# Formal Languages in Theory and Practice — day 2 Regular Languages

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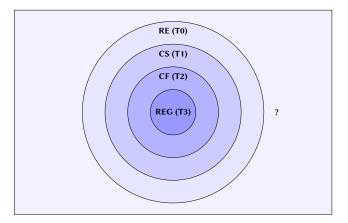
#### Outline

- NLs as FLs
- right-linear grammars
- gular expressions
- finite-state automata
- Theorem of Kleene

### Chomsky-hierarchy: main theorem

 $regular \subset context\text{-}free \subset context\text{-}sensitive \subset recursively \ enumerable$ 

$$REG \subset CF \subset CS \subset RE$$



#### Recall

- alphabet  $\Sigma$ : nonempty, finite set of symbols
- word w: a finite string  $x_1 \dots x_n$  of symbols;  $(x_1 \dots x_n \in \Sigma)$
- a formal language L is a set of words over an alphabet  $\Sigma$ , i.e.  $L \subseteq \Sigma^*$

type	grammar	rules	machine	idea	word problem	
RE	unrestricted	$\alpha \to \beta$	Turing machine	• • • • • • • • • • • • • • • • • • •	undecidable	
CS	context- sensitive	$\gamma A \delta \to \gamma \beta \delta$	linearly restricted automaton	•••	exponential	
CF	context- free	$A  o \beta$	pushdown- automaton	•••	cubic	
REG	right-linear	$A \rightarrow a aB$	finite-state automaton	•••	linear	

## Which is the class of natural languages?

# Why is the formal complexity of natural languages interesting?

- It gives information about the general structure of natural language
- It allows to draw conclusions about the adequacy of grammar formalisms
- It determines a lower bound for the computational complexity of natural language processing tasks

## Which is the class of natural languages?

#### Which idealizations about NL are necessary?

- The family of natural languages exists.
- Language = set of strings over an alphabet:
- Natural languages are generated by finite rule systems (grammars)
- Each NL consists of an infinite set of strings

#### About the idealizations

#### The family of natural languages exists:

- all natural languages are structurally similar
- all natural languages have a similar generative capacity

#### **Arguments:**

- all NLs serve for the same tasks.
- children can learn each NL as their native language (within a similar period of time)
- $\Rightarrow$  No evidence for a principal structural difference

#### About the idealizations (cont.)

#### Language = a set of strings over an alphabet:

- native speakers have full competence
- consistent grammaticality judgements

#### **Arguments:**

- all mistakes are due to performance not competence
- Mathews (1979) counter examples:
  - ▶ The canoe floated down the river sank.
  - ▶ The editor authors the newspaper hired liked laughed.
  - ▶ The man (that was) thrown down the stairs died.
  - ▶ The editor (whom) the authors the newspaper hired liked laughed.

#### About the idealizations (cont.)

#### Natural languages are generated by finite rule systems (grammars):

#### **Arguments:**

If a language is infinite, a finite set of rules can explain

- how a language can be learned
- how we understand each others sentences

#### About the idealizations (cont.)

#### Each NL consists of an infinite set of strings

#### **Arguments:**

- Recursion in NL:
  - ▶ John likes Peter
  - ▶ John likes Peter and Mary
  - ▶ John likes Peter and Mary and Sue
  - ▶ John likes Peter and Mary and Sue and Otto and ...
- (Donaudampfschiffskapitänsmützenschirm ...)

#### However:

 The set of all English sentences that have been used so far and that will be used in the time of mankind is finite.

#### Right-linear grammars

• the class of Type 3 languages can be generated by **right-linear grammars** 

#### Definition

A grammar (N, T, S, R) is **Type3** or **right-linear** iff all rules are of the form:

$$A \rightarrow a \text{ or } A \rightarrow aB \text{ with } A, B \in N, a \in T$$

Additionally, the rule  $S \to \epsilon$  is allowed iff S does not appear in any right-hand side of a rule.

A language generated by a right-linear grammar is said to be a **right-linear language** or a **Type3-language**.

[Remember, we write L(G) for the language generated by a grammar G.]

• **left-linear grammars** are defined analogously and generate Type 3 languages as well ( $A \rightarrow a$  or  $A \rightarrow Ba$ )

## Examples: Right-linear / left-linear grammar

generating the language (aaa\*)

with a right-linear grammar:

• 
$$R = \{S \rightarrow aA, A \rightarrow aA, A \rightarrow a\}$$

• example derivations:

$$S \Rightarrow aA \Rightarrow aa$$

$$S \Rightarrow aA \Rightarrow aaA \Rightarrow aaaA \Rightarrow aaaa$$

and with a left-linear grammar:

- $R = \{S \rightarrow Aa, A \rightarrow Aa, A \rightarrow a\}$
- example derivations:

$$S \Rightarrow Aa \Rightarrow aa$$

$$S \Rightarrow Aa \Rightarrow Aaa \Rightarrow Aaaa \Rightarrow aaaa$$

## Regular expressions

• the class of Type 3 languages can be described by **regular expressions** 

The set of **regular expressions**  $RegEx_{\Sigma}$  over an alphabet  $\Sigma = \{x_1, \dots, x_n\}$  is defined by:

- $\emptyset$  is a regular expression.
- ullet is a regular expression.
- $x_1, \ldots, x_n$  are regular expressions.
- If a and b are regular expressions over  $\Sigma$  then
  - |a|b
  - ► ab
  - a<sup>\*</sup>

are regular expressions too.

## Regular expressions

#### RegEx: semantics

Each regular expression r over an alphabet  $\Sigma$  denotes a formal language  $L(r) \subseteq \Sigma^*$ .

**Regular languages** are those formal languages which can be expressed by a regular expression.

The denotation function *L* is defined inductively:

- $L(\emptyset) = \emptyset$ ,  $L(\epsilon) = {\epsilon}$ ,  $L(x_i) = {x_i}$
- $L(r_1|r_2) = L(r_1) \cup L(r_2)$
- $L(r_1r_2) = L(r_1) \frown L(r_2)$
- $L(r^*) = L(r)^*$

<sup>&#</sup>x27; $r^+$ ' is used as a short-hand for ' $r \sim r^*$ '.

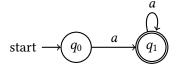
### Examples: regular expressions

Find a regular expression which describes the regular language L (be careful: at least one language is not regular!)

- *L* is the language over the alphabet  $\{a, b\}$  with  $L = \{aa, \epsilon, ab, bb\}$ .  $aa|\epsilon|ab|bb$
- *L* is the language over the alphabet  $\{a, b\}$  which consists of all words which start with a nonempty string of *a*'s followed by any number of *b*'s.  $a^+b^*$
- *L* is the language over the alphabet  $\{a, b\}$  such that every *a* has a *b* immediately to the right.  $b^*(ab^+)^*$
- *L* is the language over the alphabet  $\{a, b\}$  which consists of all words which contain an even number of *a*'s.  $b^*(ab^*a)^*b^*$
- *L* is the language of all palindromes over the alphabet {*a*, *b*}. not regular!

#### Deterministic finite-state automaton (detFSA)

- the class of Type 3 languages can be accepted (recognized) by deterministic finite-state machines (detFSA)
- example: detFSA for the language  $L(a^+)$



- initial state  $q_0$ , final state  $q_1$
- transitions from  $q_0$  to  $q_1$  reading an a, from  $q_1$  to  $q_1$  reading an a

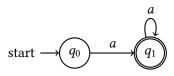
### Deterministic finite-state automaton (detFSA)

#### Definition

A deterministic finite-state automaton is a 5-tuple  $(Q, \Sigma, \delta, q_0, F)$  with:

- a finite, nonempty set of states Q
- **2** an alphabet  $\Sigma$  with  $Q \cap \Sigma = \emptyset$
- **3** a transition function  $\delta: Q \times \Sigma \to Q$
- **9** an initial state  $q_0 \in Q$  and
- **3** a set of final states  $F \subseteq Q$

$$FSA = (\{q_0, q_1\}, \{a\}, \{(q_0, a) \mapsto q_1, (q_1, a) \mapsto q_1\}, q_0, \{q_1\})$$



## Language accepted by an automaton

#### Definition

A situation of a finite-state automaton  $(Q, \Sigma, \delta, q_0, F)$  is a triple (x, q, y) with  $x, y \in \Sigma^*$  and  $q \in Q$ .

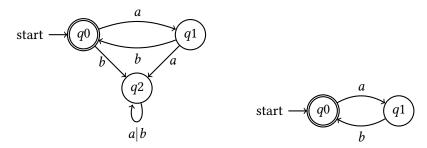
Situation (x, q, y) produces situation (x', q', y') in one step if there exists an  $a \in \Sigma$  such that x' = xa, y = ay' and  $\delta(q, a) = q'$ , we write  $(x, q, y) \mapsto (x', q', y')$   $[(x, q, y) \mapsto^* (x', q', y')$  as usual].

#### Definition

A word  $w \in \Sigma^*$  gets accepted by an automaton  $(Q, \Sigma, \delta, q_0, F)$  if  $(\epsilon, q_0, w) \mapsto^* (w, q_n, \epsilon)$  with  $q_n \in F$ .

An automaton accepts a language iff it accepts every word of the language. We write L(A) for the language accepted by an automaton A.

## Example



- both automatons accept language  $L((ab)^*)$
- in automaton graphs we often omit the trap state (partial transition function)

## Nondeterministic finite-state automaton (nondetFSA)

#### Definition

A nondeterministic finite-state automaton is a 5-tuple  $(Q, \Sigma, \Delta, q_0, F)$  with:

- a finite nonempty set of states Q
- **2** an alphabet  $\Sigma$  with  $Q \cap \Sigma = \emptyset$
- **3** a transition relation  $\Delta \subseteq Q \times \Sigma \times Q$
- **4** an initial state  $q_0 \in Q$  and
- **3** a set of final states  $F \subseteq Q$

#### nondetFSA: extensions

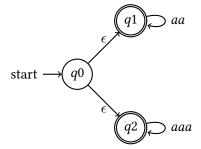
- ullet an  $\epsilon$ -transition  $\stackrel{\epsilon}{ o}$  allows to change the state without reading a symbol
- a **regular-expression transition**  $\stackrel{r}{\rightarrow}$  allows to change the state by reading in any string  $s \in L(r)$

#### Theorem of Rabin & Scott

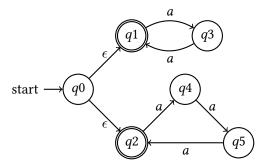
A language L is accepted by a detFSA iff L is accepted by a nondetFSA (with  $\epsilon$ -transitions and/or regular-expression transitions).

- Why is it useful to have both notions?
  - the detFSAs are conceptually more straightforward
  - sometimes easier to construct a nondetFSA
  - for some other classes of automata the two subclasses are not equivalent
- example:
  - L:  $\{a^n \mid n \text{ is even or dividable by 3}\}$  (or  $L((aa)^* \mid (aaa)^*)$ )
  - ▶ L((aa)\* | (aaa)\*) is accepted by the automata on the following slides: regex-FSA,  $\epsilon$ -FSA, nondetFSA and detFSA

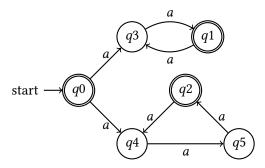
•  $L((aa)^* \mid (aaa)^*)$  with regex-FSA



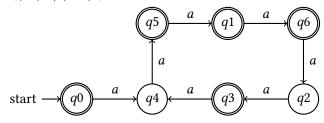
• L( $(aa)^* \mid (aaa)^*$ ) with  $\epsilon$ -FSA



•  $L((aa)^* \mid (aaa)^*)$  with nondetFSA



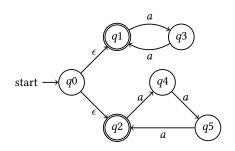
•  $L((aa)^* \mid (aaa)^*)$  with detFSA



### Eliminating $\epsilon$ -transitions

- the  $\epsilon$ -closure of a state q (denoted as ECL(q)) is the set that contains q together with all states that can be reached starting at q by following only  $\epsilon$ -transitions
- Given an  $\epsilon$ -FSA M eliminating  $\epsilon$ -transitions produces an nondetFSA M' such that L(M') = L(M).
- The construction of M' begins with M as input, and takes 3 steps:
  - 1. Make q an accepting state iff ECL(q) contains an accepting state in M.
  - 2. Add an arc from q to q' labeled a iff there is an arc labeled a in M from some state in ECL(q) to q'.
  - 3. Delete all arcs labeled  $\epsilon$ .

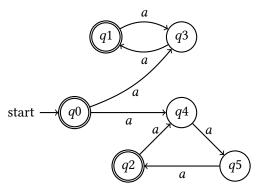
## Eliminating $\epsilon$ -transitions



- $ECL(q_0) = \{q_0, q_1, q_2\}$
- make q<sub>0</sub> an accepting (final) state
   (Make q an accepting state iff ECL(q) contains an accepting state in M.)
- 2. add the arcs: from  $q_0$  to  $q_3$  by a and  $q_0$  to  $q_4$  by a (Add an arc from q to q' labeled a iff there is an arc labeled a in M from some state in ECL(q) to q'.)
- 3. Delete all arcs labeled  $\epsilon$ .

### Eliminating $\epsilon$ -transitions

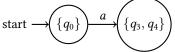
• step 1 – 2. resulting in:



• still non-deterministic FSA

#### nondetFSA to detFSA

- make the nondetFSA from the previous slide deterministic
- remove multiple transitions with the same symbol
- idea: each state in detFSA will be a **set of states** from the nondetFSA
  - ▶ from  $q_0$  we can go with a to  $q_3$  and  $q_4$   $\Rightarrow$  in the detFSA we have the states  $\{q_0\}$  and  $\{q_3, q_4\}$  with an a transition

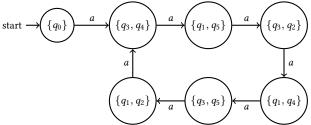


▶ from the states in  $\{q_3, q_4\}$  we can go with a to  $q_1$  and  $q_5$   $\Rightarrow$  in the detFSA we add the state  $\{q_1, q_5\}$  with an a transition from  $\{q_3, q_4\}$ 

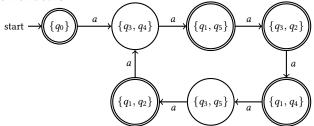


#### nondetFSA to detFSA

• repeat the steps as before, result in in:



• make all states final, where any of the states in the set were final states in the nondetFSA



#### Theorem of Kleene

#### Theorem

If L is a formal language, the following statements are equivalent:

- L is regular (i.e., describable by a regular expression)
- L is right-linear (i.e., generated by a right-linear grammar)
- L is FSA-acceptable (i.e., accepted by a finite state automaton)

#### Proof idea:

- every regular language is right-linear
- every right-linear language is FSA-acceptable
- every FSA-acceptable language is regular

# Proof: Every regular language is right-linear

$$\Sigma = \{a_1, \ldots, a_n\}$$

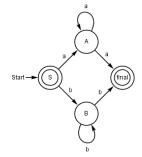
- **1**  $L(\emptyset)$  is generated by  $(\{S\}, \Sigma, S, \{\})$ ,
- ②  $L(\epsilon)$  is generated by  $(\{S\}, \Sigma, S, \{S \to \epsilon\})$ ,
- **3**  $L(a_i)$  is generated by  $(\{S\}, \Sigma, S, \{S \rightarrow a_i\})$ ,
- **①** If  $L(r_1)$ ,  $L(r_2)$  are regular languages described by  $r_1$ ,  $r_2$  with generating right-linear grammars  $(N_1, T_1, S_1, P_1)$ ,  $(N_2, T_2, S_2, P_2)$ , then  $L(r_1|r_2)$  is generated by  $(N_1 \uplus N_2, T_1 \cup T_2, S, P_1 \cup_{\uplus} P_2 \cup \{S \to S_1, S \to S_2\})$ ,
- **③**  $L(r_1r_2)$  is generated by  $(N_1 \uplus N_2, T_1 \cup T_2, S_1, P'_1 \cup_{\uplus} P_2)$   $(P'_1 \text{ is obtained from } P_1 \text{ if all rules of the form } A → b (b ∈ T) \text{ are replaced by } A → bS_2),$
- **1**  $L(r_1^*)$  is generated by  $(N_1, \Sigma, S, P_1' \cup \{S \to \epsilon, S \to S_1\})$  ( $P_1'$  is obtained from  $P_1$  if for all rules of the form  $A \to b$  ( $b \in T$ ) we add a rule  $A \to bS_1$ ).

# Proof: Every right-linear language is FSA-acceptable

If G=(N,T,S,R) is a right-linear grammar then the nondetFSA  $M=(N\cup\{\text{final}\},T,\Delta,S,F)$  with

- $F = \{\text{final}, S\} \text{ if } S \rightarrow \epsilon \in R \text{ or else } F = \{\text{final}\}.$
- $(A, a, B) \in \Delta$ , if  $A \to aB \in R$  and  $(A, a, \text{final}) \in \Delta$  if  $A \to a \in R$ . accepts L(G) = L(M).

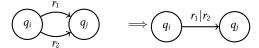
 $S \rightarrow aA, S \rightarrow bB, S \rightarrow \epsilon, A \rightarrow aA, A \rightarrow a, B \rightarrow bB, B \rightarrow b$ 



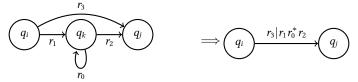
# Every FSA-acceptable language is regular

Let  $M = (Q, \Sigma, \Delta, q_0, F)$  be a nondetFSA.

- **①** Construct an equivalent automaton M' with only one final state and no incoming transitions at the start state:  $M = (Q \cup \{q_s, q_f\}, \Sigma, \Delta', q_s, \{q_f\})$  with  $\Delta' = \Delta \cup \{(q_s, \epsilon, q_0)\} \cup \{(q_i, \epsilon, q_f | q_i \in F\}.$
- **②** For each pair of states  $(q_i, q_j)$  replace all  $(q_i, r_1, q_j) \in \Delta', (q_i, r_2, q_j) \in \Delta', \ldots$  by a single transition  $(q_i, r_1 | r_2 | \ldots, q_j)$ .



**3** As long as there is still a state  $q_k \notin \{q_s, q_f\}$  eliminate  $q_k$  by the following rule:

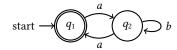


(Be careful, this last rule only illustrates the rough idea. To do it proper, you have to control the order in which you remove the states.)

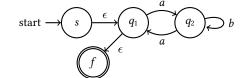
Finally the automaton consists only of the two states  $q_s$  and  $q_f$  and one single

# Example

starting with the FSA:



adding  $\epsilon$ -transitions:



• eliminating  $q_1$ :

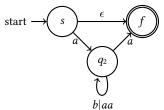
$$ightharpoonup s \xrightarrow{a} q_2$$

$$s \xrightarrow{\epsilon} f$$

$$q_2 \xrightarrow{a} f$$

$$q_2 \xrightarrow{u} f$$

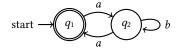
$$q_2 \xrightarrow{b|aa} q_2$$



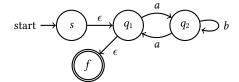
 $\epsilon |a(b|aa)^*a$ start

# Example

• starting with the FSA:

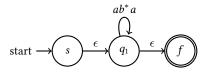


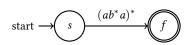
• adding  $\epsilon$ -transitions:



• eliminating  $q_2$ :

$$q_1 \xrightarrow{ab^*a} q_1$$





### Intuitive rules for regular languages

- L is regular if it is possible to check the membership of a word simply by reading it symbol by symbol while using only a finite stack.
- Finite-state automatons are too weak for:
  - unlimited counting in  $\mathbb{N}$  ("same number as");
  - recognizing a pattern of arbitrary length ("palindrome");
  - expressions with brackets of arbitrary depth.

## Closure properties of regular languages

A language class is closed under an operation if its application to arbitrary languages of this class results in a language of this class.

	Type3	Type2	Type1	Type0
union	+ 🗸	+	+	+
intersection	+	-	+	+
complement	+	-	+	-
concatenation	+ 🗸	+	+	+
Kleene's star	+ 🗸	+	+	+
intersection with a regular language	+	+	+	+

complement: construct complementary DFSA

intersection: implied by de Morgan