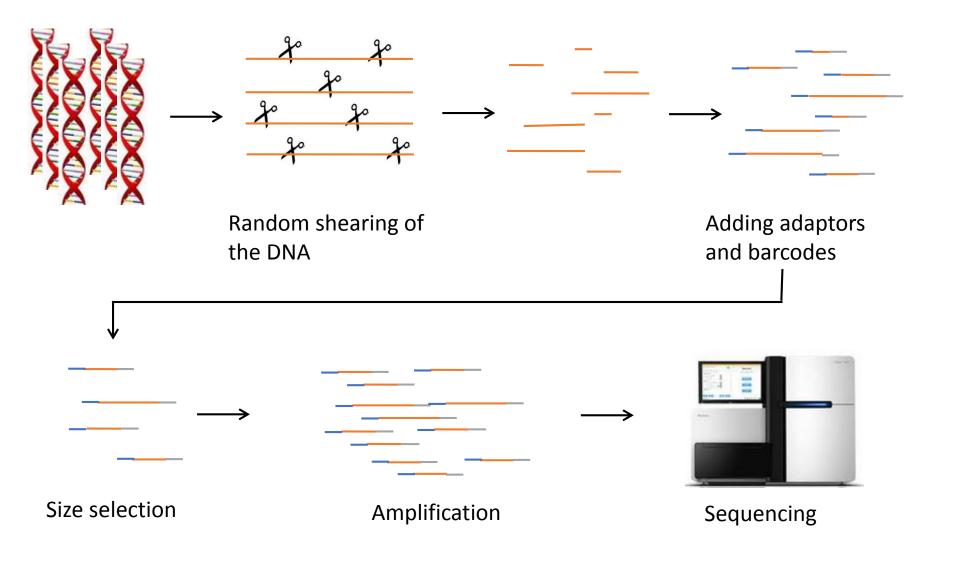
# NGS data formats and variant calling

2019 Dragon Star Bioinformatics Course (Day 1)

# Sample Preparation



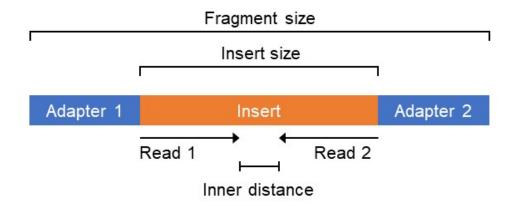
## Basic Concepts in NGS

**Insert** – the DNA portion that is used for sequencing

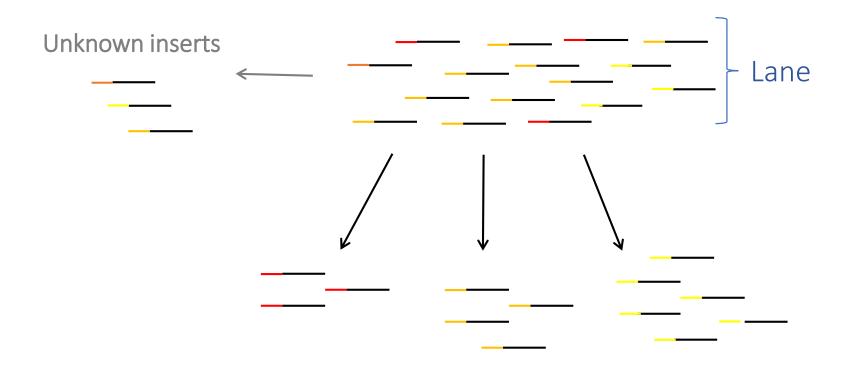
Read – the part of the insert that is sequenced

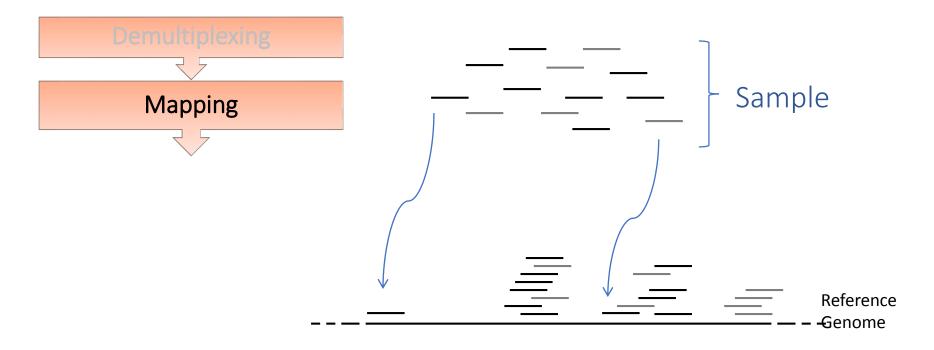
**Single End** – a sequencing procedure by which the insert is sequenced from one end only

**Paired End** – a sequencing procedure by which the insert is sequenced from both ends



## Demultiplexing

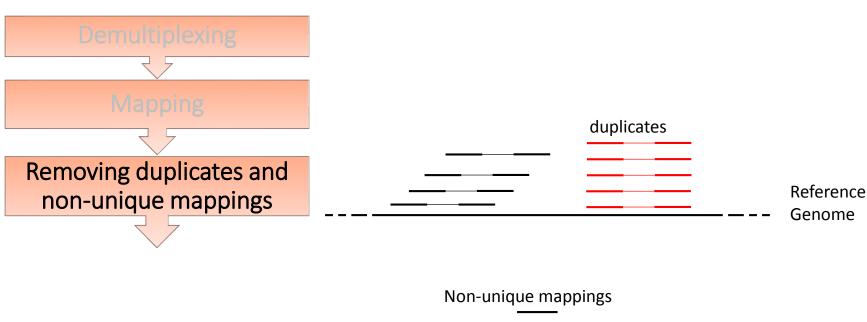


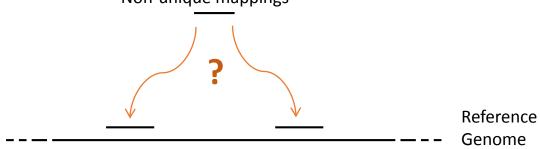


Example of mapping parameters:

- Number of mismatches per read
- Scores for mismatch or gaps

Mapping parameters affect the rest of the analysis





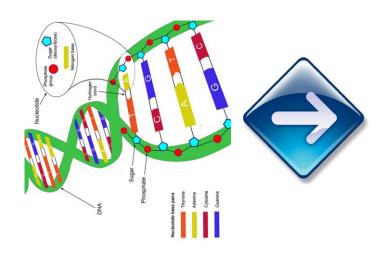
# NGS – high-throughput, but

- Shorter reads
  - Sanger sequencing: up to ~1Kb
  - NGS technologies: typically 30-300bp
  - Implication: a lot of computational tasks e.g, assembly, read alignment, haplotyping, detection of SNPs, CNVs, indels etc.
  - Higher per-base sequencing error rate
    - Sanger sequencing: < 0.001%
    - NGS: 0.5-1%
    - Implication: Need redundant sequencing of each base to distinguish sequencing errors from true polymorphisms

## Now what does NGS data look like?

What do you want them to look like?

# Fantasy Land



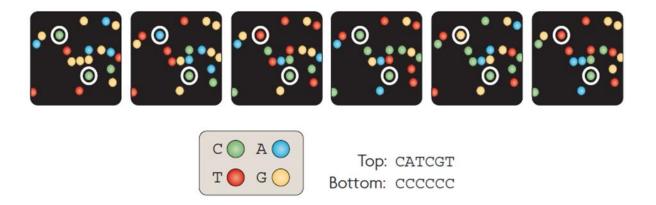
```
Chr1 haplo1: agttataagat...
Chr1 haplo2: agttattagat...
Chr2 haplo1: cctagctggat...
Chr2 haplo2: ccaagctcgat...
Chr3 haplo1: agctctgagcg...
Chr3 haplo2: agctctgagcg...
Chr4 haplo1: atcgttcgatc...
Chr4 haplo2: atcgatcgaac...
etc...
```

DNA

3 billion bases from the beginning of chromosome 1 to the end of the last sex chromosome (2x) in haplotypes

## The Rawest of Raw Data

Typically: images



- The first step is to call nucleotides at each base of each read: base calling, which is NOT 100% accurate
  - Typically base calling is done by the sequencer itself, and we start analysis after base calling (for example, fastq format file)

FASTQ: The raw sequence data format

## What the data *really* look like: FASTQ

```
@IL27 748:3:286:254:231/1
GTGGAATAATGACCATGACGAAGAGGATGACAGTCC
BBBDCDED4DEAECEFEF2DC/>>@&*/C6208'<*
@IL27 748:3:285:138:811/1
AAGTGGATTACTACCTACAGAGAGTCAGTAAGAGAG
BB3D2D<D>D7DE0+19242?=57?=4%'6%.2.'(
@IL27 748:3:142:204:780/1
AGAAAAAGAAGAGAGAGACAGACAGACAGAAAAG
26B3C8<DDD>AAA0FCF7DCA012A?(;2?AC(=/
@IL27 748:3:23:252:759/1
TTTTAGATGAAGTTATTTCCTTTACTACCGTAGGCC
BB0D; DED>; >CEC: 2EFA@69CDC3?@'%=585=
```

Millions of short reads from unknown genetic locations

## What the data *really* look like: FASTQ

```
@IL27 748:3:286:254:231/1
                                          Read 1
GTGGAATAATGACCATGACGAAGAGGATGACAGTCC
BBBDCDED4DEAECEFEF2DC/>>@&*/C6208'<*
@IL27 748:3:285:138:811/1
AAGTGGATTACTACCTACAGAGAGTCAGTAAGAGAG
                                          Read 2
BB3D2D<D>D7DE0+19242?=57?=4%'6%.2.'(
@IL27 748:3:142:204:780/1
AGAAAAAGAAAGAGAGAGACAGACAGACAGAAAAG
                                          Read 3
26B3C8<DDD>AAA0FCF7DCA012A?(;2?AC(=/
@IL27 748:3:23:252:759/1
TTTTAGATGAAGTTATTTCCTTTACTACCGTAGGCC
                                          Read 4
BB0D; DED>; > CEC: 2EFA@69CDC3?@'%=585= '
```

•••

Millions of short reads from unknown genetic locations

## What the data really look like: FASTQ

```
unique read identifier ->
                       @IL27_748:3:286:254:231/1
Bases/nucleotides read-
                       GTGGAATAATGACCATGACGAAGAGGATGACAGTCC
       "+" format line
per-base quality scores
                       BBBDCDED4DEAECEFEF2DC/>>@&*/C6208'<*
                       @IL27 748:3:285:138:811/1
                       AAGTGGATTACTACCTACAGAGAGTCAGTAAGAGAG
                       BB3D2D<D>D7DE0+19242?=57?=4%'6%.2.'(
                       @IL27 748:3:142:204:780/1
                       AGAAAAAGAAGAGAGAGACAGACAGACAGAAAG
                       26B3C8<DDD>AAA0FCF7DCA012A?(;2?AC(=/
                       @IL27 748:3:23:252:759/1
                         TTAGATGAAGTTATTTCCTTTACTACCGTAGGCC
                       BB0D; DED>; >CEC: 2EFA@69CDC3?@'%=585=
```

Millions of short reads from unknown genetic locations

Read 1

## **Base Qualities**

Short Read Sequence

#### GCTAGCTGATAGCTAGCTGATGAGCCCGA

**Short Read Base Qualities** 

30.30.28.28.29.27.30.29.28.25.24.26.27.24.24.23.20.21.22.10.25.25.20.20.18.17.16.15.14.14.13.12.10

- Each base is typically associated with a quality value
- Measured on a "Phred" scale, which was introduced by Phil Green for his Phred sequence analysis tool

 $BQ = -10log_{10}(\varepsilon)$  where  $\epsilon$  is the probability of an error

# Base quality conversion

 Nowadays, we settled on using quality scores on the original Sanger format (Phred+33).

```
!"#$%&'()*+,-./0123456789:;<=>?@ABCDEFGHIJKLMNOPQRSTUVWXYZ[\]^ `abcdefghijklmnopqrstuvwxyz{|}~
33
                                            104
                                                          126
0......26...31......40
                S - Sanger Phred+33, raw reads typically (0, 40)
       Solexa+64, raw reads typically (-5, 40)
X - Solexa
I - Illumina 1.3+ Phred+64, raw reads typically (0, 40)
J - Illumina 1.5+ Phred+64, raw reads typically (3, 41)
  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)
```

BED: Genomic region format

## **BED** format

BED format Index ▷

BED format provides a flexible way to define the data lines that are displayed in an annotation track. BED lines have three required fields and nine additional optional fields. The number of fields per line must be consistent throughout any single set of data in an annotation track. The order of the optional fields is binding: lower-numbered fields must always be populated if higher-numbered fields are used.

If your data set is BED-like, but it is very large (over 50MB) and you would like to keep it on your own server, you should use the bigBed data 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:

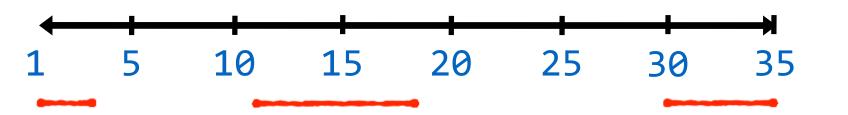
- 4. **name** Defines the name of the BED line. This label is displayed to the left of the BED line in the Genome Browser window when the track is open to full display mode or directly to the left of the item in pack mode.
- 5. **score** A score between 0 and 1000. If the track line *useScore* attribute is set to 1 for this annotation data set, the *score* value will determine the level of gray in which this feature is displayed (higher numbers = darker gray). This table shows the Genome Browser's translation of BED score values into shades of gray:



- 6. strand Defines the strand either '+' or '-'.
- 7. **thickStart** The starting position at which the feature is drawn thickly (for example, the start codon in gene displays). When there is no thick part, thickStart and thickEnd are usually set to the chromStart position.
- 8. thickEnd The ending position at which the feature is drawn thickly (for example, the stop codon in gene displays).
- 9. **itemRgb** An RGB value of the form R,G,B (e.g. 255,0,0). If the track line *itemRgb* attribute is set to "On", this RBG value will determine the display color of the data contained in this BED line. NOTE: It is recommended that a simple color scheme (eight colors or less) be used with this attribute to avoid overwhelming the color resources of the Genome Browser and your Internet browser.
- 10. blockCount The number of blocks (exons) in the BED line.
- 11. blockSizes A comma-separated list of the block sizes. The number of items in this list should correspond to blockCount.
- 12. **blockStarts** A comma-separated list of block starts. All of the *blockStart* positions should be calculated relative to *chromStart*. The number of items in this list should correspond to *blockCount*.

#### Minimal BED format. So-called BED3 format.

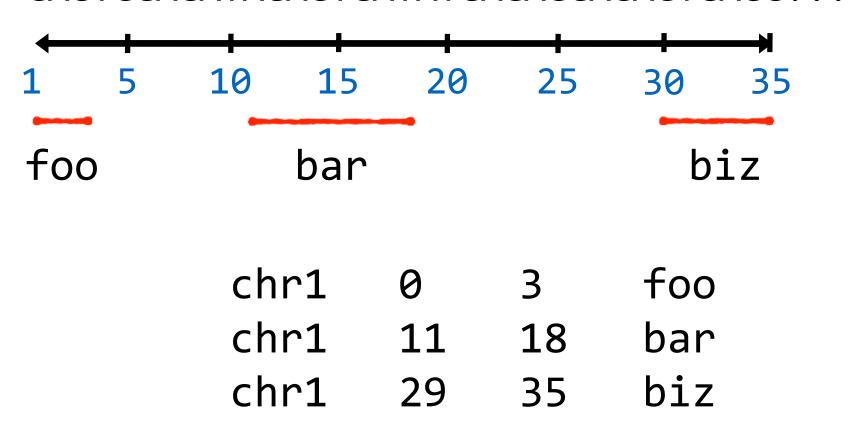
#### CAGTCGACATAGACTGATATGACACCACACTGAGC...



chr1 0 3
chr1 11 18
chr1 29 35

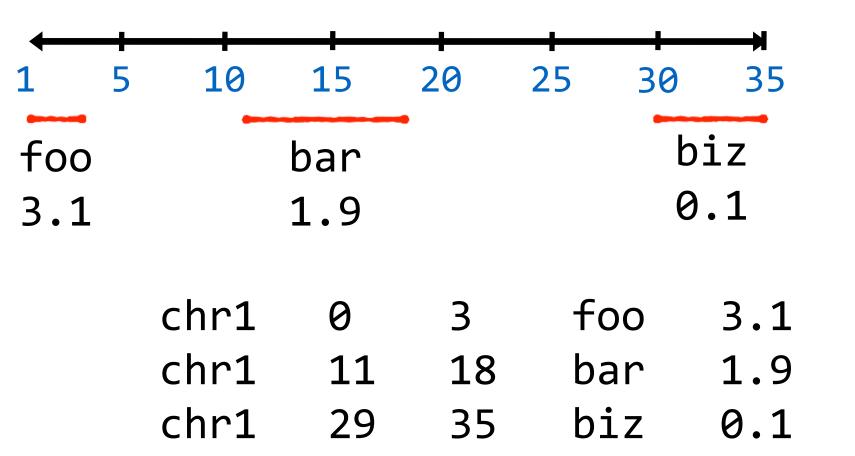
## BED format supports "labels"

#### CAGTCGACATAGACTGATATGACACCACACTGAGC...



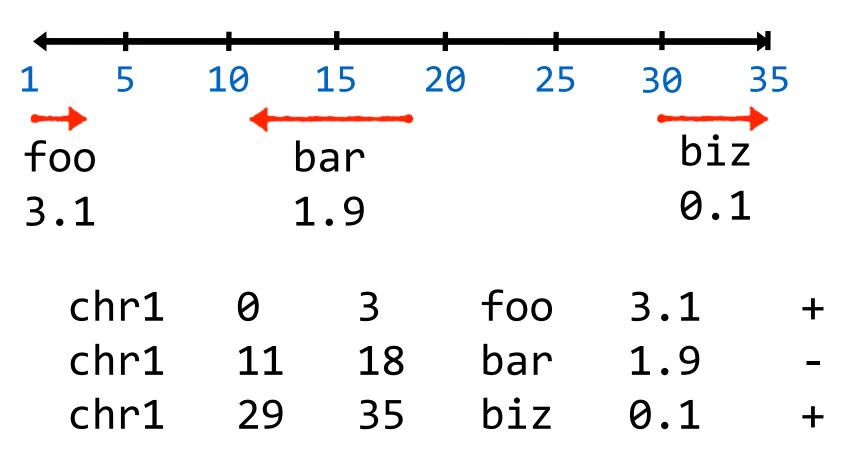
#### And scores

#### CAGTCGACATAGACTGATATGACACCACACTGAGC...



#### And strands. This is so-called BED6 format.

#### CAGTCGACATAGACTGATATGACACCACACTGAGC...



#### And more! BED12 format

BED format Index ▷

BED format provides a flexible way to define the data lines that are displayed in an annotation track. BED lines have three required fields and nine additional optional fields. The number of fields per line must be consistent throughout any single set of data in an annotation track. The order of the optional fields is binding: lower-numbered fields must always be populated if higher-numbered fields are used.

If your data set is BED-like, but it is very large (over 50MB) and you would like to keep it on your own server, you should use the bigBed data format.

The first three required BED fields are:

- chrom The name of the chromosome (e.g. chr3, chrY, chr2 random) or scaffold (e.g. scaffold10671).
- 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.

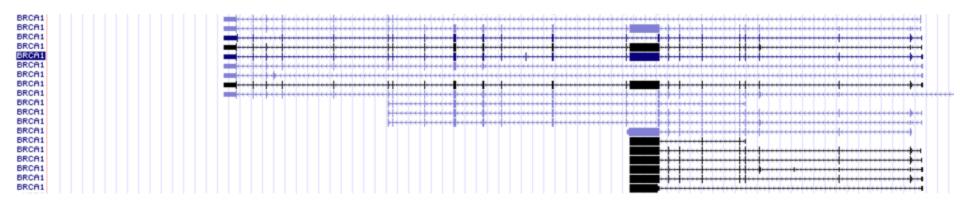
The 9 additional optional BED fields are:

- 4. **name** Defines the name of the BED line. This label is displayed to the left of the BED line in the Genome Browser window when the track is open to full display mode or directly to the left of the item in pack mode.
- 5. **score** A score between 0 and 1000. If the track line *useScore* attribute is set to 1 for this annotation data set, the *score* value will determine the level of gray in which this feature is displayed (higher numbers = darker gray). This table shows the Genome Browser's translation of BED score values into shades of gray:



- 6. strand Defines the strand either '+' or '-'
- 7. **thickStart** The starting position at which the feature is drawn thickly (for example, the start codon in gene displays). When there is no thick part, thickStart and thickEnd are usually set to the chromStart position.
- 8. thickEnd The ending position at which the feature is drawn thickly (for example, the stop codon in gene displays).
- 9. **itemRgb** An RGB value of the form R,G,B (e.g. 255,0,0). If the track line *itemRgb* attribute is set to "On", this RBG value will determine the display color of the data contained in this BED line. NOTE: It is recommended that a simple color scheme (eight colors or less) be used with this attribute to avoid overwhelming the color resources of the Genome Browser and your Internet browser.
- 10. blockCount The number of blocks (exons) in the BED line.
- 11. blockSizes A comma-separated list of the block sizes. The number of items in this list should correspond to blockCount.
- 12. **blockStarts** A comma-separated list of block starts. All of the *blockStart* positions should be calculated relative to *chromStart*. The number of items in this list should correspond to *blockCount*.

## BED12 example



chr17 41196311	41277340	uc010whm.2	0	_	41197694	41277202	0	8	1508,61,74,55,84,41,78,142, 0,3348,4826,6768,12757,19038,19579,80887,
chr17 41196311	41277340	uc002icp.4	0	-	41197694	41258496	0	23	1508,61,74,55,84,41,78,88,311,191,127,172,89,3426,77,46,103,140,89,56,54,99,142,
0,3348,4826,6768,12757,	19038,19579,23313	,26633,30036,32	193,3810	9,46649,	47140,51551,5294	9,55480,59827,6	0573,621	83,71431	,79722,80887,
chr17 41196311	41277468	uc002icu.3	0	_	41197800	41276113	0	22	1508,61,55,84,41,78,88,311,191,124,172,89,117,77,46,106,140,89,78,54,99,175,
0,3348,6768,12757,19038	,19579,23313,2663	3,30036,32193,3	8109,466	49,50449	,51551,52949,554	80,59827,60573,	62161,71	431,79722	2,80982,
chr17 41196311	41277468	uc010cyx.3	0	-	41197694	41258543	0	22	1508,61,74,55,84,41,78,88,311,191,127,172,89,3426,77,46,106,140,89,78,99,175,
0,3348,4826,6768,12757,	19038,19579,23313	,26633,30036,32	193,3810	9,46649,	47140,51551,5294	9,55480,59827,6	0573,621	61,79722	,80982,
chr17 41196311	41277500	uc002ict.3	0	-	41197694	41276113	0	24	1508,61,74,55,84,41,78,88,311,191,124,66,172,89,3426,77,46,106,140,89,78,54,99,213,
0,3348,4826,6768,12757,	19038,19579,23313	,26633,30036,32	193,3503	9,38109,	46649,47140,5155	1,52949,55480,5	9827,605	73,62161	,71431,79722,80976,
chr17 41196311	41277500	uc010whn.2	0	-	41197694	41226495	0	11	1508,61,74,55,84,41,78,88,311,191,213, 0,3348,4826,6768,12757,19038,19579,23313,26633,30036,80976,
chr17 41196311		uc010who.3	0	-	41197694	41202109	0	5	1508,61,74,129,213, 0,3348,4826,5767,80976,
chr17 41196311	41277500	uc002icq.3	0	-	41197694	41276113	0	23	1508,61,74,55,84,41,78,88,311,191,127,172,89,3426,77,46,106,140,89,78,54,99,213,
0,3348,4826,6768,12757,	19038,19579,23313	,26633,30036,32	193,3810	9,46649,	47140,51551,5294	9,55480,59827,6	0573,621	61,71431	,79722,80976,
chr17 41196311		uc010whp.2	0	-	41197694	41258543	0	22	1508,61,74,55,84,41,78,88,311,191,124,172,89,117,77,46,106,140,89,78,54,278,
0,3348,4826,6768,12757,				9,46649,			0573,621	61,71431	
chr17 41215349		uc010whq.1		-	41215349	41256198	0	12	41,78,88,311,191,127,172,89,117,106,140,89,
0,541,4275,7595,10998,1				,					
chr17 41215349		uc002idc.1	0	-	41215349	41276113	0	18	41,78,88,311,191,127,172,89,117,77,46,103,140,89,78,54,99,175,
0,541,4275,7595,10998,1				,40789,4					
chr17 41215349		uc010whr.1	0	-	41215349	41258543	0	17	41,78,88,311,191,127,172,89,117,77,46,106,140,89,78,99,175,
0,541,4275,7595,10998,1				,40789,4					
chr17 41243116		uc002idd.3	0	-	41243347	41276113	0	9	3761,77,46,106,140,89,78,54,99, 0,4746,6144,8675,13022,13768,15356,24626,32917,
chr17 41243451		uc002ide.1	0	-	41243452	41256198	0	4	3426,103,140,89, 0,8340,12687,13433,
chr17 41243451		uc010cyy.1	0	-	41243452	41276113	0	10	3426,77,46,106,140,89,78,54,99,142, 0,4411,5809,8340,12687,13433,15021,24291,32582,33747,
chr17 41243451		uc010whs.1	0	-	41243452	41276113	0	10	3426,77,46,106,140,89,78,54,99,175, 0,4411,5809,8340,12687,13433,15021,24291,32582,33842,
chr17 41243451		uc010cyz.2	0	-	41243452	41258543	0	11	3426,77,46,106,140,89,78,116,54,99,213, 0,4411,5809,8340,12687,13433,15021,19030,24291,32582,33836,
chr17 41243451		uc010cza.2	0	-	41243452	41276113	0	9	3426,77,46,106,140,89,54,99,213, 0,4411,5809,8340,12687,13433,24291,32582,33836,
chr17 41243451		uc010wht.1	0	-	41243452	41246659	0	2	3426,213, 0,33836,
chr17 41277599		uc002idf.3	-	+	41277599	41277599	0	4	188,63,182,1669, 0,5625,7373,13074,
chr17 41277599		uc010czb.2	-	+	41277599	41277599	0	2	188,1669, 0,13074,
chr17 41277599		uc002idg.3	-	+	41277599	41277599	0	5	188,63,266,468,381, 0,5625,13074,14233,19145,
chr17 41277599	41305688	uc002idh.3	0	+	41277599	41277599	0	8	188,63,125,182,205,266,120,70, 0,5625,7016,7373,12573,13074,16874,28019,

GFF: annotates one line per feature

#### **GFF** format

GFF format Index ▷

GFF (General Feature Format) lines are based on the Sanger GFF2 specification. GFF lines have nine required fields that *must* be tab-separated. If the fields are separated by spaces instead of tabs, the track will not display correctly. For more information on GFF format, refer to Sanger's GFF page.

Note that there is also a GFF3 specification that is not currently supported by the Browser. All GFF tracks must be formatted according to Sanger's GFF2 specification.

If you would like to obtain browser data in GFF (GTF) format, please refer to Genes in gtf or gff format on the Wiki.

Here is a brief description of the GFF fields:

- 1. segname The name of the sequence. Must be a chromosome or scaffold.
- 2. source The program that generated this feature.
- 3. feature The name of this type of feature. Some examples of standard feature types are "CDS", "start\_codon", "stop\_codon", and "exon".
- 4. start The starting position of the feature in the sequence. The first base is numbered 1.
- 5. end The ending position of the feature (inclusive).
- 6. score A score between 0 and 1000. If the track line useScore attribute is set to 1 for this annotation data set, the score value will determine the level of gray in which this feature is displayed (higher numbers = darker gray). If there is no score value, enter "."
- 7. strand Valid entries include '+', '-', or '.' (for don't know/don't care).
- 8. frame If the feature is a coding exon, frame should be a number between 0-2 that represents the reading frame of the first base. If the feature is not a coding exon, the value should be "."
- 9. group All lines with the same group are linked together into a single item.

#### Example:

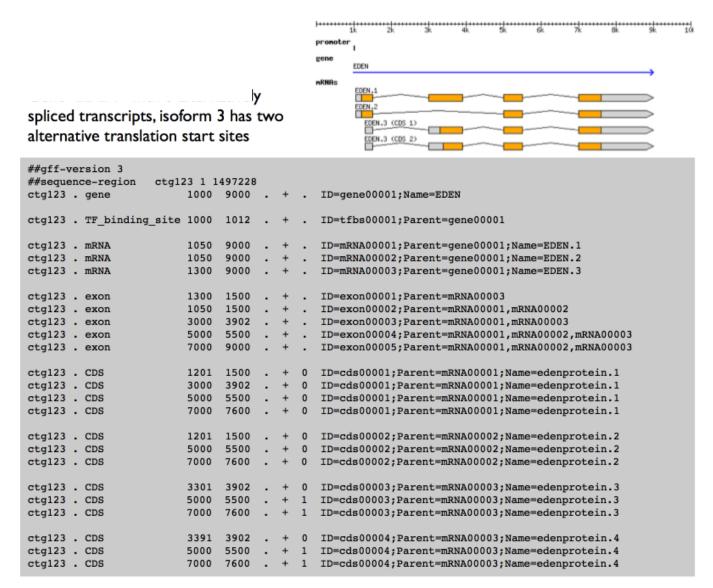
Here's an example of a GFF-based track. This example can be pasted into the browser without editing. NOTE: Paste operations on some operating systems will replace tabs with spaces, which will result in an error when the GFF track is uploaded. You can circumvent this problem by pasting the URL of the above example (http://genome.ucsc.edu/goldenPath/help/regulatory.txt) instead of the text itself into the custom annotation track text box. If you encounter an error when loading a GFF track, check that the data lines contain tabs rather than spaces.

```
browser position chr22:10000000-10025000 browser hide all track name=regulatory description="TeleGene(tm) Regulatory Regions" visibility=2 chr22 TeleGene enhancer 1000000 10001000 500 + . touch1 chr22 TeleGene promoter 10010000 10010100 900 + . touch1 chr22 TeleGene promoter 10020000 10025000 800 - . touch2
```

Click here to display this track in the Genome Browser.

chr22	TeleGene	enhancer	10000000	10001000	500 +	•	touch1
chr22	TeleGene	promoter	10010000	10010100	900 +	•	touch1
chr22	TeleGene	promoter	10020000	10025000	800 -	•	touch2

## **GFF** example



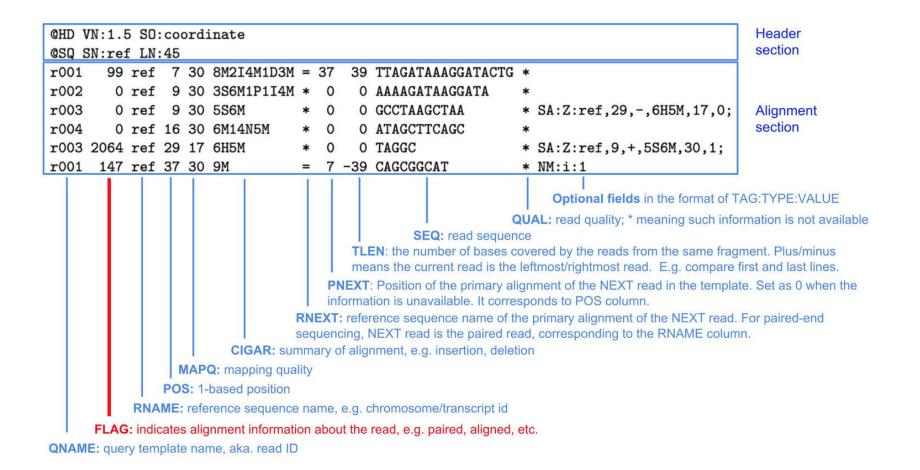
BAM/SAM: Genome alignment format

# BAM/SAM format

- SAM: Sequence Alignment/Map format (tab-delimited text file).
- BAM: The binary equivalent of a SAM file, which stores the same data in a compressed binary representation

Col	Field	Туре	Brief description
1	QNAME	String	Query template NAME
2	FLAG	Int	bitwise FLAG
3	RNAME	String	References sequence NAME
4	POS	Int	1- based leftmost mapping POSition
5	MAPQ	Int	MAPping Quality
6	CIGAR	String	CIGAR String
7	RNEXT	String	Ref. name of the mate/next read
8	PNEXT	Int	Position of the mate/next read
9	TLEN	Int	observed Template LENgth
10	SEQ	String	segment SEQuence
11	QUAL	String	ASCII of Phred-scaled base QUALity+33

# Example of a SAM file



## CRAM

- CRAM was designed to be an efficient referencebased alternative to SAM/BAM file formats
- Better lossless compression than BAM, but also allow for controlled loss of BAM data
- Typically used for large-scale population-based genome/exome sequencing project (for example, CRAMs has ~50TB for 50K exomes in UK Biobank).

VCF: Genetic variant file format

## VCF file format

- Variant Call Format, established > 10 years ago and is now a gold standard for describing variants.
- One locus per line, and it may contain more than one mutations, but most lines contain one variant only.
- Additional header lines starts with "#" to explain the meaning of the various tags in the file

# Example of a VCF file

```
##fileformat=VCFv4.3
##fileDate=20090805
##source=myImputationProgramV3.1
##reference=file:///seq/references/1000GenomesPilot-NCBI36.fasta
##contig=<ID=20,length=62435964,assembly=B36,md5=f126cdf8a6e0c7f379d618ff66beb2da,species="Homo sapiens",taxonomy=x>
##phasing=partial
##INFO=<ID=NS,Number=1,Type=Integer,Description="Number of Samples With Data">
##INFO=<ID=DP, Number=1, Type=Integer, Description="Total Depth">
##INFO=<ID=AF, Number=A, Type=Float, Description="Allele Frequency">
##INFO=<ID=AA, Number=1, Type=String, Description="Ancestral Allele">
##INFO=<ID=DB, Number=0, Type=Flag, Description="dbSNP membership, build 129">
##INFO=<ID=H2, Number=0, Type=Flag, Description="HapMap2 membership">
##FILTER=<ID=q10,Description="Quality below 10">
##FILTER=<ID=s50, Description="Less than 50% of samples have data">
##FORMAT=<ID=GT, Number=1, Type=String, Description="Genotype">
##FORMAT=<ID=GQ, Number=1, Type=Integer, Description="Genotype Quality">
##FORMAT=<ID=DP, Number=1, Type=Integer, Description="Read Depth">
##FORMAT=<ID=HQ, Number=2, Type=Integer, Description="Haplotype Quality">
#CHROM POS
                                        QUAL FILTER INFO
                                                                                         FORMAT
                                                                                                                       NA00002
                                                                                                                                        NA00003
                                                                                                      NA00001
20
       14370
                rs6054257 G
                                        29
                                              PASS
                                                      NS=3;DP=14;AF=0.5;DB;H2
                                                                                         GT:GO:DP:HO
                                                                                                      0|0:48:1:51,51 1|0:48:8:51,51
                                                                                                                                        1/1:43:5:.,.
                                                                                                      0|0:49:3:58,50 0|1:3:5:65,3
20
       17330
                                        3
                                              q10
                                                      NS=3;DP=11;AF=0.017
                                                                                         GT:GO:DP:HO
                                                                                                                                        0/0:41:3
20
       1110696 rs6040355 A
                                              PASS
                                                      NS=2;DP=10;AF=0.333,0.667;AA=T;DB GT:GQ:DP:HQ
                                                                                                      1|2:21:6:23,27 2|1:2:0:18,2
                                                                                                                                        2/2:35:4
20
      1230237 .
                                              PASS
                                                      NS=3;DP=13;AA=T
                                                                                         GT:GQ:DP:HQ 0|0:54:7:56,60 0|0:48:4:51,51
                                                                                                                                        0/0:61:2
                                                                                                                       0/2:17:2
                                                                                                                                        1/1:40:3
20
       1234567 microsat1 GTC G,GTCT 50
                                              PASS
                                                      NS=3;DP=9;AA=G
                                                                                         GT:GO:DP
                                                                                                      0/1:35:4
```

As of June 2019, the latest version is 4.3

## The header line of a VCF file

- The header line names the 8 fixed, mandatory columns. These columns are as follows:
  - #CHROM POS ID REF ALT QUAL FILTER INFO

 If genotype data is present in the file, these are followed by a FORMAT column header, then an arbitrary number of sample IDs

## The INFO line of a VCF file

- INFO fields are encoded as a semicolon-separated series of short keys with optional values in the format: key[=data[,data]].
- Some keys are reserved:

Key	Number	Type	Description
AA	1	String	Ancestral allele
AC	A	Integer	Allele count in genotypes, for each ALT allele, in the same order as listed
AD	R	Integer	Total read depth for each allele
ADF	R	Integer	Read depth for each allele on the forward strand
ADR	R	Integer	Read depth for each allele on the reverse strand
AF	A	Float	Allele frequency for each ALT allele in the same order as listed (estimated from primary data, not called genotypes)
AN	1	Integer	Total number of alleles in called genotypes
BQ	1	Float	RMS base quality
CIGAR	A	String	Cigar string describing how to align an alternate allele to the reference allele
DB	0	Flag	dbSNP membership
DP	1	Integer	Combined depth across samples

## The genotypes in a VCF file

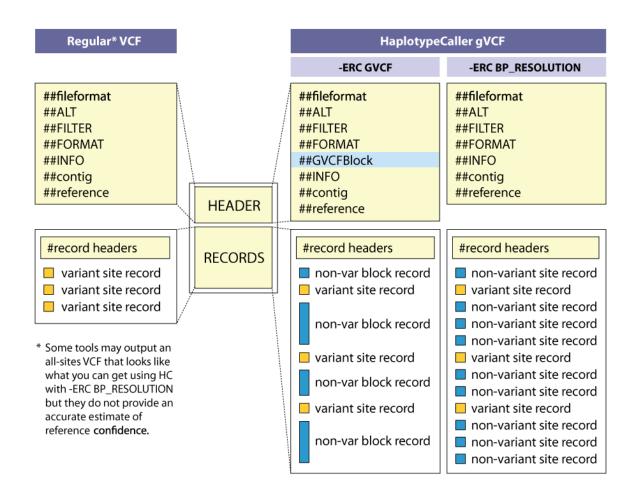
- A FORMAT field is given specifying the data types and order
- This is followed by one data block per sample, with the colon-separated data corresponding to the types specified in the format.

```
FORMAT
            NA00001
                            NA00002
                                             NA00003
            0 0:48:1:51,51
                            1 0:48:8:51,51
GT:GQ:DP:HQ
                                             1/1:43:5:.,.
            0 0:49:3:58,50
                            0 1:3:5:65,3
GT:GQ:DP:HQ
                                             0/0:41:3
            1 2:21:6:23,27
                            2 1:2:0:18,2
                                             2/2:35:4
GT:GQ:DP:HQ
            0 0:54:7:56,60
                            0 0:48:4:51,51
                                             0/0:61:2
GT:GQ:DP:HQ
                            0/2:17:2
GT:GQ:DP
            0/1:35:4
                                             1/1:40:3
```

## gVCF format

- gVCF (Genomic VCF): the basic format specification is the same as for a regular VCF, but gVCF contains extra information.
- gVCF was developed to store sequencing information for both variant and non-variant positions, which is required for human clinical applications.

## VCF versus gVCF



# Formats use different coordinate systems, which adds confusion

BED: 0-based, half-open

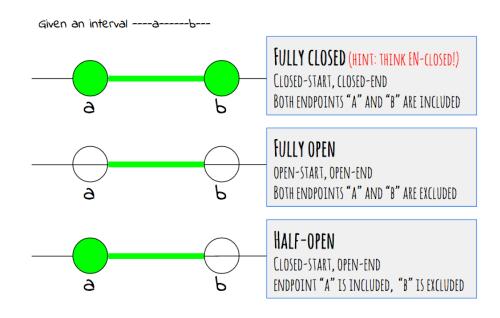
**GFF:** 1-based, fully closed

SAM: 1-based, fully closed

**BAM:** 0-based, half-open

VCF: 1-based, fully closed

• • •



## Visualization of genomic data

 Integrative Genomics Viewer (IGV) is a highperformance visualization tool for interactive exploration of large, integrated genomic datasets.



## Visualization: IGV Viewer



### Visualization: IGV Viewer



## What is coverage?

- depth of sequencing coverage can be defined theoretically as LN/G, where L is the read length, N is the number of reads and G is the haploid genome length.
- The breadth of coverage is the percentage of target bases that have been sequenced for a given number of times.
- The accuracy of variant calling is affected by sequence quality, uniformity of coverage and the threshold of falsediscovery rate that is used.

Read 1: CGGATTACGTGGACCATG (read length of 18)

ATTACGTGGACCATGAATTGCTGACA Read 2:

Read 3: ACCATGAATTGCTGACATTCGTCA Read 4:

**TIGAATTGCTGACATTCGTCAT** 

11122222222333344333333333332222221 Depth:

# Coverage: how many reads we need to cover the genome?

#### Depth of coverage model

In a shotgun sequencing, genome size G, read size S, N reads Probability of a read starts at an interval L is p=L/G D: Number of reads start in an interval of length L:

 $D \sim Binomial(N, L/G)$ 

Let L = S, then D is also the number of reads that cover the last position of the interval  $\rightarrow$  D is depth of coverage.

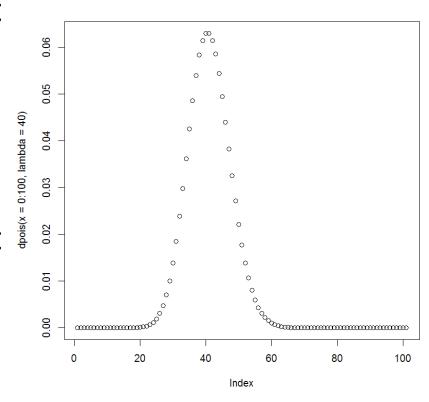
*S* << *G*, *N* very large, therefore depth of coverage is approximated by a Poisson distribution:

 $D \sim Poisson(\lambda)$  $\lambda = SN/G$  (average depth of coverage)

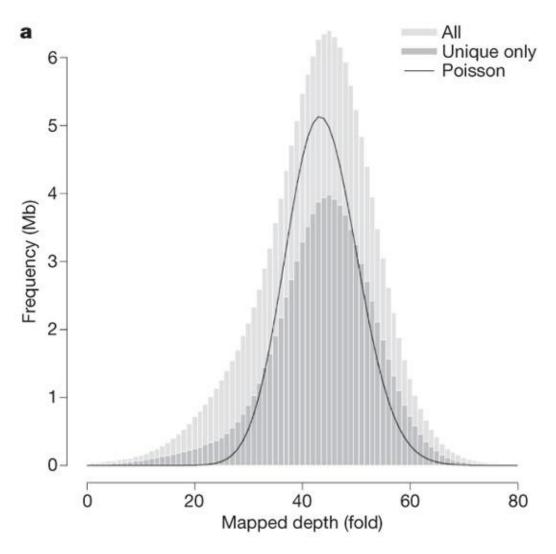
# Fraction of genome that are covered

 Given λ=40, the fraction of genome that are covered more than 30x (D>30) is: 0.938

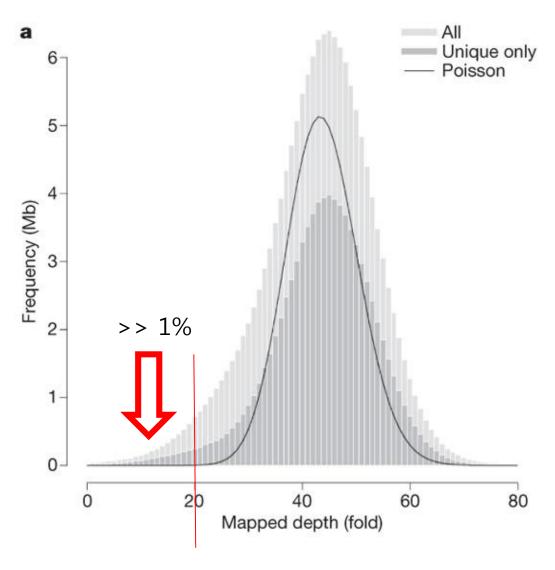
Given λ=40, the fraction of genome that are covered more than 20x (D>20) is: 0.9996



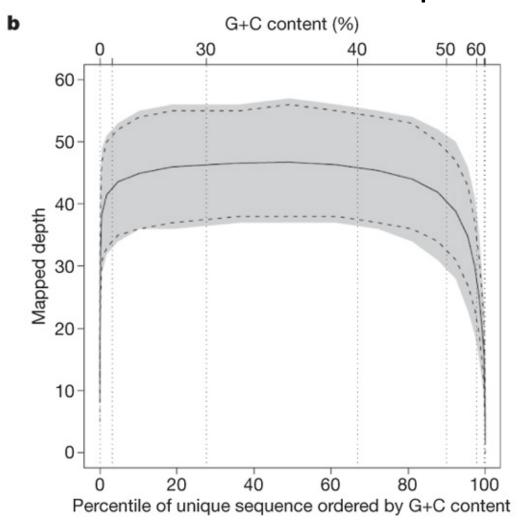
## Empirical results



## Empirical results



## Main cause of overdispersion



## How to model overdispersion

GC bias and other technical factors lead to systematic bias in coverage, resulting in overdispersion

Ideal situation (Poisson distrition):

$$Var(D) = \mu$$

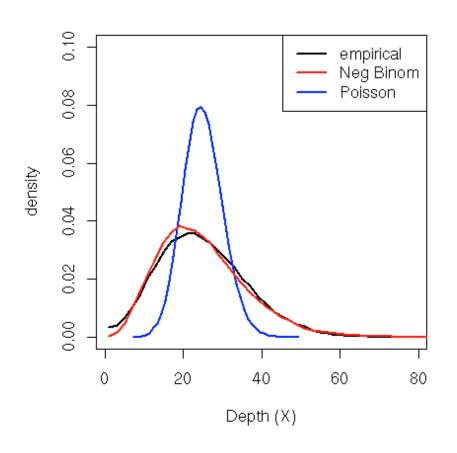
Gamma-Poisson is equivalent to Negative Binomial, which is a commonly used model for dealing with overdispersion in count data:

$$Var(D) = \mu + \mu^2/k$$

It is generalizable to model overdispersion caused by other factors, e.g. biological noise.

Larger  $k \rightarrow$  smaller overdispersion

### How to model overdispersion



- Over-dispersion: **var** > μ
- Due to sequencing bias:
  - GC content
  - Other context dependent factors

## Question on coverage

 Why do we need average 30-50x in a typical WGS experiment, and 100x in WES?

### General strategy for variant calling

- Reads piled up at each base of interest
- With per-base qualities and mapping quality



TAGCTGATAGCTAGATGAGCCCGAT

ATAGCTAGATAGCTGATGAGCCCGATCGCTGCTAGCTC

ATGCTAGCTGATAGCTAGCTGATGAGCC

AGCTGATAGCTAGCTGATGAGCCCGATCGCTG

GCTAGCTGATAGCTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTAGCTCGACG-3'
Reference Genome

Sequence Reads



5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTGCTAGCTCGACG-3'

Reference Genome

P(reads | A/A, read mapped) = 1.0

P(reads | A/C, read mapped) = 1.0

P(reads | C/C, read mapped) = 1.0



Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTGCTAGCTCGACG-3'
Reference Genome

P(reads | A/A, read mapped) = P(C observed | A/A, read mapped)

**P(reads|A/C, read mapped)=** P(C observed|A/C, read mapped)

P(reads | C/C, read mapped) = P(C observed | C/C, read mapped)

Assuming that sequencing error rate is 0.01



Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTGCTAGCTCGACG-3'
Reference Genome

P(reads | A/A, read mapped) = 0.01

P(reads | A/C, read mapped) = 0.50

P(reads | C/C, read mapped) = 0.99



AGCTGATAGCTAGCTGATGAGCCCGATCGCTG

GCTAGCTGATAGCTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTAGCTCGACG-3'
Reference Genome

P(reads | A/A, read mapped) = 0.0001

P(reads | A/C, read mapped) = 0.25

P(reads | C/C, read mapped) = 0.98



GCTAGCTGATAGCTAG CTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTGCTAGCTCGACG-3'
Reference Genome

P(reads | A/A , read mapped) = 0.000001

P(reads | A/C, read mapped) = 0.125

P(reads | C/C, read mapped) = 0.97



#### ATAGCTAGATAGCTGATGAGCCCGATCGCTGCTAGCTC

ATGCTAGCTGATAGCTAGCTGATGAGCC

AGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTG

GCTAGCTGATAGCTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTAGCTCGACG-3'
Reference Genome

**P(reads | A/A , read mapped)=** 0.00000099

P(reads | A/C, read mapped) = 0.0625

P(reads|C/C, read mapped)= 0.0097



TAGCTGATAGCTAGATGAGCCCGAT

ATAGCTAGATAGCTGATGAGCCCGATCGCTGCTAGCTC

ATGCTAGCTGATAGCTAGCTGATGAGCC

AGCTGATAGCTAGCTGATGAGCCCGATCGCTG

GCTAGCTGATAGCTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTGATGAGCCCGATCGCTGCTAGCTCGACG-3'

Reference Genome

P(reads | A/A , read mapped) = 0.00000098

P(reads | A/C, read mapped) = 0.03125

P(reads | C/C, read mapped) = 0.000097



TAGCTGATAGCTAGATGAGCCCGAT

ATAGCTAGATAGCTGATGAGCCCGATCGCTGCTAGCTC

ATGCTAGCTGATAGCTAGCTGATGAGCC

AGCTGATAGCTAGCTGATGAGCCCGATCGCTG

GCTAGCTGATAGCTAG CTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTGCTAGCTCGACG-3'

Reference Genome

P(reads | A/A, read mapped) = 0.00000098

P(reads | A/C, read mapped) = 0.03125

**P(reads | C/C, read mapped) =** 0.000097

Combine these likelihoods with a prior incorporating information from other individuals and flanking sites to assign a genotype.



TAGCTGATAGCTAGATGAGCCCGAT

ATAGCTAGATAGCTGATGAGCCCGATCGCTGCTAGCTC

ATGCTAGCTGATAGCTAGCTGATGAGCC

AGCTGATAGCTAGCTGATGAGCCCGATCGCTG

GCTAGCTGATAGCTAG CTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTGCTAGCTCGACG-3'
Reference Genome

$$P(Genotype|reads) = \frac{P(reads|Genotype)Prior(Genotype)}{\sum_{G} P(reads|G)Prior(G)}$$

Combine these likelihoods with a prior incorporating information from other individuals and flanking sites to assign a genotype.

### From Sequence to Genotype: Individual Based Prior



TAGCTGATAGCTAGATGAGCCCGAT

ATAGCTAGATAGCTGATGAGCCCGATCGCTGCTAGCTC

ATGCTAGCTGATAGCTAGCTGATGAGCC

AGCTGATAGCTAGCTGATGAGCCCGATCGCTG

GCTAGCTGATAGCTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTAGCTCGACG-3'

Reference Genome

P(reads | A/A) = 0.00000098 Prior(A/A) = 0.00034

Posterior(A/A) = <.001

P(reads | A/C) = 0.03125

Prior(A/C) = 0.00066

Posterior(A/C) = 0.175

P(reads | C/C) = 0.000097

Prior(C/C) = 0.99900

Posterior(C/C) = 0.825

Individual Based Prior: Every site has 1/1000 probability of varying.

## From Sequence To Genotype: Population Based Prior



TAGCTGATAGCTAGATGAGCCCGAT

ATAGCTAGATAGCTGATGAGCCCGATCGCTGCTAGCTC

ATGCTAGCTGATAGCTAGCTGATGAGCC

AGCTGATAGCTAGCTGATGAGCCCGATCGCTG

GCTAGCTGATAGCTAG CTAGCTGATGAGCCCGA

Sequence Reads

5'-ACTGGTCGATGCTAGCTGATAGCTAGCTAGCTGATGAGCCCGATCGCTGCTAGCTCGACG-3'

Reference Genome

P(reads | A/A) = 0.00000098 Prior(A/A) = 0.04

Posterior(A/A) = <.001

P(reads | A/C) = 0.03125 Pri

Prior(A/C) = 0.32

Posterior(A/C) = 0.999

**P(reads | C/C)=** 0.000097

Prior(C/C) = 0.64

Posterior(C/C) = <.001

**Population Based Prior:** Use frequency information from examining others at the same site. In the example above, we estimated P(A) = 0.20

#### More on Prior

#### Population Based Prior

- Uses frequency information obtained from examining other individuals
- Calling very rare polymorphisms still requires 20-30x coverage of the genome
- Calling common polymorphisms requires much less data