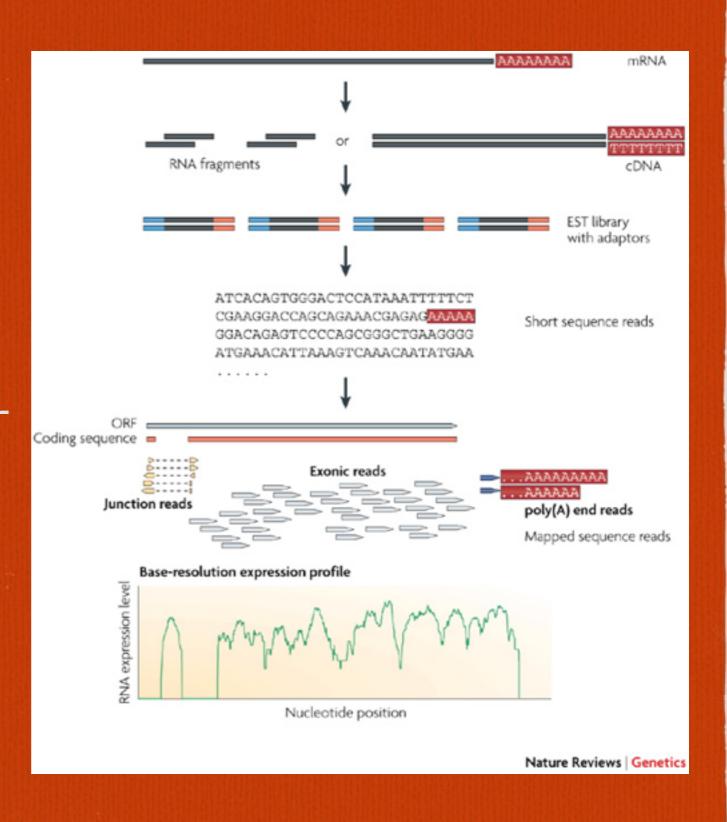
Introduction to RNA-Seq Analysis

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RNA-Seq



RNA-Seq

2cells_1.fastq
https://www.ebi.ac.uk/training/online/
course/ebi-next-generation-sequencingpractical-course/rna-sequencing/rna-seqanalysis-transcriptome

```
@ERR022484.110 IL3_4946:5:1:15692:1051/1
CNGAAGCAAAGTGTGTGCGCGAAATGCTCGTCAGGAAGATCCAAGAGGAGTCGCTGCGCACTTACCTTTTCACCTA
A!AA=CCCDBHAG=HBHHEDGCFFADHADD>D>D@>@==>BA<=>:?=;>9<><8:::879988:877:9;<9;95
@ERR022484.142 IL3_4946:5:1:2246:1064/1
GTTTCTTTCTGCTTATTAAACATGTTGGCTTTGTCCTCCAGCTCCTTCTGTTTCTCCTCCACATCTGGATTTCTT
BFFFFFFFFFFFFE=@=EECBEFEAFEFDA?D<A=?B<;=A=<:;:==.<567;6%*.%/2511*344%0:
@ERR022484.297 IL3_4946:5:1:3383:1074/1
CAGACTTCATTTCATGTTTCATCCCAGCTCCATTGGGTTTGTCCTTTTGCCATTTCGATATGGCAGCAAAGATCCC
HHGGHHHHGHHHHEHGHHHHFGHHHDGDCFE=CEEEE; EEEB>=EDECA=; <AA?:=5;9?;;6:<:7782**44:
@ERR022484.359 IL3_4946:5:1:10826:1077/1
TGAGAAGTTTTCCAGTGCCATTGGCTTGGTGTTGTTGGTCGAAGCCATTGCCGTGTTGGTGGGACCACCCGGAGCG
HGHHGCHDHHHHH@G?GGCCEGGED?@EE9@<B@==?=;;><99<:7;:::79;78994>71+7+22,/*6)20$
@ERR022484.374 IL3_4946:5:1:11790:1074/1
CTTTTCTCTTGGGGCTGTTTCCTCAGACATCAACTCTAGGTCAGAATCAGACTCTCCCTCATCAGAAGACCATGGG
HHHHHHHGGHGGGGHGGHHHHHEGCHGEFGCDBCCDGABE<AAB?@ECAB@D@=B@?A=@;==:=;:;99;99<9:
@ERR022484.391 IL3_4946:5:1:13841:1071/1
HHHHGHHHAHHHG=HCHHHHFGD@DGGGGGFCGEG@C<DB@CCCA=C=>@<=7<<<:=<9<893:7:)89:4788;
@ERR022484.399 IL3_4946:5:1:14919:1082/1
GCTGCAGCTGTGATTTTGGATCGTTCCAATCCTGGTTCAAGATGAACTCCTTGAGTCGTGGGAAGAAGCAAACGTT
EHHHHHHHHHHHHHHGGGEGGHGHFGHFGGGHHH@DDC@D=AD@>@BA?EDA<?;?B=?@=39?:9<:;6<:=:9
@ERR022484.417 IL3_4946:5:1:18221:1081/1
2cells_1.fastq
```

RNA-Seq

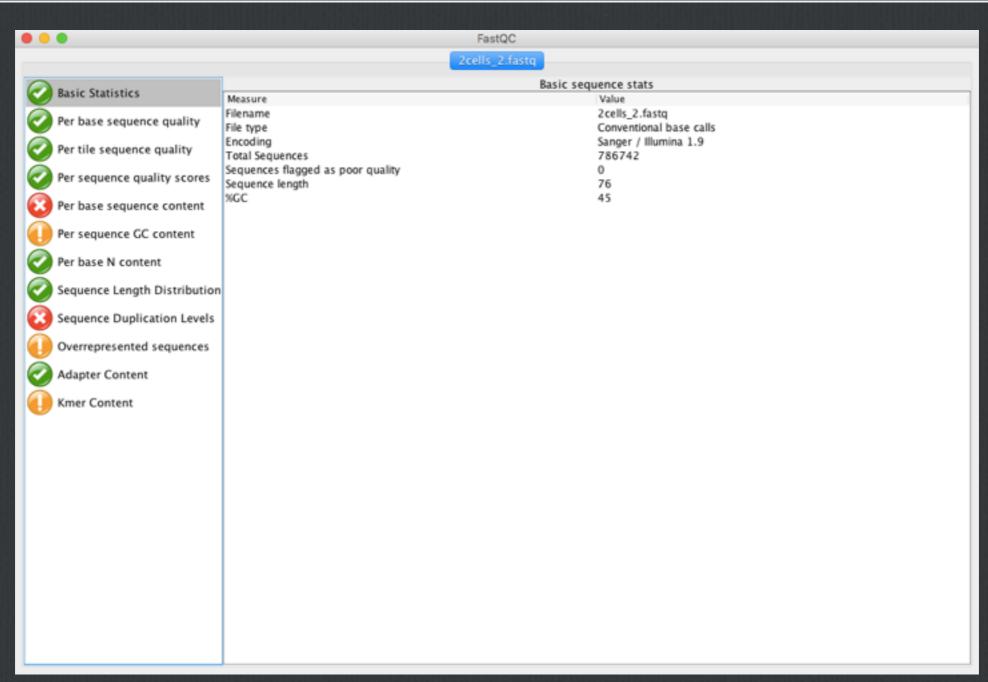
Main RNA-Seq Analysis Problems

- ☐ Reads Mapping
- □ Differential expressed gene calling
- □ Transcript expression profiling
- □ Isoform inference

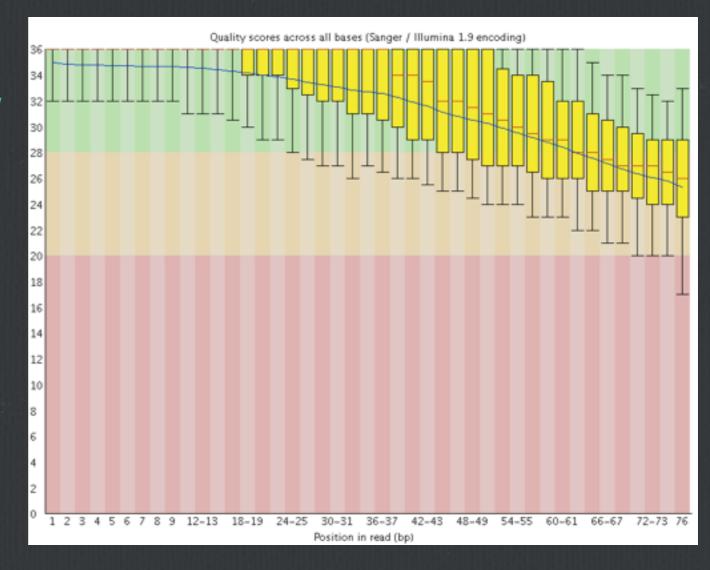
"Before starting analyze, know your data first"

-Yiying Lang

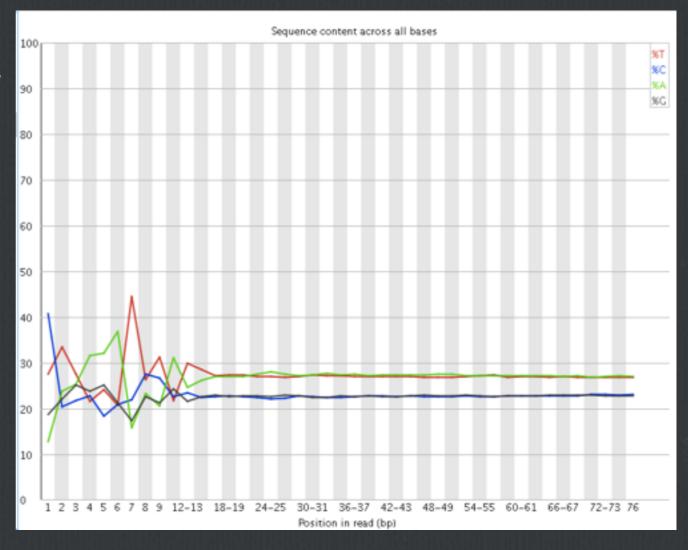
http://www.bioinformatics.babraham.ac.uk/projects/download.html#fastqc



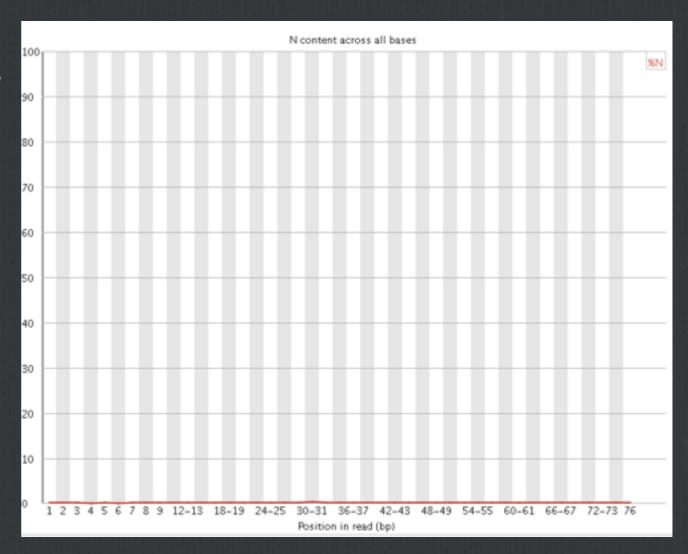
- □ Per Base Sequence Quality
- □ Per Base Sequence Count
- ☐ Per Base N Content
- ☐ Duplicate Sequence



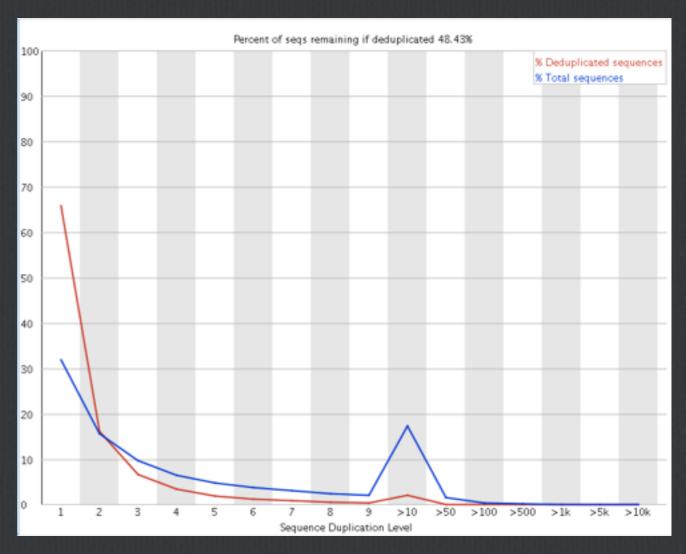
- □ Per Base Sequence Quality
- □ Per Base Sequence Count
- □ Per Base N Content
- □ Duplicate Sequence



- □ Per Base Sequence Quality
- □ Per Base Sequence Count
- □ Per Base N Content
- □ Duplicate Sequence



- □ Per Base Sequence Quality
- □ Per Base Sequence Count
- □ Per Base N Content
- □ Duplicate Sequence



Sequence Depth and Coverage

Sequence Depth = total number of bases generated size of genome

(number of reads) x (average read length)

size of genome

Sequence Depth = 5X redundancy means on average each base has been read by 5 sequences.

GOOD: 10~15X

Bowtie, TopHat

- mapping reads to genome
- TopHat uses Bowtie
- Bowtie: DNA-Seq (ChIP-seq ...)
- TopHat: RNA-Seq —— Alternative Splicing
- Bowtie1 reads length <= 50bp
- Bowtie2 reads length >= 50bp

The data we use

In the .zip file: 6 folders and 1 pdf cuffdiff, cufflinks,tophat are the folders of result.

What do we use to generate these 3 results?

```
data

| langyiying@LangYY | ~/Desktop/RNA-seq/data | ls | |
| 2cells_1.fastq* | 2cells_2.fastq* | 6h_1.fastq* | 6h_2.fastq* |
| langyiying@LangYY | ~/Desktop/RNA-seq/genome | ls -l |
| total 111496 | -rwxrwxrwx 1 langyiying staff 51542283 Sep 22 | 2012 Danio_rerio.Zv9.66.dna.fa* |
| langyiying@LangYY | ~/Desktop/RNA-seq/annotation | ls |
| Danio_rerio.Zv9.66.gtf* | Danio_rerio.Zv9.66.spliceSites* |
```

build index

bowtie2-build Danio_rerio.Zv9.66.dna.fa ../test/index/ZV9

```
Wrote 12640132 bytes to secondary EBWT file: ../test/ZV9.rev.2.bt2
Re-opening _in1 and _in2 as input streams
Returning from Ebwt constructor
Headers:
    len: 50560508
   bwtLen: 50560509
    sz: 12640127
    bwtSz: 12640128
    lineRate: 6
    offRate: 4
    offMask: 0xfffffff0
    ftabChars: 10
    eftabLen: 20
    eftabSz: 80
    ftabLen: 1048577
    ftabSz: 4194308
   offsLen: 3160032
    offsSz: 12640128
    lineSz: 64
    sideSz: 64
    sideBwtSz: 48
    sideBwtLen: 192
    numSides: 263336
   numLines: 263336
    ebwtTotLen: 16853504
    ebwtTotSz: 16853504
   color: 0
    reverse: 1
Total time for backward call to driver() for mirror index: 00:00:49
```

langyiying@LangYY ~/Desktop/RNA-seq/test/index ls
ZV9.1.bt2 ZV9.2.bt2 ZV9.3.bt2 ZV9.4.bt2 ZV9.rev.1.bt2 ZV9.rev.2.bt2

run TopHat

tophat2 -o test/tophat2 test/index/ZV9 data/2cells_1.fastq data/2cells_2.fastq

run TopHat

tophat2 -o test/tophat2 test/index/ZV9 data/2cells_1.fastq data/2cells_2.fastq

output path

run TopHat

tophat2 -o test/tophat2 test/index/ZV9 data/2cells_1.fastq data/2cells_2.fastq

bowtie index

langyiying@LangYY ~/Desktop/RNA-seq/test/index ls
ZV9.1.bt2 ZV9.2.bt2 ZV9.3.bt2 ZV9.4.bt2 ZV9.rev.1.bt2 ZV9.rev.2.bt2

run TopHat

tophat2 -o test/tophat2 test/index/ZV9 data/2cells_1.fastq data/2cells_2.fastq

data

```
langyiying@LangYY ~/Desktop/RNA-seq/data ls

2cells_1.fastq* 2cells_2.fastq* 6h_1.fastq* 6h_2.fastq*
```

Arguments:

<genome< th=""><th>index</th><th>base></th></genome<>	index	base>
--	-------	-------

The basename of the genome index to be searched. The basename is the name of any of the index files up to but not including the first period. Bowtie first looks in the current directory for the index files, then looks in the indexes subdirectory under the directory where the currently-running bowtie executable is located, then looks in the directory specified in the BOWTIE INDEXES (or BOWTIE2 INDEXES) environment variable.

Please note that it is highly recommended that a FASTA file with the sequence(s) the genome being indexed be present in the same directory with the Bowtie index files and having the name <genome_index_base>.fa. If not present, TopHat will automatically rebuild this FASTA file from the Bowtie index files.

<reads1 1[,...,readsN 1]>

A comma-separated list of files containing reads in FASTQ or FASTA format. When running TopHat with paired-end reads, this should be the *_1 ("left") set of files.

<[reads1 2,...readsN 2]>

A comma-separated list of files containing reads in FASTA or FASTA format. Only used when running TopHat with paired end reads, and contains the *_2 ("right") set of files. The *_2 files **MUST** appear in the same order as the *_1 files.

Options:

-h/--help

Prints the help message and exits

-v/--version

Prints the TopHat version number and exits

-N/--read-mismatches

Final read alignments having more than these many mismatches are discarded. The default is 2.

--read-gap-length

Final read alignments having more than these many total length of gaps are discarded. The default is 2.

--read-edit-dist

Final read alignments having more than these many edit distance are discarded. The default is 2.

--read-realign-edit-dist

Some of the reads spanning multiple exons may be mapped incorrectly as a contiguous alignment to the genome even though the correct alignment should be a spliced one - this can happen in the presence of processed pseudogenes that are rarely (if at all) transcribed or expressed. This option can direct TopHat to re-align reads for which the edit distance of an alignment obtained in a previous mapping step is above or equal to this option value. If you set this option to 0, TopHat will map every read in all the mapping steps (transcriptome if you provided gene annotations, genome, and finally splice variants detected by TopHat), reporting

```
langyiying@LangYY ~/Desktop/RNA-seq/test/tophat2 ls
accepted_hits.bam align_summary.txtandeletions.bed insertions.bed_ajunctions.bed logs/ prep_reads.info unmapped.bam
```

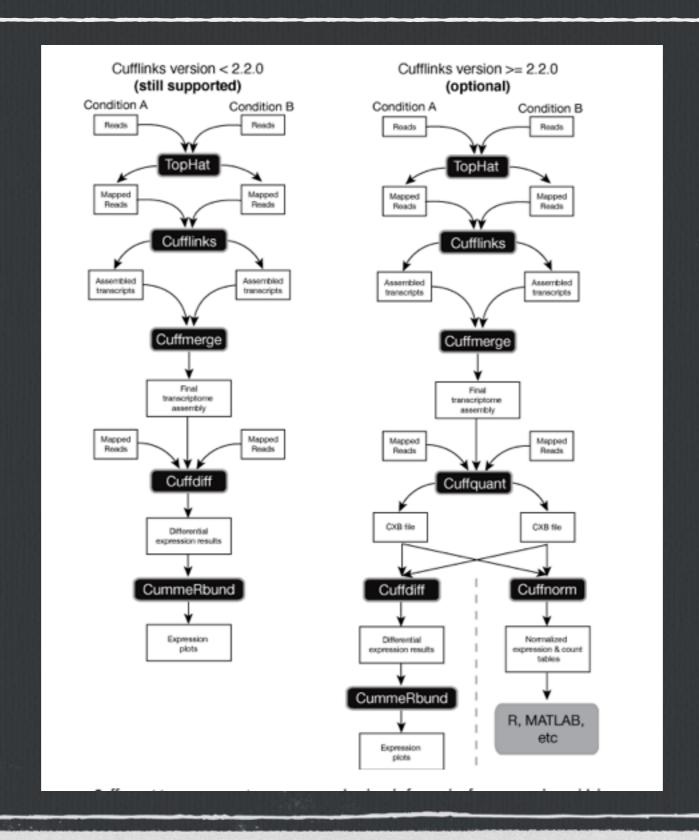
accepted_hits.bam align_summary.txt deletions.bed insertions.bed junction.bed prep_reads.info unmapped.bam logs/

langyiying@LangYY ~/Desktop/RNA-seq/test/tophat2 ls
accepted_hits.bam align_summary.txtandeletions.bed insertions.bed_junctions.bed logs/ prep_reads.info unmapped.bam

accepted_hits.bam ----- Cufflinks

align_summary.txt
deletions.bed
insertions.bed
junction.bed
prep_reads.info
unmapped.bam
logs/

Cufflinks — Assembly reads to transcripts



cufflinks -o cufflinks tophat2/accepted_hits.bam

```
langyiying@LangYY ~/Desktop/RNA-seg/test cufflinks -o cufflinks tophat2/accepted hits.bam
Warning: Your version of Cufflinks is not up-to-date. It is recommended that you upgrade to Cufflinks v2.2.1 to bene
links.cbcb.umd.edu).
[04:38:53] Inspecting reads and determining fragment length distribution.
> Processed 1961 loci.
                                           > Map Properties:
       Normalized Map Mass: 805667.00
       Raw Map Mass: 805667.00
       Fragment Length Distribution: Empirical (learned)
                   Estimated Mean: 333.12
                 Estimated Std Dev: 43.92
[04:39:03] Assembling transcripts and estimating abundances.
> Processed 1996 loci.
                                           langyiying@LangYY     ~/Desktop/RNA-seq/test
```

Results:

genes.fpm_tracking isoforms.fpkm_tracking skipped.gtf transcripts.gtf

transcripts.txt

```
1 12 Cufflinks transcript 12869 20204 1000
                                                   + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; FPKM "1332.3186006296"; frac
    "1.000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                          12869 13196 1000 + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "1"; FPKM "1332.
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                                              + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon number "2"; FPKM "1332.
                          13984 14019
                                        1000
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                          14140 14172 1000 + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "3"; FPKM "1332.
 4 12 Cufflinks exon
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
 5 12 Cufflinks exon
                          15009
                                15111 1000
                                               + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "4"; FPKM "1332.
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                          15662 15836
                                        1000
                                               + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "5"; FPKM "1332.
 6 12 Cufflinks exon
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                                16426 1000
                                               + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "6"; FPKM "1332.
 7 12 Cufflinks exon
                          16307
    3186006296"; frac "1.000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                                               + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "7"; FPKM "1332.
                                 16809
                                        1000
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                           17262 17313 1000 + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "8"; FPKM "1332.
    3186006296"; frac "1.000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                                              + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "9"; FPKM "1332.
                                 18046 1000
                          17919
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
11 12 Cufflinks exon
                          18347 18424 1000 + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "10"; FPKM "1332.
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                                               + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "11"; FPKM "1332.
12 12 Cufflinks exon
                           18522 18670 1000
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
                                               + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "12"; FPKM "1332.
13 12 Cufflinks exon
                          18935
                                18980
                                        1000
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
14 12 Cufflinks exon
                          19127 20204 1000
                                               + . gene_id "CUFF.1"; transcript_id "CUFF.1.1"; exon_number "13"; FPKM "1332.
    3186006296"; frac "1.0000000"; conf_lo "1276.359017"; conf_hi "1388.278184"; cov "128.176793";
15 12 Cufflinks transcript 151995 152136 1000 . . gene_id "CUFF.2"; transcript_id "CUFF.2.1"; FPKM "69187.4683199782";
    frac "1.000000"; conf_lo "29090.559643"; conf_hi "109284.376997"; cov "4234.808572";
16 12 Cufflinks exon 151995 152136 1000
                                              . gene_id "CUFF.2"; transcript_id "CUFF.2.1"; exon_number "1"; FPKM "69187.
    4683199782"; frac "1.0000000"; conf_lo "29090.559643"; conf_hi "109284.376997"; cov "4234.808572";
17 12 Cufflinks transcript 276131 285220 1000 - . gene_id "CUFF.3"; transcript_id "CUFF.3.1"; FPKM "1471.7867031351"; frac
    "1.000000"; conf_lo "1391.195509"; conf_hi "1552.377897"; cov "157.075777";
18 12 Cufflinks exon 276131 278083 1000 - . gene_id "CUFF.3"; transcript_id "CUFF.3.1"; exon_number "1"; FPKM "1471.
    7867031351"; frac "1.0000000"; conf_lo "1391.195509"; conf_hi "1552.377897"; cov "157.075777";
19 12 Cufflinks exon
                          278195 278362 1000
                                               - . gene_id "CUFF.3"; transcript_id "CUFF.3.1"; exon_number "2"; FPKM "1471.
    7867031351"; frac "1.0000000"; conf_lo "1391.195509"; conf_hi "1552.377897"; cov "157.075777";
                                               gene_id "CUFF.3"; transcript_id "CUFF.3.1"; exon_number "3"; FPKM "1471.
20 12 Cufflinks exon
                          278438 278629 1000
    7867031351"; frac "1.0000000"; conf lo "1391.195509"; conf_hi "1552.377897"; cov "157.075777";
                          279141 279322 1000
                                              - . gene_id "CUFF.3"; transcript_id "CUFF.3.1"; exon_number "4"; FPKM "1471.
21 12 Cufflinks exon
    7867031351"; frac "1.000000"; conf_lo "1391.195509"; conf_hi "1552.377897"; cov "157.075777";
22 12 Cufflinks exon
                          281896 282089 1000
                                               - . gene_id "CUFF.3"; transcript_id "CUFF.3.1"; exon_number "5"; FPKM "1471.
```

http://cole-trapnell-lab.github.io/cufflinks/cufflinks/index.html

Running Cufflinks

Run cufflinks from the command line as follows:

cufflinks [options] <aligned_reads.(sam/bam)>

The following is a detailed description of the options used to control Cufflinks:

Arguments

<aligned_reads.(sam/bam)>

A file of RNA-Seq read alignments in the SAM format. SAM is a standard short read alignment, that allows aligners to attach custom tags to individual alignments, and Cufflinks requires that the alignments you supply have some of these tags. Please see Input formats for more details.

Cufflinks General Options

-h/-help

Prints the help message and exits

-g/-GTF-guide <reference_annotation.(gtf/gff)>

Tells Cufflinks to use the supplied reference annotation a GFF file to guide RABT assembly. Reference transcripts will be tiled with faux-reads to provide additional information in assembly. Output will include all reference transcripts as well as any novel genes and isoforms that are assembled.

-M/-mask-file <mask.(gtf/gff)>

Tells Cufflinks to ignore all reads that could have come from transcripts in this GTF file. We recommend including any annotated rRNA, mitochondrial transcripts other abundant transcripts you wish to ignore in your analysis in this file. Due to variable efficiency of mRNA enrichment methods and rRNA depletion kits, masking these transcripts often improves the overall robustness of transcript abundance estimates.

-g using a gtf file as guide

Cuffmerge

cuff merge [options] * <assembly_GTF_list.txt>
create assembly_list.txt first

```
assembly_list.txt ×

1 ../cufflinks/ZV9_2cells/transcripts.gtf
2 ../cufflinks/ZV9_6h/transcripts.gtf
3
```

cuffmerge -o cuffmerge/ assembly_list.txt

cuffdiff -o cuffdiff/ cuffmerge/merged.gtf
-b ../genome/Danio_rerio.Zv9.66.dna.fa
../tophat/ZV9_2cells/accepted_hits.bam ../tophat/ZV9_6h/
accepted_hits.bam

cuffdiff -o cuffdiff/ cuffmerge/merged.gtf
-b ../genome/Danio_rerio.Zy9.66.dna.fa
../tophat/ZV9_2cells/accepted_hits.bam ../tophat/ZV9_6h/
accepted_hits.bam

come from coffmerge

cuffdiff -o cuffdiff/ cuffmerge/merged.gtf
-b ../genome/Danio_rerio.Zv9.66.dna.fa
../tophat/ZV9_2cells/accepted_hits.bam ../tophat/ZV9_6h/
accepted_hits.bam

the genome

cuffdiff -o cuffdiff/ cuffmerge/merged.gtf
-b ../genome/Danio_rerio.Zv9.66.dna.fa
../tophat/ZV9_2cells/accepted_hits.bam ../tophat/ZV9_6h/
accepted_hits.bam

come from TopHat2

```
-rw-r--r 1 languiging staff 0 Nov 20 05:28 bias_params.info
-rw-r--r 1 langylying staff 0 Nov 20 05:28 cds.count_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 cds.diff
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 cds.fpkm_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 cds.read_group_tracking
-rw-r--r-- 1 languiging staff 0 Nov 20 05:28 cds_exp.diff
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 gene_exp.diff
-rw-r--r-- 1 langylying staff 0 Nov 20 05:28 genes.count_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 genes.fpkm_tracking
-rw-r--r 1 languiging staff 0 Nov 20 05:28 genes.read_group_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 isoform_exp.diff
-rw-r--r 1 langyiying staff 0 Nov 20 05:28 isoforms.count_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 isoforms.fpkm_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 isoforms.read_group_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 promoters.diff
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 read_groups.info
-rw-r--r-- 1 languiging staff 0 Nov 20 05:28 run.info
-rw-r--r-- 1 languiging staff 0 Nov 20 05:28 splicing.diff
-rw-r--r 1 langyiying staff 0 Nov 20 05:28 tss_group_exp.diff
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 tss_groups.count_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 tss_groups.fpkm_tracking
-rw-r--r 1 langylying staff 0 Nov 20 05:28 tss_groups.read_group_tracking
-rw-r--r-- 1 langyiying staff 0 Nov 20 05:28 var_model.info
```

It's your time to play.