

# CMSC423: Bioinformatic Algorithms, Databases and Tools

Exact string matching:  
introduction

# Sequence alignment: exact matching

ACAGGTACAGTTCCCTCGACACCTACTACCTAAG  
CCTACT  
CCTACT  
CCTACT  
CCTACT

Text  
Pattern

```
for i = 0 .. len(Text) {  
  for j = 0 .. len(Pattern) {  
    if (Pattern[j] != Text[i]) go to next i  
  }  
  if we got there pattern matches at i in Text  
}
```

Running time =  $O(\text{len}(\text{Text}) * \text{len}(\text{Pattern})) = O(mn)$

What string achieves worst case?

# Worst case?

AA  
AAAAAAAAAAAAAT

$(m - n + 1) * n$  comparisons

# Can we do better?

the Z algorithm (Gusfield)

For a string  $T$ ,  $Z[i]$  is the length of the longest prefix of  $T[i..m]$  that matches a prefix of  $T$ .  $Z[i] = 0$  if the prefixes don't match.

$$T[0 .. Z[i]] = T[i .. i+Z[i] - 1]$$

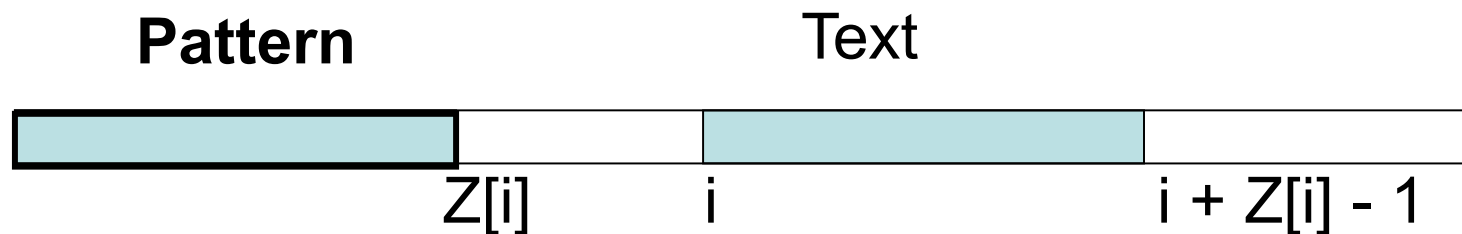


# Example Z values

ACAGGTACAGTTCCCTCGACACCTACTACCTAAG  
0010004010000000003020002002000110

# Can the Z values help in matching?

Create string `Pattern$Text` where `$` is not in the alphabet



If there exists  $i$ , s.t.  $Z[i] = \text{length}(\text{Pattern})$   
Pattern occurs in the Text starting at  $i$

# example matching

CCTACT\$ACAGGTACAGTTCCCTCGACACCTACTACCTAAG  
010010001000001000002310100106100100410000

- What is the largest Z value possible?

# Can Z values be computed in linear time?

AAAGGTACAGTTCCCTCGACACCTACTACCTAAG

Z[1]?      compare T[1] with T[0], T[2] with T[1], etc. until mismatch

Z[1] = 2

This simple process is still expensive:

T[2] is compared when computing both Z[1] and Z[2].

Trick to computing Z values in linear time:

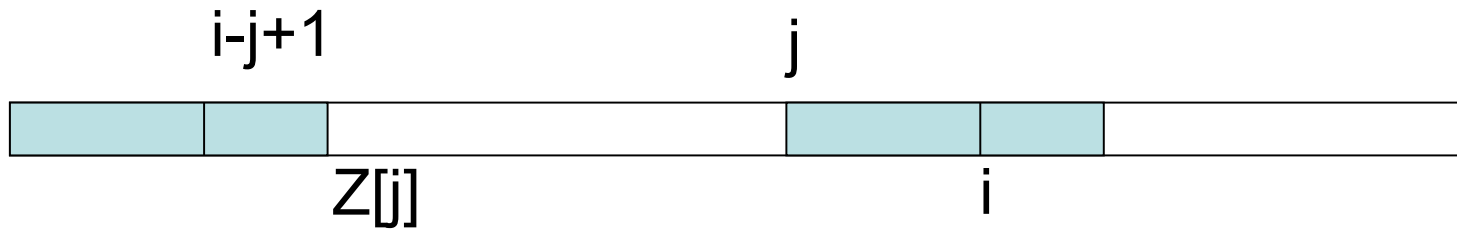
each comparison must involve a character that was not compared before

Since there are only  $m$  characters in the string, the overall # of comparisons will be  $O(m)$ .



# Basic idea: 1-D dynamic programming

Can  $Z[i]$  be computed with the help of  $Z[j]$  for  $j < i$ ?



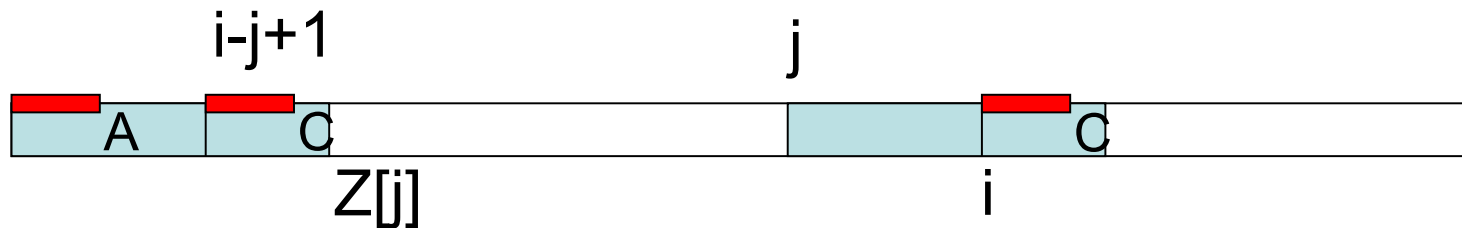
Assume there exists  $j < i$ , s.t.  $j + Z[j] - 1 > i$   
then  $Z[i - j + 1]$  provides information about  $Z[i]$

If there is no such  $j$ , simply compare characters  $T[i..]$  to  $T[0..]$   
since they have not been seen before.

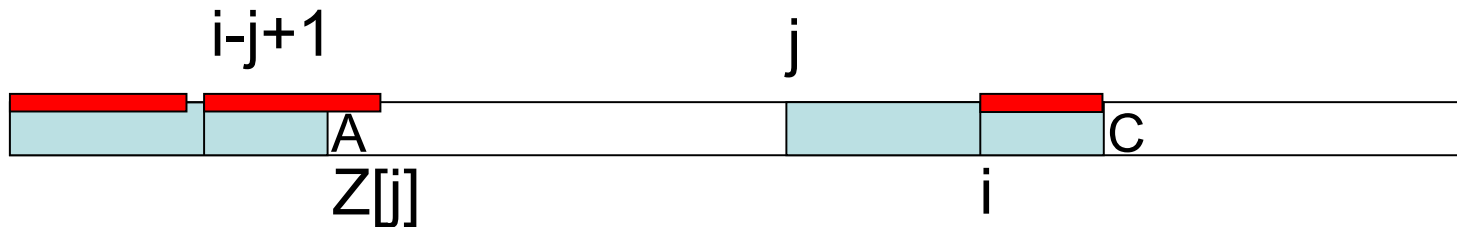
# Three cases

Let  $j < i$  be the coordinate that maximizes  $j + Z[j] - 1$   
(intuitively, the  $Z[j]$  that extends the furthest)

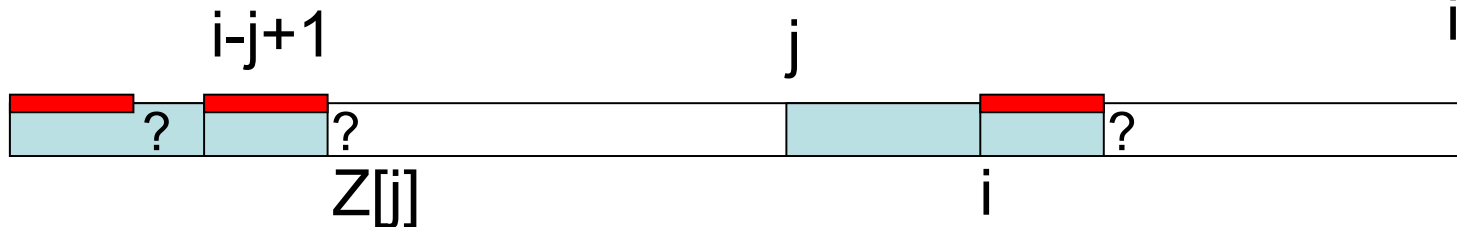
I.  $Z[i - j + 1] < Z[j] - i + j - 1 \Rightarrow Z[i] = Z[i - j + 1]$



II.  $Z[i - j + 1] > Z[j] - i + j - 1 \Rightarrow Z[i] = Z[j] - i + j - 1$



III.  $Z[i - j + 1] = Z[j] - i + j - 1 \Rightarrow Z[i] = ??$ , compare from  $i + Z[i - j + 1]$



# Time complexity analysis

- Why do these tricks save us time?
1. Cases I and II take constant time per Z-value computed – total time spent in these cases is  $O(n)$
  2. Case III might involve 1 or more comparisons per Z-value however:
    - every successful comparison (match) shifts the rightmost character that has been visited
    - every unsuccessful comparison terminates the “round” and algorithm moves on to the next Z-value

total time spent in III cannot be more than # of characters in the text
- Overall running time is  $O(n)$

# Space complexity?

- If using Z algorithm for matching, how many Z values do we need to store?

PPPPPPPPPP\$TTTTTTTTTTTTTTTTTTTTTTTTTTTTTT

# Some questions

- What are the Z-values for the following string:

TTAGGATAGCCATTAGCCTCATTAGGGATTAGGAT

- In the string above, what is the longest prefix that is repeated somewhere else in the string?
- Trace through the execution of the linear-time algorithm for computing the Z values for the string listed above. How many times do rules I, II, and III apply?

# Z algorithm, not just for matching

- Lempel-Ziv compression (e.g. gzip)

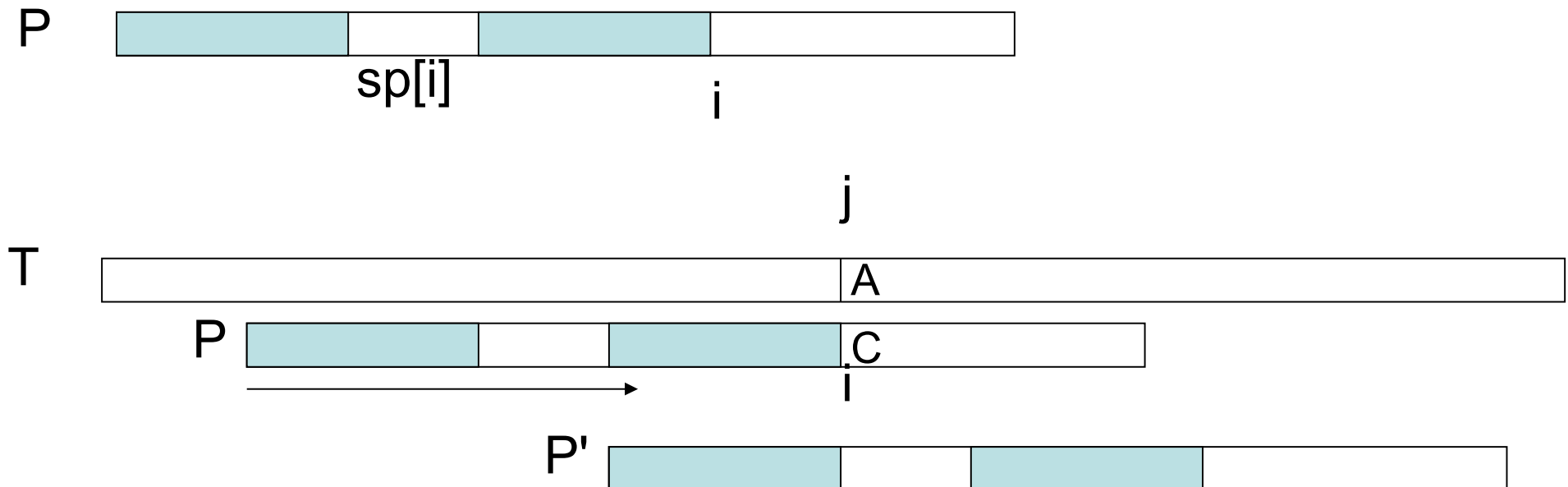


if  $Z[i] = 0$ , just send/store the character  $T[i]$ , otherwise,  
instead of sending  $T[i..i+Z[i] - 1]$  ( $Z[i] - 1$  characters/bytes)  
simply send  $Z[i]$  (one number)

- Note: other exact matching algorithms used for data compression (e.g. Burrows-Wheeler transform relates to suffix arrays)

# Knuth-Morris-Pratt algorithm

Given a Pattern and a Text, preprocess the Pattern to compute  $sp[i]$  = length of longest prefix of  $P$  that matches a suffix of  $P[0..i]$



- Compare  $P$  with  $T$  until finding a mis-match (at coordinate  $i + 1$  in  $P$  and  $j + 1$  in  $T$ ).
- Shift  $P$  such that first  $sp[i]$  characters match  $T[j - sp[i] + 1 .. j]$ .
- Continue matching from  $T[i+1]$ ,  $P[sp[i]+1]$

index: 0123456

pattern: AAAAAAA

sp: 0123456

index: 0123456

pattern: AAAAAAB

sp: 0123450

**AAAAABAAAAABAAAAAA**



index: 0123456

pattern: ABACABC

sp: 0010120

**ABABBABAABABACABC**

# KMP

- Does it work?
- Can you miss a match by shifting too far?
- How do you prove that?

# KMP – speed

- How many character comparisons are made during the execution?
- If a character in the text matches a character in the pattern, do we have to look at it again?
- How many times can a character in the text fail to match the pattern?

# KMP – computing sp values

- Can sp values be computed efficiently?
- Can you use Z values?
- (aside – sp' values)
- Can you use induction as for the Z values?