

Quality assessment and control of sequence data

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Workshop on Genomics 2014

Quality control is important

- Some of the artefacts/problems that can be detected with QC
 - Sequencing
 - Sequence quality
 - Library preparation problems
 - Contaminations
 - Overrepresented sequences
 - Adaptor sequence presence
 - ...

fastq format

```
ubuntu@ip-10-110-9-174: ~/genomics_tutorial/strain3/illumina_reads
File Edit View Search Terminal Help
@Edited_EE41049_EE41534_E:0:0_0:0:0_1/1
AAAGTGGAGCAGCATTATTCGGTGCTGCAATTGCTGTGTGTGGTGGGGCTGCTGCGTTCCGTGGGTAACCCGATTGGTTCGCTGCTGAT
+
;:LHHHHHGGHGGGHHGHHGHHGHHHHHHGGGHHGHHGGGHHGGGHHGGGHHGHHGGGHHHHHHGHHHHGHHGHHHGGHGHGHHHGG
@Edited_E4346E1_E435089_4:0:0_1:0:0_E/1
ACATTTTCTGCGCCCCACAATGTGTCCAGATAGGTGGACATCCGTTGAGTCATCTCAAGCGTTGAGTTGTCGTGAGGGCCAAAGATTAAC
+
;:LHHHHHGGHGGGHHGHHGHHGHHHHHHGGGHHGHHGGGHHGGGHHGGGHHGHHGGGHHHHHHGHHHHGHHGHHHGGHGHGHHHGG
@Edited_4138041_413856E_1:0:0_E:0:0_3/1
TATCAGGACGCTTTAGCCCATGTCCCGCATTTTGATTTGTAGTTTTGCCCTGGTTTTACTTTATCCCGCAGGGATTGATATGTACCTCGT
+
;:LHHHHHGGHGGGHHGHHGHHGHHHHHHGGGHHGHHGGGHHGGGHHGGGHHGHHGGGHHHHHHGHHHHGHHGHHHGGHGHGHHHGG
@Edited_1603E9_160841_1:0:0_1:0:0_4/1
GGCGGTTACGTGCCTCAGGTAAC TACAAC TGGATGACCAATGTCCATAGCGATTACGATTTACAGAATCGCTATTTACAACGCGATCTTG
+
;:LHHHHHGGHGGGHHGHHGHHGHHHHHHGGGHHGHHGGGHHGGGHHGGGHHGHHGGGHHHHHHGHHHHGHHGHHHGGHGHGHHHGG
@Edited_E351513_E35E083_1:0:0_4:0:0_5/1
AACCAGGATAACTTCAGGATAGTGCCATCGCCAAAATTCCAGCCAATATGTGTAGTGCCAATGAAGGCGCAAATCACCGGAATCGCCGCC
+
;:LHHHHHGGHGGGHHGHHGHHGHHHHHHGGGHHGHHGGGHHGGGHHGGGHHGHHGGGHHHHHHGHHHHGHHGHHHGGHGHGHHHGG
@Edited_6E0545_6E106E_0:0:0_0:0:0_6/1
ACGAACACTGCCGAACGCCCATCACGTTGCGATCGGTGATTTCGTTCTGGAAGGTGCCGCCGTC AATTGCAGTGTGCTTGATGCGCGGG
+
;:LHHHHHGGHGGGHHGHHGHHGHHHHHHGGGHHGHHGGGHHGGGHHGGGHHGHHGGGHHHHHHGHHHHGHHGHHHGGHGHGHHHGG
@Edited_4814930_4815379_0:0:0_E:0:0_7/1
TCCTCATTTTTAACAATTGTATCAACAACCACCAACCAAGTTATAACCCTGGTCTTCCCAGTACCCCCCGGAAAATGATTAGTGACCTC
+
;:LHHHHHGGHGGGHHGHHGHHGHHHHHHGGGHHGHHGGGHHGGGHHGGGHHGHHGGGHHHHHHGHHHHGHHGHHHGGHGHGHHHGG
@Edited_E497311_E497915_3:0:0_1:0:0_8/1
GTGCTAACCTTAGCGCCCGCACATTTGCGTTTTATTTTTATGTGGTGAACGTGACAGCAAATTCGCGCTCTGGCGGCGGAAC TGGCTG
+
;:LHHHHHGGHGGGHHGHHGHHGHHHHHHGGGHHGHHGGGHHGGGHHGGGHHGHHGGGHHHHHHGHHHHGHHGHHHGGHGHGHHHGG
@Edited_3E00760_3E01EEE_0:0:0_1:0:0_9/1
ATGCGGGGGTTGAACACGCTCGTTGGGCATTCCGGTTATTGTTACCGATCACCATTTGCCAGGCGATACATTACCCGCGAGCGGAAG
strain3_read1.fastq
```

fasta

- Most basic file format to represent nucleotide or amino-acid sequences
- Each sequence is represented by:
 - A single description line (shouldn't exceed 80 characters):
 - Starts with ">"
 - Followed by the **sequence ID**, and a space, then
 - More information (**description**)
 - The sequence, over one or several lines (the number of characters per line is generally 70 or 80, but it does not matter)

```
>Protein1 Description of protein 1
```

```
MTEITAAMVKELRESTGAGMMDCKNALSETNGDFDKAVQLLREKGLGK  
LVSVKVSDDFTIAAMRPSYLSYEDLDMTFVENEYKALVAELEKENEER
```

```
>DNA1 Description of dna segment 1
```

```
AACTCTCGCGTAGCTCAGAGAAGAGCTTGATCGATCGTGCTGCTGCTA  
CCGCTAGTAGCTGTAGATCGTGCTAGTCAGCATCGATGCTAGCTAGCT
```

fastq

- same as fasta file but including quality scores
- contains 4 lines:
 - “@” and the sequence ID
 - the sequence
 - “+” (and the sequence ID)
 - the quality score

```
@HWI-ST0747:162:C03AJACXX:3:1108:19763:106771 1:N:0:  
TTTGTCTGCAGGGGGACACGTCAAAGTCAAACGCAGGCAAGTTTGTGTTTATGTCCAGTGGATCTTTTGATTTT  
+  
<?@DDDDDDHFHHFBB@GGIACFHGGHBGHGCDHBEAHACHI=@CH.=7ACAHHADECDBCC66(6>@C>5@CACCA
```

ASCII encoding of phred scores

- one number : one letter

40 : @

41 : A

42 : B

43 : C

44 : D

45 : E

... : ...

90 : Z

91 : [

92 : \

93 :]

94 : ^

95 : _

... : ...

141 : a

142 : b

143 : c

144 : d

145 : e

146 : f

... : ...

quality – Phred scores (Q)

- Most commonly used representation of qualities
- Related to the probability of errors (P) in a particular base

$$Q = -10 \log_{10} P$$

$$P = 10^{\frac{-Q}{10}}$$

Quality Score	Probability of incorrect base call	Base call accuracy
10	1 in 10	90%
20	1 in 100	99%
30	1 in 1000	99.9%
40	1 in 10000	99.99%

Different scoring systems

```
SSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSSS.....  
.....XXXXXXXXXXXXXXXXXXXXXXXXXXXXXXXXXXXXXXX.....  
.....IIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIIII.....  
.....JJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJJ.....  
..LLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLLL.....  
!"#$%&'()*+,-./0123456789:;<=>?@ABCDEFGHIJKLMNOPQRSTUVWXYZ[\]^_`abcdefghijklmnopqrstuvwxyz  
|               |       |           |                               |  
33              59      64          73                             104  
0.....26...31.....40  
             -5....0.....9.....40  
                0.....9.....40  
                 3.....9.....40  
0.2.....26...31.....41
```

S - Sanger	Phred+33,	raw reads typically (0, 40)
X - Solexa	Solexa+64,	raw reads typically (-5, 40)
I - Illumina 1.3+	Phred+64,	raw reads typically (0, 40)
J - Illumina 1.5+	Phred+64,	raw reads typically (3, 40)
L - Illumina 1.8+	Phred+33,	raw reads typically (0, 41)

Quiz 1

http://en.wikipedia.org/wiki/FASTQ_format

- What are the phred scores (and probability of error) of the first four bases of this sequence?

```
@phredscoretest
```

```
AATTCTGGTACTCTAATGTGTTGTATATGGTCCTATC
```

```
+
```

```
FEGIFDCBAGFJDGFABBD9837.9##(. , +) ..+**
```

Quiz 1 (answer)

@phredscoretest

AATTCTGGTACTCTAATGTGTTGTATATGGTCCTATC

+

FEGIFDCBAGFJDGFABBD9837.9## (. , +) . . +**

- Sanger, Illumina 1.8+ [ascii - 33]
 - 37 , 36 , 38 , 40 [error: **between 1 and 2,5 in 10,000**]
- Solexa, Illumina 1.3+, 1.5+ [ascii - 64]
 - 6 , 5 , 7 , 9 [error: **between 1.2 and 3 in 10**]

You need to know the quality score encoding

STACKS:

- e: specify how quality scores are encoded, 'phred33' (Illumina 1.8+, Sanger, default) or 'phred64' (Illumina 1.3 - 1.5)

BOWTIE:

- phred33-quals input quals are Phred+33 (default)
- phred64-quals input quals are Phred+64 (same as --solexa1.3-quals)
- solexa-quals input quals are from GA Pipeline ver. < 1.3
- solexa1.3-quals input quals are from GA Pipeline ver. >= 1.3
- integer-quals qualities are given as space-separated integers (not ASCII)

Quiz 2

http://en.wikipedia.org/wiki/FASTQ_format

- Can you guess the sequencing platform/base caller that was used to generate this data?

```
@phredscoretest
```

```
AATTCTGGTACTCTAATGTGTTGTATATGGTCCTATC
```

```
+
```

```
FEGLFDCBAGFJDGFABBD9837.9##(. , +) ..+**
```

Quiz 2 (answer)

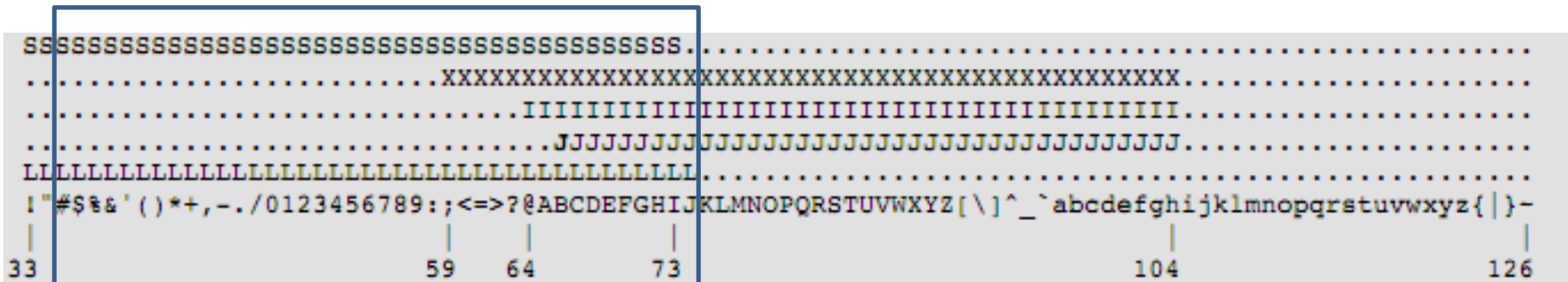
@phredscoretest

AATTCTGGTACTCTAATGTGTTGTATATGGTCCTATC

+

FEGIFDCBAGFJDGFABBD9837.9##(. , +) . . +**

Phred scores go from 35 to 73 → Illumina 1.8+



Sequence quality control

1. Look at how the data looks like

Impossible to look at a >10 GB file to check if quality scores are adequate!

Sequence quality

@BENM 2011 0526 022:2:1:299:100/1

ATGGTGAACGCACATTGCCGTAATGGTCTGCGACTGTTTCGCCAAAAGGCAATTCAATTAATTCTCCGCACTTGAAGCTCTTTTAC

+

[illegible]

@BENM 2011 0526 022:8:2:303:100/1

GGCATTACGTTTTTCTACCATCGTGCCGAGGCGCTTATTGCTGGCATCATGCTCATGATAATGAATTTGAATCAGGGGTGATAA

+

EDEDDEEEEEDEDDDEDEDEDDDEEEEDDDEEEDDDDDDDDDDDDEEEDDEEEDDEEEDDEEEDDDDEEDDEDEEEDDEDDH

@BENM 2011 0526 022:4:3:307:100/1

ATTCATAATGGCGCTGCAGCAATTGCTGGTTGAGGTTGTAAC TGCGCACCAACATAACCGATTTTCATCGTCCTGATGCAGACGCC

+

[illegible]

@BENM 2011 0526 022:7:4:292:100/1

TTCGACCGCATCCACGGCACCCCACTGATCCCGGAAACACCAGCGGTTTCAATGCGGGTCAGCCTATGGTGAAGGCCGTGAC

+

I I H I H H I I H H H H I H I I H H H I H H I H H I H I H I H I I H H H I H I I H I I H I I H H I H H I H I I I I I I H H H H I I H H I H H I I H I H H H H H I H H I

@BENM 2011 0526 022:4:5:317:100/1

TTTTCACGCTGGGGCGTGACGGCATTCAATTAACCCGCTTTCTTTGGCGATCTTCTCGATCTTCGCTTTCTCGCTTTCCGGCACG

 $+$

BBBBCCCBBCBBBCCBCCCCCBBBCBCCCCBBBCCBBBCCCBCCBCCCCCCCCBCCBBBCCBCCCCBCCBBBCCBCCBCCCCB

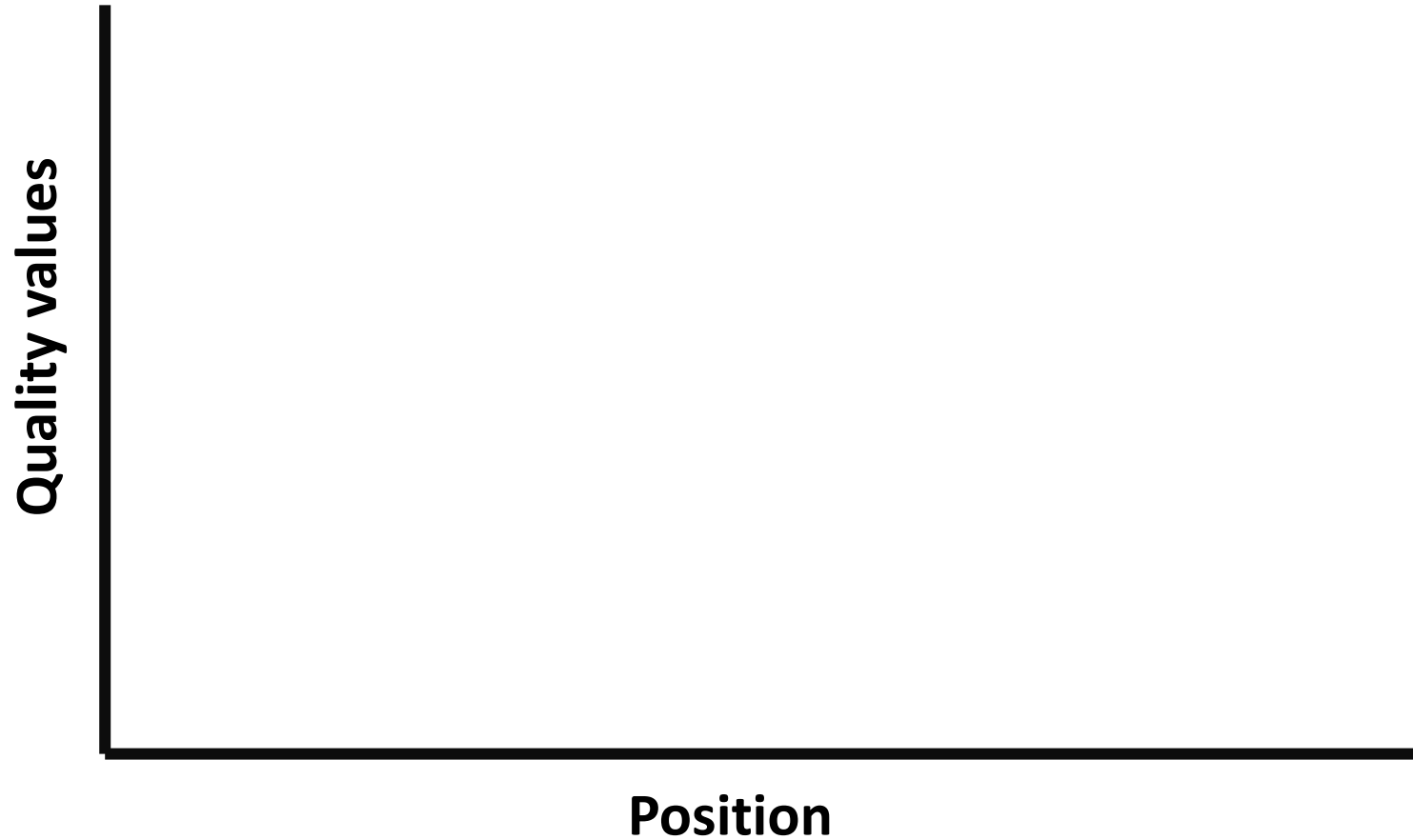
@BENM 2011 0526 022:2:6:309:100/1

GATGGGAAAAGTAAAGTGACAGTTCGCGCATCCACCGCGACAACGGTTCCAAGTCCCAATTTCGCTTTTCTGTATCACTGATCCA

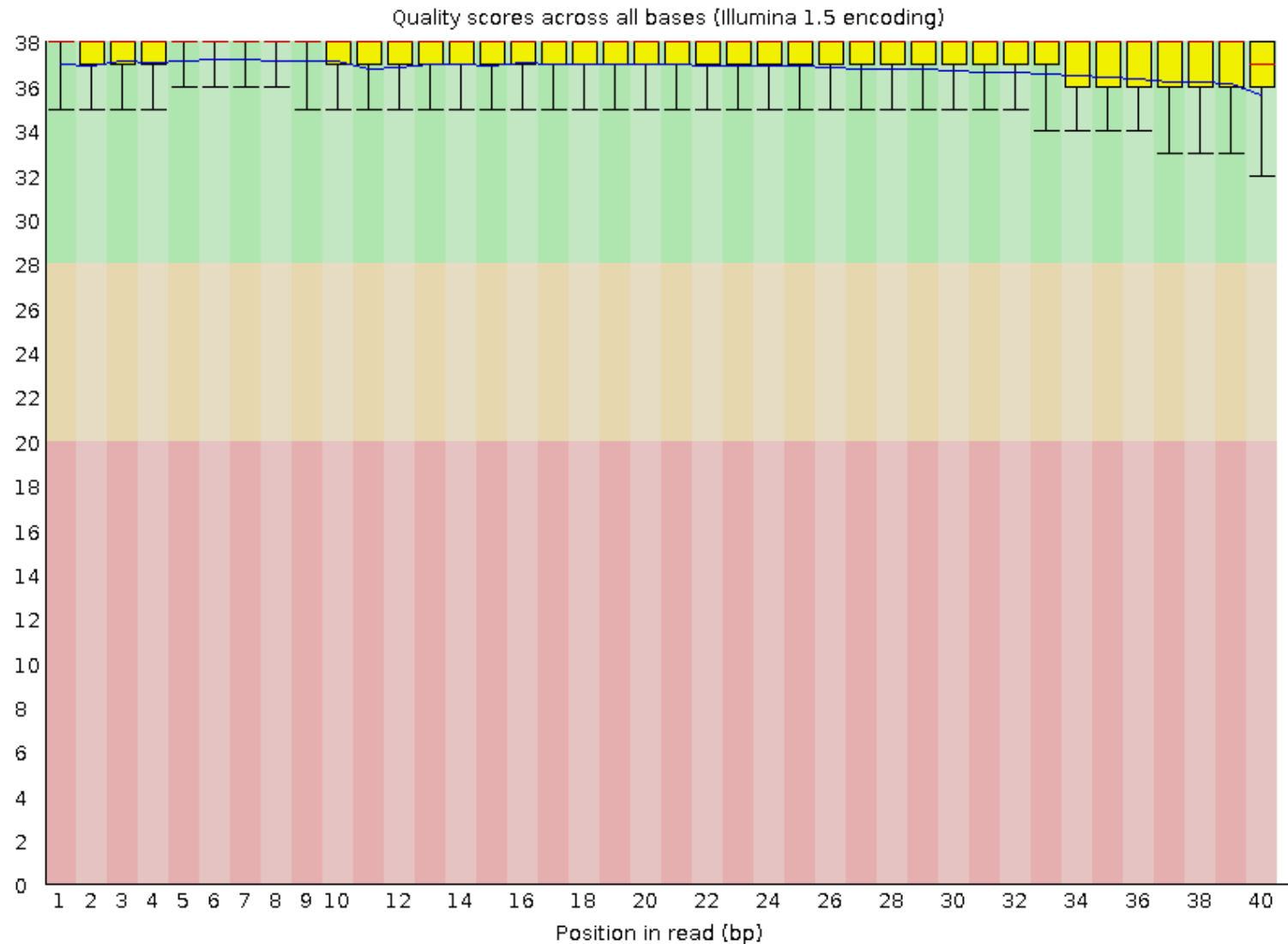
+

IIHHHHI IHHIHHHHHHH I I I I IHHHI IHHI I I I IHHIHHHHI I IHHI I I IHHI IHHI I I I IHHHHHHH I I I IHHI IHHI IHHI I

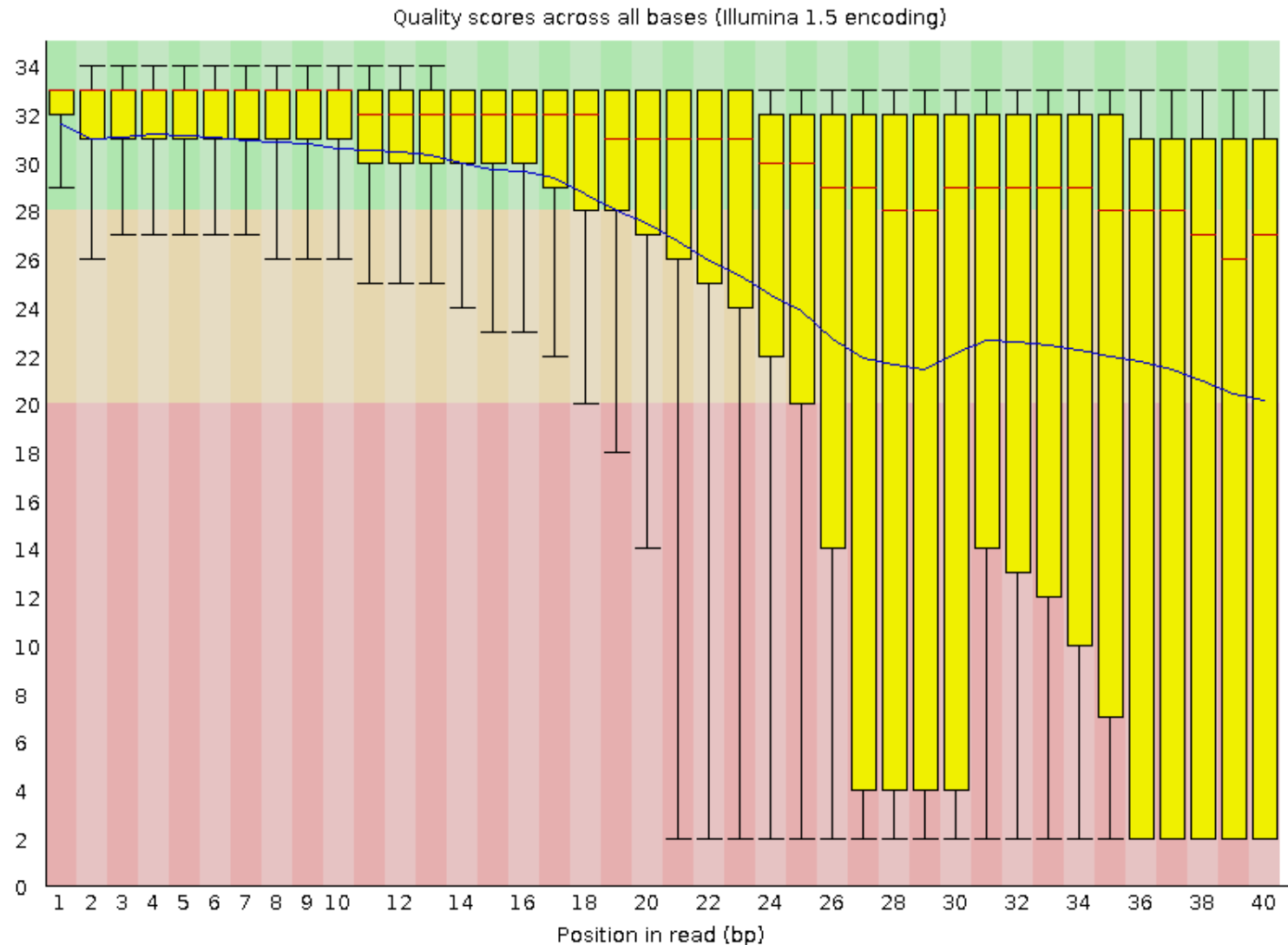
Quality plots



Sequence quality



Sequence quality



Sequence quality control

1. Look at how the data looks like

Impossible to look at a >10 GB file to check if quality scores are adequate!

2. Decide what to do:

Nothing (some programs take quality into account)

Clean:

- Trim all reads to a certain length

- Trim bad quality bases

- Discard bad quality reads

Data cleaning

FASTX-Toolkit

FASTQ/A short-reads pre-processing tools

[FASTQ-to-FASTA](#)

[FASTQ/A Quality Statistics](#)

[FASTQ Quality chart](#)

[FASTQ/A Nucleotide Distribution chart](#)

[FASTQ/A Clipper](#)

[FASTQ/A Renamer](#)

[FASTQ/A Trimmer](#)

[FASTQ/A Collapser](#)

[FASTQ/A Artifacts Filter](#)

[FASTQ Quality Filter](#)

[FASTQ/A Reverse Complement](#)

[FASTA Formatter](#)

[FASTA nucleotides changer](#)

[FASTA Clipping Histogram](#)

[FASTX Barcode Splitter](#)

FASTA/Q Trimmer

`[-l N]` = Last base to keep. Default is entire read.

FASTQ Quality Filter

`[-q N]` = Minimum quality score to keep.

`[-p N]` = Minimum percent of bases that must have `[-q]` qual.

Data cleaning

Fastx-toolkit:

http://hannonlab.cshl.edu/fastx_toolkit/index.html

FastqMcf:

<http://code.google.com/p/ea-utils/wiki/FastqMcf>

Trimmomatic:

<http://www.usadellab.org/cms/?page=trimmomatic>

Quality control is important

- Some of the artefacts/problems that can be detected with QC
 - Sequencing
 - Sequence quality
 - Library preparation problems
 - Contaminations
 - Overrepresented sequences
 - Adaptor sequence presence
 - ...

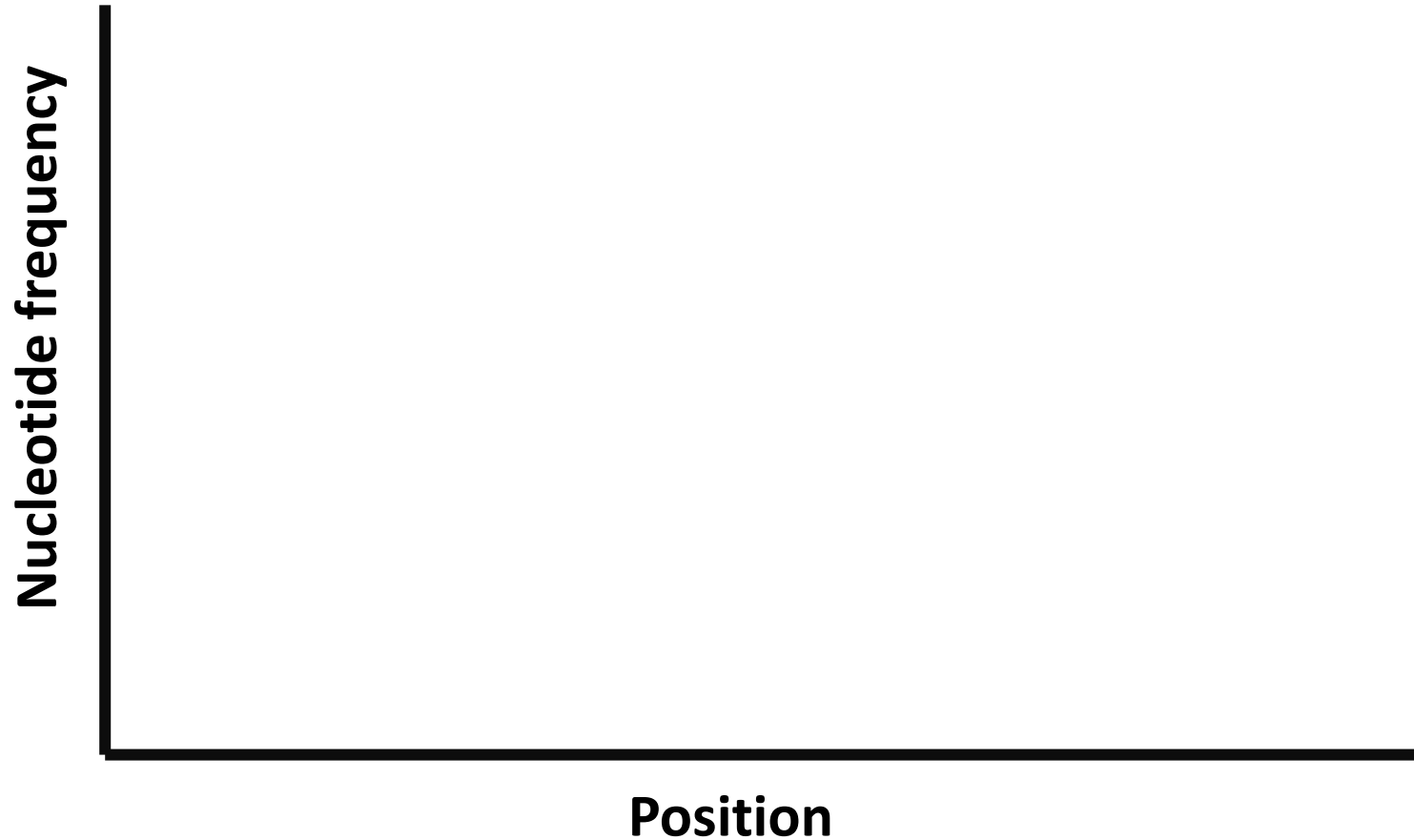
Nucleotide composition

```
@ILLUMINA-GA_0000:1:1:2771:1022#0/1
TGACATNAAGCACTGTAGCTCATCTCGTATGCCGTCTT
+ILLUMINA-GA_0000:1:1:2771:1022#0/1
faaWa]B\|)`^b`Vcdfd_f_cd_f[d_bfaSadddfb
@ILLUMINA-GA_0000:1:1:3203:1022#0/1
TGAGATNAAGCACTGTAGCTCTATCTCGTATGCCGTCT
+ILLUMINA-GA_0000:1:1:3203:1022#0/1
dcgga^BY_`^b]b`ggggffgeggdegggggegggg
@ILLUMINA-GA_0000:1:1:4878:1023#0/1
TGAGGTNGTAGGTTGTATAGTATCTCGTATGCCGTCTT
+ILLUMINA-GA_0000:1:1:4878:1023#0/1
cdaed[BWa\Z]\\\ffffdffffdffffdffffdffff
@ILLUMINA-GA_0000:1:1:5393:1022#0/1
TTCACATNATGAGAGCATTTGTTCTGAGCATCTCGTATGC
+ILLUMINA-GA_0000:1:1:5393:1022#0/1
hhhhhheBdeeffffchhhhhhhhhfghhhfffefff
@ILLUMINA-GA_0000:1:1:5523:1022#0/1
TGAGGTNGTAGGTTGTATAGTTATCTCGTATGCCGTCT
+ILLUMINA-GA_0000:1:1:5523:1022#0/1
ff]cf[B^X_bb^bbggggfgggg_ggfggcfcffaff
```

...

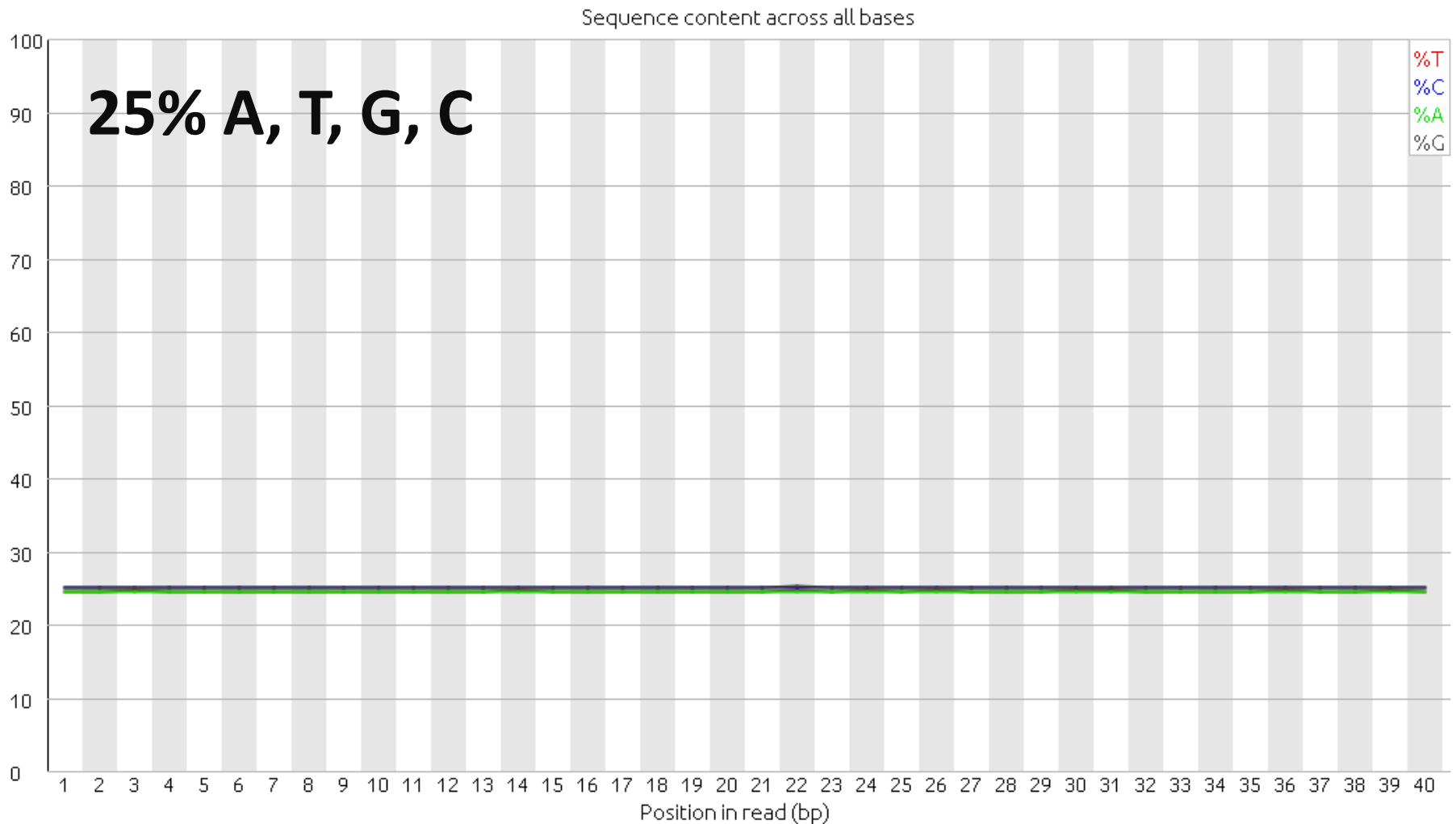
pos	A_Count	C_Count	G_Count	T_Count
1	4184726	3636289	2993640	14529850
2	2493259	4490289	13722137	4661065
3	12276591	6845747	3622752	2625158
4	3611989	4517290	12764502	4476465
5	11248562	3968447	6464472	3688770
6	3094389	3153655	6099499	13022698
7	4923585	3544477	11822757	5079405
8	11866464	1042283	6207172	6254332
9	8870719	3488704	2745084	10252623
10	5375998	2761606	12917981	4314650
11	3043455	11638364	6835895	3852527
12	12629424	5073041	4632904	3034882
13	2545268	10564820	6711226	5548937
14	3752988	2794955	3207436	15614698
15	4694143	4729795	13525064	2420856
16	3859216	3854697	3303337	14352850
17	12274317	2566690	4261912	6267332
18	3047662	6016803	10623984	5675723
19	4562389	9049534	3894678	7842744

Nucleotide composition graphs



Nucleotide composition graphs

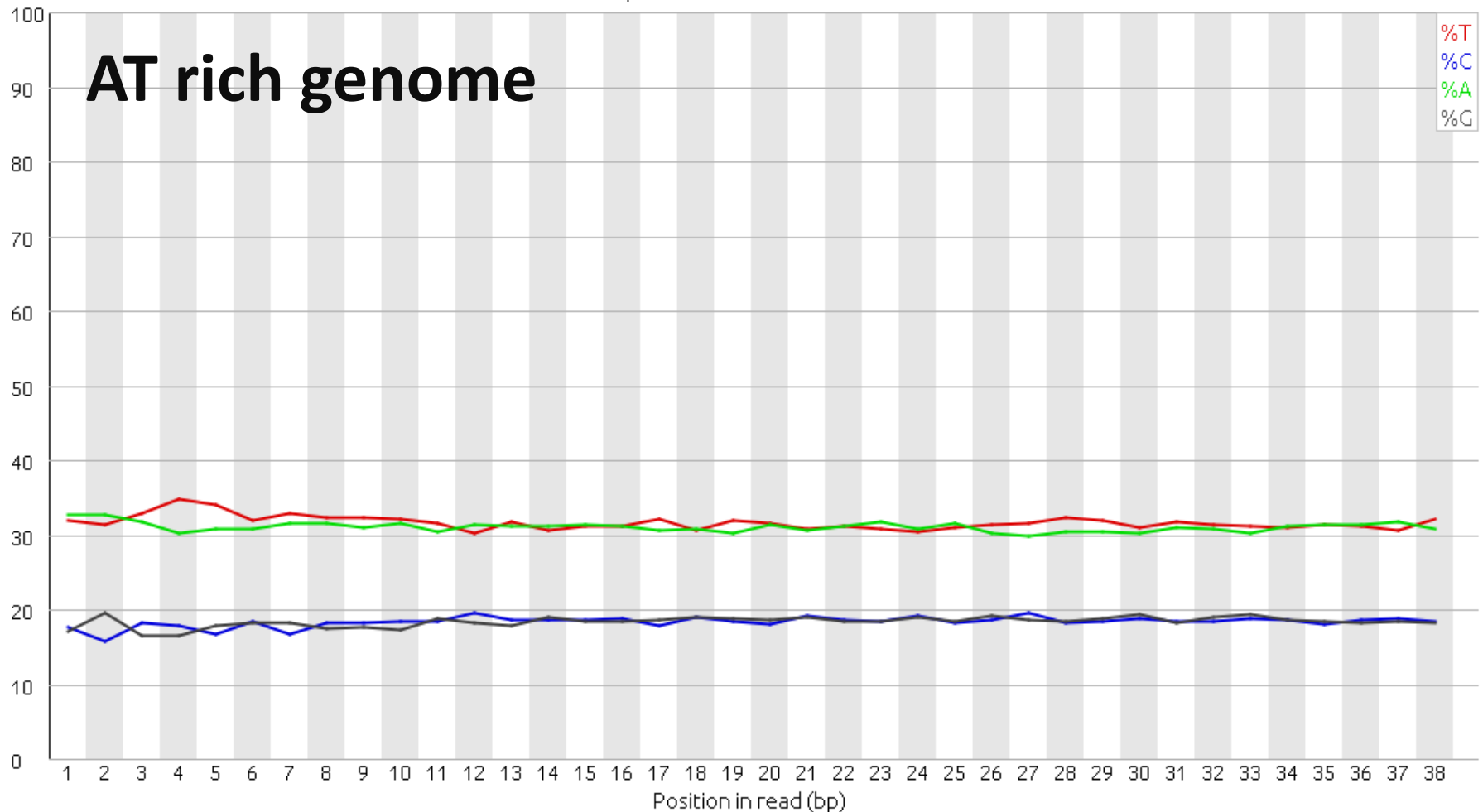
Are they what you expect?



Nucleotide composition graphs

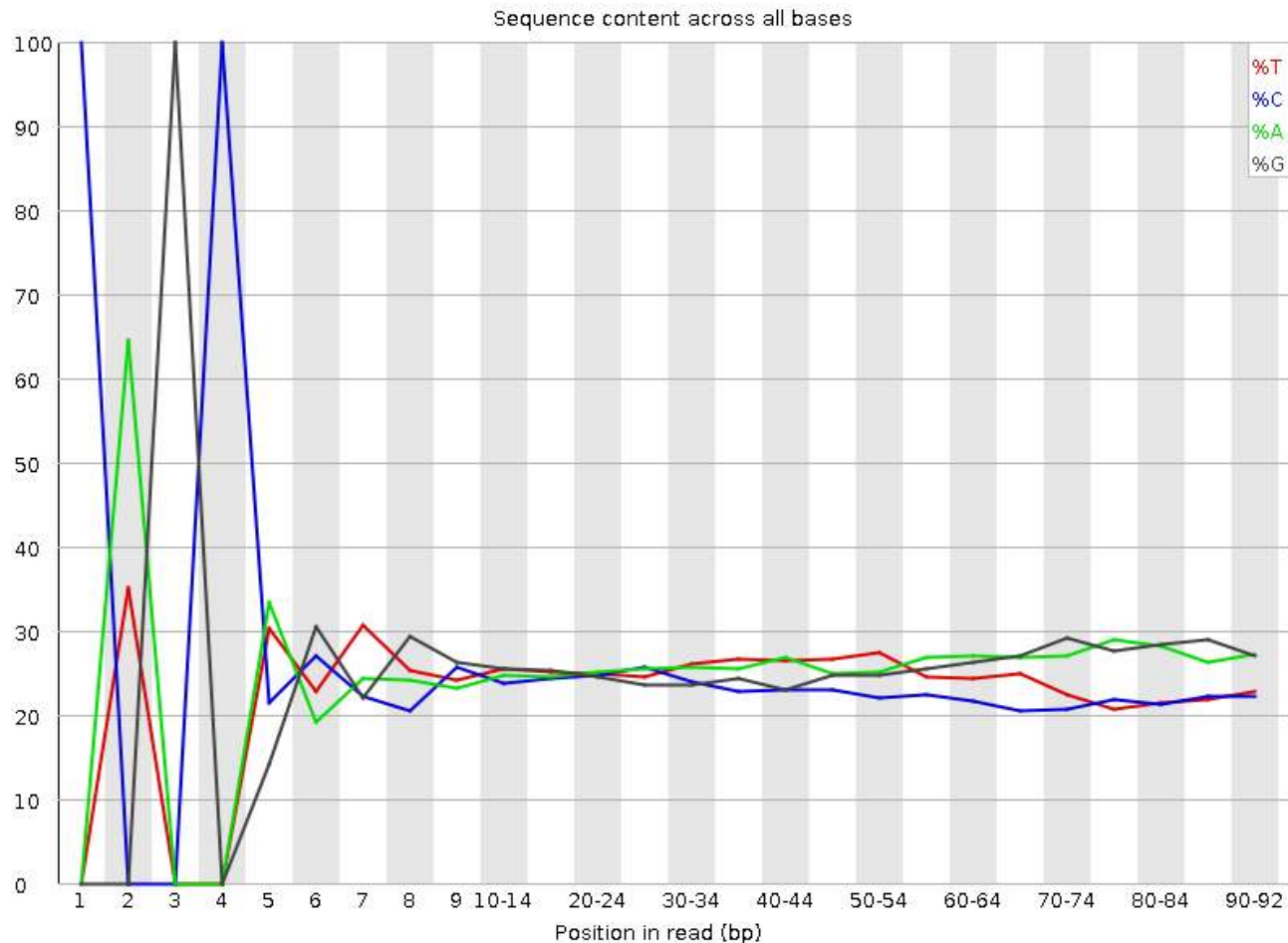
Are they what you expect?

Sequence content across all bases



Nucleotide composition graphs

Are they what you expect?



Exercise

<http://evomics.org/learning/quality-assessment-and-control-of-sequence-data/>

DATASETS

- **DATASET 1: Genome sequencing of *Bartonella***
- **DATASET 2: Amplicon sequencing of environmental 16S rRNA**
- **DATASET 3: microRNA sequencing of human embryonic stem cells**

Exercise 1: DATASET 1

- There are 10000 sequences of 38 nucleotides length. The total GC content is 37%.
- Quality score is ~37 ($Q=37 \rightarrow P = 1/5011$)

$$P = 10^{\frac{-Q}{10}}$$

- The sequences are average good quality
- Sequences are GC rich – this is expected in Bartonella
- There is an adaptor contamination that is recognized by the program

Exercise 1: DATASET 2

- Barcode sequence at the beginning of the reads:
 - TACAGAGG
- All reads have the same barcode
- Sequences from a conserved region of the 16S rRNA
- Some sequences are more frequent than others
 - Frequencies of the different bacteria in the sample are different

Exercise 1: DATASET 3

- The quality of some sequences drops down towards the end of the read
- The per base sequence content plot show that there are sequences that are more frequent than others
- The sources of the overrepresented sequences are:
 - Illumina adaptor /sequencing primer sequences
 - microRNAs that are more frequent than others

Exercise 2

- `fastq_quality_filter -q 30 -Q33 -p 75 -i SRR026762-sample.fastq -o SRR026762-sample-qf.fastq -v`
 - 53832 reads are retained
- `fastx_clipper -a ATCTCGTATGCCGTCTTCTGCTTG -l 8 -v -Q 33 -i SRR026762-sample-qf.fastq -o SRR026762-sample-qf-at.fastq`
 - 52701 reads are retained

Exercise 2 (ctd.)

ATCTCGTATGCCGTCTTCTGCTTG
AGTTCTACAGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
GTTCTACAGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
TTCTACAGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
TCTACAGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
CTACAGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
TACAGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
ACAGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
CAGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
AGTCCGACGATCTCGTATGCCGTCTTCTGCTTG
CGACAGGTTCAGAGTTCTACAGTCCGACGATC

Exercise 2 (ctd.)

- `fastx_clipper -a AGTTCTACAGTCCGACG -l 8 -v -Q 33 -i SRR026762-sample-qf-at.fastq | fastx_clipper -a GTTCTACAGTCCGACG -l 8 -v -Q 33 -i -- | fastx_clipper -a TTCTACAGTCCGACG -l 8 -v -Q 33 -i -- | fastx_clipper -a TCTACAGTCCGACG -l 8 -v -Q 33 -i -- | fastx_clipper -a CTACAGTCCGACG -l 8 -v -Q 33 -i -- | fastx_clipper -a TACAGTCCGACG -l 8 -v -Q 33 -i -- | fastx_clipper -a ACAGTCCGACG -l 8 -v -Q 33 -i -- | fastx_clipper -a ACAGTCCGACG -l 8 -v -Q 33 -i -- | fastx_clipper -a CAGTCCGACG -l 8 -v -Q 33 -i -- | fastx_clipper -a AGTCCGACG -l 8 -v -Q 33 -i -- -o test`
- 25512 reads retained