Lecture 1

Write a python program to organize your data

copy the raw data, don't rename (or use symlinks) if you rename stuff have the code do it (never by hand) document your code + backup (github) organize data in a way that it is easy to process

You are likely going to find these module useful!

import numpy as np import scipy.stats as stats import sys import shutil import os import zipfile

/bio/share/Bioinformatics_Course.tar

numpy and scipy.stats

- see crash course in scipy modules link in class notes
- https://docs.scipy.org/doc/scipy-0.18.1/reference/stats.html
- We will return to this in week 10, when we analyze some of our genomic summaries

import sys

```
main uses
# read from stdin
for line in sys.stdin:
     print line
sys.stdout & sys.stderr also useful!
# get command line arguments
for arg in sys.argv[1:]:
     print arg
# useful info
sys.path, sys.platform, sys.version
```

import os

```
# execute a shell command
os.system()
# current working directory
os.getcwd()
# return a list of directories
os.listdir(path)
# change directory
os.chdir(path)
#make a directory
os.mkdir(dir)
#path stuff
os.path.basename()
os.path.abspath()
os.path.exists()
```

import shutil

```
#copy files
shutil.copy(source,destination)
#copy files and metadata
shutil.copy2(source,destination)
#copy entire "tree"
shutil.copytree(source, destination)
#the destination folder must already exist!
```

The data

(check out the "tree" command)

```
Bioinformatics_Course
├─ ATACseq
   - README.ATACseq.txt
   ├── Sample_ACCAGCA-CTCCTTAC_4R009_L1_P050_R1.fq.gz
   ├── Sample ACCAGCA-CTCCTTAC 4R009 L1 P050 R2.fq.gz
   ├── Sample_ACCAGCA-TATGCAGT_4R009_L1_P059_R1.fq.gz
   DNAseq
   ├─ ADL06_1_1.fq.gz

    → ADL06 1 2.fq.gz

   ├─ ADL09_1_1.fq.gz
   ☐ README.DNA samples.txt
  - RNAseq
   ├─ RNAseq384plex flowcell01
       ├─ Demultiplex Stats.htm
       ├─ Project_plex1
          ├─ Sample 1
           ├── 1 CACTTGA L001 R1 001.fastq.gz

── 1_CACTTGA_L001_R2_001.fastq.gz

              └── SampleSheet.csv
           ├─ Sample 10
           ├── 10_GGAATGT_L001_R1_001.fastq.gz
             ├─ 10_GGAATGT_L001_R2_001.fastq.gz
              └── SampleSheet.csv
       ├─ Project_plex2
          ├─ Sample 46
           ├── 46_CACTTGA_L002_R1_001.fastq.gz
              ├─ 46_CACTTGA_L002_R2_001.fastq.gz
              └── SampleSheet.csv
   ├─ RNAseq384_README.txt
    - RNAseq384_SampleCoding.txt
   ☐ RNAseq384_SampleCoding.xlsx
```

- check out the readme for sample mappings
- what might be a better way to organize the data?
 - ATACseq and DNAseq by sample name
 - RNAseq perhaps left as is, and map sample names from within DESeq2

Lecture 2

Illumina data

- lots of SE or PE short reads
- current HiSEQ4000 (circa 2016)
 - -400M PE100s = \$2.5K
 - -400M PE50s = \$1.2K
- "insert size" limited to about 700bp by technology
- for most applications reads mapped to a reference genome (de novo assembly hard because of repeats)
- reads have errors (0.2% per base per read)
- sample being sequenced have SNPs and INDELs relative to reference genome

Error rate

- mismatch relative to reference
- higher at higher cycles (e.g., ends of reads)
- reads have quality scores that tell you confidence in base call
- other problems can occur with library prep
 - contamination
 - adaptory things
 - bad starting template, etc.

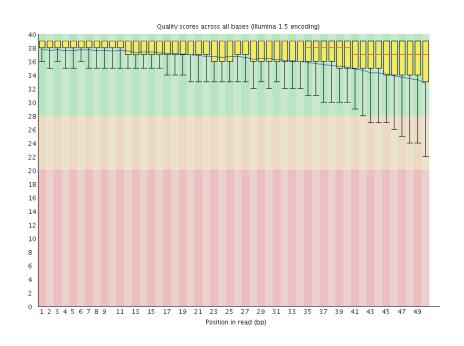
raw reads look like ...

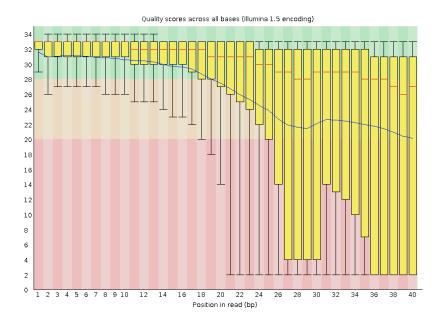
```
@unique_sequence_ID
ATTCATTAAAGCAGTTTATTGGCTTAATGTACATCAGTGAAATCATAAATGCTAAAAAATTTATGATAAAA+
unique_sequence_ID
=-(DD--DDD/DD5:*1B3&)-B6+8@+1(DDB:DD07/DB&3((+:?=8*D+DDD+B)*)B.8CDBDD4
```

```
!"#$%&'()*+,-./0123456789:;<=>?@ABCDEFGHIJKLMNOPQRSTUVWXYZ[\]^ `abcdefghijklmnopgrstuvwxyz{|}~
33
              59
                 64
                                       104
                                                    126
          0.2.....41
S - Sanger Phred+33, raw reads typically (0, 40)
X - Solexa Solexa+64, raw reads typically (-5, 40)
I - Illumina 1.3+ Phred+64, raw reads typically (0, 40)
J - Illumina 1.5+ Phred+64, raw reads typically (3, 40)
  with 0=unused, 1=unused, 2=Read Segment Quality Control Indicator (bold)
  (Note: See discussion above).
L - Illumina 1.8+ Phred+33, raw reads typically (0, 41)
```

fastqc

- difficult to look at and tell if data is good...
- quality scores hard to look at
- fastq file usually gzipped (zcat blah.fq.gz | head -n 100)
- fastqc can be helpful for QC





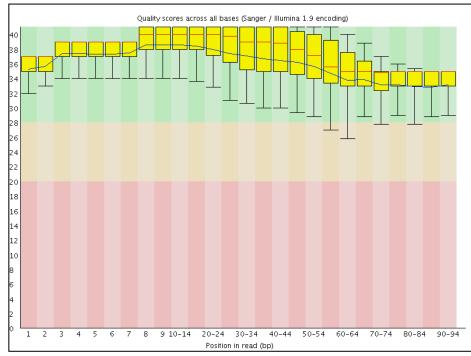
Trimming is an option in some cases

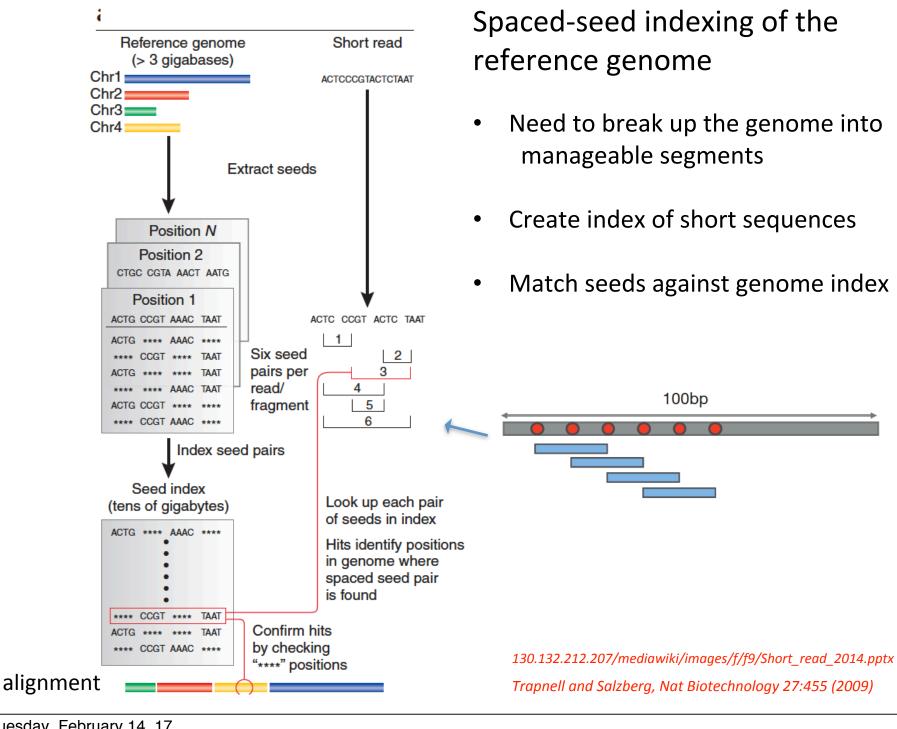
- trimmomatic or fastx-toolkit or write your own in python!
- depending on application you may or may not want to trim
 - assembly

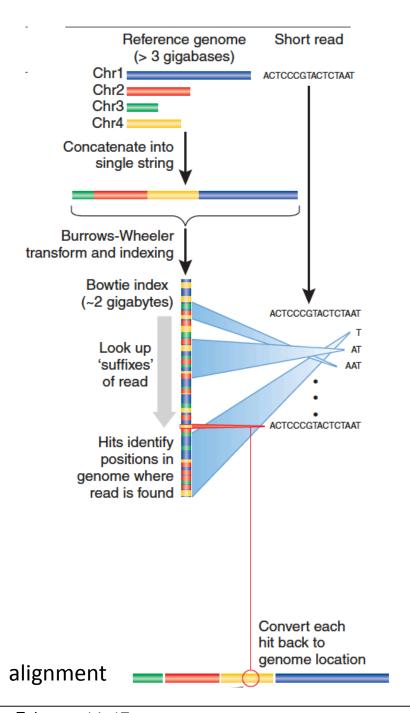
Before quality trimming

Quality scores across all bases (Sanger / Illumina 1.9 encoding) 40 38 36 34 32 30 28 26 24 22 20 118 116 14 12 10 8 6 4 2 0 1 2 3 4 5 6 7 8 9 15-19 25-29 35-39 45-49 55-59 65-69 75-79 85-89 95-99 Position in read (bp)

After quality trimming







Reference genome indexing using Burrows-Wheeler transform

- Reversible encoding scheme
- Simplifies genome sequence
- Results in "indexed" genome
- Very rapid alignments

130.132.212.207/mediawiki/images/f/f9/Short_read_2014.pptx
Trapnell and Salzberg, Nat Biotechnology 27:455 (2009)

Bowtie 2



Bowtie 2



Bowtie 2 is an ultrafast and memory-efficient tool for aligning sequencing reads to long reference sequences. It is particularly good at aligning reads of about 50 up to 100s or 1,000s of characters, and particularly good at aligning to relatively long (e.g. mammalian) genomes. Bowtie 2 indexes the genome with an FM Index to keep its memory footprint small: for the human genome, its memory footprint is typically around 3.2 GB. Bowtie 2 supports gapped, local, and paired-end alignment modes.



2/21/13

Version 2.1.0 - February 21, 2013

- . Improved multithreading support so that Bowtie 2 now uses native Windows threads when compiled on Windows and uses a faster mutex. Threading performance should improve on all platforms.
- Improved support for building 64-bit binaries for Windows x64 platforms.
- · Bowtie 2 uses a lightweight mutex by default.
- Test option --nospin is no longer available. However bowtie2 can always be recompiled with EXTRA FLAGS="-DNO SPINLOCK" in order to drop the default spinlock usage.

Version 2.0.6 - January 27, 2013

- Fixed issue whereby spurious output would be written in --no-unal mode.
- Fixed issue whereby multiple input files combined with --reorder would cause truncated output and a memory spike.
- Fixed spinlock datatype for Win64 API (LLP64 data model) which made it crash when compiled under Windows 7 x64.
- · Fixed bowtie2 wrapper to handle filename/paths operations in a more platform independent manner.
- Added pthread as a default library option under cygwin, and pthreadGC for MinGW.
- Fixed some minor issues that made MinGW compilation fail.

Version 2.0.5 - January 4, 2013

- · Fixed an issue that would cause excessive memory allocation when aligning to very repetitive genomes.
- Fixed an issue that would cause a pseudo-randomness-related assert to be thrown in debug mode under rare circumstances.
- When bowtie2-build fails, it will now delete index files created so far so that invalid index files don't linger.
- Tokenizer no longer has limit of 10,000 tokens, which was a problem for users trying to index a very large number of FASTA files.
- Updated manual's discussion of the -I and -X options to mention that setting them farther apart makes Bowtie 2 slower.
- Renamed COPYING to LICENSE and created a README to be GitHub-friendly.

Version 2.0.4 - December 17, 2012

• Fixed issue whereby --un, --al, --un-conc, and --al-conc options would incorrectly suppress SAM output.

Site Map

Home

News archive Manual

Getting started

Frequently Asked Questions

Tools that use Bowtie

Latest Release

Bowtie2 2.1.0

Please cite: Langmead B, Salzberg S. Fast gapped-read

alignment with Bowtie 2. Nature Methods, 2012, 9:357-

Related Tools

Bowtie: Ultrafast short read alignment

Crossbow: Genotyping, cloud computing

Myrna: Cloud, differential gene expression

Tophat: RNA-Seq splice junction mapper

Cufflinks: Isoform assembly, quantitation

Indexes

Consider using Illumina's iGenomes collection. Each iGenomes archive contains pre-built Bowtie 2 and Bowtie indexes.

Pre-built Indexed genomes

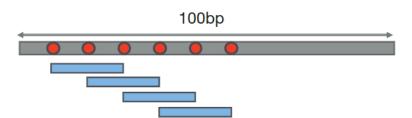
Bowtie 1 and Bowtie 2 indexes are not compatible

130.132.212.207/mediawiki/images/f/f9/Short read 2014.pptx

Alignments in Bowtie 2

@HWI-ST974:58:C059FACXX:2:1201:10589:110434 1:N:0:TGACCA
TGCACACTGAAGGACCTGGAATATGGCGAGAAAACTGAAAATCATGGAAAATGAGAAATACACACTTTAGGACGTG

Multiseed alignment (ungapped)



Seed length: 16 nt, every 10 nt

mismatches: 0

Seeds are extended (gaps allowed) to generate alignment

$$Match = 2$$

TGCACACTGAAGGACCTGGAATATGGCGAGAAAACTGAAAATCATGGAAAATGAGAAATACACACTTTAGGACGTG
TGCACACTGAAGGTCCTGGAATATGGCGAGAAAACTGAAAATCATGGAAA——GAGAAATACACACTTTAGGACGTG

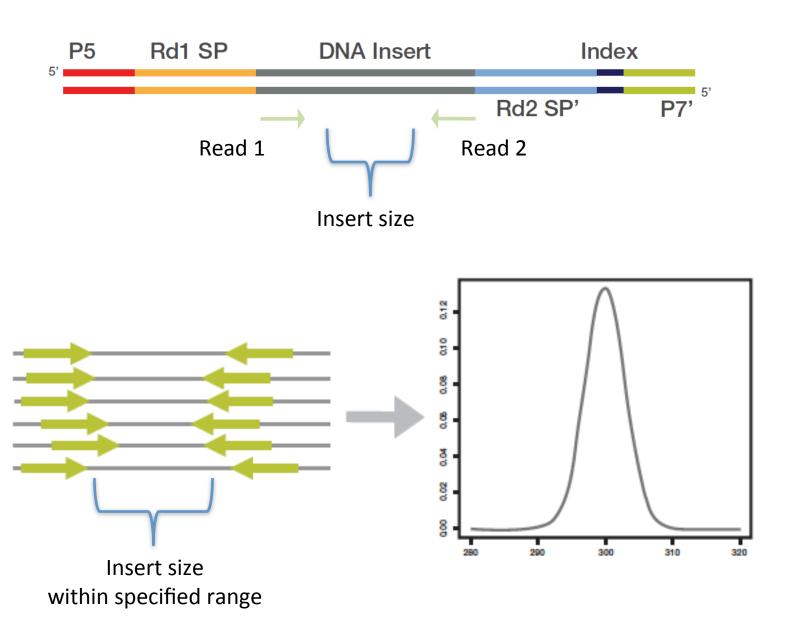
-3 to extend by 1 bp

130.132.212.207/mediawiki/images/f/f9/Short_read_2014.pptx

bwa mem and bowtie2

- most widely used
- most cited
- easiest to use
- free
- "best" by several measures
- recent (and older) version on hpc

Mapping paired end reads



sam/bam file summarizes alignment

https://samtools.github.io/hts-specs/

http://davetang.org/wiki/tiki-index.php?page=SAM

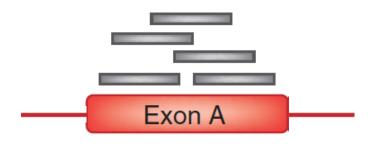
http://genome.sph.umich.edu/wiki/SAM

bam = index-able binary sam

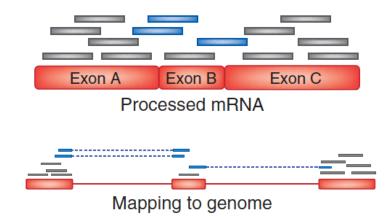
Each row describes a single alignment of a raw read against the reference genome. Each alignment has 11 mandatory fields, followed by any number of optional fields.

RNA is special

Exome or Genome



Transcriptome



- aligning RNAseq reads to a genome must allow for large "gaps" (= introns) not just SNPs and small INDELs
- a GFF/GTF describing KNOWN gene structures can aid this process
- special tool for this called tophat
- tophat on hpc

Lecture 3

...do something with alignments...

Sometimes it is helpful to look at alignments

igv viewer seems most widely used

http://software.broadinstitute.org/software/igv/

import bam files import GFF runs on your desktop





Call SNPs from DNAseq

- GATK pipeline pretty "industry standard"
- on hpc
- yuk intermediate files, lots of switches
- java...
- SNP calls in VCF file

GATK "pipeline"

http://barcwiki.wi.mit.edu/wiki/SOPs/variant_calling_GATK

- align reads using bwa mem & index
- mark duplicates (poolseq, deep seq, SEseq...)
- add read groups (GATK needs these)
- merge bam files across samples
- Indel realignment with "RealignerTargetCreator" and "IndelRealigner"
- Base Recalibration (need Gold standard SNPs)
- Call variants (diploids = HaplotypeCaller) or UnifiedGenotyper
- Annotate (need GFF file & external programs)
- Filter variants for HQ calls (strand bias etc)

IndelRealigner



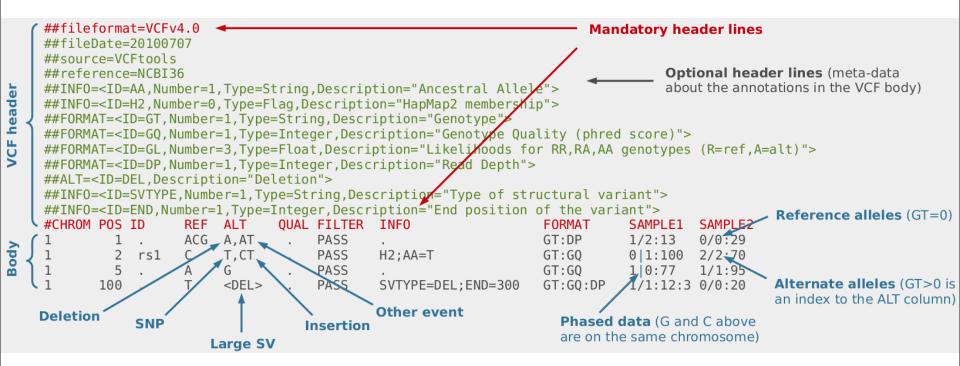
DePristo, M., Banks, E., Poplin, R. et. al, A framework for variation discovery and genotyping using next-generation DNA sequencing data. Nat Gen.

FilterVariants

the potential for lots of bad karma here, depending on downstream goals. What these filters do it label (and eventually throw out) SNPs that do not satisfy certain rules. So this could impact various downstream analyses for sure (e.g., number of segregating sites, site frequency spectrum, etc).

```
# SNPs to start with
-V rawSNPS-Q30.vcf
# SNPs must be >5bp from INDEL
--mask inDels-Q30.vcf --maskExtension 5 --maskName InDel
# SNPs within 10bp of one another are masks (alignments can be poor)
--clusterWindowSize 10
# these SNPs are poor at cross-validation
--filterExpression "MQ0 >= 4 && ((MQ0 / (1.0 * DP)) > 0.1)"
       --filterName "BadValidation"
# low quality
--filterExpression "QUAL < 30.0" --filterName "LowQual"
# low depth of ALT allele
--filterExpression "QD < 5.0" --filterName "LowVQCBD"
# SNP not consistent on Watson and Crick strands
--filterExpression "FS > 60" --filterName "FisherStrand"
# final SNPs
-o Q30-SNPs.vcf
```

VCF file format



VCF file format

There are tools for working with VCF files -vcftools

It might be fun to look at the sensitivity of downstream stuff to the filters...

You can also roll your own -estimate ALT frequency from VCF (poolseq) - week 5

ATACseq

usually short PE reads, the goal is to eventually map the "cut sites"

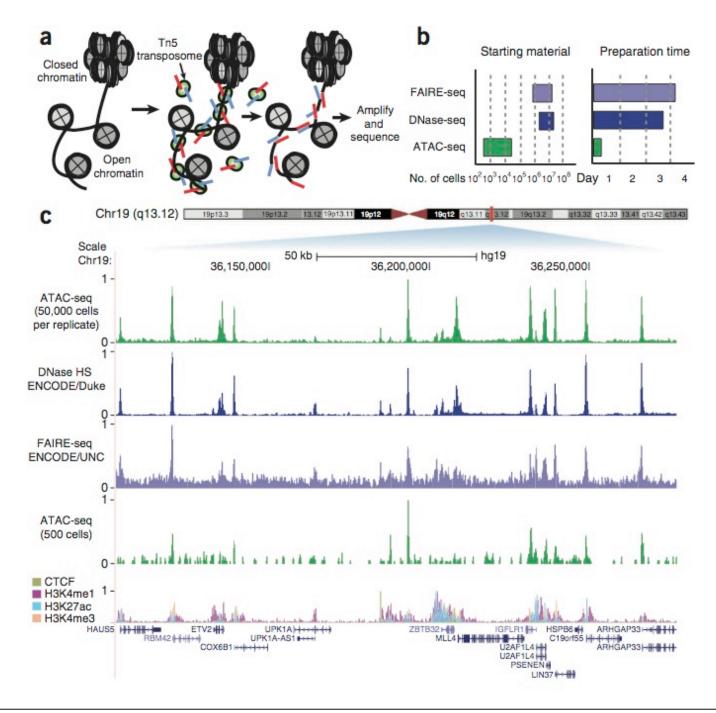
macs seems to be an important part of "peak-caller" pipelines

but this is sort of hard, so initially we will just look at coverage

But eventually we could try and get to here

https://github.com/kundajelab/atac_dnase_pipelines

https://docs.google.com/document/d/1f0Cm4vRyDQDu0bMehHD7P7KOMxTOP-HiNoIvL1VcBt8/edit#



DEseq2

RNAseq is a field in and of itself

in theory you can find new splice variants, quantify isoforms, etc.

in practice the first thing we do is look for differential expression at the level of each gene

expression highly variable, so experiments often employ biological replicates

DEseq2 is an R package that relies on other packages that are part of "Bioconductor". So I have created an Rstudio instance on tprout with the libraries in place

https://www.bioconductor.org/packages/release/bioc/html/DESeq2.html

https://www.bioconductor.org/packages/release/bioc/manuals/DESeq2/man/DESeq2.pdf

https://www.ncbi.nlm.nih.gov/pmc/articles/PMC4302049/

https://bioc.ism.ac.jp/packages/2.14/bioc/vignettes/DESeq2/inst/doc/beginner.pdf

What does DEseq do?

reads in raw counts (# reads aligning) per gene per sample

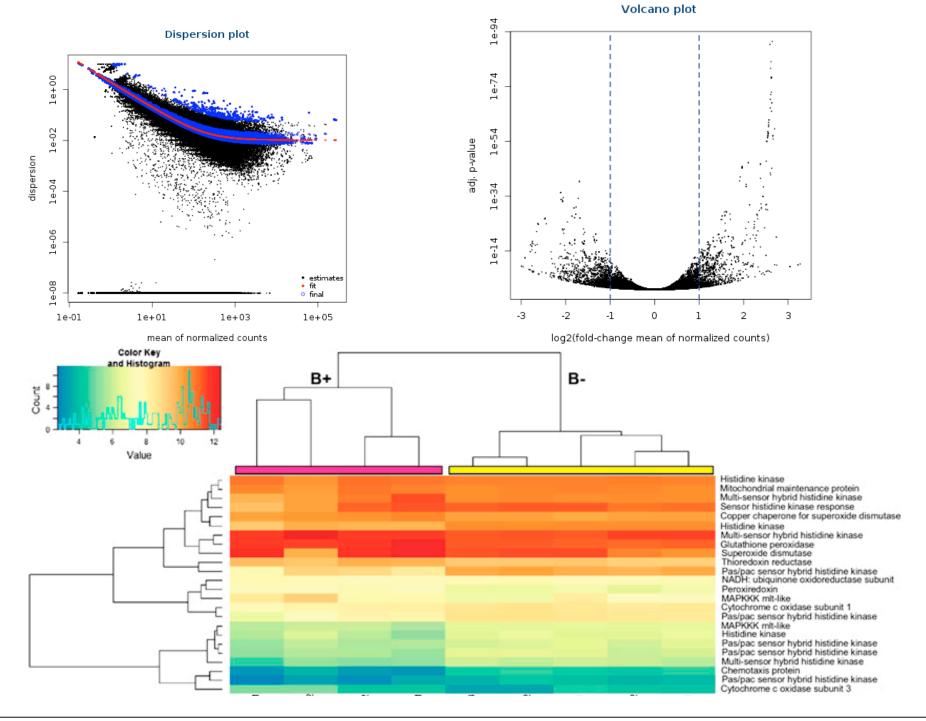
so you sort of need to define genes with a gtf file

normalize counts across samples

"variance shrinkage" to do statistical testing

statistical testing

lots of plots to make sure the wheels have not come off the bus



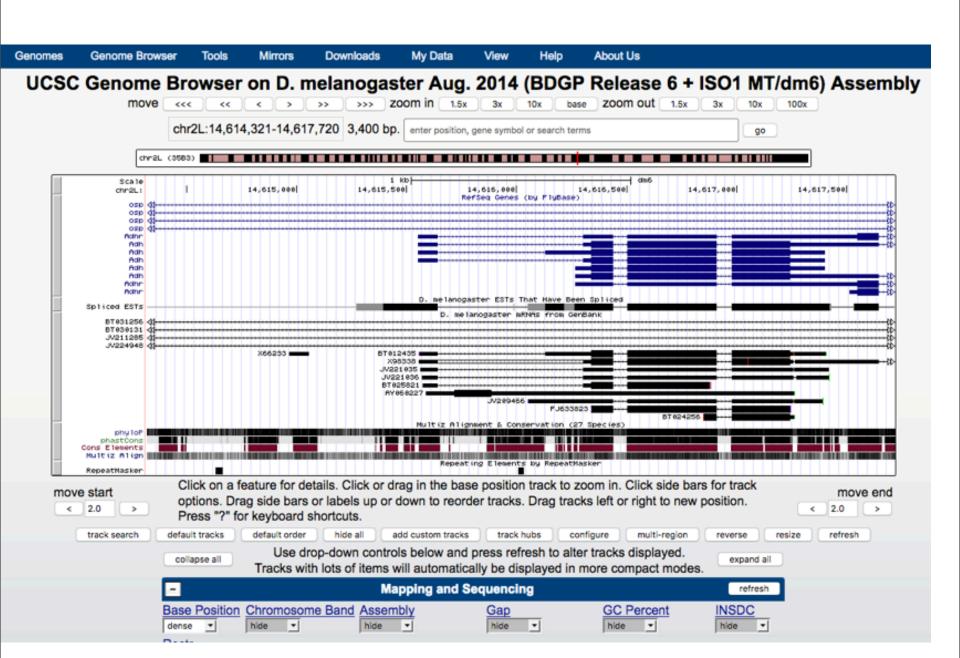
Tuesday, February 14, 17

Lecture 4

Santa Cruz Genome Browser

a way of representing genomes in browser great for models (but can do custom genomes) "tracks summarize stuff known" you can upload your own tracks you can "host" your own tracks

A tutorial: http://www.sciencedirect.com/science/article/pii/S0888754308000451



BLAT

tools -> BLAT quickly see the context of some sequence fragment

BLAT Search Genome Genome: Assembly: Query type: Sort output: Output type: Aug. 2014 (BDGP Release 6 + ISO1 MT/dm6) D. melanogaster >h-del-span-for TTAGCTGCCAATGGGTTCGG >h-del-span-rev ACGCGTTCCCATTCTTAGGG >downstream-chrX:2795279-2796278 CGGAGGCAGCAAACACCCATCTGCCGAGCATCTGAACAATGTGAGTAGTA CATGTGCATACATCTTAAGTTCACTTGATCTATAGGAACTGCGATTGCAA CATCAAATTGTCTGCGGCGTGAGAACTGCGACCCACAAAAATCCCAAAACC GCAATTGCACAAACAATAGTGACACGAAACAGATTATTCTGGTAGCTGT TCTCGCTATATAAGACAATTTTTGAGATCATATCATGATCAAGACATCTA AAGGCATTCATTTTCGACTATATTCTTTTTTACAAAAAATATAACAACCA GATATTTTAAGCTTACCATGAAGTCCTCATTTCTTCCACCTTTCATTCTC AAATATTTTCTTGCTACACTACACTACACTACACTACATTATACATCGAC CCCAAATAGTTGGATGTAGTAGATCGTAATTAGGGACGCATAACCAGTGG TGGCGTGGGAGGAGTCGGCTTAAGTTGGCCAACAACATTGCTGGGTGTCT ATAACTCTAGGCTTGCCAAGATACTAGATACTGTATCCGTATCCATTTCT GGTTGTGTACTCGCATCTTCTACCTGATCTTAATACCTCGTTGTTTGCAC GTCTCGCTCGACGAAAAATGTACAATCTAGTCTTATCTGGGTCATTATTT GGCTAGACGAATGCTTTGGGCTCAGCATCTGATATCTAGGTATCTTCGTG AAGTGAGTACGATTTGCATATCTAGCCCCGGGCTCTTTGAAACAATTTTG AAAAGTCTCAAAAAGTTATACAAGGAGATAAGAACTTTAATTCTTTTGGG AAGTAAGTAACGCAGTAAAGGTAACAAAGTATTGAAAAATATGATATGTA TGGAATATTTGAAGCCATCTTTAATTATATGTTCGTTGCATATATGTACA TATTGGGCCGTTTACGCTCTGATATTTCCTTAATAATATCGAGTGGTCGT

I'm feeling lucky

clear

submit

D. melanogaster BLAT Results

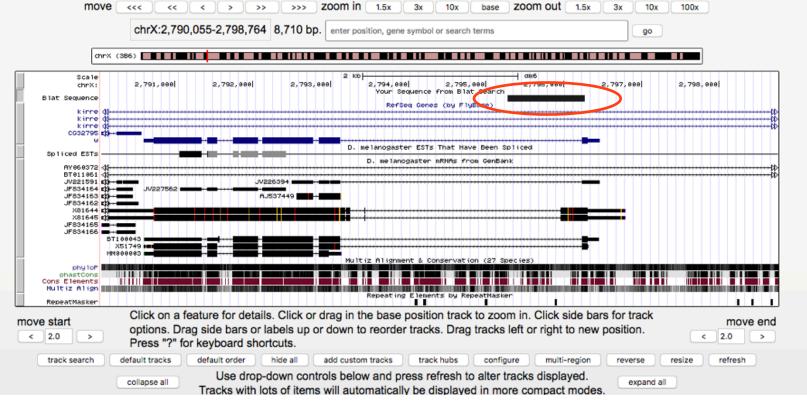
BLAT Search Results

Go back to chr2L:14614321-14617720 on the Genome Browser.

| ACTIONS | QUERY | SCORE | START | END | QSIZE | IDENTI | TY CHR | O STI | RAND ST | ART | END | SPAN | | |
|-----------------|-----------------|---------|---------|-----|-------|--------|--------|-------|---------|-----|-------|----------|----------|--------|
| | | | | | | | | | | | | | | |
| | downstream-chrX | | | | 1000 | 1 | 1000 | 1000 | 100.0% | X | - | 2795277 | 2796276 | 1000 |
| browser details | downstream-chrX | :279527 | 9-27962 | 278 | 32 | 918 | 953 | 1000 | 97.1% | 3R | + | 11935131 | 12289601 | 354471 |
| browser details | downstream-chrX | :279527 | 9-27962 | 278 | 30 | 902 | 943 | 1000 | 94.2% | 3L | - | 3262737 | 3262781 | 45 |
| browser details | downstream-chrX | :279527 | 9-27962 | 278 | 22 | 460 | 482 | 1000 | 100.0% | 3R | - | 15615100 | 15615123 | 24 |
| browser details | downstream-chrX | :279527 | 9-27962 | 278 | 21 | 933 | 953 | 1000 | 100.0% | X | + | 12583920 | 12583940 | 21 |
| browser details | downstream-chrX | :279527 | 9-27962 | 278 | 20 | 136 | 155 | 1000 | 100.0% | 2R | + | 8073088 | 8073107 | 20 |
| browser details | h-del-span-for | 20 | 1 | 20 | 20 | 100.0% | 3L | + | 8656 | 769 | 86567 | 88 20 | | |
| browser details | h-del-span-rev | 20 | 1 | 20 | 20 | 100.0% | 3L | - | 8664 | 595 | 86646 | 14 20 | | |

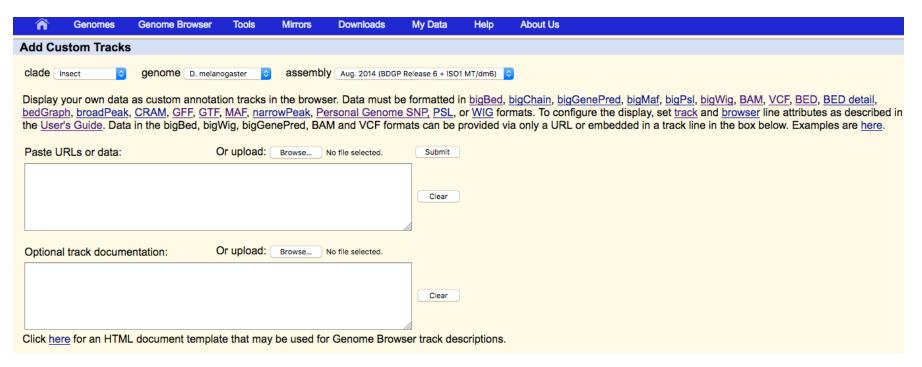
UCSC Genome Browser on D. melanogaster Aug. 2014 (BDGP Release 6 + ISO1 MT/dm6) Assembly

Missing a match?



BED

quickly add "annotations" (under add custom tracks)



bigMaf table format

bigWig format

bigChain table format

The first three required BED fields are:

- 1. chrom The name of the chromosome (e.g. chr3, chrY, chr2 random) or scaffold (e.g. scaffold10671).
- 2. chromStart The starting position of the feature in the chromosome or scaffold. The first base in a chromosome is numbered 0.
- 3. **chromEnd** The ending position of the feature in the chromosome or scaffold. The *chromEnd* base is not included in the display of the feature. For example, the first 100 bases of a chromosome are defined as *chromStart=0*, *chromEnd=100*, and span the bases numbered 0-99.

The 9 additional optional BED fields are:

Example:

This example shows an annotation track that uses the itemRgb attribute to individually color each data line. In this track, the color scheme distinguishes between items named "Pos*" and those named "Neg*". See the usage note in the *itemRgb* description above for color palette restrictions. NOTE: The <u>track and data lines</u> in this example have been reformatted for documentation purposes. This <u>example</u> can be pasted into the browser without editing.

```
browser position chr7:127471196-127495720
browser hide all
track name="ItemRGBDemo" description="Item RGB demonstration" visibility=2
itemRgb="On"
chr7
       127471196 127472363 Pos1 0 + 127471196 127472363
                                                          255,0,0
chr7
       127472363 127473530 Pos2 0 + 127472363 127473530
                                                          255,0,0
       127473530 127474697 Pos3 0 + 127473530 127474697
                                                          255,0,0
chr7
       127474697 127475864 Pos4 0 + 127474697 127475864
                                                          255,0,0
chr7
       127475864 127477031 Neg1 0 - 127475864 127477031
                                                          0,0,255
chr7
chr7
       127477031 127478198 Neg2 0 - 127477031 127478198
                                                          0,0,255
chr7
       127478198 127479365 Neg3 0 - 127478198 127479365
                                                          0,0,255
chr7
       127479365 127480532 Pos5 0 + 127479365 127480532 255,0,0
chr7
       127480532 127481699 Neq4 0 - 127480532 127481699 0,0,255
```

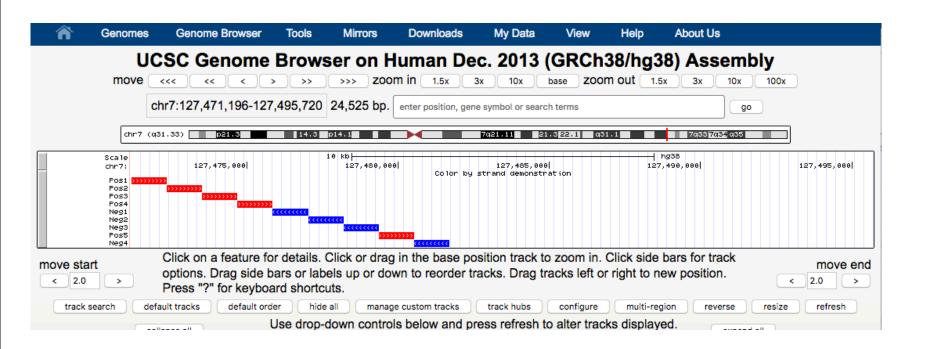
Click here to display this track in the Genome Browser.

Evamnla:

Really useful for things like:

locations of exons

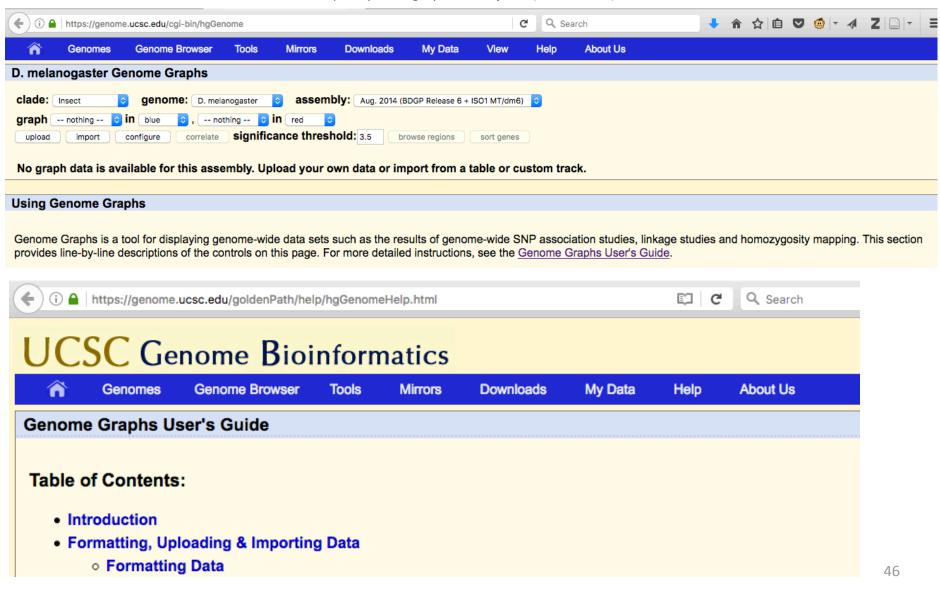
locations of other "features" -- likes a PCR product or a "peak"



when you paste it in ... make sure you switch to humans!

Genome Graph

quickly add "graph-like object" (under tools)



Genome Graph format

chromosome [tab] basepair [tab] score [return] chr2L\t1456765\t13.2\n

Really useful for things like:

LOD scores at markers coverage at markers HMM states at markers etc.

Its fun to share

myData -> Sessions

| See the Sessions User's Guide f | for more informati | on about this tool. See t | the Session | Gallery for exa | mple sessions | | |
|-----------------------------------|--------------------|---------------------------|----------------------|---------------------|--------------------|-------------------------------|-----------------|
| Click here to reset the browser u | ser interface sett | ngs to their defaults. | | | | | |
| My Sessions | | | | | | | |
| Show 10 c entries | | | | | | Search: | |
| session name (click to load) | a created on | assembly | view/edit details | delete this session | share with others? | post in public listing? | send to mail |
| dm6 | 2017-01-10 | dm6 | details | delete | ✓ | | Email |
| dm6-ATAC | 2016-05-31 | dm6 | details | delete | | | Email |
| Gianni | 2015-09-09 | sacCer3 | details | delete | | | Email |
| hub 102613 Mzebv0 | 2016-12-08 | hub_102613_Mzebv0 | details | delete | 2 | 0 | Email |
| jj look | 2015-09-10 | dm3 | details | delete | 2 | | Email |
| MAT target | 2015-09-11 | sacCer3 | details | delete | 2 | 0 | Email |
| newATACseq | 2016-10-05 | dm6 | details | delete | 2 | | Email |
| Pierre EG | 2015-12-17 | sacCer3 | details | delete | Ø | | Email |
| Stuart-A4 | 2016-02-05 | dm3 | details | delete | 2 | | Email |
| tamas-hairy | 2016-10-05 | dm6 | details | delete | Ø | | Email |
| Save Settings | | | | | | Previous | 1 Next |
| Save current settings as named | session: | | | | | | |
| name: dm3 | | ssion to be loaded by ot | thers subm | it | | | |
| Save current settings to a local | file: | | | | | | |
| _ | file type returne | | | | | | |
| file: | me type returne | 1: plain text | subm | IT. | | | |

..but...

- shared session don't last forever
- if you use them occasionally they don't die
- or make your own "track hub"
- https://genome.ucsc.edu/goldenpath/help/ hgTrackHubHelp.html

...too big to upload...

- limit on size of file you can upload to SCGB
- track hubs are an answer ... but are not quick
- you can host one of the compressed binary index formats supported by the Genome Browser -- these are not uploaded
 - bigBed, bigGenePred, bigPsl, bigChain, bigMaf, bigWig,
 BAM, CRAM, HAL or VCF (most useful)
 - this is sort of poorly documented
 - https://www.ncbi.nlm.nih.gov/pmc/articles/