An introduction to Illumina Sequencing



Daniel P. Depledge

Systems Virologist
Assistant Professor, Department of Medicine

Biomedical Informatics: Advanced course offerings

Applied Sequencing Informatics (2021)

- Expanded version of current course
- Lectures and practicums (50:50 split)
- · Advanced sequencing analyses using both short- and long-read data
- **<u>Prerequisites</u>**: experience working in HPC environments (i.e. Big Purple) + experience in R-based environments

Overview of October

Getting to grips with Illumina sequencing data

- October 6th: Introduction to Illumina Sequencing [Daniel Depledge]
 - October 8th: Introduction to unix/bash/slurm [Mark Grivainis]
- October 13th: Getting to grips with SAMtools and BEDtools [Daniel Depledge]
 - October 15th: Assignment #1 presentations

A crash course in differential gene expression analysis

- October 20th: Introduction to RNA-Seq [Daniel Depledge]
- October 22nd: Introduction to Differential Gene Expression analysis [Daniel Depledge]
 - October 27th: Advanced unix/bash/slurm [Mark Grivainis]
 - October 29th: Assignment #2 presentations

Setting the scene

High-throughput sequencing (HTS) is fundamentally changing how we approach science

- HTS is a readout for many different types of laboratory experiments
- Clinical and basic science investigators from all areas of biology can make use of this technology
- Many (most?) are completely naïve about bioinformatics
- Decreasing sequencing costs = increasing use for routine assays + technical innovation + novel applications

Sequencing informatics is a bottleneck!

- Sequencing is a commodity easy to outsource
- Sequencing informatics is the essential point of the science
- Data analysis and discovery of meaning in raw results
- Increasing data throughput = increasing time and cost of analysis



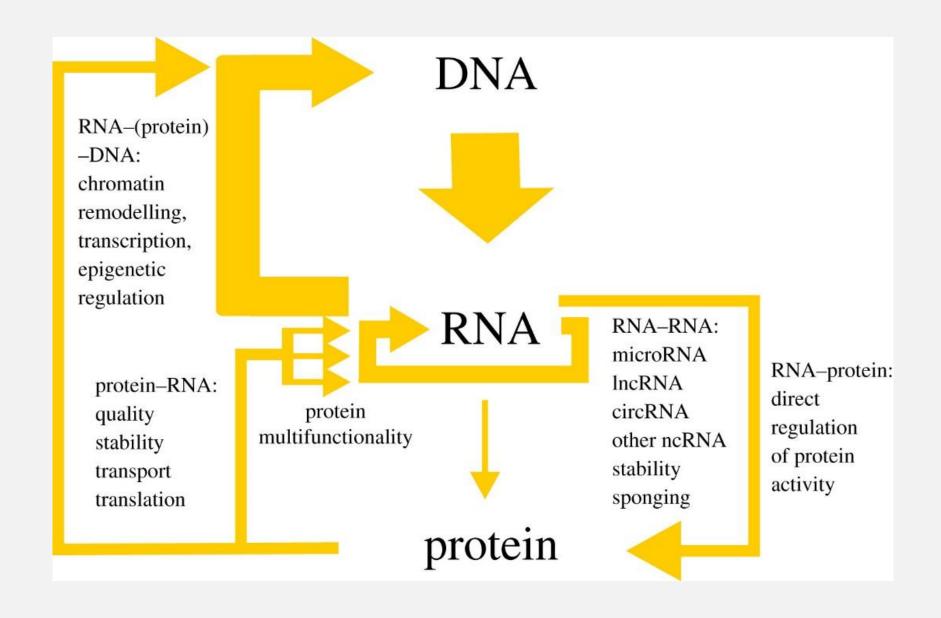
Staying in the game...



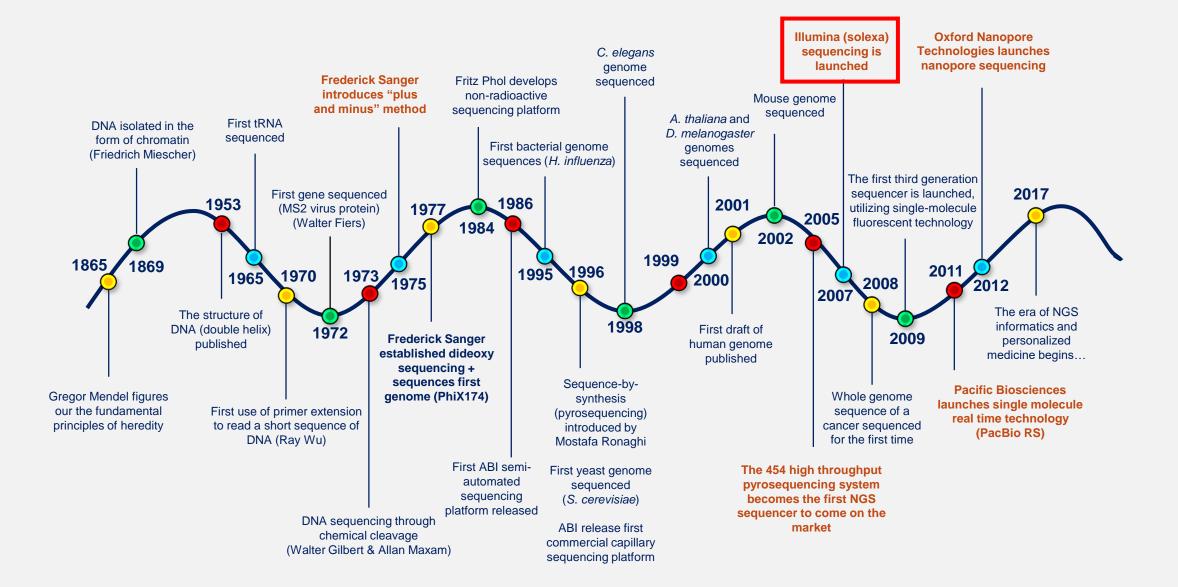
- Rapid turnover in technology platforms
 - New file formats, new data types
 - Different "standards" from different vendors
- Rapid evolution of new sequence approaches & associated analyses
- Constant rapid 'release' of methods as 'software' via unsupported open source distribution
- Increasingly large data sizes (both experimental and reference)



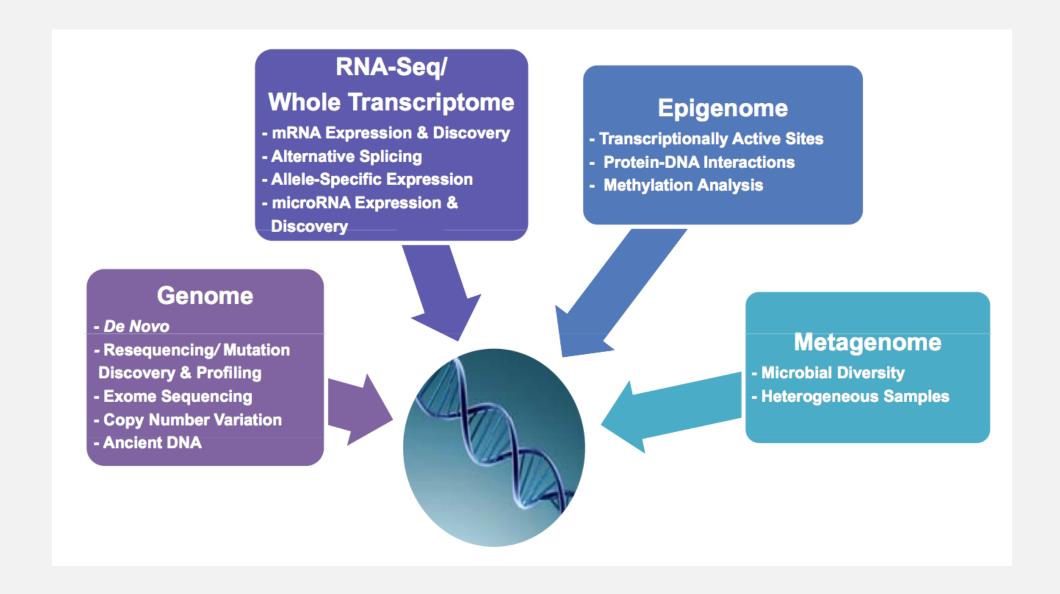
Why we sequence?



An abridged history of sequencing

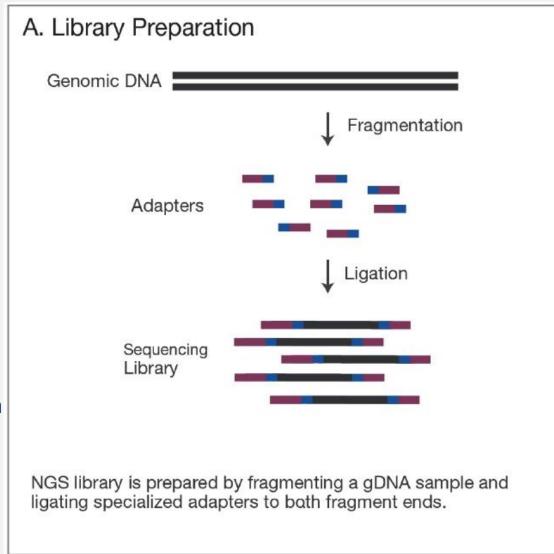


The rise of high-throughput sequencing



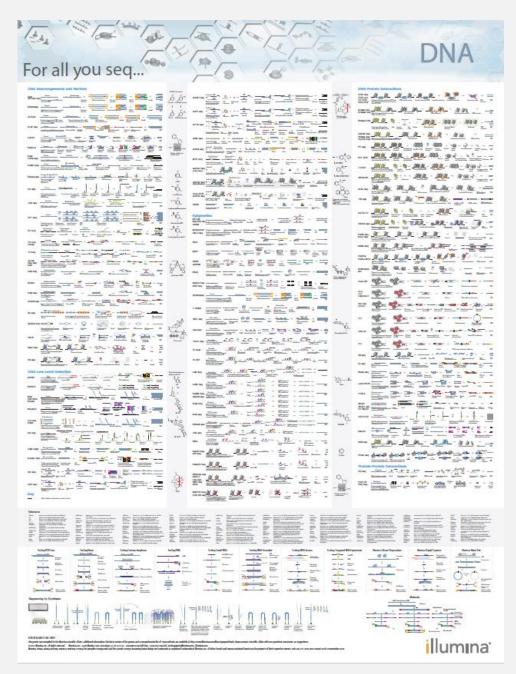
The principles of generating a short-read sequencing library

- 1. Capture DNA or RNA of interest
 - cDNA must be synthesized from RNA
- 2. Fragment DNA/cDNA to produce fragments of 150-300 nt
 - Acoustic sonication (random shearing) is favoured
 - Alternative strategies include use of transposases or targeted ligation
- 3. Repair ends and ligate adapter sequences
- 4. PCR amplification to enrich for fragments with correct ligation
 - PCR primes of sequences in adapters
- 5. Sequence



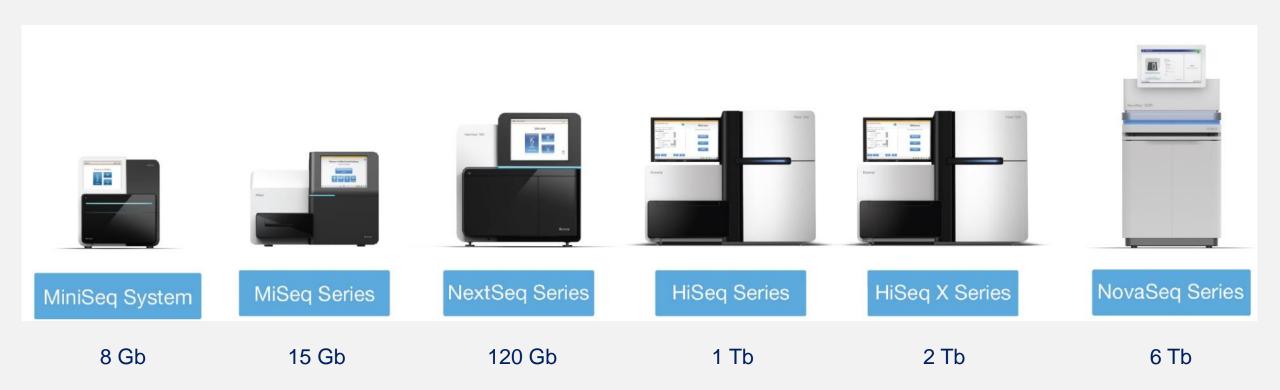
The incredible versatility of Illumina sequencing

- <u>Hundreds</u> of distinct Illumina-based methods for DNA & RNA sequencing at global (bulk) or single-cell level
- Most all of these methods require tweaks and special considerations when performing informatics analyses

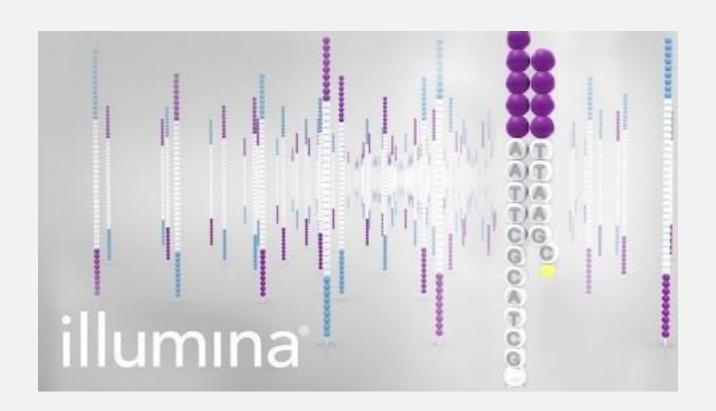


https://www.illumina.com/science/sequencing-method-explorer.html

Illumina sequencing platforms



Illumina: sequencing by synthesis

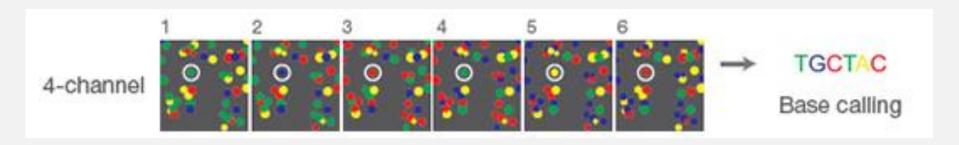


https://youtu.be/fCd6B5HRaZ8

Converting signal into bases

Basecalling is the process of converting raw signal into basecalls (A, T, G, C)

FASTA format – two lines, no quality information



An example of Illumina basecalling

- Individual basecalls are assigned probability values based on how closely a raw signal matches the expected signal
- Most sequencing analysis pipelines make use of these basecall probability values to inform quality control

Defining basecall qualities: the Phred system

$$\varepsilon = 10^{\frac{Q_{Phred}}{10}}$$

$$Q_{Phred} = -10 \cdot \log_{10}(\varepsilon)$$

E is the Error Probability (probability that a base call is wrong

Q: Phred Quality Score

Q	Probability of incorrect basecall	Basecall accuracy
60	1 in 1000000	99.9999%
50	1 in 100000	99.999%
40	1 in 10000	99.99%
30	1 in 1000	99.9%
20	1 in 100	99%
10	1 in 10	90%

ASCII tables

- Phred Q score for a given basecall is stored as a single (ASCII) character (save space)
- ASCII tables allow translation between numerical value and characters
 - 33 = !
 - 35 = #
 - 40 = (
- Quality score is derived from Decimal – 32
 - 33 = ! = 1
 - 35 = # = 3
 - 40 = (= 8

Decimal	Hexadecimal	Binary	Octal	Char		Hexadecimal	Binary	0ctal	Char	Decimal	Hexadecimal	Binary	Octal	Char
0	0	0	0	[NULL]	48	30	110000	60	0	96	60	1100000	140	×
1	1	1	1	[START OF HEADING]	49	31	110001		1	97	61	1100001	141	a
2	2	10	2	[START OF TEXT]	50	32	110010		2	98	62	1100010	142	b
3	3	11	3	[END OF TEXT]	51	33	110011		3	99	63	1100011	143	c
4	4	100	4	[END OF TRANSMISSION]	52	34	110100		4	100	64	1100100	144	d
5	5	101	5	[ENQUIRY]	53	35	110101	65	5	101	65	1100101	145	e
6	6	110	6	[ACKNOWLEDGE]	54	36	110110	66	6	102	66	1100110	146	f
7	7	111	7	[BELL]	55	37	110111	67	7	103	67	1100111	147	g
8	8	1000	10	[BACKSPACE]	56	38	111000	70	8	104	68	1101000	150	h
9	9	1001	11	[HORIZONTAL TAB]	57	39	111001	71	9	105	69	1101001	151	i
10	Α	1010	12	[LINE FEED]	58	3A	111010	72	:	106	6A	1101010	152	j
11	В	1011	13	[VERTICAL TAB]	59	3B	111011		;	107	6B	1101011	153	k
12	C	1100	14	[FORM FEED]	60	3C	111100	74	<	108	6C	1101100	154	1
13	D	1101	15	[CARRIAGE RETURN]	61	3D	111101	75	=	109	6D	1101101	155	m
14	E	1110	16	[SHIFT OUT]	62	3E	111110	76	>	110	6E	1101110	156	n
15	F	1111	17	[SHIFT IN]	62 63	3F	111111		?	111	6F	1101111	157	0
16	10		20	[DATA LINK ESCAPE]	64	40	1000000		@	112	70	1110000	160	р
17	11	10001	21	[DEVICE CONTROL 1]	65	41	1000001	101	A	113	71	1110001	161	q
18	12		22	[DEVICE CONTROL 2]	66	42	1000010		В	114	72	1110010		r
19	13	10011		[DEVICE CONTROL 3]	67	43	1000011	103	С	115	73	1110011		s
20	14		24	[DEVICE CONTROL 4]	68	44	1000100			116	74	1110100		t
21	15	10101		[NEGATIVE ACKNOWLEDGE]	69	45	1000101	_		117	75	1110101		u
22	16	10110		[SYNCHRONOUS IDLE]	70	46	1000110		•	118	76	1110110		v
23	17	10111		[ENG OF TRANS. BLOCK]	71	47	1000111	_		119	77	1110111		w
24	18		30	[CANCEL]	72	48	1001000	_		120	78	1111000		X
25	19	11001		[END OF MEDIUM]	73	49	1001001			121	79	1111001		У
26	1A		32	[SUBSTITUTE]	74	4A	1001010			122	7A	1111010		Z
27	1B	11011		(ESCAPE)	75	4B	1001011		K	123	7B	1111011		-
28	1C		34	[FILE SEPARATOR]	76	4C	1001100		L	124	7C	1111100		Ţ
29	1D	11101		[GROUP SEPARATOR]	77	4D	1001101		М	125	7D	1111101		}
30	1E		36	[RECORD SEPARATOR]	78	4E	1001110		N	126	7E	11111110		~
31	1F	11111		[UNIT SEPARATOR]	79	4F	1001111		O P	127	7F	1111111	1//	[DEL]
32 33	20	100000	40	[SPACE]	80 81	50	1010000							
33	21 22	100001			82	51	1010001		Q					
34 35	23	100010	72	#	83	52 53	1010010		R					
36	24	100011		\$	84	54								
27	25	100100	44	%	85	55	1010100	-						
39	26	100101		&	86	56	1010111							
30	27	100111		ŭ.	87	57		_						
38 39 40 41	28	101000		1	88	58	1010111							
41	29	101000		1	89	59	1011000	_	_					
42	2A	101001		*	90	5A	1011010							
43	2B	101011	_	<u>. 1</u>	91	5B	1011011		_					
44	2C	101100		T	92	5C	1011100		, i					
45	2D	101101	-	1	93	5D	1011101							
46	2E	101110	_		93 94	5E	1011110		^					
	2F	101111		i	95	5F	1011111							
47		202211					2021211		-					

Pitfalls of the Phred scoring system

- Based on empirical properties of the data (intensity of cluster, signal-to-noise ratio), combined with observations of actual error rates for known standard samples
- The calculation method is essentially arbitrary (varies by technology), and changes with every iteration of software, chemistry, and hardware on the sequencing machine
- Q scores currently use more data storage space (8 bits) than the bases (2 bits)

The FASTA format – two lines of simplicity

FASTA format – two lines, no quality information

- (1) >@SRR350953.5|MENDEL_0047_FC62MN8AAXX:1:1:1646:938|length=152
- (2) NTCTTTTCTTTCCTCTTTTGCCAACTTCAGCTAAATAGGAGCTACACTGATTAGGCAGAAACTTGATTAACAG GGCTTAAGGTAACCTTGTTGTTAGGCCGTTTTGTAGCACTCAAAGCAATTGGTACCTCAACTGCAAAAGTCCTTG GCCC
- (3) >@SRR350953.5|MENDEL 0047 FC62MN8AAXX:1:1:1934:042|length=152
- (5) >HEADER
- (6) SEQUENCE

Note that header line always start with >

The FASTQ format – layering basecall quality information

FASTQ format – four lines, quality information encoded

- (1) @SRR350953.5 MENDEL_0047_FC62MN8AAXX:1:1:1646:938 length=152
- (2) NTCTTTTCTTTCCTCTTTTGCCAACTTCAGCTAAATAGGAGCTACACTGATTAGGCAGAAACTTGATTAACAGGGCTTAAGGTAACCTTGTTGTTGTAGCCACTCAAAGCAATTGGTACCTCAACTGCAAAAGTCCTTG
- (3) +SRR350953.5 MENDEL_0047_FC62MN8AAXX:1:1:1646:938 length=152

Note: Header line starts with @

Note: Third line is redundant and typically only contains a single + character

Single vs. paired-end reads (Illumina)

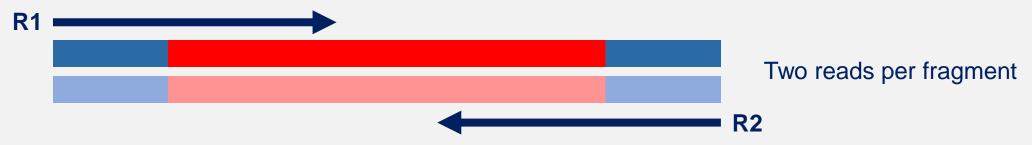
Illumina library sequence fragment with ligated adapters



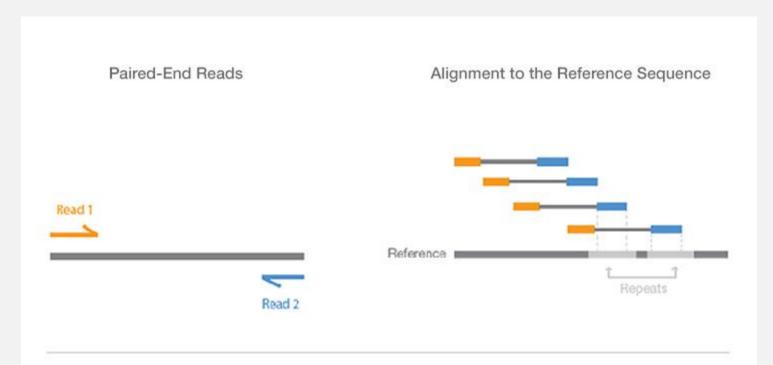
Single end sequencing (Illumina)



Paired end sequencing (Illumina)

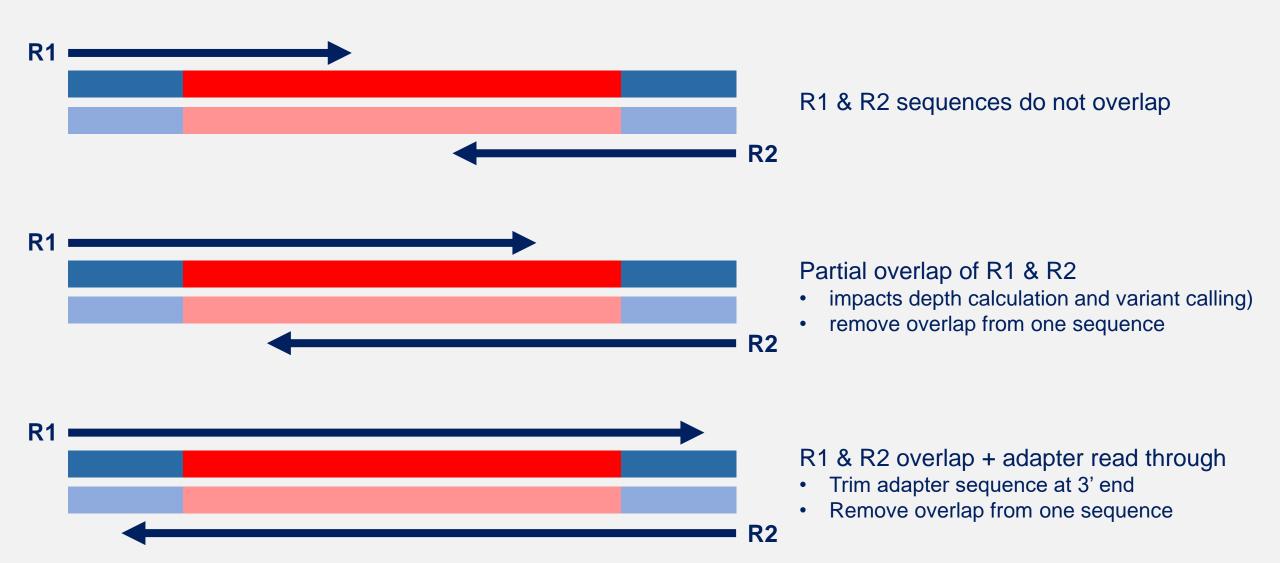


Why paired-end reads?

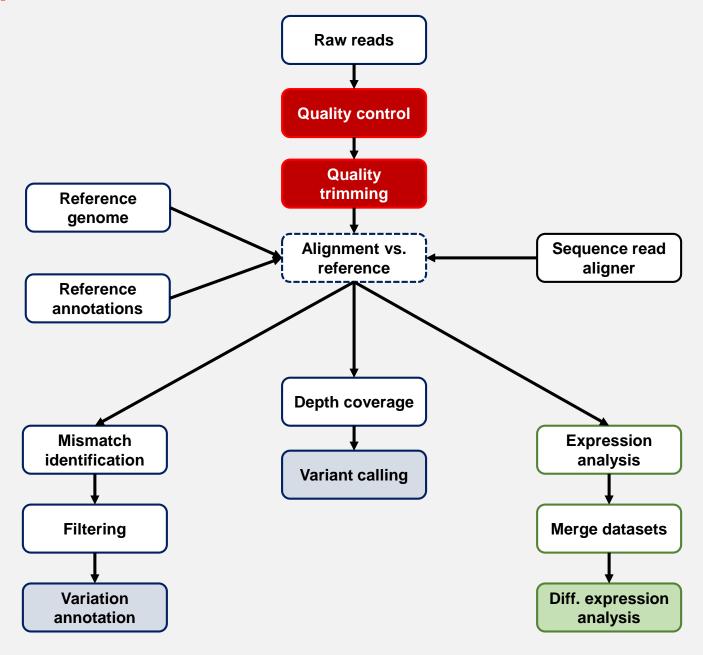


Paired-end sequencing enables both ends of the DNA fragment to be sequenced. Because the distance between each paired read is known, alignment algorithms can use this information to map the reads over repetitive regions more precisely. This results in much better alignment of the reads, especially across difficult-to-sequence, repetitive regions of the genome.

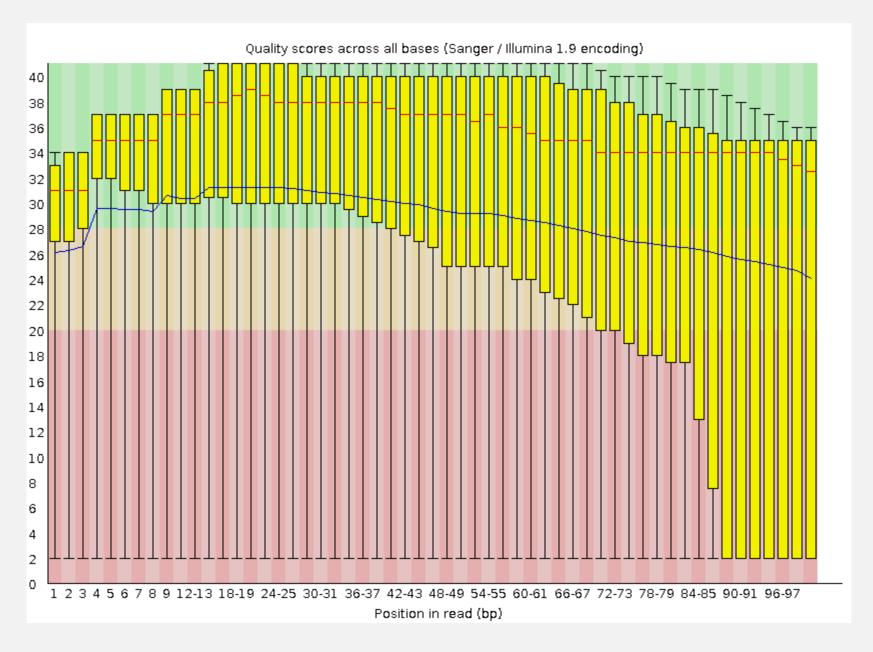
Challenges in sequencing short fragments (Illumina)



Standard workflow



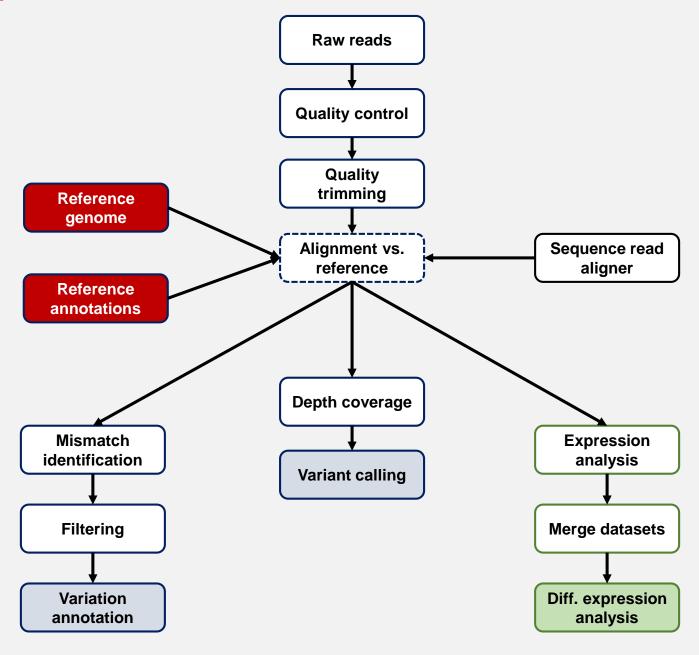
QC of sequence datasets



QC of sequence datasets

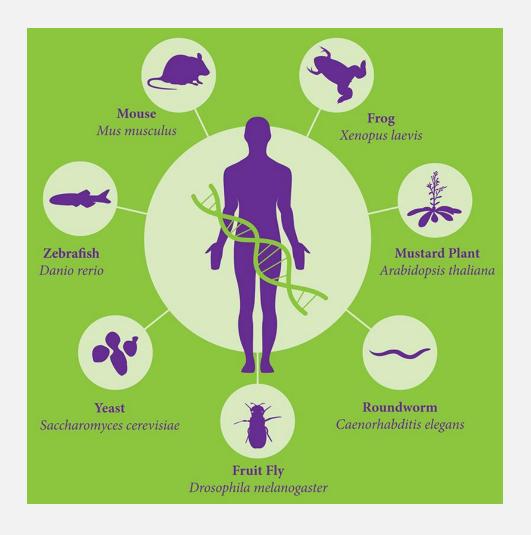
- Used to determine whether sequence reads are 'compromised'
- Compromised reads are unlikely to align to a target correctly (or at all) and count as wasted/lost data
- Most compromised reads contain adapter sequences and/or low quality basecalls
- Multiple tools exist to examine datasets and trim sequence data to maximize data usage
- Optimal combination remains FASTQC + Trim Galore (feat. CutAdapt)
 - Top tip for using Trim Galore is to set -q 30 as a flag!

Standard workflow



Model vs. non-model organisms

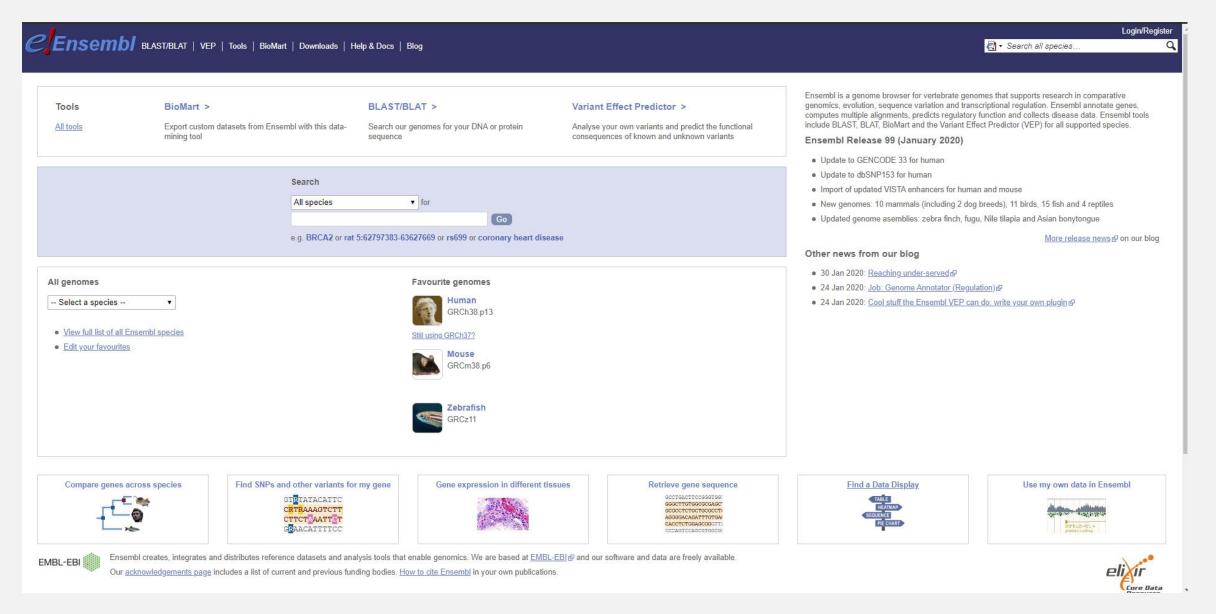
A model organism is a non-human species that is extensively studied to understand particular biological phenomena, with the expectation that discoveries made in the model organism will provide insight into the workings of other organisms.



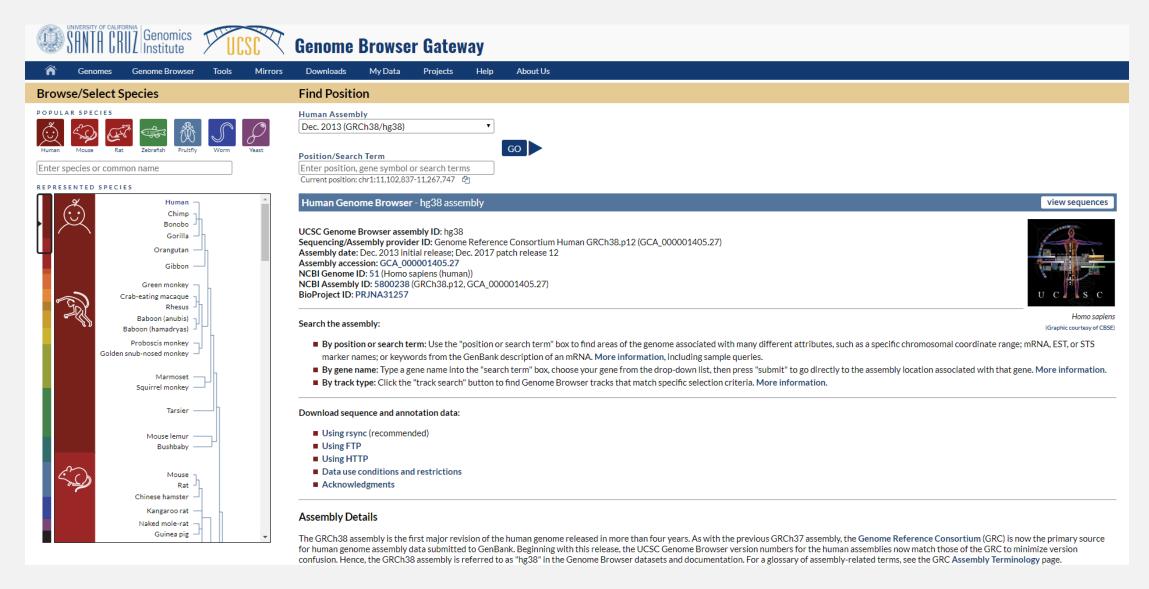
Non-model organisms are organisms that have not been selected by the research community for extensive study either for historic reasons, or because they lack the features that make model organisms easy to investigate (e.g. they cannot grow in the laboratory, have a long life cycle, low fecundity or poor genetics).



Reference genomes and where to find them (model organisms)



Reference genomes and where to find them (model organisms)



https://genome.ucsc.edu/cgi-bin/hgGateway

Reference genomes and where to find them

FASTA and pre-compiled INDEXES

- Homo_sapiens/UCSC/hg38/Sequence/AbundantSequences
- Homo_sapiens/UCSC/hg38/Sequence/BowtieIndex
- Homo_sapiens/UCSC/hg38/Sequence/Bowtie2Index
- Homo_sapiens/UCSC/hg38/Sequence/BWAIndex
- Homo_sapiens/UCSC/hg38/Sequence/Chromosomes (individual fasta for each chromosome)
- Homo_sapiens/UCSC/hg38/Sequence/WholeGenomeFasta (Single fasta w/ all chromosome)

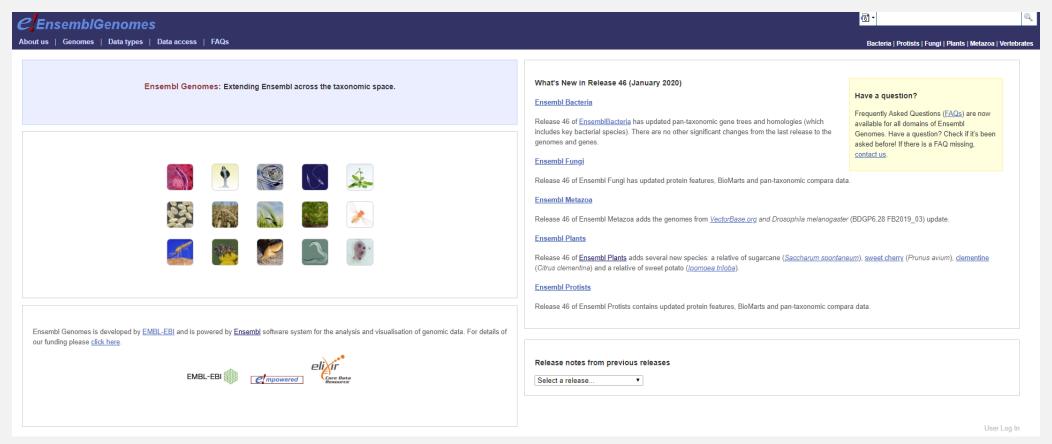
Gene annotation files (GTF and small RNA FASTA)

- Homo_sapiens/UCSC/hg38/Annotation/Genes
- Homo_sapiens/UCSC/hg38/Annotation/Genes.gencode
- Homo_sapiens/UCSC/hg38/Annotation/SmallRNA

adapter_contam1.fa chrM.fa hum5SrDNA.fa humRibosomal.fa phix.fa polyA.fa polyC.fa

Top tip: watch out for versioning! hg38 is the latest available version of the human genome: 2013 (hg38) vs 2009 (hg19)

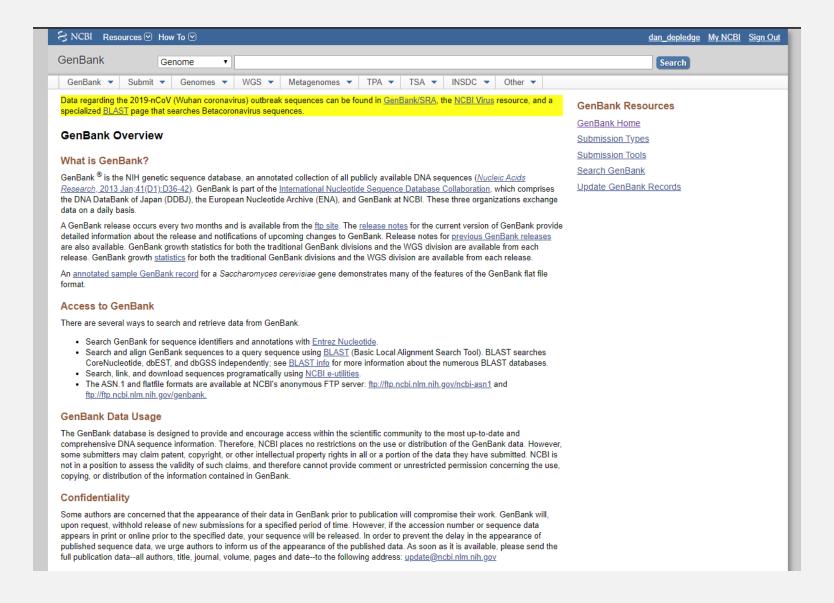
Reference genomes and where to find them (non-model organisms)



http://ensemblgenomes.org/

50,000+ genomes

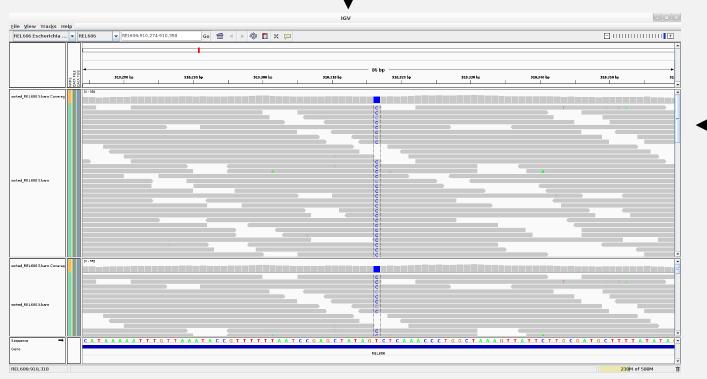
Reference genomes and where to find them (non-model organisms)



https://www.ncbi.nlm.nih.gov/genbank/ - only if you are desperate (non-model organism)

Challenges of visualizing big and small data

- Why use visual inspection?
 - Simplest way to troubleshoot
 - Helps to confirm effectiveness of alignment strategy are your parameters causing problems?
 - Inspect read alignments at interesting locations (e.g. SNPs, transcription termini, antisense transcription)
- Limitations of visual inspection
 - BAM files are often too big to load into memory (unless using a very high spec computer)
 - · Window of analysis is often too small or insufficiently detailed
 - Screen grabs make for lousy images (not publication quality)

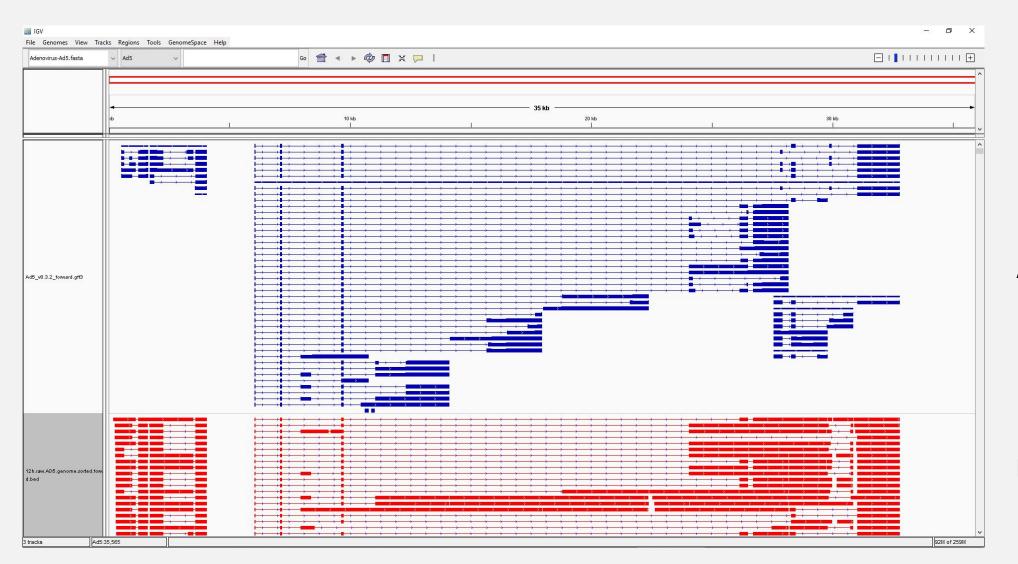


List of alignment viewers

- IGV
 - UCSC Genome Browser
 - Artemis
 - Ugene
 - Tablet
 - tview (SAMtools)
 - Literally and hilariously text based

The Integrative Genomics Viewer (IGV)

• Remains the simplest (i.e. user-friendly) solution for both model and custom genomes



Annotation track

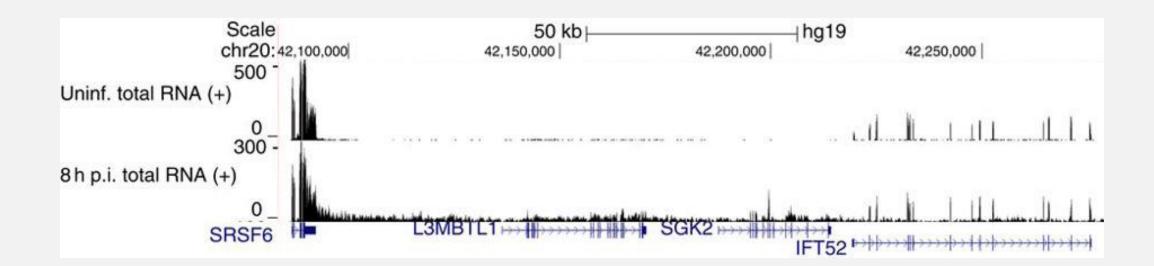
Data track

Gviz

- Pros
 - Simple to learn (requires R)
 - Great at both high level and granular levels
 - Can generate publication quality images
 - Compatible with multiple file formats (BAM/BED)
 - Plenty of support available via google / forums / developers
 - Good support for *popular* genomes

Cons

Tricky to get working with non-model genomes



Getting to grips with Gviz

General manual

https://bioconductor.org/packages/release/bioc/vignettes/Gviz/inst/doc/Gviz.pdf

Useful tutorial #1

http://www.sthda.com/english/wiki/gviz-visualize-genomic-data

Useful tutorial #2

https://davetang.org/muse/2013/10/03/using-gviz/

Assignment #1

Investigating the cellular response to exogenous dsDNA

Introduction

Double-stranded DNA (dsDNA) in the cytosol of human cells stimulates the type 1 interferon (IFN) response, a component of innate immunity that is active against invading pathogens and many cancers. Over the course of Assignment #1 and Assignment #2, we will examine the host genes that are transcriptionally regulated upon detection of invading dsDNA.

Assignment #1 will focus on (1) finding and downloading <u>stranded paired-end RNA-Seq</u> datasets from a recently published study, (2) performing basic QC and alignment of these datasets, and (3) visualizing the read coverage across several regions of the genome. The aim is to become familiar with a range of common tools used in the processing of NGS data.

Note that these alignments will be carried over into Assignment #2 in which you will need to undertake a typical differential gene expression analysis using read counts generated from the aligned data.

Assignment #1

1. Download six datasets (3 x dsDNA 12 hr bioreps and 3 x CTRL 12 hr bioreps) from the SRA. These are associated with the BioProject ID PRJNA451188.

- List of SRA IDs: SRR7049616, SRR7049615, SRR7049609, SRR7049610, SRR7049611, SRR7049612
- Hint #1 use <u>sra-tools</u> on BigPurple to download data
- Hint #2 Use the SRA run selector to get a simple overview of datasets and to filter for those you are interested in
- Hint #3 ensure that each dataset downloaded comprises two files, one with the forward reads (R1) and one with the reverse (R2).

2. Examine dataset using FASTQC and perform adapter + quality trimming with TrimGalore

- Examine all downloaded files
- This requires using <u>TrimGalore</u> and piping the output into <u>FastQC</u> (BigPurple)
- Remember to run TrimGalore in paired-end mode and consider appropriate Phred score for trimming

3. Align <u>all</u> datasets to the human genome (UCSC HG38 version) using a spliced aligner

- This requires downloading the correct copy of the human genome and aligning paired-end datasets against it in a sensible manner (i.e. bowtie2, bbmap)
- Note, all six datasets must be aligned (separately)

3. Visualize read coverage across the following loci: IFN1B, IFIT2, and ISG15

- This requires loading alignment data (BAM, BED, BIGWIG) into local installations of IGV and/or using the Gviz package to make useful plots.
- Remember to consider strandedness in alignments

Assignment #1

Useful notes

- Downloading a single dataset from the SRA can take several hours. Consider the use of parallelization.
- Alignment is a non-trivial process. Think carefully about the software and parameters you use (i.e. read the manuals!)
- IGV is a simple way to look at read coverage but does not produce publication quality images...
- Gviz requires more time/patience/fiddling but produces publication quality images and is far more flexible than IGV.

<u>Strandedness</u> refers to the fact that individual RNA-Seq reads can be assigned to a specific DNA strand. In a genic context, one would expect RNA-Seq reads for an expressed gene to predominantly align to the strand encoding that gene and to only align to the exonic regions of that gene

Thank you for your attention



Questions?