



PSO 13  
(Suffix) Tries, Forward Pattern Matching

### (Trie & lexicographic sort)

Given two bit strings  $a = a_0a_1 \dots a_p$  and  $b = b_0b_1 \dots b_q$ , we assume WLOG that  $p \leq q$ . Recall that  $a$  is said to be **lexicographically less** than  $b$  if one of the following happens:

- there exists an integer  $j \leq p$  such that  $a_i = b_i$  for all  $0 \leq i < j$  and  $a_j < b_j$ .
- $p < q$  and  $a_i = b_i$  for all  $0 \leq i \leq p$ .

Given a set  $S$  of distinct bit strings whose lengths sum to  $n$ , show how to use a radix tree (a.k.a. trie for bit strings) to sort  $S$  lexicographically in  $O(n)$  time. For example, if  $S = \{1011, 10, 011, 100, 0\}$ , then the output should be the sequence 0, 011, 10, 100, 1011.

## Question 2

### (Suffix Tries)

- (1) Draw the suffix tree for the string  $s = \text{abracadabra}$ .
- (2) What is the longest substring that appears more than once in the string  $s = \text{abracadabra}$ ?
- (3) How can we generally find the longest substring appearing more than once given a suffix trie?

### Question 3

#### (Forward pattern matching)

Another efficient pattern matching algorithm, named the Knuth-Morris-Pratt (KMP) algorithm, is based upon forward pattern matching, in which a failure function (also named as “suffix function”) is calculated to determine the most distance we can shift the pattern to avoid redundant comparisons. Specifically, for a pattern  $P$ , its corresponding failure function  $F_P(j)$ , or  $F(j)$  for short, is defined as

$$F(j) := \max_k \{k \leq j - 1 : P[0 : k] = P[j - k : j]\}.$$

In other words,  $F(j)$  represents the size of the largest prefix of  $P[0 : j]$  that is also a suffix of  $P[1 : j]$ .

In brief, the KMP algorithm can be described as: When a mismatch occurs at  $T[i]$ , if you are

- currently at  $P[j]$  with some  $j > 0$ , then shift  $P$  to align  $P[F(j - 1)]$  with  $T[i]$ .
- currently at  $P[0]$ , then shift  $P[0]$  to align with  $T[i + 1]$ .

Answer the following questions:

(1) Apply the KMP algorithm to the Boyer-Moore pattern matching problem in previous PSO, where

$$T := \underbrace{aaaaaaaaa}_9 \quad \text{and} \quad P := baaaaa.$$

1. Does it perform much better than Boyer-Moore?

(2) What is the failure function for the pattern  $P := \text{“mamagama”}$ ?

(3) Let  $T := \text{“rahhahahahromaromamagaoohlala”}$ , run the KMP pattern matching algorithm for the pattern  $P$  in (2).

### (Trie & lexicographic sort)

Given two bit strings  $a = a_0a_1 \dots a_p$  and  $b = b_0b_1 \dots b_q$ , we assume WLOG that  $p \leq q$ . Recall that  $a$  is said to be **lexicographically less** than  $b$  if one of the following happens:

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$n=13$

### Lexigraphic Ordering Practice:

- 'c' vs 'ab'  $>$
- 'abc' vs 'abca'  $<$
- 'abbbbb' vs 'baaaaa'  $<$

trie.insert

↑ BST insert but with letters  
11  
20, 15

(Trie & lexicographic sort)

Given two bit strings  $a = a_0a_1 \dots a_p$  and  $b = b_0b_1 \dots b_q$ , we assume WLOG that  $p \leq q$ . Recall that  $a$  is said to be **lexicographically less** than  $b$  if one of the following happens:

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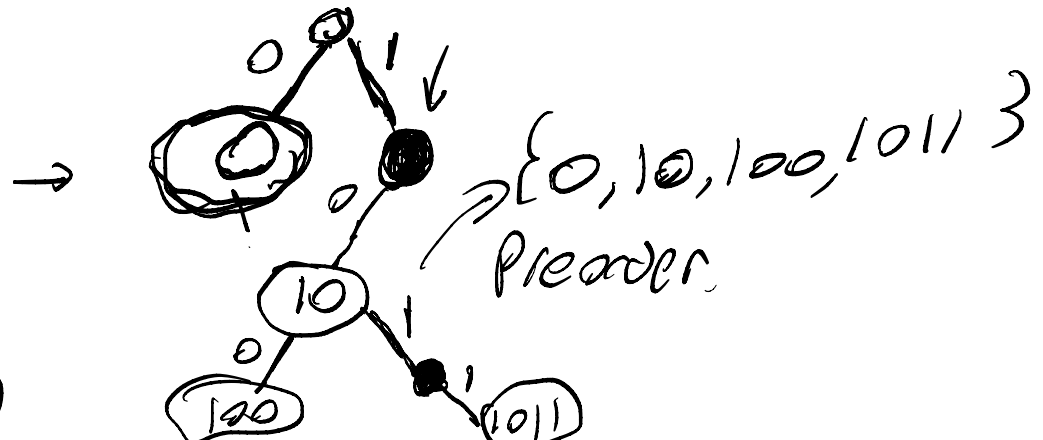
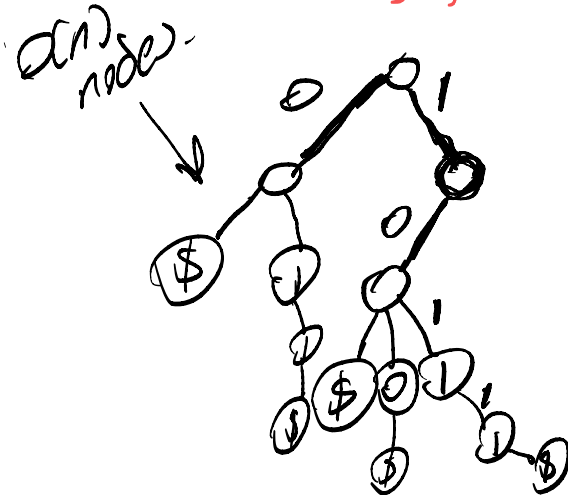
Given a set  $S$  of distinct bit strings whose lengths sum to  $n$ , show how to use a radix tree (a.k.a. trie for bit strings) to sort  $S$  lexicographically in  $O(n)$  time. For example, if  $S = \{1011, 10, 011, 100, 0\}$ , then the output should be the sequence  $0, 011, 10, 100, 1011$ .

$$\text{Sorted} = \{0, 911, 10, 100, 1011\}$$

## Form the trie for S

first tree starts out as a null root

~~inn~~: not intrinsic.



{a, ab, abc}  $\rightarrow$

```

graph TD
    a((a)) --> b1((b))
    a --> c1((c))
    b1 --> a1((a))
    b1 --> c2((c))
    c2 --> b2((b))
  
```

(1) Draw the suffix tree for the string  $s = \text{abracadabra}$ .

(2) What is the longest substring that appears more than once in the string  $s = \text{abracadabra}$ ?

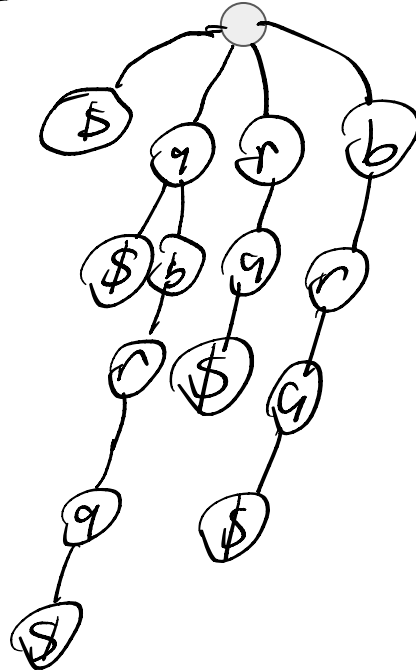
(3) How can we generally find the longest substring appearing more than once given a suffix trie?

## Drawing a suffix tree:

1. List out the suffixes,  $S = \{a, ra, bra, abra, \dots\}$
2. Use  $S$  to populate the trie

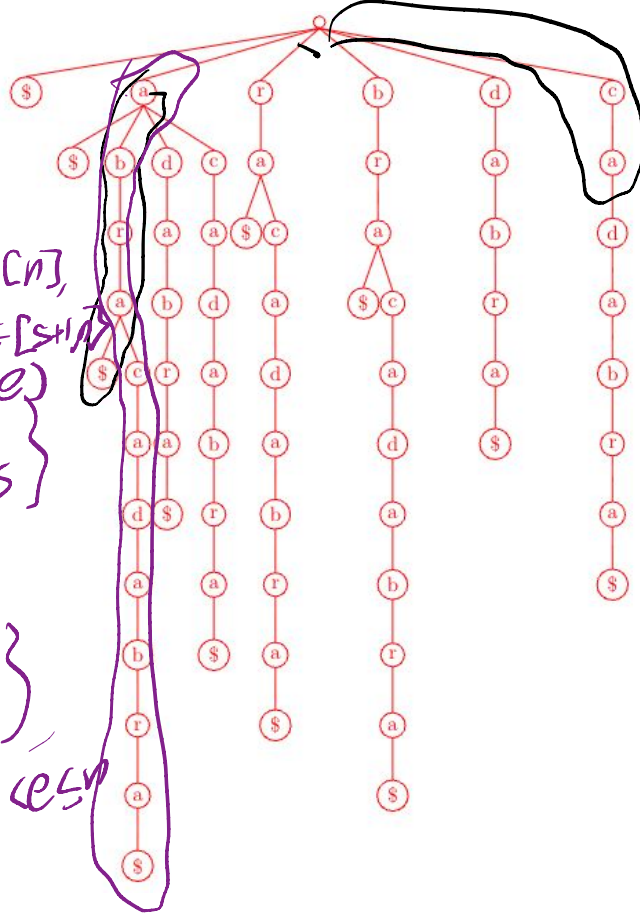
$S = \{\$, a, ra, bra, abra, dabra, adabra, adabra, cadabra, acadabra, racadabra, bracadabra, abracadabra\}$

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\_\_\_\_\_



$\{ \text{substrings} \}$   
 $(s, e) \text{ f.s. } e \leq n$

- (2) What is the longest substring that appears more than once in the string  $s = \text{abracadabra}$ ?
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Answer the following questions:

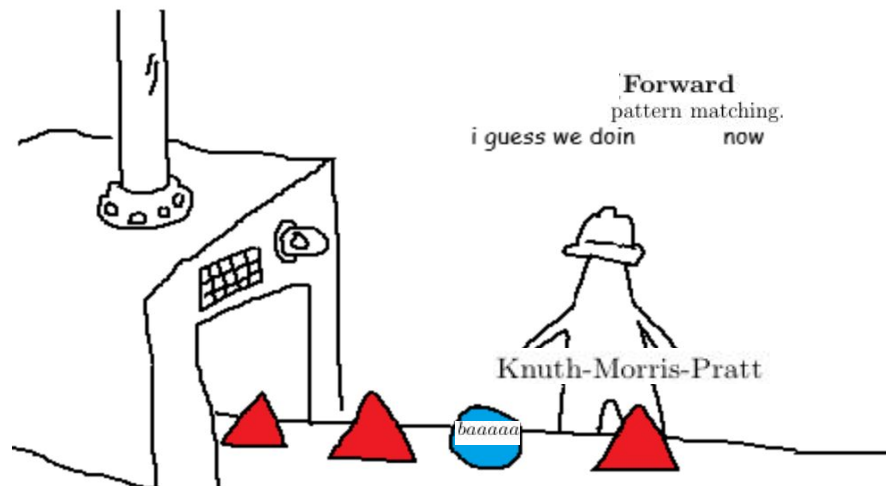
(1) Apply the KMP algorithm to the Boyer-Moore pattern matching problem in previous PSO, where

<b>T</b>	a	a	a	a	a	a	a	a
<b>P</b>	b	a	a	a	a	a		

*a a a a a b*

Boyer Moore did 24 comparisons (worse than forward brute force)!

*forward: 6 comparisons*



<b>P</b>	b	a	a	a	a	a			
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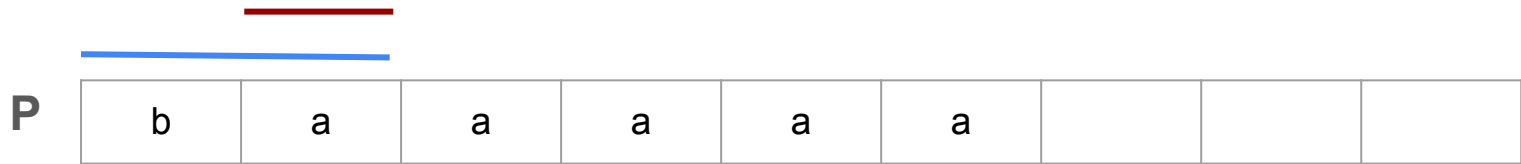
$F(j)$  represents the size of the largest prefix of  $P[0 : j]$  that is also a suffix of  $P[1 : j]$ .

$$F(j) := \max_k \{k \leq j - 1 : P[0 : k] = P[j - k : j]\}.$$

Navigation icons: back, forward, search, etc.

## Failure function

<b>j</b>	1	2	3	4	5	6	7
<b>f(j)</b>							

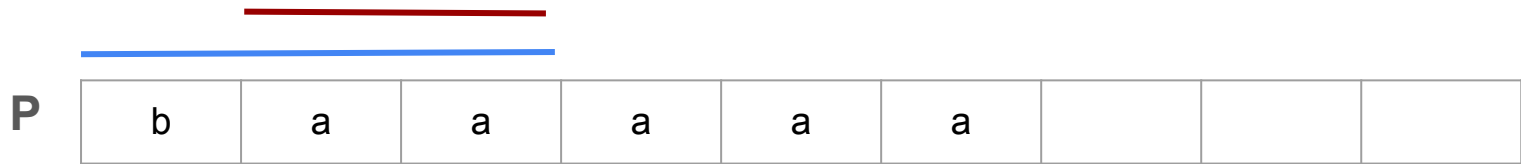


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Failure function

<b>j</b>	<b>1</b>	<b>2</b>	<b>3</b>	<b>4</b>	<b>5</b>	<b>6</b>	<b>7</b>
<b>f(j)</b>							

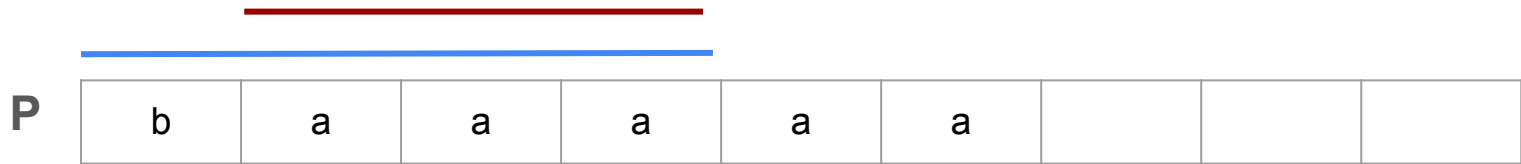


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Failure function

<b>j</b>	1	2	3	4	5	6	7
<b>f(j)</b>	0						



$F(j)$  represents the size of the largest prefix of  $P[0 : j]$  that is also a suffix of  $P[1 : j]$ .

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Failure function

<b>j</b>	1	<b>2</b>	3	4	5	6	7
<b>f(j)</b>	0	0					

<b>P</b>									
	b	a	a	a	a	a			

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Failure function

<b>j</b>	1	<b>2</b>	3	4	5	6	7
<b>f(j)</b>	0	0	0	0	0	0	0

Why all 0s?



(2) What is the failure function for the pattern  $P := \text{"mamagama"}$ ?

$F(j)$  represents the size of the largest prefix of  $P[0:j]$  that is also a suffix of  $P[1:j]$ .

$P[0:j]$   $P[1:j]$   
m a m a g a m a

$(j=1)$

j	1	2	3	4	5	6	7
f(j)	0						

(2) What is the failure function for the pattern  $P := \text{“mamagama”}$ ?

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$P[0:j]$   $P[1:j]$   
m a m a g a m a

<b>j</b>	1	<b>2</b>	3	4	5	6	7
<b>f(j)</b>	0	<u>1</u>					

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m a m a g a m a

j	1	2	3	4	5	6	7
f(j)	0	1	2				

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m a m a g a m a

<b>j</b>	1	2	3	<b>4</b>	5	6	7
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m a m a g a m a

j	1	2	3	4	5	6	7
f(j)	0	1	2	0	0	1	

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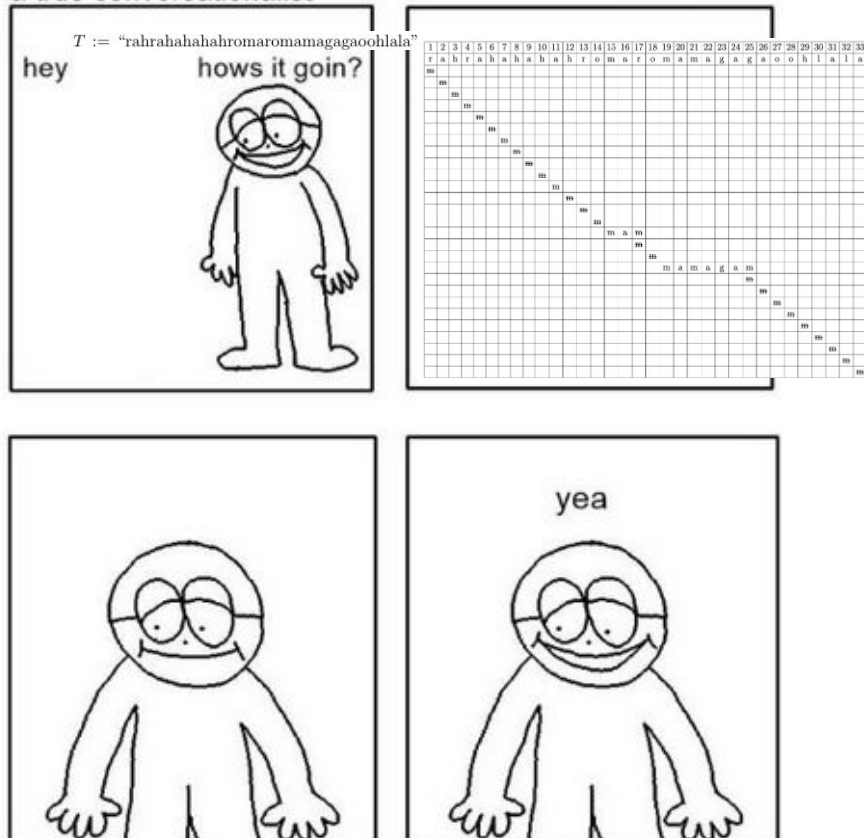


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(3) Let  $T := \text{"rahhahahahromaromamagagaoohlala"}$ , run the KMP pattern matching algorithm for the pattern  $P$  in (2).

This example is a bit long..



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Let  $T = \text{"rahmamamagama"}$

$\tau[j]$

$j$

$f(j)$

1	2	3	4	5	6	7
0	1	2	0	0	1	2

( $i = 0$ )

**T**

**P**

r	a	h	m	a	m	a	m	a	m	a	m	a
m	a	m	a	g	a	m	a					

( $Q = 9$ )

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Let  $T = \text{"rahmamamagama"}$

$j$

$f(j)$

1	2	3	4	5	6	7
0	1	2	0	0	1	2

$(i = 1)$

**T**

r	<b>a</b>	h	m	a	m	a	m	a	m	a	m	a
	<b>m</b>	a	m	a	g	a	m	a				

**P**

$(j = 0)$

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**j**

1	2	3	4	5	6	7
0	1	2	0	0	1	2

**f(j)**

(i = 2)

**T**

r	a	<b>h</b>	m	a	m	a	m	a	m	a	m	a
		<b>m</b>	a	m	a	g	a	m	a			

**P**

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- currently at  $P[0]$ , then shift  $P[0]$  to align with  $T[i + 1]$ .

$P[f(3)] = P[2]$

Let  $T = \text{"rahmamamagama"}$

j	1	2	3	4	5	6	7
f(j)	0	1	2	0	0	1	2

T	r	a	h	<del>m</del>	<del>a</del>	<del>m</del>	<del>a</del>	m	a	m	a	m	a
P				m	a	m	a	g	a	m	a		

$(i=3)$   $(j=7)$   $(j=4)$

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Let  $T = \text{"rahmamamagama"}$

**j**

**f(j)**

1	2	3	4	5	6	7
0	1	2	0	0	1	2

(i = 7)

**T**

**P**

r	a	h	m	a	m	a	<b>m</b>	a	m	a	m	a
			m	a	m	a	<b>g</b>	a	m	a		

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Let  $T = \text{"rahmamamagama"}$

**j**

1	2	3	4	5	6	7
0	1	2	0	0	1	2

**f(j)**

**T**

(i = 7)

**P**

r	a	h	m	a	m	a	<b>m</b>	a	m	a	m	a
			m	a	m	a	<b>g</b>	a	m	a		

(j = 4)

Mismatch at  $P[4]$

In brief, the KMP algorithm can be described as: When a mismatch occurs at  $T[i]$ , if you are

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Let  $T = \text{"rahmamamagama"}$

j

1	2	3	4	5	6	7
0	1	2	0	0	1	2

f(j)

T

r	a	h	m	a	m	a	m	a	m	a	m	a
			m	a	m	a	g	a	m	a		

P

Mismatch at  $P[4]$ , align  $P[2]$  with  $T[7]$



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Let  $T = \text{"rahmamamagama"}$

j	1	2	3	4	5	6	7
f(j)	0	1	2	0	0	1	2

T	r	a	h	m	a	m	a	m	a	m	a	m	a
P						m	a	m	a	g	a	m	a
				m	a	m	a	g	a	m	a		

Mismatch at  $P[4]$ , align  $P[2]$  with  $T[7]$  **Why?**

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j

1	2	3	4	5	6	7
0	1	2	0	0	1	2

f(j)

~~ma~~ ~~ma~~ ~~ga~~ ~~ma~~

T	r	a	h	m	a	m	a	m	a	m	a	m	a
P				m	a	m	a	g	a	m	a		

Mismatch at  $P[4]$ , align  $P[2]$  with  $T[7]$  Why?

**f(3)** says these are equal

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Let  $T = \text{"rahmamamagama"}$

j	1	2	3	4	5	6	7
f(j)	0	1	2	0	0	1	2

T	r	a	h	m	a	m	a	m	a	m	a
P				m	a	m	a	m	a		

Mismatch at  $P[4]$ , align  $P[2]$  with  $T[7]$  **Why?**

**Mismatch at  $P[4] \rightarrow$  No mismatch before  $P[4]$**

In brief, the KMP algorithm can be described as: When a mismatch occurs at  $T[i]$ , if you are

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Let  $T = \text{"rahmamamagama"}$

<b>j</b>	1	2	3	4	5	6	7
<b>f(j)</b>	0	1	2	0	0	1	2

<b>T</b>	r	a	h	m	a	m	a	m	a	m	a	m	a
<b>P</b>						m	a	m	a	g	a	m	a
				m	a	m	a	g	a	m	a		

Mismatch at  $P[4]$ , align  $P[2]$  with  $T[7]$  **Why?**

**No mismatch before  $P[4] \rightarrow$  I can move pattern two spaces**