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String Matching – What's behind Ctrl+F?

3 March 2021

Sebastian Wild

Outline

4 String Matching

- 4.1 Introduction
- 4.2 Brute Force
- 4.3 String Matching with Finite Automata
- 4.4 The Knuth-Morris-Pratt algorithm
- 4.5 Beyond Optimal? The Boyer-Moore Algorithm
- 4.6 The Rabin-Karp Algorithm

4.1 Introduction

Ubiquitous strings

string = sequence of characters

- ▶ universal data type for . . . everything!
 - natural language texts
 - programs (source code)
 - websites
 - XML documents
 - DNA sequences
 - bitstrings
 - ▶ ... a computer's memory → ultimately any data is a string

→ many different tasks and algorithms

Ubiquitous strings

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- universal data type for ... everything!
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 - bitstrings
 - ▶ ... a computer's memory → ultimately any data is a string
- → many different tasks and algorithms
- ► This unit: finding (exact) occurrences of a pattern text.
 - ► Ctrl+F
 - ▶ grep
 - computer forensics (e.g. find signature of file on disk)
 - virus scanner
- basis for many advanced applications

Notations

- ▶ *alphabet* Σ : finite set of allowed **characters**; $\sigma = |\Sigma|$ "a string over alphabet Σ "
 - letters (Latin, Greek, Arabic, Cyrillic, Asian scripts, ...)
 - "what you can type on a keyboard", Unicode characters
 - $\{0,1\}$; nucleotides $\{A,C,G,T\}$; ...

comprehensive standard character set including emoji and all known symbols

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 - "what you can type on a keyboard", Unicode characters
- ▶ $\Sigma^n = \Sigma \times \cdots \times \Sigma$: strings of **length** $n \in \mathbb{N}_0$ (*n*-tuples)

 $\sum_{i=1}^{3}$

- ▶ $\Sigma^* = \bigcup_{n \geq 0} \Sigma^n$: set of **all** (finite) strings over Σ
- $ightharpoonup \Sigma^+ = \bigcup_{n \geq 1} \Sigma^n$: set of **all** (finite) **nonempty** strings over Σ
- \triangleright $\varepsilon \in \Sigma^0$: the *empty* string (same for all alphabets)

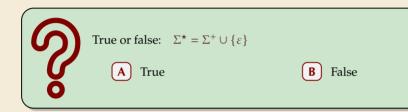
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zero-based (like arrays)!

- ▶ for $S \in \Sigma^n$, write S[i] (other sources: S_i) for ith character $(0 \le i < n)$
- ▶ for $S, T \in \Sigma^*$, write $ST = S \cdot T$ for **concatenation** of S and T
- ▶ for $S \in \Sigma^n$, write S[i..j] or $S_{i,j}$ for the **substring** $S[i] \cdot S[i+1] \cdots S[j]$ $(0 \le i \le j < n)$
 - ► S[0..j] is a **prefix** of S; S[i..n-1] is a **suffix** of S
 - ► S[i..j) = S[i..j 1] (endpoint exclusive) \rightsquigarrow S = S[0..n)

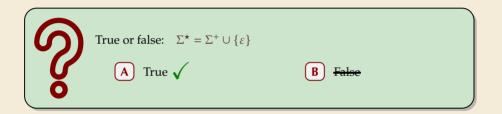
Clicker Question



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Click on "Polls" tab

Clicker Question



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String matching – Definition

Search for a string (pattern) in a large body of text

- ► Input:
 - ▶ $\underline{T} \in \Sigma^n$: The \underline{text} (haystack) being searched within
 - ▶ $P \in \Sigma^m$: The *pattern* (needle) being searched for; typically $n \gg m$
- Output:
 - ▶ the first occurrence (match) of P in T: $\min\{i \in [0..n m) : T[i..i + m) = P\}$
 - or NO_MATCH if there is no such i ("P does not occur in T")
- ▶ Variant: Find **all** occurrences of *P* in *T*.
 - \sim Can do that iteratively (update *T* to T[i+1..n) after match at *i*)
- **Example:**
 - ightharpoonup T = "Where is he?"
 - $ightharpoonup P_1 = "he" \iff i = 1$
 - ► $P_2 =$ "who" \rightsquigarrow NO_MATCH
- ▶ string matching is implemented in Java in String.indexOf

January:

Clicker Question



Let $T = COMP526_{\tt lis} fun$. What is T[3..7)?

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Clicker Question



Let $T = COMP526_{\tt u}is_{\tt u}fun$. What is T[3..7)?

012<mark>3456</mark>78901234 COMP526_is_fun.

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4.2 Brute Force

Abstract idea of algorithms

Pattern matching algorithms consist of guesses and checks:



- ▶ A **guess** is a position i such that P might start at T[i]. Possible guesses (initially) are $0 \le i \le n m$.
- ▶ A **check** of a guess is a pair (i, j) where we compare T[i + j] to P[j].

Abstract idea of algorithms

m= 1P1

Pattern matching algorithms consist of *guesses* and *checks*:

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- ▶ A **check** of a guess is a pair (i, j) where we compare T[i + j] to P[j].
- ▶ Note: need all *m* checks to verify a single correct guess *i*, but it may take (many) fewer checks to recognize an incorrect guess.
- ► Cost measure: #character comparisons = #checks $(\neg \xi :) \stackrel{?}{=} P \{ j \})$

 \rightsquigarrow cost $\leq n \cdot m$ (number of possible checks)

Brute-force method

Example:

T = abbbababbabP = abba

```
procedure bruteForceSM(T[0..n), P[0..m))

for i := 0, ..., n-m-1 do

for j := 0, ..., m-1 do

if T[i+j] \neq P[j] then break inner loop

if j == m then return i

return NO_MATCH
```

- ▶ try all guesses *i*
- check each guess (left to right); stop early on mismatch
- essentially the implementation in Java!

							6				
1	а	b	b	b	а	b	а	b	b	а	b
	/	\vee	\vee	\times							
		X									
			\times								
				\times							
					√	V	X				
						×					
							\vee	\vee	\vee	\checkmark	

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- ightharpoonup try all guesses i
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- essentially the implementation in Java!

Example:

T = abbbababbabP = abba

 \rightarrow 15 char cmps (vs $n \cdot m = 44$) not too bad!

	а	b	b	b	а	b	а	b	b	а	b
	а	b	b	а							
		а									
			а								
				а							
					а	b	b				
ſ						а					
Ī							а	b	b	а	

Brute-force method – Discussion

- Brute-force method can be good enough
 - typically works well for natural language text
 - ▶ also for random strings
- but: can be as bad as it gets!

а	а	а	а	а	а	а	а	а	а	а
а	а	а	b							
	а	а	а	b						
		а	а	а	Ь					
			а	а	а	b				
				а	а	а	b			
					а	а	а	b		
						а	а	а	b	
							а	а	а	b

- Worst possible input: $P = a^{m-1}b$, $T = a^n$
- ▶ Worst-case performance: $(n m + 1) \cdot m$
- \rightsquigarrow for $m \le n/2$ that is $\Theta(mn)$

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а	а	а	а	а	а	а	а	а	а	а
а	а	а	b							
	а	а	а	b						
		а	а	а	b					
			а	а	а	b				
				а	а	а	b			
					а	а	а	b		
						а	а	а	b	
							а	а	а	b

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- ▶ Worst-case performance: $(n m + 1) \cdot m$
- \rightsquigarrow for $m \le n/2$ that is $\Theta(mn)$

- ▶ Bad input: lots of self-similarity in $T! \rightsquigarrow$ can we exploit that?
- ▶ brute force does 'obviously' stupid repetitive comparisons → can we avoid that?

Roadmap

- ► **Approach 1** (this week): Use *preprocessing* on the **pattern** *P* to eliminate guesses (avoid 'obvious' redundant work)
 - ► Deterministic finite automata (**DFA**)
 - ► Knuth-Morris-Pratt algorithm
 - ► Boyer-Moore algorithm
 - ► Rabin-Karp algorithm
- ► **Approach 2** (¬¬ Unit 6): Do *preprocessing* on the **text** *T*Can find matches in time *independent of text size(!)*
 - inverted indices
 - Suffix trees
 - ► Suffix arrays

4.3 String Matching with Finite Automata

Clicker Question

Do you know what regular expressions, NFAs and DFAs are, and how to convert between them?



- A Never heard of this; are these new emoji?
- (B) Heard the terms, but don't remember conversion methods.
- C Had that in my undergrad course (memories fading a bit).
- D Sure, I could do that blindfolded!

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Click on "Polls" tab

Theoretical Computer Science to the rescue! —

stuff P sheff = 7

- ▶ string matching = deciding whether $T \in \Sigma^* \cdot P \cdot \Sigma^*$
- $ightharpoonup \Sigma^* \cdot P \cdot \Sigma^*$ is *regular* formal language
- \rightarrow \exists deterministic finite automaton (DFA) to recognize $\Sigma^* \cdot P \cdot \Sigma^*$
- \rightarrow can check for occurrence of *P* in |T| = n steps!

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WTF!?

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Job done!



WTF!?

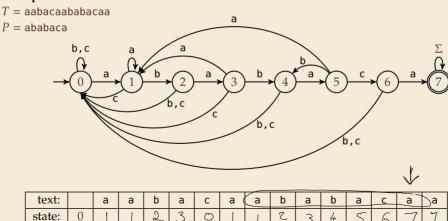
We are not quite done yet.

- ▶ (Problem 0: programmer might not know automata and formal languages . . .)
- ▶ Problem 1: existence alone does not give an algorithm!
- ▶ Problem 2: automaton could be very big!

String matching with DFA

- ▶ Assume first, we already have a deterministic automaton
- ► How does string matching work?

Example:

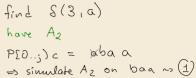


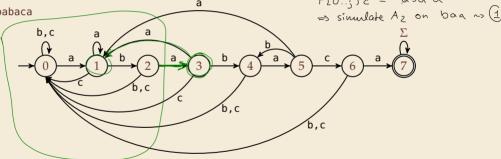
String matching with DFA

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Example:







text:		а	а	b	а	С	а	а	b	а	b	а	С	а	а
state:	0	1	1	2	3	0	1	1	2	3	4	5	6	7	7

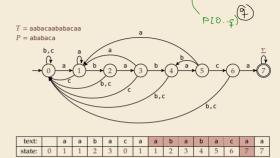
String matching DFA – Intuition

Why does this work?

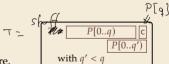
► Main insight:

State *q* means:

"we have seen P[0..q) until here (but not any longer prefix of P)"



- \blacktriangleright If the next text character c does not match, we know:
 - (i) text seen so far ends with $P[0...q) \cdot c$
 - (ii) $P[0...q) \cdot c$ is not a prefix of P
 - (iii) without reading c, P[0..q) was the *longest* prefix of P that ends here.



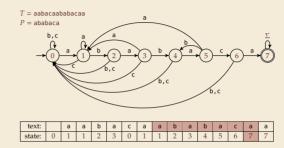
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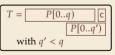
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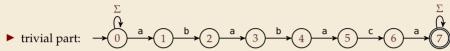
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- \rightarrow New longest matched prefix will be (weakly) shorter than q
- \rightarrow All information about the text needed to determine it is contained in $P[0...a) \cdot c!$

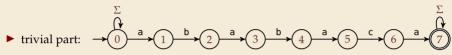
NFA instead of DFA?

It remains to *construct* the DFA.



NFA instead of DFA?

It remains to *construct* the DFA.



- ▶ that actually is a *nondeterministic* finite automaton (NFA) for Σ^*P Σ^*
- → We *could* use the NFA directly for string matching:
 - ▶ at any point in time, we are in a *set* of states
 - accept when one of them is final state

Example:

text:		а	а	b	а	С	а	а	b	а	b	a	С	а	a
state:	0	0,1	0,1	0,2	0,1,3	0	0,1	0,1	0,2	0,1,3	0,2,4	0,1,3,5	0,6	0,1,7	0,1,7

But maintaining a whole set makes this slow . . .

Computing DFA directly



You have an NFA and want a DFA? Simply apply the power-set construction (and maybe DFA minimization)!

The powerset method has exponential state blow up!

I guess I might as well use brute force ...



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Ingenious algorithm by Knuth, Morris, and Pratt: construct DFA inductively:

Suppose we add character P[j] to automaton A_{j-1} for P[0..j-1]

- ▶ add new state and matching transition ~→ easy
- ▶ for each $c \neq P[j]$, we need $\delta(j, c)$ (transition from (j)) when reading (c)



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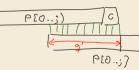
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Suppose we add character P[j] to automaton A_{j-1} for P[0..j-1]

- ▶ add new state and matching transition → easy
- for each $c \neq P[i]$, we need $\delta(i, c)$ (transition from (i)) when reading c)
- $\delta(i,c)$ = length of the longest prefix of P[0..i)c that is a suffix of P[1..i)c
 - = state of automaton after reading P[1..i)c

 $\leq i \rightsquigarrow \text{can use known automaton } A_{i-1} \text{ for that!}$

 \rightarrow can directly compute A_i from A_{i-1} !



State a means:

"we have seen P[0..q) until here (but not any longer prefix of P)"

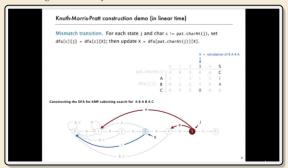


 \bigcirc seems to require simulating automata $m \cdot \sigma$ times

Computing DFA efficiently

- ► KMP's second insight: simulations in one step differ only in last symbol
- \rightarrow simply maintain state x, the state after reading P[1..j-1].
 - copy its transitions
 - update x by following transitions for P[j]

Demo: Algorithms videos of Sedgewick and Wayne



https://cuvids.io/app/video/194/watch

String matching with DFA – Discussion

- ► Time:
 - ▶ Matching: *n* table lookups for DFA transitions
 - ▶ building DFA: $\Theta(m\sigma)$ time (constant time per transition edge).
 - \rightarrow $\Theta(m\sigma + n)$ time for string matching.
- ► Space:
 - $\Theta(m\sigma)$ space for transition matrix.
- fast matching time actually: hard to beat!
- total time asymptotically optimal for small alphabet (for $\sigma = O(n/m)$)
- substantial **space overhead**, in particular for large alphabets
 - Unicode o 100k

4.4 The Knuth-Morris-Pratt algorithm

Failure Links

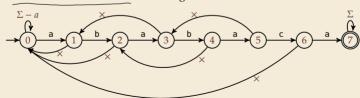
- ► Recall: String matching with is DFA fast, but needs table of $m \times \sigma$ transitions.
- ▶ in fast DFA construction, we used that all simulations differ only by *last* symbol
- \leadsto **KMP's third insight:** do this last step of simulation from state x during *matching*! ... but how?

Failure Links

- ► Recall: String matching with is DFA fast, but needs table of $m \times \sigma$ transitions.
- ▶ in fast DFA construction, we used that all simulations differ only by *last* symbol
- → KMP's third insight: do this last step of simulation from state *x* during *matching*!
 ... but how?
- ► **Answer:** Use a new type of transition, the *failure links*



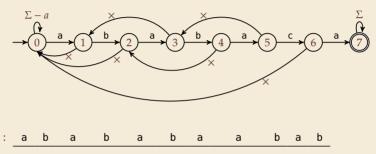
- ▶ Use this transition (only) if no other one fits.
- ► × does not consume a character. → might follow several failure links



→ Computations are deterministic (but automaton is not a real DFA.)

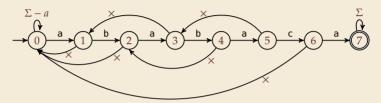
Failure link automaton – Example

Example: T = abababaaaca, P = ababaca



Failure link automaton – Example

Example: T = abababaaaca, P = ababaca





(after reading this character)



What is the worst-case time to process one character in a failure-link automaton for P[0..m)?

 $\mathbf{A} \quad \Theta(1)$

 \mathbf{C} $\Theta(m)$

 $\mathbf{B} \quad \Theta(\log m)$

 $\Theta(m^2)$

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A 9(1)

 \mathbf{C} $\Theta(m)$

 $\Theta(\log m)$

 $\Theta(m^2)$

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The Knuth-Morris-Pratt Algorithm

```
procedure KMP(T[0..n-1], P[0..m-1])
      fail[0..m] := failureLinks(P)
       i := 0 // current position in T
       q := 0 // current state of KMP automaton
      while i < n do
           if T[i] == P[q] then
                i := i + 1; \ a := a + 1
                if a == m then
                    return i - \frac{\omega}{a} // occurrence found
           else // i.e. T[i] \neq P[q]
                if q \ge 1 then
11
                    q := fail[q] // follow one \times
12
                else
13
                    i := i + 1
14
       end while
15
       return NO MATCH
```

- only need single array fail for failure links
- ► (procedure failureLinks later)

The Knuth-Morris-Pratt Algorithm

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procedure KMP(T[0..n-1], P[0..m-1])
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3
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      while i < n do
           if T[i] == P[g] then
               i := i + 1; q := q + 1
               if a == m then
                    return i - q // occurrence found
           else // i.e. T[i] \neq P[q]
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11
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12
               else
13
                    i := i + 1
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      end while
15
      return NO MATCH
16
```

- only need single array fail for failure links
- ► (procedure failureLinks later)

Analysis: (matching part)



- ▶ always have fail[j] < j for $j \ge 1$
- → in each iteration
 - either advance position in text (i := i + 1)
 - or shift pattern forward (guess i j)
- ightharpoonup each can happen at most n times
- $\rightsquigarrow \le 2n$ symbol comparisons!

Computing failure links

- ► failure links point to error state *x* (from DFA construction)
- \rightarrow run same algorithm, but store fail[j] := x instead of copying all transitions

```
procedure failureLinks(P[0..m-1])
     fail[0] := 0
     x := 0
      for j := 1, ..., m-1 do
         fail[i] := x
          // update failure state using failure links:
         while P[x] \neq P[i]
              if x == 0 then
                   x := -1: break
              else
                   x := fail[x]
11
          end while
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                                    fail[x]<×
              else
10
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11
          end while
12
          x := x + 1
13
      end for
14
```

Analysis:

- ▶ *m* iterations of for loop
- ightharpoonup while loop always decrements x
- ➤ *x* is incremented only once per iteration of for loop
- \rightsquigarrow $\leq m$ iterations of while loop *in total*
- $\rightsquigarrow \leq 2m$ symbol comparisons

Knuth-Morris-Pratt – Discussion

- ► Time:
 - $ightharpoonup \leq 2n + 2m = O(n + m)$ character comparisons
 - ightharpoonup clearly must at least *read* both T and P
 - → KMP has optimal worst-case complexity!
- ► Space:
 - $ightharpoonup \Theta(m)$ space for failure links
- total time asymptotically optimal (for any alphabet size)
- reasonable extra space

What are the main advantages of the KMP string matching (using the failure-link automaton) over string matching with DFAs? Check all that apply.



- A faster preprocessing on pattern
- **B** faster matching in text
- **C**) fewer character comparisons
- D uses less space
- **E** makes running time independent of σ
- F I don't have to do automata theory

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The KMP prefix function

- ▶ It turns out that the failure links are useful beyond KMP
- ▶ a slight variation is more widely used: (for historic reasons) the (KMP) *prefix function* $F: [1..m-1] \rightarrow [0..m-1]$:

F[j] is the length of the longest prefix of P[0..j] that is a suffix of P[1..j].

► Can show: fail[j] = F[j-1] for $j \ge 1$, and hence

fail (q) = failure-link target

(fail (q))

(q)

