATGGTCT 5'  

Read 2: 3' TTGTGTCACT 5'
```

And in the bottom case we have:

```
Read 2: 5' ACCTGCAGGA 3'  

5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTAACACAGTGAACAGCATATACCAGA 3'  

forward-strand  

||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||  

reverse-strand  

3' TGTATCTGTCCCTGGTGGACGTCCGTGTGTGCGTCAAATGATTCCAAATGAGTTGTGTCACTTGTGTATATGGTCT 5'  

Read 1: 3' TTGTGTCACT 5'
```

Note that, although one of the reads always aligns to the reverse strand, the position at which it is deemed to align is still read off of the position on the forward strand. (Thank goodness for that! Just think how atrocious it would be if we counted positions of fragments mapping to the reverse strand by

starting from the reverse strands's 5' end, on the other end of the chromosome, and counting forward from there!!)

Note that the *alignment position* is one of the most important pieces of information about an alignment. It gets recorded in the **POS** column of an alignment. It is recorded as the first position (counting from 1 on the 5' end of the forward reference strand) at which the alignment starts. Of course, the name of the reference sequence the read maps to is essential. In a SAM file this is called the **RNAME** or reference name.

Both of the last two alignments illustrated above involve paired end reads that align “properly,” because one read in the pair aligns to the forward strand and one read aligns to the reverse strand of the reference genome. As we saw above, that is just what we would expect if the template we were sequencing is a faithful copy (apart from a few SNPs or indels) of either the forward or the reverse strand of the reference sequence. In alignment parlance we say that each of the reads is “mapped in a proper pair.” This is obviously an important piece of information about an alignment and it is recorded in a SAM file in the so-called **FLAG** column for each alignment. (More on these flags later...)

How can a read pair not be properly mapped? There are a few possibilities:

- (1) One read of the pair gets aligned, but the other does not. For example something that in our schematic would look like this:

```
5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGAACACAGCATATACCAGA 3'  
      5' ACCTGCAGGA 3'
```

- (2) Both reads of the pair map to the same strand. If our paired end reads looked like:

```
Read 1: 5' ACCTGCAGGA 3'  
Read 2: 5' AACACAGTGA 5'
```

then they would both align nicely to just the forward strand of the reference genome:

```
5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGAACACAGCATATACCAGA 3'  
      5' ACCTGCAGGA-----AACACAGTGA 3'
```

And, as we saw above, this would indicate the the template must not conform to the reference genome in some way. This may occur if there is a rearrangement (like an inversion, etc.) in the genome being sequenced, relative to the reference genome.

- (3) The two different reads of a pair get aligned to different chromosomes/scaffolds or they get aligned so far apart on the same chromosome/scaffold that the alignment program determines the pair to be aberrant. This evaluation requires that the program have a lot

of other paired end reads from which to estimate the distribution, in the sequencing library, of the *template length*—the length of the original template. The template length for each read pair is calculated from the mapping positions of the two reads and is stored in the **TLEN** column of the SAM file.

What is another way I might align to thee? Well, one possibility is that a read pair might align to many different places in the genome (this can happen if the reads are from a repetitive element in the genome, for example). In such cases, there is typically a “best” or “most likely” alignment, which is called the *primary alignment*. The SAM file output might record other “less good” alignments, which are called *secondary alignments* and whose status as such is recorded in the **FLAG** column. The aligner **bwa mem** has an option to allow you to output all secondary alignments. Since you don’t typically output and inspect all secondary alignments (something that would be an unbearable task), most aligners provide some measure of confidence about the alignment of a read pair. The aligner, *bwa*, for example, looks at all possible alignments and computes a score for each. Then it evaluates confidence in the primary alignment by comparing its score to the sum of the scores of all the alignments. This provides the *mapping quality score* found in the **MAPQ** column of a SAM file. It can be interpreted, roughly, as the probability that the given alignment of the read pair is incorrect. These can be small probabilities, and are represented as Phred scaled values (using integers, not characters!) in the SAM file.

The last way that a read might align to a reference is by not perfectly matching every base pair in the reference. Perhaps only the first part of the read matches base pairs in the reference, or maybe the read contains an insertion or a deletion. For example, if instead of appearing like 5' ACCTGCAGGA 3', one of our reads had an insertion of AGA, giving: 5' ACCAGAGTGCAGGA 3', this fragment would still align to the reference, at 10 bp, and we might record that alignment, but would still want a compact way of denoting the position and length of the insertion—a task handled by the **CIGAR** column.

To express all these different ways in which an alignment can occur, each read occupies a single line in a SAM file. This row holds information about the read’s alignment to the reference genome in a number of TAB-delimited columns. There are 11 required columns in each alignment row, after which different aligners may provide additional columns of information. Table 15.1 gives a brief description of the 11 required columns (intimations of most of which occurred in **ALL CAPS BOLDFACE** in the preceding paragraphs. Some, like **POS** are relatively self-explanatory. Others, like **FLAG** and **CIGAR** benefit from further explanation as given in the subsections below.

TABLE 15.1: Brief description of the 11 required columns in a SAM file.

Column	Field	Data Type	Description
1	QNAME	String	Name/ID of the read (from FASTQ file)
2	FLAG	Integer	The SAM flag
3	RNAME	String	Name of scaffold/chromosome the read aligns to
4	POS	Integer	1-based 5'-most alignment position on reference forward strand
5	MAPQ	Integer	Phred-scaled mapping quality score
6	CIGAR	String	String indicating matches, indels and clipping in alignment
7	RNEXT	String	Scaffold/chromosome that the read's mate aligns to
8	PNEXT	Integer	Alignment position of the read's mate
9	TLEN	Integer	Length of DNA template whose ends were read (in paired-end sequencing)
10	SEQ	String	The sequence of the read, represented in 5' to 3' on the reference forward strand
11	QUAL	String	Base quality scores, ordered from 5' to 3' on the reference forward strand

15.4.2 Play with simple alignments

Now, everyone **who has a Mac** should clone the RStudio project repository on GitHub at <https://github.com/eriqande/alignment-play> (by opening a new RStudio project with the “From Version Control” → GitHub option, for example).

This has a notebook that will let us do simple alignments and familiarize ourselves with the output in SAM format.

15.4.3 SAM Flags

The FLAG column expresses the status of the alignment associated with a given read (and its *mate* in paired-end sequencing) in terms of a combination of 12 yes-or-no statements. The combination of all of these “yesses” and “nos” for a given aligned read is called its *SAM flag*. The yes-or-no status of any single one of the twelve statements is called a “bit” because it can be thought of as a single binary digit whose value can be 0 (No/False) or 1 (Yes/True). Sometimes a picture can be helpful: we can represent each statement as a circle which is shaded if it is true and open if it is false. Thus, if all 12 statements are false you would see $\circ\circ\circ\circ \circ\circ\circ\circ \circ\circ\circ\circ$. However, if statements 1, 2, 5, and 7 are true then you would see $\circ\circ\circ\circ \bullet\bullet\bullet\bullet \circ\circ\bullet\bullet$. In computer parlance we would say that bits 1, 3, 5, and 7 are “set” if they indicate Yes/True. As these are bits in a binary number, each bit is associated with a power of 2 as shown in Table 15.2, which also lists the meaning of each bit.

TABLE 15.2: SAM flag bits in a nutshell. The description of these in the SAM specification is more general, but if we restrict ourselves to paired-end Illumina data, each bit can be interpreted by the meanings shown here. The “bit-grams” show a visual representation of each bit with open circles meaning 0 or False and filled circles denoting 1 or True. The bit grams are broken into three groups of four, which show the values that correspond to different place-columns in the hexadecimal representation of the bit masks.

bit-#	bit-gram	2^x	dec	hex	Meaning
1	$\circ\circ\circ\circ \circ\circ\circ\circ \bullet\bullet_2^0$	1	0x1		the read is paired (i.e. comes from paired-end sequencing.)
2	$\circ\circ\circ\circ \circ\circ\circ\circ \circ\bullet\bullet_2^1$	2	0x2		the read is mapped in a proper pair
3	$\circ\circ\circ\circ \circ\circ\circ\circ \circ\bullet\circ_2^2$	4	0x4		the read is not mapped/aligned
4	$\circ\circ\circ\circ \circ\circ\circ\circ \bullet\circ\circ_2^3$	8	0x8		the read’s mate is not mapped/aligned
5	$\circ\circ\circ\circ \circ\circ\bullet\bullet \circ\circ\circ_2^4$	16	0x10		the read maps to the reverse strand
6	$\circ\circ\circ\circ \circ\bullet\circ\circ \circ\circ\circ_2^5$	32	0x20		the read’s mate maps to the reverse strand
7	$\circ\circ\circ\circ \bullet\bullet\circ\circ \circ\circ\circ_2^6$	64	0x40		the read is read 1
8	$\circ\circ\circ\circ \bullet\circ\circ\circ \circ\circ\circ_2^7$	128	0x80		the read is read 2
9	$\circ\circ\bullet\circ \circ\circ\circ\circ \circ\circ\circ_2^8$	256	0x100		the alignment is not primary (don’t use it!)
10	$\circ\circ\bullet\circ \circ\circ\circ\circ \bullet\circ\circ_2^9$	512	0x200		the read did not pass platform quality checks

bit-#	bit-gram	2^x	dec	hex	Meaning
11	○●○○ ○○○○ ○○○○ ^{2¹⁰}		1024	0x400	the read is a PCR (or optical) duplicate
12	●○○○ ○○○○ ○○○○ ^{2¹¹}		2048	0x800	the alignment is part of a chimeric alignment

If we think of the 12 bits as coming in three groups of four we can easily represent them as hexadecimal numbers. Hexadecimal numbers are numbers in base-16. They are expressed with a leading “0x” but otherwise behave like decimal numbers, except that instead of a 1’s place, 10’s place, and 100’s place, and so on, we have a 1’s place, a 16’s place, and 256’s place, and so forth. In the first group of four bits (reading from right to left) the bits correspond to 0x1, 0x2, 0x4, and 0x8, in hexadecimal. The next set of four bits correspond to 0x10, 0x20, 0x40, and 0x80, and the last set of four bits correspond to 0x100, 0x200, 0x400, 0x800. It can be worthwhile becoming comfortable with these hexadecimal names of each bit.

In the SAM format, the **FLAG** field records the decimal (integer) equivalent of the binary number that represents the yes-or-no answers to the 12 different statements. It is relatively easy to do arithmetic with the hexadecimal flags to find the decimal equivalent: add up the numbers in each of the three hexadecimal value places (the 1’s, 16’s, and 256’s places) and multiply the result by 16 raised to the number of zeros right of the “x” in the hexadecimal number. For example if the bits set on an alignment are 0x1 & 0x2 & 0x10 & 0x40, then they sum column-wise to 0x3, and 0x50, so the value listed in the FLAG field of a SAM file would be $3 + 5 \cdot 16 = 83$.

While it is probably possible to get good at computing these 12-bit combinations from hexadecimal in your head, it is also quite convenient to use the Broad Institute’s wonderful SAM flag calculator².

We will leave our discussion of the various SAM flag values by noting that the large SAM-flag bits (0x100, 0x200, 0x400, and 0x800) all signify something “not good” about the alignment. The same goes for 0x4 and 0x8. On the other hand, when you are dealing with paired-end data, one of the reads has to be read 1 and the other read 2, and that is known from their read names and the FASTQ file that they are in. So, we expect that 0x40 and 0x80 should always be set, trivially. With paired-end data, we are always comforted to see bits 0x1 and 0x2 set, as departures from that condition indicate that the pairing of the read alignments does not make sense given the sequence in the reference genome. As we saw in our discussion of how a template can properly map to a reference, you should be able to convince yourself that, in a properly mapped alignment, exactly one of the two bits 0x10 and 0x20 should be set for one

²<https://broadinstitute.github.io/picard/explain-flags.html>

read in the pair, and the other should be set for the other. Therefore, in good, happy, properly paired reads, from a typical whole genome sequencing library preparation, we should find either:

```
read 1 : 0x1 & 0x2 & 0x10 & 0x40 = 83
read 2 : 0x1 & 0x2 & 0x20 & 0x80 = 163
```

or

```
read 1 : 0x1 & 0x2 & 0x20 & 0x40 = 99
read 2 : 0x1 & 0x2 & 0x10 & 0x80 = 147
```

So, now that we know all about SAM flags and the values that they take, what should we do with them? First, investigating the distribution of SAM flags is an important way of assessing the nature and reliability of the alignments you have made (this is what *samtools flagstat* is for, as discussed in a later chapter). Second, you might wonder if you should do some sort of filtering of your alignments before you do variant calling. With most modern variant callers, the answer to that is, “No.” Modern variant callers take account of the information in the SAM flags to weight information from different alignments, so, leaving bad alignments in your SAM file should not have a large effect on the final results. Furthermore, filtering out your data might make it hard to follow up on interesting patterns in your data, for example, the occurrence of improperly aligning reads can be used to infer the presence of inversions. If all those improperly paired reads had been discarded, they could not be used in such an endeavor.

15.4.4 The CIGAR string

CIGAR is an acronym for Compressed Idiosyncratic Gapped Alignment Report. It provides a space-economical way of describing the manner in which a single read aligns to a reference genome. It is particularly important for recording the presence of insertions or deletions within the read, relative to the reference genome. This is done by counting up, along the alignment, the number of base pairs that: *match* (M) the reference; that are *inserted* (I) into the read and absent from the reference; and that are *deleted* (D) from the read, but present in the reference. To arrive at the syntax of the CIGAR string you catenate a series of Number-Letter pairs that describe the sequence of matches, insertions and deletions that describe an alignment.

Some examples are in order. We return to our 80 base-pair reference from above and consider the alignment to it of a 10 bp read that looks like 5' ACCTGCAGGA 3':

```
5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGAACAGCATATACCAGA 3'
      5' ACCTGCAGGA 3'
```

Such an alignment has no insertions or deletions, or other weird things, going on. So its CIGAR string would be 10M, signifying 10 matching base pairs. A *very important* thing to note about this is that the M refers to bases that match in *position* in the alignment *even though they might not match the specific nucleotide types*. For example, even if bases 3 and 5 in the read don't match the exact base nucleotides in the alignment, like this:

```
5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGAACACAGCATATACCAGA 3'
      5' ACTTACAGGA 3'
```

its CIGAR string will typically still be 10M. (The SAM format allows for an X to denote mismatches in the base nucleotides between a reference and a read, but I have never seen it used in practice.)

Now, on the other hand, if our read carried a deletion of bases 3 and 4. It would look like 5' ACGCAGGA 3' and we might represent it in an alignment like:

```
5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGAACACAGCATATACCAGA 3'
      5' AC--GCAGGA 3'
```

where the -'s have replaced the two deleted bases. The CIGAR string for this alignment would be 2M2D6M.

Continuing to add onto this example, suppose that not only have bases 3 and 4 been deleted, but also a four-base insertion of ACGT occurs in the read between positions 8 and 9 (of the original read). That would appear like:

```
5' ACATAGACAGGGACCACCTGCAG---GACACACACGCAGGTTACTAAGGGTTACTCAACACAGTGAACACAGCATATACCAGA
      5' AC--GCAGACGTGA 3'
```

where -'s have been added to the reference at the position of the insertion in the read. The CIGAR string for this arrangement would be 2M2D4M4I2M which can be hard to parse, visually, if your eyes are getting as old as mine, but it translates to:

```
2 bp Match
2 bp Deletion
4 bp Match
4 bp Insert
2 bp Match
```

In addition to M, D and I (and X) there are also S and H, which are typically seen with longer sequences. They refer to *soft-* and *hard-clipping*, respectively, which are situations in which a terminal piece of the read, from either near the 3' or 5' end, does not align to the reference, but the central part, or the other end of the read does. Hard clipping removes the clipped sequence from the read as represented in the SEQ column, while soft clipping does not remove the clipped sequence from the SEQ column representation.

One important thing to understand about CIGAR strings is that they always represent the alignment as it appears in the 5' to 3' direction. As a consequence, it is the same whether you are reading it off the read in the 5' to 3' direction or if you are reading it off from how the reverse complement of the read would align to the opposite strand of the reference. Another picture is in order: if we saw a situation like the following, with a deletion in Read 1 (which aligns to the reverse strand), the CIGAR string would be, from 5' to 3' on Read 1, 6M2D2M, which is just what we would have if we were to align the reverse complement of Read 1, called **Comp R1** below to the forward strand of the reference.

```
Read 2: 5' ACCTGCAGGA 3'           Comp R1: 5' AA--CAGTGA 3'
5' ACATAGACAGGGACCACCTGCAGGACACACACGCAGGTTACTAAGGGTTACTAACACAGTGAACACAGCATATACCAGA 3'
forward-strand
|||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||
reverse-strand
3' TGTATCTGTCCCTGGTGGACGTCCGTGTGCGTCAAATGATTCCAAATGAGTTGTGTCAGTGTGTATGGTCT 5'
                                         Read 1: 3' TT--GTCACT 5'
```

For the most part, it is important to have an understanding of CIGAR strings, though you will rarely end up parsing and using them yourself. That job is best left for the specialized tools that process SAM files and their compressed equivalents, BAM files. Nonetheless, it is worth pointing out that if you want to identify the nucleotide values (i.e. alleles) at different variant positions upon single reads, it is necessary to contend with CIGAR strings to do so. This is one of the things that gets taken care of (with some Perl code) in the R package `microhaplot`³ for extracting microhaplotypes from short read data (and then visualizing them).

15.4.5 The SEQ and QUAL columns

These columns hold the actual reads and quality scores that came off the sequencing machine and were in the FASTQ files. (Note, if you thought that after aligning your reads, the SAM or BAM files would end up taking up less space than the ridiculously large, gzipped FASTQ files you just downloaded from the sequencing center, guess again! SAM files actually have all the information present in a FASTQ, along with extra information about the alignments.)

The only thing that is tricky about these columns is that, if the read aligns to the reverse strand of the reference genome, the entry in the **SEQ** column is the reverse complement of the read that actually appeared in the FASTQ file. Of course, when you read off the letters of DNA from a reverse complement, going left to right the way you read a book, the order in which you encounter

³<https://cran.r-project.org/web/packages/microhaplot/index.html>

the complement of each base from the original sequence is reversed from the way you would read the bases in the original sequence. Accordingly, the order of the base quality scores that appear in the **QUAL** column will be in reverse order if the mapping was to the reverse strand.

15.4.6 SAM File Headers

To this point, we have talked almost exclusively about the rows in a SAM file which record the alignments of different reads. However, if you look at a SAM file (with `cat` or `less`, or in a text editor) the first thing you will see is the SAM file *header*: a series of lines that all start with the @ symbol followed by two capital letters. Like @SQ.

These file header lines can appear daunting at first, and, when merging or dividing SAM and BAM files can prove to be the bain of your existence, so understanding both their purpose and structure is paramount to avoiding some pain down the road.

In a nutshell, the lines in the header provide information to programs (and people) that will be processing the data in a SAM (or BAM, see below) file. Some of the header lines give information about the reference genome that was aligned to, others provide an overview of the various samples (and other information) included in the file, while still others give information about the program and data that produced the SAM file.

If you have ever looked at the SAM header for an alignment to a reference genome that is in thousands of pieces, you were likely overwhelmed by thousands of lines that started with @SQ. Each of these lines gives information about the names and lengths (and optionally, some other information) of sequences that were used as the reference for the alignment.

Each header line begins with an @ followed by two capital letters, for example, @RG or @SQ. The two-letter code indicates what kind of header line it is. There are only five kinds of header lines:

- @HD: the “main” header line, which, if present, will be the first line of the file. Its purpose is to reveal the version of the SAM format in use, and also information about how the alignments in the file are sorted.
- @SQ: typically the most abundant SAM header lines, each of these gives information about a sequence in the reference genome aligned to.
- @RG: these indicate information about *read groups*, which are collections of reads that, for the purposes of downstream analysis can all be assumed to be from the same individual and to have been treated the same way during the processes of library preparation and sequencing. We will discuss read groups more fully in the section on alignment.

- **@PG:** a line that tells about the program that was used to produced the SAM file.
- **@CO:** a line in which a comment can be placed.

Those first three characters signify that a line is a header line, but, within each header line, how is information conveyed? In all cases (except for the comment lines using **@CO**), information within a header line is provided in TAB-delimited, colon-separate *key-value* pairs. This means that the type or meaning of each piece of information is tagged with a key, like **ID**, and its *value* follows that key after a colon. For example, then line

```
@PG ID:bwa PN:bwa VN:0.7.9a-r786
```

tells us that the ID of the program that produced the SAM file was **bwa**, and its version number (VN) was 0.7.9a-r786.

The keys in the key-value pairs are always two uppercase letters. And different keys are allowed (and in some case required) in the context of each of the five different kinds of SAM header lines.

The most important keys for the different kinds of header lines are as follows:

- For **@HD**
 - **VN:** the version of the SAM specification in use. This is required.
 - **SO:** the sort order of the file. The default value is be **unknown**. More commonly, when your SAM/BAM file is prepared for variant calling, it will have been sorted in the order of the reference genome, which is denoted as **SO:coordinate**. For other purposes, it is important to sort the file in the order of read names, or **SO:queryname**. It is important to note that setting these values in a SAM file does not sort it. Rather, when you have asked a program to sort a SAM/BAM file, that program will make a note in the header about how it is sorted.
- For **@SQ**
 - **SN** is the key for the sequence name and is required.
 - **LN** is the key for the length (in nucleotide bases) of the sequence, and is also required.
- For **@RG**
 - **ID** is the only required key for **@RG** lines. Note that if multiple **@RG** lines occur in the file, each of their **ID** values must be different.
 - **SM** is the key for the name of the sample from which the reads came from. This is the name used when recording genotypes of individuals when doing variant calling.
 - **LB** denotes the particular library in which the sample was prepared for sequencing.
 - **PU** denotes the “Platform Unit,” of sequencing. Typically interpreted to mean the flow-cell and the lane upon which the sample was sequenced.

We will talk much more about the contents of read-group header lines, and how to fill them.

- For @PG
 - ID is required and provides information about the program that produced the SAM output.
 - VN as we saw before, this key lets you record the version of the program used to produce the SAM output.

A complete accounting of the different possible SAM header lines and their contents is given in the SAM specification⁴. It is given in a terse table that is quite informative and is not terribly tough sledding. It is recommended that you read the section on header lines.

15.4.7 The BAM format

As you might have inferred from the foregoing, SAM files can end up being enormous text files. The two big problems with that are:

1. They could take up a lot of hard drive space.
2. It would take you (or some program that was processing a SAM file) a lot of time to “scroll” through the file to find any particular alignment you (it) might be interested in.

The originators of the SAM format dealt with this by also specifying and creating a compressed *binary* (meaning “not composed of text”) format to store all the information in a SAM file. This is called a BAM (Binary Alignment Map) file. In a BAM file, each column of information is stored in its native data type (i.e., the way a computer would represent it internally if it were working on it) and then the file holding all of these “rows” is compressed into a series of small blocks in such a way that the file can be indexed, allowing rapid access (without “scrolling” through the whole file) to the alignments within a desired genomic range. As we will see in a later chapter, in order to index such a file for rapid access to alignments in a particular genomic range, the alignments must be sorted in the order of genomic coordinates in the reference sequence.

Since BAM files are smaller than SAM files, and access into them is faster than for SAM files, you will almost always convert your SAM files to BAM files to prepare for further bioinformatic processing. The main tool used for this purpose is the program `samtools` (written by the creators of the SAM and BAM formats) for that purpose. We will encounter `samtools` in a later chapter.

Finally, humans cannot directly read BAM files, or even decompress them with

⁴<https://samtools.github.io/hts-specs/SAMv1.pdf>

standard Unix tools. If you want to view a BAM file, you can use `samtools view` to read it in SAM format.

15.4.8 Quick self study

1. Suppose a read is Read 2 from the FASTQ, it aligns to the reverse strand, and its mate does too. The alignment is a primary alignment, but it has been flagged as a PCR duplicate. Write down, in hexadecimal form, all the bits that will be set for this read's alignment, then combine them to compute the SAM FLAG for it.
2. Given the alignments shown below, what do you think the CIGAR strings for Read 1 and Read 2 might look like?

```
Read 2: 5' ACCT--AGGAGGGACACACAC 3'
5' ACATAGACAGGGACCACCTGCAGGA---CACACACGCAGGTTACTAAGGGTTACTAACACAGTGAACAGCATATACCAGA 3
forward-strand
|||||||||||||||||---|||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||||
reverse-strand
3' TGTATCTGTCCCTGGTGGACGTCT---GTGTGTGCGTCAAATGATTCCAAATGAGTTGTCACTTGTGTATATGGTCT 5
Read 1: 3' AAAAAAAAAAAATTGTGTC-CT 5'
```

15.5 Variants

In terms of the format/standard, is going to be well worth explaining the early part of section 5 of the standard so that people know how insertions and deletions are coded. I hadn't really digested that until just today. Basically, the position in the VCF file corresponds to the first character in either the REF or the ALT field.

When you remember that, it all falls into place.

VCF. I've mostly used vcftools until now, but I've gotta admit that the interface is awful with all the -recode BS. Also, it is viciously slow. So, let's just skip it all together and learn how to use bcftools. One nice thing about bcftools is that it works a whole lot like samtools, syntactically.

Note that for a lot of the commands you need to have an indexed vcf.gz.

15.6 Segments

BED

15.7 Conversion/Extractions between different formats

- vcflib's vcf2fasta takes a phased VCF file and a fasta file and spits out sequence.
-

15.8 Visualization of Genomic Data

Many humans, by dint of our evolution, are exceptionally visual creatures. Being able to create visual maps for different concepts is also central facilitating understanding of those concepts and extending their utility to other realms. The same is true for bioinformatic data: being able to visualize bioinformatic data can help us understand it better and to see connections between parts of our data sets that we did not, before.

The text-based bioinformatic formats we have discussed so far do not, standing by themselves, offer a rich visual experience (have you ever watched a million lines of a SAM file traverse your terminal, and gotten much understanding from that?). However, sequence data, once it has been aligned to a reference genome has an “address” or “genomic coordinates” that, by analogy to street addresses and geographic coordinates suggests that aligned sequence data might be visualized like geographic data in beautiful and/or thought-provoking “maps.”

There are a handful of programs that do just that: they make compelling, interactive pictures of bioinformatic data. One of those programs (that I am partial to), called IGV (for Integrative Genomics Viewer), was developed in the cross-platform language, Java, by researchers at the Broad Institute. It is available for free download from <https://software.broadinstitute.org/software/igv/>, and it should run on almost any operating system. It has been well-optimized to portray genomics data at various scales and to render an incredible amount of information in visual displays as well as text-based

“tool-tip” reports that may be activated by mousing over different parts of the display.

There is extensive documentation that goes with IGV, but it is valuable (and more fun!) to just crack open some genomic data and start playing with it. To do so, there are just a few things that you need to know:

1. The placement of all data relies on the reference genome as a sort of “base map.” The reference genome serves the purpose of a latitude-longitude coordinate system that lets you make sense of spatial data on maps. Therefore, it is required for all forays with IGV. You must specify a reference genome by choosing one of the options from the “Genomes” menu. If you are working on a non-model organism of conservation concern it is likely that you will have the reference genome for that critter on your local computer, so you would “Genomes->Load Genome From File...”, to show IGV where the FASTA file (cannot be compressed) of your genome is on your hard drive. Let’s repeat that: if you are loading the FASTA for a reference genome into IGV, you *must* use the “Genomes” menu option. If you use “File->Load From File...” to try to load the reference genome, it won’t let you. Don’t do it! Use “**Genomes->Load Genome From File**”
2. Once your reference genome is known to IGV, you can add data from the bioinformatic formats described in this chapter *that include positions from a reference genome*. These include SAM or BAM files and VCF files (but note FASTQ files). To include data from these formats, choose “File->Load From File...”. (Note, BAMs are best sorted and indexed). The data from each file that you “Load” in this manner appears in a separate *track* of data in a horizontally tiled window that is keyed to the reference genome coordinates.
3. You can zoom in and out as appropriate (and in several different ways).
4. Right clicking within any track gives a set of options appropriate for the type of track it is. For example, if you are viewing a BAM file, you can choose whether the reads joined together with their mates (“View as pairs”) or not, or whether the alignments should be viewed at “full scale” (“Expanded”), somewhat mashed down (“Collapsed”) or completely squashed down and small (“Squished”).

15.8.1 Sample Data

About 0.5 Gb of sample data can be downloaded from <https://drive.google.com/file/d/1TMug-PjuL7FYrXRTpNikAgZ-ElrvVneH/view?usp=sharing>.

This download includes a zip-compressed folder called `tiny-genomic-data`. Within that folder are two more folders:

- `chinook-wgs-3-Mb-on-chr-32`: FASTQs, BAMs, and VCFs from whole genome sequencing data along a 3 Mb span of Chinook salmon chromosome 32 (which in the reference is named NC_037124.1). The genomic region from which the data comes from is NC_037124.1:4,000,000–7,000,000. The BAM and VCF files can be viewed against the reference genome in IGV.
- `mykiss-rad-and-wgs-3-Mb-chr-omy28` includes BAMs from RAD-seq data (sequenced in the study by (Prince et al., 2017)) from multiple steelhead trout individuals merged together into two BAM files. The genomic region included in those BAM files is omy28:11,200,000–12,200,000. Also included is a VCF file from whole genome resequencing data from 125 steelhead and rainbow trout in the 3 Mb region from ‘omy28:10,150,000–13,150,000.

Both of the above directories include a `genome` directory that holds the FASTA that you must point IGV to. Note that in neither case does the FASTA hold the complete genome of the organism. I have merely included three chromosomes in each—the chromosome upon which the BAM and VCF data are located, and the chromosome on either side of that chromosome.

Explore these data and have fun. Some things to play with (remember to right-click [cntrl-click on a Mac] each track for a menu) :

Start with the Chinook data:

1. Load the FASTA for each data set first
2. Load a BAM file after that
3. Then load a VCF file.
4. You will likely have to zoom pretty far into a genomic region with data (see above!) before you see anything interesting.
5. Try zooming in as far as you can.
6. Toggle “View as Pairs” and see the result.
7. Play with “Collapsed/Expanded/Squished”
8. Experiment with grouping/sorting/coloring alignments by different properties
9. Use coloring to quickly find alignments with
 - F1R2 or F2R1 orientation
 - Insert size > 1000 bp
10. Sort by mapping quality and find some reads with MAPQ < 60

11. Zoom out and use the VCF to find a region with a high variant density, then zoom back in and view the alignments there? What do you notice about the number of reads aligning to those areas?

For the steelhead data additionally:

1. Do you see where the RAD cutsite must have been and how paired-end sequencing works from either side of the cutsite?
2. What do you notice about the orientation of Read 1 and Read 2 on either side of the cutsite?
3. Why do we see the read depth patterns we see on either side of the cutsite? (i.e., in many cases it goes up as you move away from the cutsite, and then drops off again.)
4. Do you appreciate this visual representation of how sparse RAD data is compared to whole genome resequencing data?

16

Genome Assembly

This is going to be a pretty light coverage of how it works. Maybe I could get Rachael Bay or CH to write it.



17

Alignment of sequence data to a reference genome

A light treatment of how bwa works. I think I will focus solely on bwa, unless someone can convince me that there are cases where something like bowtie works better.

17.1 Preprocess ?

Will have a bit about sequence pre-processing (with WGS data it already comes demultiplexed, so maybe we can hold off on this until we get to RAD data). No, we need to talk about trimming and maybe slicing. Perhaps put that in a separate chapter of “preliminaries”

17.2 Read Groups

Gotta talk about this and make it relevant to conservation. i.e. maybe one individual was sampled with blood and also with tissue and each of those were included in four different library preps, etc. Give an example that makes it clear how it works.

17.3 Merging BAM files

There is a lot of discussion on biostars about how samtools does not reconstruct the @RG dictionary. But I think that this must be a problem with an

older version. The newer version works just fine. That said, Picard's MergeSamFiles seems to be just about as fast (in fact, faster. For a comparably sized file it took 25 minutes, and gives informative output telling you where it is at). And samtools merge is at well over 30 and only about 3/4 of the way through. Ultimately it took 37 minutes. Might have been on a slower machine...

However, if you have sliced your fastqs and mapped each separately, then samtools let's you not alter duplicate read group IDs, and so you can merge those all together faithfully, as I did in the impute project. Cool.

17.4 Divide and Conquer Strategies

At the end of each of these chapters, I think I will have a special section talking about ways that things can be divided up so that you can do it quickly, or at least, within time limits on your cluster.

18

Variant calling with GATK

Standard stuff here.

Big focus on parallelizing.



19

Bioinformatics for RAD seq data with and without a reference genome

We've gotta get our hands dirty with RAD and STACKS.

For some applications (like massive salamander genomes) this is the only way forward, at the moment. Can be useful, but is also fraught with peril.

Discuss all the problems, and strategies for dealing with them.

Note that stacks2 is a lot better than things were before. And, you can use a reference genome with them.

Amanda Stahlke gave a nice practical example at ConGen. Found all the materials on box through the link that Brian Hand gave me (in my email.)

That will be worth running through closely and carefully. Note that stacks2's denovo_map.pl script now takes all the tsv output and puts it into a series of bams.



20

Processing amplicon sequencing data

Super high read depths can cause problems for some pipelines.

I am going to mostly focus on short amplicons that are less than the number of sequencing cycles, and how we create microhaps out of those, and the great methods we have for visualizing and curating those.



21

Genome Annotation

I don't intend this to be a treatise on how to actually annotate a genome. Presumably, that is a task that involves feeding a genome and a lot of mRNA transcripts into a pipeline that then makes gene models, etc. I guess I could talk a little about that process, 'cuz it would be fun to learn more about it.

However, I will be more interested in understanding what annotation data look like (i.e. in a GFF file) and how to associate it with SNP data (i.e. using snpEff).

The GFF format is a distinctly hierarchical format, but it is still tabular, it is not in XML, thank god! 'cuz it is much easier to parse in tabular format.

You can fiddle it with bedtools.

Here is an idea for a fun thing for me to do: Take a big chunk of chinook GFF (and maybe a few other species), and then figure out who the parents are of each of the rows, and then make a graph (with dot) showing all the different links (i.e. gene -> mRNA -> exon -> CDS) etc, and count up the number of occurrences of each, in order to get a sense of what sorts of hierarchies a typical GFF file contains.



22

Whole genome alignment strategies

Basically want to talk about situations

22.1 Mapping of scaffolds to a closely related genome

I basically want to get my head fully around how SatsumaSynteny works.

After that, we might as well talk about how to get in and modify a VCF file to reflect the new positions and such. (It seems we could even add something to the INFO field that listed its position in the old scaffold system. awk + vcf-tools sort seems like it might be the hot ticket.)

22.2 Obtaining Ancestral States from an Outgroup Genome

For many analyses it is helpful (or even necessary) to have a guess at the ancestral state of each DNA base in a sequence. These ancestral states are often guessed to be the state of a closely related (but outgroup) species. The idea there is that it is rare for the same nucleotide to experience a substitution (or mutation) in each species, so the base carried by the outgroup is assumed to be the ancestral sequence.

So, that is pretty straightforward conceptually, but there is plenty of hardship along the way to do this. There are two main problems:

1. Aligning the outgroup genome (as a query) to the target genome. This typically produces a multiple alignment format (MAF) file. So, we have to understand that file format. (read about it here¹, on the

¹<http://genome.ucsc.edu/FAQ/FAQformat#format5>

UCSC genome browser site.) A decent program to do this alignment exercise appears to be LASTZ²

2. Then, you might have to convert the MAF file to a fasta file to feed into something like ANGSD. It seems that Dent Earl has some tools that might to do this <https://github.com/dentearl/mafTools>³. Also, the ANGSD github site has a maf2fasta⁴ program, though no documentation to speak of. Or you might just go ahead and write an awk script to do it. Galaxy has a website that will do it: http://mendel.gene.cwru.edu:8080/tool_runner?tool_id=MAF_To_Fasta1, and there is an alignment tool called mugsy that has a perl script associated with it that will do it: ftp://188.44.46.157/mugsy_x86-64-v1r2.3/maf2fasta.pl Note that the fasta file for ancestral sequence used by ANGSD just seems to have Ns in the places that don't have alignments.

It will be good to introduce people to those “dotplots” that show alignments.

Definitely some discussion of seeding and gap extensions, etc. The LASTZ web page has a really nice explanation of these things.

The main take home from my explorations here is that there is no way to just toss two genomes into the blender with default setting and expect that you are going to get something reasonable out of that. There is a lot of experimentation, it seems to me, and you really need to know what all the options are (this might be true of just about everything in NGS analysis, but in many cases people just use the defaults....)

22.2.1 Using LASTZ to align coho to the chinook genome

First, compile it:

```
# in: /Users/eriq/Documents/others_code/lastz-1.04.00
make
make install

# then I linked those (in bin) to my aliases
```

Refreshingly, this has almost no dependencies, and the compilation is super easy.

²http://www.bx.psu.edu/miller_lab/dist/README.lastz-1.02.00/README.lastz-1.02.00a.html

³<https://github.com/dentearl/mafTools>

⁴<https://github.com/ANGSD/maf2fasta>

Now, let's find the coho chromosome that corresponds to omu28 on NCBI. We can get this with curl:

```
# in: /tmp
curl ftp://ftp.ncbi.nlm.nih.gov/genomes/all/GCA/002/021/735/GCA_002021735.1_Otis_V1/GCA_00
```

```
gunzip coho-28.fna.gz
```

Then, let's also pull that chromosome out of the chinook genome we have:

```
# in /tmp
samtools faidx ~/Documents/UnsyncedData/Otsh_v1.0/Otsh_v1.0_genomic.fna NC_037124.1 > chi
```

Cool, now we should be able to run that:

```
time lastz chinook-28.fna coho-28.fna --notransition --step=20 --nogapped --ambiguous=iupac
```

```
real 0m14.449s
user 0m14.198s
sys 0m0.193s
```

OK, that is ridiculously fast. How about we make a file that we can plot in R?

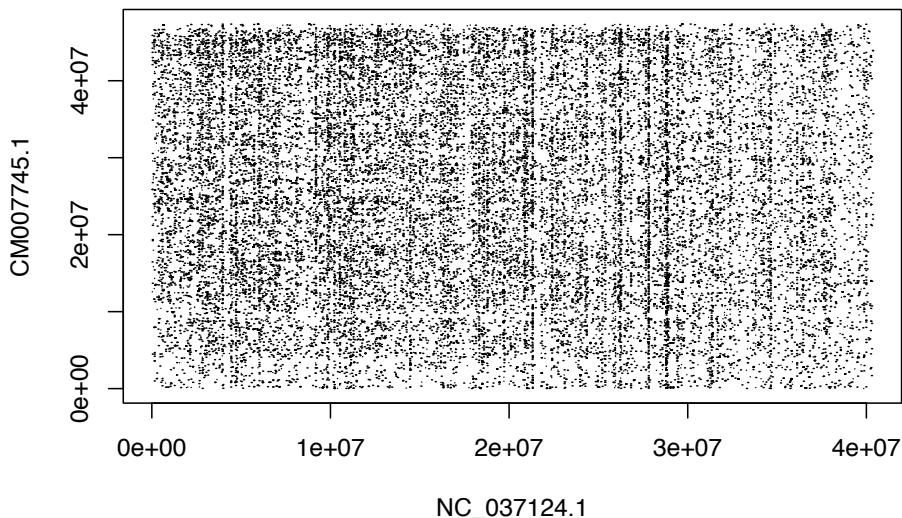
```
time lastz chinook-28.fna coho-28.fna --notransition --step=20 --nogapped --ambiguous=iupac
```

I copied that to inputs so we can plot it:

```
dots <- readr::read_tsv("inputs/chin28_vs_coho28.rdp.gz")
```

```
## Parsed with column specification:
## cols(
##   NC_037124.1 = col_double(),
##   CM007745.1 = col_double()
## )
```

```
plot(dots, type="l")
```



OK, clearly what we have there is just a bunch of repetitive bits. I think we must not have the same chromosomes in the two species.

So, let's put LG28 in coho against the whole chinook genome. Note the use of the bracketed "multiple" in there to let it know that there are multiple sequences in there that should get catenated together.

```
time lastz ~/Documents/UnsyncedData/Otsh_v1.0/Otsh_v1.0_genomic.fna[multiple] coho-28.fna
FAILURE: in load_fasta_sequence for /Users/eriq/Documents/UnsyncedData/Otsh_v1.0/Otsh_v1.0_genomic.fna
```

No love there. But that chinook genome has a lot of short scaffolds in there too, I think.

Maybe we could just try LG1. Nope. How about we toss every coho LG against LG1 from chinook...

```
# let's get the first 10 linkage groups from coho:
for i in {1..10}; do curl ftp://ftp.ncbi.nlm.nih.gov/genomes/all/GCA/002/021/735/GCA_002021735.1/GCA_002021735.1_genomic.fna.gz | lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --nogap
```

Nothing looked good until I got to coho LG10:

```
dots <- readr::read_tsv("inputs/chinook1_vs_coho10.rdp.gz")
plot(dots, type="l")
```

There is clearly a big section that aligns there. But, we clearly are going to need to clean up all the repetitive crap, etc on these alignments.

22.2.2 Try on the chinook chromosomes

So, it crapped out on the full Chinook fasta. Note that I could modify the code (or compile it with a -D): check this out in sequences.h:

```
// Sequence lengths are normally assumed to be small enough to fit into a
// 31-bit integer. This gives a maximum length of about 2.1 billion bp, which
// is half the length of a (hypothetical) monoploid human genome. The
// programmer can override this at compile time by defining max_sequence_index
// as 32 or 63.
```

But, for now, I think I will just go for the assembled chromosomes only:

```
# just get the well assembled chromosomes (about 1.7 Gb)
# in /tmp
samtools faidx ~/Documents/UnsyncedData/Otsh_v1.0/Otsh_v1.0_genomic.fna $(awk '/^NC/ {print
```



```
# then try tossing coho 1 against that:
time lastz chinook_nc_chroms.fna[multiple] coho-1.fna --notransition --step=20 --nogapped
```



```
# that took about 7 minutes
real    6m33.411s
user    6m28.391s
sys     0m4.121s
```

Here is what the figure looks like. It is clear that the bulk of Chromosome 1 in coho aligns for long distances to two different chromosomes in Chinook (likely paralogs?). This is complex!

22.2.3 Explore the other parameters more

I am going to use the chinook chromosome 1 and coho 10 to explore things that will clean up the results a little bit.

```
# in /tmp
i=10; time lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --nogapped --ambiguous
```

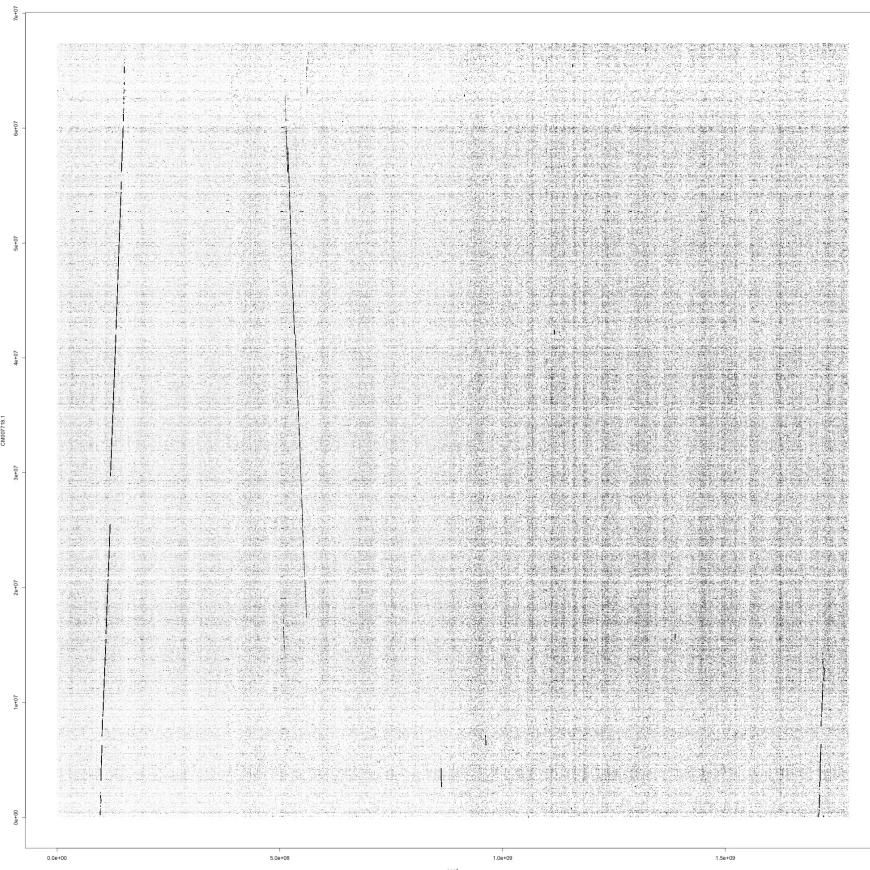


FIGURE 22.1: Coho Chromo 1 on catenated chinook chromos

```
real    0m29.055s
user    0m28.497s
sys     0m0.413s
```

That is quick enough to explore a few things. Note that we are already doing gap-free extension, because “By default seeds are extended to HSPs using x-drop extension, with entropy adjustment.” However, by default, chaining is not done, and that is the key step in which a path is found through the high-scoring pairs (HSPs). That doesn’t take much (any) extra time and totally cleans things up.

```
i=10; time lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --nogapped --ambiguous  
real    0m28.704s
```

So, that is greatly improved:

```
dots <- readr::read_tsv("inputs/chain-chinook1_vs_coho10.rdp.gz")  
plot(dots,type="l")
```

So, it would be worth seeing if chaining also cleans up the multi-chrom alignment:

```
time lastz chinook_nc_chroms.fna[multiple]  coho-1.fna --notransition --step=20 --nogapped  
real    6m42.835s  
user    6m35.042s  
sys 0m6.207s
```

```
dots <- readr::read_tsv("inputs/chin_nc_vs_coho1-chain.rdp.gz")  
plot(dots,type="l")
```

OK, that shows that it will find crappy chains if given the chance. But if you zoom in on that stuff you see that some of the spots are pretty short, and some are super robust. So, we will want some further filtering to make this work. So, we need to check out the “back-end filtering.” that is possible. Back-end filtering does not happen by default.

Let’s say that we want 70 Kb alignment blocks. That is .001 of the total input sequence.

```
time lastz chinook_nc_chroms.fna[multiple]  coho-1.fna --notransition --step=20 --nogapped
```

That took 6.5 minutes again. But, it also produced no output whatsoever. We probably want to filter on identity first anyway. Because that takes so long, maybe we could do it with our single chromosome first.

```
i=10; time lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --nogapped --ambiguous
```

```
dots <- readr::read_tsv("/tmp/chinook1_vs_coho10-ident95.rdp")
plot(dots,type="l")
```

That keeps things very clean, but the alignment blocks are all pretty short (like 50 to 300 bp long). So perhaps we need to do gapped extension here to make these things better. This turns out to take a good deal longer.

```
i=10; time lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --gapped --ambiguous
real    3m15.575s
user    3m14.048s
sys  0m0.936s
```

```
dots <- readr::read_tsv("/tmp/chinook1_vs_coho10-ident95-gapped.rdp")
plot(dots,type="l")
```

That is pretty clean and slick.

Now, this has got me to thinking that maybe I *can* do this on a chromosome by chromosome basis.

Check what 97% identity looks like:

```
i=10; time lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --gapped --ambiguous
dots <- readr::read_tsv("/tmp/chinook1_vs_coho10-ident97-gapped.rdp")
plot(dots,type="l")
```

That looks to have a few more holes in it.

Final test. Let's see what happens when we chain it on a chromosome that doesn't have any homology:

```
# first with no backend filtering
i=1; time lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --gapped --ambiguous
real    0m35.130s
user    0m34.642s
sys  0m0.413s
```

```
# Hey! That is cool. When there are no HSPs to chain, this doesn't take very long
i=1; time lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --gapped --ambiguous=
```

```
dots <- readr::read_tsv("/tmp/chinook1_vs_coho1-gapped.rdp")
plot(dots,type="l")
```

OK, it finds something nice and crappy there.

What about if we require 95% identity?

```
dots <- readr::read_tsv("/tmp/chinook1_vs_coho1-gapped-ident95.rdp")
plot(dots,type="l")
```

That leaves us with very little.

Let's also try interpolation at the end to see how that does. Note that here we also produce the rdotplot at the same time as the maf.

```
i=10; time lastz chinook-1.fna coho-${i}.fna --notransition --step=20 --gapped --ambiguous
real    4m25.625s
user    4m22.957s
sys     0m1.478s
```

That took an extra minute, but was not so bad.

```
dots <- readr::read_tsv("/tmp/chinook1_vs_coho10-ident95-gapped-inner1000.rdp")
plot(dots,type="l")
```

22.2.3.1 Repeat Masking the Coho genome

Turns out that NCBI site has the repeat masker output in GCF_002021735.1_Okis_V1_rm.out.gz. I save that to a shorter name. Now I will make a bed file of the repeat regions. Then I use bedtools maskfasta to softmask that fasta file.

```
# in: /Users/eriq/Documents/UnsyncedData/Okis_v1
gzcat Okis_V1_rm.out.gz | awk 'NR>3 {printf("%s\t%s\t%s\n", $5, $6, $7)}' > repeat-regions.bed
bedtools maskfasta -fi Okis_V1.fna -bed repeat-regions.bed -fo Okis_V1-soft-masked.fna -
```

That works great. But it turns out that the coho genome is already softmasked.

But, it is good to now that I can use a repeat mask output file to toss repeat sites if I want to for ANGSD analyses, etc.

22.2.3.2 multiz maf2fasta

So, it looks like you can use single_cov2 from multiz to retain only a single alignment block covering each area. Then you can maf2fasta that and send it off in fasta format. Line2 holds the reference (target) sequence, but it has dashes added where the query has stuff not appearing in the target. So, what you have to do is run through that sequence and drop all the positions in the query that correspond to dashes in the target. That will get us what we want.

But maybe I can just use megablast like Christensen and company. They have some of their scripts, but it is not clear to me that it will be easy to get that back to a fasta for later analysis in ANGSD.

Not only that, but then there is the whole paralog issue. I am exploring that a little bit right now. It looks like when you crank the identity requirement up, the paralogs get pretty spotty so they can be easily recognized. For example setting the identity at 99.5 makes it clear which is the paralog:

```
time lastz chinook_nc_chroms.fna[multiple] coho-1.fna --notransition --step=20 --nogapped  
# takes about 6 minutes
```

And the figure is here.

So, I think this is going to be a decent workflow:

1. run lastz on each coho linkage group against each chinook chromosome separately. Do this at identity=92 and identity=95 and identity=99.9. For each run, produce a .maf file and at the same time a .rdotplot output.
2. Combine all the .rdotplot files together into something that can be faceted over chromosomes and make a massive facet grid showing the results for all chromosomes. Do this at different identity levels so that the paralogs can be distinguished.
3. Visually look up each columns of those plots and determine which coho chromosomes carry homologous material for each chinook chromosome. For each such chromosome pair, run single_cov2 on them (maybe on the ident=92 version).
4. Then merge those MAFs. Probably can just cat them together, but there might be some sorting that needs to be done on them.
5. Run maf2fasta on those merged mafs to get a fasta for each chinook chromosome.

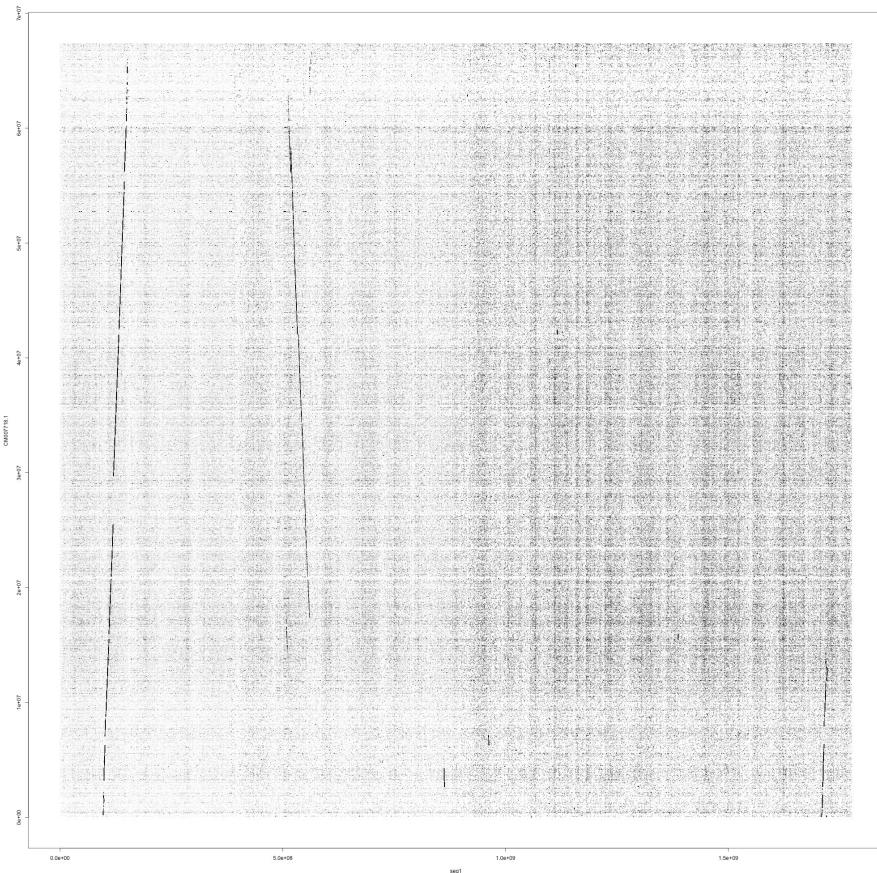


FIGURE 22.2: Coho Chromo 1 on catenated chinook chromos. Ident=99.5

6. Write a C-program that uses uthash to efficiently read the fasta for each chinook chromosome and then write out a version in which the positions that are dashes in the chinook reference are removed from both the chinook reference and the aligned coho sequence.
_Actually, one can just pump each sequence out to a separate file in which each site occupies one line. Then paste those and do the comparison...

```
2018-10-18 11:15 /tmp/--% time (awk 'NR==2' splud | fold -w1 > spp1.text)

real      0m23.244s
user      0m22.537s
```

```
sys 0m0.685s

# then you can use awk easily like this:
paste spp1.text spp2.text | awk 'BEGIN {SUBSEP = " "}{n[$1,$2]++} END {for(i in n) print
```

7. The coho sequence thus obtained will have dashes anywhere there isn't coho aligned to the chinook. So, first, for each chromosome I can count the number of dashes, which will tell me the fraction of sites on the chinook genome that were aligned (sort of—there is an issue with N's in the coho genome.) Then those dashes can be converted to N's.
8. It would be good to count the number of sites that are not N's in chinook that are also not Ns in coho, to know how much of it we have aligned.

Note, the last thing that really remains here is making sure that I can run two or more different query sequences against one chinook genome and then process that out correctly into a fasta.

Note that Figure 1 in christensen actually gives me a lot to go on in terms of which chromosomes in coho to map against which ones in chinook.

Part IV

Part IV: Analysis of Big Variant Data



23

Bioinformatic analysis on variant data

Standard analyses like computing Fst and linkage disequilibrium, etc., from data, typically in a VCF file.

Basically, we want to get comfortable with plink 2.0, bedtools, vcftools, etc.

The key in all of this is to motivate every single thing we do here in terms of an application in conservation genomics. That is going to be key.

This Part IV will be about standard bioinformatic tools for doing things with big variant data.

- Filtering
- Imputation
- LD, HWD, FST
- Etc.

I will probably have a chapter on unix tools.

Maybe another on R/Bioconductor tools.

Gotta have a chapter about “Look at your data!” and Whoa! and diagnostics using radiator.



Part V

Part V: Population Genomics



24

Topics in pop gen

This is just a bunch of ideas. But basically, I want to have some topics here that everyone should know about. Slanted toward things that are relevant for inference or simulation.

24.1 Coalescent

Gotta have a lecture on the coalescent. It would be nice to try to motivate all the topics from this backward in time perspective.

Get far enough to discuss π and the expected site frequency spectrum.

24.2 Measures of genetic diversity and such

It would really be good for me to write a chapter / give a few lectures on different measures like dxy and fst

From Ash's paper: However, population genomic analyses (outlined below) use FST only, as dxy was highly correlated to nucleotide diversity (for early stage diverging populations the correlation between dxy and π is > 0.91 , Pearson correlation). As such variation in dxy across the genome reflects variation in diversity, not differentiation (Riesch et al., 2017).

Tajima's D and such. The influence of selection on such measures.

24.3 Demographic inference with *DaDi* and *moments*

24.4 Balls in Boxes

Would be worthwhile to have a review of all these sorts of variants of population assignment, structure, admixture, etc.

Population structure and PCAs.

finestructure and fineRADstructure.

Might want to insert Bradburd et al. (2018).

Might also want to discuss Pickrell and Pritchard (2012).

Also: Pritchard et al. (2000)

What if we go and try to put the same one in? Like Pritch 2000 again:
(Pritchard et al., 2000)

24.5 Some landscape genetics

After talking with Amanda about her dissertation I realized it would be good to talk about some landscape genetics stuff. For sure I want to talk about EEMS and maybe CircuitScape, just so I know well what is going on with the latter.

24.6 Relationship Inference

Maybe do a lecture on this...

24.7 Tests for Selection

A look at a selection of the methods that are out there. FST outliers, *Bayesian*, *Lositan*, *PCAdapt*, and friends. It would be good to get a nice succinct explanation/understanding of all of these.

24.8 Multivariate Associations, GEA, etc.

It really is time for me to wrap my head around this stuff.

24.9 Estimating heritability in the wild

Another from Amanda. It would be good to do some light Quant Genet so that we all understand how we might be able to use NGS data to estimate heritability in wild populations.



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