

# INF2080

## Repetition

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Department of  
Informatics



University of  
Oslo

# Today

- wrap-up of last week Friday
- repetition of course so far

## Wrap-up: Reducibility

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- The mathematician reduces the current problem ("boil water after a night camping") to a problem with a known solution. The mathematician (1) brings the pot back to the car, (2) goes back to camp. Thus the problem has been reduced to the problem solved the day before: how to get boiling water when the pot is in the car.

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We used this to show various decidability and undecidability results, e.g.,

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We formalized reducibility as follows:

### Definition

Language  $A$  is *mapping reducible* to language  $B$ , written  $A \leq_m B$ , if there exists a computable function  $f : \Sigma^* \rightarrow \Sigma^*$  such that for every  $w$

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Recall: a function  $f : \Sigma^* \rightarrow \Sigma^*$  is computable if there exists a Turing machine  $M$  that for every input  $w$  halts with just  $f(w)$  on its tape.

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By this definition:  $A \leq_m B \iff \bar{A} \leq_m \bar{B}$  (useful tool we will use soon).

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We can use this to show:

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*The language  $EQ_{TM} = \{\langle M_1, M_2 \rangle \mid M_1, M_2 \text{ are TMs with } L(M_1) = L(M_2)\}$  is neither Turing-recognizable nor co-Turing-recognizable.*

Proof: Let's show that  $EQ_{TM}$  is not Turing recognizable. We show a mapping reduction from  $\overline{A_{TM}}$ , i.e.,  $\overline{A_{TM}} \leq_m EQ_{TM}$ .

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$F =$  on input  $\langle M, w \rangle$ :

- 1 Construct the following two machines  $M_1$  and  $M_2$ :  
 $M_1$  : on any input, *reject*  
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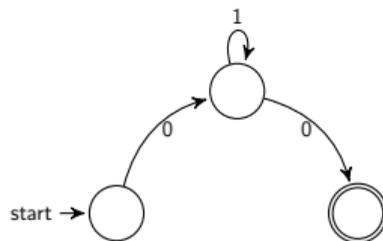
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- There exist languages that are neither recognizable nor co-recognizable, i.e., *no such computational model* can check membership or non-membership! (e.g.,  $\overline{EQ_{TM}}$ )

- Deterministic Finite Automata (DFA): an automata with a finite number of states where for every state and input there is precisely one transition leading to another state.

# Regular Languages

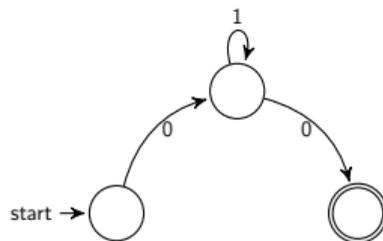
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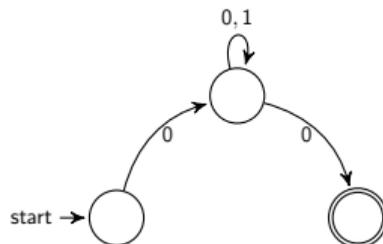
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- The set of inputs accepted by a DFA is called a *regular language*

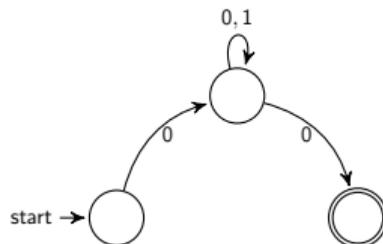
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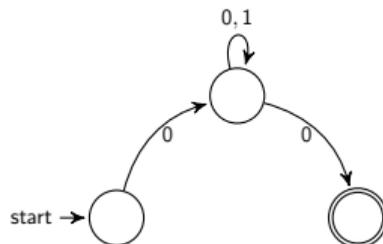
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- NFA's accept the same languages as DFA's, i.e., a language is regular iff an NFA accepts it
- proof idea: Given an NFA  $N$  with state set  $Q$ , we define a DFA  $D$  with state set  $P(Q)$ , where the state  $Q \in P(Q)$  in  $D$  represents that  $N$  could be in any state  $q \in Q$ .

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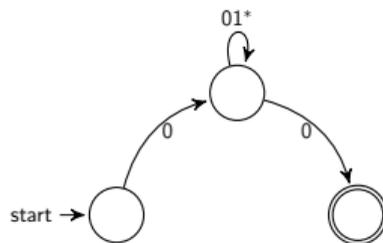
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- The expressivity of regular languages is precisely that of DFA/NFA. To show this, we introduced GNFA (generalized finite automata), NFA's with RE's as labels instead of symbols.

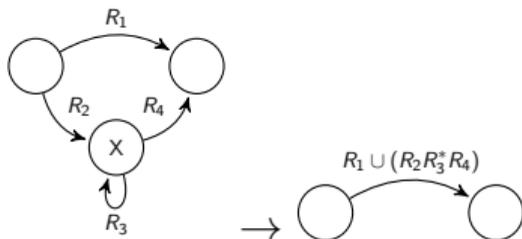


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## Lemma (Pumping Lemma)

*If  $A$  is a regular language, then there is a number  $p$ , called the pumping length, where if  $w$  is a word in  $A$  of length  $\geq p$  then  $w$  can be divided into three parts,  $w = xyz$ , such that*

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- Use the fact that regular languages only have finite memory

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*If  $A$  is a regular language, then there is a number  $p$ , called the pumping length, where if  $w$  is a word in  $A$  of length  $\geq p$  then  $w$  can be divided into three parts,  $w = xyz$ , such that*

- ❶  $xy^iz \in A$  for every  $i \geq 0$ ,
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- a language that is nonregular, yet every word can be pumped according to pumping lemma!  $\rightarrow$  sometimes other tools are required (see, e.g., oblig 2)

## Context-free languages

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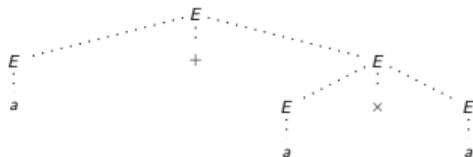
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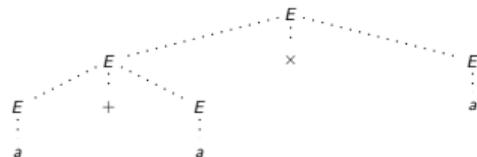
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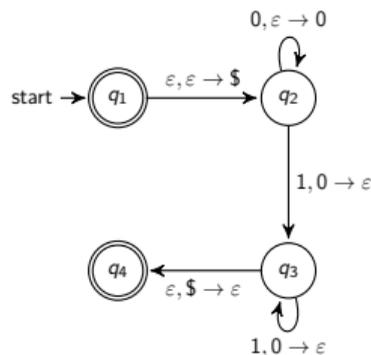
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- converting PDA to CFG: much more involved. General idea: For each pair of states  $p, q$  in PDA, add a variable  $A_{pq}$  to  $G$  that generates all strings that take the PDA from  $p$  to  $q$  with empty stacks (i.e., stack when arriving at  $p$  is equal to the stack when arriving at  $q$ ). Add certain rules according to transition function  $\delta$ .

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- So, CFG=PDA
- noteworthy: deterministic PDA (DPDA) is *not* equal to PDA, though we haven't covered this in the lecture

# Context-free languages

Every CFG can be rewritten into a grammar in Chomsky normal form:

## Definition

A grammar is in *Chomsky Normal Form* if every rule is of the form:

$$A \rightarrow BC$$

$$A \rightarrow a$$

where  $a$  is any terminal,  $A$  is any variable,  $B, C$  are any variables that are not the start variable. In addition the rule  $S \rightarrow \varepsilon$  is permitted.

# Pumping Lemma - CFL

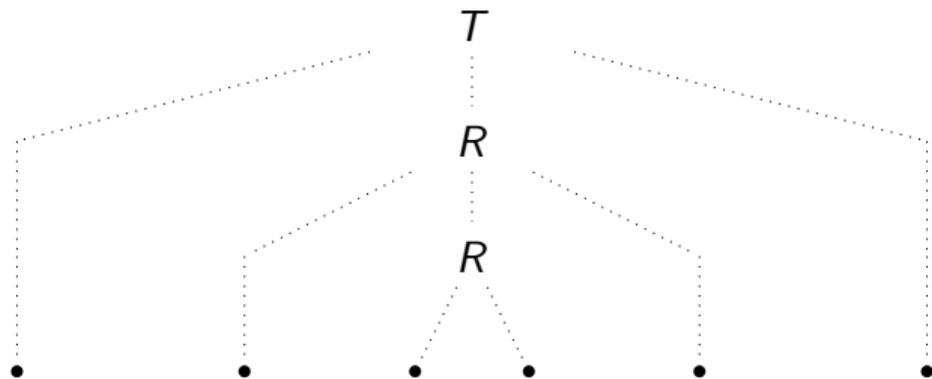
## Lemma (Pumping Lemma for CFLs)

*For every context-free language  $A$  there exists a number  $p$  (called the pumping length) where, if  $s$  is a word in  $A$  of length  $\geq p$ , then  $s$  can be divided into five parts,  $s = uvxyz$ , satisfying the following conditions:*

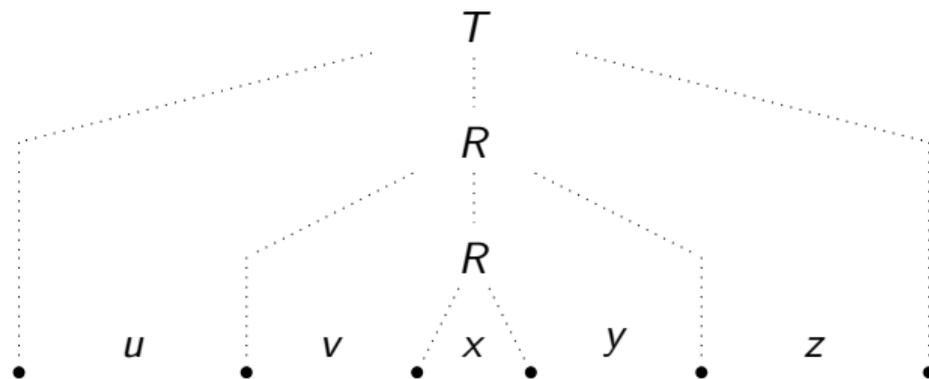
- 1  $uv^i xy^i z \in A$  for all  $i \geq 0$ ,
- 2  $|vy| > 0$ ,
- 3  $|vxy| \leq p$ .

- similar to RL, we exploit the limited memory of CFL's
- If a word is "long enough", the smallest parse tree will contain two occurrences of the same variable

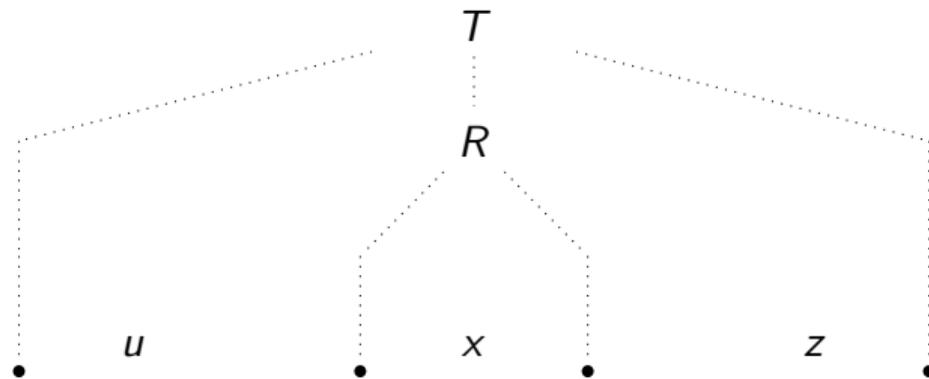
# Pumping Lemma - CFLs



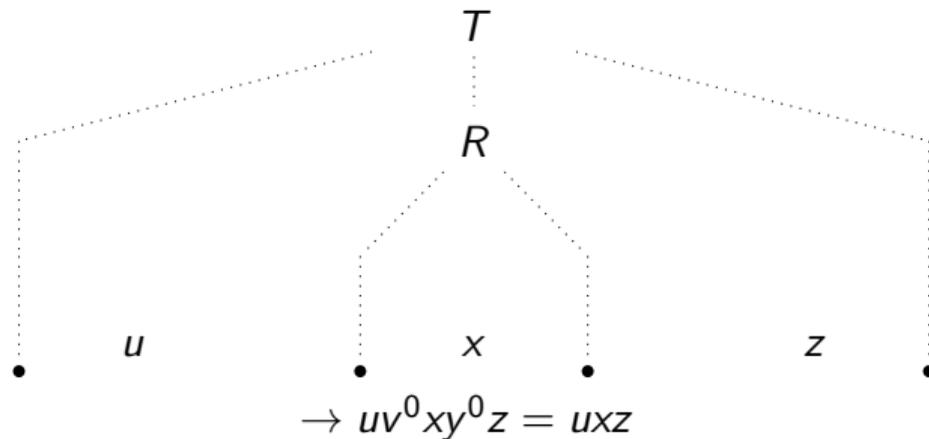
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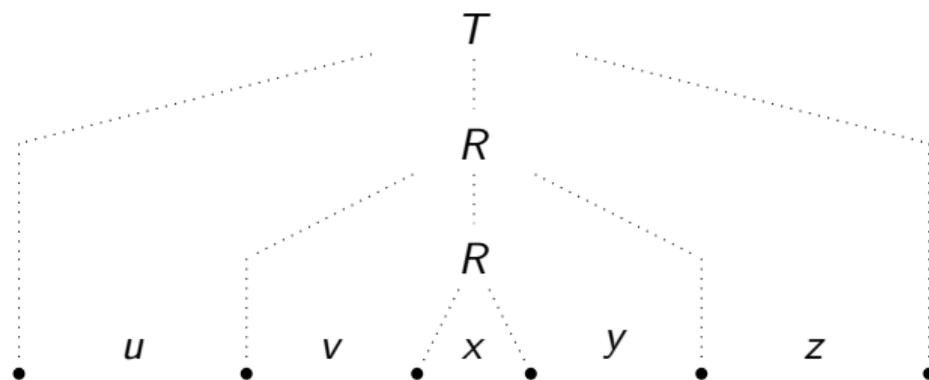
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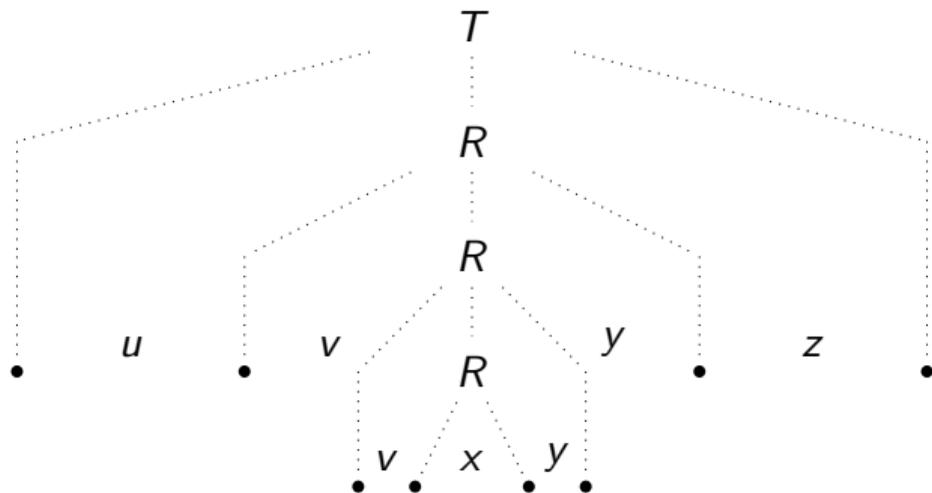
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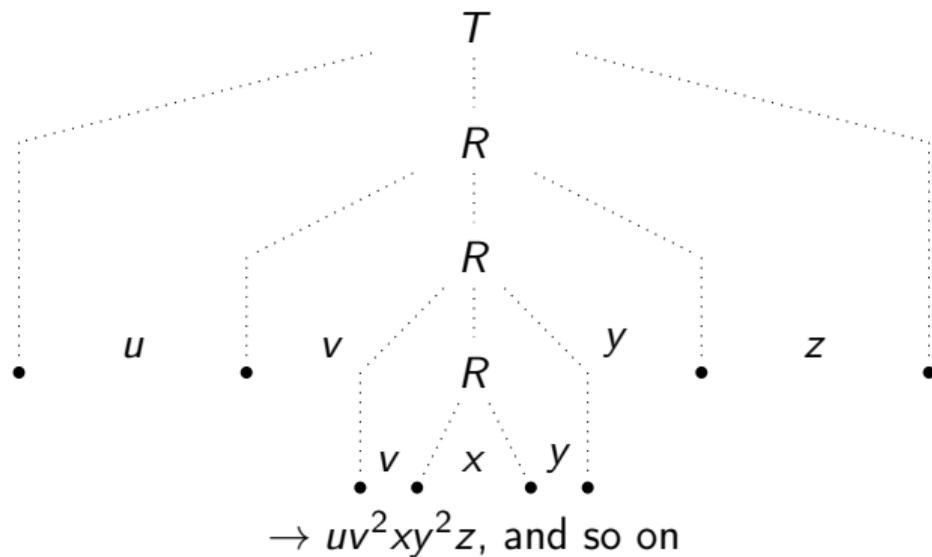


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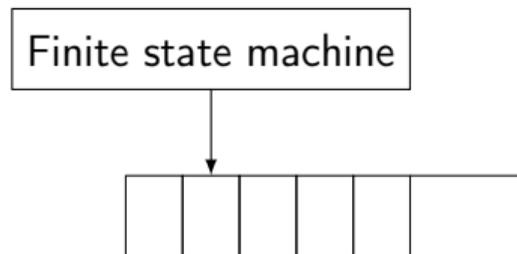
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## Pumping Lemma - CFLs

- Once again, useful tool for determining if a language is *not* context-free
- However, just like in the regular case, there exist languages that are not context-free that can be pumped. (analogous to the regular case)
- Thus, we have so far seen  $\{RL\} \subsetneq \{CFL\}$ , and that there exist non-context-free languages

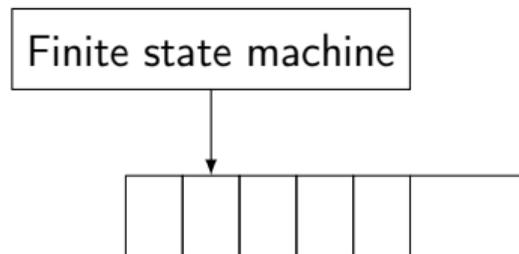
# Turing Machines

Defined Turing machines:



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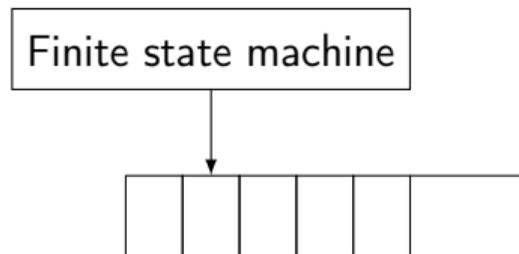
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- a finite state machine with access to an infinite tape

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- a finite state machine with access to an infinite tape
- modelled by having a read/write head that can move left or right over the tape

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- each of the computational models we had seen so far were special cases of Turing machines
- different description levels of Turing machines: high-level (“algorithmic” description, no fine-grained detail on tape operations), low-level (description of how the head operates on tape), implementation level (formal definition of the Turing machine)
- It is important to remember how high-level things can be implemented by tape manipulation, however formal definitions of Turing machines can be cumbersome

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DFA/PDA:

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TM:

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- unrestricted access to infinite memory

# Turing Machines

A language accepted by a Turing machine is called Turing-recognizable. If the machine halts on every input, then the language it recognizes is called decidable.

# Turing Machines

Have looked at Turing machine variants, seen that they are equivalent:

- the LRS Turing machine (the head can move left, right, or stay put)
- the multitape Turing machine (multiple tapes, multiple heads)
- the nondeterministic Turing machine
- the enumerator
- NFA with two stacks
- ...

*All* computational models with unlimited access to infinite memory that can perform finite work in one step are equivalent to a Turing machine!

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- Church Turing thesis: each intuitive definition of algorithms can be described by decidable Turing machines

# Decidability

Considered acceptance, emptiness, and equivalence problems for computational models, e.g.:

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We showed various decidability/undecidability results for languages:

	$x \in L$	$L = \emptyset$	$L = \Sigma^*$	$L = K$
regular	✓	✓	✓	✓
CFL	✓	✓	X	X
LBA	✓	X	X	X
decidable	✓	X	X	X
Turing-rec.	X	X	X	X

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→ decidability relates to more things than just Turing machines!

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We haven't gone through Type-1 (extra lecture at the end of the semester, if desired), however we have seen the computational model that accepts them: linear bounded automata (LBA) and seen that these are decidable.

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- ...but how hard are these problems? How can they be compared with one another
- related to reducibility, computable functions
- *highly* relevant for anything within computer science, be it crypto/security, programming, theoretical work (AI, databases)