

### **Consensus & Variant Calling**

Dr. David Bibby, Genomics and Clinical Virology, 5<sup>th</sup> March 2025

### **Overview**

### **Consensus & Variant – what are they?**

How to build a consensus and define variants.

#### What can be done with variant analysis - examples

Features: Drug resistance, epitopes, species/strain identification

Phyletics: Linkage, Dual infections, Transmission, Quasispecies reconstruction

#### **Technical pitfalls - examples**

Virus – Laboratory – Bioinformatics

#### Validation, validation

- Reproducibility
- Standardised materials
- EQA schemes
- Clinical validation?

### **Consensus and Variant**

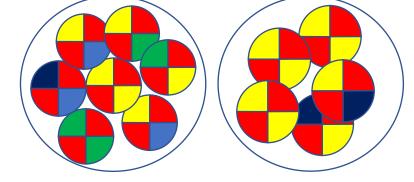
**Consensus**: "The sequence of the most frequent nucleotides at each position"

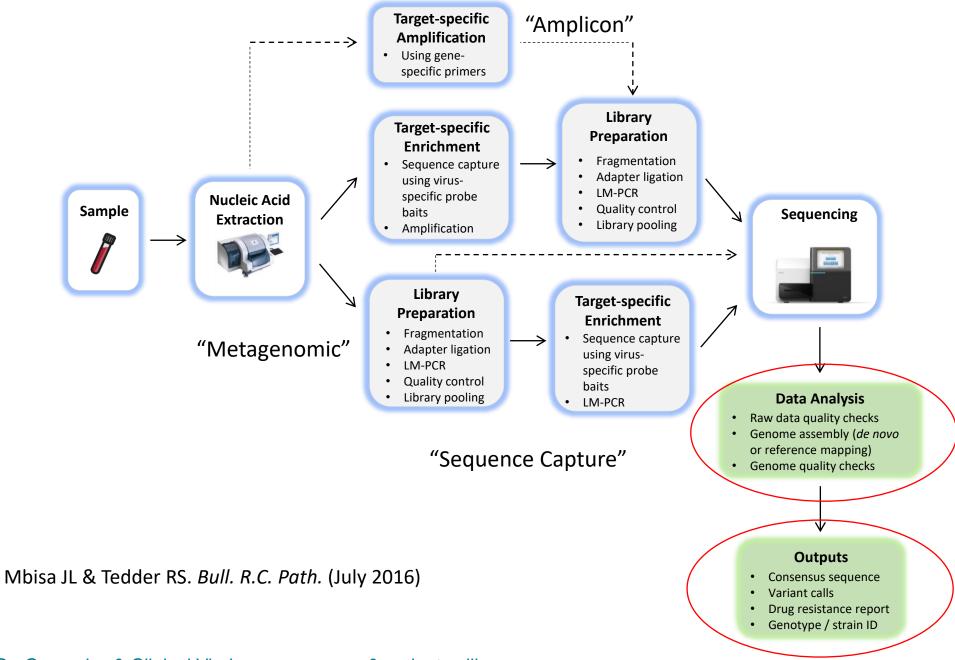
**Variants**: "Differences between a test sequence and a reference"

Viruses often exist in populations of related sequences, i.e. 'quasi-species'

 A consensus of a viral sequence may often contain mixed bases, incorporating the variants above a set frequency

• e.g. 15-20% to mimic Sanger detection





### How to build a consensus

### Sequencer output:

- Giant file containing all sequences from all samples (and controls)
- Each read has an adapter sequence added during the sample library prep
- These enable the reads to be 'binned' according to sample ID

#### The bins are FASTQ files

- Paired end Forward and Reverse (often R1 & R2 files)
- Adapters usually trimmed before further analysis

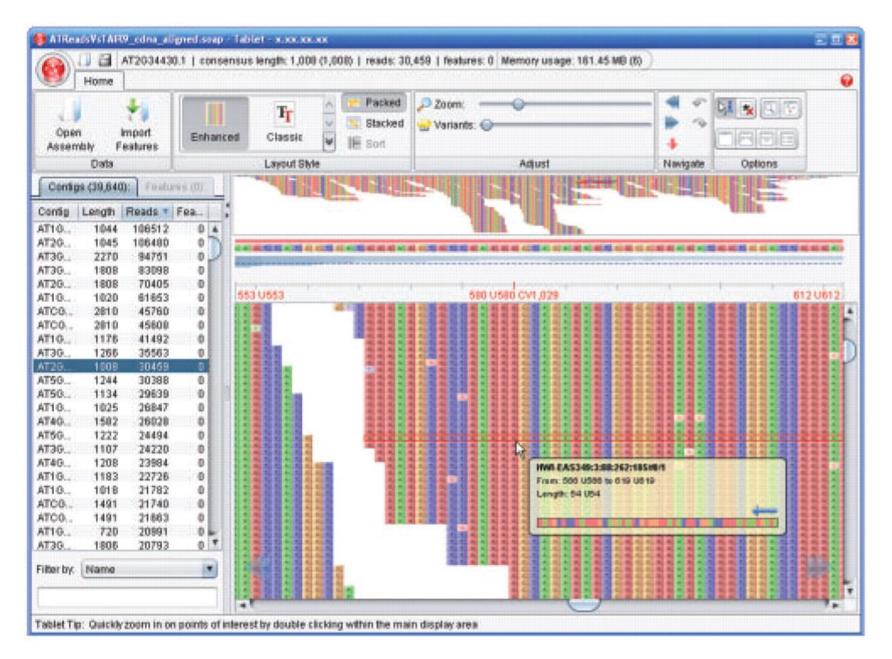
Reads are e.g. Reference Mapped → SAM file

```
bwa mem my_virus_ref.fasta sample1_R1.fastq sample1_R2.fastq > sample1.sam
```

SAM files are converted to BAM files

```
samtools view -Sbhu sample1.sam | samtools sort > sample1.bam
samtools index sample1.bam
```

These can be viewed in Tablet / Genious / IGV etc.

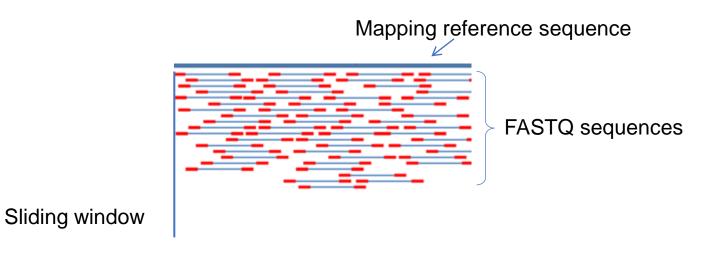


### How to build a consensus

Several tools are available to derive consensus sequences from a SAM/BAM file:

mpileup
V-Phaser
QuasiBAM

Slide along the sequence, interrogating all reads covering each position



### How to build a consensus

### **Considerations**

- Quality of bases within a read
  - Phred score exclusion thresholds (usually 30, sometimes 20)
- Quality of the read mapping
  - Map Quality exclusion thresholds
    - i.e. where the degree of homology to the reference sequence is low
    - Are these contaminants or rare sequence motif(s)?
- Handling of insertions / deletions / variants

Can be <u>very</u> dependent upon choice of mapping software lts parameters, and/or reference sequence

## Variant calling – mpileup

### mpileup (samtools) <a href="http://www.htslib.org/doc/samtools.html">http://www.htslib.org/doc/samtools.html</a>

- 1. Iterates through each position in a reference (i.e. one row per position)
- 2. Iterates through each read covering that position and adds a match type symbol...
  - . , Match to reference (forward & reverse respectively)
  - ^ \$ Start and finish of a read respectively

ACGTN, acgtn Mismatch to reference (fwd & rev respectively)

[+-][0-9]+[ACGTNacgtn]+ Insertions / deletions

3. ...and a Quality symbol (Phred Score)

# Variant calling – mpileup

apprize.info

# Variant calling – VCF

### VCF "Variant Call Format"

### http://vcftools.sourceforge.net

- Developed for human genome annotations by 1,000 Genomes project
- Useful for sparse variation in long, multi-chromosome genomes
- Lists variations from a reference in a tabular format
  - One row per variant
  - (At least) 8 columns:

CHROM POS ID REF ALT QUAL FILTER INFO

CHROM = Chromosome

POS = Position

REF = Reference

ALT = Alternative (variant)

# Variant calling – VCF

```
##fileformat=VCFv4.1
##fileDate=20140930
##source=23andme2vcf.pl https://github.com/arrogantrobot/23
##reference=file://23andme_v3_hg19_ref.txt.gz
##FORMAT=<ID=GT, Number=1, Type=String, Description="Genotype"
#CHROM POS ID REF ALT QUAL
                                FILTER INFO
                                                FORMAT GEN
        82154
                rs4477212
chr1
                                                GT 0/0
chr1
        752566
                rs3094315
                                                GT 1/1
chr1
        752721
                rs3131972
                                                    1/1
chr1
        798959
                rs11240777
                                                    0/0
chr1
        800007
                rs6681049
                                                GT
                                                    1/1
chr1
        838555
                rs4970383
                                                    0/0
chr1
        846808
                rs4475691
                                                    0/0
                                                GT
chr1
        854250
                rs7537756
                                                GT
                                                    0/0
chr1
        861808
                rs13302982
                                                GT
                                                    1/1
chr1
        873558
                rs1110052
                                                    1/1
                                                GT
chr1
        882033
                rs2272756
                                                    0/1
chr1
        888659
                rs3748597
                                                    1/1
chr1
        891945
                rs13303106 A
                                                GT 0/1
```

genomeintelligence.org

# Variant calling – V-phaser

### V-Phaser & V-Phaser 2

- Developed by the Broad Institute
- Considers read position, strand bias, quality scores, dinucleotide frequency, forward & reverse read, and phasing (linkage)
- Reports variant frequency and absolute read numbers by forward & reverse read
- Similar to VCF, but for viral populations
  - One row per variant
  - Seven columns:

Ref\_Pos Var Cons Strd\_bias\_pval Type Var\_perc SNP\_or\_LP\_Profile

Macalalad AR *et al.* PLoS Computational Biology 8(3):e1002417 Yang X, *et al.* BMC Genomics 2013 14:674

# Variant calling – V-phaser

#Ref_Pos	Var	Cons	Strd_bias_	Туре	Var_perc	SNP_or_L	P_Profile		
<b>‡</b>									
1448	G	С	0.2919	snp	7.477	C:53:46	G:2:6		
1462	Τ	А	1	snp	6.604	A:49:47	G:1:2	T:4:3	
1476	С	Т	1	snp	7.273	A:0:1	C:4:4	T:50:51	
1480	T	С	0.6589	snp	11.21	A:0:1	C:45:47	G:1:1	T:7:5
1481	А	G	1	snp	7.273	A:4:4	C:1:1	G:49:51	
1488	С	T	0.8233	snp	9.91	C:5:6	G:3:0	T:46:51	
1568	T	С	1	snp	7.865	C:37:45	T:4:3		
1872	А	G	1	snp	8.14	A:3:4	G:37:42		
3473	Α	G	1	snp	2.857	A:2:1	G:56:46		
3481	Т	С	1	snp	2.913	C:56:44	T:2:1		
3511	С	Т	1	snp	2.885	C:2:1	T:52:49		
3514	T	С	1	snp	2.83	A:0:1	C:52:50	T:2:1	
3527	Α	Т	1	snp	3.061	A:2:1	T:49:46		
3530	G	Α	1	snp	3.125	A:46:47	G:2:1		
3532	С	Т	1	snp	3.125	C:2:1	T:46:47		
3559	G	С	1	snp	3.75	C:34:43	G:2:1		
3570	С	Α	1.127	snp	4.878	A:35:43	C:2:2		
3574	T	С	1.127	snp	4.762	A:0:1	C:36:43	T:2:2	
3577	С	Т	1.127	snp	4.878	C:2:2	T:37:41		
3592	Т	С	1.127	snp	4.819	C:40:39	T:2:2		
3601	А	G	1	snp	3.614	A:1:2	G:39:41		
3605	С	Α	1	snp	3.704	A:37:41	C:1:2		
3616	G	Α	0.9257	snp	14.29	A:31:35	G:6:5		
6583	Т	С	0.2925	snp	8.654	C:51:44	T:7:2		
6882	Т	А	0.8081	snp	21.21	A:32:46	T:8:13		
6895	G	А	0.7799	snp	39.81	A:24:37	G:17:24	T:0:1	
7150	Т	С	1.004	snp	9.639	C:31:42	G:2:0	T:5:3	
7387	G	А	0.5027	snp	10.71	A:35:40	G:6:3		
9176	А	G	0.7282	snp	24.29	A:5:12	G:18:35		
‡									
summar	LPV: 0								

# Variant calling – QuasiBAM

- QuasiBAM (UKHSA)
- Produces a table of nucleotide & codon frequencies for an entire reference
- One row per nucleotide position, i.e. more like mpileup
- 14 Columns:

```
    1-3 Position, Reference nucleotide, Depth
    4-9 A / C / G / T / Gap / Insertion frequencies
    10 Insertion sequences and their frequencies
    11-12 Reference Amino Acid, Depth
    13-14 Codon / Amino Acid frequencies
```

- Can be parameterized
  - Strandedness
  - Gap-masking
  - Primer-mediated error filtering

# Variant calling – QuasiBAM

Pos	Ref_N	Depth	Α	С	G	T	Gap	Ins	I_Desc	Ref_AA	AA_depth	Cod	AA
4492	С	23097	0	99.753	0	0	0			Р	22244	CCC:21813:98.062 CCT:295:1.326	P:22120:99.443
4493	С	23048	0	99.683	0	0	0			P	22465	CCT:22064:98.215 CTT:302:1.344	P:22081:98.291 L:302:1.344
4494	С	23623	0	98.650	0	1.300	0			L	22991	CTG:22574:98.186 TTG:306:1.331	L:22963:99.878
4495	T	23607	0	0	0	99.924	0			С	22904	TGC:22744:99.301	C:22796:99.528
4496	G	23547	0	0	99.643	0	0			Α	22876	GCT:22701:99.235	A:22729:99.357
4497	С	23323	0	99.734	0	0	0			L	22800	CTT:22587:99.066	L:22708:99.596
4498	Т	23511	0	0	0	99.860	0			L	22928	TTA:22635:98.722	L:22671:98.879
4499	T	23515	0	0	0	99.468	0			*	22688	TAA:19 <del>794:87.244</del> TAG:2636:11.618	*:22442: <del>98.916</del>
4500	Α	23389	99.376	0	0	0	0			K	22584	AAG:19401:85.906 AGG:2630:11.645 AA-:278:1.231	K:19526:86.459 R:2637:11.676 X:395:1.749
4501	Α	23320	87.414	0	12.543	0	0			R	22621	AGG:19329:85.447 GGG:2820:12.466 A-G:269:1.189	R:19369:85.624 G:2824:12.484 X:275:1.216
4502	G	24246	0	0	98.189	0	(1.192	)		G	23482	GGG:22955:97.756 -GG:276:1.175	G:22998:97.939 X:281:1.197
4503	G	24131	0	0	99.731	0	0			G	23371	GGG:23209:99.307	G:23264:99.542
4504	G	24352	0	0	99.782	0	0			G	23454	GGG:23275:99.237	G:23339:99.51
4505	G	24122	0	0	99.718	0	0			G	23214	GGG:22957:98.893	G:23083:99.436
<b>4506</b>	G	24106	0	0	99.722	0	0			G	22025	GGA:21713:98.583	G:21853:99.219
4507	G	23894	0	0	99.456	0	0			E	21459	GAA:21207:98.826	E:21208:98.83
1508	Α	22601	99.345	0	0	0	0			K	21422	AAG:21237:99.136	K:21261:99.248
4509	Α	22591	99.708	0	0	0	0			R	21844	AGG:17994:82.375 AGA:3758:17.204	R:21762:99.625
4510	G	22841		0	99.764	0	0			G	21640	GGC:17818:82.338 GAC:3733:17.25	G:17845:82.463 D:3736:17.264
4511	G	22795	17.043	0	82.843	0	0			Α	21368	GCA:17613:82.427 ACA:3698:17.306	A:17618:82.45 T:3698:17.306
4512	С	22402	0	99.853	0	0	0			н	21443	CAC:21350:99.566	H:21399:99.795
4513	Α	22367	99.978	0	0	0	0			Т	21502	ACC:21381:99.437	T:21443:99.726
1514	С	22774	0	99.750	0	0	0			P	21968	CCT:21806:99.263	P:21851:99.467
4515	С	22582	0	99.703	0	0	0			L	21981	CTC:21824:99.286	L:21871:99.5
<del>1</del> 516	T	22841	0	0	0	99.781	0			S	22318	TCA:22131:99.162	S:22220:99.561
4517	С	22753	0	99.780	0	0	0			н	21775	CAT:21427:98.402	H:21430:98.416
4518	Α	22928	99.603	0	0	0	0 (	1.396	T:320:1.396	) [	21820	ATT:21364:97.91	I:21521:98.63
4519	Т	22553	0	0	0	99.056	0			F	22155	TTT:21779:98.303	F:21786:98.334
4520	Т	22721	0	0	0	99.080	0			F	22039	TTT:21816:98.988	F:21829:99.047
4521	Т	22804	0	0	0	99.961	0			F	22041	TTT:21893:99.329	F:22011:99.864
4522	Т	22430	0	0	0	99.911	0			F	21689	TTT:21545:99.336	F:21547:99.345
4523	Т	22551	0	0	0	99.463	0			L	21655	TTG:21466:99.127	L:21636:99.912
4524	Т	22159	0	0	0	99.973	0			С	21555	TGC:21400:99.281	C:21480:99.652

## **Uses of variant analysis**

### **Features**

- Typing
- Resistance
- Epitopes

### **Quasispecies reconstruction**

- Linkage
- Dual infections
- Transmission

### **Uses of variant analysis - Features**

Here, the consensus can be submitted to 'conventional' tools for interpretation









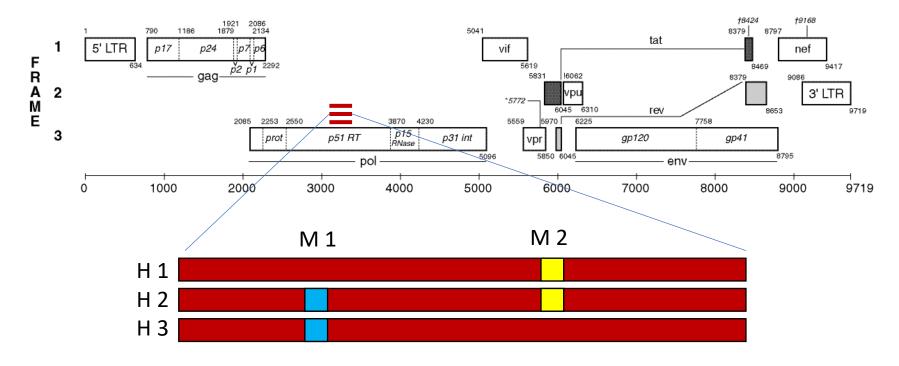


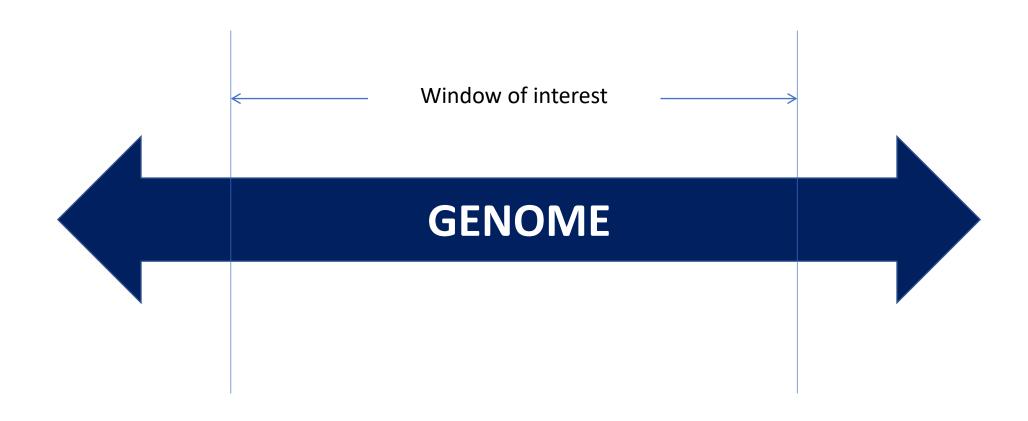
 Use the variant calling tool(s) to produce consensuses at different mixed-base thresholds to interrogate minority variants.

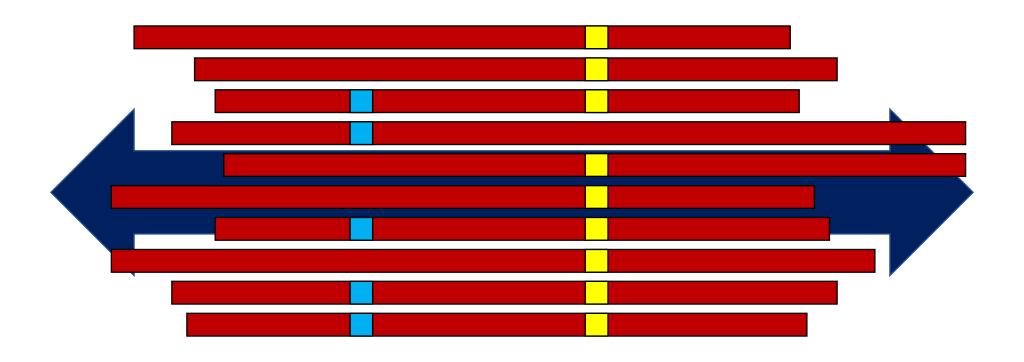
Stanford (HIV) and geno2pheno (HCV) can already take nucleotide frequency files

Validation, validation

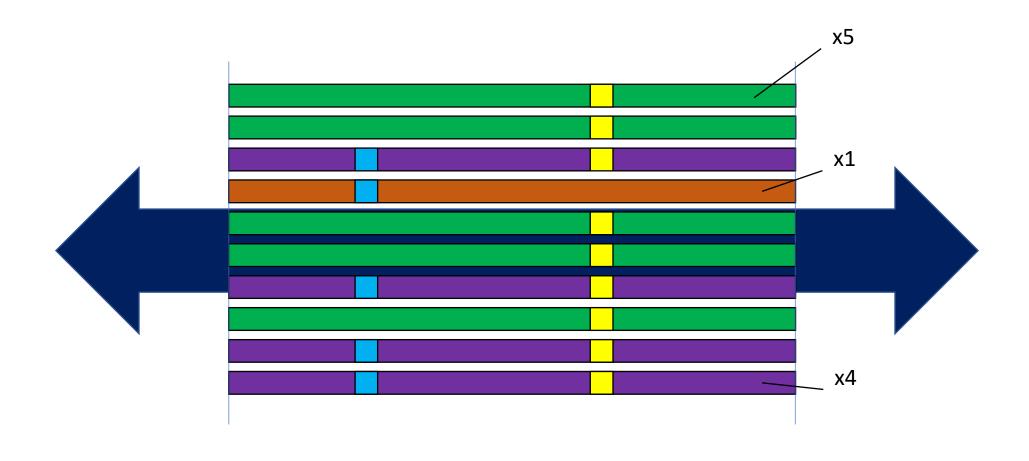
- Each read derives from an individual virus genome molecule
- Linkage of variants on reads enables binning of haplotypes
- Examine all reads that map across a short, specified region of the genome:











Local data can be expanded to generate longer haplotypes

Haploclique <a href="https://github.com/cbg-ethz/haploclique">https://github.com/cbg-ethz/haploclique</a>

QuasiRecomb <a href="https://github.com/cbg-ethz/QuasiRecomb">https://github.com/cbg-ethz/QuasiRecomb</a>

QuRe <a href="https://sourceforge.net/projects/qure">https://sourceforge.net/projects/qure</a>

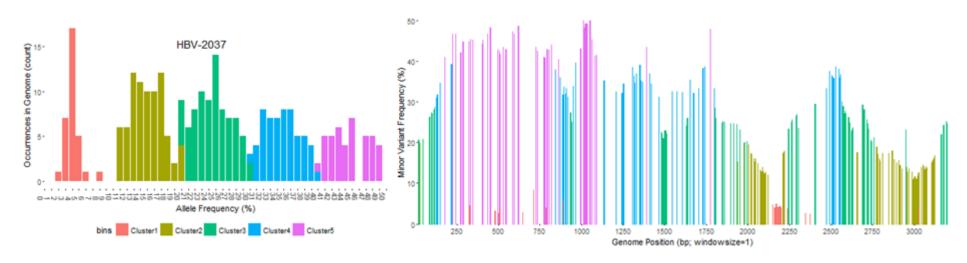
PredictHaplo <a href="http://bmda.cs.unibas.ch/software.html">http://bmda.cs.unibas.ch/software.html</a>

### Efficiency of reconstruction is "varied"!

Beerenwinkel N et al. Front Microbiol. 2012 3:329

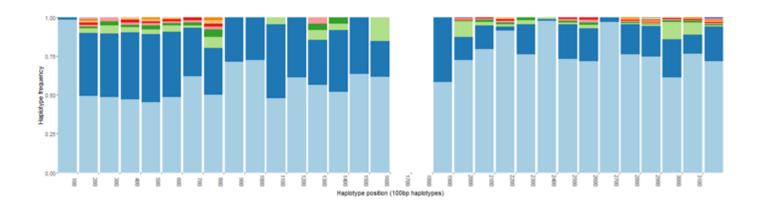
Prosperi MCF et al. Sci Rep. 2013 3:2837

Correlate mutation frequencies across the genome



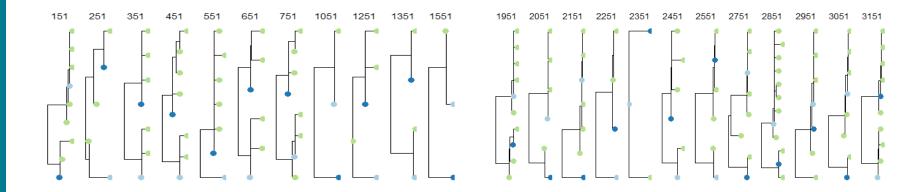
Mathew Beale

Correlate mutation frequencies across the genome

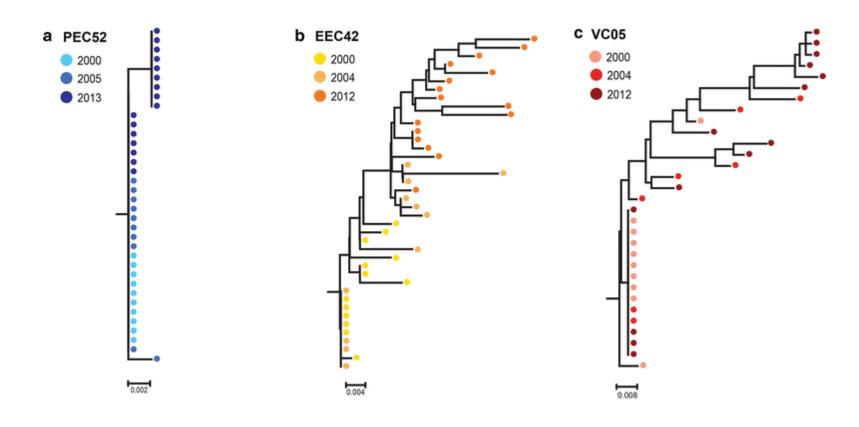


Mathew Beale

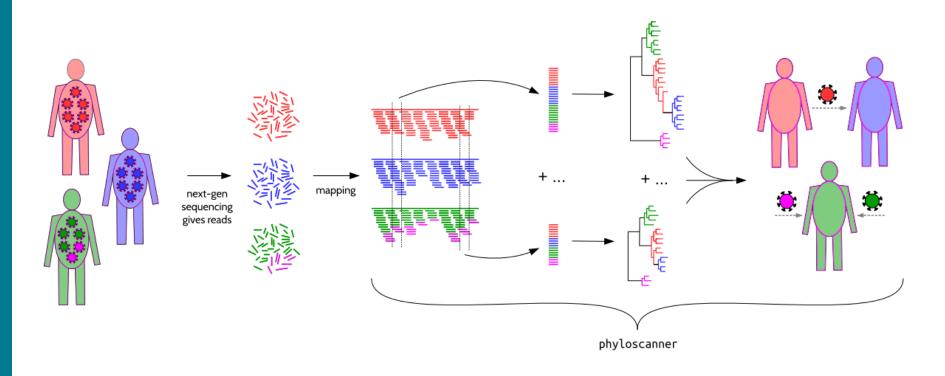
Correlate mutation frequencies across the genome



Mathew Beale

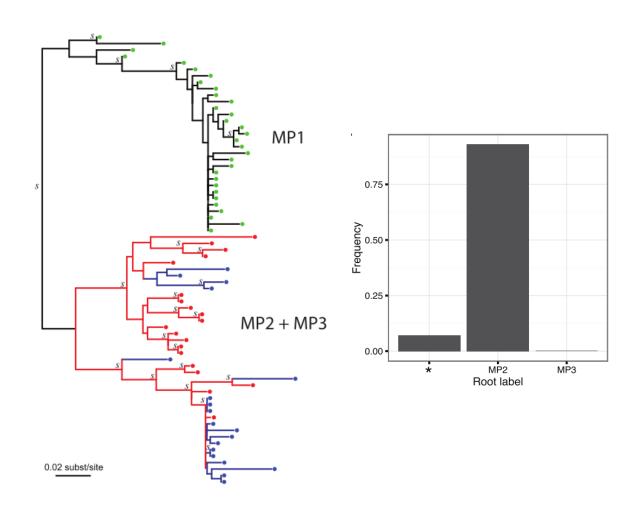


de Azevedo SSD et al. Retrovirology 2017 14:29

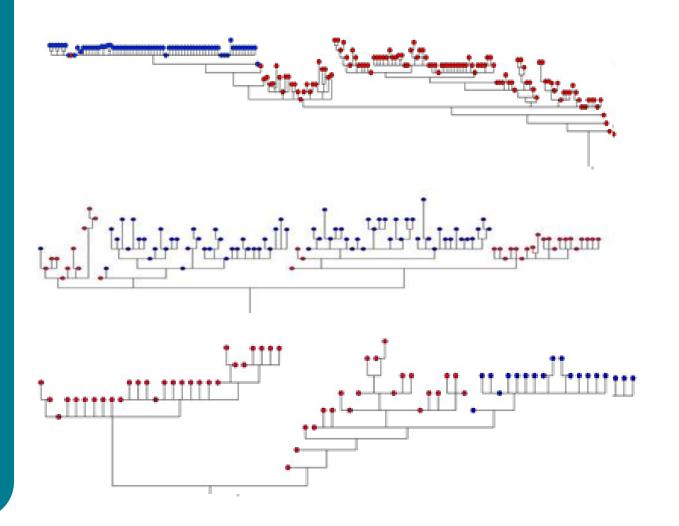


Wymant C et al. Mol Biol Evol 2017

- Three patients MP1, 2 & 3
- Who infected whom?
- MP1 is independent from the cluster
- MP2 (red) → MP3 (blue)?
- Or vice versa?

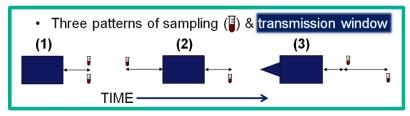


Romero-Severson EO et al. Genetics 2017 207(3):1089



Transmission						
MSM	х3					
HET	x5					
MtCT	x2					

Subty	Subtype						
В	x5						
С	x2						
G, 01, 02	x1 each						



	A → B		$A \leftarrow B$ $B \rightarrow A$			A?B Transmission &		Expected
Pair	<b>●</b> —②→●	•=•	•==•	<b>○</b> —②→●	•	<b>○</b> <··?}·->●	sampling patter	n result
1			2		8		MSM 1	•
2			3	6		1	HET 2	•
3	10						HET 1	•
4	1	6	1	1		1	HET 3	?
5				5	5		HET 3	?
6	3		5		2		MSM 2	•
7	3		6	1			MSM 2	•
8	4					6	HET 3	?
9			10				MtCT 1	•
10	6	3	1				MtCT 1	•

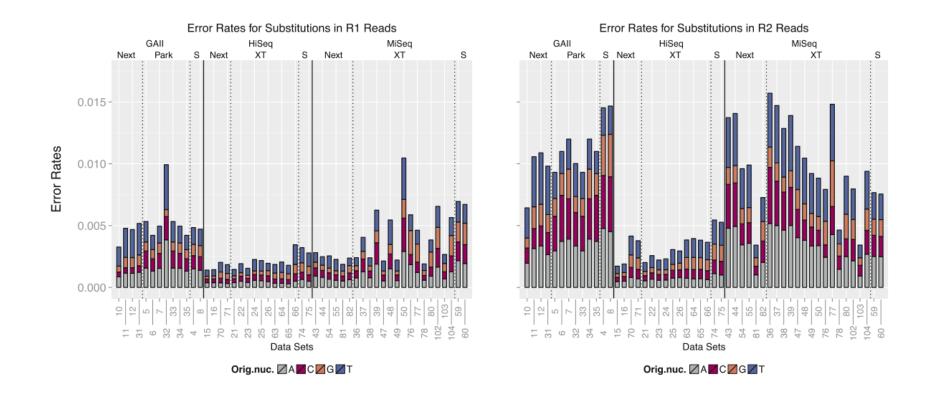
Bibby DF et al. HIV Dynamics & Evolution 2017

## **Technical pitfalls**

Frequency of minor variant detection limited by experimental noise Many sources of error:

- 1. Sequencing
- 2. Amplicon-based sequencing
- 3. Nucleotide content
- 4. Hexamer priming
- 5. Product degradation
- 6. Contamination
- 7. Bioinformatics

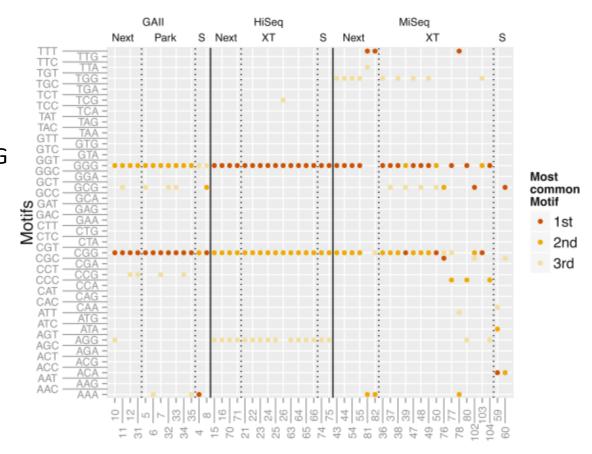
## Technical pitfalls – Sequencing



# Technical pitfalls – Sequencing

### **Substitutions**

xGG motif
GGG = CGG > AGG > TGG

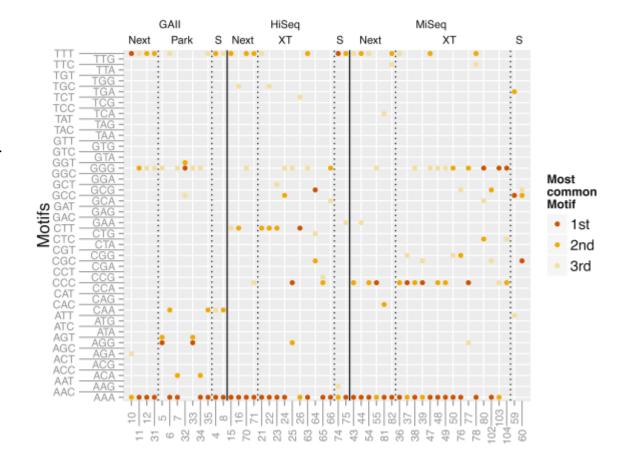


# Technical pitfalls - Sequencing

### <u>Indels</u>

Homopolymeric tracts **AAA** > CCC = GGG = TTT

High Quality Scores



## Technical pitfalls – Amplicons

Table 1. Error rate of *Taq* DNA polymerase.

Amplicon	Substitution rate	Deletion rate	Insertion rate	Total error rate	Total bases
		Sanger (	dideoxy)		,
LacZ-1	1.2 × 10 <sup>-4</sup> (98.8%)	1.6 × 10 <sup>-6</sup> (1.2%)	- (0.0%)	1.3 × 10 <sup>-4</sup>	323,802
		Pacific Bios	ciences RSII		,
LacZ-1	1.7 × 10 <sup>-4</sup> (97.3%)	$4.7 \times 10^{-6} (2.6\%)$	1.8 × 10 <sup>-7</sup> (0.1%)	1.8 × 10 <sup>-4</sup>	35,879,784
LacZ-2	1.7 × 10 <sup>-4</sup> (96.1%)	5.1 × 10 <sup>-6</sup> (2.9%)	1.8 × 10 <sup>-6</sup> (1.0%)	1.8 × 10 <sup>-4</sup>	15,857,446
DNA-1	1.4 × 10 <sup>-4</sup> (97.2%)	$3.9 \times 10^{-6} (2.8\%)$	$1.2 \times 10^{-7} (0.1\%)$	1.4 × 10 <sup>-4</sup>	18,680,811
DNA-2	1.4 × 10 <sup>-4</sup> (97.5%)	$3.4 \times 10^{-6} (2.4\%)$	1.5 × 10 <sup>-7</sup> (0.1%)	1.4 × 10 <sup>-4</sup>	27,978,748

Reported error rates are per base per doubling as detailed in Materials and Methods. Numbers in parentheses are percentages of the total error rate.

Table 6. PCR-meditated recombination rate by *Taq* DNA polymerase.

Template pair	N <sub>re</sub> <sup>a</sup>	N <sub>total</sub> b	Recombination rate <sup>c</sup>
DNA-1:DNA-1x	19,943	77,725,936	9.6 × 10 <sup>-5</sup>
DNA-2:DNA-2x	14,687	44,271,304	1.3 × 10 <sup>-4</sup>

<sup>&</sup>lt;sup>a</sup> Number of recombination events.

Potapov V et al. PLoS One 2017 12(1): e0169774

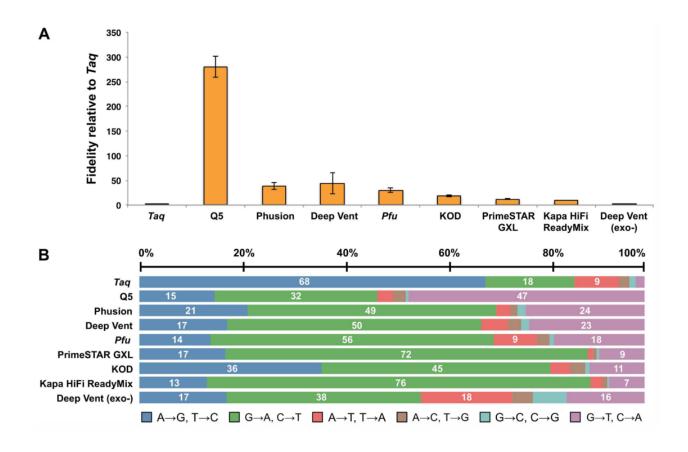
Strands with at least 1 recombination event 23% 28%

1kb, 16x cycles

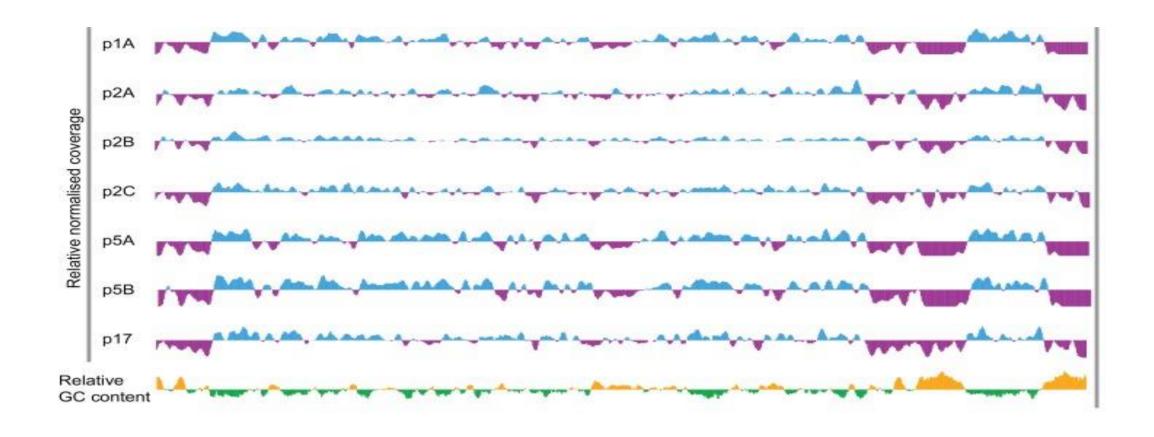
<sup>&</sup>lt;sup>b</sup> Total number of analyzed sequenced bases.

<sup>&</sup>lt;sup>c</sup> Recombination rate is per base per doubling. Recombination rate is doubled to account for "cryptic" recombination events.

### Technical pitfalls – Amplicons

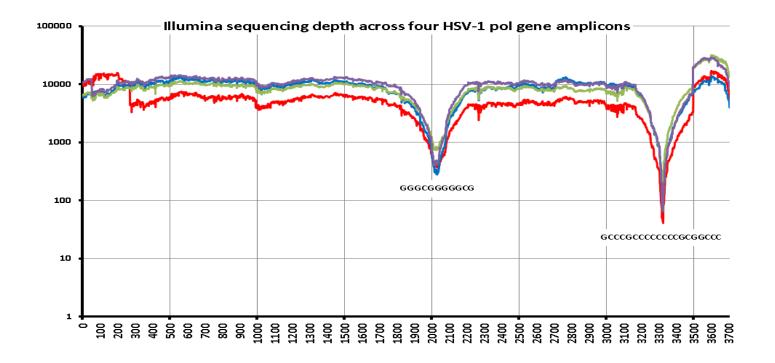


### Technical pitfalls – Nucleotide content

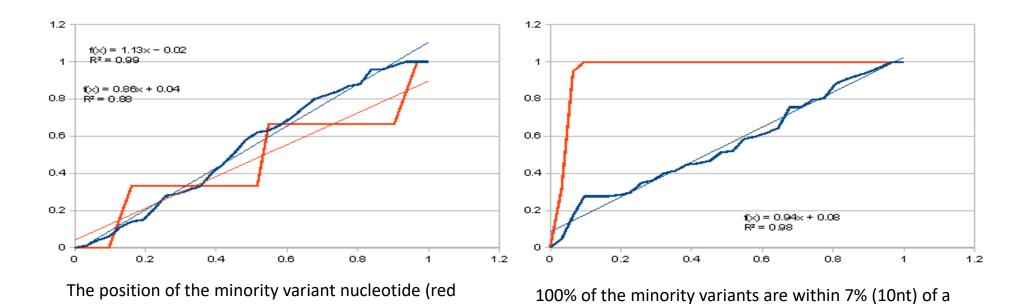


Karamitros T et al. PLoS One 2016 11(6):e0157600

### Technical pitfalls – Nucleotide content



## Technical pitfalls – Hexamer priming



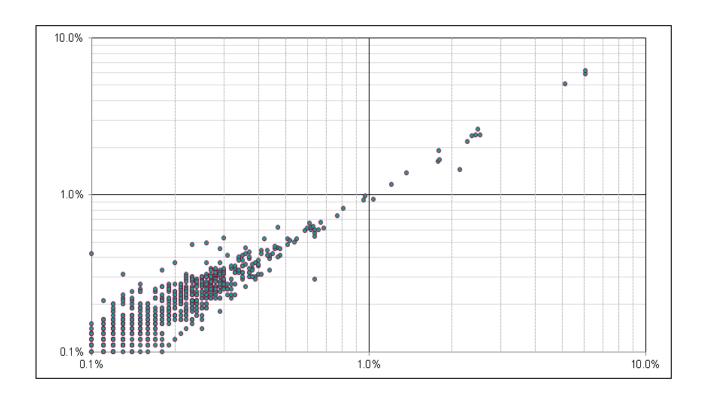
read terminus – artefact from insert-priming

**UKHSA** (unpublished)

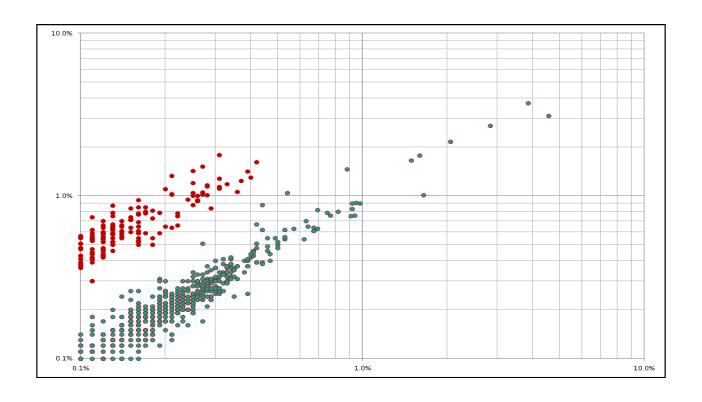
line) is evenly distributed along the read lengths

(as is the majority variant in blue)

## Technical pitfalls – Product degradation



### Technical pitfalls – Product degradation

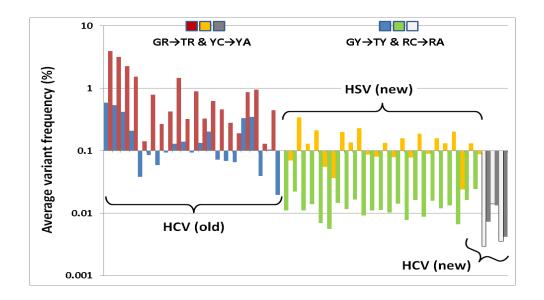


# Technical pitfalls – Product degradation

Much investigation revealed context-specific conversion of dinucleotides

$$YC \rightarrow YA$$
 $GR \rightarrow TR$ 
previously only seen in sonicated fragments – Costello *et al.* NAR 2013

The frequency of converted bases is proportional to the time spent at 4°C



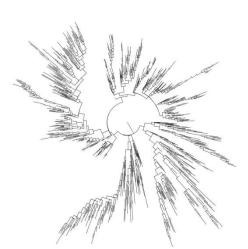
### **Technical pitfalls – Contamination**

### "Sequences not belonging to that sample present in the FASTQ set"

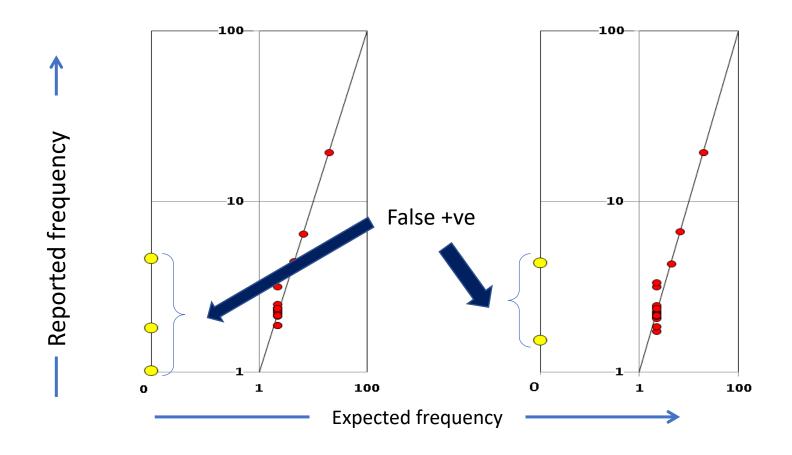
- Index-switching
  - Occurs during library prep / sequencing
- Laboratory contamination
  - Similar to PCR
  - Spatial and temporal separation of work areas
  - Rotation of adapters
  - Robotics
  - Rotation of control positions
  - Alternation of template types

### Technical pitfalls – Bioinformatics

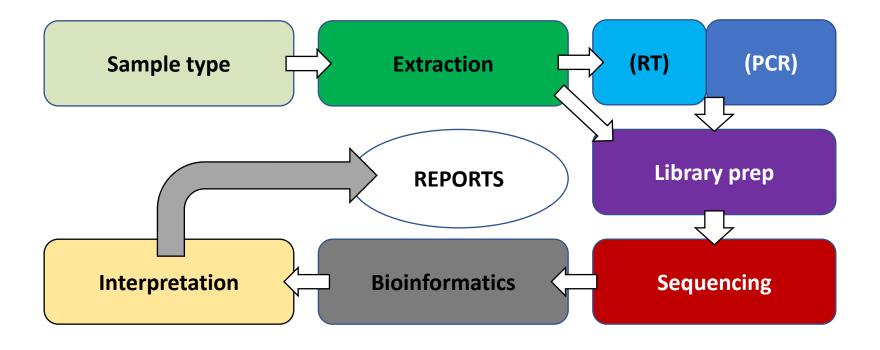
- Synthetic FASTQ datasets
  - HIV quasi-species generation
     Adapted from Pandit A & de Boer R, Retrovirology 2014 11(1):56
  - FASTQ generation using empirical error profiles / quality scores
     ART Huang W, et al. Bioinformatics 2012 28(4):593-4
- Two pre-production pipelines tested



### **Technical pitfalls – Bioinformatics**



### **Validation**



### Validation – How low can you go?

- For HIV & HCV, Sanger at 15-20% == resistant
  - What does 10% mean?
  - 5%?
- Reproducibility, repeatability, accuracy and precision is critical
  - Validating against Sanger is relatively straightforward, both clinically and technically
  - Validating lower frequencies is quite the opposite
- Clinical utility of lower frequency variants unproven

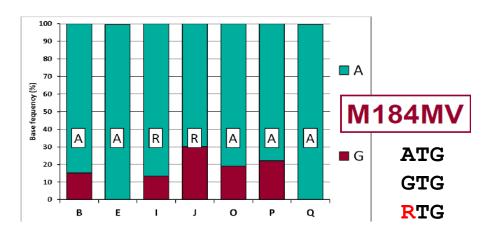
### **Cut-offs vary considerably between assays**

# Validation – Copy number & variant frequency

### How reliable is a variant frequency call?

- When the depth of coverage (i.e. reads covering that position) is high/low?
- What levels constitute 'high' and 'low' depths for PCR, sequence capture and metagenomic approaches?

Sample: A Domain: PR/RT Position: 847 Consensus: R



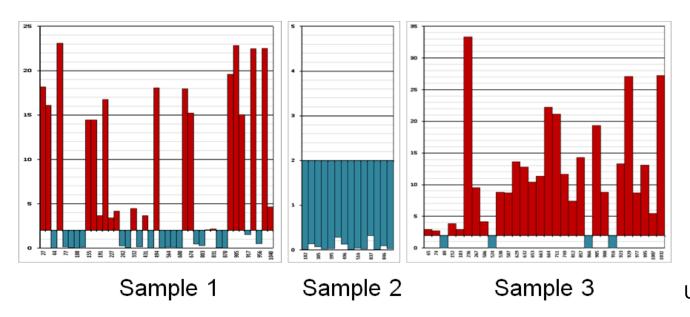
# Validation – Copy number & variant frequency

### How reliable is a variant frequency call?

When the depth of coverage (i.e. reads covering that position) is high/low?

What levels constitute 'high' and 'low' depths for PCR, sequence capture and metagenomic

approaches?



# Validation – Copy number & variant frequency

### How reliable is a variant frequency call?

- PCR produces large amounts of material
- How representative of the starting population is the amplicon mix?
  - Depth is not correlated with reliability!
- If the starting virus copy number is 100,000 copies per library, 10% = 10,000
  - But at 1,000 copies, how reliable is 5% (50 viruses)?
  - Reverse transcription (to generate cDNA) is notoriously inefficient and error-prone how many viruses are represented?
  - There are multiple PCR cycles in the library prep too...
- Often, the amount of starting material / viral load is unknown

### Validation – Standardised materials



**Sample** – haplotypes mixed at precise frequencies (e.g. 1, 2, 5, 10 & 20%)



**DNA / RNA extract** 



**PCR** product



**Library** – storage issues



**FASTQ datasets** - artificial quasispecies and synthetic FASTQs



**Consensus sequences** – to test interpretation mechanisms

## Summary

#### **Consensus & variant calling**

- Many tools for mapping (BWA, Bowtie, smalt, Tanoti)
- Several tools for variant calling (QuasiBAM, V-Phaser)

Choice of reference & user-defined parameters is CRITICAL

#### **Using the consensus**

- Submit to usual tools
- Different mixed-base thresholds to incorporate minority variants

**BEWARE – Interpretations may not be validated on NGS-derived data...** 

Phyletic analysis is coming

# Summary

#### **Technical pitfalls**

- Experimental approach influences the result in unpredictable ways
  - Low-frequency variation can arise through diverse processes
- Reproducibility experiments are essential
  - Across a range of conditions and samples

### **Validation**

#### **ESSENTIAL** – especially when detecting 'new' data, e.g. <20% minority

- All components of the assay need independent investigation
- Look at <u>all</u> the <u>data</u>
- ESPECIALLY THE BIOINFORMATICS!