

## K-mer Analyses, Contamination Detection, And Mapping Based Analyses



- What is a k-mer?
  - A k-mer is a sequence of nucleotides of length k.
  - Examples of a 6-mer
    - ACGTCT
    - TGACTA
    - GATCCC
- A read of length L has  $L-k+1$  k-mers.

1 read:

100 bp



Kmers:

$k=21\text{bp}$

$$N = (L - k + 1)$$

$$(100\text{bp} - 21\text{ bp} + 1)$$

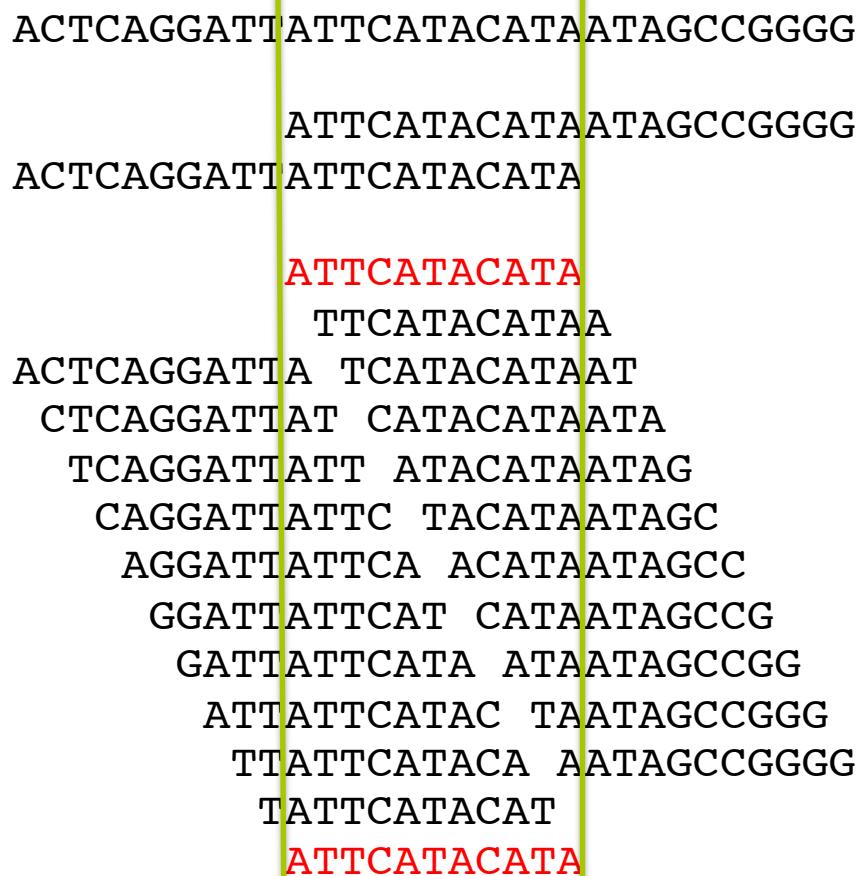
80



.....



# K-mer Analysis



ACTCAGGATT ATT CATA CATA ATAGCCGGGG  
ATT CATA CATA ATAGCCGGGG  
ACTCAGGATT ATT CATA CATA  
**ATT CATA CATA**  
TTCATA CATA AA  
ACTCAGGATT A TCATA CATA AT  
CTCAGGATT AT CATA CATA ATA  
TCAGGATT ATT ATACATA ATAG  
CAGGATT ATT C TACATA ATAGC  
AGGATT ATT CA ACATA ATAGCC  
GGATT ATT CAT CATA ATAGCCG  
GATT ATT CATA ATA ATAGCCGG  
ATT ATT CATA C TAATAGCCGGG  
TT ATT CATA CA AATAGCCGGGG  
TATT CATA C AT  
**ATT CATA CATA**

- The sequence has 21 distinct 11-mers.
- The reads have 21 distinct 11-mers even though 22 11-mers are generated.
- The frequency of a distinct k-mer increases where reads overlap

# K-mer Analysis

ACTCAGGATTATTCATACATAATAGCCGGGG  
ATTCATACATAATAGCCGGGG  
ACTCAGGATTATTCATACATA  
GGATTATTCATACATAATAGC  
  
ATTCATACATA  
TTCATACATAAA  
ACTCAGGATTA TCATACATAAT  
CTCAGGATTAT CATACTATAATA  
TCAGGATTATT ATACATAATAG  
CAGGATTATTC TACATAATAGC  
AGGATTATTCA ACATAATAGCC  
GGATTATTCAT CATAATAGCCG  
GATTATTCTATA ATAATAGCCGG  
ATTATTCTACAC TAATAGCCGGG  
TTATTCTACACA AATAGCCGGGG  
TATTCTACACAT  
ATTCTACACATA  
  
GGATTATTCTAC  
GATTATTCTATA  
ATTATTCTACAC  
TTATTCTACACA  
TATTCTACACAT  
ATTCTACACATA  
TTCATACATAAA  
TCATACATAAT  
CATACATAATA  
ATACATAATAG  
TACATAATAGC

- The sequence has 21 distinct 11-mers.
- The reads have 21 distinct 11-mers even though 33 11-mers are generated.
- The frequency of a distinct k-mer increases where reads overlap

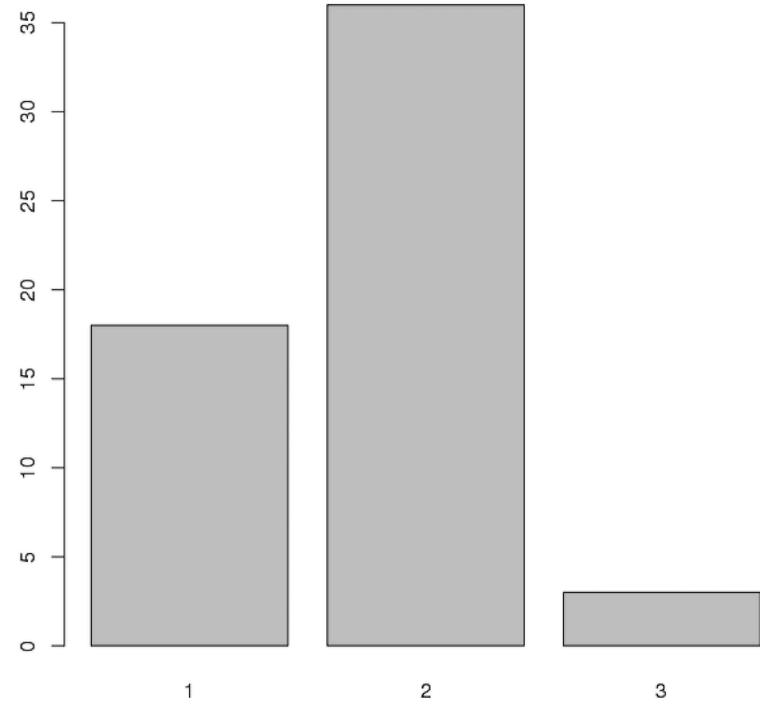
# K-mer Analysis

ACTCAGGATTATTCATACTACATAATAGCCGGGTACATTCATTAAGCGGCATTACGATTACATACGT

ATTCATACATAATAGCCGGGTACATTCATTAAGCGGCATTACGATTACATACGT  
ACTCAGGATTATTCATACTACATAATAGCCGGGTACATTCATTAAGCGGCATTACGATTACATACGT  
GGATTATTCATACTACATAATAGC GGGGTACATTCATTAAGCGG  
ACATAATAGCCGGGTACATT AGCGGCATTACGATTACATA

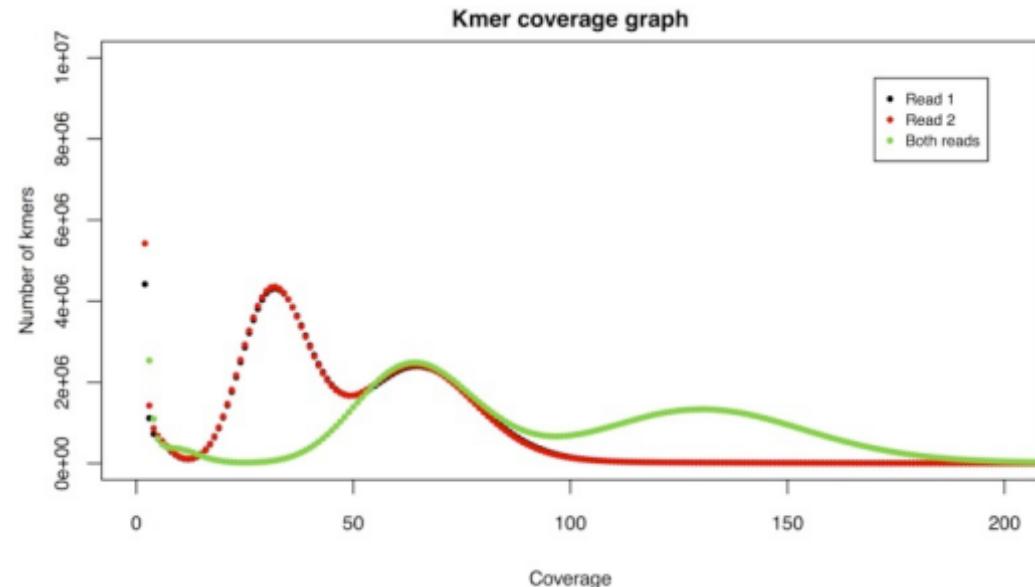
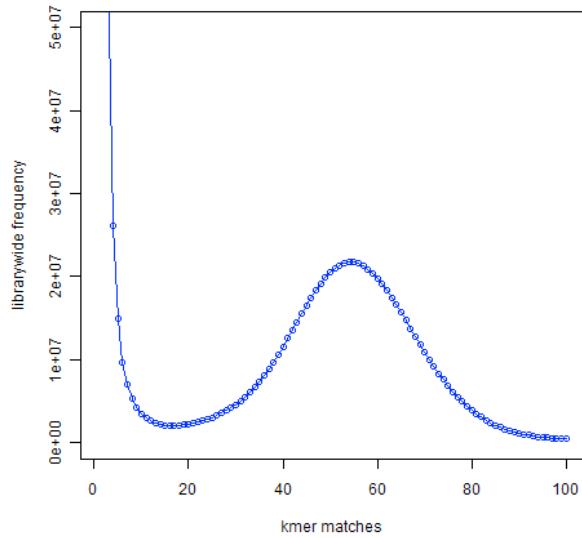
ATTCATACATA  
TTCATACATAA  
ACTCAGGATTATTCATACATAATAGCCGGGTACATTCATTAAGCGGCATTACGATTACATACGT  
CTCAGGATTATTCATACATAATAAGGGGTACATTGGCGATTACGATTACATACGT  
TCAGGATTATTCATACATAATAGGGGTACATTTCGCGATTACGATTACATACGT  
CAGGATTATTCATACATAATAGCCTGGTACATTTCAGCGATTACGATTACATACGT  
AGGATTATTCATACATAATAGCCGTACATTTCAGCGATTACGATTACATACGT  
GGATTATTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
GATTATTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
ATTATTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
TTATTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
TATTCATACATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
ATTTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
GGATTATTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
GATTATTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
ATTATTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
TTATTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
TATTCATACATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
ATTTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
TTCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
TCATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
CATACATAATAAGCCGGTACATTTCAGCGATTACGATTACATACGT  
ATACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
TACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
ACATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
CATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
ATAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
TAATAGCCGGTACATTTCAGCGATTACGATTACATACGT  
AATAGCCGGGTACATTTCAGCGATTACGATTACATACGT  
ATAGCCGGGTACATTTCAGCGATTACGATTACATACGT  
TAGCCGGGTACATTTCAGCGATTACGATTACATACGT  
AGCCGGGTACATTTCAGCGATTACGATTACATACGT  
GCCGGGTACATTTCAGCGATTACGATTACATACGT  
CCGGGTACATTTCAGCGATTACGATTACATACGT  
CGGGGTACATTTCAGCGATTACGATTACATACGT

18 36 3



# What can k-mers tell us?

- Plotting the frequencies of k-mers tells us how complicated our genome is.
  - There are a proportion of distinct k-mers that appear only once in the genome.
  - Distinct k-mers with count f (x-axis) vs Frequency of distinct k-mers with count f (y-axis).



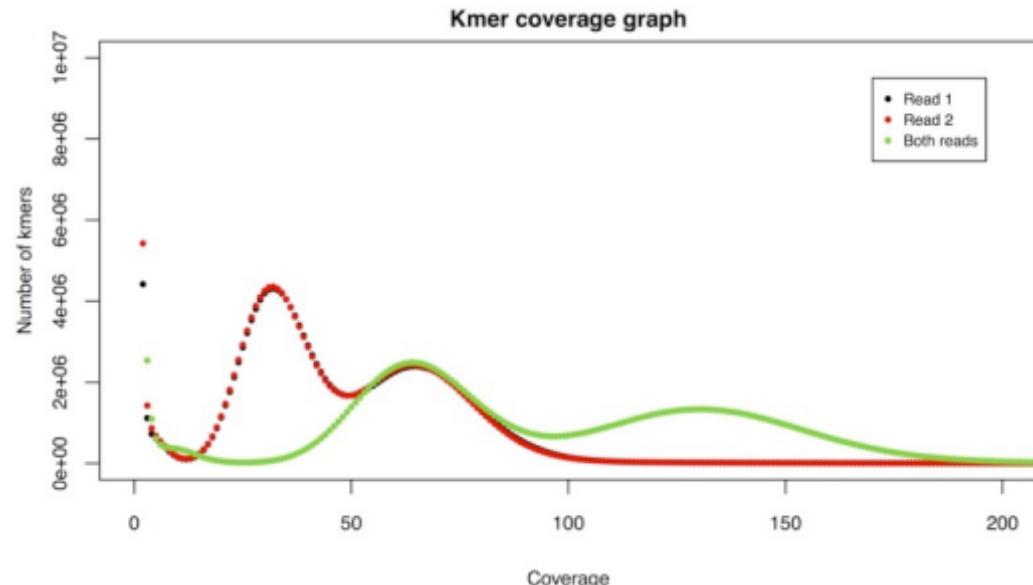
# K-mer Analysis

ACTCAGGATTATTACATACATAATAGCCGGGG  
ACTCCGGATTATTACATACATAATAGCCGGGG

ACTCAGGATTATTACATACATA  
ACTCCGGATTATTACATACATA  
ATTACATACATAATAGCCGGGG  
ATTACATACATAATAGCCGGGG

ATTACATACATA  
TTCATACATAAA  
ACTCAGGATTA TCATACATAAT  
CTCAGGATTAT CATACTACATAATA  
TCAGGATTATT ATACATACATAATAG  
CAGGATTATTTC TACATACATAATAGC  
AGGATTATTCA ACATACATAATAGCC  
GGATTATTTCAT CATACTACATCG  
GATTATTTCATA ATAATAGCCGG  
ATTATTTCATAC TAATAGCCGGGG  
TTATTTCATACA AATAGCCGGGG  
TATTTCATACAT  
ATTACATACATA  
ATTACATACATA  
TTCATACATAAA  
ACTCCGGATTA TCATACATAAT  
CTCCGGATTAT CATACTACATAATA  
TCCGGATTATT ATACATACATAATAG  
CCGGATTATTTC TACATACATAATAGC  
CGGATTATTCA ACATACATAATAGCC  
GGATTATTTCAT CATACTACATCG  
GATTATTTCATA ATAATAGCCGG  
ATTATTTCATAC TAATAGCCGGGG  
TTATTTCATACA AATAGCCGGGG  
TATTTCATACAT  
ATTACATACATA

- Variation generates additional distinct k-mers
- Variants are at half the frequency of the rest of the distinct genome

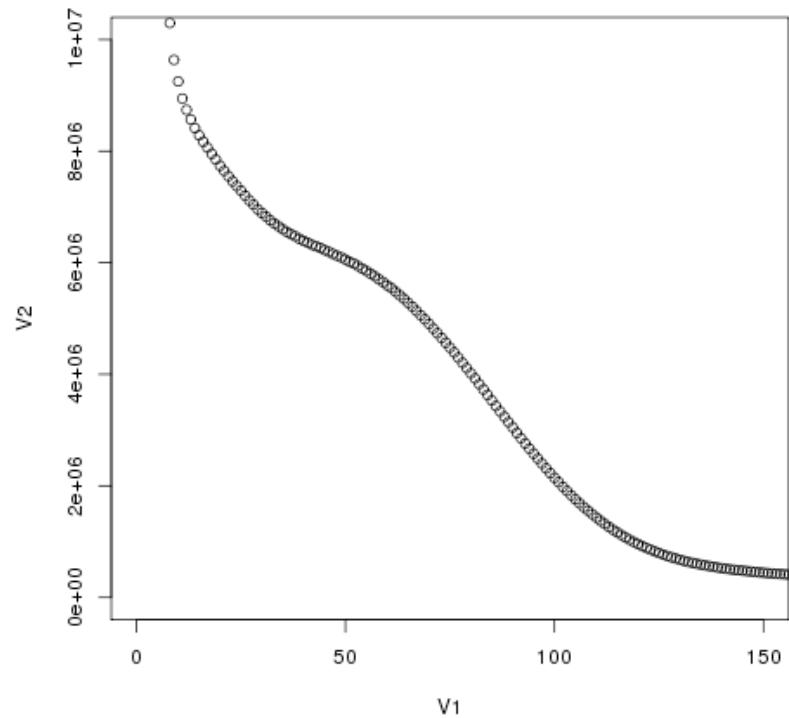
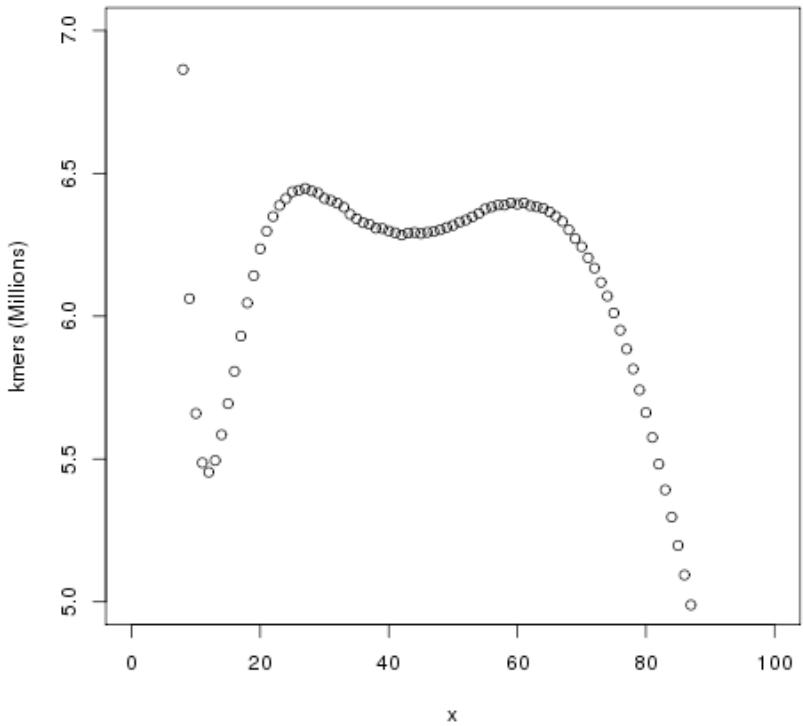


# Estimating Genome size

- We can use coverage to estimate genome size
  - $N = M * L / (L - K + 1)$ 
    - N is Depth of Read Coverage
    - M is mean k-mer coverage
    - L is read length
    - K is k-mer size
  - $G = T / N$ 
    - G is the genome size
    - T is the total number of bases

# Estimating Genome size

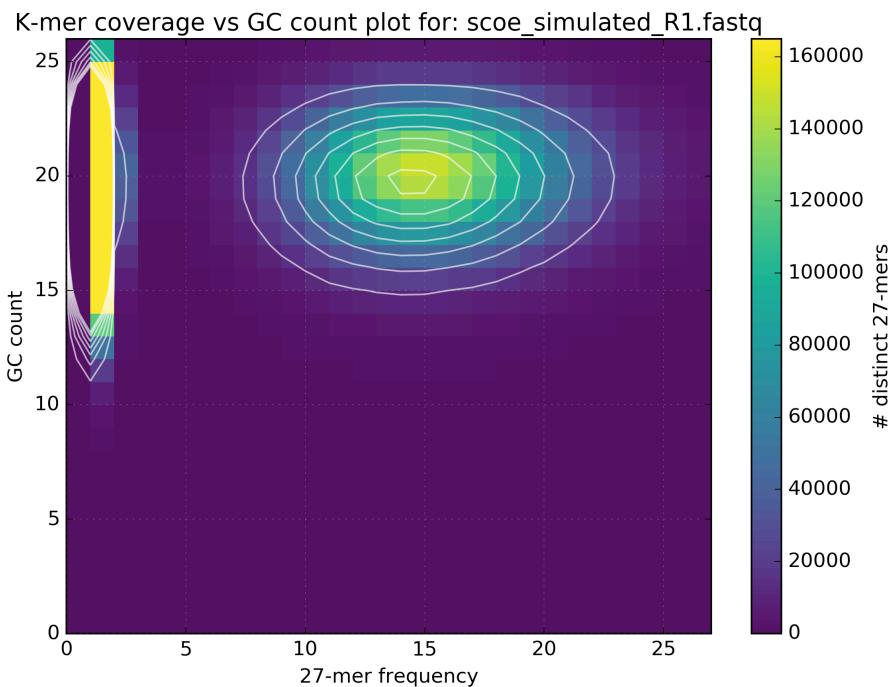
- Not so easy: estimating complexity



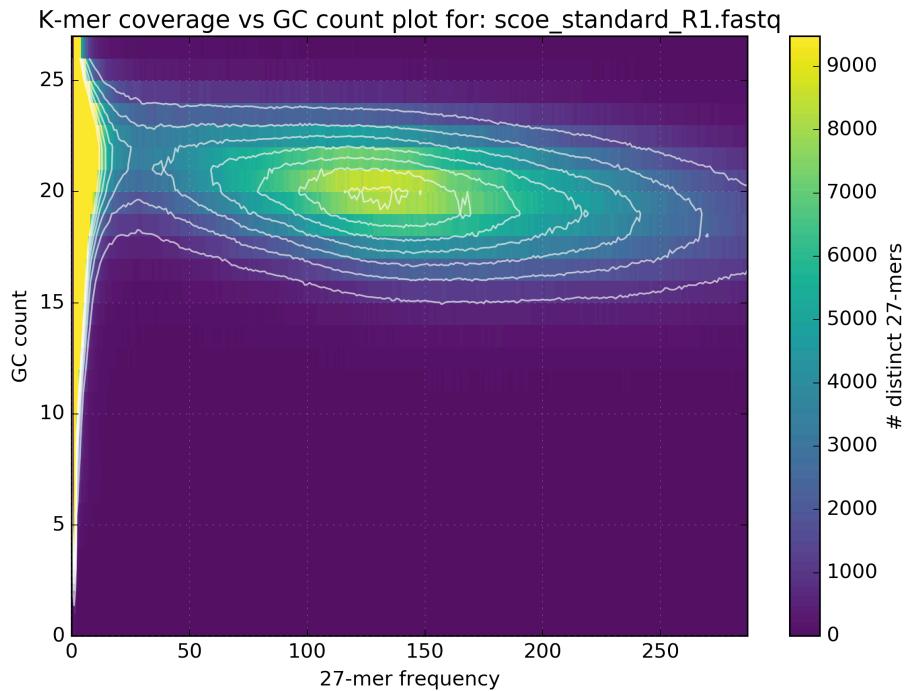
# GC Content in depth

- Monitor GC Bias

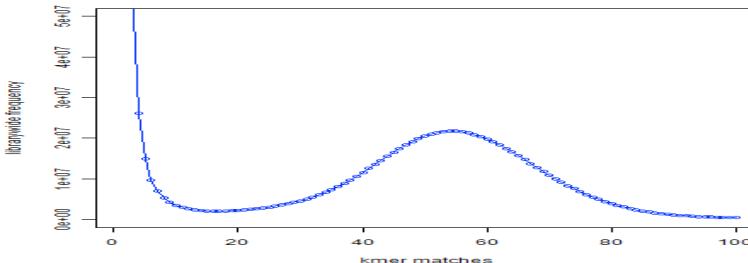
## Simulated data



## GC bias in Standard Illumina protocol

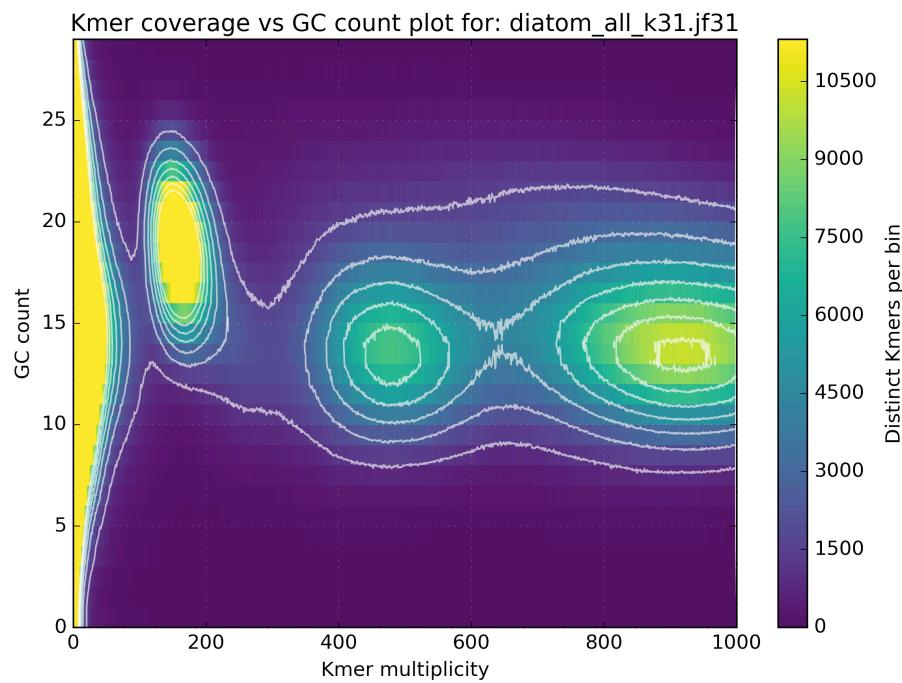
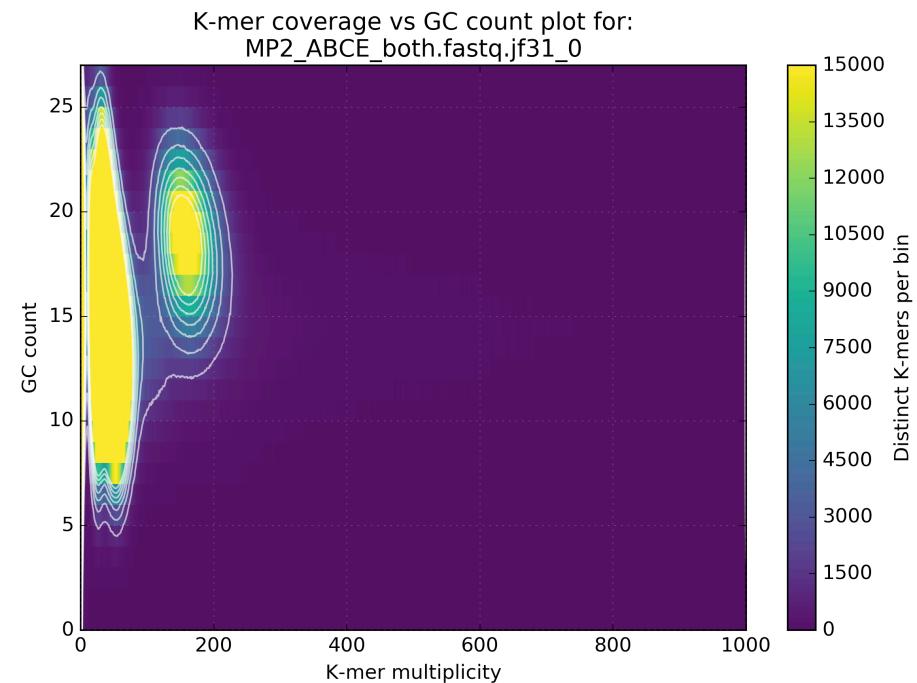


ACTCAGGGATTA    GC=4 Count=1  
AATAGCCGGGG    GC=7 Count=2



# GC Content in depth

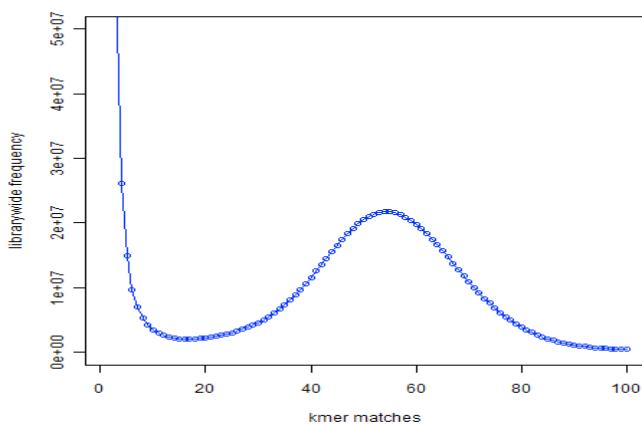
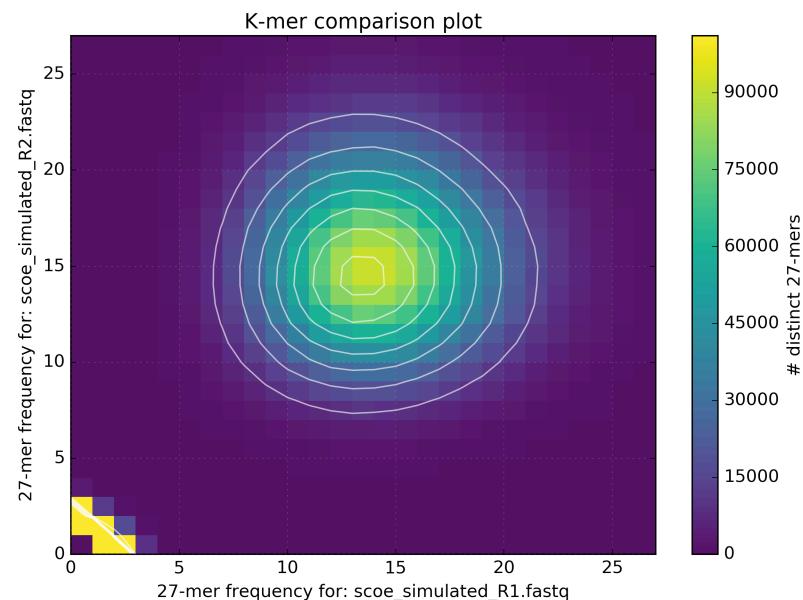
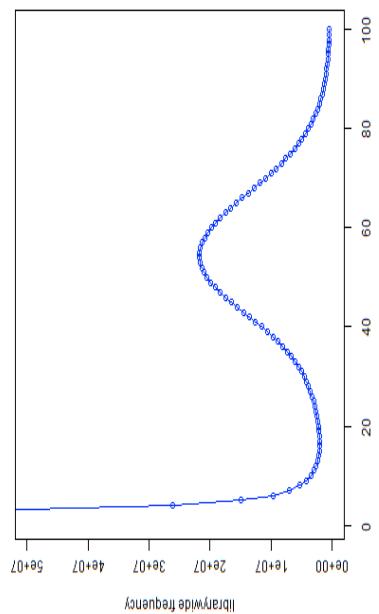
- Uncover contamination
  - Separate bacteria from eukaryote
  - Separate organelle from nuclear genome



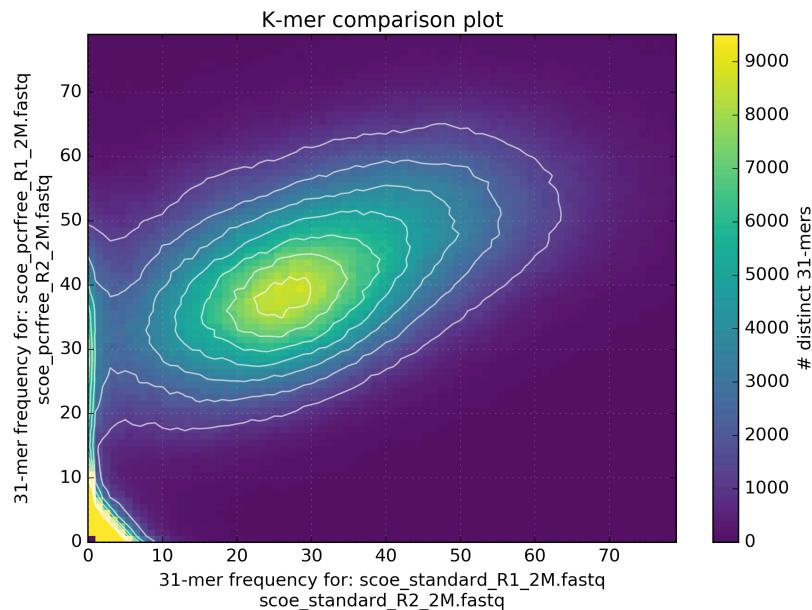
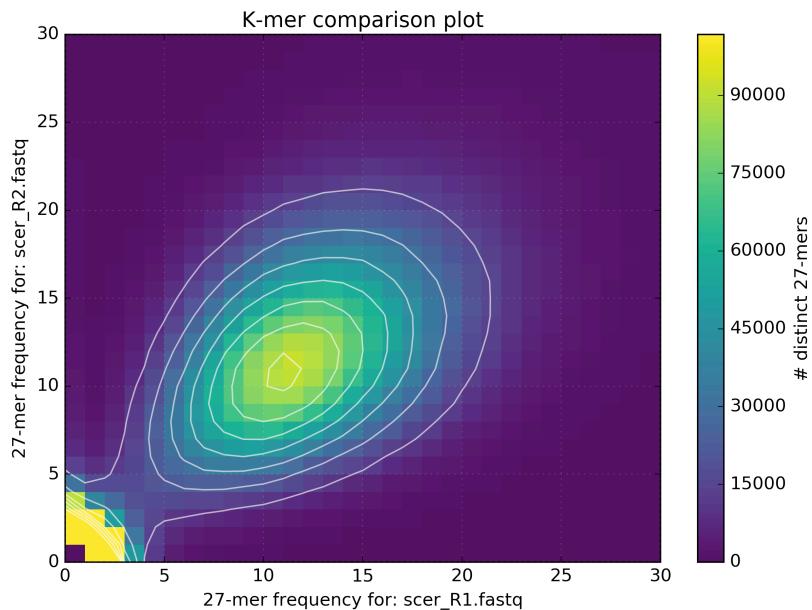
# What can k-mers tell us?

- Comparing k-mer counts between data reveals biases

- R1 vs R2
- Lib1 vs Lib2



# Data comparison

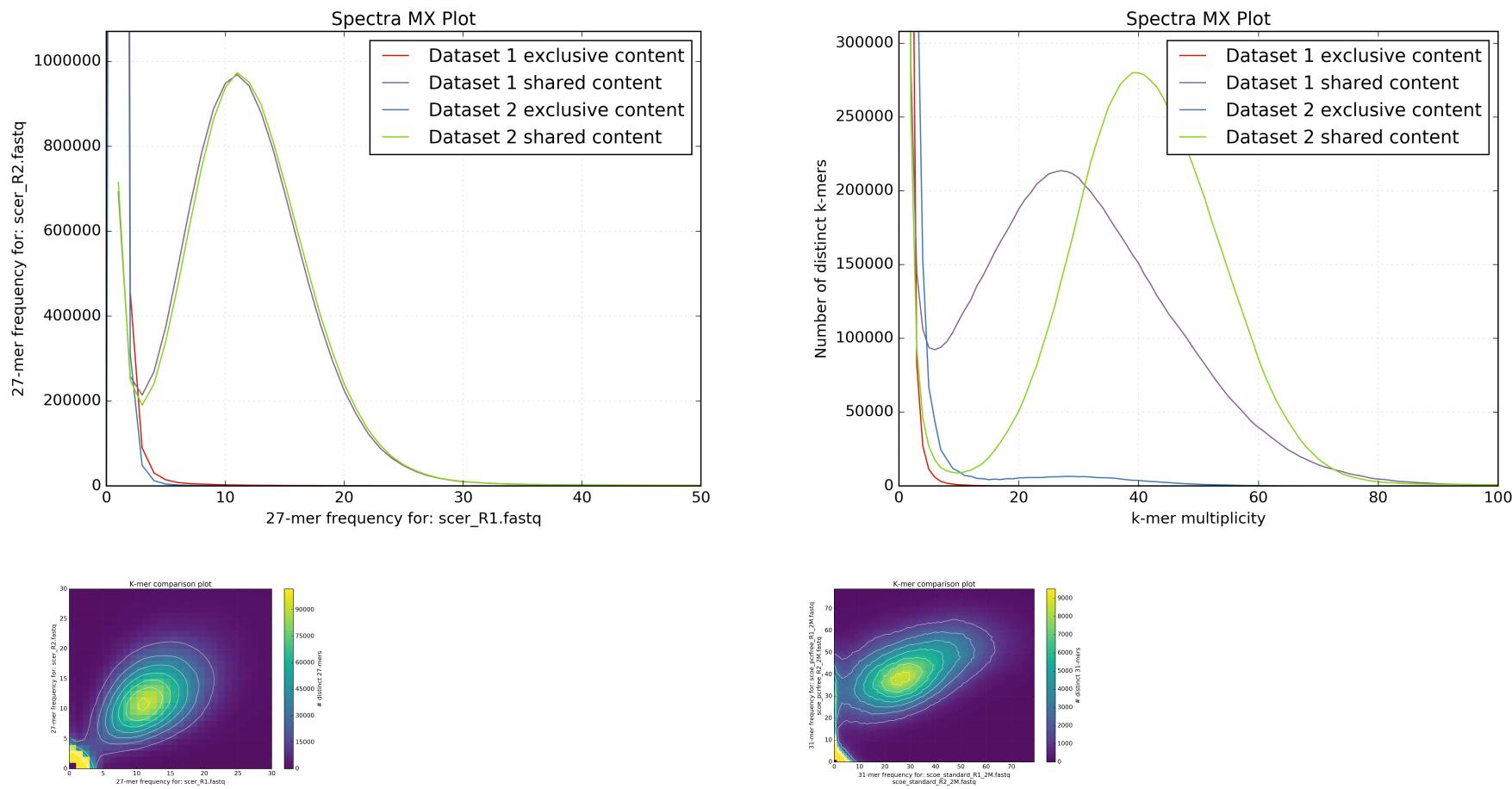


R1 vs R2

Standard vs PCR free

- PCR free captures data missing in standard protocol

# Data comparison

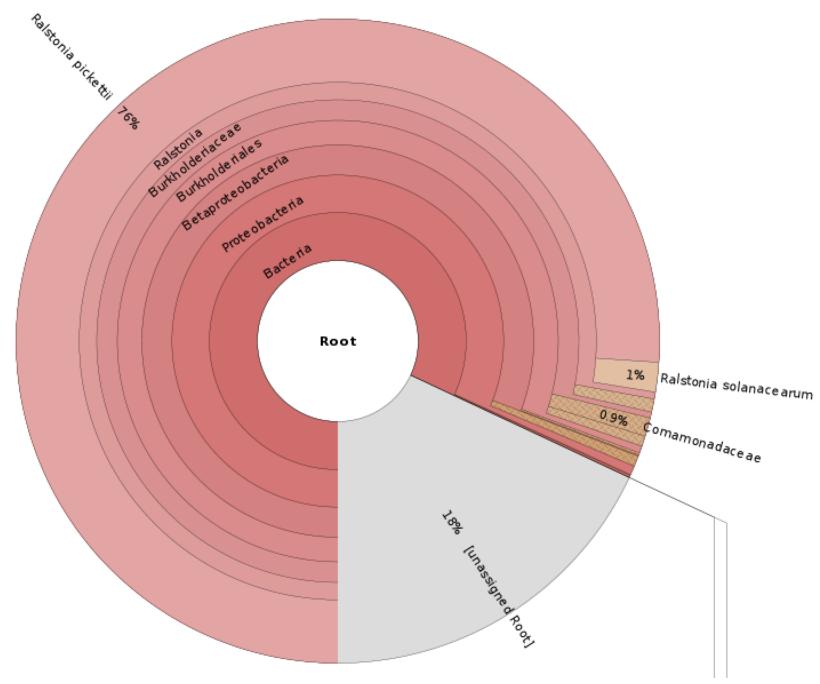
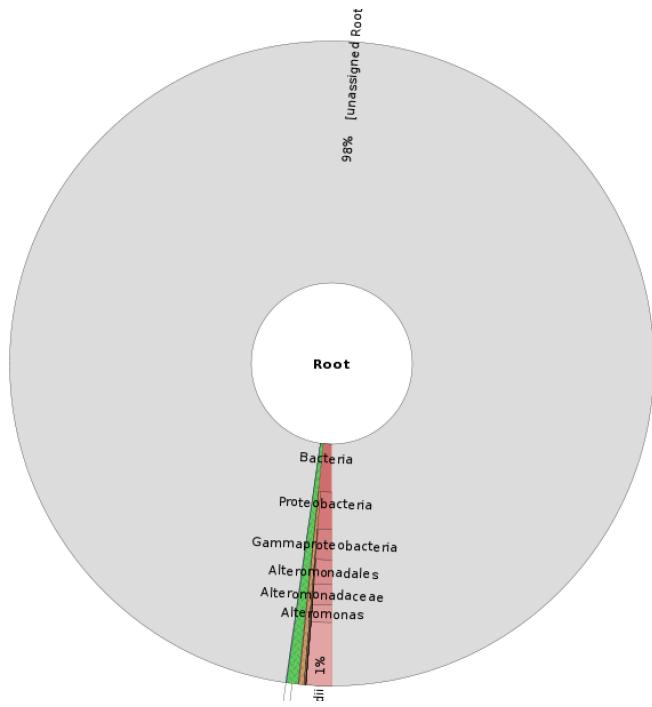


- Methods:
  - Digital Normalisation
  - Error Correction
  - Cut-off based
- The result is difficult to predict
  - Removes low coverage data
  - Overcorrects repeats
  - Removal of similar alleles
  - Large computation time for potentially little gain

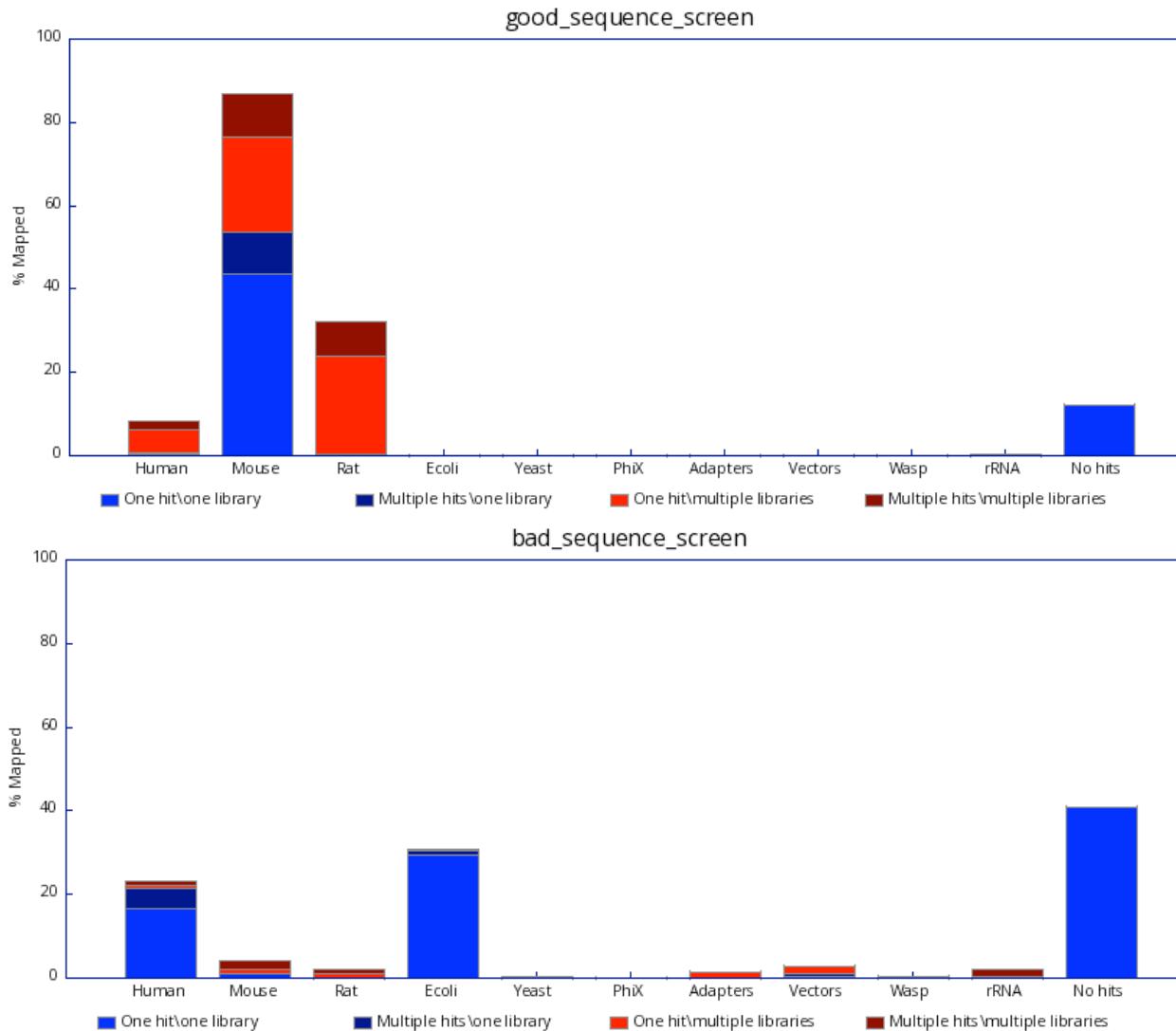
# Contamination Analyses

- Read based contamination analyses are tricky
  - Entirely dependent on your reference database
  - Short string matching increases alignment to multiple targets
  - Unrelated organisms can contain similar strings of nucleotides

# Kraken taxonomic classification



# FastQ Screen

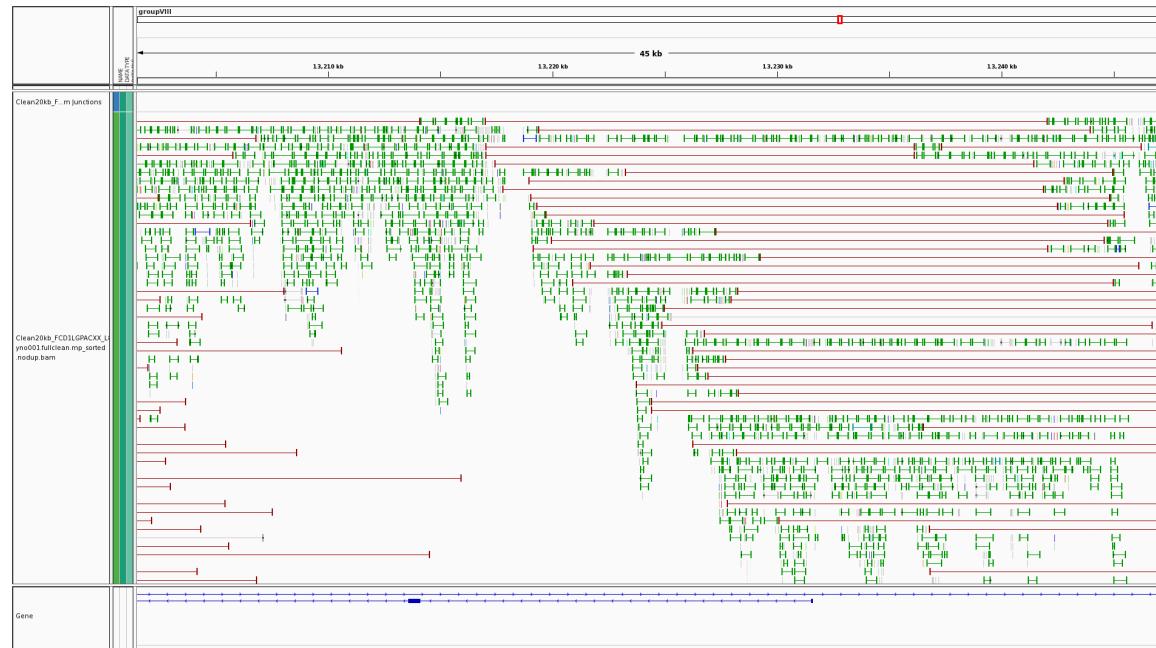


# Reference Alignment

- Alignment to a known close relative.
  - Check % alignment.

```
5351663 + 0 in total (QC-passed reads + QC-failed reads)
0 + 0 secondary
19003 + 0 supplementary
0 + 0 duplicates
543253 + 0 mapped (10.15% : N/A)
5332660 + 0 paired in sequencing
2666330 + 0 read1
2666330 + 0 read2
0 + 0 properly paired (0.00% : N/A)
524250 + 0 with itself and mate mapped
0 + 0 singlettons (0.00% : N/A)
12048 + 0 with mate mapped to a different chr
160 + 0 with mate mapped to a different chr (mapQ>=5)
```

- Other QC issues
  - Incorrect fragment size
    - Alignment -> Picard Metrics / Genome Browser



- Incorrect Demultiplexing
  - Check data proportions

- Check data integrity
- Check basic statistics
- Check for contaminants, adapter, duplication
- Check data sets share the same information content
- Check platform specific diagnostics
- Trash in -> trash out.
  
- If something looks wrong, talk to your sequencing provider
  - (but get a second opinion on the answer they give you)