

COMS21103: String Matching

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Introduction - String Matching

In this lecture we look at **string matching** algorithms.


a b a b a a b b a b a b b
a b a b b

A large 'X' mark indicating a mismatch between the strings 'abababababab' and 'ababb' at index 5 (0-indexed), where 'a' in the top string does not match 'b' in the bottom string.


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a b a b a a b b a b a b b
a b a b b

A large checkmark indicating a match between the strings 'abababababab' and 'ababb' at index 5 (0-indexed), where 'b' in the top string matches 'b' in the bottom string.

In **simple terms**, we want to find all the occurrences of some string P in a larger string T .

Introduction

- ▶ This seems like a very simple problem, and it is:
 - ▶ The real problem is one of efficiency in time and space.
 - ▶ Doing many matching operations demands a better than naive approach.
- ▶ High performance string matching is vital in many applications:
 - ▶ In **web searches** or **databases**:
 - ▶ We might search stored text for a keyword supplied by the user.
 - ▶ In Unix tools like **grep**:
 - ▶ We need to match regular expressions against input text streams.
 - ▶ In **DNA matching**:
 - ▶ We match a small DNA strand against a large corpus
 - ▶ Here, as in many situations, inexact matching is also required

Introduction

- ▶ We look at four different exact string matching methods:
 - ▶ The naive, obvious method.
 - ▶ The **Knuth-Morris-Pratt** (KMP) algorithm.
 - ▶ The **Boyer-Moore-Horspool** (BMH) algorithm.
 - ▶ The **Finite State Machine** (FSM) algorithm.
- ▶ To compare each different approach, we count the number of **comparisons** they do:
 - ▶ Performance is mostly determined by how many comparisons are performed.
 - ▶ It is therefore a good candidate as our **computational step**.
 - ▶ To make absolutely sure, we should check that the run-time is linearly related to the number of comparisons in each case (it is).

Naive Method – Algorithm

- ▶ The **basic idea** is this:
 - ▶ Match pattern string against input string character by character.
 - ▶ When there is a **mismatch**, shift the whole input string down by one character in relation to the pattern string, and start again at the beginning.

Input: Strings P and T

$n \leftarrow |T|;$

$m \leftarrow |P|;$

for $i \leftarrow 0$ **to** $n - m$ **do**

if $P[1, \dots, m] = T[i + 1, \dots, i + m]$ **then**

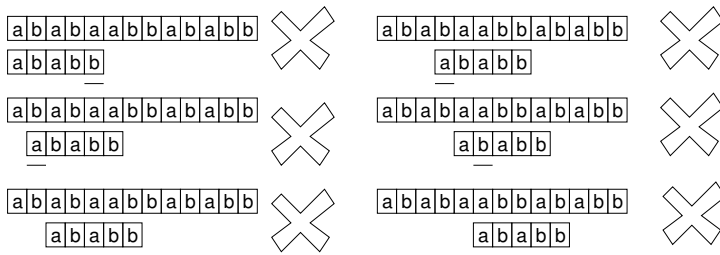
 OUTPUT($i + 1$);

end

end

Naive Method – Example

- Consider matching some example arrays where we set $T = \text{ababaabbababb}$ and $P = \text{ababb}$



- The underlined characters are where the match fails.
- This performs a total of **23** comparisons to find a match.

Naive Method – Summary

- ▶ However, consider a worst case example:
 - ▶ The input text is $aaa \dots b$ and of total length n .
 - ▶ That is, $n - 1$ a characters followed by one b .
 - ▶ The pattern is $aaa \dots b$ and of total length m .
 - ▶ That is, $m - 1$ a characters followed by one b .
- ▶ Using the naive method, we match up to the m -th character and after each mismatch, restart at the first character:
 - ▶ The mismatch occurs $n - m$ times.
 - ▶ The match succeeds at position $n - m + 1$.
 - ▶ The total number of comparisons is therefore $(n - m + 1) \cdot m \in \Theta(nm)$.

Knuth-Morris-Pratt – Algorithm

- ▶ When a **mismatch** occurs at index j in the naive method, we have found $j - 1$ characters that **do match**.
- ▶ We can take advantage of this when deciding where to restart the match:
 - ▶ Imagine a case where the string `ababb` mismatches at the 5th character.
 - ▶ The matched text consists of `abab?` where `?` is **unknown**.
 - ▶ We restart the match by comparing the 3rd character, an `a`, against `?`.
- ▶ In short, since we know the pattern beforehand we can work out where to restart the match.

Knuth-Morris-Pratt – Example

- Consider matching the same example arrays where we set $T = \text{ababaabbababb}$ and $P = \text{ababb}$:

a	b	a	b	a	a	b	b	a	b	a	b	b
---	---	---	---	---	---	---	---	---	---	---	---	---

a	b	a	b	b
---	---	---	---	---

✗

a	b	a	b	a	a	b	b	a	b	a	b	b
---	---	---	---	---	---	---	---	---	---	---	---	---

a	b	a	b	b
---	---	---	---	---

✗

a	b	a	b	a	a	b	b	a	b	a	b	b
---	---	---	---	---	---	---	---	---	---	---	---	---

a	b	a	b	b
---	---	---	---	---

✗

a	b	a	b	a	a	b	b	a	b	a	b	b
---	---	---	---	---	---	---	---	---	---	---	---	---

a	b	a	b	b
---	---	---	---	---

✗

a	b	a	b	a	a	b	b	a	b	a	b	b
---	---	---	---	---	---	---	---	---	---	---	---	---

a	b	a	b	b
---	---	---	---	---

✗

a	b	a	b	a	a	b	b	a	b	a	b	b
---	---	---	---	---	---	---	---	---	---	---	---	---

a	b	a	b	b
---	---	---	---	---

✓

- Note that we are shifting the pattern **either** by one or a distance from a precomputed prefix table.
- Now we only perform a total of **17** comparisons.

Knuth-Morris-Pratt – Algorithm

- ▶ The **basic idea** is this:
 - ▶ First compute the **prefix** table of the pattern which tells us where to restart.
 - ▶ Then when we run the KMP matcher, use the table when a mismatch occurs.

What is a prefix table? The prefix table tells us how far we can shift the pattern along at each turn without missing any matches. Let $P = ababb$.

- ▶ The j th element of the prefix table for P is the length of the longest prefix of $P[1, \dots, j]$ that is also a proper suffix of $P[1, \dots, j]$
- ▶ $P[1, 1] = a$. There is no proper suffix of a so the first element of the prefix table is 0
- ▶ $P[1, 2] = ab$. The only proper suffix of ab is b which is not a prefix of ab . Therefore the second element of the prefix table is 0
- ▶ $P[1, 3] = aba$. The proper suffices are ba and a . a is a prefix of aba so the third element of the prefix table is 1.
- ▶ The fourth and fifth elements of the prefix table are therefore 2 and 0.

Knuth-Morris-Pratt – Algorithm

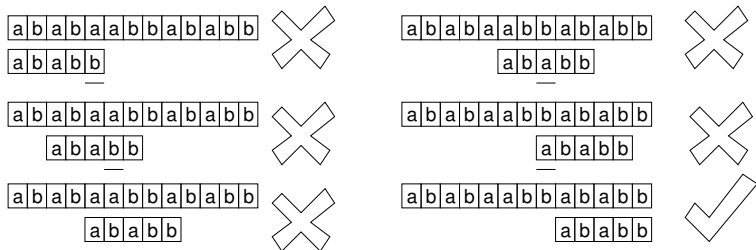
The overall algorithm structure is as follows.

```
KMP-MATCHER( $T, P$ )
begin
   $n \leftarrow |T|$ 
   $m \leftarrow |P|$ 
   $\Pi \leftarrow \text{KMP-PREFIX}(P)$ 
   $i \leftarrow 0$ 
  for  $j = 1$  upto  $n$  step 1 do
    while  $i > 0$  and  $P[i + 1] \neq T[j]$  do
       $i \leftarrow \Pi[i]$   $\triangleright$  Skip using prefix table
    if  $P[i + 1] = T[j]$  then
       $i \leftarrow i + 1$   $\triangleright$  Next character matches
    if  $i = m$  then
      OUTPUT( $j - m$ )  $\triangleright$  Pattern at shift  $j - m$ 
       $i \leftarrow \Pi[i]$   $\triangleright$  Look for next match
  end
```

Knuth-Morris-Pratt – Example

- ▶ Let's look at the example again. $T = \text{ababaabbababb}$ and $P = \text{ababb}$:

- ▶ We calculate the prefix table as $\Pi = \{0, 0, 1, 2, 0\}$.



- ▶ We use the prefix table to shift the pattern as required.

Knuth-Morris-Pratt – Running Time

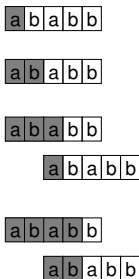
What is the largest number of comparison KMP can take for a pattern of length m and a text of length n ? Recall that i is the current index in the pattern and j is the current index in the text.

- ▶ There can be at most $n - 1$ successful comparisons
- ▶ There can be at most $n - 1$ failed comparisons since the number of times we decrease index i cannot exceed the number of times we increment i
- ▶ At max there are $2n - 2$ comparisons
- ▶ KMP takes $O(n)$ time assuming that the prefix table is available

Knuth-Morris-Pratt – Prefix Table

We can compute the prefix table by comparing the pattern against itself.

- ▶ For each $j \leq m$ we compute the length of the longest prefix of $P[1, \dots, j]$ that is also a proper suffix of $P[1, \dots, j]$.
- ▶ This can be done cleverly in $O(m)$ time



KMP-PREFIX(P)

begin

$m \leftarrow |P|$

$\Pi[1] \leftarrow 0$

$i \leftarrow 0$

for $j = 2$ **upto** m **step** 1 **do**

while $i > 0$ **and** $P[i + 1] \neq P[j]$ **do**

$i \leftarrow \Pi[i]$

if $P[i + 1] = P[j]$ **then**

$i \leftarrow i + 1$

$\Pi[j] \leftarrow i$

return Π

end

Knuth-Morris-Pratt – Summary

- ▶ The KMP algorithm **never** needs to back-track in the input text:
 - ▶ This is an advantage if the text is streamed rather than in an array since we don't have to maintain a buffer for the stream.
- ▶ The worst case performance is $O(n)$ comparisons.
- ▶ However, it doesn't improve much on the average case:
 - ▶ Best performance when alphabet is small since this means higher chance of repeated substrings in the input and pattern.

Boyer-Moore-Horspool – Algorithm

- ▶ The main goals of BMH are simplicity and improving on the weakness of KMP over large alphabets
 - ▶ Use the alphabet that makes up the pattern and input text to skip **large distances**.
 - ▶ Make comparisons starting on the **right** of the pattern rather than the left, this finds the rightmost mismatch.
- ▶ The trick is to consider the alphabet over which the text is defined:
 - ▶ The alphabet is the set of characters C_0, C_1, \dots, C_{k-1} .
- ▶ We build a table Γ which tells us the rightmost occurrence of each letter in the pattern.
 - ▶ For each C_i in the pattern string, set $\Gamma[i]$ to be the position of the rightmost occurrence of C_i in the pattern.

Boyer-Moore-Horspool – Example

- Say we want to search for the pattern `lean` in the following string:

[illegible]

- ▶ The characters `n` and `p` mismatch, also `p` doesn't appear anywhere in the pattern so we can move all the way past `p` and restart:

[illegible]

- ▶ The characters `n` and `e` mismatch, but now `e` occurs in the pattern so line them up:
- ▶ Only 8 comparisons needed in this example. KMP would need 18.

[illegible]

Boyer-Moore-Horspool – Summary

- ▶ In the worst case no better than naive matching:
 - ▶ The Horspool heuristic is very fast in practice
- ▶ The method works best when you have little repetition within the input text.
 - ▶ The worst case is $O(nm)$ comparisons. Consider $p = ba^{m-1}$ and $t = a^n$.
 - ▶ The best case is now $O(n/m)$ comparisons.
 - ▶ Fast in practice.

Finite State Machines (1)

- ▶ The previous methods are quite efficient but also quite simplistic in what they can do:
 - ▶ What happens if we want to consider **regular expressions** ?
- ▶ This is exactly the problem faced by **parsers** in a compiler:
 - ▶ One defines the syntactic tokens as regular expressions:
`value := [0-9]+`
`ident := [a-z][a-z0-9]*`
 - ▶ The goal is to match these patterns against the input text.
- ▶ Using the KMP or Boyer-Moore methods is problematic:
 - ▶ Pre-computing the tables can't be done since the pattern is not finite.

Finite State Machines (2)

- ▶ We can solve this problem by using a fourth type of matching method.
- ▶ A Finite State Machine (FSM) is formally defined by the following parts.
 - ▶ Q , a finite set of **states**.
 - ▶ $q_0 \in Q$, a **start state**.
 - ▶ $A \subseteq Q$, a set of **accepting states**.
 - ▶ Σ , an **input alphabet**.
 - ▶ δ , a function from $Q \times \Sigma$ into Q which we call the **transition function**.
- ▶ More simply, it is just a graph where moving between nodes means consuming input characters.

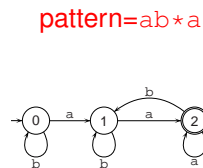
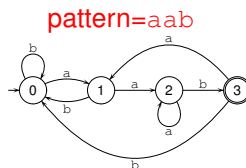
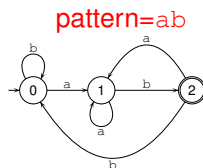
Finite State Machines (3)

- ▶ Here are a few examples of basic regular expressions:
 - a^+ – **one** or more repetitions of a .
 - a^* – **zero** or more repetitions of a .
 - $.$ – **any** character.
- ▶ The hard bit is constructing the automaton.
- ▶ However, once this is done implementing the matching algorithm is quite easy.

```
FSM-MATCHER( $T, P$ )  
begin  
   $n \leftarrow |T|$   
   $\delta \leftarrow \text{FSM-BUILD}(P)$   
   $s \leftarrow 0$   
  for  $i = 1$  upto  $n$  step 1 do  
     $s \leftarrow \delta(s, T[i])$   
    if  $s$  is an accepting state then  
      OUTPUT( $i$ )  
end
```

Finite State Machines (4)

- ▶ Consider some example FSM constructions:
 - ▶ Take the input string a character at a time and move along edges which match each character.
 - ▶ The empty edge denotes the start state, double circled nodes are accepting states which signal a match.



- ▶ **Question:** How do we move through the states for the string aababaaba ?

Comparison

- ▶ To get an idea of which algorithm is best, we can compare their complexities:

	Pre-computation	Matching
Naive		$\Theta(nm)$
Knuth-Morris-Pratt	$\Theta(m)$	$\Theta(n)$
Boyer-Moore-Horspool	$O(m + \Sigma)$	$\Theta(nm)$
Finite State Machine	$O(m \Sigma)$	$\Theta(n)$

- ▶ Some points to note from this analysis are:
 - ▶ For one-off matches on short strings, the naive method isn't so bad.
 - ▶ The methods that require pre-computation may also require extra memory.

Conclusions

- ▶ String matching sounded like a trivial problem:
 - ▶ Hopefully you can see there is a little more to it than the naive method.
- ▶ As a general rule, selecting the right algorithm is done as follows:
 - ▶ If you need to consider complex matching like regular expressions, use the **FSM** method.
 - ▶ Otherwise, the choice depends on the alphabet size:
 - ▶ For large alphabets, like natural language, use the **Boyer-Moore-Horspool** method.
 - ▶ For small alphabets, use the **Knuth-Morris-Pratt** method.
- ▶ However, there are some even more complicated methods than these.
- ▶ See <http://tinyurl.com/eolt7> for a long list with example code.

Further Reading

- ▶ **Introduction to Algorithms**

T.H. Cormen, C.E. Leiserson, R.L. Rivest and C. Stein.
MIT Press/McGraw-Hill, ISBN: 0-262-03293-7.

- ▶ Chapter 32 – String Matching.

- ▶ **YouTube Lessons**

- ▶ KMP - Aliaksei Mikhailiuk <https://youtu.be/HaAu5ZGj6fc>
 - ▶ KMP - Callum Mann <https://youtu.be/v82y5TCcBhQ>
 - ▶ BMH - Mike Slade <https://youtu.be/PHXAOKQk2dw>
 - ▶ FSM - Sam Meredith <https://youtu.be/yY0E-45AxUI>