

# CSC 334: TOPICS IN COMPUTATIONAL BIOLOGY

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“Algorithms for Genomic Data”

Fall 2015

Smith College

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# Outline: 9/25

- Bowtie paper

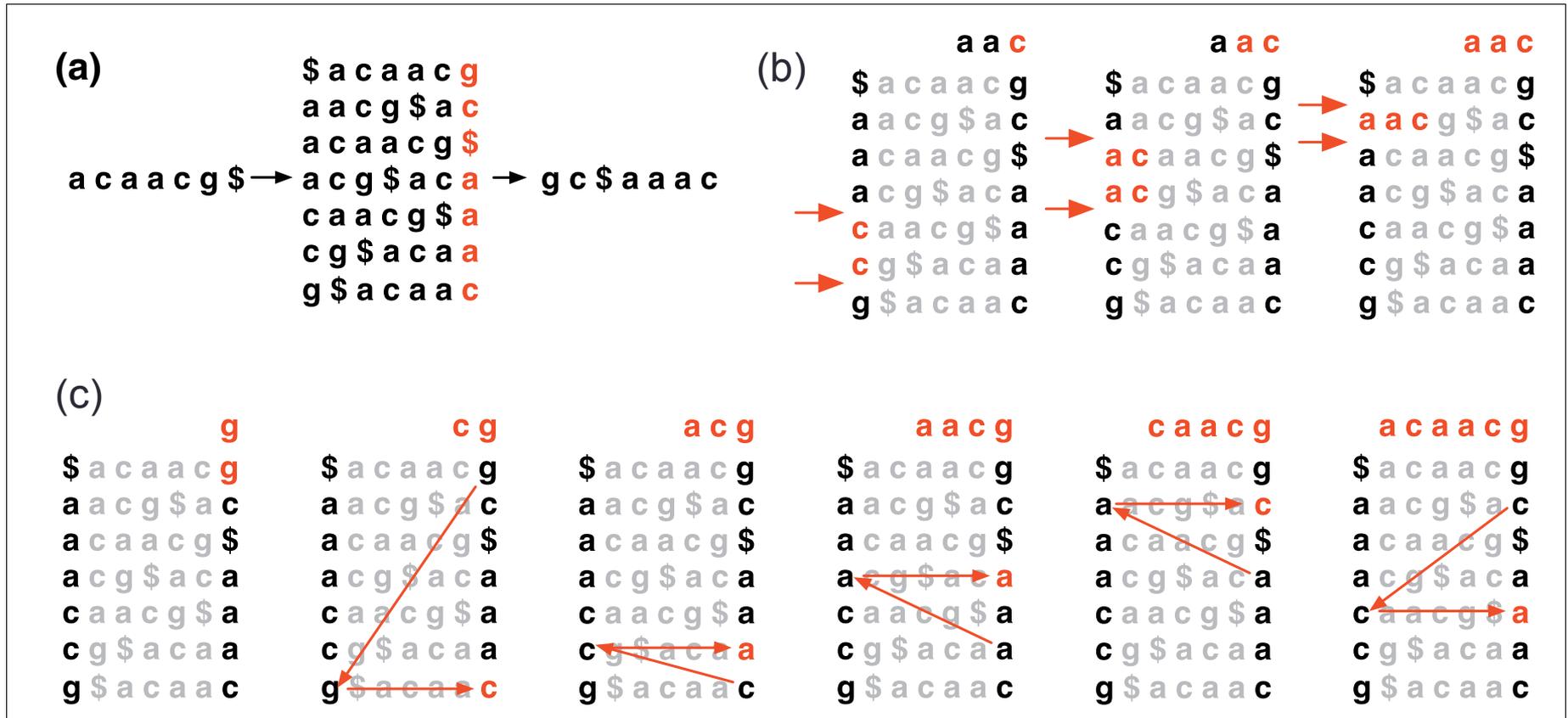
# BWT alignment vocabulary

- **Oligomer:** like a k-mer
- **Re-sequencing:** in this context, sequencing a new individual from the same species
- **Reversible permutation:** rearrangement of the characters of a string such that the original string is recoverable
- **Depth-first search:** (board)

# Bowtie description of BWT

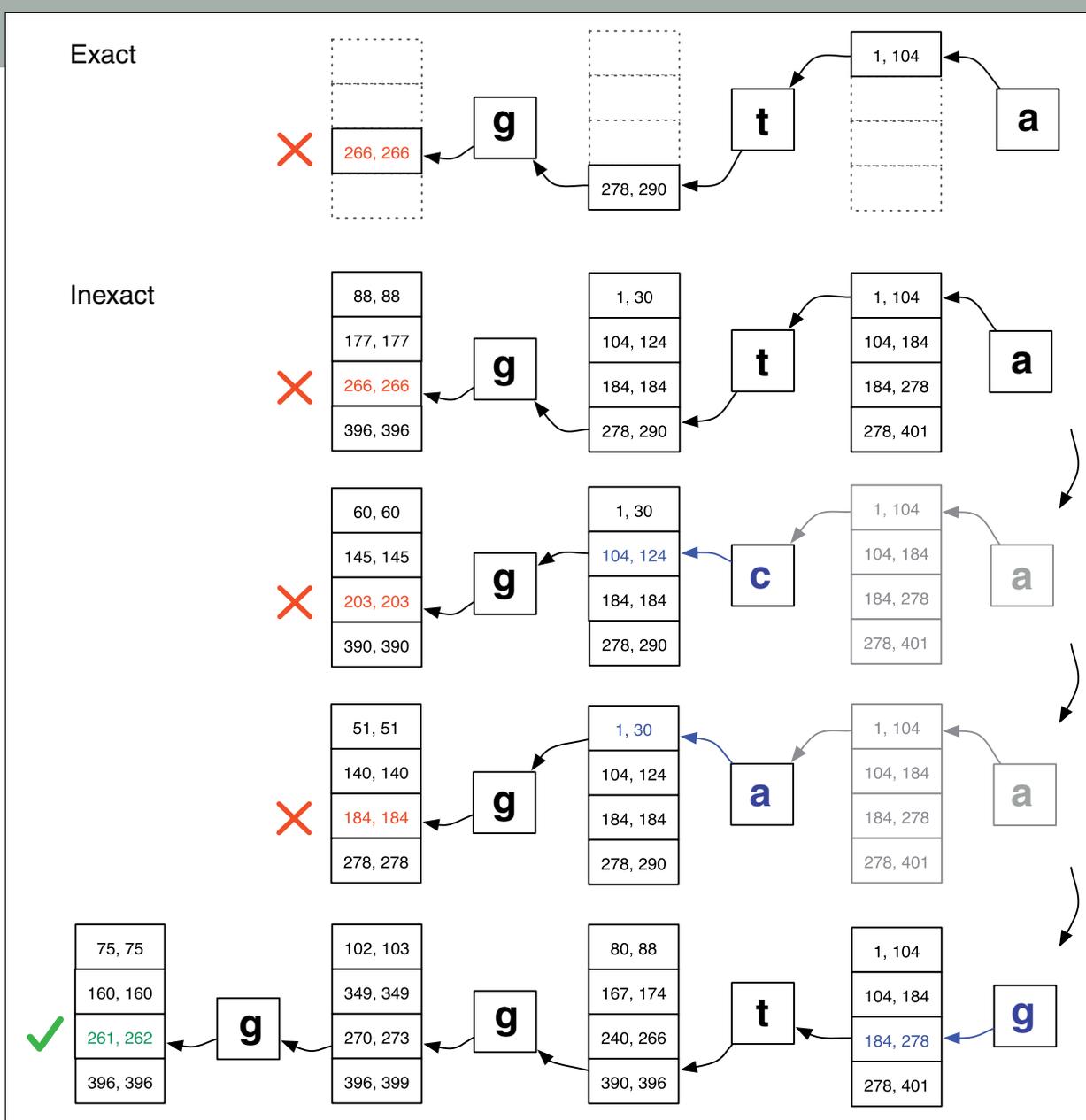
The Burrows-Wheeler transformation of a text  $T$ ,  $BWT(T)$ , is constructed as follows. The character  $\$$  is appended to  $T$ , where  $\$$  is not in  $T$  and is lexicographically less than all characters in  $T$ . The Burrows-Wheeler matrix of  $T$  is constructed as the matrix whose rows comprise all cyclic rotations of  $T\$$ . The rows are then sorted lexicographically.  $BWT(T)$  is the sequence of characters in the rightmost column of the Burrows-Wheeler matrix (Figure 1a).  $BWT(T)$  has the same length as the original text  $T$ .

# Bowtie: Figure 1



**Figure 1** Burrows-Wheeler transform. (a) The Burrows-Wheeler matrix and transformation for 'acaacg'. (b) Steps taken by EXACTMATCH to identify the range of rows, and thus the set of reference suffixes, prefixed by 'aac'. (c) UNPERMUTE repeatedly applies the last first (LF) mapping to recover the original text (in red on the top line) from the Burrows-Wheeler transform (in black in the rightmost column).

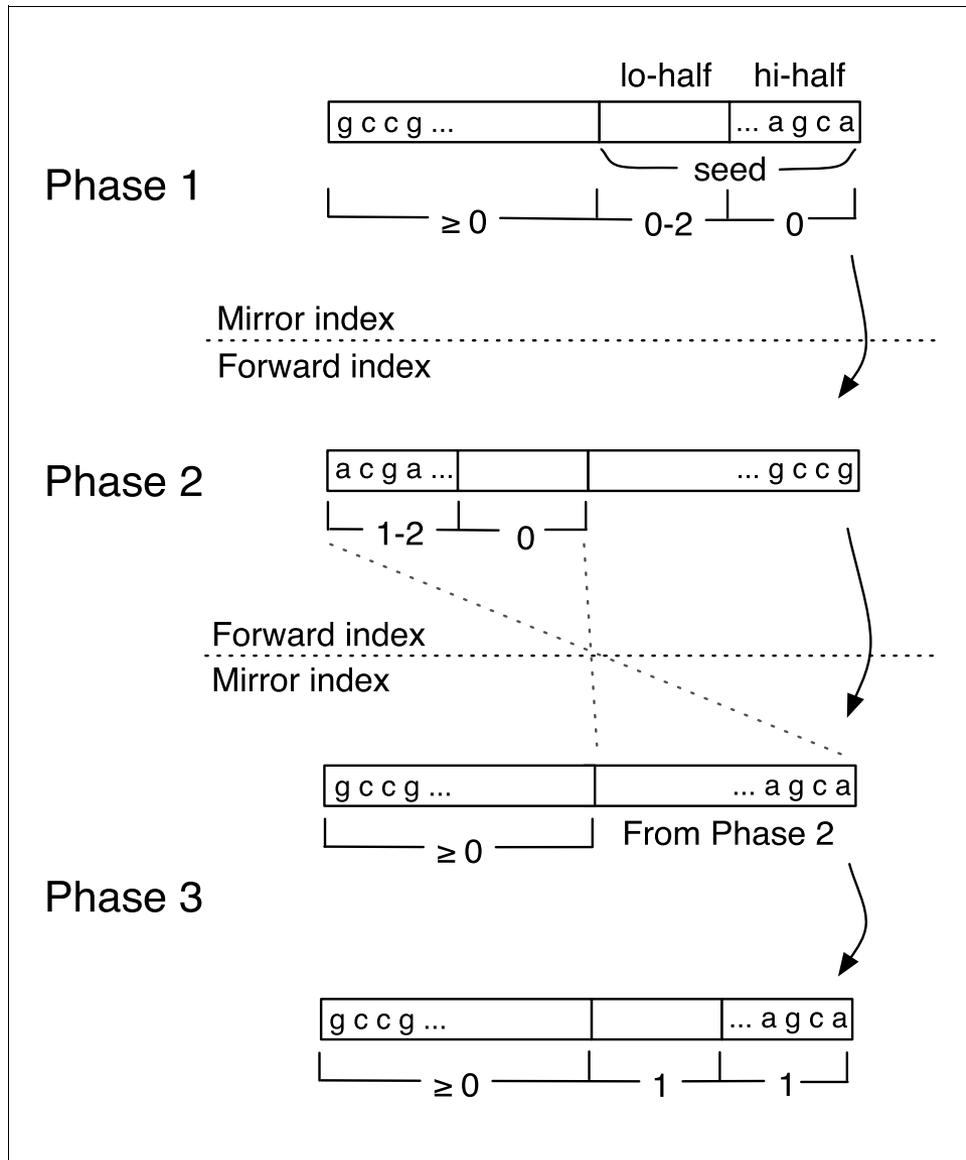
# Bowtie: Figure 2



**Figure 2**

Exact matching versus inexact alignment. Illustration of how EXACTMATCH (top) and Bowtie's aligner (bottom) proceed when there is no exact match for query 'ggta' but there is a one-mismatch alignment when 'a' is replaced by 'g'. Boxed pairs of numbers denote ranges of matrix rows beginning with the suffix observed up to that point. A red X marks where the algorithm encounters an empty range and either aborts (as in EXACTMATCH) or backtracks (as in the inexact algorithm). A green check marks where the algorithm finds a nonempty range delimiting one or more occurrences of a reportable alignment for the query.

# Bowtie: Figure 3



**Figure 3**

The three phases of the Bowtie algorithm for the Maq-like policy. A three-phase approach finds alignments for two-mismatch cases 1 to 4 while minimizing backtracking. Phase 1 uses the mirror index and invokes the aligner to find alignments for cases 1 and 2. Phases 2 and 3 cooperate to find alignments for case 3: Phase 2 finds partial alignments with mismatches only in the hi-half, and phase 3 attempts to extend those partial alignments into full alignments. Finally, phase 3 invokes the aligner to find alignments for case 4.

# Comparison with other aligners

Table 1

**Bowtie alignment performance versus SOAP and Maq**

	Platform	CPU time	Wall clock time	Reads mapped per hour (millions)	Peak virtual memory footprint (megabytes)	Bowtie speed-up	Reads aligned (%)
Bowtie -v 2	Server	15 m 7 s	15 m 41 s	33.8	1,149	-	67.4
SOAP		91 h 57 m 35 s	91 h 47 m 46 s	0.10	13,619	351×	67.3
Bowtie	PC	16 m 41 s	17 m 57 s	29.5	1,353	-	71.9
Maq		17 h 46 m 35 s	17 h 53 m 7 s	0.49	804	59.8×	74.7
Bowtie	Server	17 m 58 s	18 m 26 s	28.8	1,353	-	71.9
Maq		32 h 56 m 53 s	32 h 58 m 39 s	0.27	804	107×	74.7

# Comparison with other aligners

Table 2

**Bowtie alignment performance versus Maq with filtered read set**

	Platform	CPU time	Wall clock time	Reads mapped per hour (millions)	Peak virtual memory footprint (megabytes)	Bowtie speed up	Reads aligned (%)
Bowtie	PC	16 m 39 s	17 m 47 s	29.8	1,353	-	74.9
Maq		11 h 15 m 58 s	11 h 22 m 2 s	0.78	804	38.4×	78.0
Bowtie	Server	18 m 20 s	18 m 46 s	28.3	1,352	-	74.9
Maq		18 h 49 m 7 s	18 h 50 m 16 s	0.47	804	60.2×	78.0