

# An Adaptive Hybrid Pattern-Matching Algorithm on Indeterminate Strings

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# Outline

- 1 Introduction
- 2 Fundamental Algorithms
  - The Knuth-Morris-Pratt Algorithm
  - The Sunday Adaption of Boyer-Moore Algorithm
  - The Shift-And Algorithm
  - The Franek-Jennings-Smyth Algorithm
- 3 Special Properties of Indeterminate Borders
- 4 The New Hybrid Algorithm
  - Outline of the New Algorithm
  - Shift-And Matching
  - Sunday-Shift
  - Examples
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## Regular Pattern Matching Algorithms

Over the last several decades, dozens of regular pattern-matching algorithms have been proposed.

- **Window shifting**: KMP [KMP77], BM [BM77], FJS [FJS06], etc.
- **Bit-parallel**: Shift-Or [Döm68, WM92, BYG92], BNDM [NR98], etc.

## Regular Pattern Matching Algorithms

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# Indeterminate Pattern-Matching Algorithms

Intuitive approach: Modify existing regular pattern-matching algorithms to do indeterminate pattern-matching.

- **Shift-Or**: Can be modified to indeterminate pattern-matching easily, with the same speed of regular pattern-matching.
- **iBMS**: A very fast indeterminate pattern-matching algorithm based on BMS has been proposed in [HSW06b].
- **iFJS**: An indeterminate pattern-matching algorithm based on modified FJS (cut-off border array) has been proposed in [HSW06a].

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## Indeterminate String

A (regular) string  $x$  on  $\Sigma$  is a finite sequence of letters drawn from  $\Sigma$ . Two letters  $\lambda, \mu \in \Sigma$  are said to *match* ( $\lambda \approx \mu$ ) iff  $\lambda = \mu$ . Consider any specified **subset**  $S = \{\lambda_1, \lambda_2, \dots, \lambda_j\}$  of  $\Sigma$ ,  $j \geq 2$ . We introduce the idea of an **indeterminate letter**  $\lambda = \lambda_S$  with the property that it matches every element of  $S$  (but no other letter); we write

$$\lambda \approx \lambda_1, \lambda \approx \lambda_2, \dots, \lambda \approx \lambda_j.$$

Given two subsets  $S, T$  of  $\Sigma$ ,  $|S| \geq 2$ ,  $|T| \geq 2$ , and indeterminate letters  $\lambda, \mu$  associated with  $S, T$  respectively,  
 $\lambda \approx \mu \Leftrightarrow S \cap T \neq \emptyset$ . Given two indeterminate strings  $x$  and  $y$ ,  
 $x \approx y \Leftrightarrow (|x| = |y|) \wedge (\forall i \in 1..|x|, x[i] \approx y[i])$ .

# Outline

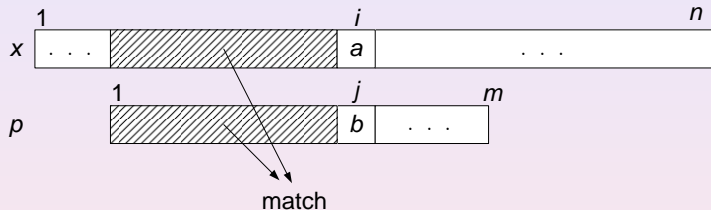
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# The Knuth-Morris-Pratt Algorithm

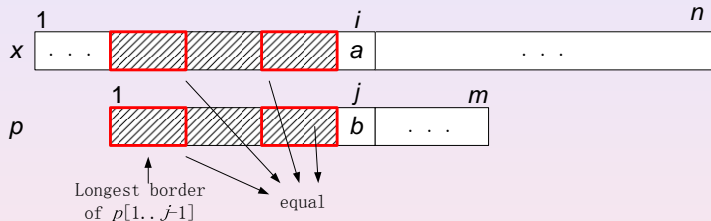
- A well-known linear time pattern-matching algorithm.
- Based on border array calculation.
- However, not very fast in practice.



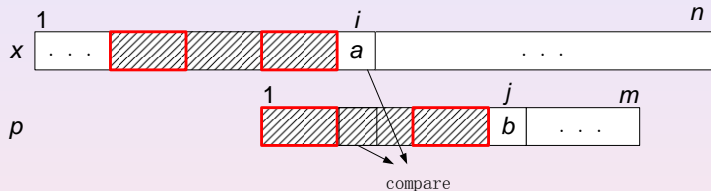
# The KMP Algorithm - 1



# The KMP Algorithm - 2



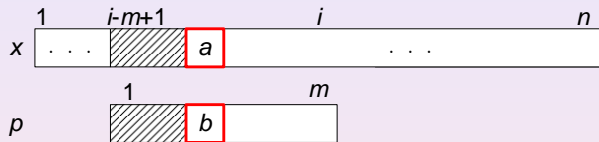
# The KMP Algorithm - 3



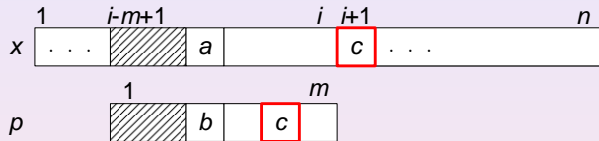
# The Sunday Adaption of Boyer-Moore Algorithm

- A simplified version of the Boyer-Moore algorithms.
- Time complexity  $O(mn)$ .
- However, very fast in practice.

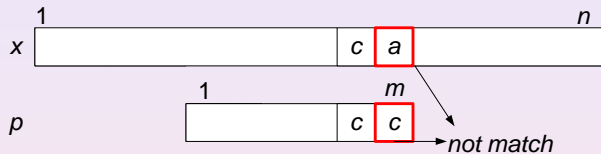
# The BMS Algorithm - 1



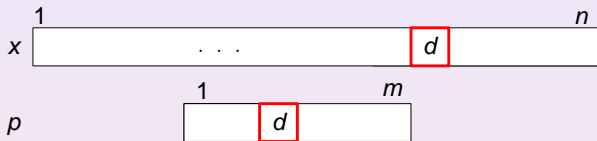
# The BMS Algorithm - 2



# The BMS Algorithm - 3

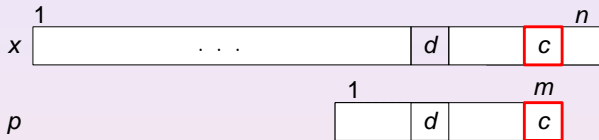


# The BMS Algorithm - 4

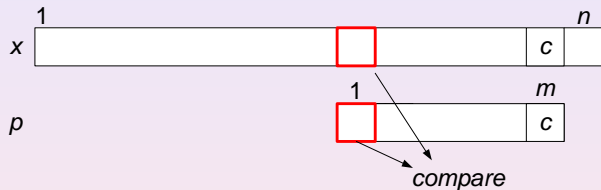




# The BMS Algorithm - 5



# The BMS Algorithm - 6



# The Shift-And Algorithm

- Makes use of the bit-parallel nature of computer.
- Time complexity  $O(mn/w)$ .
- Can be easily modified for indeterminate pattern-matching.

# The Shift-And Algorithm

$m \setminus \Sigma$	A	C	G	T	Preprocessing();
A	1	0	0	0	<i>BitArray</i> : $D[1..n]$
A	1	0	0	0	$D[1] \leftarrow S_x[1]$
T	0	0	0	1	<b>for</b> $i = 2$ <b>to</b> $n$ <b>do</b>
C	0	1	0	0	$D[i] \leftarrow (\text{Shift}(D[i-1]) \& S_x[i]);$
G	0	0	1	0	<b>if</b> $D_m \& 10^{m-1}$ <b>then</b> output $i - m + 1;$

# The Franek-Jennings-Smyth Algorithm

- A hybrid algorithm that combines the KMP and BMS algorithm.
- Inherits the merits of both algorithms: very fast both asymptotically ( $O(n)$ ) and in practice.

# Outline of the FJS Algorithm

1. Perform **Sunday** shift along text.
2. When a match of letters is found at the end of the pattern, switch to **KMP** matching.
3. Continue **KMP** matching until no border can be used, then switch back to **Sunday** shift.

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## Example of Non-transitivity Effect

Suppose we are performing KMP matching along the text.

Index		1	2	3	4	5	6	7	
$x$	.....	$a$	$a$	$b$	$b$	$a$	$b$	$b$	.....
$p$		$a$	*	*	$b$	$a$	*	$a$	
1st Shift				$a$	*	*	$b$	$a$	.....
2nd Shift						$a$	*	*	.....
3rd Shift							$a$	*	.....

**Table:** First example of the non-transitivity effect



## Proposition

*Shifting the pattern to the right according to the longest border cannot guarantee a prefix match.*

## Proposition

*A border of a border of  $x$  is not necessarily a border of  $x$ .*

Index		1	2	3	4	5	6	7	
$x$	.....	$a$	$b$	$a$	*	$a$	*	$a$	.....
$p$		$a$	$b$	$a$	$a$	$a$	$b$	$b$	
Wrong Shift						$a$	$b$	$a$	.....
Correct Shift				$a$	$b$	$a$	$a$	$a$	.....

**Table:** Second example of the non-transitivity effect

### Proposition

*Shifting the pattern to the right according to the longest border can miss some occurrences in between.*

## Impact

- Because of these properties, transforming regular pattern-matching algorithms that use border arrays into indeterminate pattern-matching algorithms is non-trivial (KMP, FJS, etc.)
- However, since some of these regular algorithms are very fast in practice and have nice properties, we are motivated to invent indeterminate versions of them that avoid using border arrays.

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# A New Hybrid Algorithm

We propose a new hybrid algorithm that uses Shift-And and BMS as complementary shift engines.

- 1. Perform **Sunday shift** along text.
- 2. When a match of letters is found at the end of the pattern, switch to **Shift-And matching**.
- 3. Continue **Shift-And matching** until no match can be found at the current position ( $D = 0$ ), then skip to next possible position and switch back to **Sunday shift**.

## Shift-And Preprocessing

The usual Shift-And preprocessing is modified as follows:

```
for  $i = 1$  to  $m$   
  for  $j = 1$  to  $|\Sigma|$   
    if  $\text{MATCH}(p[i], \Sigma[j])$  then  $S[i, j] = 1$   
    else  $S[i, j] = 0$ 
```

## Properties of Shift-Or

Notice some of the important properties of Shift-Or.

### Proposition

$$D[j] = 1 \Leftrightarrow p[1..j] \approx x[i - j + 1..i]$$

### Proposition

*$D = 0$  if and only if there doesn't exist any  $j \in 1..m$  such that  $p[1..j] \approx x[i - j + 1..i]$*

These properties enables us to move the pattern beyond  $x[i]$  when we finish `ShiftAnd-Match`.

# ShiftAnd-MATCH

$D \leftarrow 0$

**do**

$D \leftarrow (D \ll 1) \& S_x[i]$

**if**  $D \& 10^m \neq 0$  **then output**  $i$

$i \leftarrow i + 1$

*//If  $D = 0$ , terminate loop according to previous proposition*

**while**  $(i \leq n \text{ and } D \neq 0)$



## BMS Preprocessing

The usual BMS preprocessing is modified as follows.

```
for  $i = 1$  to  $|\Delta|$   
     $\Delta[i] = m + 1$   
for  $i = 1$  to  $m$   
    for  $j = 1$  to  $|\Sigma|$   
        if  $\text{MATCH}(p[i], \Sigma[j])$  then  $\Delta[p[i]] = i$ 
```

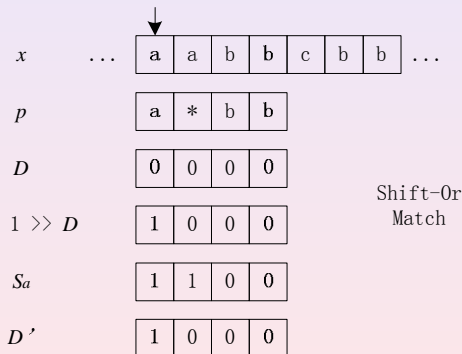
## Sunday-Shift

```
while not MATCH( $p[m]$ ,  $x[i']$ ) do  
   $i' \leftarrow i' + \Delta[x[i' + 1]]$   
if  $i' > n$  then return
```

## Algorithm Shift-And/Sunday

```
 $i' \leftarrow m; m' \leftarrow m - 1;$   
while  $i' \leq n$  do  
  Sunday-Shift();  
   $i \leftarrow i' - m';$   
  //After Sunday-Shift stops, perform ShiftAnd-MATCH  
  ShiftAnd-Match();  
  //After ShiftAnd-Match stops, shift pattern to the right  
   $i' \leftarrow i + m';$ 
```

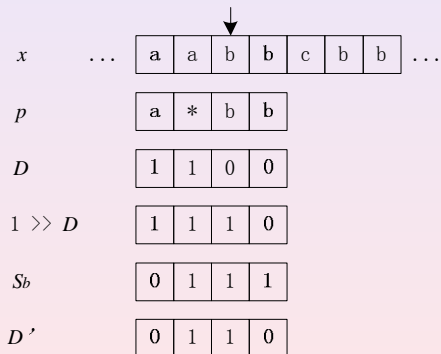
## Example of The New Hybrid Algorithm



## Example of The New Hybrid Algorithm

$x$	...	a	a	b	b	c	b	b	...
$p$		a	*	b	b				
$D$		1	0	0	0				
$1 \gg D$		1	1	0	0				
$S_a$		1	1	0	0				
$D'$		1	1	0	0				

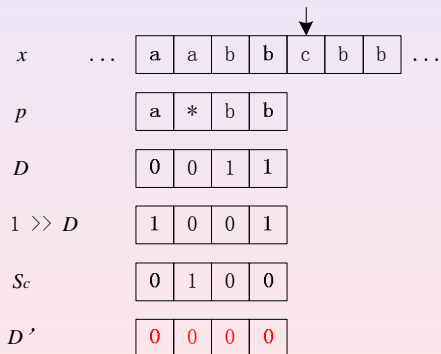
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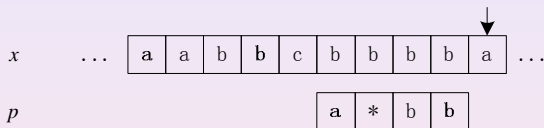
$x$	...	a	a	b	b	c	b	b	...
$p$		a	*	b	b				
$D$		0	1	1	0				
$1 \gg D$		1	0	1	1				
$S_b$		0	1	1	1				
$D'$		0	0	1	1				

## Example of The New Hybrid Algorithm





# Example of The New Hybrid Algorithm

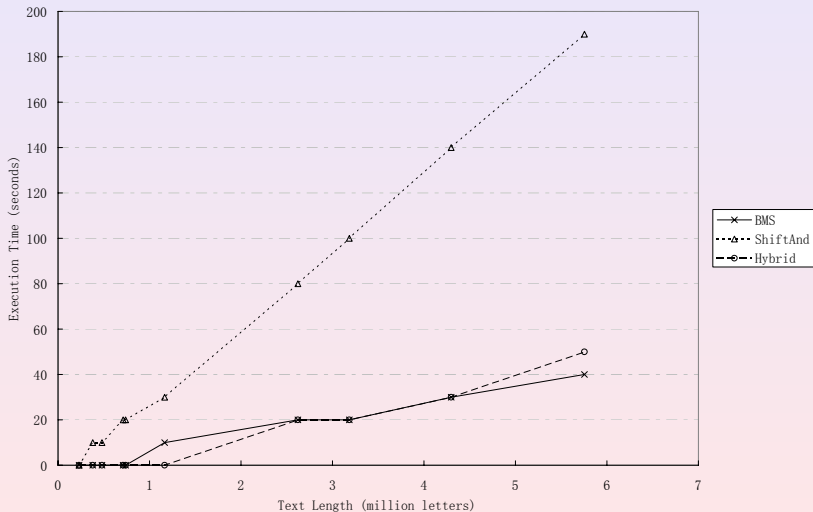


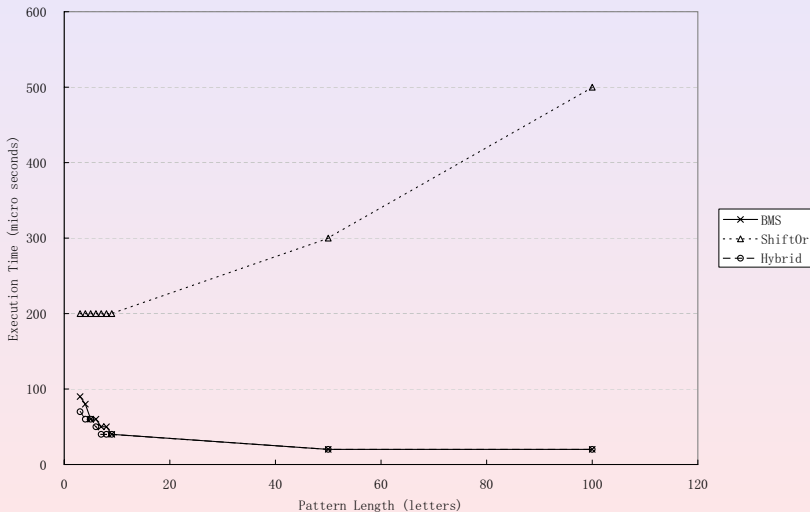
Begin *Sunday-Shift*

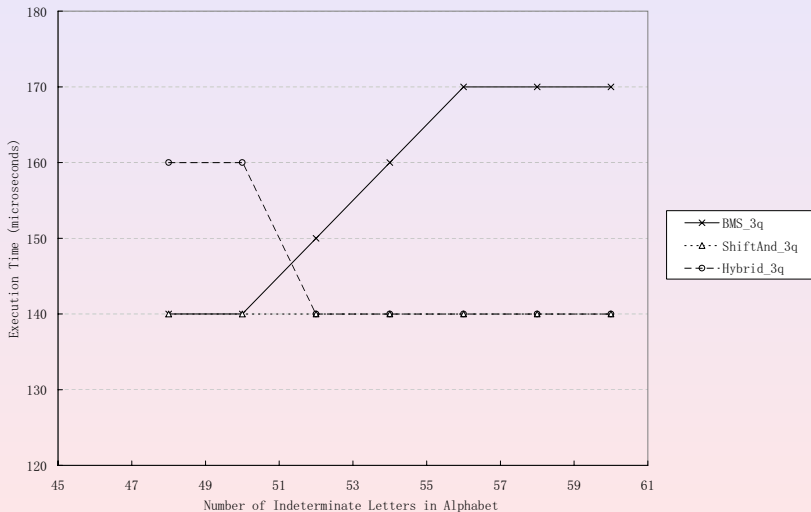


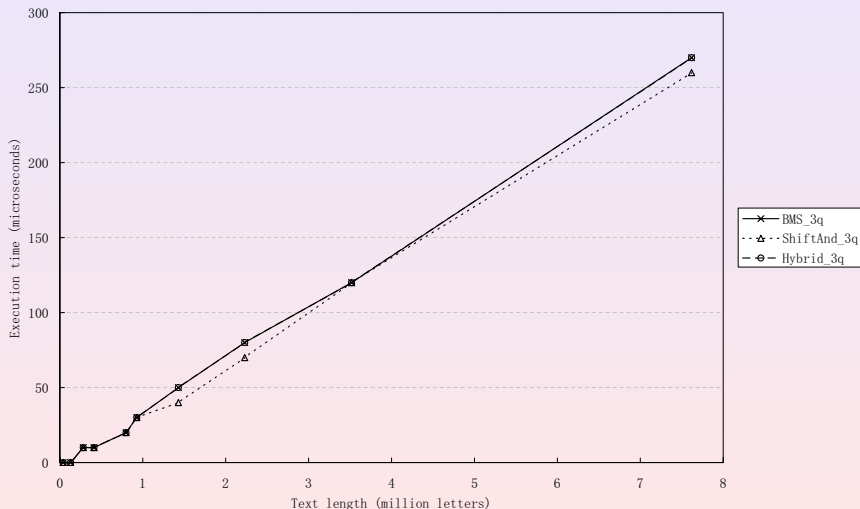
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- In all of these tests, the hybrid algorithm's behaviour is very close to that of the better of BMS and Shift-And.
- The new algorithms's total running time is very competitive among these three algorithms being tested.









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- A new algorithm that performs fast pattern-matching on both regular and indeterminate strings.
- Strong ability to adapt to the nature of text/pattern and to achieve faster performance over cases that arise in practice. This dynamic adaptivity is useful when we do not know the type of text or pattern: we don't need to make a decision ahead of time about which algorithm to use.
- Future work: Indeterminate pattern-matching algorithms based on variants of Shift-And such as BNDM and [Fre07], as well as on new convolution techniques [AAR07].

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