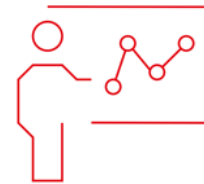
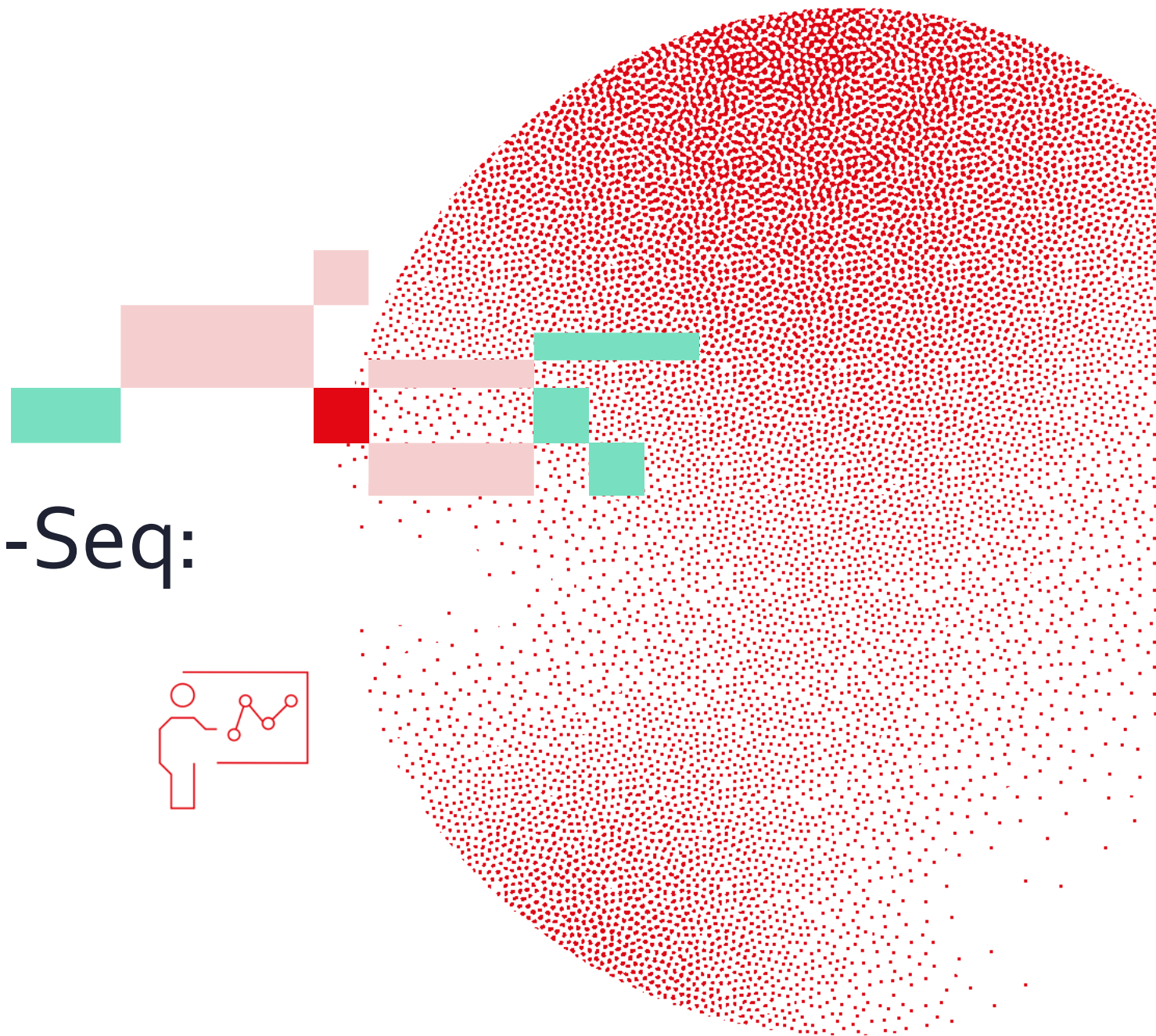


Introduction to RNA-Seq: Mapping & Aligning

Wandrille Duchemin



Alignment vs. pseudoalignment

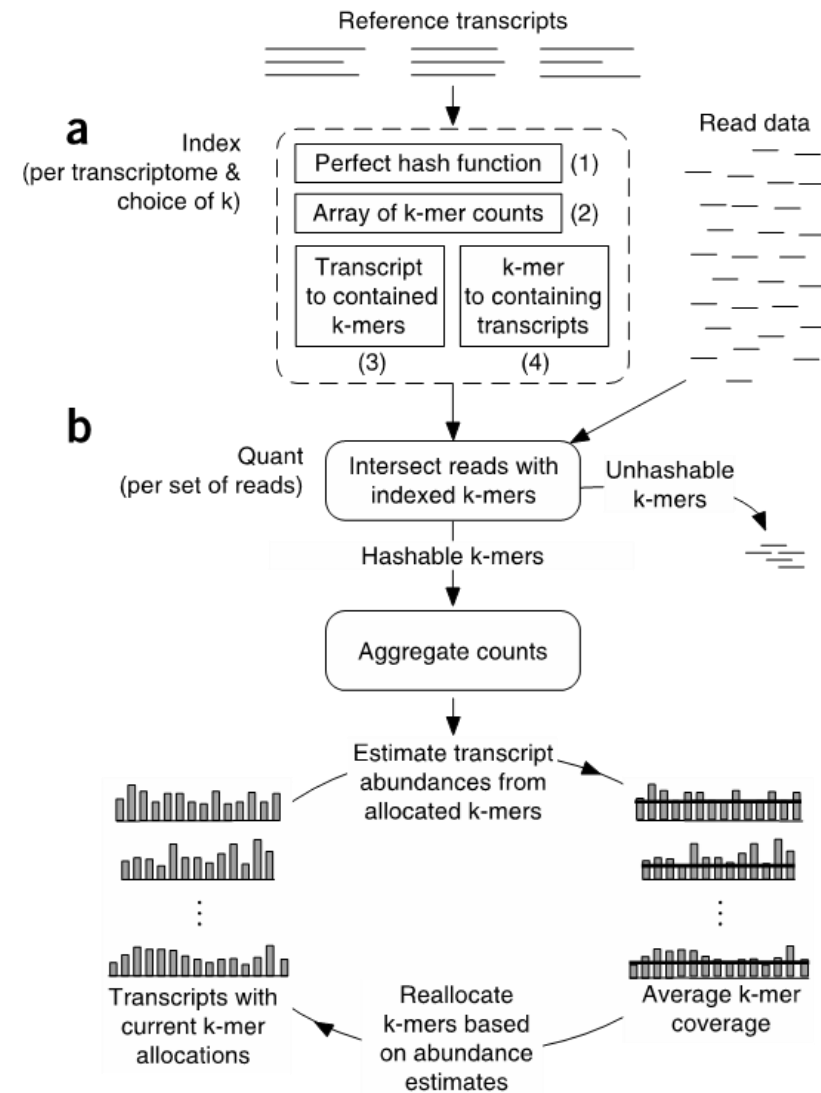
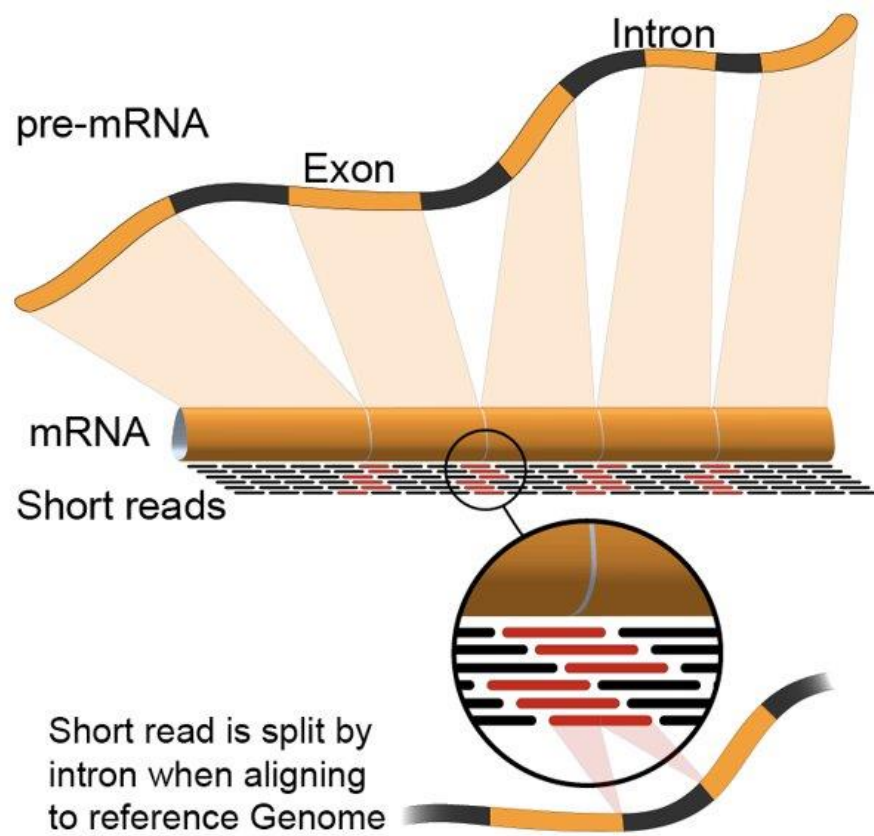
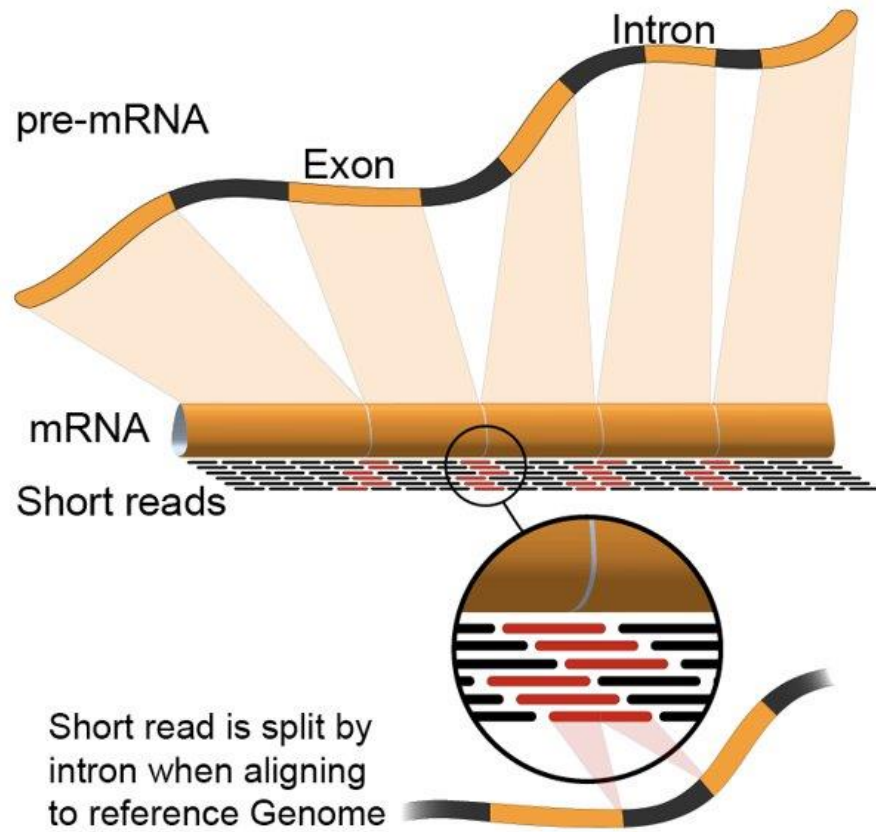


Image credit : wikipedia user Rgocs

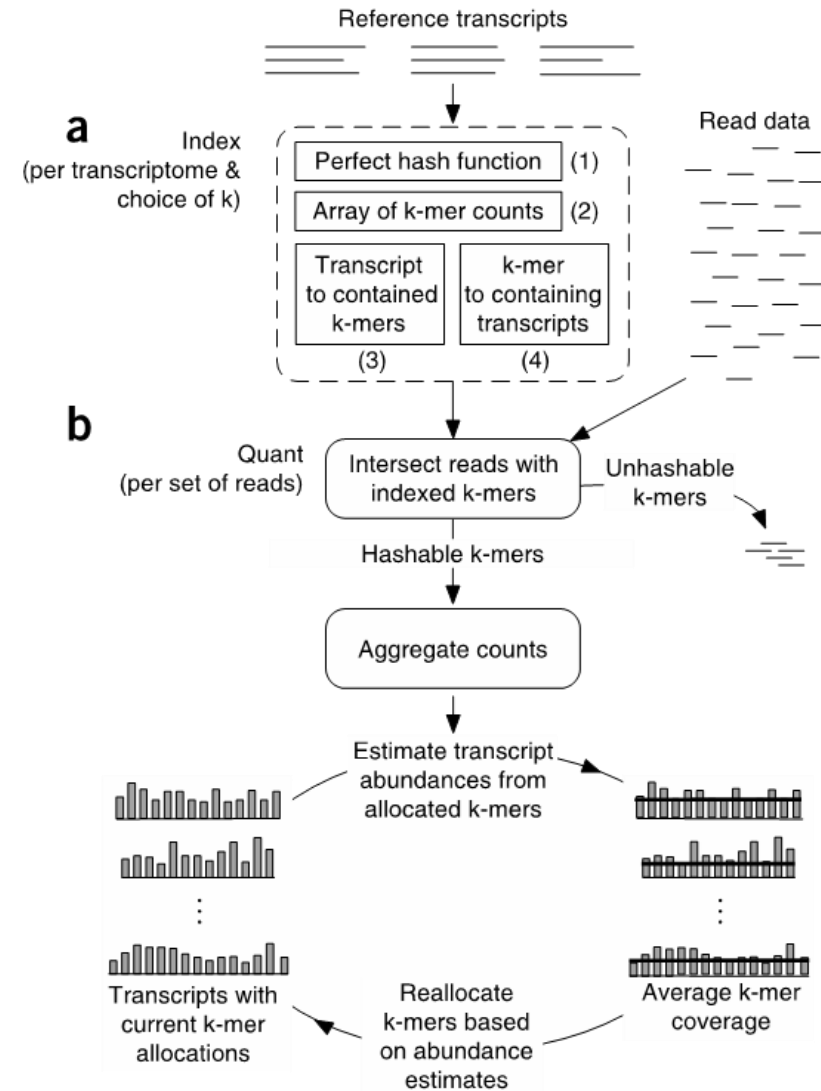
Sailfish (Patro et al. 2014),
See also Kallisto (Bray et al. 2016)

Alignment vs. pseudoalignment



Resource intensive!

Image credit : wikipedia user Rgocs



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Alignment vs. pseudoalignment

alignment



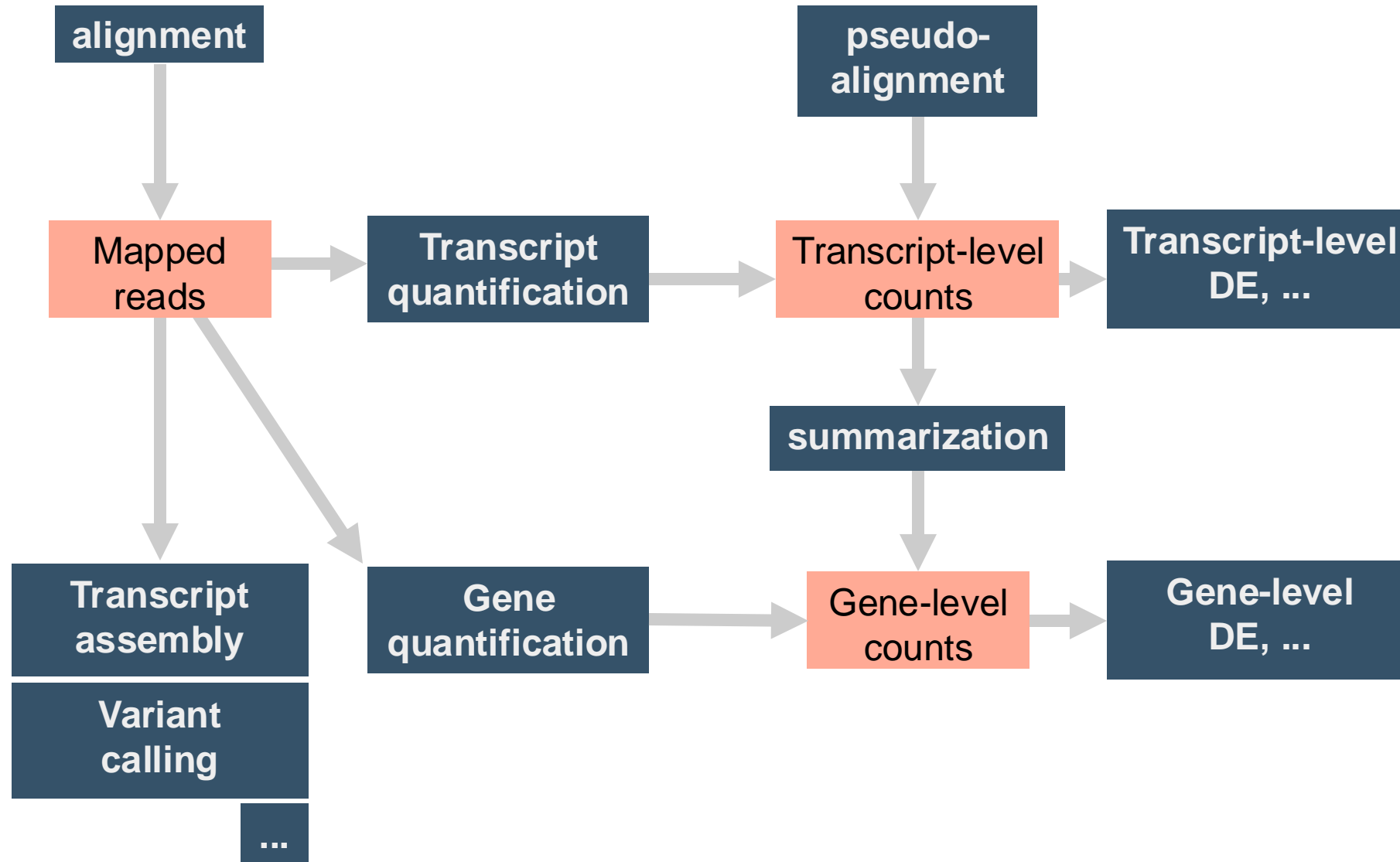
Mapped
reads

**pseudo-
alignment**

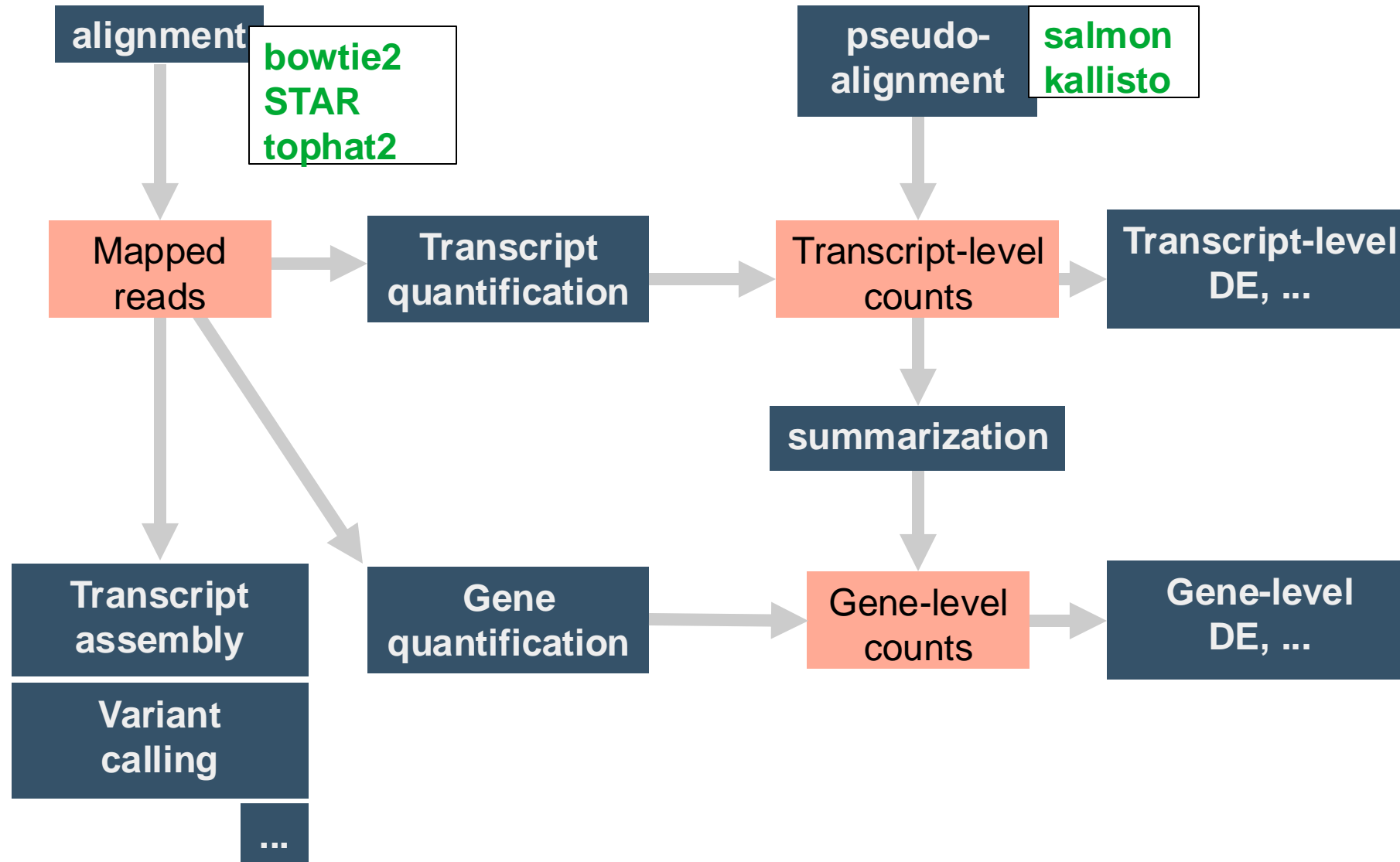


Transcript-level
counts

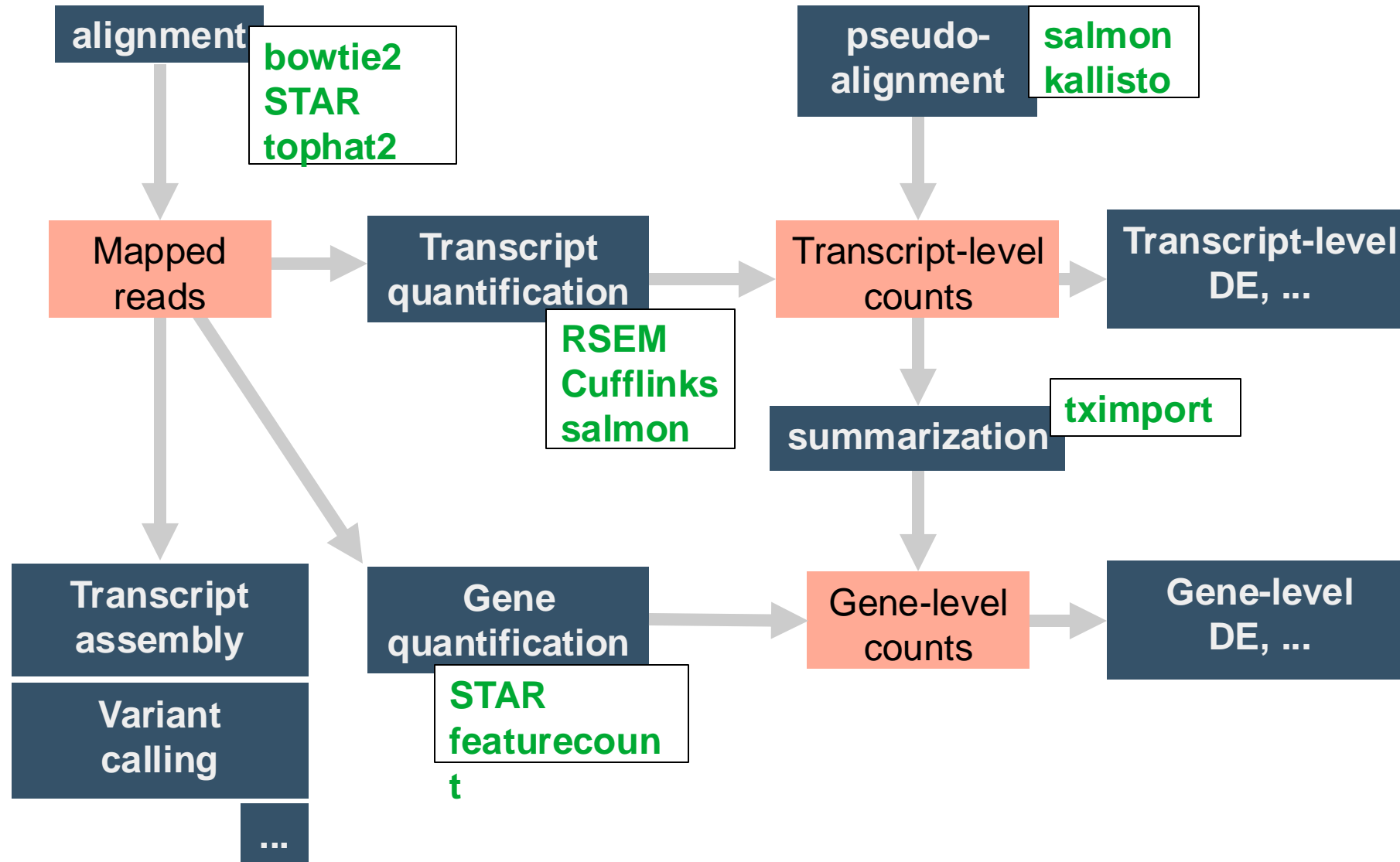
Alignment vs. pseudoalignment



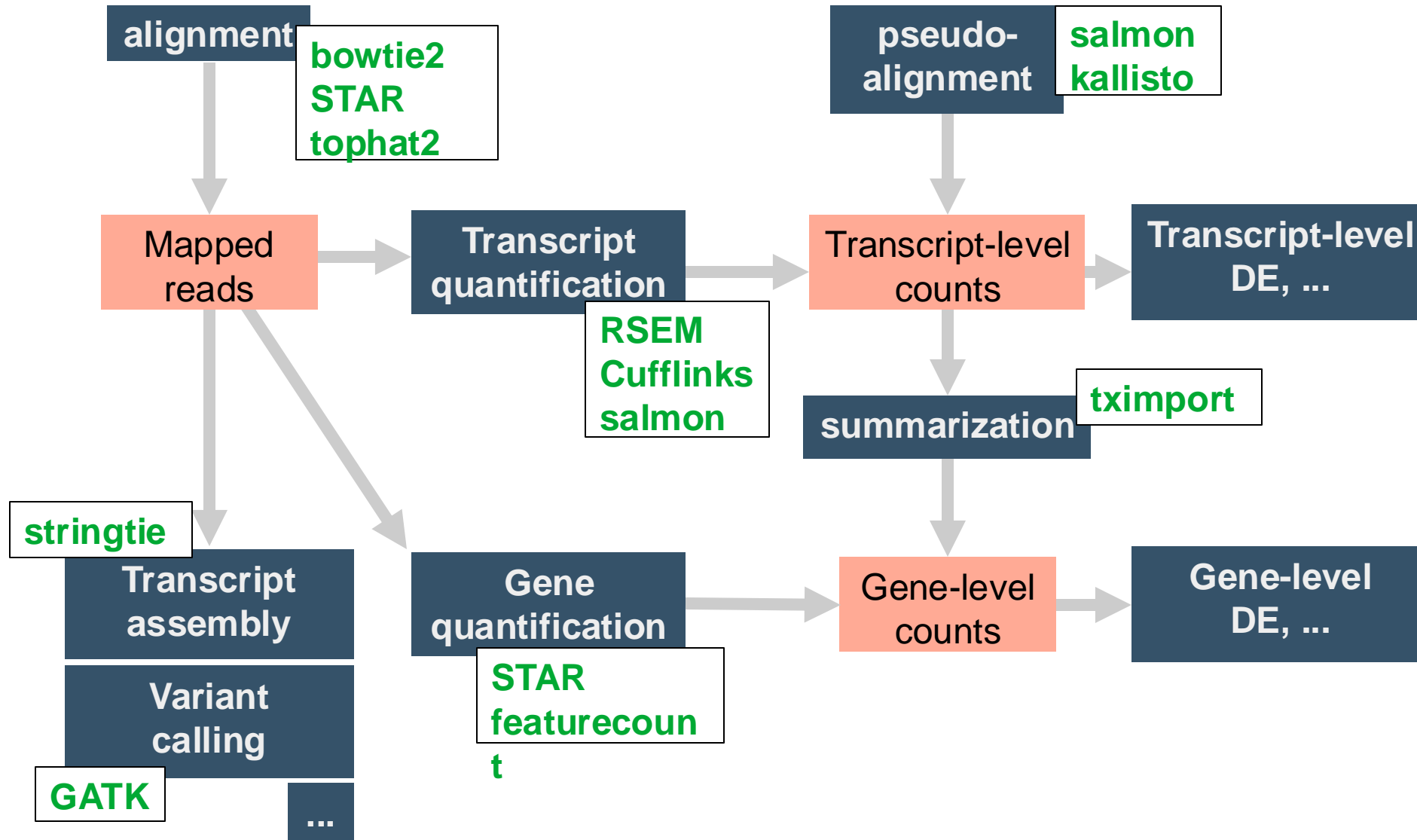
Alignment vs. pseudoalignment



Alignment vs. pseudoalignment

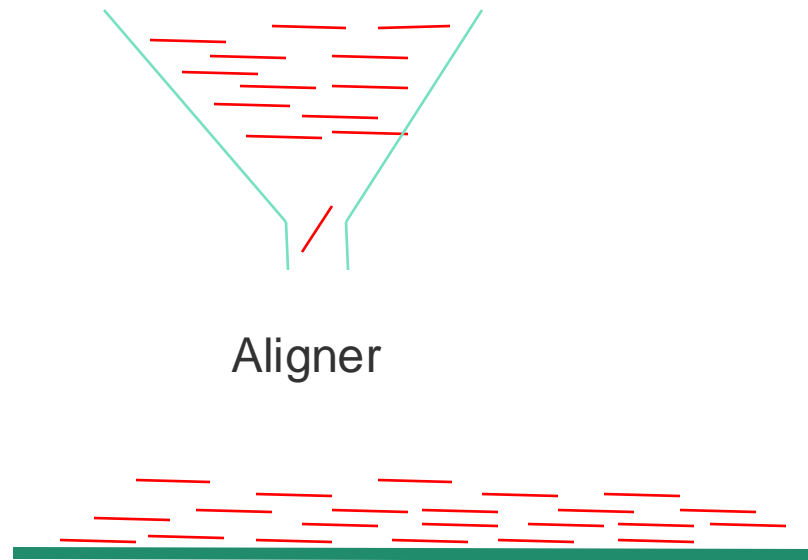


Alignment vs. pseudoalignment



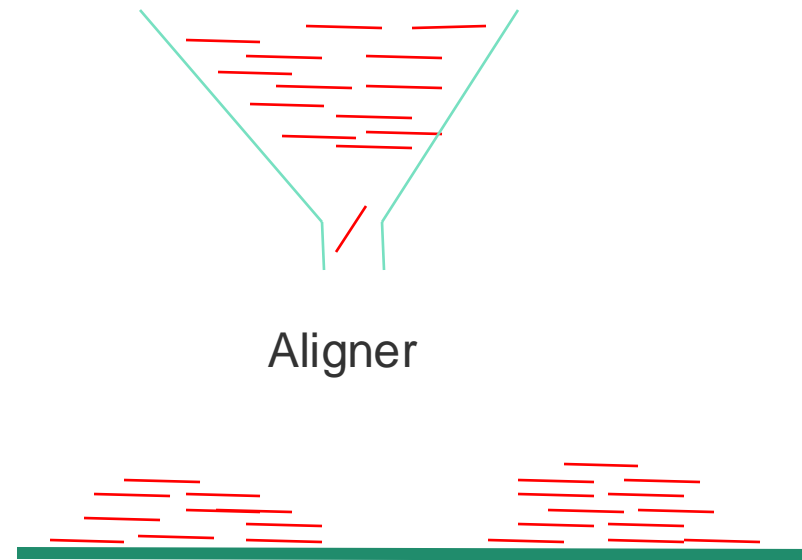
Aligning & mapping sequencing reads

Whole genome re-sequencing
Prokaryote RNAseq



- BWA (Li and Durbin 2009)
- Bowtie (Langemead et al. 2009)

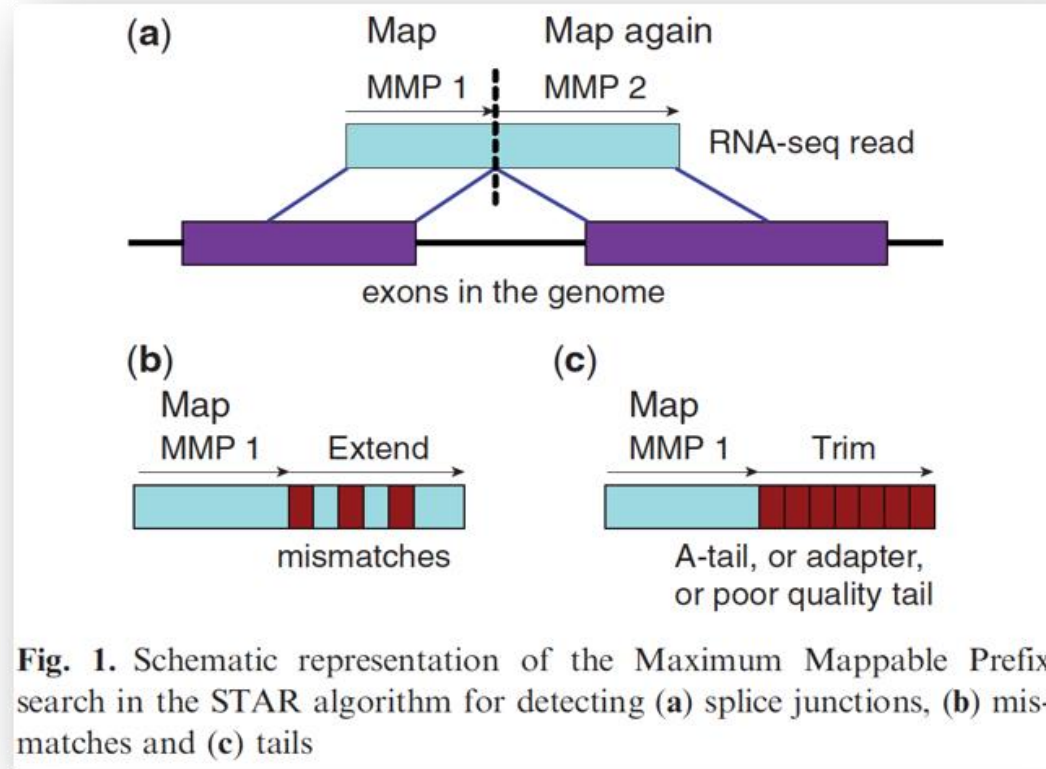
Transcriptome sequencing (RNA-seq)



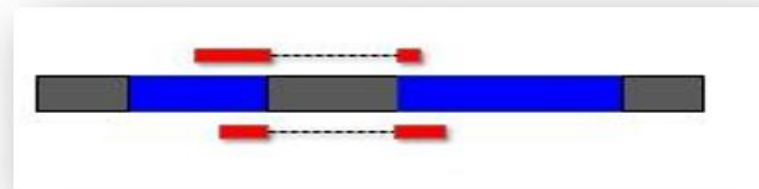
- Tophat (Trapenell et al. 2009, Kim et al. 2013)
- STAR (Dobin et al. 2013)

Alignment using STAR

Phase 1:
mapping using "Maximum Mappable Prefix"



Phase 2:
"stitching"



Benchmarking of RNAseq aligners

Aligner	Correctly mapped 200 bases	≥150 bases correctly mapped	Unmapped	True positive junctions		False positive junctions	
				Number	Sensitivity	Number	FDR
	1	2	4	5	6	7	8
STAR	81.3%	95.0%	4.82%	148,487	92.7%	409	0.3%
TopHat2	82.6%	83.7%	6.70%	135,006	84.3%	1,228	0.9%

Dobin & Gingeras 2013

STAR : 20x faster

Tophat2 : 6x less memory (can be run on recent laptop)

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Reference index preparation

Different for each software!

Needs a suitable reference genome

- sequence
- annotation

<https://www.ensembl.org/info/data/ftp/index.html>

<https://hgdownload.soe.ucsc.edu/downloads.html>

Genome annotation files

Text file describing genomic features

- Gene, CDS, exon, intron, ...
- Chromosome, start, end, strand, attributes, ...

Most common format: gtf / gff3

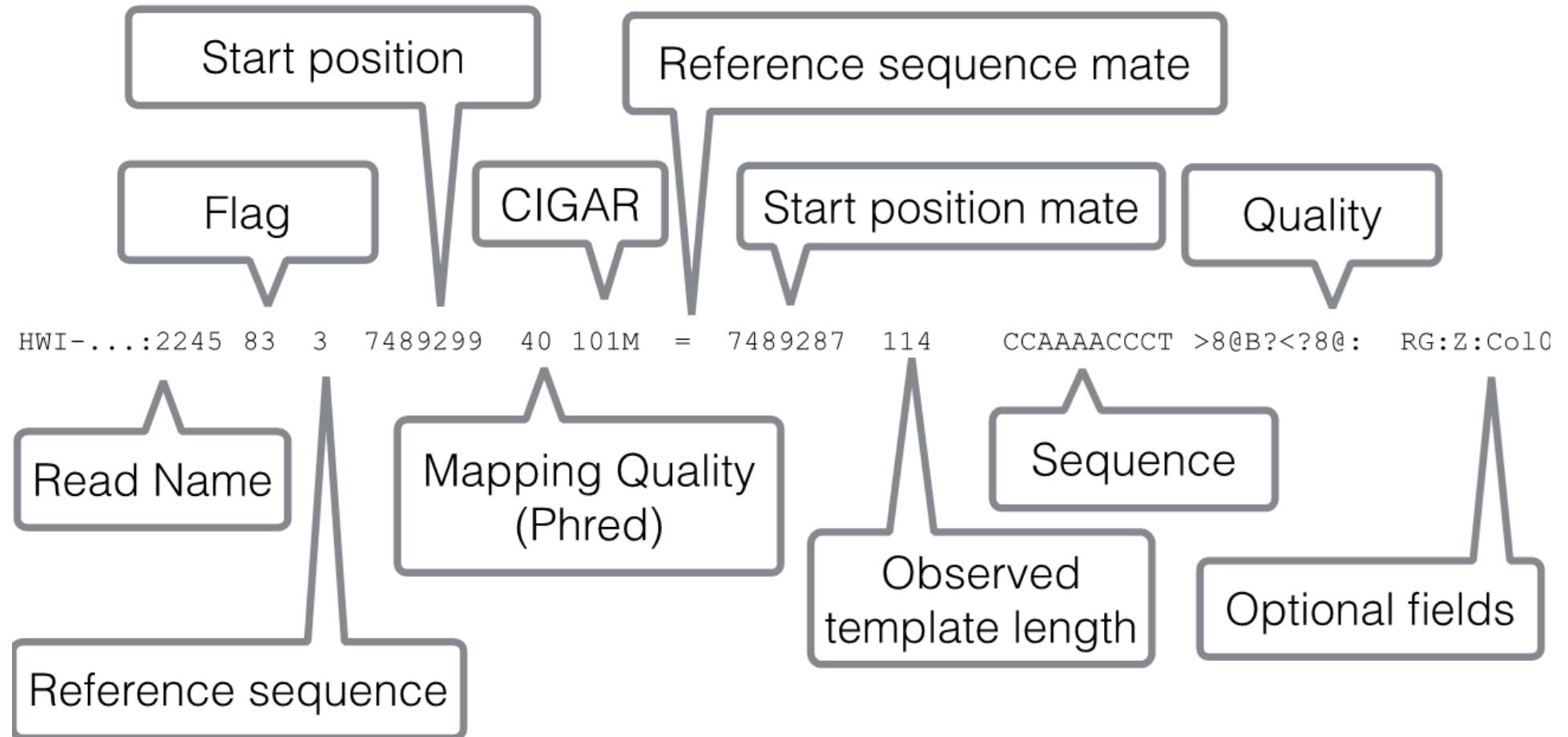
<http://www.ensembl.org/info/website/upload/gff.html>

MT	RefSeq	gene	2751	3707	.	+	.	gene_id "ENSMUSG00000064341";
MT	RefSeq	transcript	2751	3707	.	+	.	gene_id "ENSMUSG00000064341";
MT	RefSeq	exon	2751	3707	.	+	.	gene_id "ENSMUSG00000064341";
MT	RefSeq	CDS	2751	3704	.	+	0	gene_id "ENSMUSG00000064341";
MT	RefSeq	start_codon	2751	2753	.	+	0	gene_id "ENSMUSG00000064341";
MT	RefSeq	stop_codon	3705	3707	.	+	0	gene_id "ENSMUSG00000064341";

Most mapper produce SAM files

<https://samtools.github.io/hts-specs/SAMv1.pdf>

Each line contain mapping information about a single read



Most mapper produce SAM files

<https://samtools.github.io/hts-specs/SAMv1.pdf>

Bit	Description
1	0x1 template having multiple segments in sequencing
2	0x2 each segment properly aligned according to the aligner
4	0x4 segment unmapped
8	0x8 next segment in the template unmapped
16	0x10 SEQ being reverse complemented
32	0x20 SEQ of the next segment in the template being reverse complemented
64	0x40 the first segment in the template
128	0x80 the last segment in the template
256	0x100 secondary alignment
512	0x200 not passing quality controls
1024	0x400 PCR or optical duplicate
2048	0x800 supplementary alignment

Example, flag 83 = $64+16+2+1$ means it's first read (0x40) of pair-end reads (0x1) and it's mapped on minus strand (0x10) and both reads mapped (0x2).

<https://broadinstitute.github.io/picard/explain-flags.html>

Most mapper produce SAM files

<https://samtools.github.io/hts-specs/SAMv1.pdf>

- Big files: ideally compress in BAM file
- Can be sorted and indexed for easy access by post-processing software
- multiQC can grab interesting information from a folder containing SAM/BAM files
(as well as the other files created by the mapping software)

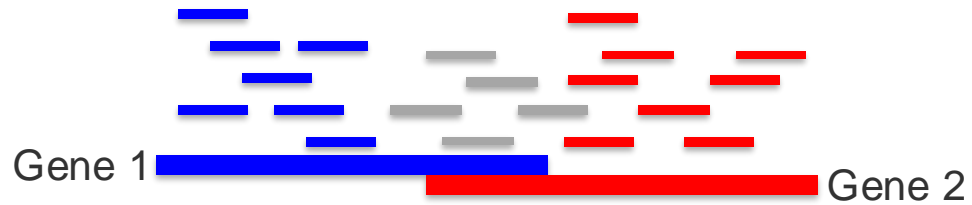
After mapping: counting

Pseudoaligner: transcript-level expression quantification

Aligner: we need to subsequently estimate expression from mapped reads

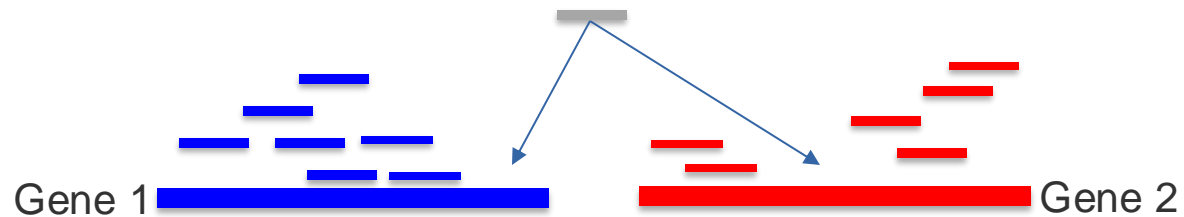
Counting: fundamental problems

Overlapping genes



stranded sequencing
OR
discard reads / count both ?

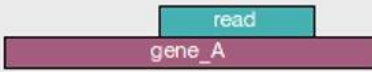
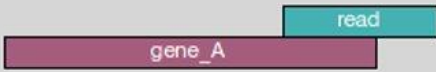





Multi-mapping reads



- discard reads?
- count both?

Counting: gene-level counters

HTSeq

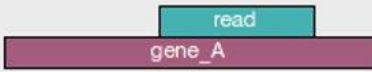
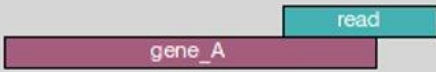





	union	intersection_strict	intersection_nonempty
	gene_A	gene_A	gene_A
	gene_A	no_feature	gene_A
	gene_A	no_feature	gene_A
	gene_A	gene_A	gene_A
	gene_A	gene_A	gene_A
	ambiguous	gene_A	gene_A
	ambiguous	ambiguous	ambiguous

Counting: gene-level counters

HTSeq

FeatureCount

+ options for
fractional counts

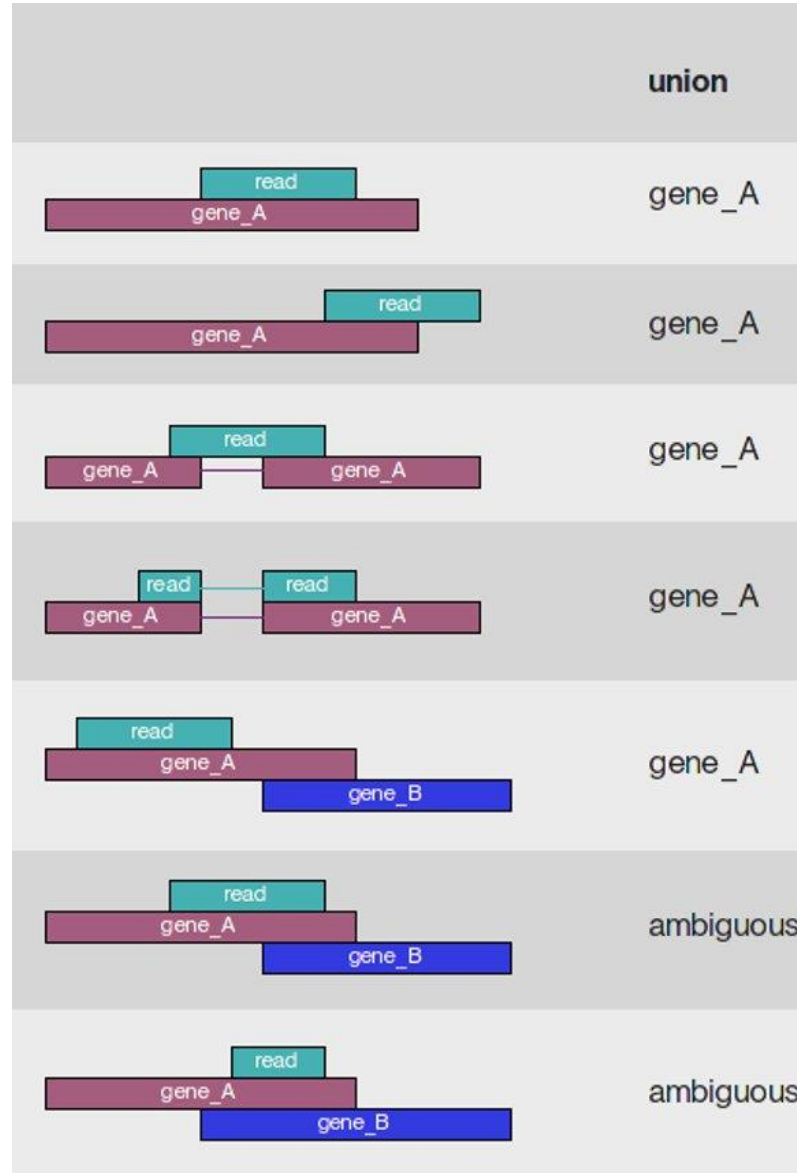
	union	intersection_strict	intersection_nonempty
	gene_A	gene_A	gene_A
	gene_A	no_feature	gene_A
	gene_A	no_feature	gene_A
	gene_A	gene_A	gene_A
	gene_A	gene_A	gene_A
	ambiguous	gene_A	gene_A
	ambiguous	ambiguous	ambiguous

Counting: gene-level counters

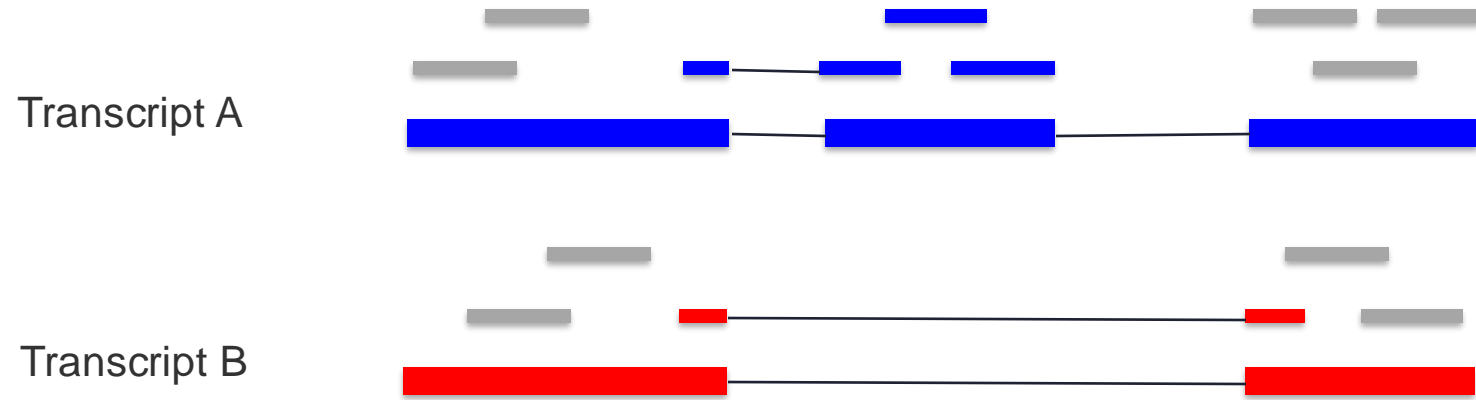
HTSeq

FeatureCount
+ options for
fractional counts

STAR



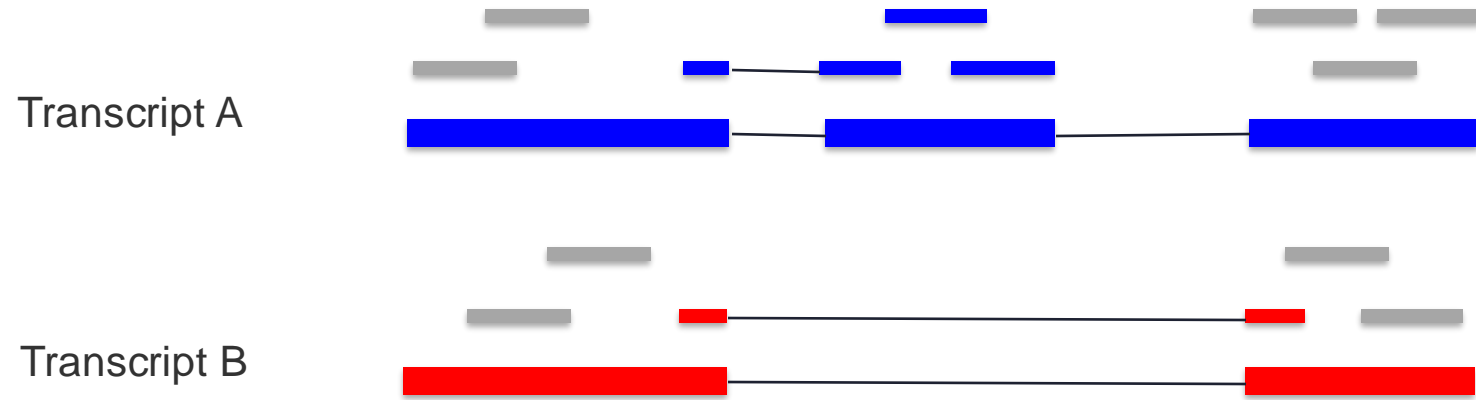
Counting: transcript-level counter



RSEM, cufflink, salmon, stringtie, ...

Practical

Counting: transcript-level counter



RSEM, cufflink, salmon, stringtie, ...