

General processing of HTS data

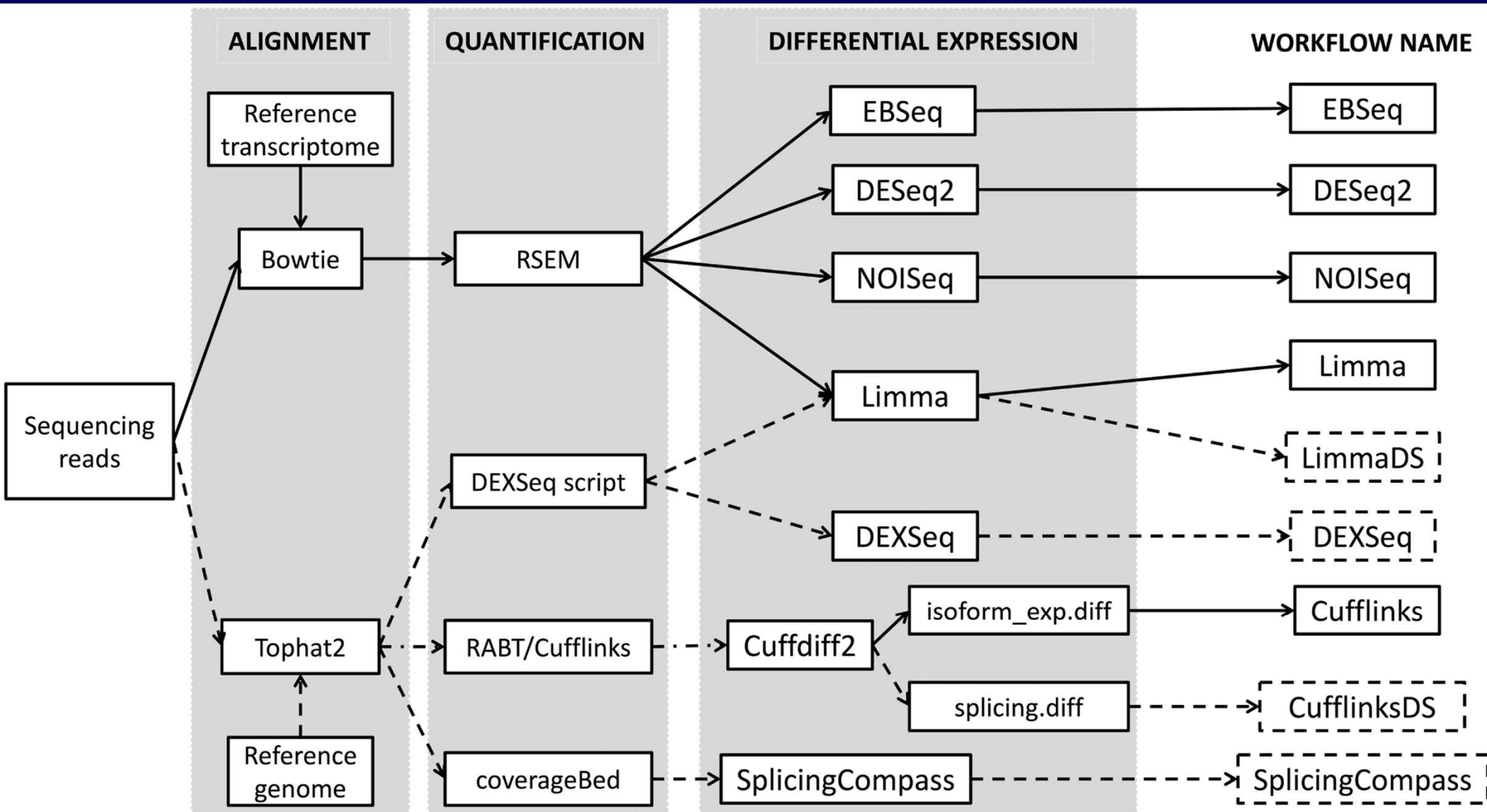
1. Mapping to the targeted genome.
2. Quantification.
3. Comparison.
4. Further analysis (GO enrichment assay, etc.)

RNA-Seq Overview

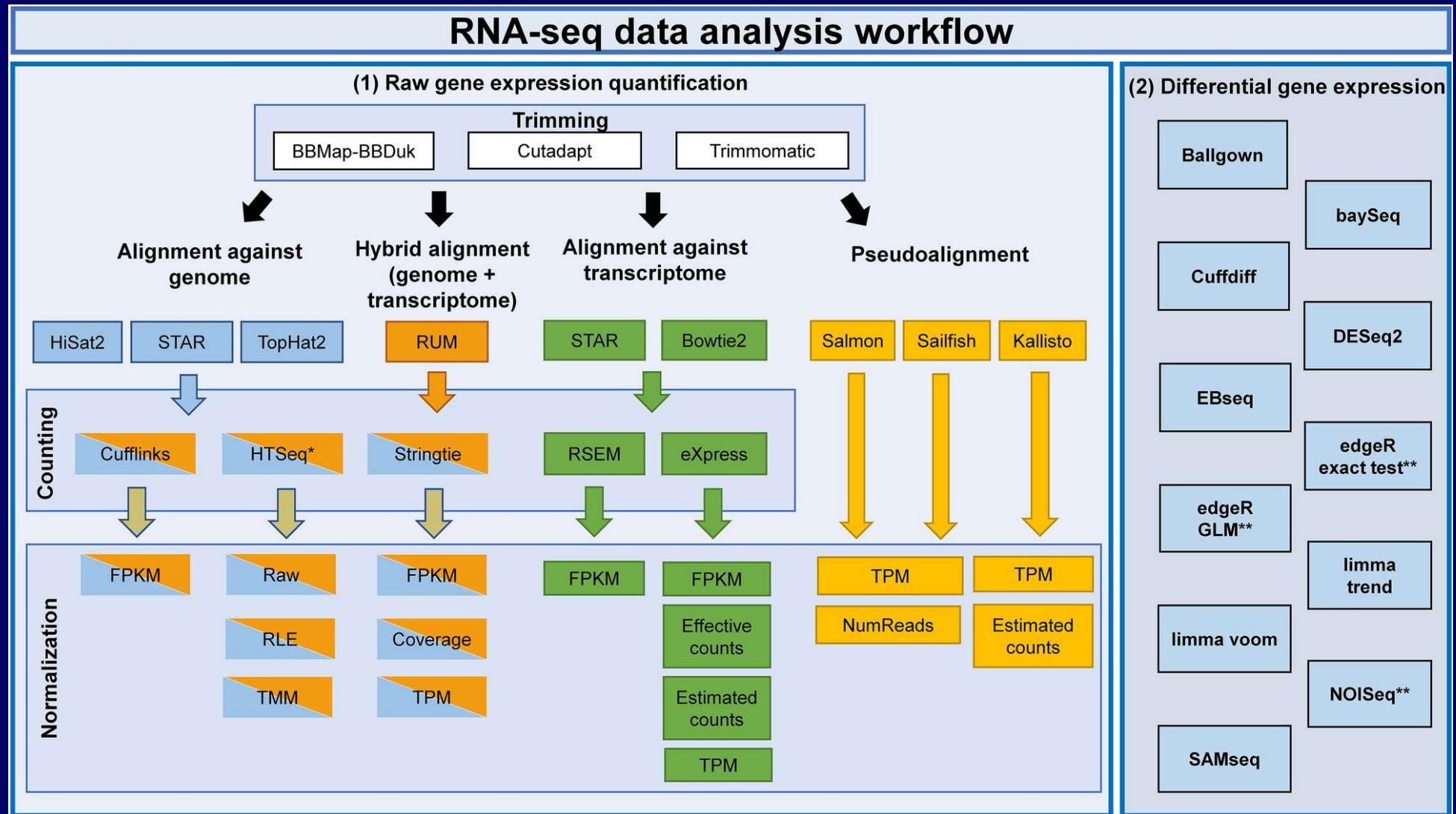
Four major steps, **semi-independent** of each other.

- I. Mapping → produce SAM/BAM or counts data.
- II. Quantification → produce RPKM for each gene/transcript.
- III. Identifying DEG (Differentially expressed genes) → gene list.
- IV. Identifying affected biological processes/pathways.

RNA-Seq overview



RNA-seq data processing options



Systematic comparison and assessment of RNA-seq procedures for gene expression quantitative analysis. *Corchete et al (2020) Sci. Rep*

RNA-seq data processing options

How to design your RNA-Seq analysis process:

❖ Based on the biological questions:

- Identifying differentially expressed gene
- Using gene expression data for clustering cancer samples.

❖ Based on objective:

- I want to identify different splicing forms and ncRNAs, vs.
- I am only interested in protein-coding genes.

RNA-seq map options

RNA-seq data analysis workflow

(1) Raw gene expression quantification

Trimming

BBMap-BBDDuk

Cutadapt

Trimmomatic

Alignment against genome

HiSat2

STAR

TopHat2

Hybrid alignment (genome + transcriptome)

RUM

Alignment against transcriptome

STAR

Bowtie2

Pseudoalignment

Salmon

Sailfish

Kallisto

Counting

Cufflinks

HTSeq*

Stringtie

RSEM

eXpress

Normalization

FPKM

Raw

RLE

TMM

FPKM

Coverage

TPM

FPKM

FPKM

Effective counts

Estimated counts

TPM

TPM

NumReads

TPM

Estimated counts

(2) Differential gene expression

Ballgown

Cuffdiff

EBseq

edgeR GLM**

limma voom

SAMseq

baySeq

DESeq2

edgeR exact test**

limma trend

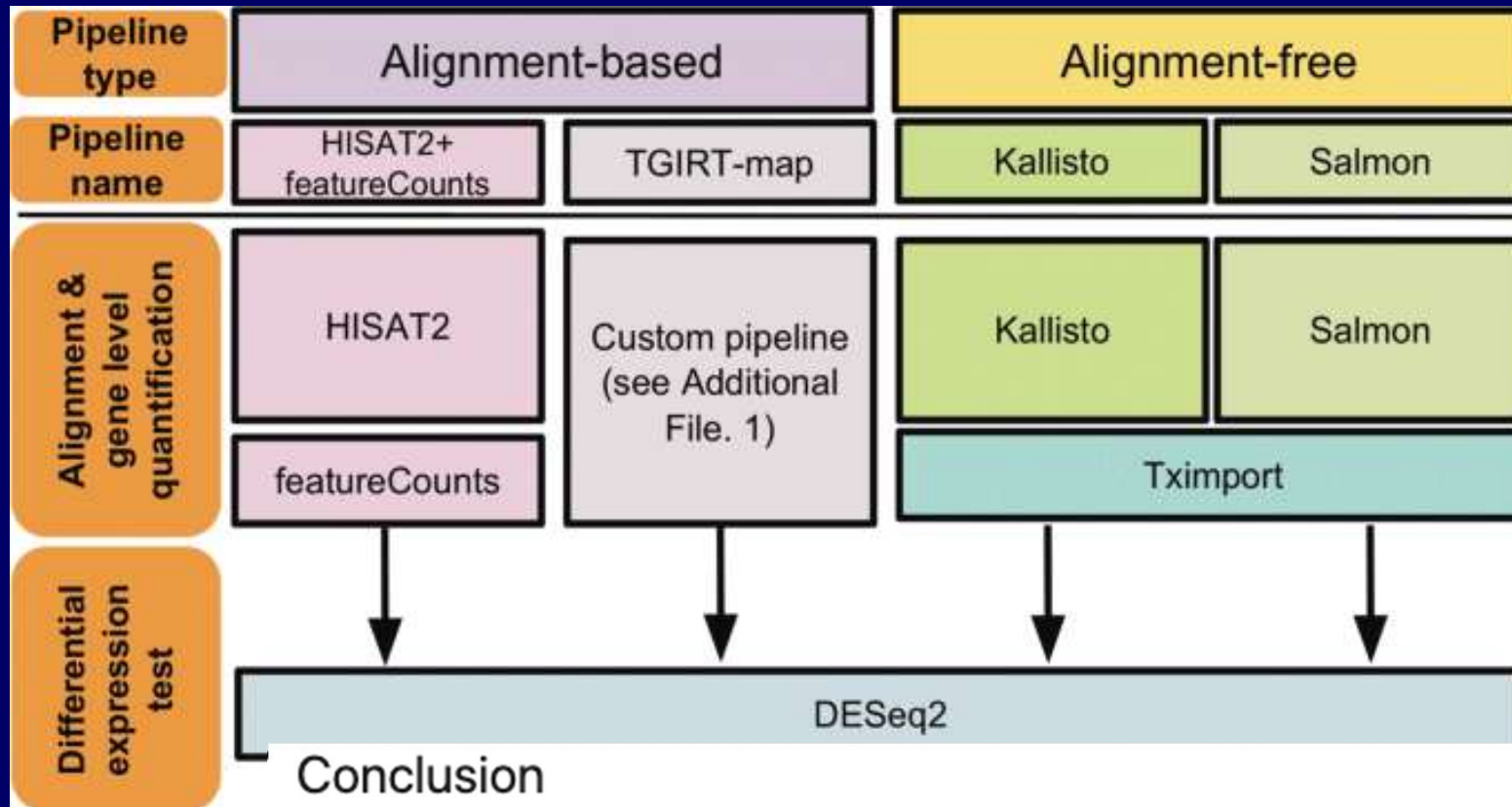
NOISeq**

RNA-Seq: map to genome

- ❑ Each algorithm applies a different mapping strategy and requires a specific index (multiple files).
- ❑ Index can be built with programs using genomic or transcriptomic sequence and GTF files as input, analogous to what you did with “makeblastdb”.
 - ❑ GTF- Gene Transfer (annotation) format.
- ❑ Given the task and resources the mapping may take minutes, or more likely hours, or even days.
 - ❑ – *you might need 12 pots of coffee if you did not use a job file.*

Limitations of alignment-free tools in total RNA-seq quantification

[Douglas C. Wu](#), [Jun Yao](#), [Kevin S. Ho](#), [Alan M. Lambowitz](#) & [Claus O. Wilke](#) 



We have shown that alignment-free and traditional alignment-based quantification methods perform similarly for common gene targets, such as protein-coding genes. However, we have identified a potential pitfall in analyzing and quantifying lowly-expressed genes and small RNAs with alignment-free pipelines, especially when these small RNAs contain biological variations.

RNA-Seq: map to genome

Q: If you are interested in identifying differentially expressed genes, de novo mRNA splicing, and novel ncRNAs in cancer samples. How would you map your RNA-Seq reads.

- a.) Map to genome with Star (or Hisat2/Tophat2).**
- b.) Map to transcriptome with Star (or bowtie).**
- c.) Get TPM with Salmon.**

Generate index from .fasta and .gtf

```
#!/bin/sh
#SBATCH --job-name=Dm6_Star_Index
#SBATCH --mail-type=ALL
#SBATCH --mail-user=leizhou@ufl.edu
#SBATCH --mem-per-cpu=6gb
#SBATCH --cpus-per-task=8
#SBATCH --qos=zhou
#SBATCH -t 3:00:00
#SBATCH --output=STAR_Index_%j.log
```

module load star

```
STAR --runThreadN 16 \
--runMode genomeGenerate \
--genomeDir Dm6.44.StarIndex \
--genomeFastaFiles ./Dm6.44.fa \
--sjdbGTFfile ./Dm6.44.gtf \
--sjdbOverhang 99
```

Map to genome - job file (Star)

```
STAR --readFilesCommand zcat --genomeDir ./index/Dm6.44.StarIndex/ \  
--sjdbGTFfile ./index/Dm6.44.gtf \  
    --runThreadN 2 --runMode alignReads --outSAMtype BAM SortedByCoordinate \  
--outBAMsortingBinsN 200 --limitBAMsortRAM 16013050982 \  
    --readFilesIn SRR1618640.fastq.gz \  
    --outFileNamePrefix ./starMap/WG_young_1
```

Map to genome – Choose resource if you have a primary account

```
#!/bin/bash
#SBATCH --job-name=StarMapping
#SBATCH --output=StarMapping_%j.log
#SBATCH --mail-type=ALL
#SBATCH --mail-user=xxxx@ufl.edu
#SBATCH --time=24:00:00
#SBATCH --qos=gms6014
#SBATCH --cpus-per-task=2
#SBATCH --mem-per-cpu=4gb
```

```
$ sbatch --account=gms6014 --qos=gms6014
jobfile
```

```
#!/bin/bash
#SBATCH --job-name=StarMapping
#SBATCH --output=StarMapping_%j.log
#SBATCH --mail-type=ALL
#SBATCH --mail-user=xxxx@ufl.edu
#SBATCH --time=24:00:00
#SBATCH --qos=YOURGROUP
#SBATCH --cpus-per-task=XXX
#SBATCH --mem-per-cpu=4gb
```

```
$ sbatch jobfile
```

RNA-Seq: Getting counts

- ☐ Raw – counts (reads) per gene.
- ☐ Normalized
 - ☐ FPKM (Fragments Per Kilobase gene length and per Million reads)
 - ☐ TPM (Transcripts Per Million)
- ☐ Depending on the which program will be used for identifying DEGs.
 - ☐ DESeq (DESeq2) requires raw counts
 - ☐ CuffLinks generated normalized counts as well as models for CuffDiff.

RNA-seq: Getting counts

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Hybrid alignment
(genome +
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TPM

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FPKM

Effective
counts

Estimated
counts

TPM

TPM

NumReads

TPM

Estimated
counts

(2) Differential gene expression

Ballgown

baySeq

Cuffdiff

DESeq2

EBseq

edgeR
exact test**

edgeR
GLM**

limma
trend

limma voom

NOISeq**

SAMseq

Getting counts with cufflinks

```
#!/bin/bash
#SBATCH --job-name=cufflink_gms6014
#SBATCH --mail-type=ALL
#SBATCH --mail-user=xxxx@ufl.edu
#SBATCH --mem-per-cpu=4gb
#SBATCH --cpus-per-task=2
#SBATCH --qos=gms6014
#SBATCH --time=8:00:00
#SBATCH --output=cufflinks_%j.log
```

```
pwd; date
```

```
module load cufflinks
```

```
cufflinks -p 2 -o WG_young_1.clout ./starMap/WG_young_1Aligned.sortedByCoord.out.bam
cufflinks -p 2 -o WG_young_2.clout ./starMap/WG_young_2Aligned.sortedByCoord.out.bam
cufflinks -p 2 -o WG_old_1.clout ./starMap/WG_old_1Aligned.sortedByCoord.out.bam
cufflinks -p 2 -o WG_old_2.clout ./starMap/WG_old_2Aligned.sortedByCoord.out.bam
```

Practice: RNA-Seq analysis

Follow instructions on the course web site.