

Central European Institute of Technology BRNO | CZECH REPUBLIC

Introduction to Bioinformatics (LF:DSIB01)

Week 5 : Sequence Alignment



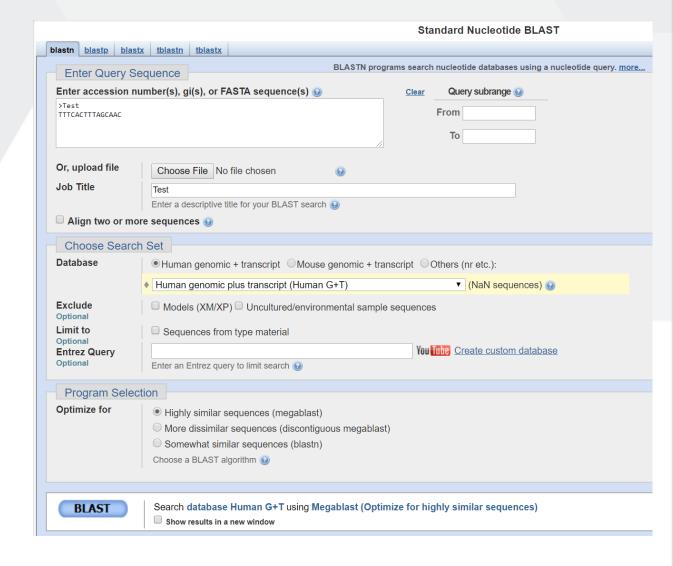
- BLAST is a method for performing Local Alignment
- It uses a Seed query that must match perfectly to the reference, then builds around it
- The alignment ends when a score threshold is passed
- Step 1: Break Query into short words of specific length W
- Step 2: Search for this sequence in a database of the reference
- Step 3: Keep seeds that pass Threshold and extend
- Step 4: Calculate E (Expected Value) log10 chance that such alignment is found by luck

Published 1990 ~80,000 citations





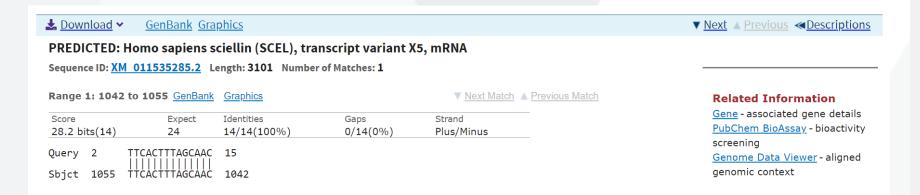
https://blast.ncbi.nlm.nih.gov/Blast.cgi

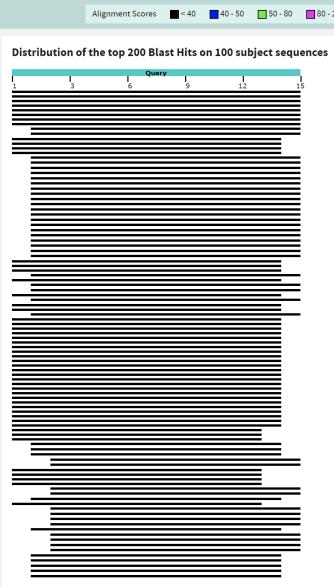




Descripti	ons	Graphic Summary	Alignments	Taxonomy								
Sequences producing significant alignments Download Manage Columns Show 100 100											100 🗸	
✓ select all 100 sequences selected GenBank Graphics Distance tree of residue to the control of the control o											nce tree of results	
			Desc	ription			Max Score		Query Cover	E value	Per. Ident	Accession
Transcripts												
✓ PREI	DICTED: Hor	mo sapiens sciellin (SCEL)	<u>, transcript variant X5, </u>	mRNA			28.2	28.2	93%	24	100.00%	XM_011535285.2
✓ PREI	DICTED: Hor	mo sapiens sciellin (SCEL)	, transcript variant X15	mRNA			28.2	28.2	93%	24	100.00%	XM_017020805.1
✓ PRE	DICTED: Hor	<u>mo sapiens uncharacterize</u>	d LOC105378421 (LOC	<u> 2105378421), transcr</u>	ipt variant X4, ncRNA		28.2	28.2	93%	24	100.00%	XR_001747545.1
✓ PREI	DICTED: Hor	<u>mo sapiens uncharacterize</u>	d LOC105378421 (LOC	<u> 2105378421), transcr</u>	<u>ipt variant X3, ncRNA</u>		28.2	28.2	93%	24	100.00%	XR_001747544.1
✓ PREI	DICTED: Hor	<u>mo sapiens uncharacterize</u>	d LOC105378421 (LOC	<u> 2105378421), transcr</u>	<u>ipt variant X2, ncRNA</u>		28.2	28.2	93%	24	100.00%	XR_001747543.1
✓ PRE	DICTED: Hor	<u>mo sapiens uncharacterize</u>	d LOC105378421 (LOC	<u> 2105378421), transcr</u>	<u>ipt variant X1, ncRNA</u>		28.2	28.2	93%	24	100.00%	XR_001747542.1
✓ PREI	DICTED: Hor	mo sapiens sciellin (SCEL)	, transcript variant X16	mRNA			28.2	28.2	93%	24	100.00%	XM_011535291.1
✓ PRE	DICTED: Hor	mo sapiens sciellin (SCEL)	, transcript variant X14	mRNA			28.2	28.2	93%	24	100.00%	XM_011535290.1
☑ PREI	DICTED: Hor	mo sapiens sciellin (SCEL)	, transcript variant X13	mRNA			28.2	28.2	93%	24	100.00%	XM_011535289.1
☑ PREI	DICTED: Hor	mo sapiens sciellin (SCEL)	, transcript variant X11,	mRNA			28.2	28.2	93%	24	100.00%	XM_011535288.1
☑ PREI	DICTED: Hor	mo sapiens sciellin (SCEL)	, transcript variant X8,	mRNA			28.2	28.2	93%	24	100.00%	XM_011535287.1

- Useful information about alignment(s)
- Works well for a single sequence







BLAST variations – old standalone programs

1999

- **BLASTN** Compares a DNA query to a DNA database. Searches both strands automatically. It is optimized for speed, rather than sensitivity.
- **BLASTP** Compares a protein query to a protein database.
- BLASTX Compares a DNA query to a protein database, by translating the query sequence in the 6 possible frames, and comparing each against the database (3 reading frames from each strand of the DNA) searching.
- TBLASTN Compares a protein query to a DNA database, in the 6 possible frames of the database.
- TBLASTX Compares the protein encoded in a DNA query to the protein encoded in a DNA database, in the 6*6 possible frames of both query and database sequences (Note that all the combinations of frames may have different scores).
- BLAST2 Also called advanced BLAST. It can perform gapped alignments.
- PSI-BLAST (Position Specific Iterated) Performs iterative database searches



BLAST variations – web services and API

2019

Web BLAST



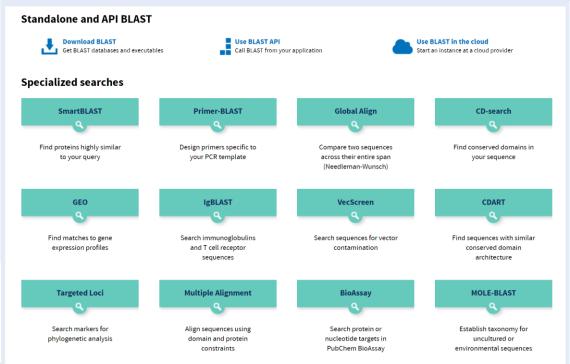
blastx

translated nucleotide ▶ protein

tblastn

protein ▶ translated nucleotide







BWA - Burrows-Wheeler Aligner

BWA. 2009

BIOINFORMATICS

ORIGINAL PAPER

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Sequence analysis

Fast and accurate short read alignment with Burrows–Wheeler transform

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ABSTRACT

Motivation: The enormous amount of short reads generated by the new DNA sequencing technologies call for the development of fast and accurate read alignment programs. A first generation of hash table-based methods has been developed, including MAQ, which is accurate, feature rich and fast enough to align short reads from a single individual. However, MAQ does not support gapped alignment for single-end reads, which makes it unsuitable for alignment of longer reads where indels may occur frequently. The speed of MAQ is also a concern when the alignment is scaled up to the resequencing of hundreds of individuals.

Results: We implemented Burrows-Wheeler Alignment tool (BWA), a new read alignment package that is based on backward search with Burrows-Wheeler Transform (BWT), to efficiently align short sequencing reads against a large reference sequence such as the human genome, allowing mismatches and gaps. BWA supports both base space reads, e.g. from Illumina sequencing machines, and color space reads from AB SOLiD machines. Evaluations on both simulated and real data suggest that BWA is ~10-20× faster than MAQ, while achieving similar accuracy. In addition, BWA outputs alignment in the new standard SAM (Sequence Alignment/Map) format. Variant calling and other downstream analyses after the alignment can be achieved with the open source SAMtools software

Availability: http://maq.sourceforge.net Contact: rd@sanger.ac.uk of scanning the whole genome when few reads are aligned. The second category of software, including SOAPv1 (Li et al., 2008b), PASS (Campagna et al., 2009), MOM (Eaves and Gao, 2009), ProbeMatch (Jung Kim et al., 2009), NovoAlign (http://www.novocraft.com), ReSEQ (http://code.google.com/p/re-seq), Mosaik (http://bioinformatics.be.edu/marthlab/Mosaik) and BFAST (http://genome.ucla.edu/bfast), hash the genome. These programs can be easily parallelized with multi-threading, but they usually require large memory to build an index for the human genome. In addition, the iterative strategy frequently introduced by these software may make their speed sensitive to the sequencing error rate. The third category includes slider (Malhis et al., 2009) which does alignment by merge-sorting the reference subsequences and read sequences.

Recently, the theory on string matching using Burrows—Wheeler Transform (BWT) (Burrows and Wheeler, 1994) has drawn the attention of several groups, which has led to the development of SOAPv2 (http://soap.genomics.org.cn/), Bowtie (Langmead et al., 2009) and BWA, our new aligner described in this article. Essentially, using backward search (Ferragina and Manzini, 2000; Lippert, 2005) with BWT, we are able to effectively mimic the top-down traversal on the prefix trie of the genome with relatively small memory footprint (Lam et al., 2008) and to count the number of exact hits of a string of length m in O(m) time independent of the size of the genome. For inexact search, BWA samples from the implicit prefix trie the distinct substrings that are less than k edit distance

- BWA is a software package for mapping low-divergent sequences against a large reference genome, such as the human genome.
- Variants: short seq (up to 100bp), longer seq (70-1,000,000bp)
- Utilizes "Burrows Wheeler Transform" to make alignment faster



Burrows Wheeler Transform

```
(a) $acaacg
aacg$ac
acaacg$
acaacg$→acg$aca→gc$aaac
caacg$a
cg$acaa
g$acaac
```

 a) Sort every permutation (sliding through) of the string and then take the last column = Transform

Essentially sorting by the character that comes AFTER this one (right-context)

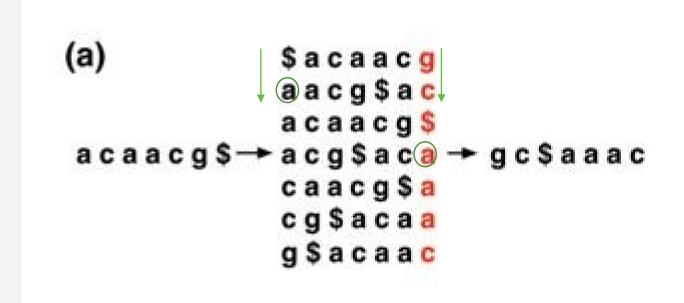
```
>>> bwtViaBwm("Tomorrow_and_tomorrow_and_tomorrow$")
'w$wwdd__nnoooaattTmmmrrrrrooo__ooo'

>>> bwtViaBwm("It_was_the_best_of_times_it_was_the_worst_of_times$")
's$esttssfftteww_hhmmbootttt_ii__woeeaaressIi_____'

>>> bwtViaBwm('in_the_jingle_jangle_morning_Ill_come_following_you$')
'u_gleeeengj_mlhl_nnnnt$nwj__lggIolo_iiiiarfcmylo_oo_'
```



Burrows Wheeler Transform



Important Property: LF (Last First)

On the First and Last columns the order of same letters remains the same

Next Step:

Sort the table by order of letter AND index

\$

A1

A2

A3

 C_1

 C_2

G1



Burrows Wheeler Transform - Reversing

Reverse BWT(T) starting at right-hand-side of T and moving left

Start in first row. F must have \$. L contains character just prior to \$: ap

a₀: LF Mapping says this is same occurrence of a as first a in F. Jump to row beginning with a₀. L contains character just prior to a₀: b₀.

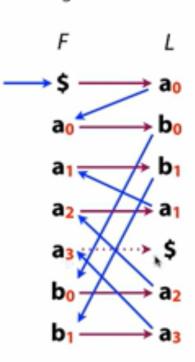
Repeat for bo, get a2

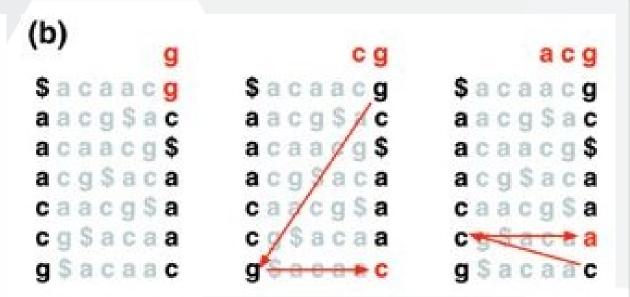
Repeat for a2, get a1

Repeat for a1, get b1

Repeat for b₁, get a₃

Repeat for a3, get \$, done

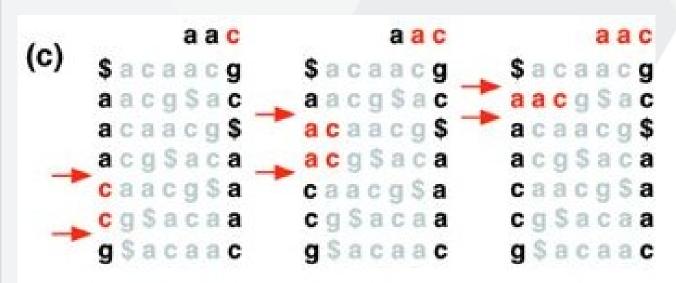




b) We can easily recreate the original sequence by working on a reverse order from any point in the Transform



Burrows Wheeler Transform



c) For every subsequence we can quickly find the location of all possible matches by working backwards in the transform

Using precalculation the complexity of the lookup can be reduced close to O(1)

Explanation of BWT for genomic indexing by Ben Langmead (creator of bowtie)
https://www.youtube.com/watch?v=4n7NPk5lwbl
https://www.youtube.com/watch?v=kvVGj5V65io



Bowtie

Bowtie, 2009

Software



Ultrafast and memory-efficient alignment of short DNA sequences to the human genome

Ben Langmead, Cole Trapnell, Mihai Pop and Steven L Salzberg

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Abstract

Bowtie is an ultrafast, memory-efficient alignment program for aligning short DNA sequence reads to large genomes. For the human genome, Burrows-Wheeler indexing allows Bowtie to align more than 25 million reads per CPU hour with a memory footprint of approximately 1.3 gigabytes. Bowtie extends previous Burrows-Wheeler techniques with a novel quality-aware backtracking algorithm that permits mismatches. Multiple processor cores can be used simultaneously to achieve even greater alignment speeds. Bowtie is open source http://bowtie.cbcb.umd.edu.

Bowtie 2, 2012

BRIEF COMMUNICATIONS

Fast gapped-read alignment with Bowtie 2

Ben Langmead^{1,2} & Steven L Salzberg¹⁻³

As the rate of sequencing increases, greater throughput is demanded from read aligners. The full-text minute index is often used to make alignment very fast and memory-efficient, but the approach is ill-suited to finding longer, gapped alignments. Bowtie 2 combines the strengths of the full-text minute index with the flexibility and speed of hardware-accelerated dynamic programming algorithms to achieve a combination of high speed, sensitivity and accuracy.

Aligning sequencing reads to a reference genome is the first step in many comparative genomics pipelines, including pipelines for variant calling¹, isoform quantitation² and differential gene expression³. In many cases, the alignment step is the slowest. This is because for each read the aligner must solve a difficult computational problem: determining the read's likely point of origin with respect to a reference genome⁴.

Many aligners use a genome index to rapidly narrow the list of candidate alignment locations. The full-text minute index 5 is a fast and memory-efficient index that has been used in recent aligners 6-10. Index-assisted aligners work by searching for all ways of mutating the read string into a string that occurs in the reference, subject to an alignment policy limiting the number of differences. Although this search space is large, many portions of it can be skipped ('pruned') without loss of sensitivity. In practice, pruning strategies such as double indexing 6 and bidirectional Burrows-Wheeler transform (BWT) 7 facilitate very efficient

ungapped alignment of short reads.

Index aided alignment can be quit

benefits from the efficiency of single-instruction multiple-data (SIMD) parallel processing available on modern processors. The combination of full-text minute index-assisted seed alignment and SIMD-accelerated dynamic programming achieves an effective combination of speed, sensitivity and accuracy across a range of read lengths and sequencing technologies.

For each read, Bowtie 2 proceeds in four steps (Supplementary Note and Supplementary Fig. 1). In step 1, Bowtie 2 extracts 'seed' substrings from the read and its reverse complement. In step 2, the extracted substrings are aligned to the reference in an ungapped fashion assisted by the full-text minute index. In step 3, seed alignments are prioritized, and their positions in the reference genome are calculated from the index. In step 4, seeds are extended into full alignments by performing SIMD-accelerated dynamic programming.

To assess how Bowtie 2 performs on real data, we compared Bowtie 2 to three other full-text minute index-based read aligners: Burrows-Wheeler Aligner (BWA)§, BWA's Smith-Waterman alignment (BWA-SW)§ and short oligonucleotide alignment program 2 (SOAP2)¹0 as well as to Bowtie⁶. In all experiments, the reference we used was the GRCh37 major build of the human genome, including sex chromosomes, mitochondrial genome and 'non-chromosomal' sequences. We obtained 100-by-100 nucleotide (nt) paired-end HiSeq (2000) reads from a human resequencing study¹¹¹ and extracted a random subset of 2 million pairs.

We first used BWA, SOAP2, Bowtie 2 and Bowtie to align one end (labeled '1') from the subset in an unpaired fashion. To illustrate parameter tradeoffs, we ran three of the tools with a wide variety of parameter settings (Fig. 1a and Supplementary Table 1). Note that SOAP2 and Bowtie do not permit gapped alignment of unpaired reads. The Bowtie 2 default mode is faster than all BWA modes we tried and more than 2.5 times faster than the BWA default mode. All Bowtie 2 modes aligned a greater number of reads than either BWA (Supplementary Table 2) or SOAP2. The peak memory footprint of Bowtie 2 (3.24 gigabytes) was between



TopHat2

TopHat2 works well with gaps + introns

TopHat2, 2013

Kim et al. Genome Biology 2013, 14:R36 http://genomebiology.com/2013/14/4/R36



METHOD Open Access

TopHat2: accurate alignment of transcriptomes in the presence of insertions, deletions and gene fusions

Daehwan Kim^{1,2,3*}, Geo Pertea³, Cole Trapnell^{5,6}, Harold Pimentel⁷, Ryan Kelley⁸ and Steven L Salzberg^{3,4}

Abstract

TopHat is a popular spliced aligner for RNA-sequence (RNA-seq) experiments. In this paper, we describe TopHat2, which incorporates many significant enhancements to TopHat. TopHat2 can align reads of various lengths produced by the latest sequencing technologies, while allowing for variable-length indels with respect to the reference genome. In addition to *de novo* spliced alignment, TopHat2 can align reads across fusion breaks, which can occur after genomic translocations. TopHat2 combines the ability to identify novel splice sites with direct mapping to known transcripts, producing sensitive and accurate alignments, even for highly repetitive genomes or in the presence of pseudogenes. TopHat2 is available at http://ccb.jhu.edu/software/tophat.

Bowtie 2, 2012

BRIEF COMMUNICATIONS

Fast gapped-read alignment with Bowtie 2

Ben Langmead^{1,2} & Steven L Salzberg¹⁻³

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Many aligners use a genome index to rapidly narrow the list of candidate alignment locations. The full-text minute index⁵ is a fast and memory-efficient index that has been used in recent aligners⁶⁻¹⁰. Index-assisted aligners work by searching for all ways of mutating the read string into a string that occurs in the reference, subject to an alignment policy limiting the number of differences. Although this search space is large, many portions of it can be skipped ('pruned') without loss of sensitivity. In practice, pruning strategies such as double indexing⁶ and bidirectional Burrows-Wheeler transform (BWT)⁷ facilitate very efficient

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STAR

STAR, 2013

BIOINFORMATICS

ORIGINAL PAPER

Vol. 29 no. 1 2013, pages 15-21 doi:10.1093/bioinformatics/bts635

Sequence analysis

Advance Access publication October 25, 2012

STAR: ultrafast universal RNA-seq aligner

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¹Cold Spring Harbor Laboratory, Cold Spring Harbor, NY, USA and ²Pacific Biosciences, Menlo Park, CA, USA Associate Editor: Inanc Birol

ABSTRACT

Motivation: Accurate alignment of high-throughput RNA-seq data is a challenging and yet unsolved problem because of the non-contiguous transcript structure, relatively short read lengths and constantly increasing throughput of the sequencing technologies. Currently available RNA-seq aligners suffer from high mapping error rates, low mapping speed, read length limitation and mapping biases.

Results: To align our large (>80 billon reads) ENCODE Transcriptome RNA-seq dataset, we developed the Spliced Transcripts Alignment to a Reference (STAR) software based on a previously undescribed RNA-seq alignment algorithm that uses sequential maximum mappable seed search in uncompressed suffix arrays followed by seed clustering and stitching procedure. STAR outperforms other aligners by a factor of >50 in mapping speed, aligning to the human genome 550 million 2×76 bp paired-end reads per hour on a modest 12-core server, while at the same time improving alignment sensitivity and precision. In addition to unbiased de novo detection of canonical junctions. STAR can discover non-canonical splices and chimeric (fusion) transcripts, and is also capable of mapping full-length RNA sequences. Using Roche 454 sequencing of reverse transcription polymerase chain reaction amplicons, we experimentally validated 1960 novel intergenic splice junctions with an 80-90% success rate, corroborating the high precision of the STAR mapping strategy.

Availability and implementation: STAR is implemented as a standalone C++ code. STAR is free open source software distributed under GPLv3 license and can be downloaded from http://code.google.com/ p/rna-star/.

Contact: dobin@cshl.edu.

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unique challenges to detection and characterization of spliced transcripts. Two key tasks make these analyses computationally intensive. The first task is an accurate alignment of reads that contain mismatches, insertions and deletions caused by genomic variations and sequencing errors. The second task involves mapping sequences derived from non-contiguous genomic regions comprising spliced sequence modules that are joined together to form spliced RNAs. Although the first task is shared with DNA resequencing efforts, the second task is specific and crucial to the RNA-seq, as it provides the connectivity information needed to reconstruct the full extent of spliced RNA molecules. These alignment challenges are further compounded by the presence of multiple copies of identical or related genomic sequences that are themselves transcribed, making precise mapping difficult.

Various sequence alignment algorithms have been recently developed to tackle these challenges (Au et al., 2010; De Bona, et al., 2008; Grant et al., 2011; Han et al., 2011; Trapnell et al., 2009; Wang et al., 2010; Wu and Nacu, 2010; Zhang et al., 2012). However, application of these algorithms invokes compromises in the areas of mapping accuracy (sensitivity and precision) and computational resources (run time and disk space) (Grant et al., 2011). With current advances in sequencing technologies, the computational component is increasingly becoming a throughput bottleneck. High mapping speed is especially important for large consortia efforts, such as ENCODE (http://www.genome.gov/encode/), which continuously generate large amounts of sequencing data.

Furthermore, most of the cited algorithms were designed to deal with relatively short reads (typically \(\leq 200 \) bases), and are ill-suited for aligning long read sequences generated by the emerging third-generation sequencing technologies (Flusberg et al., 2011). The longer read sequences ideally

- STAR works well with gaps + introns
- Preferable for mapping on RNA
- Faster than TopHat2

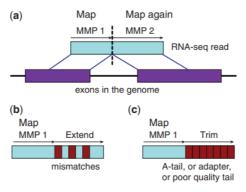
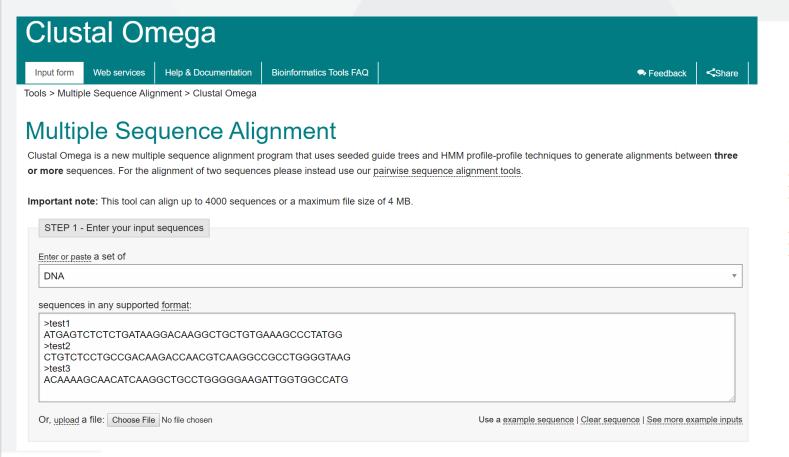


Fig. 1. Schematic representation of the Maximum Mappable Prefix search in the STAR algorithm for detecting (a) splice junctions, (b) mismatches and (c) tails

Clustal – Omega (Multiple Sequence Alignment)





Exercise

Global Alignment: Use Alignment Matrix

Global Alignment: Align Position Weight Matrices

https://bit.ly/3427HeE



