String matching Data Structures and Algorithms for Cor (ISCL-BA-07) Çağrı Çöltekin ccoltekin@sfs.uni-tuebingen.de Winter Semester 2022/23

Finding patterns in a string

 There are many more: DNA sequencing / bioinformatics
 Plagiarism detection Search engines / information retrieval
 Spell checking

Problem definition

 $\Sigma = \{A, C, G, T\}$

the example

Brute-force string search

. Finding a pattern in a larger text is a common problem in m. Typical example is searching in a text editor or word proof

feat: A A T A G A C G G C T A G C A A

* We want to find all occurrences of pattern p (length m) in text t (length n)

p occurs in t with shift s if p[0: m] --- t[s: s+m], we have a match at s = 3 in

ase i and i reneat

 \star The characters in both t and p are from an alphabet Σ , in the example

* A string x is a prefix of string y, if y = xw for a possibly empty string w * A string x is a suffix of string y, if y = wx for a possibly empty string w

. The size of the alphabet (q) is often an important factor

EAATAGACGGCTAGCAA

LAATAGACGGCTAGCAA

- if j == m, announce success with s = i
- if t[i]! = p[j]: shift p (increase i, set j = 0)
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Types of problems

- The efficiency and usability of algorithms depend on some properties of the
- Typical applications are based on finding multiple occurrences of a single pattern in a text, where the pattern is much shorter than the text
 The efficiency of the algorithms may depend on the
- - relative size of the pattern
 expected number of repetitions
 size of the alphabet
 whether the pattern is used once or many tir
- · Another related problem is searching for multiple patterns at once
- . In some cases, fuzzy / approximate search may be required
- In some applications, preprocessing (indexing) the text to be searched may be beneficial

Brute-force string search

LAATAGACGGCTAGCAA

- - Start from the beginning, of $\mathfrak{i}=0$ and $\mathfrak{j}=0$
 - if j == m, announce success with s = t
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Brute-force string search



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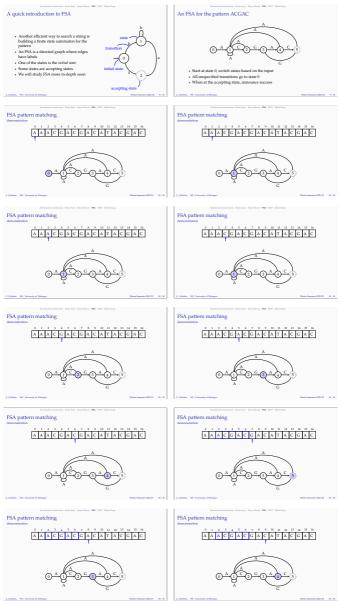
t A A T A G A C G G C T A G C A A

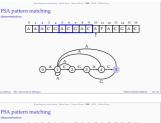
Brute-force string search £ A A T A G A C G G C T A G C A A

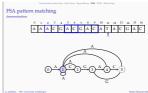
A G C A

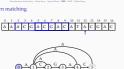
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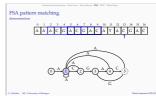
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- if t[i]! = p[j]: shift p (increase i, set j = 0)
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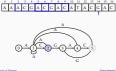




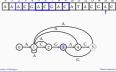




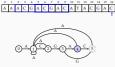




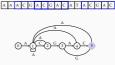
PSA pattern matching



FSA pattern matching



PSA pattern matching



PSA for string matching

* An FSA results in $O(\ensuremath{n})$ time matching, however, we need to first build the

- . At any state of the ar
- failing matches
- Given substring s recognized by a state and a non-matching input sym we want to find the longest prefix of s such that it is also a suffix of sa
- * A naïve attempt results in $O(qm^3)$ time for building the automaton (where q is the size of the alphabet m is the length of the pattern)
- + If stored in a matrix, the space requirement is O(qm)

- Better (faster) algorithms exist for construction these automaton (we will cover some later in this course)

Knuth-Morris-Pratt (KMP) algorithm

- * The KMP algorithm is probably the most popular algorithm for string

 - The idea is similar to the PSA approach: on failure, continue comparing from the longest matched prefix so fa However, we rely on a simpler data st
 - where to back up) . Construction of the table is also faste

KMP algorithm

- . In case of a match, increment both i and j
- + On failure, or at the end of the pattern, decide which new p[j] compare with t[i] based on a function f
- f[j 1] tells which j value to resume the comparisons from

KMP algorithm

- A A C G A T G A C A T A C G A C A T G
- . In case of a match, increment both i and j
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KMP algorithm AACGATGACATACGACATG A C G A C

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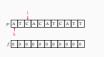
Complexity of the KMP algorithm

- . In the while loop, we either incre
- i, or shift the comparison
- As a result, the loop runs at most 2s times, complexity is O(n)

- 0, 0 • i < n: T[i] -- P[j]: if j -- n - 1: return i - 1 1 +- 1 | j +- 1 | elif j > 0: | j - f[k --| else: | j +- 1 | eturn None

Building the prefix/failure table





KMP algorithm

AACGATGACATACGACATG

A C G A C

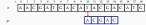
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KMP algorithm

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KMP algorithm



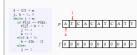
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KMP algorithm

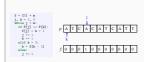


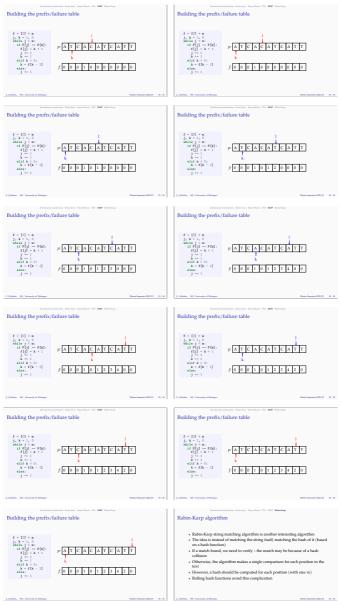
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Building the prefix/failure table



Building the prefix/failure table





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Rabin-Karp string matching

Rabin-Karp string matching

