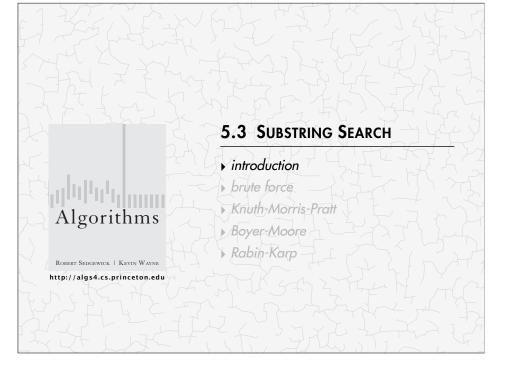
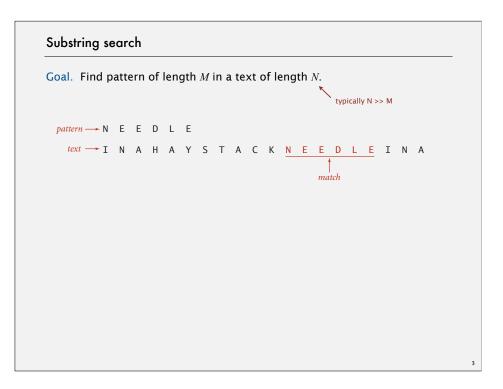
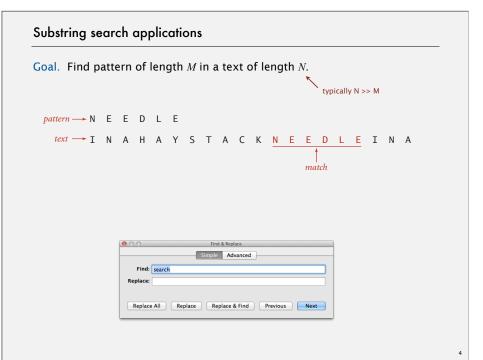
# Algorithms

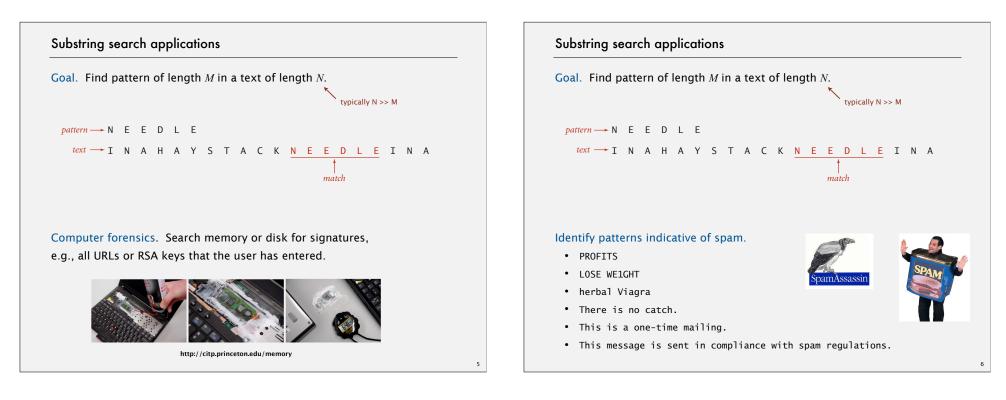
ROBERT SEDGEWICK | KEVIN WAYNE

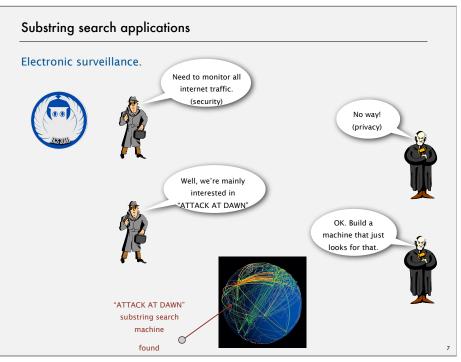












#### Substring search applications

Screen scraping. Extract relevant data from web page.

Ex. Find string delimited by <b> and </b> after first occurrence of pattern Last Trade:.

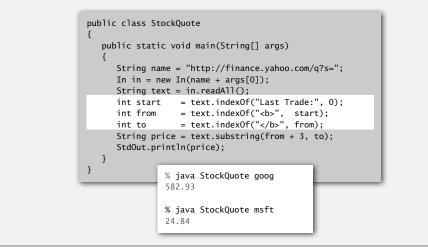
Google Inc. (N After Hours: 0.00 N/A		Add to Portfolio						
Last Trade:	582.93	Day's Range:	N/A - N/A	Google Inc. GOOG	Nov 29, 3:59pm EST			
Trade Time:	Nov 29	52wk Range:	473.02 - 642.96	MA.	58			
Change:	0.00 (0.00%)	Volume:	0	VVV				
Prev Close:	582.93	Avg Vol (3m):	3,100,480	1 WW	MWYH			
Open:	N/A	Market Cap:	188.80B		WWW 35			
Bid:	579.70 x 100	P/E (ttm):	19.87	© Yahoo!				
Ask:	585.33 x 100	EPS (ttm):	29.34	10am 12pm	2pm 4pm Previous Close			
1y Target Est:	731.10	Div & Yield:	N/A (N/A)	1d 5d 3m 6r	n 1v 2v 5v max			

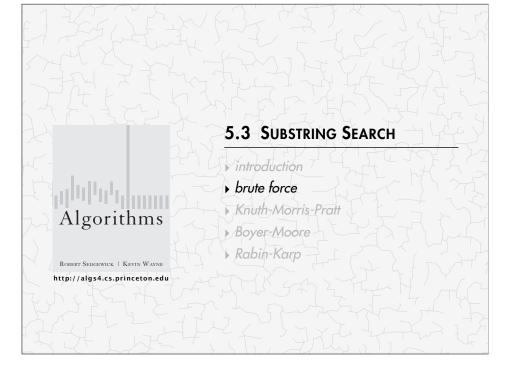
http://finance.yahoo.com/q?s=goog



## Screen scraping: Java implementation

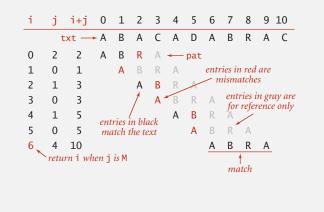
Java library. The indexOf() method in Java's string library returns the index of the first occurrence of a given string, starting at a given offset.





Brute-force substring search

Check for pattern starting at each text position.

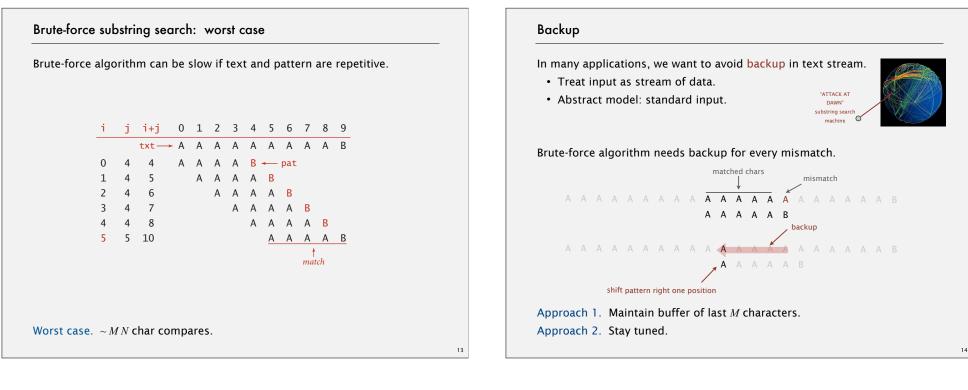


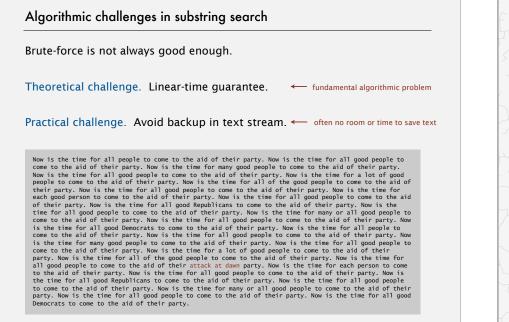
11

Brute-force substring search: Java implementation

Check for pattern starting at each text position.

```
public static int search(String pat, String txt)
{
   int M = pat.length();
   int N = txt.length();
   for (int i = 0; i \le N - M; i++)
   {
      int j;
      for (j = 0; j < M; j++)
         if (txt.charAt(i+j) != pat.charAt(j))
            break;
                                 index in text where
      if (j == M) return i; 🝝
                                  pattern starts
   3
   return N; — not found
}
```





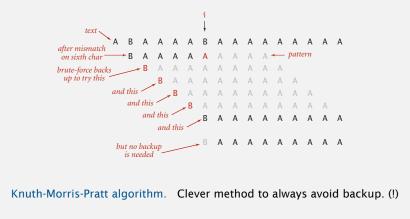


## Knuth-Morris-Pratt substring search

Intuition. Suppose we are searching in text for pattern BAAAAAAAAA.

- Suppose we match 5 chars in pattern, with mismatch on 6<sup>th</sup> char.
- We know previous 6 chars in text are BAAAAB.
- Don't need to back up text pointer!

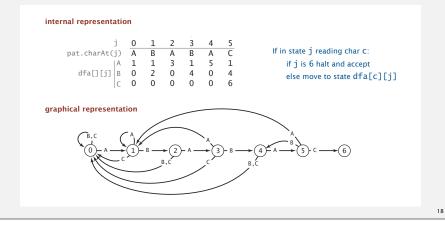
assuming { A, B } alphabet



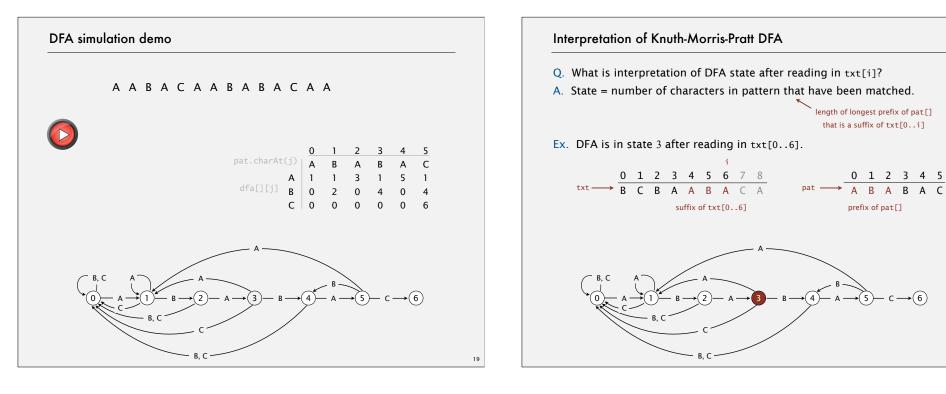
### Deterministic finite state automaton (DFA)

#### DFA is abstract string-searching machine.

- Finite number of states (including start and halt).
- Exactly one transition for each char in alphabet.
- Accept if sequence of transitions leads to halt state.



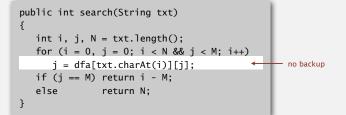
20



## Knuth-Morris-Pratt substring search: Java implementation

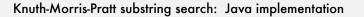
#### Key differences from brute-force implementation.

- Need to precompute dfa[][] from pattern.
- Text pointer i never decrements.



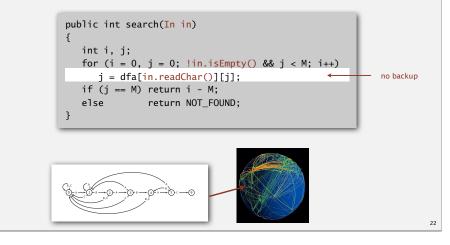
#### Running time.

- Simulate DFA on text: at most N character accesses.
- Build DFA: how to do efficiently? [warning: tricky algorithm ahead]

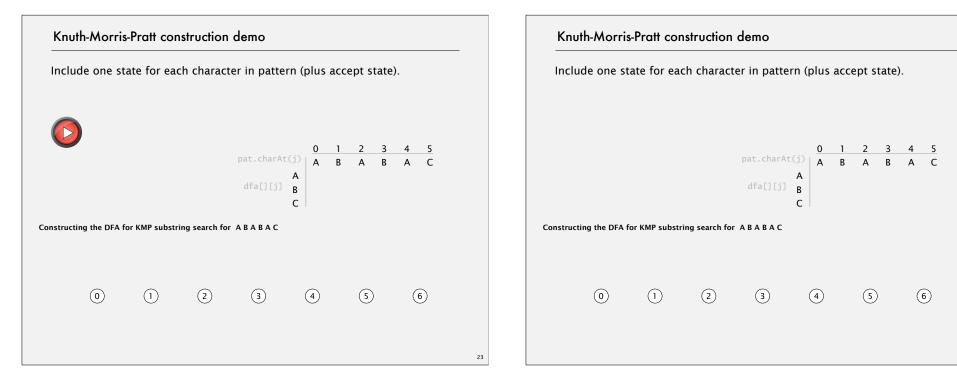


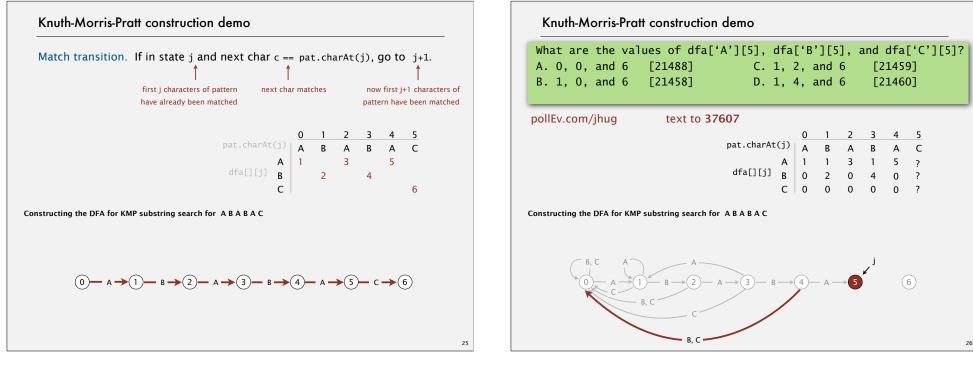
#### Key differences from brute-force implementation.

- Need to precompute dfa[][] from pattern.
- Text pointer i never decrements.
- Could use input stream.



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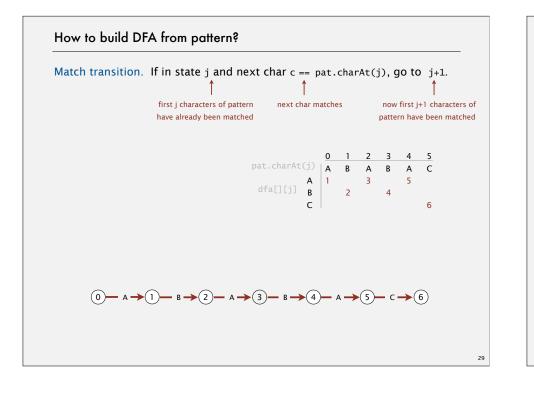
How to build DFA from pattern? Include one state for each character in pattern (plus accept state). 0 1 2 3 4 5 С pat.charAt(j) | A B A B A C dfa[][j] B С  $(\mathbf{0})$ (1)(2) (3) (4) (5) (6) 27

What are the values of dfa['A'][5], dfa['B'][5], and dfa['C'][5]? D. 1, 4, and 6 [21460] pat.charAt(j) A B A B A А dfa[][j] B 0 4 0 4 Constructing the DFA for KMP substring search for ABABAC

Knuth-Morris-Pratt construction demo

## Knuth-Morris-Pratt construction demo

A. 0, 0, and 6       [21488]       C. 1, 2, and 6       [21459]         B. 1, 0, and 6       [21458]       D. 1, 4, and 6       [21460]	
bollEv.com/jhug text to 37607 0 1 2 3 4 5	
pat.charAt(j)       A       B       A       B       A       C         A       1       1       3       1       5       ?         dfa[][j]       B       0       2       0       4       0       ?         C       0       0       0       0       ?	
onstructing the DFA for KMP substring search for ABABAC	
$ \begin{array}{c} B, C \\ 0 \\ C \\ B, C \\ B, C \\ C \\ \end{array} \begin{array}{c} A \\ B \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ B \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ B \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ B \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ B \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ B \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ B \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ B \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\ C \\ C \\ C \\ \end{array} \begin{array}{c} A \\ C \\$	
B, C	



## How to build DFA from pattern? Mismatch transition. If in state j and next char c != pat.charAt(j), then the last j-1 characters of input are pat[1..j-1], followed by c. To compute dfa[c][j]: Simulate pat[1..j-1] on DFA and take transition c. Running time. Seems to require *j* steps. still under construction (!) Ex. dfa['A'][5] = 1; dfa['B'][5] = 4 simulate BABA; simulate BABA; 0 1 2 3 4 5 take transition 'A' take transition 'B' pat.charAt(j) A B A B A C = dfa['A'][3] = dfa['B'][3] simulation of BABA 30

2 3 4

(5)

1 В Α В

А В

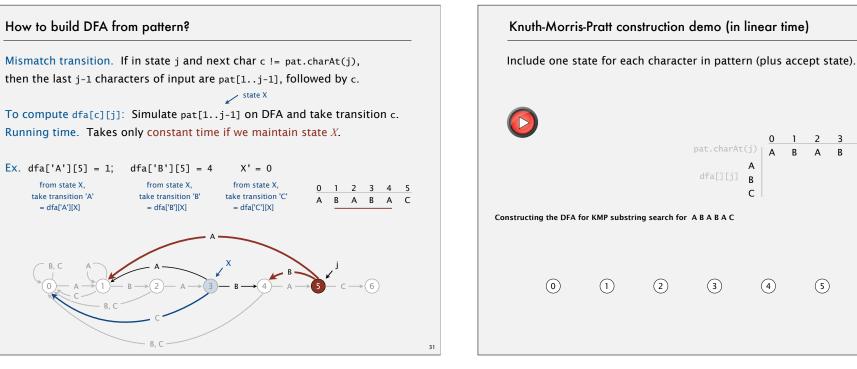
С

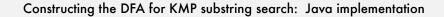
(4)

5

A C

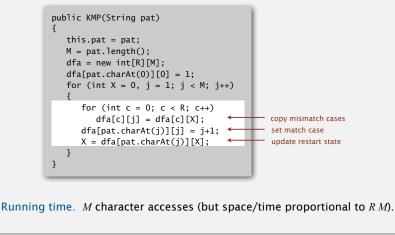
(6)





#### For each state j:

- Copy dfa[][X] to dfa[][j] for mismatch case.
- Set dfa[pat.charAt(j)][j] to j+1 for match case.
- Update x.



#### KMP substring search analysis

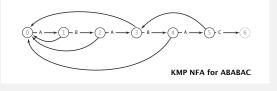
33

**Proposition.** KMP substring search accesses no more than M + N chars to search for a pattern of length M in a text of length N.

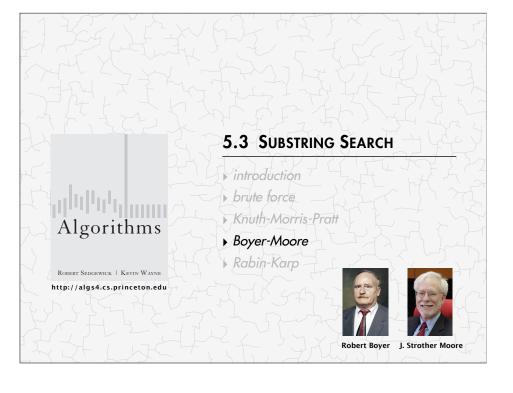
Pf. Each pattern char accessed once when constructing the DFA; each text char accessed once (in the worst case) when simulating the DFA.

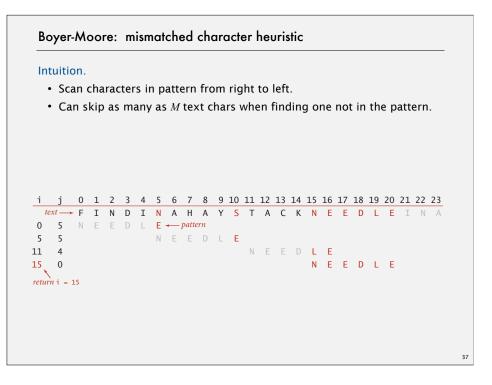
**Proposition**. KMP constructs dfa[][] in time and space proportional to *R M*.

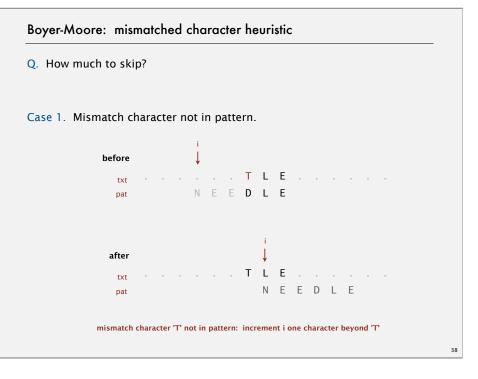
Larger alphabets. Improved version of KMP constructs nfa[] in time and space proportional to *M*.

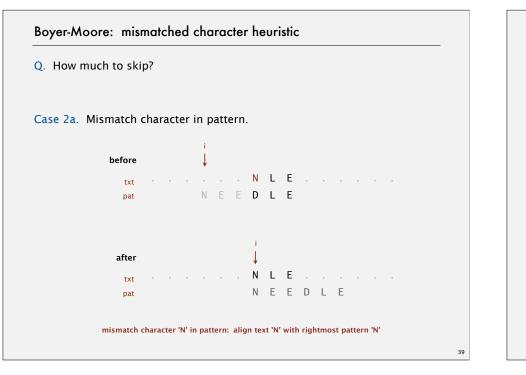


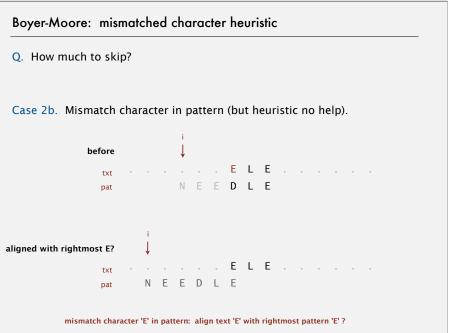
## Knuth-Morris-Pratt: brief history • Independently discovered by two theoreticians and a hacker. - Knuth: inspired by esoteric theorem, discovered linear algorithm - Pratt: made running time independent of alphabet size - Morris: built a text editor for the CDC 6400 computer • Theory meets practice. SIAM J. COMPUT. Vol. 6, No. 2, June 1977 FAST PATTERN MATCHING IN STRINGS\* DONALD E. KNUTH†, JAMES H. MORRIS, JR.‡ AND VAUGHAN R. PRATT¶ Abstract. An algorithm is presented which finds all occurrences of one given string within another, in running time proportional to the sum of the lengths of the strings. The constant of proportionality is low enough to make this algorithm of practical use, and the procedure can also be extended to deal with some more general pattern-matching problems. A theoretical application of the algorithm shows that the set of concatenations of even palindromes, i.e., the language $\{\alpha \alpha^R\}^*$ , can be recognized in linear time. Other algorithms which run even faster on the average are also co Don Knuth Vaughan Pratt lim Morris 35

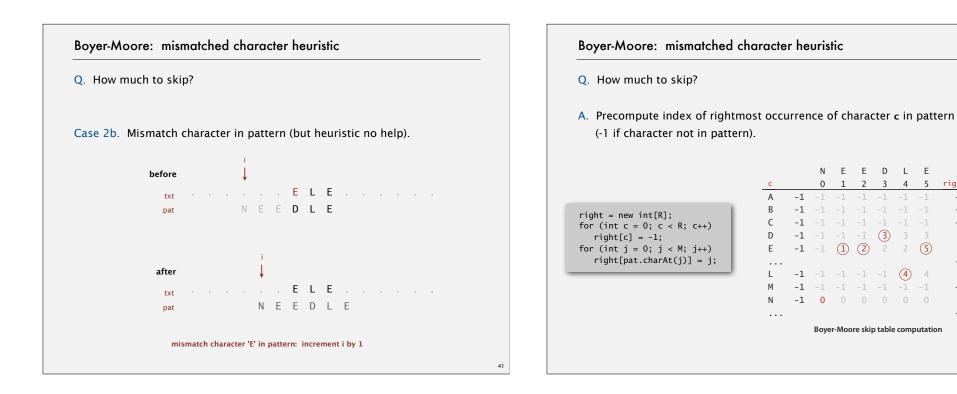


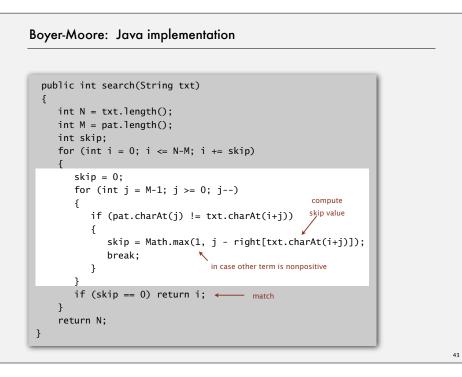












#### Boyer-Moore: analysis

Property. Substring search with the Boyer-Moore mismatched character heuristic takes about ~ N/M character compares to search for a pattern of length M in a text of length N.

Worst-case. Can be as bad as ~ MN.

i s	skip	0	1	2	3	4	5	6	7	8	9
	txt—	► B	В	В	В	В	В	В	В	В	В
0	0	Α	В	В	В	В	-	pat			
1	1		Α	В	В	В	В				
2	1			Α	В	В	В	В			
3	1				Α	В	В	В	В		
4	1					Α	В	В	В	В	
5	1						Α	В	В	В	В

Boyer-Moore variant. Can improve worst case to  $\sim 3 N$  character compares by adding a KMP-like rule to guard against repetitive patterns.

right[c]

-1

-1

-1

3

5

-1

4

-1

0

-1

## Boyer-Moore vs. KMP

#### Crudely:

- Boyer-Moore thrives on long mismatches.
  - Large alphabets.
  - Random input.
  - Long patterns.
  - Example: Sentences in English.
- KMP thrives on partial matches.
  - Small alphabets.
  - Structured data.
  - Example: Genomes
- Experiments needed to know which is best for your data set.

## Puzzle (discuss in groups)

Given 48390279381551 % 7 = 2

Find 83902793815518%7

Hint  $10^{13}$  % 7 = 3

## Solution

45

big8 =  $(4big - 4*10^{13}) * 10 + 8$ big8 % 7 = ((2 - 4\*3) \* 10 + 8) % 7 = 6



## Rabin-Karp fingerprint search

#### Basic idea = modular hashing.

- Compute a hash of pattern characters 0 to *M* 1.
- For each *i*, compute a hash of text characters *i* to M + i 1.
- If pattern hash = text substring hash, check for a match.

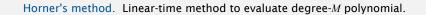
```
pat.charAt(i)
i 0 1 2 3 4
    2 6 5 3 5 % 997 = 613
                 txt.charAt(i)
    0 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15
    3 1 4 1 5 9 2 6 5 3 5 8 9 7 9 3
    3 1 4 1 5 % 997 = 508
       1 4 1 5 9 % 997 = 201
1
         4 1 5 9 2 % 997 = 715
2
3
            1 5 9 2 6 % 997 = 971
4
              5 9 2 6 5 % 997 = 442
                                         match
5
                 9 2 6 5 3 % 997 = 929
6 \leftarrow return i = 6
                   2 6 5 3 5 % 997 = 613
```

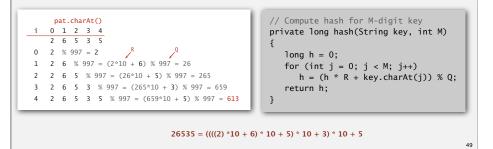
## Efficiently computing the hash function

Modular hash function. Using the notation  $t_i$  for txt.charAt(i), we wish to compute

 $x_i = t_i R^{M-1} + t_{i+1} R^{M-2} + \dots + t_{i+M-1} R^0 \pmod{Q}$ 

Intuition. *M*-digit, base-*R* integer, modulo *Q*.





Ν	lath	ien	nat	tica	l tri	ick	. т	ō l	<ee< th=""><th>р</th><th>nu</th><th>mł</th><th>be</th><th>rs</th><th>sr</th><th>na</th><th>ll,</th><th>ta</th><th>ak</th><th>e i</th><th>res</th><th>su</th><th>lt</th><th>m</th><th>bc</th><th>ul</th><th>0 (</th><th><b>ງ</b>.</th><th></th><th></th><th></th><th></th></ee<>	р	nu	mł	be	rs	sr	na	ll,	ta	ak	e i	res	su	lt	m	bc	ul	0 (	<b>ງ</b> .				
i				2 3																												
	-	_		1	-	-	_	6	5	3	5	8		9	7	9		3														
0	3	%	99	97 =	3						2	2																				
1	3	1	%	6 997	7 =	(3;	10°	+ 1	.) %	5 99	97 :	= 3	1																			
2	3	1	4	<b>%</b>	997	' =	(31	*10	+	4)	%	997	=	3	14																	
3	3	1	4	1	%	997	7 =	(31	4*1	.0 -	- 1)	) %	9	97	=	15	0															
4	3	1	4	1	5	%	997	=	(15	0*1	LO ·	⊦ 5	)	% !	997	' =	5	08	RM	'/	R											
5				1																		) %	6 9	97	=	20	1					
6			4	1	5	9	2	%	997	=	(()	201	+	1	*(9	97	-	30	)))	*1	0 .	+ 2	2)	%	997	' =	7	15				
7				1	5	9	2	6	%	997	7 =	((	71	5 -	+ 4	l*(	99	7 -	- 3	0)	)*:	10	+	6)	%	99	7 :	= !	971	-		
8					5	9	2	6	5	%	99	7 =	(	(9)	71	+	1*	(99	97	_	30	));	10	) +	5)	%	9	97	=	44	2	ma
9							2																									
0	-	retui	n i	-M+1 :	= 6																											

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Efficiently computing the hash function

**Challenge**. How to efficiently compute  $x_{i+1}$  given that we know  $x_i$ .

 $x_i = t_i R^{M-1} + t_{i+1} R^{M-2} + \dots + t_{i+M-1} R^0$ 

 $x_{i+1} = t_{i+1} R^{M-1} + t_{i+2} R^{M-2} + \dots + t_{i+M} R^0$ 

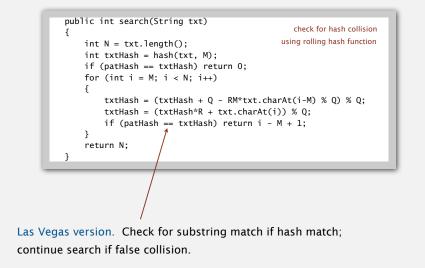
#### Key property. Can update hash function in constant time!

x <sub>i+1</sub> = (x <sub>i</sub> ) current value	S	ubt	ract		mu	$R + t_{i+M}$ $\uparrow$ Itiply add new (can precompute R <sup>M-1</sup> radix trailing digit
						7
current value $1$						6  5  text
new value	4	1	5	9	2	6 5
	4	1	5	9	2	current value
-	4	0	0	0	0	
		1	5	9	2	subtract leading digit
			*	1	0	multiply by radix
	1	5	9	2	0	
				+	6	add new trailing digit
	1	5	9	2		new value

oublic class RabinKarp		1
private long patHash;	// pattern hash value	
private int M;		
	// modulus	
private int R;		
private long RM;	// R^(M-1) % Q	
Q = longRandomPrime	<i>,</i> ,	(but avoid overflow)
RM = 1;	M 1	precompute R <sup>M − 1</sup> (mod Q)
for (int i = 1; i <=		
RM – (R * RM) % (	)•	
RM = (R * RM) % ( patHash = hash(pat.	.,	
RM = (R * RM) % ( patHash = hash(pat, }	.,	
patHash = hash(pat, }	M);	
patHash = hash(pat,	M);	
<pre>patHash = hash(pat, } private long hash(Strin </pre>	M);	

## Rabin-Karp: Java implementation (continued)

#### Monte Carlo version. Return match if hash match.



## Rabin-Karp analysis

**Theory.** If *Q* is a sufficiently large random prime (about  $MN^2$ ), then the probability of a false collision is about 1/N.

**Practice**. Choose Q to be a large prime (but not so large to cause overflow). Under reasonable assumptions, probability of a collision is about 1/Q.

#### Monte Carlo version.

- Always runs in linear time.
- Extremely likely to return correct answer (but not always!).

#### Las Vegas version.

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- Always returns correct answer.
- Extremely likely to run in linear time (but worst case is MN).

## Rabin-Karp fingerprint search

#### Advantages.

- Extends to 2d patterns.
- Extends to finding multiple patterns.

#### Disadvantages.

- Arithmetic ops slower than char compares.
- Las Vegas version requires backup.
- Poor worst-case guarantee.

Q. How would you extend Rabin-Karp to efficiently search for any one of P possible patterns in a text of length N?



## Substring search cost summary

Cost of searching for an *M*-character pattern in an *N*-character text.

algorithm	version	operatio	n count	backup	correct?	extra	
aigontinn	version	guarantee	typical	in input?	conect:	space	
brute force	_	MN	1.1 N	yes	yes	1	
Knuth-Morris-Prat	full DFA (Algorithm 5.6)	2N	1.1 N	no	yes	Mŀ	
Knutn-Morris-Pratt	mismatch transitions only	3 N	1.1 N	no	yes	М	
	full algorithm	3 N	N/M	yes	yes	R	
Boyer-Moore	mismatched char heuristic only (Algorithm 5.7)	MN	N/M	yes	yes	R	
Rabin-Karp <sup>†</sup>	Monte Carlo (Algorithm 5.8)	7 N	7 N	no	yes †	1	
-	Las Vegas	$7 N^{\dagger}$	7 N	yes	yes	1	



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