## **COMPSCI 220:** Automata and Pattern Matching

Cristian S. Calude

Term 2 2009

COMPSCI 220: Automata and Pattern Matching

#### "The purpose of computing is insight, not numbers."

Elena Calude, Michael Dinneen, Nick Hay, and Radu Nicolescu for stimulating discussions and critical comments.











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Outline

#### Assignment and exam

## • Assignment 1: 21 August 2009; 8:30pm (ADB time)

 Midterm test 18 August (in class): prepare all results discussed in class and tutorials Outline

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#### Question

Are there finite memory machines accepting as input finite binary sequences of any length and deciding whether the sequence has a certain property (for example, it has an even number of 0's)?

Using "states" to remember the 'property' seems a good idea, but don't we have to keep adding newer and newer 'states' as the input gets longer and longer?

Re-phrased: Is a finite memory enough? In general the answer seems to be negative, but ...

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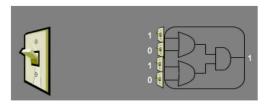
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#### A simple example

Probably the simplest finite machine operates a switch as follows:

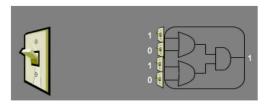


So, if the switch is down, then the light goes on and if the switch is up, then the light goes off.

To this device, the switch position is an input and the light on/off is the output. The machine works with finitely many "states" for any sequence of modifications of the switch.

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- Bit strings: ε (empty string), 0, 1, 00, 01, 10, 11, ...
- $B = \{0, 1\}$  and  $B^*$  is the set of all binary strings
- Strings can be concatenated: from x and y get xy
- The length of the string x is denoted by |x|

• Other alphabets:  $\Sigma = \{a, b, c, d\}$ , the set of 7-bit ASCII characters

Σ\* is the set of all strings over the alphabet Σ

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- Q is the finite set of machine states
- $\bigcirc$   $\Sigma$  is the finite input alphabet
- $\bigcirc$   $\delta$  is a transition function from Q imes  $\Sigma$  to Q
- $\bigcirc$  s  $\in$  Q is the start state
- If  $F \subseteq Q$  is the accepting (final/membership) states.

# A deterministic finite automaton (DFA, for short) is a five-tuple $M = (Q, \Sigma, \delta, s, F)$ where

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# **DFA: example 1**

$$M = (Q, \Sigma, \delta, s, F):$$

$$Q = \{q_0, q_1, q_2, q_3\}$$

$$\Sigma = \{a, b\}$$

$$\delta \qquad \Sigma$$

$$Q \qquad a \qquad b$$

$$q_0 \qquad q_1 \qquad q_2$$

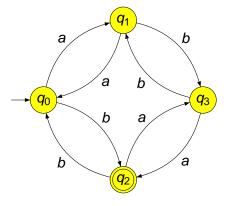
$$q_1 \qquad q_0 \qquad q_3$$

$$q_2 \qquad q_3 \qquad q_0$$

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$$s = q_0$$

$$F = \{q_2\}$$



## DFA: accepted strings and language

Let  $M = (Q, \Sigma, \delta, s, F)$  be a DFA and  $w = w_1 w_2 \cdots w_n$  be a string over  $\Sigma$ .

 The trace (path) of the computation of w on M is the (unique) sequence of states

 $S_1, S_2, \cdots, S_n, S_{n+1}$ 

such that

 $s_1 = s, \delta(s_1, w_1) = s_2, \dots, \delta(s_{n-1}, w_{n-1}) = s_n, \delta(s_n, w_n) = s_{n+1}.$ 

- The string w is accepted (or recognised) by M if s<sub>n+1</sub> ∈ F; otherwise, w is rejected by M.
- The language accepted by M, denoted by L(M), is the set of all accepted strings by M; if A == L(M), for some DFA M, then A is called regular.

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#### Questions

# • Given a DFA *M*, check which strings *M* accepts.

- Given a language (set of strings) can we build a DFA *M* that recognises just them? If the answer is affirmative can we construct a minimal (in the sense of the number of states) DFA recognising the language?
- Which properties of DFAs can be checked algorithmically?

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The language accepted by this DFA is empty, i.e. the DFA accepts no string.

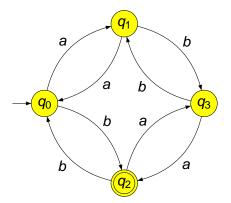


The language accepted by this DFA consists of all strings over  $\Sigma = \{a, b\}$ , i.e. the language  $\Sigma^* = \{a, b\}^*$ .



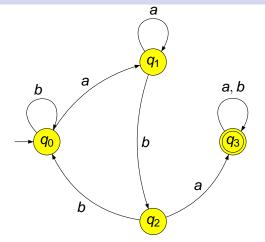
#### **DFA: example 1 continued**

The language accepted by this DFA consists of all strings over  $\Sigma = \{a, b\}$  which contain an even number of *a*'s and an odd number of *b*'s.



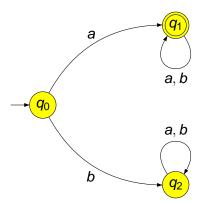
#### DFA: example 4

The language accepted by this DFA consists of all strings over  $\Sigma = \{a, b\}$  which contain the substring *aba*, i.e. all the strings of the form *uabav* with  $u, v \in \{a, b\}^*$ .

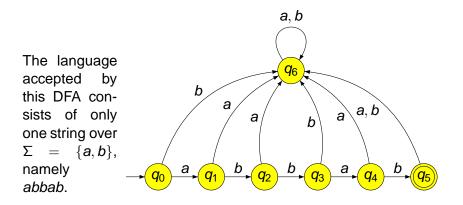


#### **DFA: example 5**

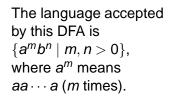
The language accepted by this DFA consists of all strings over  $\Sigma = \{a, b\}$  which start with a, i.e. all the strings of the form av, with  $v \in \Sigma^* = \{a, b\}^*$ .

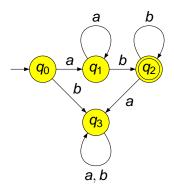


**DFA: example 6** 



DFA: example 7





Not all languages are accepted by DFAs

# The language

$$L = \{a^n b^n \mid n > 0\}$$

is not accepted by any DFA.

Why?

Informally, because a DFA can 'count' only up to the number of its states.

More formally, because, if *n* is greater than the number of states of a DFA supposed to accept *L*, then any trace (path) labelled by  $a^n$  passes twice through some state. That is, the there are strings  $a^i$  and  $a^j$  for  $i < j \le n$  that fall into the same state. Thus both  $a^i b^i$  and  $a^j b^i$  are accepted/rejected which contradicts the definition of *L*.

• The complement of a regular language is also regular. Proof: if A = L(M), where  $M = (Q, \Sigma, \delta, s, F)$ , then its complement,  $\overline{A} = L(M')$ , where  $M' = (Q, \Sigma, \delta, s, \overline{F})$ .

DFA

- It is algorithmically decidable whether a DFA *M* accepts the empty string.
   Proof: If *M* = (*Q*, Σ, δ, *s*, *F*), then ε ∈ *L*(*M*) if and only if *s* ∈ *F*.
- It is algorithmically decidable whether a DFA *M* accepts a string *w*. Proof: Construct the trace of the computation of *w* on *M* and check whether its last state is final.

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   Proof: Construct the trace of the computation of *w* on *M* and check whether its last state is final.

- It is algorithmically decidable whether a DFA *M* accepts the empty string.

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## It is algorithmically decidable whether a DFA M accepts no string.

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Proof: Given the DFA *M* check whether there is a path from the initial state *s* (has a trace of a computation) to a final state in *F*. We have:  $L(M) = \emptyset$  if and only if there there is no path from the initial state to a final state.

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# • It is algorithmically decidable whether a DFA *M* accepts infinitely strings.

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Proof: Given the DFA M, L(M) is infinite if and only if there is a path from the initial state (has a trace of a computation) s to a final state in F having the following additional property: some state q in the path possesses a loop, i.e. there is a path from q to q.

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#### The reverse operation

The reverse of a string

$$w = c_1 c_2 c_3 \cdots c_n$$

is the string

$$R(w)=c_nc_{n-1}\cdots c_2c_1.$$

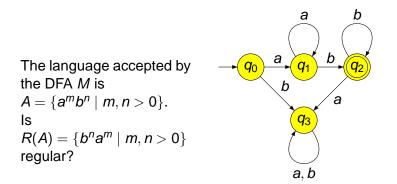
For example, R(abaaa) = aaaba, R(abba) = abba, R(bac) = cab.

The *reverse* of a language A is the language

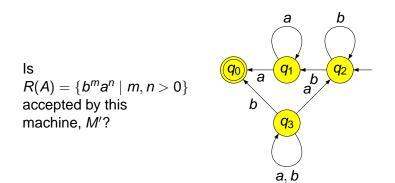
$$R(A) = \{R(w) \mid w \in A\}.$$

Problem: Is R(A) regular whenever A is regular?

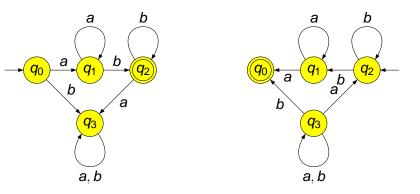
## DFA: example 7 revisited



## A possible solution?



The solution 'under microscope': *M* vs *M*'



1

NFA

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# What did we do, in more general terms?

- The initial state of M becomes the accept state of M'.
- 2 Every accept state of M becomes an initial state of M'.
- If  $\delta(q_1, c) = q_2$  is in *M* then  $\delta(q_2, c) = q_1$  is in *M'*. That is, all transitions are reversed.

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# Do we have a problem with M'? Answer: yes: M' is not a DFA!

Still, the procedure seems reasonable!

What should we do? Well, let's examine another example.

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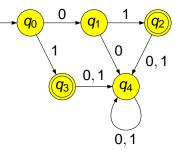
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#### The solution 'under microscope'

Transforming this DFA *M* into *M'* produces: a) two initial states:  $q_2, q_3$ b) multiple transitions with the same label (e.g.  $\delta(q_4, 0) = \{q_1, q_2, q_3, q_4\})$ 



4

#### Nondeterministic finite automata

#### Should we abandon the transformation $M \rightarrow M'$ ?

- No. We turn it into a new concept!
- A nondeterministic finite automaton (NFA, for short) is a five-tuple  $N = (Q, \Sigma, \delta, S, F)$  where
  - Q is the finite set of machine states
  - **2**  $\Sigma$  is the finite input alphabet
  - If  $\delta$  is a function from  $Q \times \Sigma$  to  $2^Q$ , the set of subsets of Q
  - If  $S \subseteq Q$  is a set of start (initial) states
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#### NFA: accepted strings and language

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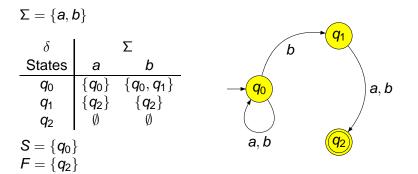
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- The state transition function  $\delta$  is more general for NFAs than DFAs. Besides having transitions to multiple states for a given input symbol, we can have  $\delta(q, c)$  empty (undefined) for some  $q \in Q$  and  $c \in \Sigma$ . This means that that we can design automata such that no state moves are possible for when in some state q and the next character read is c (that is, the human designer does not have to worry about all cases).
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1

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The string aba is accepted: there are two traces,

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The string baa is not accepted: there are two traces,

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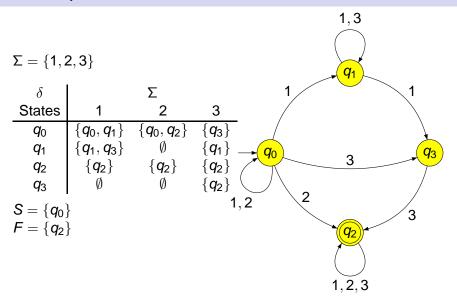
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NFA: example 2



NFA

#### Every NFA can be simulated by a DFA.

In fact, there is an algorithm which converts an NFA N into an equivalent DFA M, that is L(M) = L(N).

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• The set of states of *M* is the set of all subsets of *Q*,  $Q_M = 2^Q$ .

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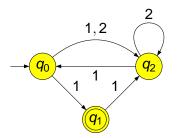
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- The initial state  $s_M$  of M is the set of all initial states of N,  $s_M = S$ .
- The accepting states *F<sub>M</sub>* of *M* is the set of states that have an accepting state of *N*, *F<sub>M</sub>* = {*A* ⊆ *Q* | *A* ∩ *F* ≠ ∅}.

## NFAtoDFA: an example

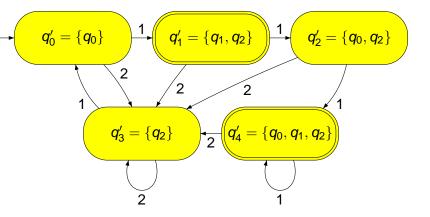


# The NFA N

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#### NFAtoDFA: an example



NFA

Equivalent DFA M

#### Closure properties of regular languages

# • The union of two regular languages is also regular.

Proof: Given two NFAs  $N_A$ ,  $N_B$  with no common states such that  $A = L(N_A)$ ,  $B = L(N_B)$ , the NFA *N* consisting of the union of all components of  $N_A$ ,  $N_B$  recognises  $A \cup B$ .

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More precisely, if  $N_A = (Q_A, \Sigma, \delta_A, S_A, F_A)$  and  $N_B = (Q_B, \Sigma, \delta_B, S_B, F_B)$  with  $Q_A \cap Q_B = \emptyset$ , then  $A \cup B$  is recognised by the NFA

$$N = (Q_A \cup Q_B, \Sigma, \delta_A \cup \delta_B, S_A \cup S_B, F_A \cup F_B).$$

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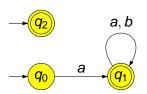
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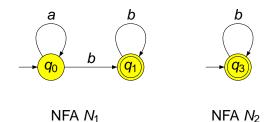


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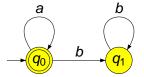
Closure under union: an example



## Closure under intersection: an example

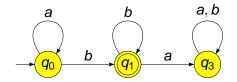


## Closure under intersection: an example



# NFA accepting the complement of $N_1$ ?

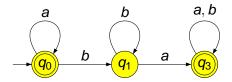
## Closure under intersection: an example



DFA  $M_1$  equivalent to  $N_1$ 

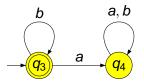
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#### Closure under intersection: an example



# DFA $\overline{M}_1$ recognising the complement of $M_1$

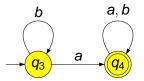
## Closure under intersection: an example



# DFA $M_2$ equivalent to $N_2$

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## Closure under intersection: an example



DFA  $\overline{M}_2$  recognising the complement of  $M_2$ 

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## Closure under intersection: an example

a b  $q_{0}$  b  $q_{1}$  a  $q_{2}$  b a, b  $q_{3}$  a  $q_{4}$ 

NFA  $N_3$  recognising  $L(\overline{M}_2) \cup L(\overline{M}_2)$ 

#### Closure under intersection: an example

Last two steps:

Construct a DFA M<sub>3</sub> equivalent to the NFA N<sub>3</sub>

 Construct the complement of *L*(*M*<sub>3</sub>) = *L*(*N*<sub>1</sub>) ∩ *L*(*N*<sub>2</sub>) = {*b<sup>k</sup>* | *k* ≥ 1}

Recap:

• 
$$L(N_1) = \{a^n b^m \mid n \ge 0, m \ge 1\}$$

• 
$$L(N_2) = \{b^m \mid m \ge 0\}$$

• 
$$L(M_3) = \{b^k \mid k \ge 1\}$$

#### Closure under intersection: an example

Last two steps:

- Construct a DFA M<sub>3</sub> equivalent to the NFA N<sub>3</sub>
- Construct the complement of  $L(M_3) = L(N_1) \cap L(N_2) = \{b^k \mid k \ge 1\}$

Recap:

# **Closure properties of regular languages**

The closure (or Kleene star) of a language A, denoted by  $A^*$ , is the set of all strings that can be formed by concatenating together any finite number of strings of A.

Examples:

- $\{a\}^* = \{\varepsilon, a, aa, aaa, \dots, a^n, \dots\}$
- $\{a, ab\}^* = \{\varepsilon, a, ab, aa, abab, aab, aba, \ldots\}$

 The Kleene star of a regular language is also regular. Proof: Given an NFA N<sub>A</sub> that recognizes a language A we can build an NFA N<sub>A\*</sub> that recognises the closure of A by making a start state accept state and, adding transitions, with corresponding labels, from all accept state(s) to the neighbours of the initial state(s).

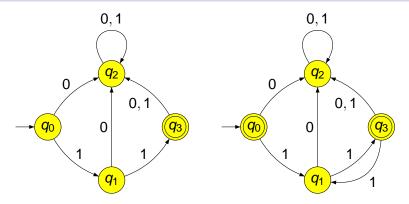
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## Closure operation: an example



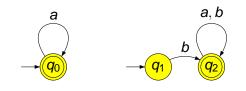
## **Closure properties of regular languages**

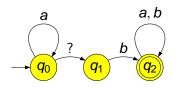
The concatenation of two languages *A*, *B* is defined to be the set of strings that can be formed by concatenating all strings of *A* with all strings of *B*, i.e.

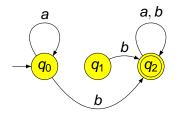
$$AB = \{xy \mid x \in A, y \in B\}.$$

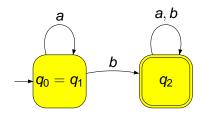
*Example*: If  $A = \{a^n \mid n \ge 0\}$  and  $B = \{bw \mid w \in \{a, b\}^*\}$ , then

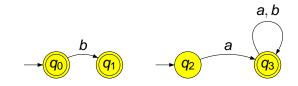
 $AB = \{a^n bw \mid w \in \{a, b\}^*, n \ge 0\} = \{ubv \mid u, v \in \{a, b\}^*\}.$ 

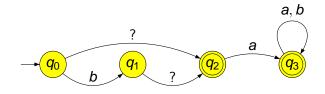


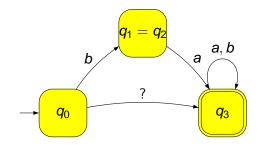


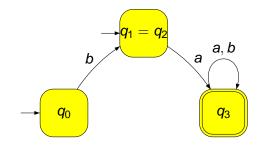


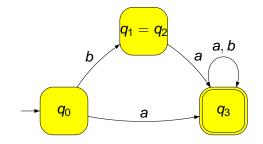












## **Closure properties of regular languages**

# • The concatenation of two regular languages is also regular.

Proof: Given two NFAs  $N_A = (Q_A, \Sigma, \delta_A, S_A, F_A)$  and  $N_B = (Q_B, \Sigma, \delta_B, S_B, F_B)$ ,  $Q_A \cap Q_B = \emptyset$ , recognising the languages *A*, *B*, respectively, we can build an NFA  $N = (Q, \Sigma, \delta, S, F)$  that recognises the concatenation of *A* and *B* as follows:

$$\triangleright \quad \mathbf{Q} = \mathbf{Q}_A \cup \mathbf{Q}_B$$

•  $S = S_A \cup S_B$  if one state of  $S_A$  is a final state; otherwise,  $S = S_A$ •  $F = F_B$ 

$$\delta(q,c) = \begin{cases} \delta_A(q,c), & \text{if } q \in \mathsf{Q}_A \setminus F_A, \\ \delta_B(q,c), & \text{if } q \in \mathsf{Q}_B \setminus S_B \\ \delta_A(q,c) \cup \{\delta_B(q',c) \mid q' \in S_B\}, & \text{if } q \in F_A. \end{cases}$$

# $\blacktriangleright Q = Q_{4} \cup Q_{B}$

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3

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#### **Closure under repeated concatenation**

Let *A* be a language and  $n \ge 1$ . We define:

$$A^n = \{ \mathbf{x}_1 \mathbf{x}_2 \cdots \mathbf{x}_n \mid \mathbf{x}_1, \mathbf{x}_2, \dots, \mathbf{x}_n \in A \}.$$

• If *A* is a regular language, then for each  $n \ge 1$ ,  $A^n$  is also regular. Proof:  $A^1 = A, A^2 = AA, \dots, \underbrace{A^n = AA \cdots A}_{n \text{ times}}$ , so the result follows from the closure under concatenation.

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## More decidable properties of regular languages

 It is algorithmically decidable whether two DFAs accept the same language.

Proof: If *A*, *B* are two languages recognised by the DFAs  $M_A$ ,  $M_B$ , respectively, then (using the closure properties of regular languages) we can construct a DFA *M* such that:

$$L(M) = A \Delta B = (A \cap \overline{B}) \cup (B \cap \overline{A}),$$

and then use the equivalence:

$$\mathsf{A} = \mathsf{B} \Leftrightarrow \mathsf{A} \Delta \mathsf{B} = \emptyset.$$

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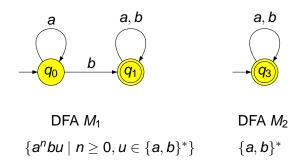
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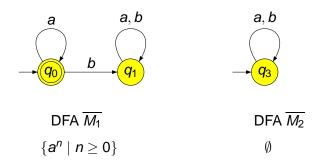
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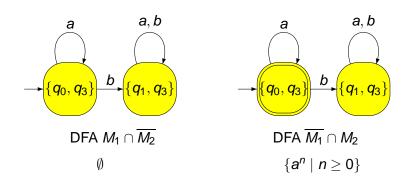
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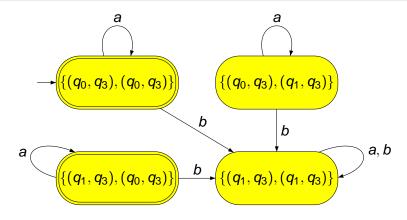
$$A = B \Leftrightarrow A \Delta B = \emptyset.$$



NFA







DFA  $M_1 \Delta M_2$ :  $\{a^n \mid n \ge 0\} \neq \emptyset$  implies  $L(M_1) \neq L(M_2)$ 

NFA

# More decidable properties of regular languages

- It is algorithmically decidable whether a DFA *M* accepts only one a string *w*.
   Proof: Take A = L(M) and B = {w}.
- It is algorithmically decidable whether the language accepted by a DFA *M* includes the language accepted by a DFA *M*'.
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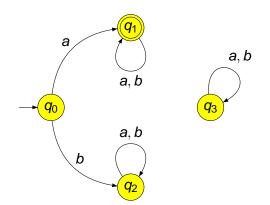
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The state  $q_3$  can be removed without modifying the accepted language

From a DFA

 $M = (Q, \Sigma, \delta, s, F)$ 

and any state  $q \in Q$  we define the new DFA

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# by simply replacing the initial state s with q.

We say two states p and q of M are distinguishable (*k*-distinguishable) if there exists a string  $w \in \Sigma^*$  (of length k) such that exactly one of  $M_p$ or  $M_q$  accepts w.

If there is no such string w then we say p and q are equivalent.

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4

Does there exist an algorithm deciding whether two states p and q are k-distinguishable?

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Questions:

• Does there exist an algorithm deciding whether two states *p* and *q* are distinguishable?

- Does there exist an algorithm deciding whether two states p and q are k-distinguishable?
- Does there exist an algorithm deciding whether two states *p* and *q* are equivalent?

## Minimisation of DFAs: elimination lemma

If a DFA *M* has two equivalent states *p* and *q*, then one of these states can be eliminated without modifying the accepted language, hence we can construct a smaller DFA M' such that L(M) = L(M').

Proof: Assume  $M = (Q, \Sigma, \delta, s, F)$  and  $p \neq s$ . We create an equivalent DFA

$$M' = (Q \setminus \{p\}, \Sigma, \delta', s, F \setminus \{p\}),$$

where  $\delta'$  is  $\delta$  with all instances of  $\delta(q_i, c) = p$  replaced with  $\delta'(q_i, c) = q$ , and all instances of  $\delta(p, c) = q_i$  deleted.

The resulting automaton M' is deterministic and accepts L(M).

Two states *p* and *q* are *k*-distinguishable if and only if for some  $c \in \Sigma$ , the states  $\delta(p, c)$  and  $\delta(q, c)$  are (k - 1)-distinguishable.

Proof: Consider all strings w = cw' of length k. If  $\delta(p, c)$  and  $\delta(q, c)$  are (k - 1)-distinguishable by some string w', then p and q must be k-distinguishable by w.

Likewise, if *p* and *q* are *k*-distinguishable by *w*, then there exist two states  $\delta(p, c)$  and  $\delta(q, c)$  that are (k - 1)-distinguishable by the shorter string *w*'.

## Minimisation of DFAs: the algorithm

The algorithm minimizeDFA finds the equivalent states of a DFA  $M = (Q, \Sigma, \delta, s, F)$ . It defines a series of equivalence relations  $\equiv_0, \equiv_1, \ldots$  on the states of Q:

- $p \equiv_0 q$  if both p and q are in F or both not in F.
- $p \equiv_{k+1} q$  if  $p \equiv_k q$  and, for each  $c \in \Sigma$ ,  $\delta(p, c) \equiv_k \delta(q, c)$ .

It stops generating these equivalence classes when  $\equiv_n$  and  $\equiv_{n+1}$  are identical.

# Is the algorithm correct?

Distinguish lemma guarantees no more non-equivalent states.

Since there can be at most the number of states non-equivalent states, the number of equivalence relations  $\equiv_k$  generated cannot be larger than the number of states.

We can eliminate one state from *M* (using the elimination lemma) whenever there exist two states p and q such that  $p \equiv_n q$ .

ls the algorithm minimizeDFA optimal?
222

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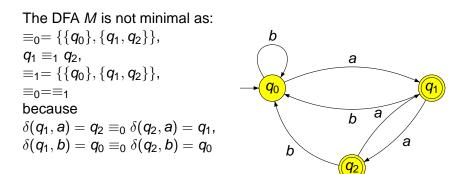
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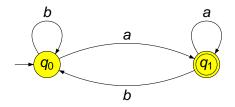
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The following DFA is minimal and equivalent to M:

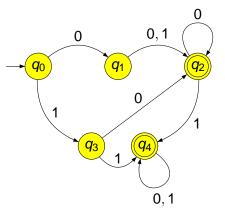


The DFA *M* is not minimal as:  $\equiv_0 = \{\{q_0, q_1, q_3\}, \{q_2, q_4\}\},\$ 

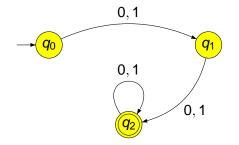
$$\equiv_1 = \{ \{q_0\}, \{q_1, q_3\}, \{q_2, q_4\} \}, \\ \equiv_2 \equiv_1,$$

because

$$\begin{split} \delta(q_2, 0) &= q_2 \equiv_0 \delta(q_4, 0) = q_4, \\ \delta(q_2, 1) &= q_4 \equiv_0 \delta(q_4, 1) = q_4, \\ \delta(q_0, 0) &= q_1 \neq_0 \delta(q_1, 0) = q_2, \\ \delta(q_0, 0) &= q_1 \neq_0 \delta(q_3, 0) = q_2, \\ \delta(q_1, 0) &= q_2 \equiv_0 \delta(q_3, 0) = q_2, \\ \delta(q_1, 1) &= q_2 \equiv_0 \delta(q_3, 1) = q_4 \end{split}$$



# The following DFA is minimal and equivalent to *M*:



## Searching with GREP

# A grep pattern, also known as a regular expression, describes the text that we are looking for.

For instance, a pattern can describe words that begin with C and end in I. A pattern like this would match "Call", "Cornwall", and as well as many other words, but not "Computer".

Most characters that we type into the Find & Replace dialogue (in your favourite editor) match themselves. For instance, if you are looking for the letter "s", Grep stops and reports a match when it encounters an "s" in the text.

A range of characters can be enclosed in square brackets. For example [a-z] would denote the set of lower case letters. A period . is a wild card symbol used to denote any character except a newline. A grep pattern, also known as a regular expression, describes the text that we are looking for.

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#### **Regular expressions**

The Kleene regular expressions over the alphabet  $\Sigma$  and the sets they designate are:

**(**) Any  $c \in \Sigma$  is a regular expression denoting the set  $\{c\}$ .

If  $E_1$ ,  $E_2$  are regular expressions and  $E_1$  denotes the set  $S_1$ ,  $E_2$  denotes the set  $S_2$ , then so are:

- $E_1 + E_2$  (or  $E_1 | E_2$ ) which denotes the union  $S_1 \cup S_2$ ,
- $E_1 E_2$  which denotes the concatenation  $S_1 S_2$ ,
- $E_1^*$  which denotes the Kleene closure  $S_1^*$ .

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# **Examples of regular expressions**

Sample regular expressions over  $\Sigma = \{a, b, c\}$  and their corresponding sets (languages):

regular expression	denoted set (language)
а	{ <b>a</b> }
ab	{ <b>ab</b> }
a + bb	{a, bb}
(a+b)c	{ <i>ac</i> , <i>bc</i> }
<b>C</b> *	$\{arepsilon,  extsf{CC},  extsf{CCC}, \dots\}$
(a+b+c)cba	{acba, bcba, ccba}
$a^{*} + b^{*} + c^{*}$	$\{\varepsilon, a, b, c, aa, bb, cc, aaa, bbb, ccc, \ldots\}$
$(a+b^*)c(c^*)$	$\{ac, acc, accc, \dots, c, cc, ccc, \dots, dc, accc, accc, \dots, dc, accc, accc, \dots, dc, accc, accc, \dots, dc, accc, acccc, accc, acccc, accc, accc, acccc, acccc, acccc, acccc, acccc, acccc, accc, acc$
	$bc, bcc, bbccc, \ldots\}$

Kleene's Theorem: Regular sets coincide with regular languages.

- NFAs for L = Ø and L = {ε} are easy to construct: an NFA with no final states works in the first case and an NFA with one initial and final state and no transitions works in the second case.
- Now suppose *E* is a regular expression for *L*. We construct an NFA *N* such that L(N) = L based on the length of *E*. We proceed by induction.

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- Verification: If  $E = \{c\}$  for some  $c \in \Sigma$ , then we can take  $N = (Q, \Sigma, \delta, S, F)$  where  $Q = \{q_0, q_1\}, S = \{q_0\}, F = \{q_1\}$  and there is one transition  $\delta(q_0, c) = q_1$ .
- Induction:
  - ▶ If  $N_1$ ,  $N_2$  are NFAs accepting the languages denoted by  $E_1$  and  $E_2$ , respectively, then in view of the closure under union the NFA  $N_{union}$  accepts the language denoted by  $E_1 + E_2$ :

$$L(N_{union}) = L(N_1) \cup L(N_2).$$

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# • Induction (continued):

▶ If  $N_1$ ,  $N_2$  are NFAs accepting the languages denoted by  $E_1$  and  $E_2$ , respectively, then in view of the closure under concatenation the NFA  $N_{concatenation}$  accepts the language denoted by  $E_1 E_2$ :

$$L(N_{concatenation}) = L(N_1)L(N_2).$$

If N<sub>1</sub> is a NFA accepting the language denoted by E<sub>1</sub>, then in view of the closure under Kleene closure the NFA N<sub>\*</sub> accepts the language denoted by E<sub>1</sub><sup>\*</sup>:

$$L(N_*)=L(N_1)^*.$$

# Induction (continued):

If N<sub>1</sub>, N<sub>2</sub> are NFAs accepting the languages denoted by E<sub>1</sub> and E<sub>2</sub>, respectively, then in view of the closure under concatenation the NFA N<sub>concatenation</sub> accepts the language denoted by E<sub>1</sub>E<sub>2</sub>:

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# Kleene's Theorem: an example

Construct an NFA accepting exactly the language denoted by the regular expression:  $(01)^* + 1$ .

- construct NFAs *N*<sub>1</sub> and *N*<sub>2</sub> accepting the languages {0} and {1}, respectively
- construct an NFA N<sub>3</sub> for the concatenation of L(N<sub>1</sub>) and L(N<sub>2</sub>) obtaining the language {01}
- construct an NFA N<sub>4</sub> for the Kleene closure of L(N<sub>3</sub>) so obtaining {01}\*
- construct an NFA N<sub>5</sub> for the union of L(N<sub>4</sub>) and L(N<sub>2</sub>) obtaining the language {01}\* ∪ {1}
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Construct a regular expression denoting the language:

$$A = \{0^{n}1^{m} \mid n, m \ge 0\}.$$

The language L is regular and

$$A = \{0^{n}1^{m} \mid n, m \ge 0\} \\ = \{0^{n} \mid n \ge 0\}\{1^{m} \mid m \ge 0\}$$

so A is denoted by 0\*1\*.

There is no a regular expression denoting the language:

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There is no a regular expression denoting the language:

$$C = \{uuww \mid u, w \in \{a, b\}^*\}$$

because C is not regular. Prove this fact!

There is no a regular expression denoting the language:

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because C is not regular. Prove this fact!

#### The pattern matching problem

# The pattern matching problem:

Given a (short) pattern P and a (long) text T, (over an alphabet  $\Sigma$ ) determine whether P appears somewhere in T.

*Example*: If P = aba and T = baabababaaaba, then the first occurrence of P in T appears at the third character:

T = ba**aba**babaaaba

Of course, there are some other occurrences.

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Try each possible position the pattern P[1..m] could appear in the text T[1..n]:

There are two nested loops; the inner one takes O(m) iterations and the outer one takes O(n) iterations so the total time is the product, O(mn). This is slow!

# An example: if T[1..n] is $a^n$ , and P[1..m] is *b*, then it takes *m* comparisons each time to discover that we don't have a match, so *mn* overall.

The worst case scenario may not be too frequent because the inner loop usually finds a mismatch quickly and moves on to the next position without going through all *m* steps.

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# Pattern matching and regular languages

Solution: Consider the language

 $A(P) = \{x \mid x \text{ contains the pattern } P\}.$ 

1

Assume that A(P) is regular! Let *M* be a DFA for A(P). When processing an input *M* must enter an accepting state when it has just finished 'seeing' the first occurrence of *P*, and thereafter it must remain in some accepting state or other.

# Is A(P) regular?

Answer: yes.

*Example*: If P = aba and the alphabet is  $\{a, b\}$ , then

$$A(P) = \{x \in \{a, b\}^* \mid x = uPv, \text{ for some } u, v \in \{a, b\}^*\},\$$

or

# $A(P) = \{uabav \mid u, v \in \{a, b\}^*\}.$

Is A(P) regular?

Answer: yes.

*Example*: If P = aba and the alphabet is  $\{a, b\}$ , then

 $A(P) = \{x \in \{a, b\}^* \mid x = uPv, \text{ for some } u, v \in \{a, b\}^*\},\$ 

٥r

# $A(P) = \{uabav \mid u, v \in \{a, b\}^*\}.$

Is A(P) regular?

Answer: yes.

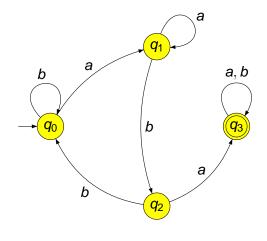
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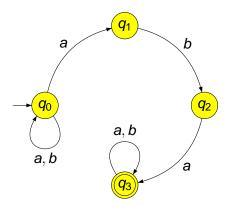
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# Pattern matching and regular languages



A DFA for AP(aba)

### Pattern matching and regular languages



An NFA for A(aba)

4

# Pattern matching and regular languages

# For every string P, the language

# $A(P) = \{uPv \mid u, v \in \{a, b\}^*\}$

## is regular.

Proof: Let *M* be a DFA recognising exactly  $\{P\}$ . An NFA recognising A(P) can be obtained from a DFA *M* by adding loops labelled with *a* and *b* to the initial and final states of *M*.

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### Pattern matching and regular languages

# Is the fact that A(P) is regular of any use?

Yes, because there is an algorithm testing the membership problem for A(P) which is the same as testing whether P appears in the input text T.

How complex is this algorithm?

### Pattern matching and regular languages

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## An efficient "automata-theoretic" solution

We will present an efficient "automata-theoretic" solution which consists of:

"pre-processing": building a DFA *M* for each pattern *P*[1..*m*], then
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The complexity of this solution is the sum of the complexities of the above two steps.

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- 2 running M on the text T[1..n].

The complexity of this solution is the sum of the complexities of the above two steps.

# We introduce the prefix and suffix relations and the suffix function.

- A string w is a prefix of the string x,  $w \leq_{\text{prefix}} x$  if x = wz for some string z.
- Let  $P_k$  be P[1..k], the prefix of length  $k \le m$  of P[1..m].
- A string *w* is a suffix of the string *x*,  $w \leq_{\text{suffix}} x$  if x = yw for some string *y*.
- For example:  $a \leq_{\text{prefix}} ab$ ,  $ca \leq_{\text{suffix}} aabbca$ ,  $baab \leq_{\text{suffix}} baab$ , but  $ca \not\leq_{\text{prefix}} aaaaba$ ,  $ab \not\leq_{\text{suffix}} abb$ .
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The suffix function associated to the pattern P[1..m] is the function

$$\sigma: \Sigma^* \to \{0, 1, \ldots, m\}$$

defined as follows:  $\sigma(x)$  is the length of the longest prefix of *P* that is a suffix of *x*,

$$\sigma(\mathbf{x}) = \max\{\mathbf{k} : \mathbf{P}_{\mathbf{k}} \leq_{\text{suffix}} \mathbf{x}\}.$$

For example, if P = nano and  $\Sigma = \{a, b, n, o\}$  then  $P_0 = \varepsilon, P_1 = n, P_2 = na, P_3 = nan, P_4 = nano = P$  (so m = 4).

> $\sigma(\varepsilon) = 0$   $\sigma(annnao) = 0$   $\sigma(aonaaanna) = 2$   $\sigma(aon) = 1$   $\sigma(aonaaannano) = 4$  $\sigma(annnaanan) = 3.$

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The automaton states will record partial matches to the pattern.

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In particular they will tell whether

- we have already matched P[1..m] in T[1..n], and, if not,
- we could possibly be in the middle of a match.

So we will have m + 1 states: the initial and accept states are clear: 0, m, respectively.

The transition function from (state, character) to state is the longest string that is simultaneously a prefix of the pattern and a suffix of that prefix of the pattern plus the character we have just scanned. The automaton states will record partial matches to the pattern.

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### **Aho-Corasick automaton**

Given the pattern P[1..m] over  $\Sigma$ , the Aho-Corasick DFA  $M = (Q, \Sigma, \delta, s, F)$  is constructed as follows:

- the set of states:  $Q = \{0, 1, ..., m\}$ ,
- (2) the alphabet:  $\Sigma$ ,
- **③** the transition function  $\delta$  from  $Q \times \Sigma$  to Q is defined by

 $\delta(\boldsymbol{q},\boldsymbol{x})=\sigma(\boldsymbol{P}_{\boldsymbol{q}}\boldsymbol{x}),$ 

where  $q \in Q, x \in \Sigma$ ,

0 is the start state,

**I**  $F = \{m\}$  is the (unique) accepting state.

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Here is an example for the alphabet  $\Sigma = \{a, b, n, o\}$  and pattern P = nano, so m = 4. Aho-Corasick automaton M will have:

• the set of states:  $Q = \{0, 1, 2, 3, 4\}$ ,

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$$\begin{split} \delta(0,a) &= \sigma(P_0a) = \sigma(\varepsilon a) = \sigma(a) = 0\\ \delta(0,b) &= \sigma(P_0b) = \sigma(\varepsilon b) = \sigma(b) = 0\\ \delta(0,n) &= \sigma(P_0n) = \sigma(\varepsilon n) = \sigma(n) = 1\\ \delta(0,o) &= \sigma(P_0o) = \sigma(\varepsilon o) = \sigma(0) = 0\\ \delta(1,a) &= \sigma(P_1a) = \sigma(na) = 2\\ \delta(1,b) &= \sigma(P_1b) = \sigma(nb) = 0\\ \delta(1,n) &= \sigma(P_1n) = \sigma(nb) = 1\\ \delta(1,o) &= \sigma(P_1o) = \sigma(no) = 0\\ \delta(2,a) &= \sigma(P_2a) = \sigma(naa) = 0\\ \delta(2,b) &= \sigma(P_2b) = \sigma(nab) = 0\\ \delta(2,n) &= \sigma(P_2n) = \sigma(nan) = 3\\ \delta(2,o) &= \sigma(P_2o) = \sigma(nao) = 0 \end{split}$$

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$$\delta(3, a) = \sigma(P_3a) = \sigma(nana) = 2$$
  

$$\delta(3, b) = \sigma(P_3b) = \sigma(nanb) = 0$$
  

$$\delta(3, n) = \sigma(P_3n) = \sigma(nann) = 1$$
  

$$\delta(3, o) = \sigma(P_3o) = \sigma(nanoa) = 0$$
  

$$\delta(4, a) = \sigma(P_4a) = \sigma(nanoa) = 0$$
  

$$\delta(4, b) = \sigma(P_4b) = \sigma(nanob) = 0$$
  

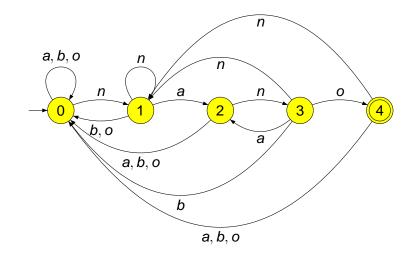
$$\delta(4, n) = \sigma(P_4n) = \sigma(nanon) = 1$$
  

$$\delta(4, o) = \sigma(P_4o) = \sigma(nanoo) = 0$$

## A compact presentation of the transition function:

6

$\delta(\boldsymbol{q}, \boldsymbol{x})$	а	b	n	0	Ρ
0	0	0	1	0	n
1	2	0	1	0	а
2	0	0	3	0	n
3	2	0	1	4	0
4	0	0	1	0	



7

8

The following procedure computes the transition function:

COMPUTE-TRANSITION-FUNCTION  $(P, \Sigma)$ 

```
1. m = length[P]

2. for q = 0 to m

3. do for each character x \in \Sigma

4. do k = min(m+1, q+2)

5. repeat k = k - 1

6. until P_k \leq_{suffix} P_q x

7. \delta(q, a) = k

8. return \delta
```

The procedure computes  $\delta(q, x)$  in a straightforward manner: it starts with the largest possible value for k, which is min(m, q + 1) and decreases k until  $P_k \leq_{\text{suffix}} P_q x$ .

The running time is  $O(m^3 \times \text{number of elements in } \Sigma)$ : the outer loops contribute a factor of  $m \times \text{number of elements in } \Sigma$ , the inner loops can run at most m + 1 times and the test  $P_k \leq_{\text{suffix}} P_q x$  on line 6. can require to compare up to *m* characters.

A **clever** algorithm requiring  $O(m \times \text{number of elements in } \Sigma)$  exists!

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A **clever** algorithm requiring  $O(m \times \text{ number of elements in } \Sigma)$  exists!

The following algorithm runs Aho-Corasick automaton for the pattern P on the text T:

```
FINITE-AUTOMATON-MATCHER (\Sigma, \delta, T)
```

```
1. n = length[T]

2. q = 0

3. for i=1 to n

4. do q = \delta(q, T[i])

5. if q = m

6. then print 'Pattern occurs at position i - m' and return

7. Print 'Pattern doesn't occur'
```

The simple loop structure of the above algorithm shows that the running time on T[1..n] is O(n). The overall running time, i.e. which includes the pre-processing, is now

 $O(m \times \text{ number of elements in } \Sigma) + O(n).$ 

Consider the example for the alphabet  $\Sigma = \{a, b, n, o\}$  and pattern P = nano. Running the Aho-Corasick automaton M described above on the text T = annaananoaa we get:

					11	

so the match was found at position i - m = 11 - 4 = 7.

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i	1	2	3	4	5	6	7	8	9	10	11	12	13
T[i]	а	n	n	n	а	а	n	а	n	0	а	а	
state	0	0	1	1	1	2	0	1	2	3	4	0	0
							n	а	n	0			

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							n	а	n	0			

so the match was found at position i - m = 11 - 4 = 7.

## Knuth-Morris-Pratt algorithm

Knuth-Morris-Pratt algorithm uses the *prefix function* associated to the pattern P[1..m]

$$\pi: \{1, 2, \dots, m\} \to \{0, 1, 2, \dots, m-1\}$$

defined by

$$\pi(q) = \max\{k : k < q \text{ and } P_k \leq_{\text{suffix}} P_q\},\$$

i.e. the length of the shortest prefix of P that is a proper suffix of  $P_q$ . The overall running time is

$$O(m+n)$$
.



# In the practice of computing regular expressions (abbreviated as regex or regexp, with plural forms regexes) differ from the Kleene definition discussed before.

Regexes are written in a formal language that can be interpreted by a regular expression processor, a program that either serves as a parser generator or examines text and identifies parts that match the provided specification.

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Regexes are written in a formal language that can be interpreted by a regular expression processor, a program that either serves as a parser generator or examines text and identifies parts that match the provided specification.

There are various versions of regexes; they provide an expressive power that exceeds the regular languages.

Here is an example. Regexes have the ability to group sub-expressions with parentheses and recall the value they match in the same expression.

Using this feature one can write a pattern that matches strings of repeated words like "papatoetoe" (squares). The regex to match "papatoetoe" is

 $(.^*) \setminus 1(.^*) \setminus 2,$ 

where 1 = pa and 2 = toe were the sub-matches. The language associated to this pattern is not regular.

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Using this feature one can write a pattern that matches strings of repeated words like "papatoetoe" (squares). The regex to match "papatoetoe" is

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Although in many cases system administrators can run regex-based queries internally, most search engines do not offer regex support to the public.

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## **Test distribution**

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