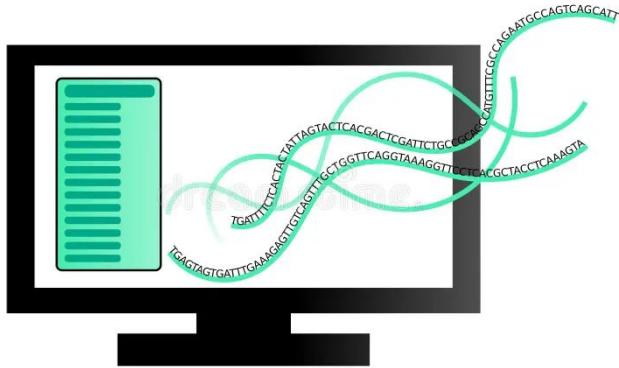


# BULK RNA-SEQ: UPSTREAM ANALYSIS



Presenter: Duy Dao

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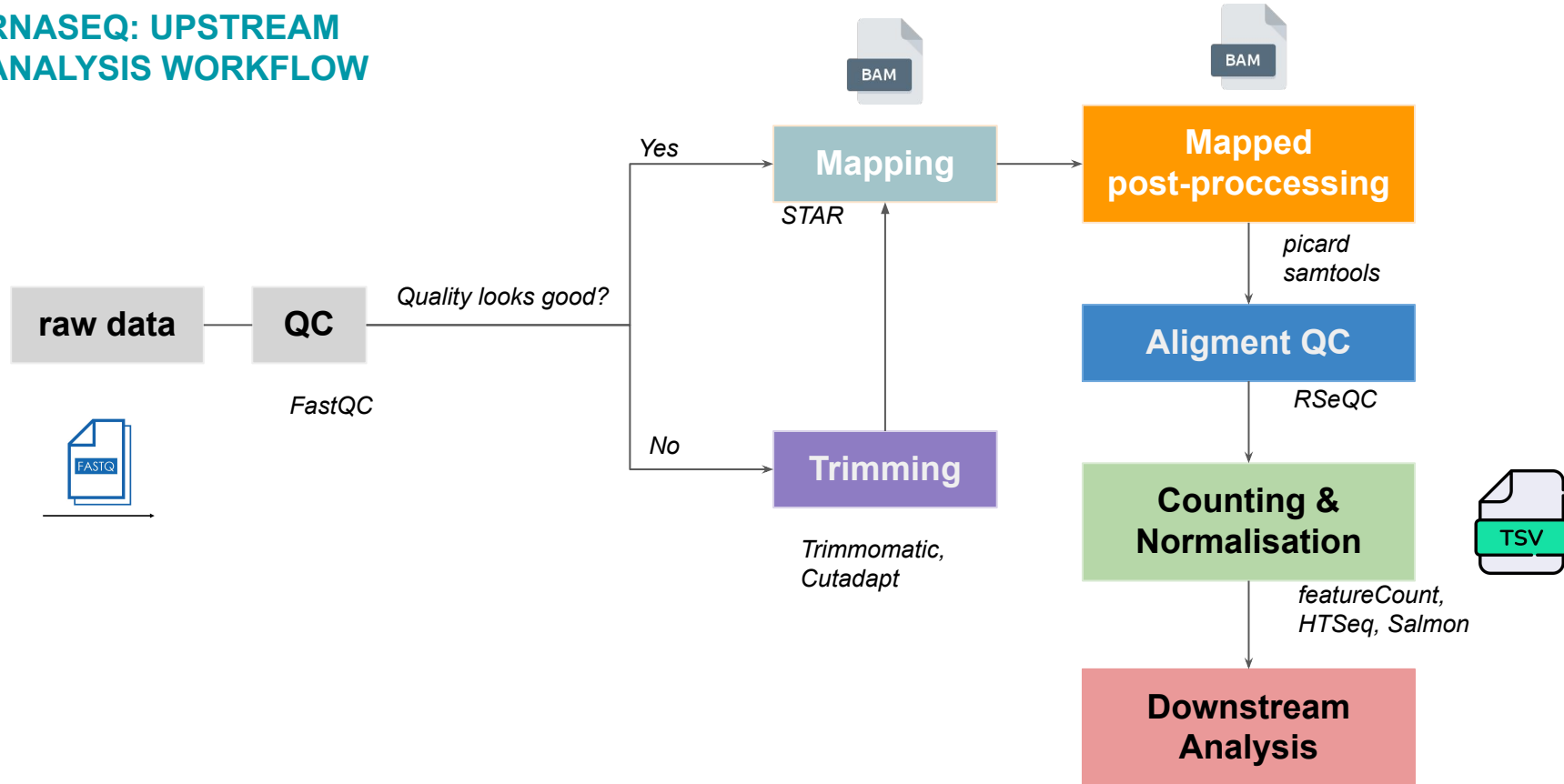
05

ALIGNMENT DATA: QUALITY CONTROL



# INTRODUCTION


## RNASEQ: UPSTREAM ANALYSIS WORKFLOW














# RAW DATA PROCESSING

## SEQUENCE QUALITY CONTROL (FASTQC)

### > FASTQC Summary

 **FastQC Report**

**Summary**

-  [Basic Statistics](#)
-  [Per base sequence quality](#)
-  [Per tile sequence quality](#)
-  [Per sequence quality scores](#)
-  [Per base sequence content](#)
-  [Per sequence GC content](#)
-  [Per base N content](#)
-  [Sequence Length Distribution](#)
-  [Sequence Duplication Levels](#)
-  [Overrepresented sequences](#)
-  [Adapter Content](#)

“FASTQC is a useful tool to check sequences quality.”

#### **Basic Statistics**

Measure	Value
Filename	NIST7035_TAAGGCGA_L001_R1_001.fastq.gz
File type	Conventional base calls
Encoding	Sanger / Illumina 1.9
Total Sequences	20203002
Total Bases	2 Gbp
Sequences flagged as poor quality	0
Sequence length	101
%GC	49

## READ TRIMMING & FILTERING

usadellab/  
**Trimmomatic**



2

Contributors

25

Issues

131

Stars

56

Forks



This program does adaptive quality trimming, head and tail crop, and adaptor removal.

*Check QC → Trim → Check QC again.*



Trimming:

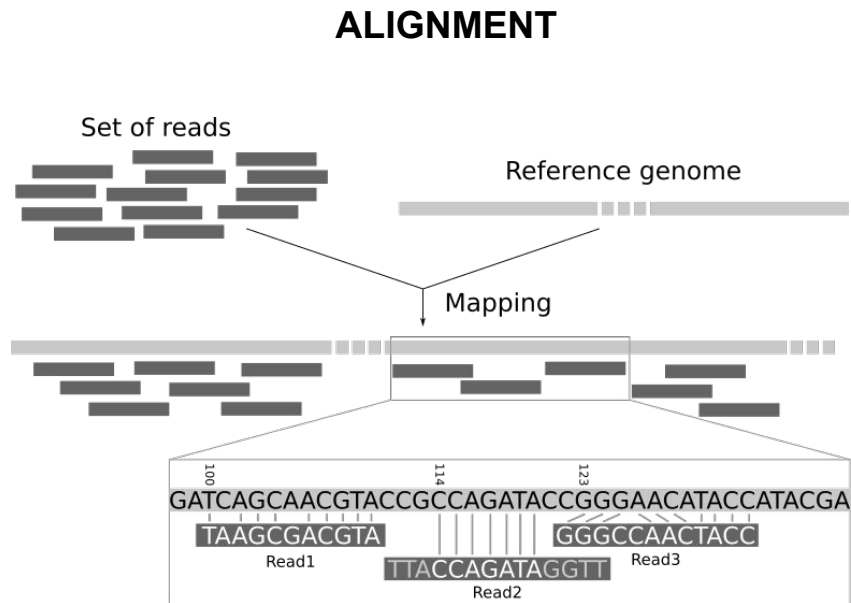
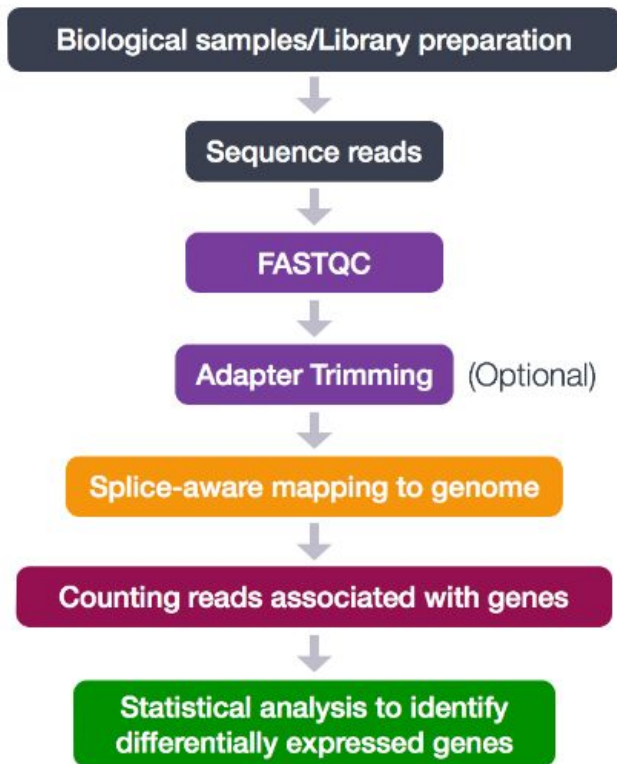
- Quality trimming
- Adapter trimming.

## Quality problems

- Quality problems typically originate either in the sequencing itself or in the preceding library preparation.
- They include low-confidence bases, sequence-specific bias, 3'/5' positional bias, polymerase chain reaction (PCR) artifacts, untrimmed adapters, and sequence contamination.
- These problems can seriously affect mapping to reference, assembly, and expression estimates, but luckily many of them can be corrected for by filtering, trimming, error correction, or bias correction.
- Some problems cannot be corrected for, but you should at least be aware of them when interpreting results.

# ALIGNMENT

# RNA-SEQ: ALIGNMENT / MAPPING



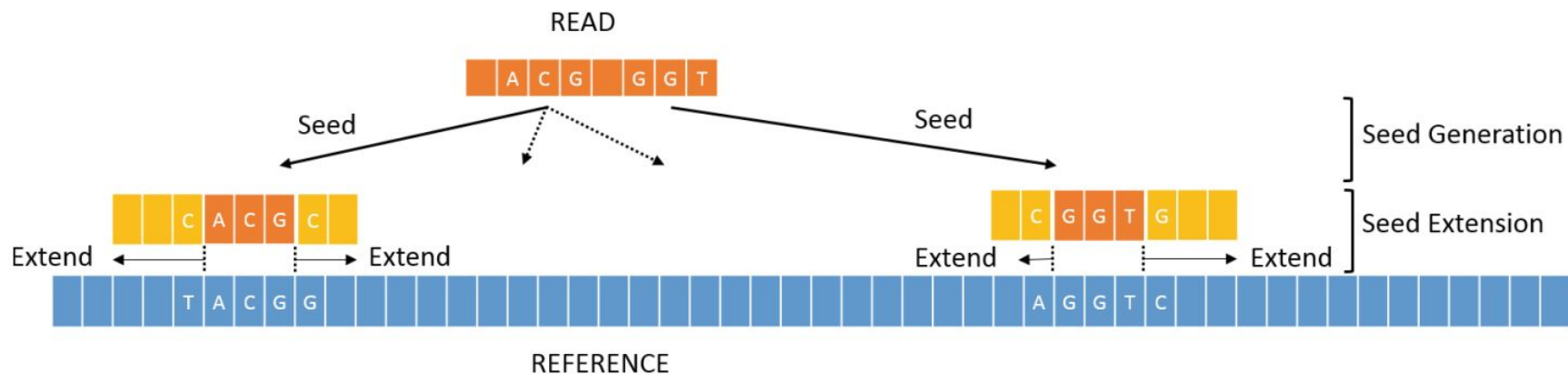
*Workflow for a RNA-seq analysis.*



# RNA-SEQ: ALIGNMENT / MAPPING

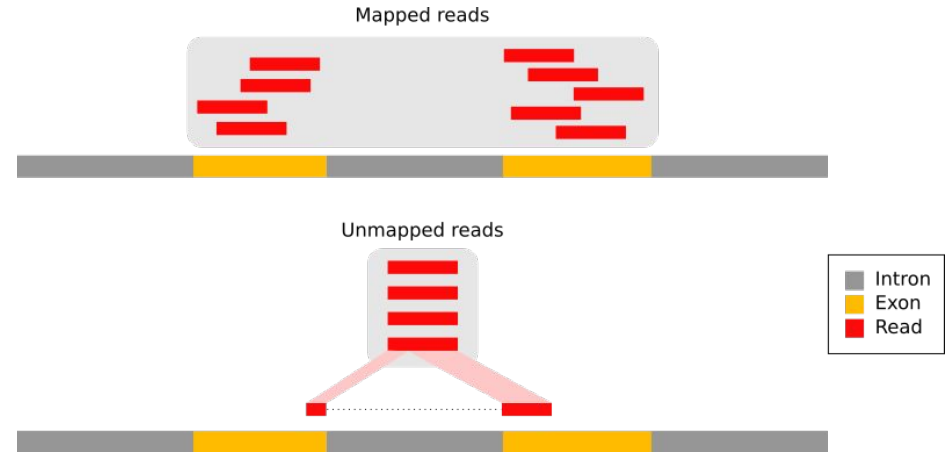
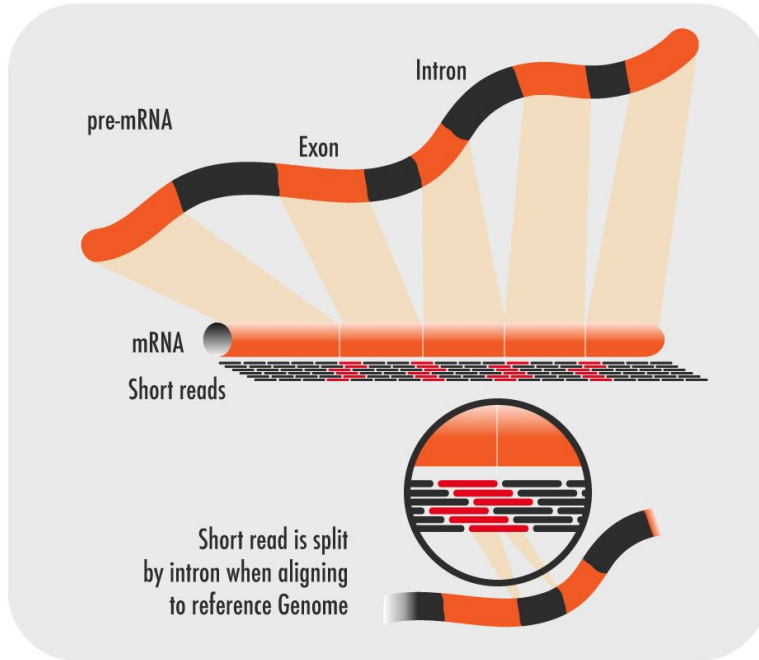
## Basic alignment (Contiguous Alignment / Non-spliced Alignment)

In contiguous alignment, sequences are aligned continuously without any gaps or interruptions.



# RNA-SEQ: ALIGNMENT / MAPPING

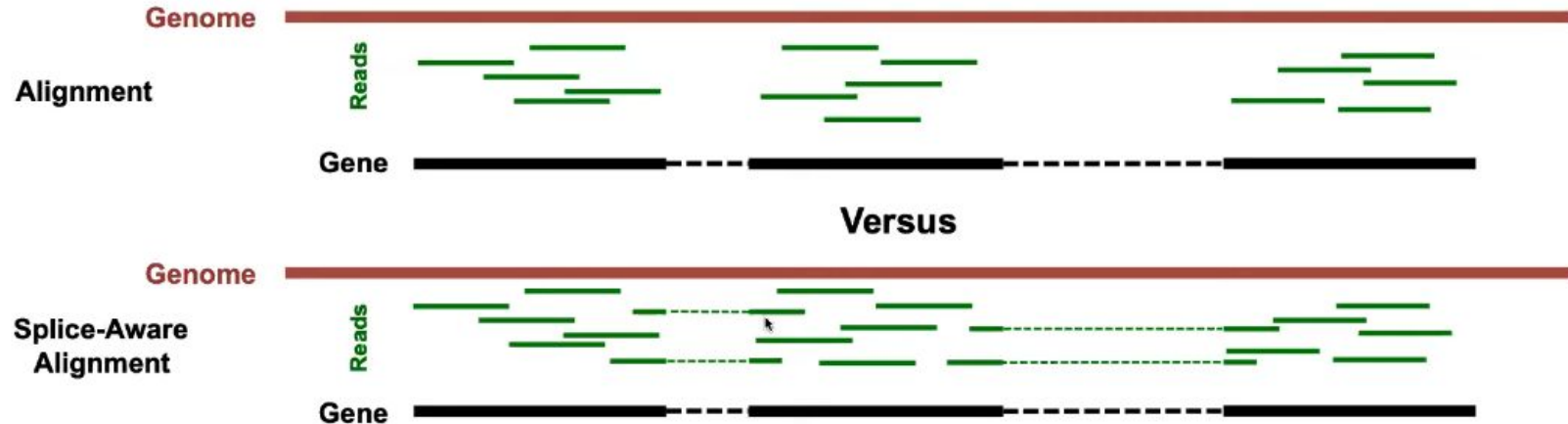
## Problem when using basic alignment to map RNA-seq data



- Unmapped reads due to intron splicing.

# RNA-SEQ: ALIGNMENT / MAPPING

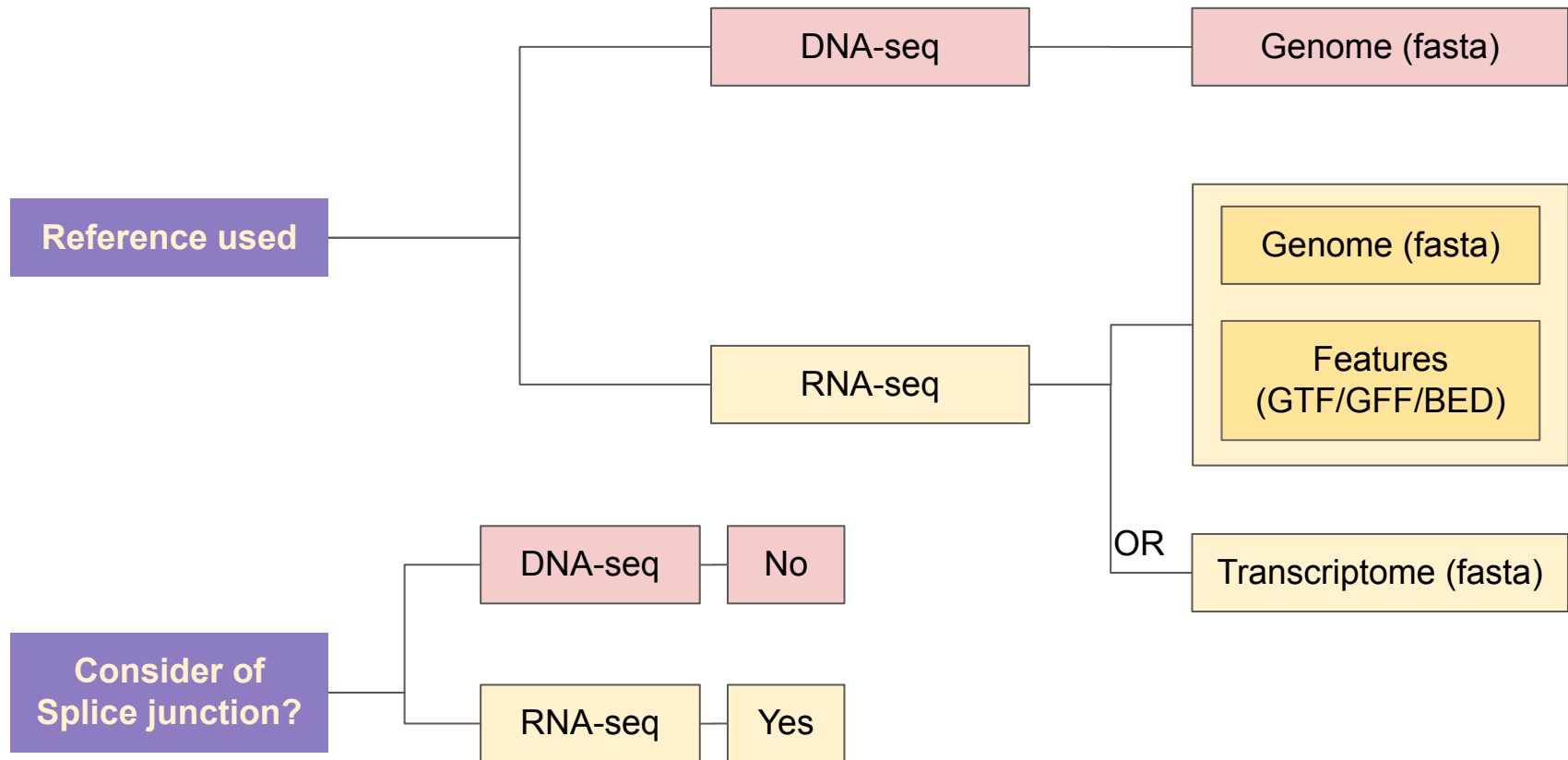
## Contiguous Alignment vs Splice-Aware Alignment



- Contiguous Aligners: BWA, Bowtie2,...
- Spliced Aligners: HiSAT2, TopHat, STAR,...

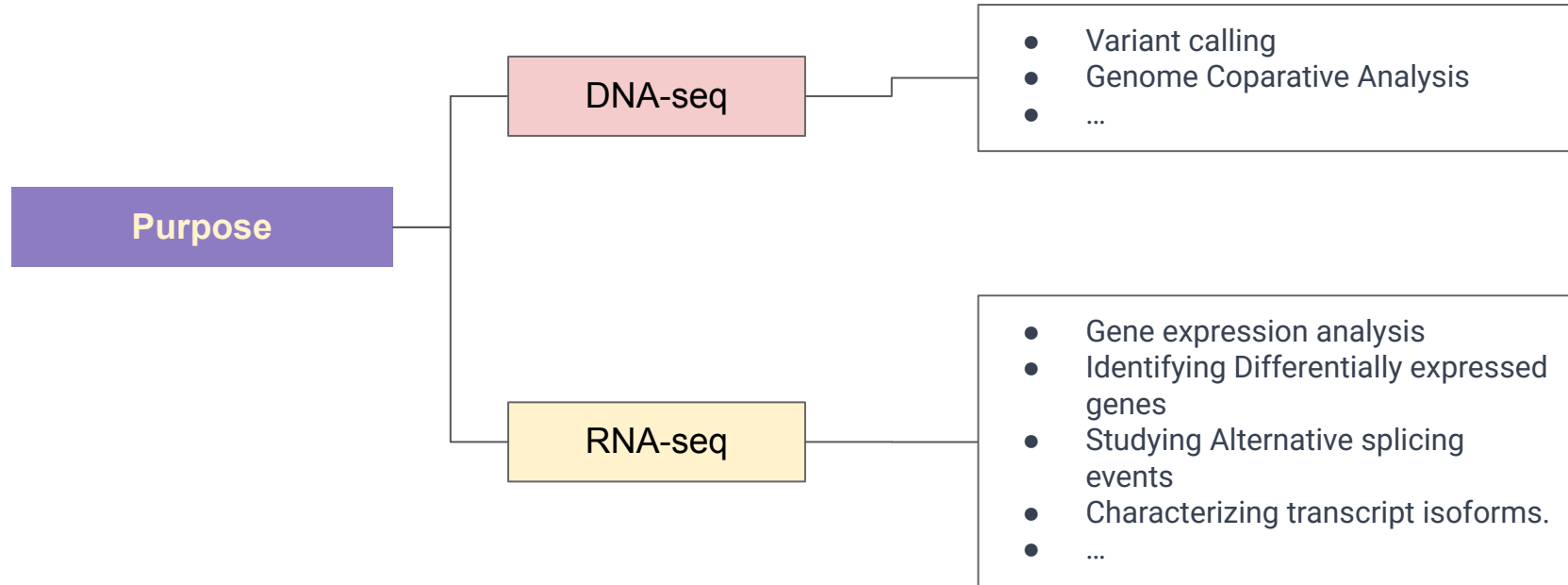
# RNA-SEQ: ALIGNMENT / MAPPING

Compare the Alignment of DNA-seq and RNA-seq



# RNA-SEQ: ALIGNMENT / MAPPING

## Compare the Alignment of DNA-seq and RNA-seq



Spliced-aware alignment algorithms employ various strategies to handle splice junctions, such as:

- **Split reads:** Allows for precise alignment across the splice junctions.
- **Novel splice junction detection:** Detect previously unknown splicing events, providing insights into alternative splicing patterns and transcriptome complexity.
- **Splice junction annotation:** Aligners may utilize existing splice junction annotations, such as those obtained from databases or previous studies, to guide the alignment process.

## alexdobin/**STAR**

RNA-seq aligner



36

Contributors

637

Issues

44

Discussions

2k

Stars

442

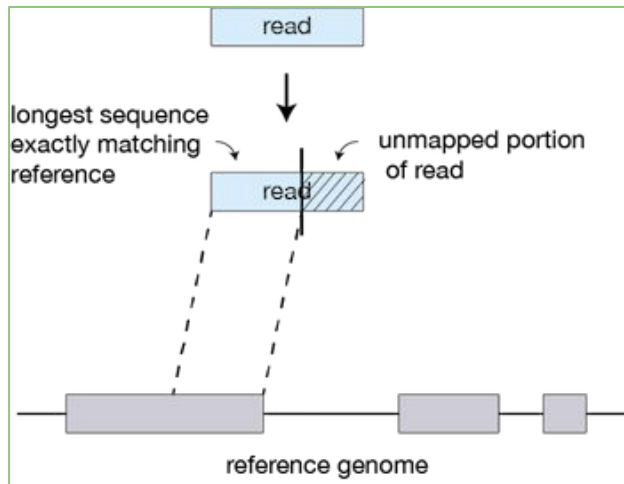
Forks



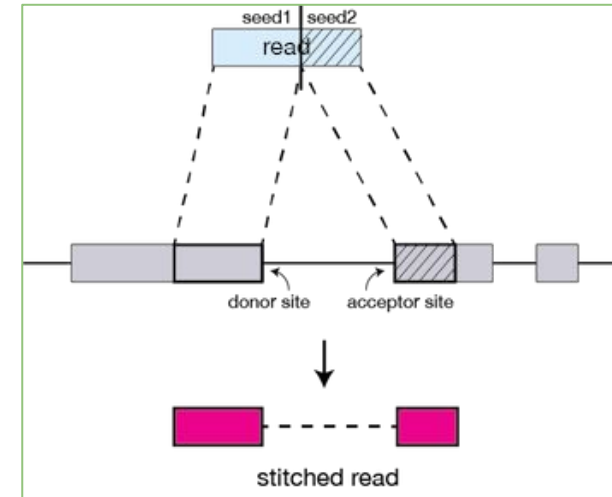
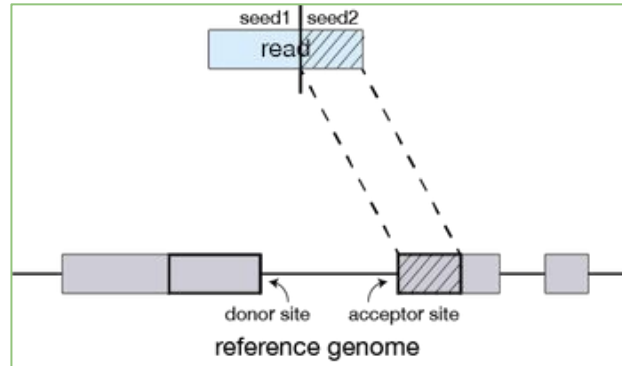
# RNA-SEQ: ALIGNMENT / MAPPING

## STAR (Spliced Transcripts Alignment to a Reference)

### STAR alignment strategy



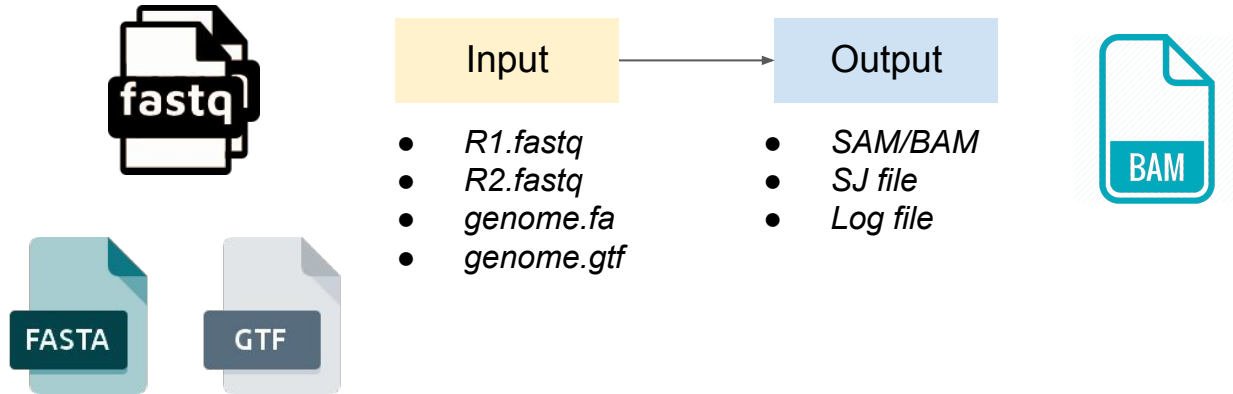
Seed searching...



Clustering, stitching, and scoring



# RNA-SEQ: ALIGNMENT / MAPPING



# RNA-SEQ: ALIGNMENT / MAPPING

## Alignment statistics & Utilities for manipulating alignment files.

```
Started job on | Jun 18 14:12:08
Started mapping on | Jun 18 14:12:13
Finished on | Jun 18 14:12:43
Mapping speed, Million of reads per hour | 666.81
```

```
Number of input reads | 5556750
Average input read length | 124
UNIQUE READS:
Uniquely mapped reads number | 4987609
Uniquely mapped reads % | 89.76%
Average mapped length | 124.32
Number of splices: Total | 244266
Number of splices: Annotated (sjdb) | 236101
Number of splices: GT/AG | 243487
Number of splices: GC/AG | 63
Number of splices: AT/AC | 11
Number of splices: Non-canonical | 705
Mismatch rate per base, % | 0.08%
Deletion rate per base | 0.01%
Deletion average length | 1.35
Insertion rate per base | 0.00%
Insertion average length | 1.07
MULTI-MAPPING READS:
Number of reads mapped to multiple loci | 270940
% of reads mapped to multiple loci | 4.88%
Number of reads mapped to too many loci | 30963
% of reads mapped to too many loci | 0.56%
UNMAPPED READS:
Number of reads unmapped: too many mismatches | 0
% of reads unmapped: too many mismatches | 0.00%
Number of reads unmapped: too short | 266450
% of reads unmapped: too short | 4.80%
Number of reads unmapped: other | 788
% of reads unmapped: other | 0.01%
CHIMERIC READS:
```

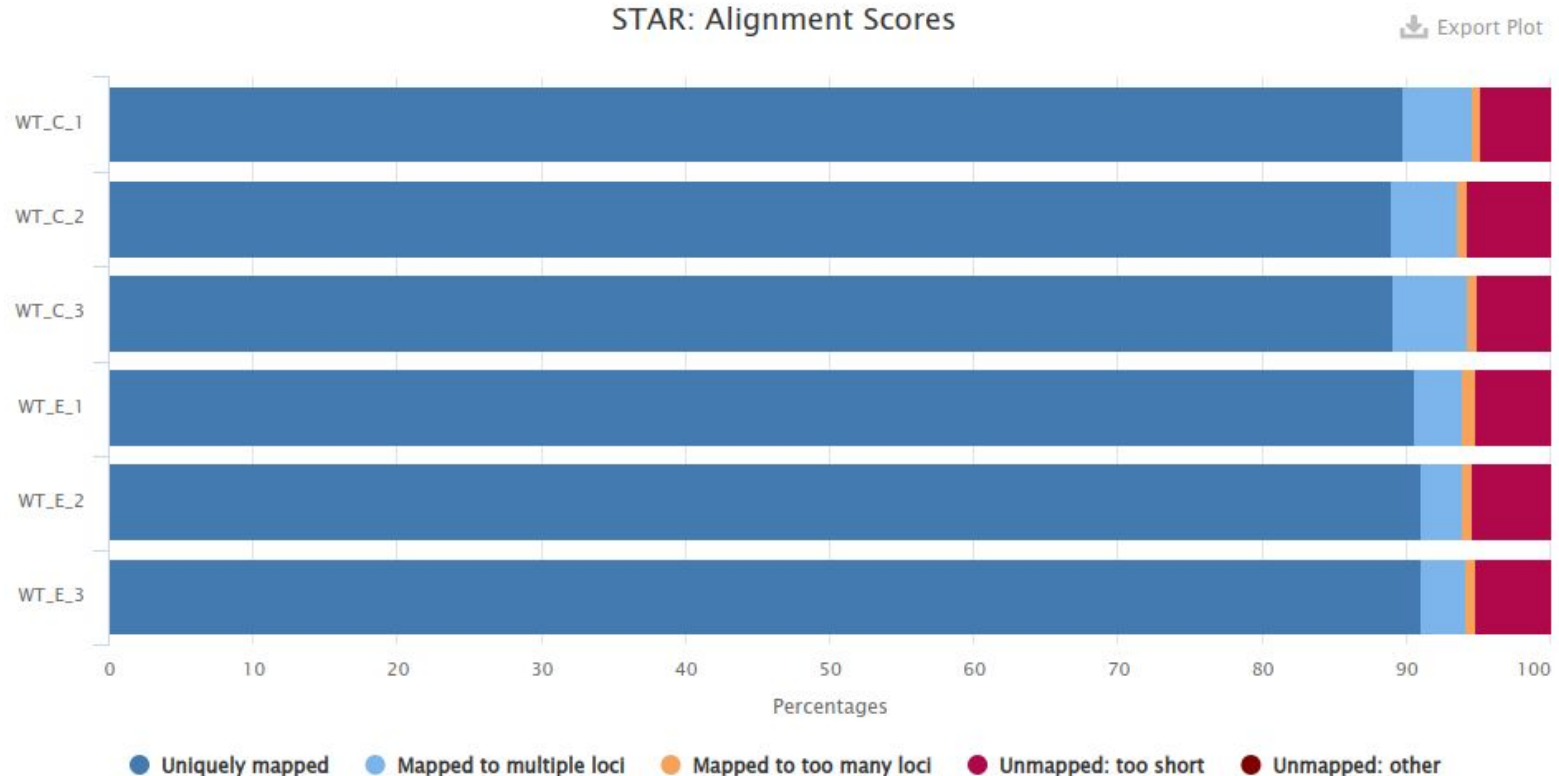
### SJ.out.tab

chrI	12728	12823	1	1	0	0	1	13
chrI	87388	87500	1	1	1	70	0	32
chrI	128525	129021	2	2	0	1	0	26
chrI	142254	142619	1	1	1	1820	0	32
chrI	142254	143349	1	1	0	1	0	22
chrI	151007	151096	2	2	1	4	0	32
chrI	206383	206517	1	1	0	2	1	25
chrII	5120	5335	2	2	0	0	1	30
chrII	45645	45977	1	1	0	1087	2	31
chrII	47059	47146	2	2	1	11	0	23
chrII	60194	60697	2	2	1	2960	0	32
chrII	89133	89440	2	2	0	81	0	31
chrII	110421	110505	2	2	1	88	0	32
chrII	110880	110948	1	1	1	23	0	32
chrII	125155	125270	1	1	1	67	0	32
chrII	142750	142846	2	2	1	181	0	32
chrII	142754	142846	2	2	0	1	0	26
chrII	167650	230011	2	2	0	0	17	12
chrII	168425	168808	1	1	1	308	0	31
chrII	170621	170804	1	1	0	6	0	27
chrII	170677	170804	1	1	1	82	0	32

The SJ.out.tab contains filtered splice junctions detected in the mapping

# RNA-SEQ: ALIGNMENT / MAPPING

Alignment statistics & Utilities for manipulating alignment files.



## RNA-SEQ: ALIGNMENT / MAPPING

## Alignment statistics & Utilities for manipulating alignment files.

## SAM format

QNAME	FLAG	RNAME	POS	MAPQ	CIGAR	RNEXT	PNEXT	TLEN	SEQ
HWI-D00119:50:H7AP8ADXX:1:1101:1322:2086	113	chr17	74243430	60	86M	=	74243430	0	GCCTGGGACTGCCAAGCGCTCCAAGTGTCCTGGCCTCGTGAGTATCCCTACCCGTGGACCTGGGACAAAGGG
HWI-D00119:50:H7AP8ADXX:1:1101:1322:2086	177	chr17	74243430	60	86M	=	74243430	0	GCCTGGGACTGCCAAGCGCGTCCAAGTGTCCTGGCCTCGTGAGTATCCCTACCCGTGGACCTGGGACAAAGGG
HWI-D00119:50:H7AP8ADXX:1:1101:1294:2087	65	chr1	49798791	60	73M	=	49798791	0	CCAAACTCGGAAGATTTTTATTTTATTTAAATATTTTCAGCATCTTTGTAATTAAGTGTTAATCCACATG
HWI-D00119:50:H7AP8ADXX:1:1101:1294:2087	129	chr1	49798791	60	73M	=	49798791	0	CCAAACTCGGAAGATTTTTATTTTATTTAAATATTTTCAGCATCTTTGTAATTAAGTGTTAATCCACATG
HWI-D00119:50:H7AP8ADXX:1:1101:1406:2159	65	chr18	9733113 60	86M	=	9733113 0	CCATGCTATAAATCTTTATTTTTTCCACTTTGGTTTGAAGTGGGATCACTTCCATTGGAGCTAATCCAGAAATGCTAATTCAGTGG	HGI	
HWI-D00119:50:H7AP8ADXX:1:1101:1406:2159	129	chr18	9733113 60	86M	=	9733113 0	CCATGCTATAAATCTTTATTTTTTCCACTTTGGTTTGAAGTGGGATCACTTCCATTGGAGCTAATCCAGAAATGCTAATTCAGTGG	HGI	
HWI-D00119:50:H7AP8ADXX:1:1101:1303:2183	65	chr6	132570953	60	86M	=	132570953	0	TTATTATGATAATCTGTATGTGAACATATTTCTGTGGCTAGACGACAGCGGAAAAAGATAGAAAACTAGTGTAA
HWI-D00119:50:H7AP8ADXX:1:1101:1303:2183	129	chr6	132570953	60	86M	=	132570953	0	TTATTATGATAATCTGTATGTGAACATATTTCTGTGGCTAGACGACAGCGGAAAAAGATAGAAAACTAGTGTAA
HWI-D00119:50:H7AP8ADXX:1:1101:1413:2244	81	chr19	56204243	0	86M	=	56195531	-8798	TTGCCGCTCATGCAAGTTGTGGACTTTCATTTTCTGAGGAGCTTCTATACCTGTCTCCATATCCGGTCTCTCA
HWI-D00119:50:H7AP8ADXX:1:1101:1413:2244	161	chr19	56195531	0	86M	=	56204243	8798	GGGATGTAAATTAGAGCAGCGCATATGGAGCAGATAGAAAGCTCTCCAGAAAATGAAAGTCCCAACACTCTCA
HWI-D00119:50:H7AP8ADXX:1:1101:1372:2246	113	chr19	50402338	60	86M	=	50402338	0	CGCGCCCTACGAGGCCAACGTCGACTTTGAGATCCGGTACGGCTCTGCCTCACTTCTCCGGCTCTATCCCCAC
HWI-D00119:50:H7AP8ADXX:1:1101:1372:2246	177	chr19	50402338	60	86M	=	50402338	0	CGCGCCCTACGAGGCCAACGTCGACTTTGAGATCCGGTACGGCTCTGCCTCACTTCTCCGGCTCTATCCCCAC
HWI-D00119:50:H7AP8ADXX:1:1101:1613:2099	113	chr1	172749268	27	86M	=	172749268	0	TGCTATTCTCGCCTCACTGGTAACCTCAACCTCGGGATGTATCAAACACTATATGCAGCTTTACCCACTGAAGTT
HWI-D00119:50:H7AP8ADXX:1:1101:1613:2099	177	chr1	172749268	27	86M	=	172749268	0	TGCTATTCTCGCCTCACTGGTAACCTCAACCTCGGGATGTATCAAACACTATATGCAGCTTTACCCACTGAAGTT
HWI-D00119:50:H7AP8ADXX:1:1101:1644:2101	113	chr1	76700193	46	86M	=	76700193	0	GGAAGCTGGCATCACTGAGAAGTTGTTTTCGACGACAGCAAGGTCATCGCAGATAACGTGAAGGACTGGAGCAA
HWI-D00119:50:H7AP8ADXX:1:1101:1644:2101	177	chr1	76700193	46	86M	=	76700193	0	GGAAGCTGGCATCACTGAGAAGTTGTTTTCGACGACAGCAAGGTCATCGCAGATAACGTGAAGGACTGGAGCAA
HWI-D00119:50:H7AP8ADXX:1:1101:1657:2113	65	chr8	85661599	0	86M	=	85654762	-6838	GCTGTG
HWI-D00119:50:H7AP8ADXX:1:1101:1657:2113	129	chr8	85654762	0	86M	=	85661599	6838	CGTGTG
HWI-D00119:50:H7AP8ADXX:1:1101:1777:2104	113	chr19	18784989	60	86M	=	18784989	0	GGAGCG
HWI-D00119:50:H7AP8ADXX:1:1101:1777:2104	177	chr19	18784989	60	86M	=	18784989	0	GGAGCG
HWI-D00119:50:H7AP8ADXX:1:1101:1830:2136	65	chr1	227731993	60	86M	=	227731993	0	CAGGGG
HWI-D00119:50:H7AP8ADXX:1:1101:1830:2136	129	chr1	227731993	60	86M	=	227731993	0	CAGGGG
HWI-D00119:50:H7AP8ADXX:1:1101:2021:2071	65	chr17	18541691	0	86M	=	18541691	0	ACCAAA
HWI-D00119:50:H7AP8ADXX:1:1101:2021:2071	129	chr17	18541691	0	86M	=	18541691	0	ACCAAA
HWI-D00119:50:H7AP8ADXX:1:1101:2027:2162	65	chr2	39673045	60	86M	=	39673045	0	GTGCTC
HWI-D00119:50:H7AP8ADXX:1:1101:2027:2162	129	chr2	39673045	60	86M	=	39673045	0	GTGCTC
HWI-D00119:50:H7AP8ADXX:1:1101:2340:2087	65	chr2	232386840	60	86M	=	232386840	0	CGCCCT
HWI-D00119:50:H7AP8ADXX:1:1101:2340:2087	129	chr2	232386840	60	86M	=	232386840	0	CGCCCT
HWI-D00119:50:H7AP8ADXX:1:1101:2340:2087	129	chr4	9326689	0	86M	=	9331435 4747	CGAGGGAGGGCCAGGAGATCC	
HWI-D00119:50:H7AP8ADXX:1:1101:2340:2087	129	chr4	9331435 0	86M	=	9326689 -4747	CGAGGGAGGGCCAGGAGATCC		

Alignment section

Table 9.1. Mandatory fields of the SAM Format.			
Col	Field	Description	Example
1	QNAME	Query template NAME	read.1
2	FLAG	Bitwise FLAG	0
3	RNAME	Reference sequence NAME	chrE
4	POS	Left-most mapping POSITION (1-based)	11
5	MAPQ	MAPping Quality	37
6	CIGAR	CIGAR string	10M
7	RNEXT	Ref. name of the mate or NEXT read	*
8	PNEXT	Position of the mate or NEXT read	0
9	TLEN	Observed Template LENGTH	0
10	SEQ	Segment SEQUENCE	ACGCATACTG
11	QUAL	Base QUALity string	DIGAFHHBCA

*Note:* Each line in the alignment section of a SAM file comprises 11 mandatory fields.

# RNA-SEQ: ALIGNMENT / MAPPING

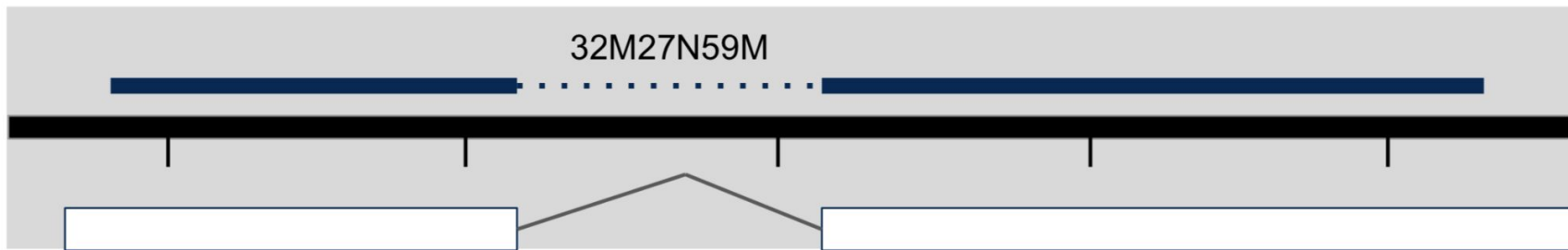
**Alignment statistics & Utilities for manipulating alignment files.**

## **CIGAR string with “N”**

The "N" in the CIGAR string represents a stretch of skipped reference bases (also known as introns or gaps) in a sequence alignment.

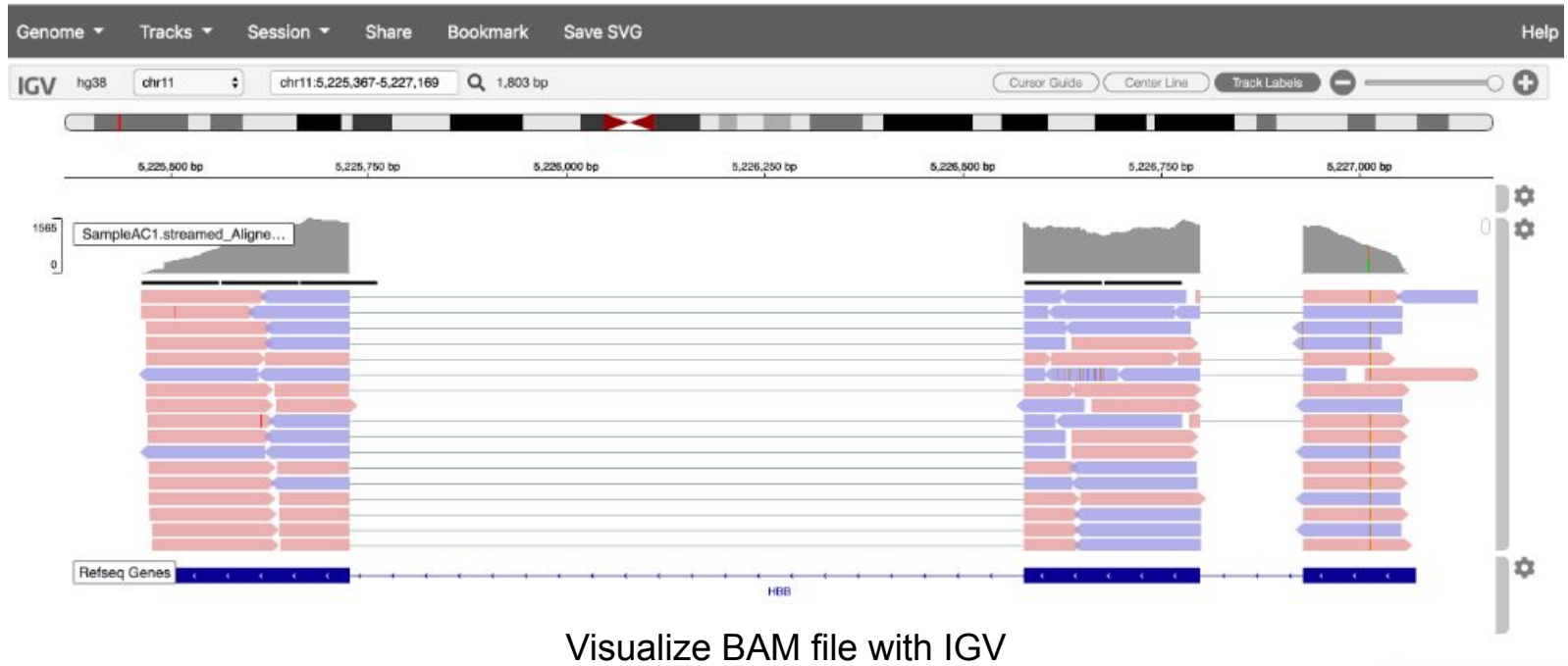
It indicates that the read aligns to the reference genome, but there is a region of the reference sequence that is not covered by the read.

### **Splicing:**



# RNA-SEQ: ALIGNMENT / MAPPING

Alignment statistics & Utilities for manipulating alignment files.



# **ALIGNMENT QUALITY CONTROL**

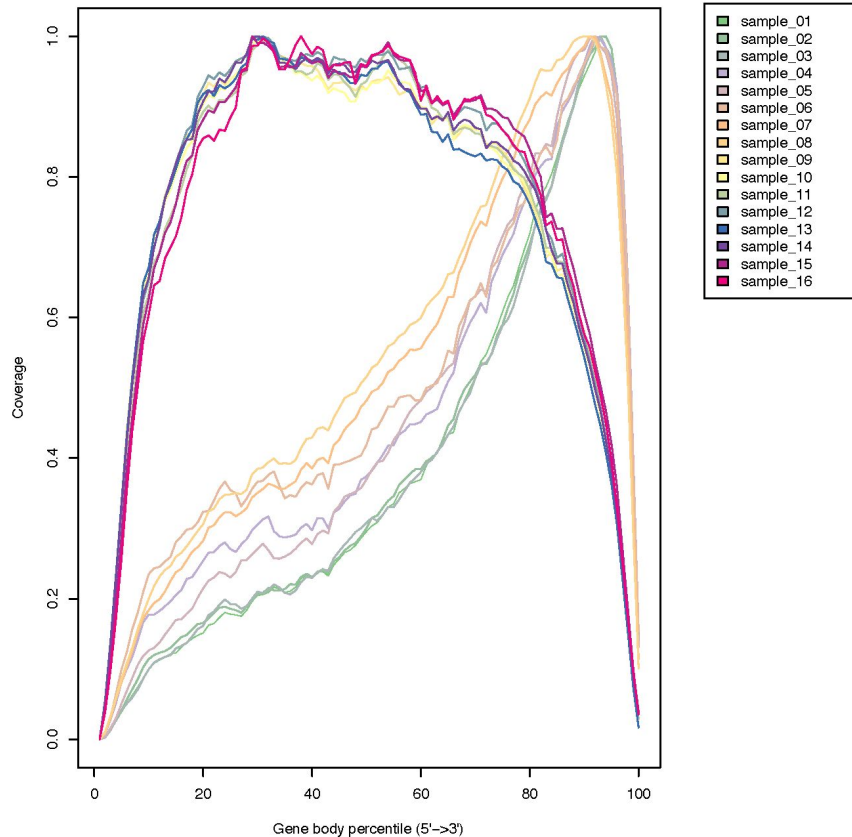
Alignment quality metrics:

- Coverage uniformity along transcripts
- Saturation of sequencing depth
- Ribosomal RNA content (rRNA)
- Read distribution between exons, introns & intergenic regions.
- ...



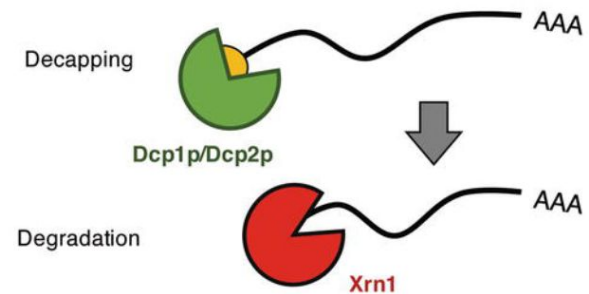
# RNA-SEQ: ALIGNMENT QUALITY CONTROL

## RSeQC: Genebody Coverage



→ Used to assess the sequencing depth and coverage across the entire length of genes

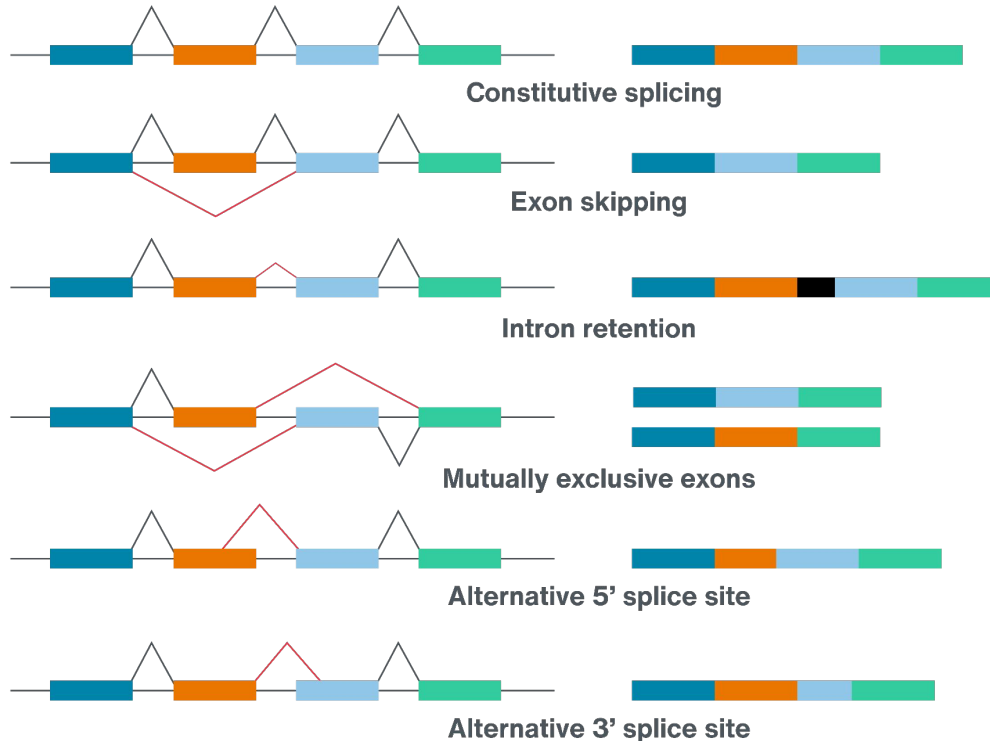
- Gene expression quantification
- Transcript isoform analysis
- Detection of gene expression biases
- Assessing RNA integrity and sample quality



*Which samples may have been degraded?*

# RNA-SEQ: ALIGNMENT QUALITY CONTROL

## RSeQC: Junction Annotation



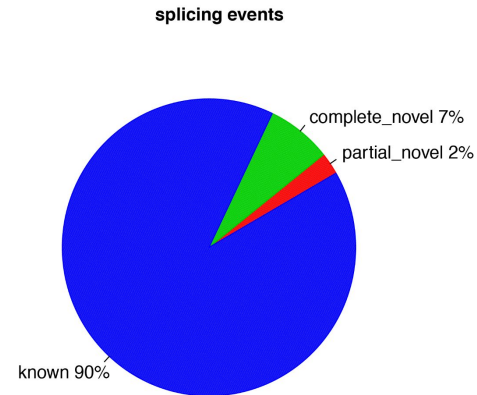
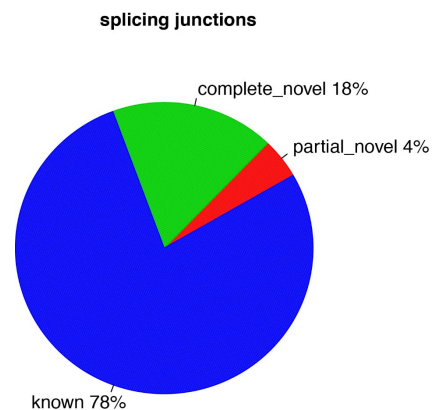
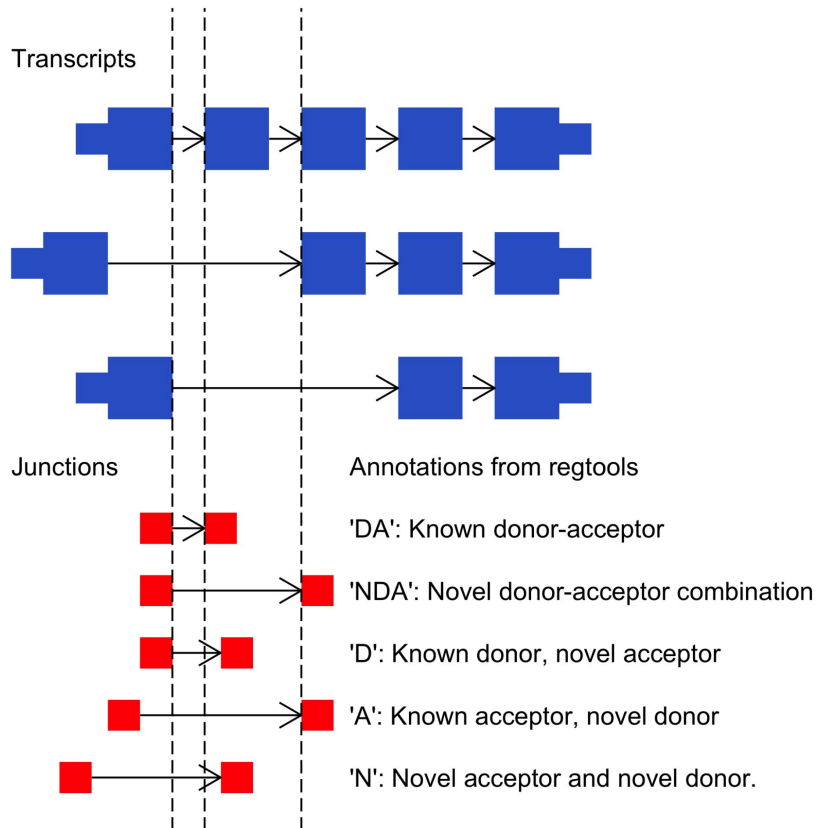
*Splice variation*

The junction-annotation command:

1. Search an RNA-Seq bam file for splice junctions.
2. Compare them to a gene model.
3. Output whether the found junctions are novel, partially novel, or already annotated in a gene model.

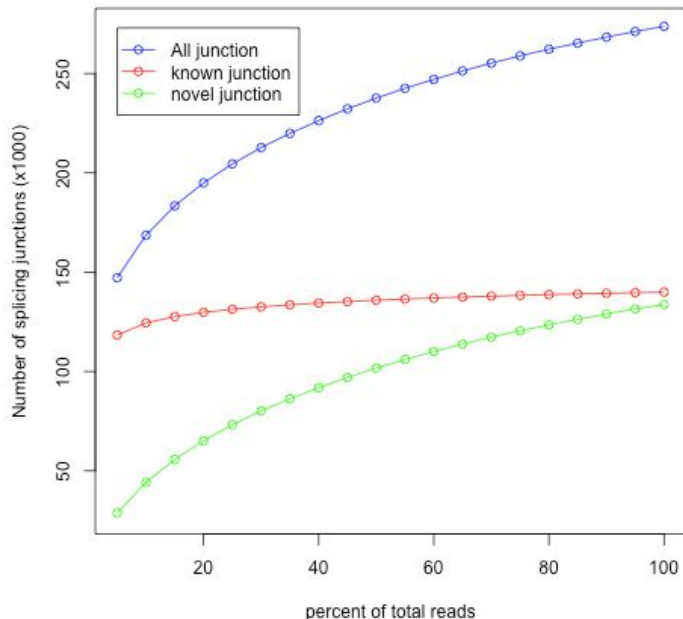
# RNA-SEQ: ALIGNMENT QUALITY CONTROL

## RSeQC: Junction Annotation



# RNA-SEQ: ALIGNMENT QUALITY CONTROL

## RSeQC: Junction Saturation



*A sample that reaches a plateau before getting to 100% data indicates that all junctions in the library have been detected, and that further sequencing will not yield more observations.*

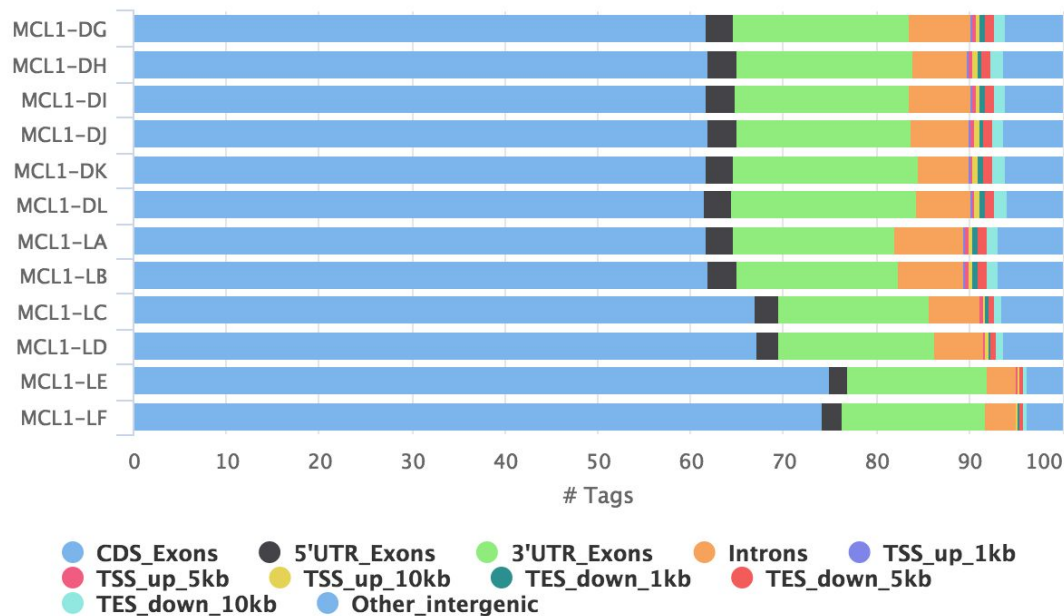
### Junction Saturation Analysis

- Evaluates the depth of sequencing coverage at splice junctions.
  - It helps determine if sufficient sequencing depth has been achieved to capture the full diversity of splice junctions.
- Guides decisions on whether additional sequencing is needed to achieve more comprehensive coverage.
- Ensures confidence in downstream analyses (alternative splicing analysis, isoform discovery).

# RNA-SEQ: ALIGNMENT QUALITY CONTROL

## RSeQC: Read Distribution

RSeQC: Read Distribution



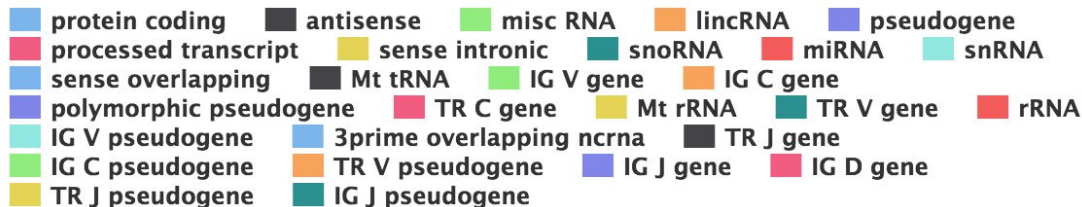
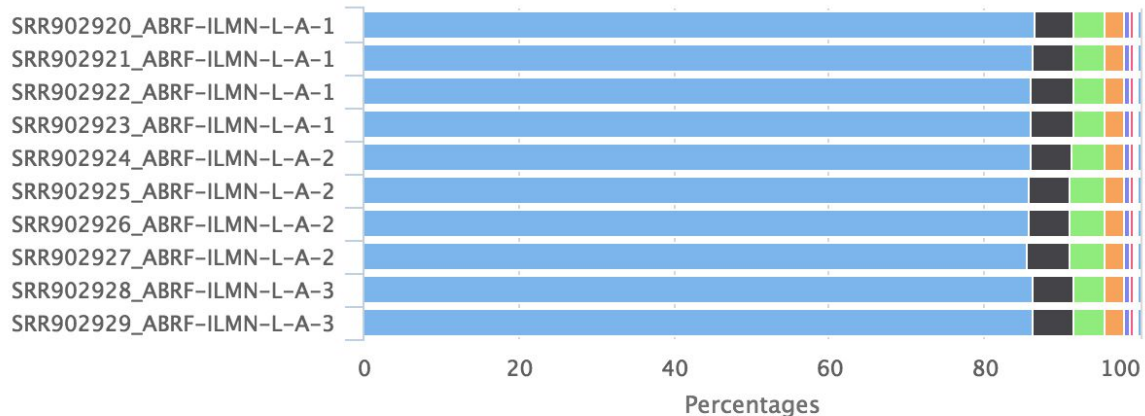
Calculate how mapped reads were distributed over genome feature (like CDS exon, 5'UTR exon, 3' UTR exon, Intron, Intergenic regions).

Created with MultiQC

# RNA-SEQ: ALIGNMENT QUALITY CONTROL

## Biotypes Count

featureCounts Biotypes

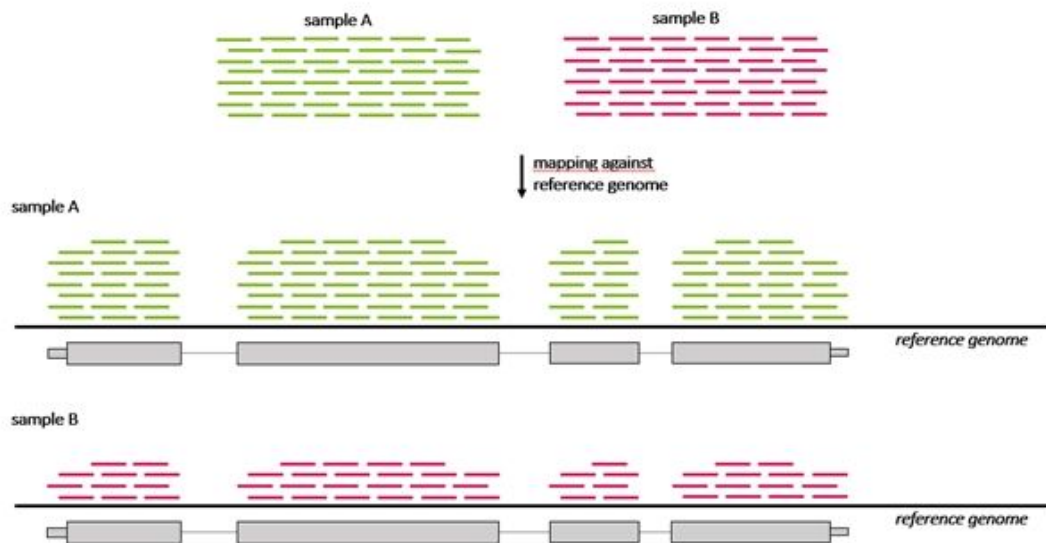


- A good RNAseq sample should have a large portion of the reads coming from protein coding genes.
- This plot can help you spot problems with your library such as incomplete rRNA depletion.

# QUANTIFICATION

# RNA-SEQ: QUANTIFICATION

## Quantification - Read Count



Count how many reads have mapped to each gene.

→ Using the **featureCounts** tool to get the gene counts

**Input:** BAM + GTF

**Output:** Number of reads (counts) associated with each feature of interest (genes, exons, transcript, etc.).



# RNA-SEQ: QUANTIFICATION

## Counting reads with featureCounts

- Accurate, fast and is relatively easy to use
- Counts reads that map to a single location (uniquely mapping) and follows the scheme in the figure below for assigning reads to a gene/exon.

aligned read:

start: 113217600 end: 113217650



GTF

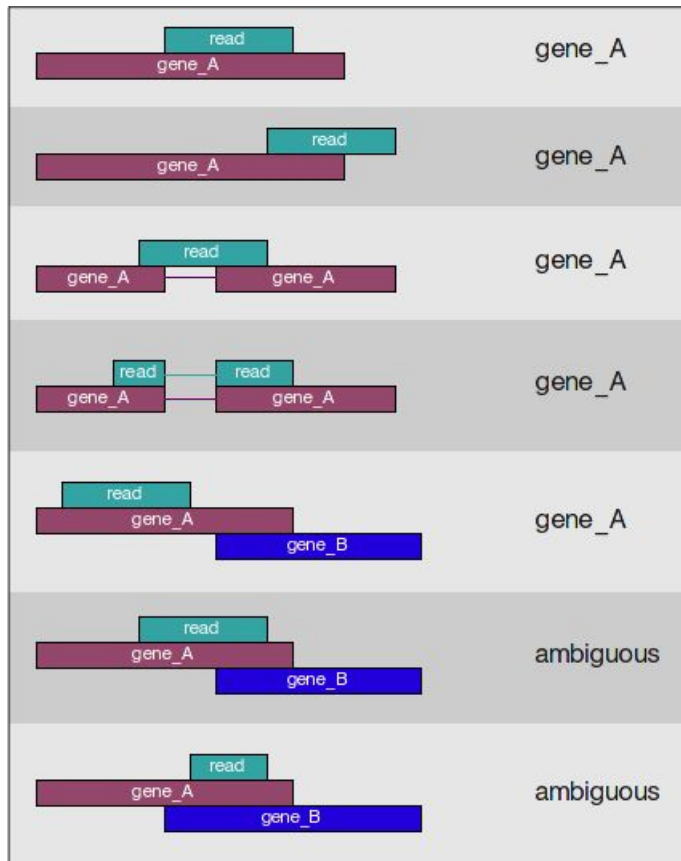
chr1	unknown	exon	113217048	113217252	.	+	.	gene_id	"MOV10";p_id	"P5535";transcript_id	"NM_001130079"
chr1	unknown	exon	113217048	113217351	.	+	.	gene_id	"MOV10";p_id	"P5535";transcript_id	"NM_020963"
chr1	unknown	exon	113217470	113217671	.	+	.	gene_id	"MOV10";p_id	"P5535";transcript_id	"NM_001130079"
chr1	unknown	CDS	113217535	113217671	.	+	0	gene_id	"MOV10";p_id	"P5535";transcript_id	"NM_001130079"
chr1	unknown	start_codon	113217535	113217537	.	+	.	gene_id	"MOV10";p_id	"P5535";transcript_id	"NM_001130079"

↑  
feature type

↑  
feature

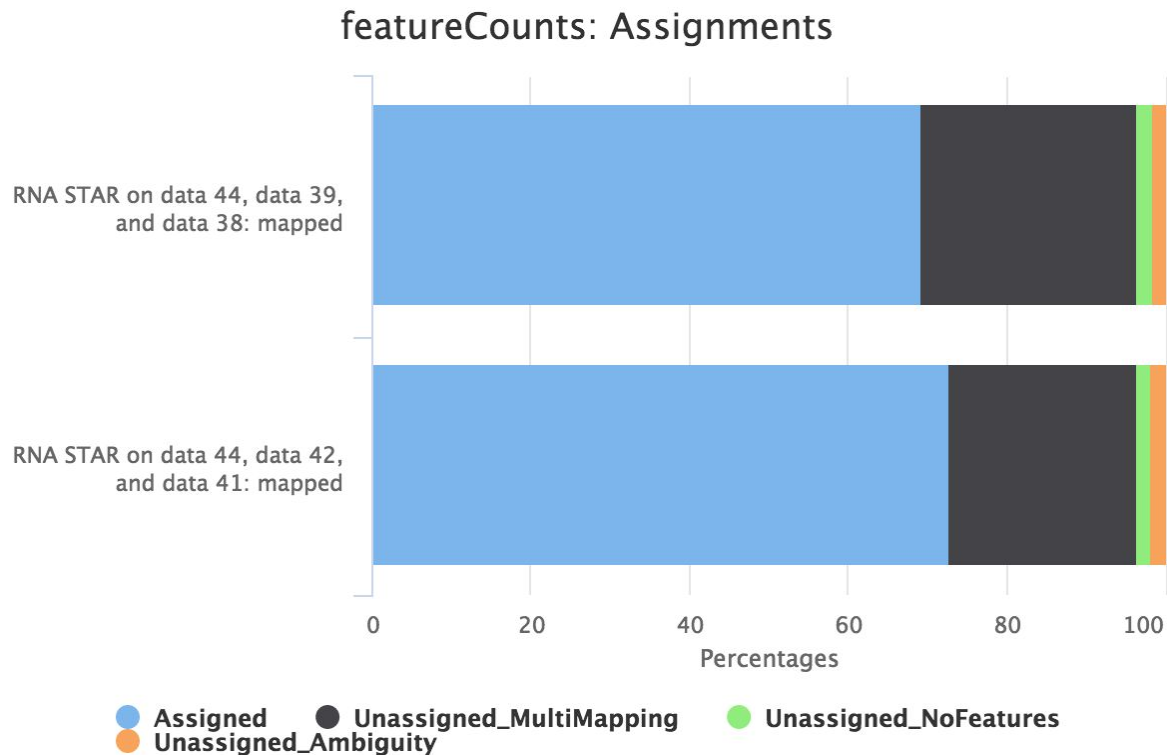
# RNA-SEQ: QUANTIFICATION

## Counting reads using featureCounts



- A read is said to overlap a feature if at least one read base is found to overlap the feature.
- For paired-end data, a fragment (or template) is said to overlap a feature if any of the two reads from that fragment is found to overlap the feature.
- If strandedness is specified, then in addition to considering the genomic coordinates it will also take the strand into account for counting.

# RNA-SEQ: QUANTIFICATION



Created with MultiQC

*Example of a featureCounts Assignment.*

# RNA-SEQ: QUANTIFICATION

## Counting reads using featureCounts

gene	Location		Strand	Length	Count									
# Program:featureCounts v2.0.2; Command:"featureCounts" "-p" "-a" "/mnt/d4t/DATA/PROJECT/RNA_seq/sacCer2/ref/annotation/sacCer3.ensG														
GeneId	Chr	Start	End	Strand	Length	WT_C_1	WT_C_2	WT_C_3	WT_E_1	WT_E_2	WT_E_3			
YDL248W	chrIV	1802	2953	+	1152	164	132	148	337	94	378			
YDL247W-A	chrIV	3762	3836	+	75	0	0	0	3	0	0	6		
YDL247W	chrIV	5985	7814	+	1830	0	0	1	0	0	4			
YDL246C	chrIV	8683	9756	-	1074	0	0	2	0	0	6			
YDL245C	chrIV	11657	13360	-	1704	14	2	6	38	6	12			
YDL244W	chrIV	16204	17226	+	1023	14	6	6	39	19	27			
YDL243C	chrIV	17577	18566	-	990	115	94	100	292	142	215			
YDL242W	chrIV	18959	19312	+	354	5	13	9	16	4	26			
YDL241W	chrIV	20635	21006	+	372	89	46	60	16	2	13			
YDL240C-A	chrIV	22471	22608	-	138	5	1	1	1	2	2			
YDL240W	chrIV	22823	25876	+	3054	191	166	245	112	27	200			
YDL239C	chrIV	26403	28775	-	2373	82	146	128	409	136	506			
YDL238C	chrIV	28985	30454	-	1470	101	79	92	555	91	346			
YDL237W	chrIV	30657	31829	+	1173	553	381	536	827	322	1330			
YDL236W	chrIV	32296	33234	+	939	1886	1855	1661	3095	459	1820			
YDL235C	chrIV	33415	33918	-	504	1306	1405	900	1364	385	965			
YDL234C	chrIV	34237	36477	-	2241	648	601	881	2822	1148	2386			
YDL233W	chrIV	36797	38173	+	1377	132	158	147	391	193	463			
YDL232W	chrIV	38487	38597	+	111	545	533	443	353	153	429			
YDL231C	chrIV	38867	42244	-	3378	681	565	552	586	139	451			
YDL230W	chrIV	42700	43707	+	1008	398	429	411	590	460	1119			
YDL229W	chrIV	44065	45906	+	1842	6625	4502	4656	2168	124	744			
YDL228C	chrIV	45277	45918	-	642	31	28	34	12	1	1			
YDL227C	chrIV	46271	48031	-	1761	1006	837	556	97	8	102			
YDL226C	chrIV	51115	52173	-	1059	1264	1219	1326	1657	603	1801			
YDL225W	chrIV	52445	54100	+	1656	1116	1061	1044	1430	366	1444			
YDL224C	chrIV	54397	56346	-	1950	310	174	264	272	183	584			
YDL223C	chrIV	57265	60405	-	3141	124	104	92	1487	845	3016			
YDL222C	chrIV	60872	61801	-	930	17	15	51	101	303	1036			
YDL221W	chrIV	62011	62562	+	552	27	28	13	35	24	39			
YDL220C	chrIV	62244	65018	-	2775	63	34	64	110	36	107			
YDL219W	chrIV;chrIV	65242;65378	65306;65765	++;	453	697	834	610	512	189	509			
YDL218W	chrIV	66493	67446	+	954	28	21	16	51	32	84			
YDL217C	chrIV	67983	68606	-	624	287	247	295	392	91	344			
YDL216C	chrIV	68997	70310	-	1233	170	127	203	215	134	408			

## Output: Raw counts

These are the “raw” counts will be used in statistical programs downstream for differential gene expression.

# RNA-SEQ: QUANTIFICATION

## Counting reads using featureCounts

gene		Count					
Geneid	gene_name	WT_C_2	WT_C_1	WT_E_1	WT_C_3	WT_E_2	WT_E_3
YDL246C	SOR2	0	0	0	2	0	6
YDL243C	AAD4	104	109	275	109	328	206
YDR387C	CIN10	263	274	747	492	695	810
YDL094C	NA	7	4	8	1	8	3
YDR438W	THI74	72	102	140	126	144	161
YDR523C	SPS1	39	30	27	61	31	12
YDR542W	PAU10	0	1	0	1	0	0
YDR492W	IZH1	420	619	2850	338	1651	749
YDR018C	NA	21	19	160	50	359	455
YDL189W	RBS1	380	405	376	518	408	515
YDR508C	GNP1	1661	2365	767	2126	972	1417
YDR462W	MRPL28	307	304	850	360	1081	700
YDR175C	RSM24	528	577	1456	617	1304	903
YDR186C	SND1	730	868	2061	681	1658	1643
YDR150W	NUM1	474	420	772	535	831	724
YDR243C	PRP28	189	176	282	192	147	232
YDL182W	LYS20	2163	2953	500	3361	318	710
YDR362C	TFC6	323	360	558	350	536	461
YDR232W	HEM1	616	579	845	642	542	452
YDR158W	HOM2	12602	14504	4521	14868	4053	5727
YDR439W	LRS4	93	136	163	113	197	202
YDL206W	NA	177	215	369	315	633	653
YDR125C	ECM18	82	87	111	93	145	228
YDR338C	NA	204	245	226	259	289	265
YDR526C	NA	0	2	0	4	1	0
YDR533C	HSP31	3469	3665	24999	1677	30821	22425
YDR272W	GL02	1591	1329	5826	1413	6536	7377
YDR197W	CBS2	329	393	573	380	732	648
YDR512C	EMI1	783	588	2009	670	2625	2619

### A table of counts

Don't need information about the genomic coordinates, length

→ Cleaning up the featureCounts matrix

### Final output:

A count matrix, with genes as rows and samples are columns

# EXAMPLE DATA

NCBI  Gene Expression Omnibus

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NCBI > GEO > Accession Display  Not logged in | Login 

Scope:  Format:  Amount:  GEO accession:

**Series GSE227381** [Query DataSets for GSE227381](#)

Status	Public on Mar 19, 2023
Title	Effect of the lysphosphatidylcholine analogue edelfosine on gene expression in <i>Saccharomyces cerevisiae</i>
Organism	<a href="#">Saccharomyces cerevisiae</a>
Experiment type	Expression profiling by high throughput sequencing
Summary	To investigate the impact of a lysolipid burden in the nuclear envelope on the regulation of gene expression, particularly in tethered nuclear domains, we treated cells with edelfosine.
Overall design	Comparative gene expression profiling analysis of RNA-seq data for <i>S. cerevisiae</i> cells treated with edelfosine for 60 minutes.
Contributor(s)	<a href="#">Sosa Ponce ML</a> , <a href="#">Cobb JA</a> , <a href="#">Zarembeg V</a>
Citation missing	Has this study been published? Please <a href="#">login</a> to update or <a href="#">notify GEO</a> .
Submission date	Mar 15, 2023
Last update date	Mar 19, 2023
Contact name	Vanina Zarembeg
E-mail(s)	<a href="mailto:vzarembeg@ucalgary.ca">vzarembeg@ucalgary.ca</a>
Organization name	University of Calgary
Department	Biological Sciences
Street address	2500 University Dr NW
City	Calgary
State/province	Alberta
ZIP/Postal code	T2N 1N4
Country	Canada

Platforms (1) [GPL19756](#) Illumina NextSeq 500 (*Saccharomyces cerevisiae*)

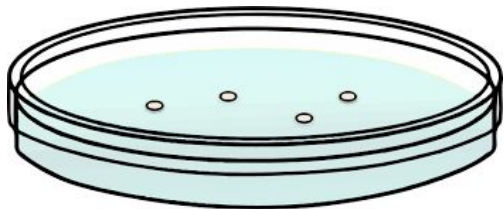
Samples (6) [GSM7099592](#) WT\_C\_1  
[GSM7099593](#) WT\_E\_1  
[GSM7099594](#) WT\_C\_2

“Effect of the lysphosphatidylcholine analogue edelfosine on gene expression in *Saccharomyces cerevisiae*”

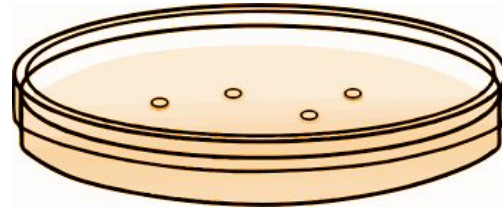
<https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE227381>

# EXAMPLE DATA

Comparative gene expression profiling analysis of RNA-seq data for *S. cerevisiae* cells treated with edelfosine for 60 minutes.



Control (X3)



Edelfosine treatment (X3)

```
WT_C_1_R1.fastq.gz  
WT_C_1_R2.fastq.gz  
WT_C_2_R1.fastq.gz  
WT_C_2_R2.fastq.gz  
WT_C_3_R1.fastq.gz  
WT_C_3_R2.fastq.gz  
WT_E_1_R1.fastq.gz  
WT_E_1_R2.fastq.gz  
WT_E_2_R1.fastq.gz  
WT_E_2_R2.fastq.gz  
WT_E_3_R1.fastq.gz  
WT_E_3_R2.fastq.gz
```

**Bulk RNA-seq Analysis**

**THANK YOU**