Intro to NGS Data Processing and Formats

Tyler Linderoth Copenhagen Popgen Summer course 2021

Some motivations for NGS.

- Genome-wide vs. targeted sequencing data is much more conducive to identifying and characterizing the evolutionary roles of **structural variation**.
- Genome-wide association studies (GWAS). Much more efficient than candidate gene approaches (though identifying truly novel gene functions is still a challenge).
- Discerning how the landscape of genetic variability across the genome influences fitness. E.g.
 there's recently been debate over how important overall levels of genetic diversity are to population
 viability compared to how it's distributed in the genome.
- Being able to infer different genealogical histories along the genome has greatly enhanced our ability to reconstruct population histories (e.g. PSMC).
- Much more efficient for identifying and characterizing hybridization between species. Without NGS, finding regions of adaptive introgression for instance could be a needle-in-a-haystack endeavor. This has greatly enhanced our view of how species engage with one another to influence biodiversity and evolution.
- **Genetic monitoring** through eDNA and metabarcoding.
 - Effective for sequencing degraded **historic and ancient DNA**.

So NGS provides "genome-wide" data, but how does it do it and what are the different flavors?

- Whole genome sequencing (WGS)
 - Short read (~100-150 bp reads)
 - Long reads (>10 kb-long reads)
- Reduced representation, which target some fraction of the genome.
 - o Targeted sequence capture.
 - Restriction-associated digest (RAD).
 - single-digest
 - double-digest
 - RAD-capture.

So you've gathered that NGS provides "genome-wide" data, but how does it do it and what are the different flavors?

Whole genome sequencing (WGS)

Pros:

- Most amiable for discovering both SNP and structural variation.
- Better ability to finely identify causal variants in association studies and divergence scans.
- Library preparation is easier.

Cons:

- Require's a reliable reference genome, which can be difficult to generate depending on the organism.
- More sequencing and cost to achieve a target sequencing depth-of-coverage. May not be able to achieve high enough coverage to reliably phase and so could preclude the use of powerful haplotype-based analytical methods.

So you've gathered that NGS provides "genome-wide" data, but how does it do it and what are the different flavors?

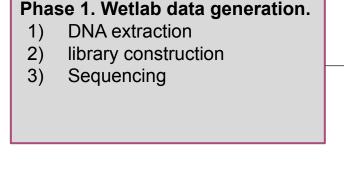
Reduced representation, which target some fraction of the genome.

Pros:

- Can increase sample sizes at a fixed budget and depth-of-coverage, which can provide more statistical power and accurate inference.
- *de novo* reference assembly can be easier since the data has often been pre-screened for regions that will be difficult to assemble.

Cons:

- Gamble on being able to identify particular regions of interest through linkage-disequilibrium (LD), and often the extent of LD is unknown.
- Capture kits can be expensive (7,000 USD for a 4 reaction kit), but still may be cheaper than additional sequencing required for WGS.
- RAD is anonymous (you may not be able to find from where in the genome your SNPs are actually located unless there are suitable references).

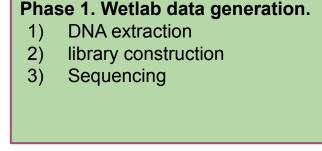


- Phase 2. Mapping / Alignment
 - FASTQ quality control (FastQC, cutadapt, trimmomatic, Trim Galore, PEAR, FLASH, super deduper). Assembly
- 2) 3)
 - Mapping (bwa, Bowtie, Novoalign).

Phase 3. Variant discovery

- Quality control sites to ensure any genetic 1) variation or (lack of genetic variation) at them is deemed reliable.
- 2) Screen for signatures indicative of SV (samtools, IGV, ngsParalog)
- Call SNPs and genotypes (ANGSD, 3) bcftools, GATK, freeBayes)

- Phase 4. Characterize genetic variation and make biological inference
- Estimate allele frequencies (ANGSD)
- 2) Population structure, demography, selection.



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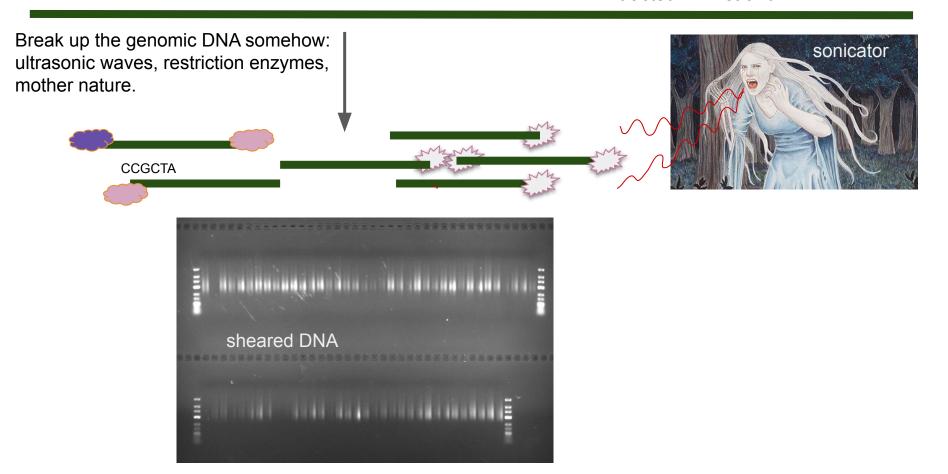
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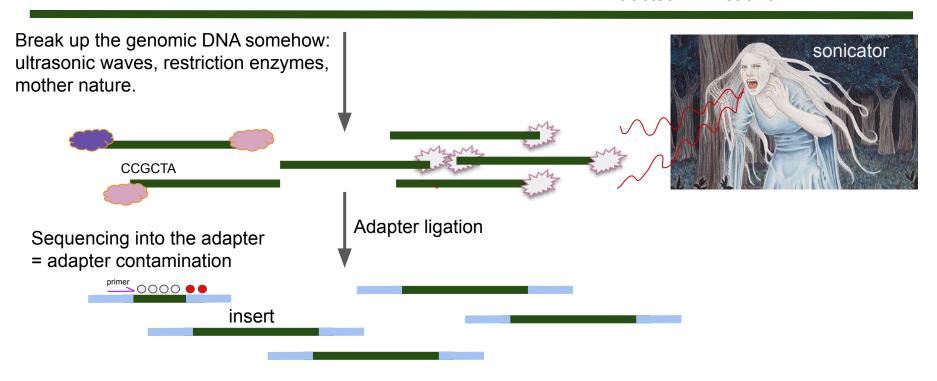
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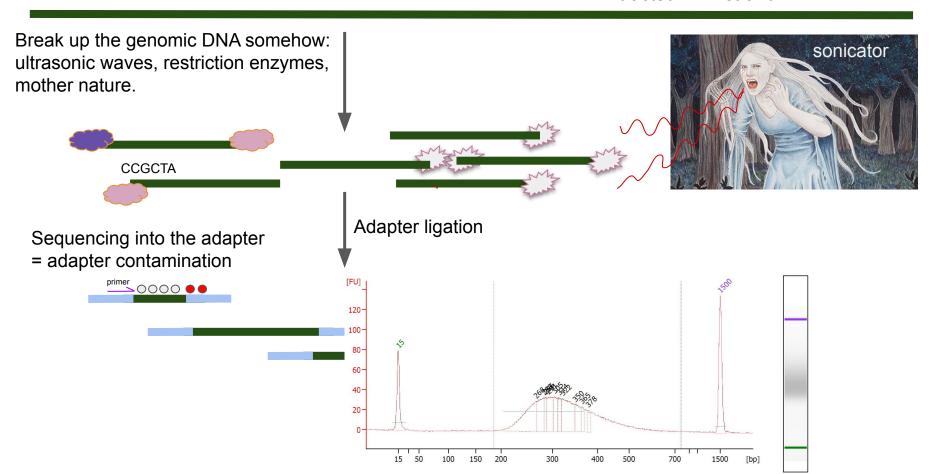
Extracted DNA strand



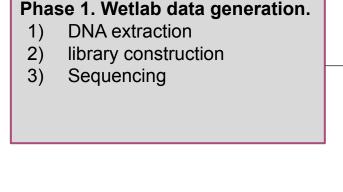
Extracted DNA strand



Extracted DNA strand



Extracted DNA strand Break up the genomic DNA somehow: ultrasonic waves, restriction enzymes, single-end paired-end mother nature. independent reads two inwardly oriented reads separated by ~200 nt mate-paired Adapter ligation Sequencing into the adapter two outwardly oriented reads separated by ~3000 nt = adapter contamination primer OOOO •• sequencing



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Raw sequencing reads in FASTQ format



Read ID
Sequence
base quality
scores

Raw sequencing reads in FASTQ format

Dec	Char		Dec	Char	Dec	Char	Dec	Char	
0	NUI	(null)	32	SPACE	64	(a	96	`,	
1		(start of heading)	33	I	65	_	97	a	
2		(start of text)	34	ii .	66	В	98	b	TTATAAGTGATCANTGTC
3		(end of text)	35	#	67	C	99	C	
4		(end of transmission)	36	\$	68	D	100	d	Control of the Contro
5		(enquiry)	37		69	E	101	e	7FJJ<7FJ< <jjf#<jff< td=""></jjf#<jff<>
6		(acknowledge)	38	&	70	F	102	f	
7		(bell)	39	1	71	G	103	g	CONTRACTOR OF THE STREET, STRE
8	BS	(backspace)	40	(72	Н	104	h	GCAACAAAATTANTAAA
9		(horizontal tab)	41)	73	I	105	i	JOCANCANANTIANTANA
10	LF		42	*	74	j	106	i	
11	VT	(vertical tab)	43			K	107	k	
12	FF	(NP form feed, new page)	44		76	L	108	1	,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,
13	CR	(carriage return)	45	_	77	M	109	m	
14	50	(shift out)	46	685	78	N	110	n	
15	SI	(shift in)	47	1	79	0	111	0	ATCCAACNAACAANCTTT
16	DLE	(data link escape)	48	Θ	80	P	112	p	
17		(device control 1)	49	1	81	0	113	q	
18	DC2	(device control 2)	50	2	82	R	114	r	JJJFJJJ#JJJJJ#JJJJ
19	DC3	(device control 3)	51	3	83	S	115	S	0001000110000110000
20	DC4	(device control 4)	52	4	84	T	116	t	
21	NAK	(negative acknowledge)	53	5	85	U	117	u	TACCACCNICTCCNITTAA
22		(synchronous idle)	54	6	86	V	118	V	TAGCAGCNTGTGCNTTAA
23	ETB	(end of trans. block)	55	7	87	W	119	W	
24	CAN	(cancel)	56	8	88	X	120	X	
25	EM	(end of medium)	57	9	89	Y	121	y	JJJJFJJ#JJFJJ#< <fj< td=""></fj<>
26	SUB	(substitute)	58		90	Z	122	z	A MANAGER AND A SECTION OF THE SECTI
27	ESC	(escape)	59	;	91]	123	{	
28	FS	(file separator)	60	<	92	1	124	Ĩ	CTCGCAANACGTCNTTCC
29	GS	(group separator)	61		93]	125	}	or cochained rentrice
30	RS	(record separator)	62	>	94	^	126	~	
31	US	(unit separator)	63	?	95		127	DEL	

The quality scores are in ASCII encoding, and can be interpreted as the probability of being an error.

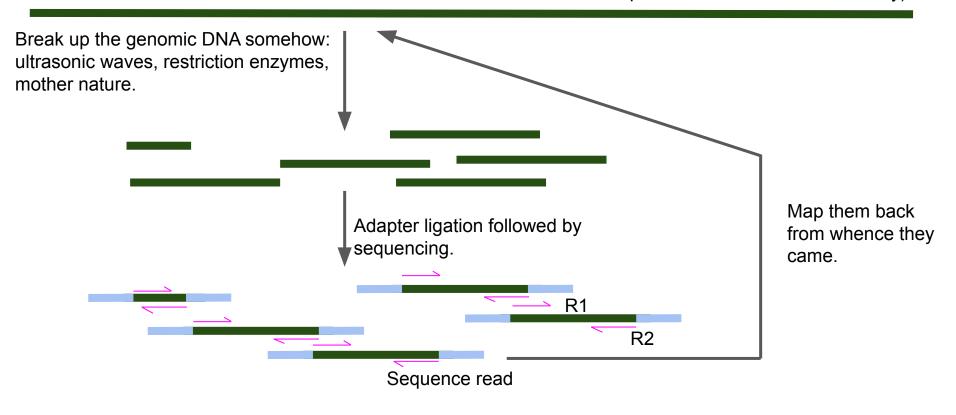
They are in Phred scale: Qscore = $-10*log_{10}(\epsilon)$

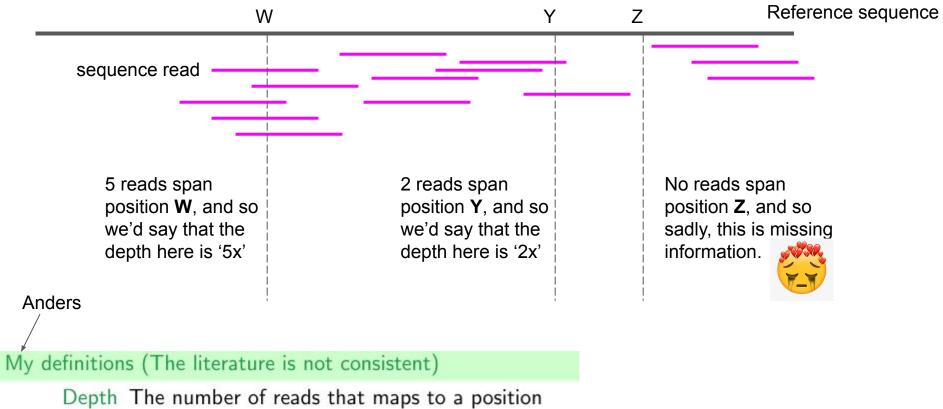
Given the quality score then, $\epsilon = 10^{-Q/10}$

Raw decimal values are normally offset by 33 (64 on some older platforms). So a Qscore of '5' is 53-33 = 20. $10^{-20/10} = 1\%$. There is a 1% probability that a base with Qscore '5' is an error.

FASTQ quality issues.

- Adapter contamination (this is the only quality issue I mostly worry about these days)
- Low quality bases at the ends of reads (best handled by mappers like BWA through soft-clipping)
- Contamination
- Low Complexity reads (this is best handled by the mapper these days)
- Excess missing bases ('N')





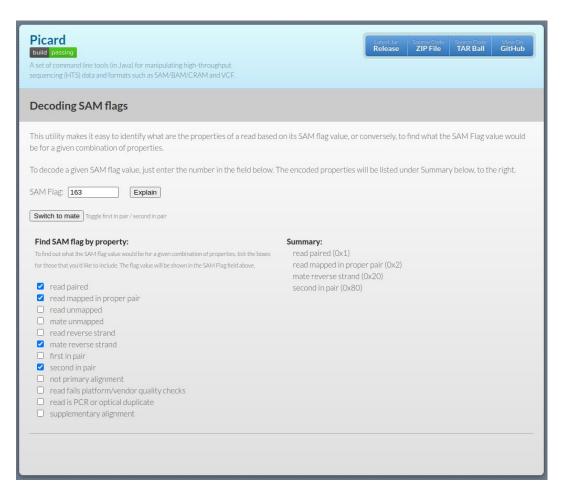
Depth The number of reads that maps to a position Coverage The fraction of the genome (region) with data Depth-of-coverage Average depth for sites that are covered

SAM/BAM/CRAM format (for mapped reads)

HS36 21523:8:1214	17007.21562	162	chc7	16 23	125M =	503	612	CGAGAGTGCAGCAGTTTGGTGA	AACCAACACCTCAACAACACCTC	ACCATCCA ACACACCACCA ACA	CCACACTTTCAAACC	ACACATTATCCCACAATAAA	ACCTCT
AAGAGCAGAGATTCATT								FFFFFFFFFFFFFFFFFFFFFFFFFFFFFFFFFFFFFFF			XS:i:125	MO:i:23 MC:Z:125M	AGCTGT
					CCCCCCCCC					EEEE AS: C: 120	X3: (:125	MQ:1:23 MC:2:123M	
	D:Z:108G16	NM:i:1											
HS36_21523:8:2114				35 0	125M =	446	533		GGTGAGCATCCAAGAGACGAGCA				
TATCTTTACTATTTTTC								AAAAAAAAAAAAAAAAAAAAAA			XS:i:125	XA:Z:chr8,-2398254	
,0;chr16,-2795556	,125M,1;chr18,	+31933268	,125M,1;	chr18,+30035788	,125M,2;ch	г8,-2399344	8,125M,3;	BC:Z:GAGGATGGTCTTTCCC	QT:Z:BBBBB <ff bbbbbff<="" td=""><td>MQ:i:0 MC:Z:122M3S</td><td>ms:i:3656</td><td>MD:Z:89G35</td><td>NM:i</td></ff>	MQ:i:0 MC:Z:122M3S	ms:i:3656	MD:Z:89G35	NM:i
:1 RG:Z:21523_8#3	1												
HS36_21523:8:1103:	:15663:2731	99	chr7 4	45 47	125M =	593	673	AGGTGAAGAAGAGGTGAGCATC	CAAGAGACGAGCAAGAGGACAGT	TTCAAAGCAGACATTATGGCAC	CAATAAAAGCTGTGAG	AGCAGAGATTCATTCATATC	TTTACT
ATTTTTCTTTAGCTTCT								BBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBB			XS:i:120	XA:Z:chr8,-2398253	2,125M
,1;chr16,-2795546	,125M,2;chr18,	+31933278	,125M,2;	chr8,-23993438,	125M,3;chr	18,+3003579	8,125M,3;	BC:Z:GAGGATGGTCTTTCCC	QT:Z:BBBBBFFFBBBBBFFF	MQ:i:48 MC:Z:125M	ms:i:3343	MD:Z:125	NM:i
:0 RG:Z:21523 8#3	1												

\mathbf{Col}	\mathbf{Field}	\mathbf{Type}	Regexp/Range	Brief description
1	QNAME	String	[!-?A-~]{1,254}	Query template NAME ID of the read
2	FLAG	Int	$[0, 2^{16} - 1]$	bitwise FLAG
3	RNAME	String	* [:rname:^*=][:rname:]*	Reference sequence NAME ¹¹
$_4$	POS	Int	$[0, 2^{31} - 1]$	1-based leftmost mapping POSition
5	MAPQ	Int	$[0, 2^8 - 1]$	MAPping Quality
6	CIGAR	String	* ([0-9]+[MIDNSHPX=])+	CIGAR string
7	RNEXT	String	* = [:rname:^*=][:rname:]*	Reference name of the mate/next read
8	PNEXT	Int	$[0, 2^{31} - 1]$	Position of the mate/next read
9	TLEN	Int	$[-2^{31}+1, 2^{31}-1]$	observed Template LENgth
10	SEQ	String	* [A-Za-z=.]+	segment SEQuence
11	QUAL	String	[!-~]+	ASCII of Phred-scaled base QUALity+33

https://broadinstitute.github.io/picard/explain-flags.html



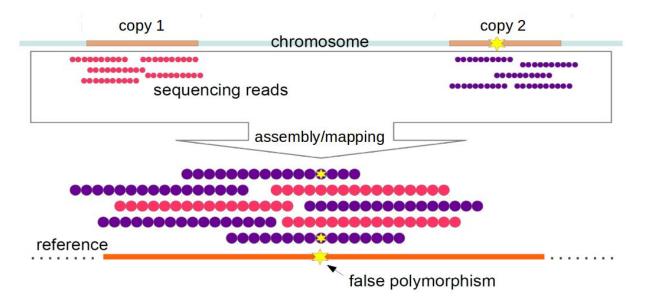
Can use this tool from the Broad to interpret the bitwise flags.

;0;CH110,-279333 :1	#1	chr7 45	47 125M = 593 673 AGGTGAAGAAGAGGTGAGCA	C Q1:2:BBBBB <ff7bbbbbff mc:2:122m3s="" mq:0:0="" ms:0:3050="" mu:2:89g3s="" nm:0="" tccaagagacgagac<="" tccaagagacgagagagagagattcatactttact="" th=""></ff7bbbbbff>
ATTTTTCTTTAGCTTC ,1;chr16,-279554	T BBBBBBBBBBBBBBBB 6,125M,2;chr18,+31933	BBBBBBBBBBBBBBBBBB	3BBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBB	BBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBBB
:0 RG:Z:21523_8	#1			
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10	SEQ	String	* [A-Za-z=.]+	segment SEQuence
11	QUAL	String	[!-~]+	ASCII of Phred-scaled base QUALity+33

MO:i:23 MC:Z:125M

Based on the first entry, the left-most coordinate of read HS36_21523:8:1214:17897:31562 mapped in a properly mapped pair to chr7:16 in the reference and was identical to the reference along all 125 of its bases. The mapping quality is not particularly high: 23, so it could potentially be mismapped (~0.5% probability).

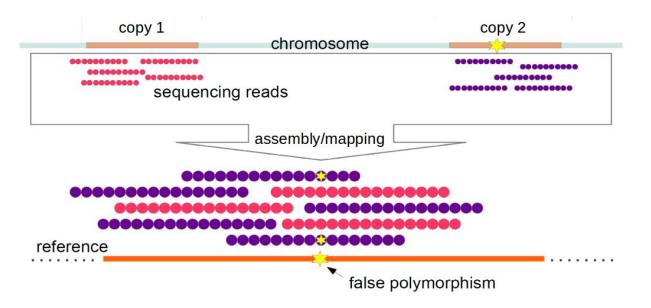
The problem of paralogs (or any other type of repeat sequence)



- Sequence depth proportional to the number of copies.
- Tendency to inflate estimates of heterozygosity

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The problem of paralogs (or any other type of repeat sequence)



- Sequence depth proportional to the number of copies.
- Tendency to inflate estimates of heterozygosity.
- Can generate improperly mapped reads



Pileup format (generated with SAMtools)

chr	10000	Т	2	٠,	EB	7	.,,,,,^],	>IIBGGE	6	,	DEGEGG	9	1 . 1 1 . 1 1 . 1	DABGIIIII
chr	7 10001	C	3	٠, ^].	EBB	7		>IIBGGI	6	,	DEGEGG	9	1.11.11.1	DABGIIIII
chr	10002	G	3	.,.	EBB	7	.,,,,,,	>IIBGGI	6	,	DEGEGG	9	1 . 1 1 . 1 1 . 1	DABGIIIII
chr	10003	G	3	.,.	EBB	7		>IIBGGI	6	,	DEGEGG	10	, . , , . , , , ^].	DABGIIIIE
chr	10004	Α	3	.,.	EBB	8	.,,,,,,^].	>IIBGGIE	6	,	DEGEGG	10	, . , , . , , . , .	DABGIIIII
chr	10005	G	3	.,.	EBB	8	.,,,,,,,	>IIBGGIG	6	,	DEGEGG	10		DABGIIIII
chr	10006	Α	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	6	,	DEGEGG	10	1.11.11.1.	DABGIIIII
chr	10007	G	3	.,.	EBB	8	.,,,,,,,	>IIBGGIG	7	,^].	DEGEGGE	10	1.11.11.1.	DABGIIIII
chr	10008	C	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	7	, .	DEGEGGG	10	, . , , . , , . , .	DABGIIIII
chr	10009	Α	3	.,.	EBB	8	.,,,,,,,	>IIBGGIG	8	,.^],	DEGEGGGB	10	1.11.11.1.	DABGIIIII
chr	10010	G	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	8	, . ,	DEGEGGGB	10	1.11.11.1.	DABGIIIII
chr	10011	C	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	8	, . ,	DEGEGGGB	10	1 . 1 1 . 1 1 . 1 .	DABGIIIII
chr	10012	T	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	8	, . ,	DEGEGGGB	10		DABGIIIII
chr	10013	Т	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	9	,.,^],	DEGEGGGBE	10		DABGIIIII
chr	10014	Α	4	.,.^].	EBBE	8	.,,,,,,	>IIBGGIG	9	.GgG,,	DEGEGGGBG	10	1.11.11.1.	D3BGIIIII
chr	10015	G	4	.,	EBBI	8	.,,,,,,	>IIBGGIG	9	, . , ,	DEGEGGGBG	10	1 . 1 , . , , . , .	D3BGIIIIII

Left-most fields:

- (1) Reference sequence
- Position
- (3)Reference base
- (2)

(1) Depth

(2) read bases

Each individual has 3 fields:

(3) quality scores.

Base codes:

. = reference match on forward strand , = reference match on revere strand [ACGTacgt] = alternate allele (forward strand = uppercase, reverse strand = lowercase)

Pileup format (generated with SAMtools)

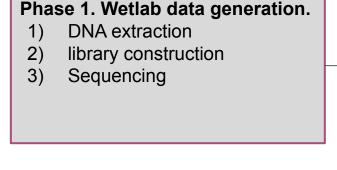
chr7	10000	Т	2	٠,	EB	7	.,,,,,^],	>IIBGGE	6	,	DEGEGG	9	1 . 1 1 . 1 1 . 1	DABGIIIII
chr7	10001	C	3	٠,^].	EBB	7	.,,,,,,	>IIBGGI	6	,	DEGEGG	9	1.11.11.1	DABGIIII
chr7	10002	G	3	.,.	EBB	7	.,,,,,,	>IIBGGI	6	,	DEGEGG	9	1 . 1 1 . 1 1 . 1	DABGIIIII
chr7	10003	G	3	.,.	EBB	7	.,,,,,,	>IIBGGI	6	,	DEGEGG	10	, . , , . , , , ^].	DABGIIIIE
chr7	10004	Α	3	.,.	EBB	8	.,,,,,,^].	>IIBGGIE	6	,	DEGEGG	10		DABGIIIII
chr7	10005	G	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	6	,	DEGEGG	10		DABGIIIII
chr7	10006	Α	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	6	,	DEGEGG	10	, , , , , , , , , ,	DABGIIIII
chr7	10007	G	3	.,.	EBB	8	.,,,,,,,	>IIBGGIG	7	,^].	DEGEGGE	10	1.11.11.1.	DABGIIIII
chr7	10008	C	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	7	, .	DEGEGGG	10		DABGIIIII
chr7	10009	Α	3	.,.	EBB	8	.,,,,,,,	>IIBGGIG	8	,.^],	DEGEGGGB	10	1.11.11.1.	DABGIIIII
chr7	10010	G	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	8	, . ,	DEGEGGGB	10	1.11.11.1.	DABGIIIII
chr7	10011	C	3	.,.	EBB	8	.,,,,,,,	>IIBGGIG	8	, . ,	DEGEGGGB	10		DABGIIIII
chr7	10012	T	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	8	, . ,	DEGEGGGB	10		DABGIIIII
chr7	10013	T	3	.,.	EBB	8	.,,,,,,	>IIBGGIG	9	,.,^],	DEGEGGGBE	10		DABGIIIII
chr7	10014	Α	4	.,.^].	EBBE	8	.,,,,,,	>IIBGGIG	9	.GgG,,	DEGEGGGBG	10		D3BGIIIII
chr7	10015	G	4	٠, ٠	EBBI	8	.,,,,,,,	>IIBGGIG	9	,.,,	DEGEGGGBG	10	, , , , , , , , ,	D3BGIIIIII

Start of read with ASCII MQ ']'

Other characters that show up: \$ = end of read

* = missing base

</> = reference skip



Phase 2. Mapping / Alignment

- FASTQ quality control (FastQC, cutadapt, trimmomatic, Trim Galore, PEAR, FLASH, super_deduper).

 Assembly
- 2) Assembly3) Mapping
 -) Mapping (bwa, Bowtie, Novoalign).

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 3) Call SNPs and genotypes (ANGSD, bcftools, GATK, freeBayes)

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 2) Population structure, demography
- 2) Population structure, demography, selection.

Phase 2: Variant discovery

Variant Call Format (VCF)

```
##INFO=<ID=MQ,Number=1,Type=Integer,Description="Average mapping quality">
##INFO=<ID=PV4,Number=4,Type=Float,Description="P-values for strand bias, baseQ bias, mapQ bias and tail distance bias">
##bcftools callVersion=1.13-3-g89a566b+htslib-1.13-3-gd16bed5
##bcftools_callCommand=call --ploidy 2 -a PV4,GQ,GP -m -P 0.001 -O u; Date=Sun Jul 25 00:26:03 2021
##INFO=<ID=NS.Number=1.Type=Integer.Description="Number of samples with data">
                                                                                                                                                                                                                                                         metadata
##INFO=<ID=AF,Number=A,Type=Float,Description="Allele frequency">
##INFO=<ID=ExcHet,Number=A,Type=Float,Description="Test excess heterozygosity; 1=good, 0=bad">
##bcftools_pluginVersion=1.13-3-g89a566b+htslib-1.13-3-gd16bed5
##bcftools pluginCommand=plugin fill-tags -0 b -o /home/tyler/ngs intro/output/calmas allsites.bcf.gz -- -tAF,NS,ExcHet; Date=Sun Jul 25 00:26:04 2021
##bcftools viewVersion=1.3.1-98-ga6a7829+htslib-1.3.1-64-g74bcfd7
##bcftools viewCommand=view -r chr7:10000-10200 calmas allsites.bcf.qz; Date=Mon Jul 26 11:44:41 2021
#CHROM
           POS
                                                               OUAL
                                                                          FILTER INFO
                                                                                                    FORMAT CMASS6607982
                                                                                                                                         CMASS6607991
                                                                                                                                                                   CMASS6389725
                                                                                                                                                                                                                     CMASS6169461
                                                                                                                                                                                                                                                                       CMASS6169443
                                                                                                                                                                                                                                                                                                 CMASS6
chr7
            10000
                                                               4752.11 .
                                                                                        DP=165;AD=165;SCR=21;MOSBZ=0.639526;FS=0;MO0F=0;AN=78;DP4=89,76.0.0;MO=56;NS=39 GT:DP:AD:SCR:OS 0/0:2:2:0:69
                                                                                                                                                                                                                                                                       0/0:7:7:1:258
                                                                                                                                                                                                                                                                                                0/0:6:0
chr7
            10001
                                                               4795.11 .
                                                                                        DP=166:AD=166:SCR=21:MOSBZ=0.609616:FS=0:MO0F=0:AN=78:DP4=90.76.0.0:MO=56:NS=39 GT:DP:AD:SCR:OS 0/0:3:3:0:102
                                                                                                                                                                                                                                                                       0/0:7:7:1:258
                                                                                                                                                                                                                                                                                                0/0:6:0
chr7
                                                               4874.11 .
            10002
                                                                                        DP=167;AD=167;SCR=21;MQSBZ=0.580082;FS=0;MQ0F=0;AN=78;DP4=91,76,0,0;MQ=57;NS=39 GT:DP:AD:SCR:QS 0/0:3:3:0:102
                                                                                                                                                                                                                                                                       0/0:7:7:1:258
                                                                                                                                                                                                                                                                                                0/0:6:6
chr7
            10003
                                                               4920.11 .
                                                                                        DP=170;AD=170;SCR=21;MQSBZ=0.493647;FS=0;MQ0F=0;AN=78;DP4=94,76,0,0;MQ=57;NS=39 GT:DP:AD:SCR:QS 0/0:3:3:0:102
                                                                                                                                                                                                                                                                       0/0:7:7:1:258
                                                                                                                                                                                                                                                                                                0/0:6:0
chr7
            10004
                                                              23.6449 .
                                                                                        DP=172;AD=171;SCR=21;SGB=-0.626698;RPBZ=1.6921;MOBZ=-2.46491;MOSBZ=0.499982;BOBZ=-1.67883;SCBZ=3.32672;FS=0;MO0F=0;AN=78;DP4=94,77,1,0;
chr7
                                                                                        DP=173;AD=173;SCR=21;MOSBZ=0.472176;FS=0;MO0F=0;AN=78;DP4=96,77,0.0;MO=57;NS=39 GT:DP:AD:SCR:OS 0/0:3:3:0:102
                                                              5018.12 .
                                                                                                                                                                                                                                                                                                0/0:6:6
chr7
                                                              24.4501 .
            10006
                                                                                        DP=174;AD=172;SCR=21;VDB=0.14;SGB=-2.84764;RPBZ=2.23109;MOBZ=-3.51912;MOSBZ=0.506159;BOBZ=-2.38185;SCBZ=4.42789;FS=0;MO0F=0;AN=78;DP4=9
chr7
            10007
                                                               5087.12 .
                                                                                        DP=176;AD=176;SCR=21;MQSBZ=0.451479;FS=0;MQ0F=0;AN=78;DP4=98,78,0,0;MQ=57;NS=39 GT:DP:AD:SCR:QS 0/0:3:3:0:102
chr7
            10008
                                                              5066.12 .
                                                                                        DP=176;AD=176;SCR=21;MQSBZ=0.451479;FS=0;MQ0F=0;AN=78;DP4=98,78,0,0;MQ=57;NS=39 GT:DP:AD:SCR:QS 0/0:3:3:0:102
                                                                                                                                                                                                                                                                       0/0:8:8:1:296
                                                                                                                                                                                                                                                                                               0/0:7:
chr7
            10009
                                                              5155.12 .
                                                                                        DP=179;AD=179;SCR=21;MOSBZ=0.431514;FS=0;MO0F=0;AN=78;DP4=100,79,0,0;MQ=57;NS=39
                                                                                                                                                                                                                                 GT:DP:AD:SCR:QS 0/0:3:3:0:102
                                                                                                                                                                                                                                                                                    0/0:8:8:1:296
chr7
            10010
                                                              5128.12 .
                                                                                        DP=180;AD=180;SCR=21;MOSBZ=0.405226;FS=0;MO0F=0;AN=78;DP4=101,79.0.0;MO=57;NS=39
                                                                                                                                                                                                                                 GT:DP:AD:SCR:OS 0/0:3:3:0:102
                                                                                                                                                                                                                                                                                    0/0:8:8:1:296
chr7
            10011
                                                              5228.12 .
                                                                                        DP=183;AD=183;SCR=21;MOSBZ=0.444839;FS=0;MO0F=0;AN=78;DP4=102,81,0,0;MO=57;NS=39
                                                                                                                                                                                                                                 GT:DP:AD:SCR:OS 0/0:3:3:0:102
                                                                                                                                                                                                                                                                                    0/0:8:8:1:296
chr7
                                                                                                                                                                                                                                  GT:DP:AD:SCR:OS 0/0:3:3:0:102
            10012
                                                              5332.12 .
                                                                                        DP=186;AD=186;SCR=21;MQSBZ=0.425788;FS=0;MQ0F=0;AN=78;DP4=104,82,0,0;MQ=57;NS=39
                                                                                                                                                                                                                                                                                    0/0:8:8:1:296
chr7
            10013
                                                              5390.12 .
                                                                                        DP=188;AD=188;SCR=21;MQSBZ=0.432328;FS=0;MQ0F=0;AN=78;DP4=105,83,0,0;MQ=57;NS=39
                                                                                                                                                                                                                                  GT:DP:AD:SCR:QS 0/0:3:3:0:102
                                                                                                                                                                                                                                                                                    0/0:8:8:1:296
                                                                                        DP=190;AD=177,12;SCR=21;VDB=0.311296;SGB=16.1258;RPBZ=-0.0261303;MOBZ=0.689528;MOSBZ=0.382678;BOBZ=0.848991;SCBZ=-1.16673;FS=0;MOFI=0;AD=177,12;SCR=21;VDB=0.311296;SGB=16.1258;RPBZ=-0.0261303;MOBZ=0.689528;MOSBZ=0.382678;BOBZ=0.848991;SCBZ=-1.16673;FS=0;MOFI=0;AD=177,12;SCR=21;VDB=0.311296;SGB=16.1258;RPBZ=-0.0261303;MOBZ=0.689528;MOSBZ=0.382678;BOBZ=0.848991;SCBZ=-1.16673;FS=0;MOFI=0;AD=177,12;SCR=21;VDB=0.311296;SGB=16.1258;RPBZ=-0.0261303;MOBZ=0.689528;MOSBZ=0.382678;BOBZ=0.848991;SCBZ=-1.16673;FS=0;MOFI=0;AD=177,12;SCR=21;VDB=0.311296;SGB=16.1258;RPBZ=-0.0261303;MOBZ=0.689528;MOSBZ=0.382678;BOBZ=0.848991;SCBZ=-1.16673;FS=0;MOFI=0;AD=177,12;SCR=21;VDB=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=0.848991;SCBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.16673;FS=0;MOSBZ=-1.
chr7
            10014
                                                              259.035 .
chr7
            10015
                                                               5441.12 .
                                                                                        DP=190;AD=190;SCR=21;MOSBZ=0.382678;FS=0;MO0F=0;AN=78;DP4=107.83.0.0;MO=57;NS=39
                                                                                                                                                                                                                                  GT:DP:AD:SCR:QS 0/0:4:4:0:142
                                                                                                                                                                                                                                                                                   0/0:8:8:1:296
```

#CHROM POS ID REF ALT QUAL FILTER INFO FORMAT CMASS6607982

chr7 10014 . A G 259.035 .

DP=190;AD=177,12;SCR=21;VDB=0.311296;SGB=16.1258;RPBZ=-0.0261303;MQBZ=0.689528;;BQBZ=0.84 8991;SCBZ=-1.16673;FS=0;MQ0F=0;AC=3;AN=78;DP4=99,78,8,5;MQ=57;PV4=0.778225,1,1,1;NS=39;AF=0.

0384615;ExcHet=0.961039 GT:PL:DP:AD:SCR:QS:GP:GQ

0/0:0,12,125:4:4,0:0:142,0:0.994672,0.00532842,5.66837e-16:22

Phase 2: Variant discovery

Variant Call Format (VCF)

#CHROM POS ID REF ALT QUAL FILTER INFO FORMAT CMASS6607982

chr7 10014 . A G 259.035 .

DP=190;AD=177,12;SCR=21;VDB=0.311296;SGB=16.1258;RPBZ=-0.0261303;MQBZ=0.689528;;BQBZ=0.84
8991;SCBZ=-1.16673;FS=0;MQ0F=0;AC=3;AN=78;DP4=99,78,8,5;MQ=57;PV4=0.778225,1,1,1;NS=39;AF=0.0384615;ExcHet=0.961039 GT:PL:DP:AD:SCR:QS:GP:GQ

0/0:0,12,125:4:4,0:0:142,0:0.994672,0.00532842,5.66837e-16:22

Site-wide info

Format of the information for individuals

Information for the first individual

This is a lot of rich information that we can subset sites with using bcftools.

Phase 2: Variant discovery

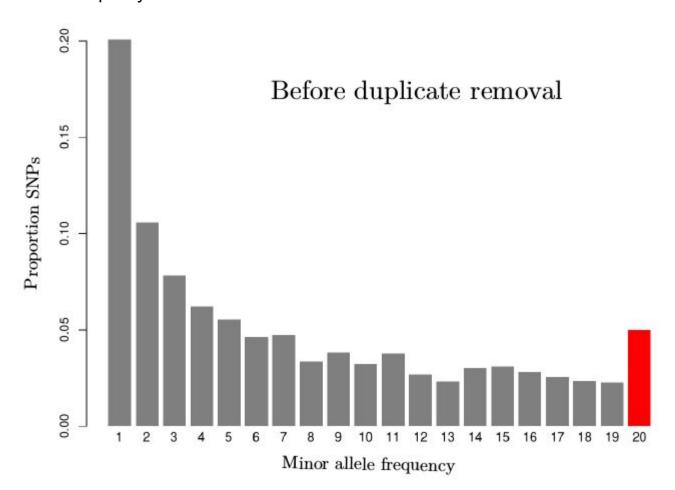
Site-level quality control

- Excessively low total site sequencing depth (excessive missing data).
- Excessively high total site sequencing depth (indicative of sites with problematic mapping due to collapsed repeats for example).
- Evenness of depth across individuals.
- Minimum number of individuals with called genotypes (sufficient high-confidence data)
- Mapping quality and excess mapping quality of zero
- Excess heterozygosity (addresses collapsed mapping)

Filters related to biases between reference and alternate alleles (we expect them to act the same):

- Map quality bias
- Base quality bias
- Read position bias
- Strand bias

Phase 2: Variant discovery
Assessing the effect of quality control



Now put it all into practice:

https://github.com/tplinderoth/Copenhagen-Popgen-Cours e/tree/main/ngs_intro_exercises