

## Summary last week

- function  $f : \mathbb{N} \rightarrow \mathbb{N}$  **computable** if exists **effective procedure** computing  $f(x)$  on  $x$
- **effective procedure** for  $f$  if exists TM  $M$  that leaves output  $f(x)$  on tape on input  $x$ ;
- **equivalently** defined via other **models of computation**:  $\mu$ -recursion,  $\lambda$ -calculus, . . .
- language  $L$  **recursive(ly enumerable)** if exists (total) TM  $M$  **accepting**  $L$  ( $L = L(M)$ )
- property  $P$  **(semi-)decidable** if  $\{x \mid P(x)\}$  is recursive(ly enumerable)

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- language  $L$  **recursive(ly enumerable)** if exists (total) TM  $M$  **accepting**  $L$  ( $L = L(M)$ )
- property  $P$  **(semi-)decidable** if  $\{x \mid P(x)\}$  is recursive(ly enumerable)
- TM **encoded** by some  $x \in \{0, 1\}^*$  (program as bit-string)  $\Rightarrow$  **countably** many TMs
- **uncountably** many functions  $\mathbb{N} \rightarrow \mathbb{N} \Rightarrow$  some (most) functions **not** computable
- exist TM  $U$  that is **universal**:  $U$  on  $x\#y$  simulates TM  $M_x$  (TM having code  $x$ ) on  $y$
- **diagonal**  $d$  is behaviour exhibited when running  $M_x$  on  $x$  (itself) for each input  $x$
- **complement**  $cd$  of  $d$  **distinct** from all TM behaviours  $\Rightarrow$  not a TM behaviour
- **halting** problem  $HP := \{M\#x \mid M \text{ halts for input } x\}$  not recursive
- if  $L$  and  $\sim L$  recursively enumerable, then (both) recursive

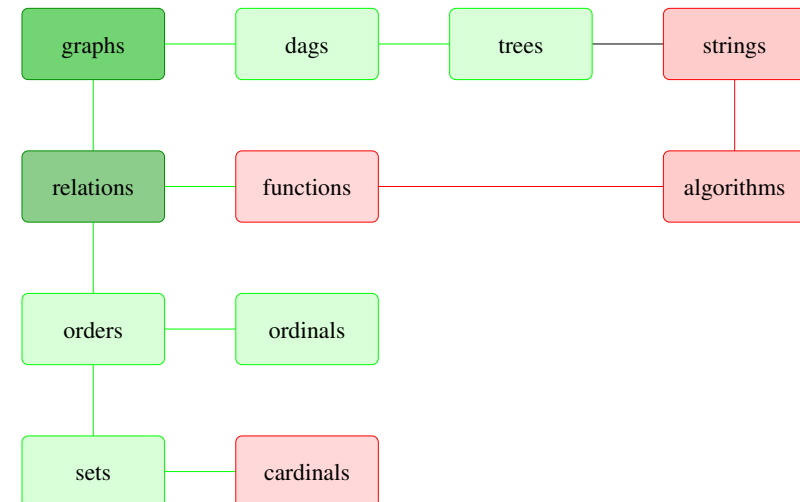
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## Course themes

- **directed** and undirected **graphs**
- **relations** and **functions**
- **orders** and **induction**
- **trees** and **dags**
- **finite** and **infinite** counting
- **elementary** number theory
- **Turing machines**, **algorithms**, and **complexity**
- **decidable** and **undecidable** problem

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## Discrete structures



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## Recursive/recursively enumerable languages

### Definition

A language  $L$  (or, more generally, a set) is

- **recursively** enumerable, if there exists a TM  $M$  such that  $L = L(M)$   
i.e.  $L$  is the set of strings **accepted** by  $M$
- **recursive**, if there exists a **total** TM  $M$ , such that  $L = L(M)$   
i.e.  $M$  is required to **halt** (accept or reject) on all strings

### Theorem

- every recursive set is recursively enumerable;
- if a set and its complement are recursively enumerable, they are recursive;

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## A non-recursive language HP (recapitulation)

### Definition (Halting Problem)

$HP := \{M\#x \mid M \text{ halts on input } x\}$

### Theorem

HP is not recursive

### Definition

**behaviour** is a map from input words  $x \in \{0, 1\}^*$  to either ! (halts) or  $\circ$  (loops).

### Proof of Theorem.

Suppose HP were recursive, i.e. there is a **total** TM  $K$  such that  $L(K) = HP$ .

- 1 there is a behaviour  $cd$  **not exhibited** by any TM;
- 2 using  $K$  we could construct a TM  $CD$  **exhibiting** behaviour  $cd$ .

Contradiction, so HP is not recursive.

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### (1) there is a behaviour $cd$ not exhibited by any TM

### Proof.

Enumerating **all** TMs as  $M_\epsilon, M_0, M_1, M_{00}, \dots$ , their behaviours can be depicted as:

	$\epsilon$	0	1	00	01	10	11	000	001	010	...
$M_\epsilon$	!	$\circ$	$\circ$	!	!	$\circ$	!	$\circ$	!	!	
$M_0$	$\circ$	$\circ$	!	!	$\circ$	!	!	$\circ$	$\circ$	!	
$M_1$	$\circ$	!	$\circ$	!	$\circ$	!	!	$\circ$	$\circ$	!	
$M_{00}$	!	$\circ$	$\circ$	!	!	!	!	$\circ$	$\circ$	!	
$M_{01}$	!	!	!	!	$\circ$	$\circ$	$\circ$	!	!	$\circ$	...
$M_{10}$	!	!	$\circ$	!	!	$\circ$	!	!	$\circ$	!	
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6

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$M_0$	$\circ$	$\circ$	!	!	$\circ$	!	!	$\circ$	$\circ$	!	
$M_1$	$\circ$	!	$\circ$	!	$\circ$	!	!	$\circ$	$\circ$	!	
$M_{00}$	!	$\circ$	$\circ$	!	!	!	!	$\circ$	$\circ$	!	
$M_{01}$	!	!	!	!	$\circ$	$\circ$	$\circ$	!	!	$\circ$	...
$M_{10}$	!	!	$\circ$	!	!	$\circ$	!	!	$\circ$	!	
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**diagonal** behaviour  $d = ! \circ \circ ! \circ \circ \dots$

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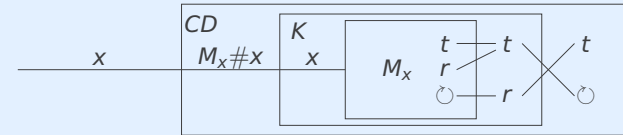
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$M_1$	○	!	!	!	○	!	!	○	○	!	
$M_{00}$	!	○	○	○	!	!	!	○	○	!	
$M_{01}$	!	!	!	!	!	○	○	!	!	○	...
$M_{10}$	!	!	○	!	!	!	!	!	○	!	
⋮						⋮					⋮

complement diagonal  $cd = \text{○ ! ! ○ ! !} \dots$  not exhibited by any TM

**(2) using  $K$  we could construct a TM  $CD$  exhibiting behaviour  $cd$**

**Proof.**

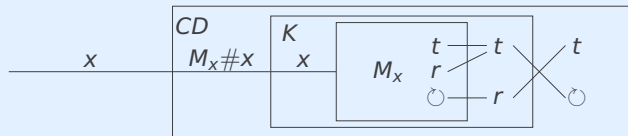
Suppose  $K$  were a total TM  $K$  such that  $L(K) = \text{HP}$ . Construct  $CD$ :



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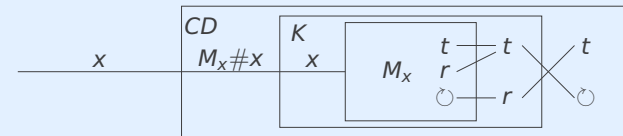
in words:

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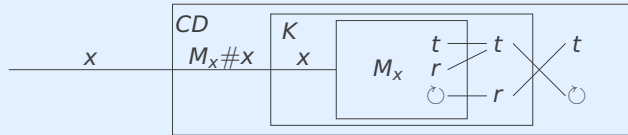
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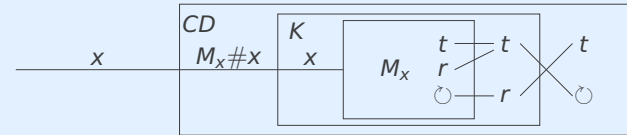
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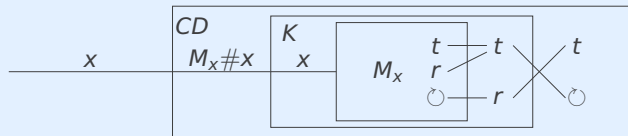
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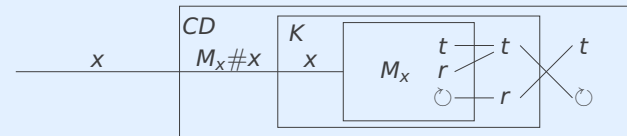
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$M_x$  halts/loops on  $x$  iff  $K$  accepts/rejects  $M_x\#x$  iff  $CD$  loops/halts on  $x$

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$M_x$  halts/loops on  $x$  iff  $K$  accepts/rejects  $M_x\#x$  iff  $CD$  loops/halts on  $x$   
 $CD$  exhibits behaviour  $cd$

## Complements

### Lemma

if  $L$  recursive, then so is  $\sim L$

### Proof.

If  $L = L(M)$  for total TM  $M$ , then  $\sim L = L(M')$  for  $M'$  as  $M$  but swapping accept, reject ■

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### Theorem

$\sim$ HP is not recursively enumerable (although HP is)

### Proof.

Suppose  $\sim$ HP were recursively enumerable.

- then both HP (previous lecture) and  $\sim$ HP would be recursively enumerable;
- so both HP and  $\sim$ HP would in fact be recursive (previous lecture);
- but that would contradict that HP is not recursive (previous lecture).

So  $\sim$ HP is not recursively enumerable. ■

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## Closure properties of recursively enumerable languages

### Theorem

recursively enumerable languages are closed under union and intersection, but not under complement or difference

### Proof.

- if  $L_1 = L(M_1)$ ,  $L_2 = L(M_2)$ , running both  $M_1$ ,  $M_2$  on a given input  $x$ , and accepting if at least one/both of them accepts, shows closure under union/intersection.

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- closure under complement fails as shown by the previous theorem. in particular,  $\sim$ HP is not r.e., although HP is. from this it follows that closure under difference fails since  $\sim$ HP =  $\{0, 1\}^* -$  HP and  $\{0, 1\}^*$  is trivially r.e. ■

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### Corollary

recursive languages are closed under union, intersection, complement, and difference

by above closure properties and using De Morgan;  $\sim(L_1 \cup L_2) = (\sim L_1) \cap (\sim L_2)$  <sup>9</sup>

### (1) there is a language $cd$ not accepted by any TM

### Proof.

Enumerating all TMs as  $M_\epsilon, M_0, M_1, M_{00}, \dots$ , their languages can be depicted as:

	$\epsilon$	0	1	00	01	10	11	000	001	010	...
$M_\epsilon$	x	x	x	✓	✓	x	x	x	x	✓	
$M_0$	x	x	✓	✓	x	✓	✓	x	x	✓	
$M_1$	x	x	x	✓	x	x	✓	x	x	✓	
$M_{00}$	✓	x	x	✓	✓	✓	✓	x	x	✓	
$M_{01}$	x	✓	x	✓	x	x	x	✓	✓	x	...
$M_{10}$	✓	✓	x	✓	x	x	x	x	x	x	
$\vdots$						$\vdots$					$\ddots$

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## Another non-recursive language MP

### Definition (Membership Problem)

$\text{MP} := \{M\#x \mid M \text{ accepts input } x\}$

### Theorem

MP is not recursive

### Proof.

Suppose MP were recursive, i.e. there is a total TM  $K$  such that  $L(K) = \text{MP}$ .

- 1 there is a language  $cd$  not accepted by any TM;
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Contradiction, so MP is not recursive. ■

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$M_{01}$	x	✓	x	✓	x	x	x	✓	✓	x	...
$M_{10}$	✓	✓	x	✓	x	x	x	x	x	x	
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diagonal language  $d = \{00, \dots\}$  ■

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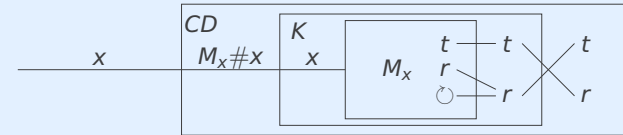
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complement diagonal  $cd = \{\epsilon, 0, 1, 01, 10, 11, \dots\}$  not accepted by any TM

**(2) using  $K$  we could construct a TM  $CD$  accepting  $cd$**

**Proof.**

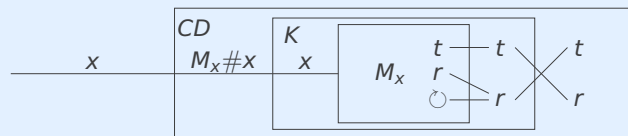
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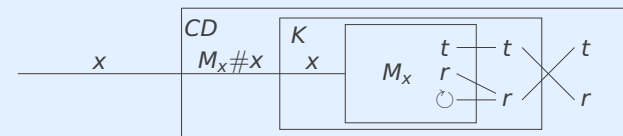
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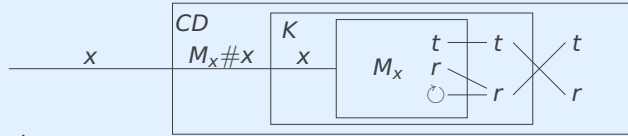
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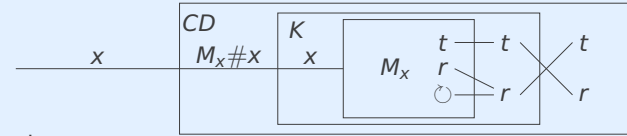
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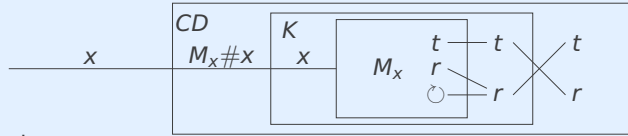
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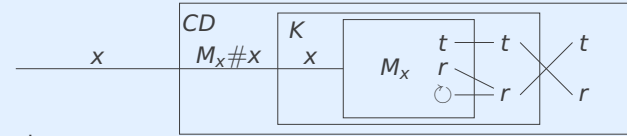
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$M_x$  accepts/does not accept  $x$  iff  $K$  accepts/rejects  $M_x\#x$  iff  $CD$  rejects/accepts  $x$

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 $CD$  accepts  $cd$



## Border between in/outside of language

### Remark

- language  $L$  being recursively enumerable (recursive) depends on its **border**
- how 'difficult' it is to decide that string  $x$  is in  $L$  (and not in  $L$ )
- does **not** depend on **cardinality** of  $L$
- but note every **finite** language recursive (finite case-distinction)

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### Example

for  $A$  set of all strings over alphabet  $\supseteq \{0, 1, \#\}$

- $\emptyset \subseteq HP \subseteq A$

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for  $A$  set of all strings over alphabet  $\supseteq \{0, 1, \#\}$

- $\emptyset \subseteq HP \subseteq A$
- although both  $\emptyset, A$  recursive,  $HP$  is not recursive

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## Border between in/outside of language

### Remark

- language  $L$  being recursively enumerable (recursive) depends on its **border**
- how 'difficult' it is to decide that string  $x$  is in  $L$  (and not in  $L$ )
- does **not** depend on **cardinality** of  $L$
- but note every **finite** language recursive

### Example

for  $A$  set of all strings over alphabet  $\supseteq \{0, 1, \#\}$

- $\emptyset \subseteq HP \subseteq A$
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- sub/superset of recursive or recursively enumerable language need not be so

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- although both  $\emptyset, A$  recursive, HP is not recursive
- sub/superset of recursive or recursively enumerable language need not be so
- may have  $L_0 \subset L_1 \subset L_2 \subset L_3 \subset \dots$  such that  $L_{2i}$  recursive,  $L_{2i+1}$  not recursive

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## Relating non-recursiveness of HP and MP

### similarity between proofs

suppose  $L = L(K)$  for some total TM  $K$

- determine  $cd$  **distinct** from  $L(M)$  for **every** TM  $M$  by **diagonalising away**
- show that **using**  $K$  we could construct TM  $CD$  with  $L(CD) = cd$

so supposition must be false

avoid redoing diagonalisation?

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- say: **reduce**  $L$  to  $L'$  (reduction **from**  $L$  to  $L'$ )

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- $L$  is **not more complex** than  $L'$  (may be strictly less so; may be **simpler** subroutine)

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- determine  $cd$  **distinct** from  $L(M)$  for **every** TM  $M$  by **diagonalising away**
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- if  $L$  **not** recursive and  $L \leq L'$ , then  $L'$  **not** recursive

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## Formal definition of reduction

### Definition (recall from before)

$f: \Sigma^* \rightarrow \Sigma^*$  is **computable** if  $\exists$  a total TM  $T$  with input alphabet  $\Sigma$ , such that on input  $x \in \Sigma^*$ ,  $T$  writes  $f(x)$  on the tape

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### Theorem

*if  $L$  not recursive and  $L \leq L'$ , then  $L'$  is not recursive*

### Proof.

supposing  $L \leq L'$  by function  $f$  by TM  $T$  and  $L'$  **were recursive** by total TM  $K$ , then  $x \in L$  iff  $f(x) \in L'$  iff  $K$  accepts  $f(x)$ . that is,  $L$  is recursive using TM that first transforms  $x$  into  $f(x)$  by running  $T$  and then runs  $K$  on  $f(x)$ . contradiction. so  $L'$  is not recursive. 15 ■

## Reducing HP to MP ?

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### Definition

$f(M\#x) = M'\#x$  where  $M'$  is obtained from  $M$  by changing reject into accept

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### Lemma

$M\#x \in \text{HP}$  iff  $f(M\#x) \in \text{MP}$

### Proof.

$M\#x \in \text{HP} \Rightarrow M$  halts on  $x \Rightarrow M'$  accepts  $x \Rightarrow M'\#x \in \text{MP}$

$M\#x \notin \text{HP} \Rightarrow M$  does not halt on  $x \Rightarrow M'$  does not halt on  $x \Rightarrow M'\#x \notin \text{MP}$  ■

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### Corollary

MP is not recursive

### Proof.

since HP is not recursive (assumed known) and  $\text{HP} \leq \text{MP}$

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## More on reducibility

### Theorem

$\leq$  is reflexive and transitive

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### Proof.

- to show reflexivity, take  $f(x) = x$  (the identity function)

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### Theorem

$\leq$  is reflexive and transitive

### Proof.

- to show reflexivity, take  $f(x) = x$
- to show transitivity, compose the functions (run the TMs consecutively) ■

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### Lemma

there is no program testing whether a given program is a “hello world”-program (prints “hello world” and then accepts)

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- to show transitivity, compose the functions ■

### Lemma

there is no program testing whether a given program is a “hello world”-program

### Proof.

show  $HP \leq$  “hello world”-program. let  $f(M\#x)$  be  $M'\#x$  with  $M'$  a TM that first runs  $M$  on its input, if that halts overwrites tape with “hello world” and then accepts:  
 $M\#x \in HP \Rightarrow M$  halts on  $x \Rightarrow M'$  is a “hello world”-program  
 $M\#x \notin HP \Rightarrow M$  does not halt on  $x \Rightarrow M'$  is not a “hello world”-program ■

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## Regular languages

### Question

What languages can be accepted for machines more restricted than TMs?

### Regular languages

We consider **finite automata**. These accept **regular** languages, and will show these are recursive, but not necessarily the other way around,

### relevance of regular languages

- software for designing and testing of **digital circuits**
- software components of compiler, e.g. for **lexical analysis**:
- software for **searching** in long texts
- software to **verify** all kinds of systems having a finite number of states
- components of computer games (**computer-controlled** non-player-character)

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## Deterministic finite automata (DFAs)

### Example

$\emptyset$  and the set of all strings are regular, as are all **finite** languages.

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### Definition

A **DFA** is a 5-tuple  $A = (Q, \Sigma, \delta, s, F)$  with

- 1  $Q$  a finite set of **states**
- 2  $\Sigma$  a finite set of **input** symbols, ( $\Sigma$  is called the **input** alphabet)
- 3  $\delta: Q \times \Sigma \rightarrow Q$  the **transition** function
- 4  $s \in Q$ , the **start** or **initial** state
- 5  $F \subseteq Q$  a finite set of **accepting** or **final** states

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Beware:  $\delta$  must be defined, for all possible inputs

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### Transition table

	$a_1 \in \Sigma$	$a_2 \in \Sigma$	$\dots$
$q_1 \in Q$	$\delta(q_1, a_1)$	$\delta(q_1, a_2)$	$\dots$
$q_2 \in Q$	$\delta(q_2, a_1)$		
$\vdots$	$\vdots$		

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$\vdots$	$\vdots$		

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### Transition graph

For a DFA  $A = (Q, \Sigma, \delta, s, F)$ , its (directed) **transition graph** with initial state  $d$  and final states  $F$  where:

- 1 the states are the nodes
- 2 the edges  $E$  are

$$(p, q) \quad p, q \in Q \text{ and } \exists a \in \Sigma \text{ with } \delta(p, a) = q$$

- 3 the edges are labelled by symbols by a function  $b: E \rightarrow \Sigma$  defined by

$$(p, q) \mapsto a \quad \text{if } \delta(p, a) = q$$

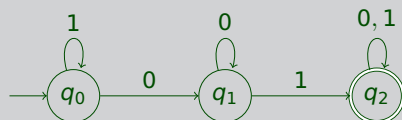
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### Example

The DFA  $A = (\{q_0, q_1, q_2\}, \{0, 1\}, \delta, q_0, \{q_2\})$  with transition table

	0	1
$\rightarrow q_0$	$q_1$	$q_0$
$q_1$	$q_1$	$q_2$
$*q_2$	$q_2$	$q_2$

has the following transition graph:



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### Definition (extending the transition function)

Let  $\delta$  be a transition function. The **extended** transition function  $\hat{\delta}: Q \times \Sigma^* \rightarrow Q$  is inductively defined by:

$$\begin{aligned} \hat{\delta}(q, \epsilon) &:= q \\ \hat{\delta}(q, xa) &:= \delta(\hat{\delta}(q, x), a) \end{aligned} \quad x \in \Sigma^*, a \in \Sigma$$

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Let  $A = (Q, \Sigma, \delta, q_0, F)$  be a DFA; the **language**  $L(A)$  **accepted** by  $A$  is:

$$L(A) := \{x \in \Sigma^* \mid \hat{\delta}(q_0, x) \in F\}$$

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For the DFA  $A$  above,  $\hat{\delta}(q_0, 0010) = q_2$

$\hat{\delta}(q_0, 0010)$  is computed recursively as follows:

- $\hat{\delta}(q_0, 0010) = \delta(\hat{\delta}(q_0, 001), 0) = \delta(q_2, 0) = q_2$
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### Example

For the DFA  $A$ , we have  $L(A) = \{x01y \mid x, y \in \Sigma^*\}$ . The language  $L(A)$  is the set of all words in which 01 occurs somewhere (or rather of words not of the form: a number of 1s followed by a number of 0s)

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### Definition

A formal language  $L$  is **regular**, if  $\exists$  DFA  $A$ , such that  $L(A) = L$