

# Theory of Computer Science

## D3. Halting Problem and Reductions

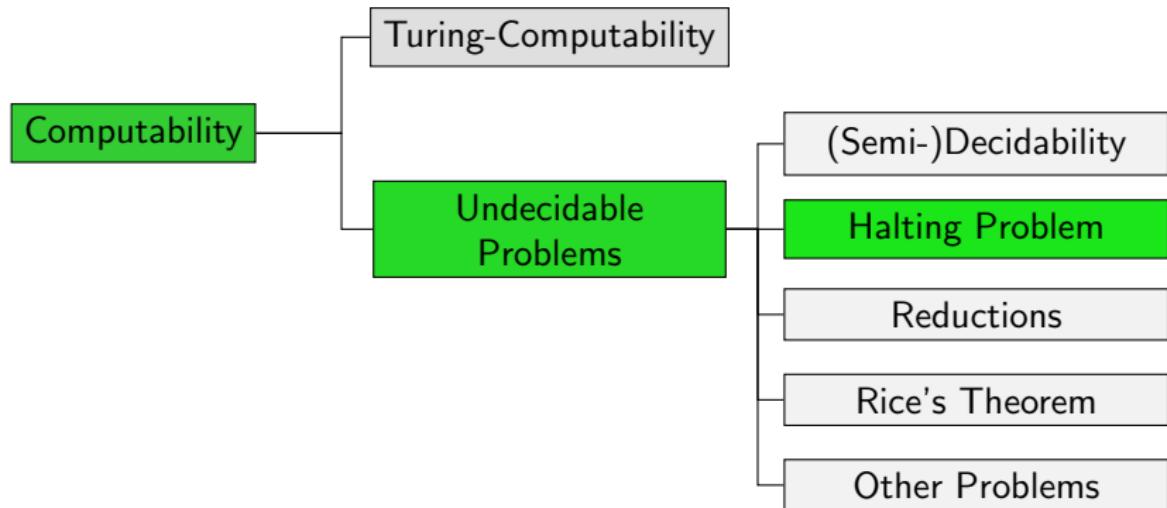
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## Introduction

# Overview: Computability Theory



# Undecidable Problems

- We now know many characterizations of semi-decidability and decidability.
- What's missing is a **concrete example** for an **undecidable** (= not decidable) problem.
- Do undecidable problems even exist?

# Undecidable Problems

- We now know many characterizations of semi-decidability and decidability.
- What's missing is a **concrete example** for an **undecidable** (= not decidable) problem.
- Do undecidable problems even exist?
- Yes! **Counting argument**: there are (for a fixed  $\Sigma$ ) as many **decision algorithms** (e.g., Turing machines) as numbers in  $\mathbb{N}_0$  but as many **languages** as numbers in  $\mathbb{R}$ .  
Since  $\mathbb{N}_0$  cannot be surjectively mapped to  $\mathbb{R}$ , languages with no decision algorithm exist.
- But this argument does not give us a **concrete** undecidable problem.  $\leadsto$  main goal of this chapter

# Turing Machines as Words

# Turing Machines as Inputs

- The first undecidable problems that we will get to know have Turing machines as their **input**.  
~~ “programs that have programs as input”: cf. compilers, interpreters, virtual machines, etc.
- We have to think about how we can encode **arbitrary Turing machines** as **words over a fixed alphabet**.
- We use the binary alphabet  $\Sigma = \{0, 1\}$ .
- As an intermediate step we first encode over the alphabet  $\Sigma' = \{0, 1, \#\}$ .

# Encoding a Turing Machine as a Word (1)

Step 1: encode a Turing machine as a word over  $\{0, 1, \#\}$

**Reminder:** Turing machine  $M = \langle Q, \Sigma, \Gamma, \delta, q_0, \square, E \rangle$

Idea:

- input alphabet  $\Sigma$  should always be  $\{0, 1\}$
- enumerate states in  $Q$  and symbols in  $\Gamma$  and consider them as numbers  $0, 1, 2, \dots$
- blank symbol always receives number 2
- start state always receives number 0

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Then it is sufficient to **only encode  $\delta$**  explicitly:

- $Q$ : all states mentioned in the encoding of  $\delta$
- $E$ : all states that never occur on a left-hand side of a  $\delta$ -rule
- $\Gamma = \{0, 1, \square, a_3, a_4, \dots, a_k\}$ , where  $k$  is the largest symbol number mentioned in the  $\delta$ -rules

## Encoding a Turing Machine as a Word (2)

encode the rules:

- Let  $\delta(q_i, a_j) = \langle q_{i'}, a_{j'}, D \rangle$  be a rule in  $\delta$ , where the indices  $i, i', j, j'$  correspond to the enumeration of states/symbols and  $D \in \{L, R, N\}$ .
- encode this rule as

$$w_{i,j,i',j',D} = \# \# \text{bin}(i) \# \text{bin}(j) \# \text{bin}(i') \# \text{bin}(j') \# \text{bin}(m),$$

$$\text{where } m = \begin{cases} 0 & \text{if } D = L \\ 1 & \text{if } D = R \\ 2 & \text{if } D = N \end{cases}$$

- For every rule in  $\delta$ , we obtain one such word.
- All of these words in sequence (in arbitrary order) encode the Turing machine.

## Encoding a Turing Machine as a Word (3)

Step 2: transform into word over  $\{0, 1\}$  with mapping

$$0 \mapsto 00$$

$$1 \mapsto 01$$

$$\# \mapsto 11$$

Turing machine can be reconstructed from its encoding.

How?

# Encoding a Turing Machine as a Word (4)

## Example (step 1)

$\delta(q_2, a_3) = \langle q_0, a_2, N \rangle$  becomes ##10#11#0#10#10

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**Note:** We can also consider the encoded word  
(uniquely; [why?](#)) as a **number** that enumerates this TM.

This is not important for the halting problem but in other contexts where we operate on numbers instead of words.

# Turing Machine Encoded by a Word

**goal:** function that maps any word in  $\{0, 1\}^*$  to a Turing machine

**problem:** not all words in  $\{0, 1\}^*$  are encodings of a Turing machine

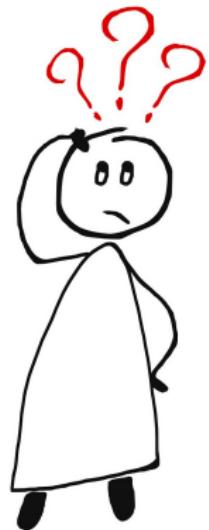
**solution:** Let  $\hat{M}$  be an arbitrary fixed deterministic Turing machine (for example one that always immediately stops). Then:

## Definition (Turing Machine Encoded by a Word)

For all  $w \in \{0, 1\}^*$ :

$$M_w = \begin{cases} M' & \text{if } w \text{ is the encoding of some DTM } M' \\ \hat{M} & \text{otherwise} \end{cases}$$

# Questions



Questions?

# Special Halting Problem

# Special Halting Problem

Our preparations are now done and we can define:

## Definition (Special Halting Problem)

The **special halting problem** or **self-application problem** is the language

$$K = \{w \in \{0, 1\}^* \mid M_w \text{ started on } w \text{ terminates}\}.$$

**German:** spezielles Halteproblem, Selbstanwendbarkeitsproblem

**Note:** word  $w$  plays two roles as encoding of the TM and as input for encoded machine

# Semi-Decidability of the Special Halting Problem

Theorem (Semi-Decidability of the Special Halting Problem)

*The special halting problem is semi-decidable.*

Proof.

We construct an “interpreter” for DTMs  
that receives the encoding of a DTM as input  $w$   
and simulates its computation on input  $w$ .

If the simulated DTM stops, the interpreter returns 1.  
Otherwise it does not return.

This interpreter computes  $\chi'_K$ .



**Note:** TMs simulating arbitrary TMs are called **universal** TMs.

**German:** universelle Turingmaschine

# Undecidability of the Special Halting Problem (1)

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**Proof by contradiction:** we assume that the special halting problem  $K$  were decidable and derive a contradiction.

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So assume  $K$  is decidable. Then  $\chi_K$  is computable (why?).

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## Theorem (Undecidability of the Special Halting Problem)

*The special halting problem is undecidable.*

### Proof.

**Proof by contradiction:** we assume that the special halting problem  $K$  were decidable and derive a contradiction.

So assume  $K$  is decidable. Then  $\chi_K$  is computable ([why?](#)).

Let  $M$  be a Turing machine that computes  $\chi_K$ , i. e.,  
given a word  $w$  writes 1 or 0 onto the tape  
(depending on whether  $w \in K$ ) and then stops.

...

# Undecidability of the Special Halting Problem (2)

Proof (continued).

Construct a new machine  $M'$  as follows:

- ① Execute  $M$  on the input  $w$ .
- ② If the tape content is 0: stop.
- ③ Otherwise: enter an endless loop.

## Undecidability of the Special Halting Problem (2)

Proof (continued).

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- ① Execute  $M$  on the input  $w$ .
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Let  $w'$  be the encoding of  $M'$ . **How will  $M'$  behave on input  $w'$ ?**

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iff  $w' \notin K$

iff  $M_{w'}$  run on  $w'$  does not stop

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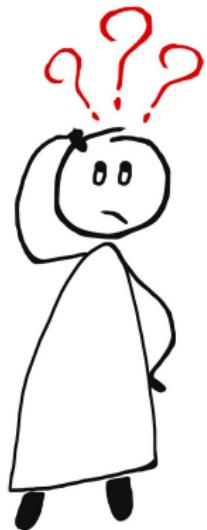
iff  $w' \notin K$

iff  $M_{w'}$  run on  $w'$  does not stop

iff  $M'$  run on  $w'$  does not stop

**Contradiction!** This proves the theorem. □

# Questions



Questions?

# Reprise: Type-0 Languages

[Back to Chapter C8: Closure Properties](#)

	Intersection	Union	Complement	Product	Star
Type 3	Yes	Yes	Yes	Yes	Yes
Type 2	No	Yes	No	Yes	Yes
Type 1	Yes <sup>(2)</sup>	Yes <sup>(1)</sup>	Yes <sup>(2)</sup>	Yes <sup>(1)</sup>	Yes <sup>(1)</sup>
Type 0	Yes <sup>(2)</sup>	Yes <sup>(1)</sup>	No <sup>(3)</sup>	Yes <sup>(1)</sup>	Yes <sup>(1)</sup>

## Proofs?

(1) proof via grammars, similar to context-free cases

(2) without proof

### (3) proof in later chapters (part D)

# Back to Chapter C8: Decidability

	Word problem	Emptiness problem	Equivalence problem	Intersection problem
Type 3	Yes	Yes	Yes	Yes
Type 2	Yes	Yes	No	No
Type 1	Yes <sup>(1)</sup>	No <sup>(3)</sup>	No <sup>(2)</sup>	No <sup>(2)</sup>
Type 0	No <sup>(4)</sup>	No <sup>(4)</sup>	No <sup>(4)</sup>	No <sup>(4)</sup>

Proofs?

(1) same argument we used for context-free languages

(2) because already undecidable for context-free languages

(3) without proof

(4) proofs in later chapters (part D)

# Answers to Old Questions

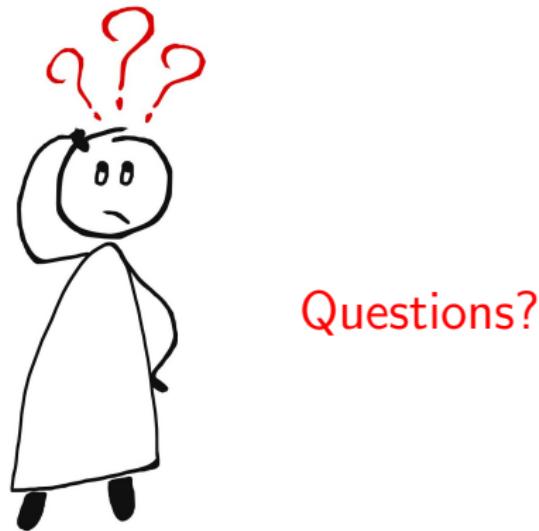
## Closure properties:

- $K$  is semi-decidable (and thus type 0) but not decidable.
- ~~  $\bar{K}$  is **not** semi-decidable, thus **not** type 0.
- ~~ Type-0 languages are **not** closed under complement.

## Decidability:

- $K$  is type 0 but not decidable.
- ~~ **word problem** for type-0 languages not decidable
- ~~ emptiness, equivalence, intersection problem: [later in exercises](#)  
(We are still missing some important results for this.)

# Questions



Introduction  
○○○

TMs as Words  
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Special Halting Problem  
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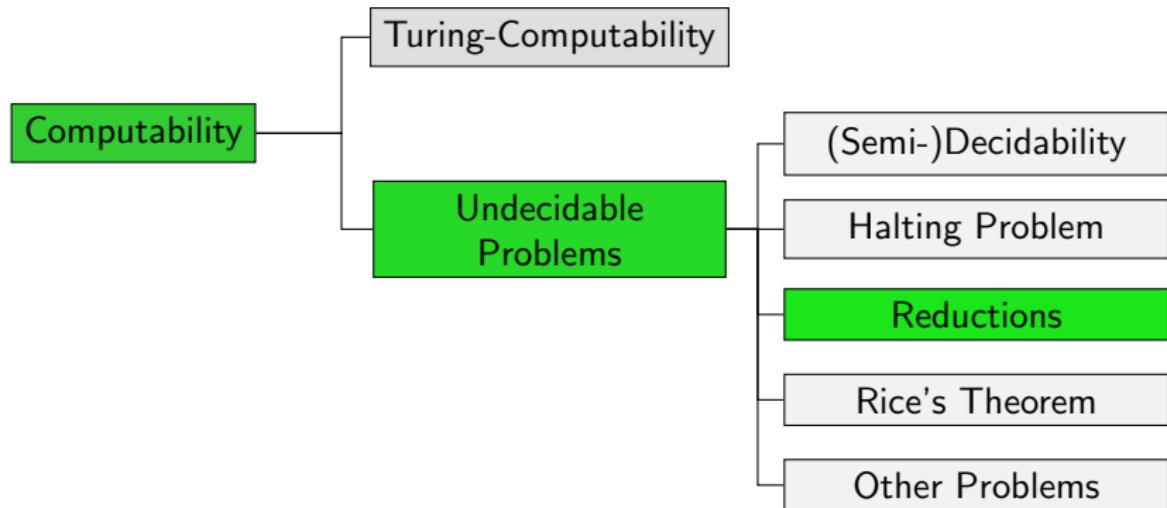
Type-0 Languages  
○○○○○

Reductions  
●○○○○○○○○

Summary  
○○

# Reductions

# Overview: Computability Theory



# What We Achieved So Far: Discussion

- We now know a concrete undecidable problem.
- But the problem is rather artificial:  
how often do we want to apply a program to itself?
- We will see that we can derive **further** (more useful)  
undecidability results from the undecidability  
of the special halting problem.
- The central notion for this is **reducing**  
a new problem to an already known problem.

# Reductions: Definition

## Definition (Reduction)

Let  $A \subseteq \Sigma^*$  and  $B \subseteq \Gamma^*$  be languages, and let  $f : \Sigma^* \rightarrow \Gamma^*$  be a total and computable function such that for all  $x \in \Sigma^*$ :

$$x \in A \quad \text{if and only if} \quad f(x) \in B.$$

Then we say that  $A$  can be **reduced to  $B$**  (in symbols:  $A \leq B$ ), and  $f$  is called **reduction from  $A$  to  $B$** .

**German:**  $A$  ist auf  $B$  reduzierbar, Reduktion von  $A$  auf  $B$

# Reduction Property

## Theorem (Reductions vs. Semi-Decidability/Decidability)

Let  $A$  and  $B$  be languages with  $A \leq B$ . Then:

- ① If  $B$  is decidable, then  $A$  is decidable.
- ② If  $B$  is semi-decidable, then  $A$  is semi-decidable.
- ③ If  $A$  is not decidable, then  $B$  is not decidable.
- ④ If  $A$  is not semi-decidable, then  $B$  is not semi-decidable.

~~ In the following, we use 3. to show undecidability for further problems.

# Reduction Property: Proof

## Proof.

for 1.: The following algorithm computes  $\chi_A(x)$  given input  $x$ :

```
y := f(x)
result :=  $\chi_B(y)$ 
RETURN result
```

# Reduction Property: Proof

## Proof.

for 1.: The following algorithm computes  $\chi_A(x)$  given input  $x$ :

```
y := f(x)
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for 2.: identical to (1), but use  $\chi'_B$  (instead of  $\chi_B$ )  
to compute  $\chi'_A$  (instead of  $\chi_A$ )

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for 2.: identical to (1), but use  $\chi'_B$  (instead of  $\chi_B$ )  
to compute  $\chi'_A$  (instead of  $\chi_A$ )

for 3./4.: contrapositives of 1./2.  $\rightsquigarrow$  logically equivalent



# Reductions are Preorders

## Theorem (Reductions are Preorders)

*The relation “ $\leq$ ” is a preorder:*

- ① For all languages  $A$ :

$A \leq A$  (reflexivity)

- ② For all languages  $A, B, C$ :

If  $A \leq B$  and  $B \leq C$ , then  $A \leq C$  (transitivity)

German: schwache Halbordnung/Quasiordnung, Reflexivitat, Transitivitat

# Reductions are Preorders: Proof

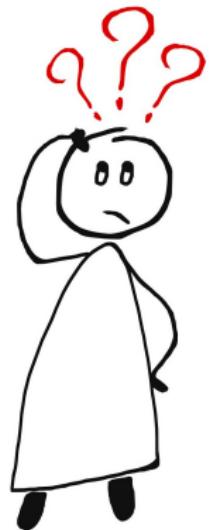
## Proof.

for 1.: The function  $f(x) = x$  is a reduction from  $A$  to  $A$  because it is total and computable and  $x \in A$  iff  $f(x) \in A$ .

for 2.:  $\rightsquigarrow$  exercises



# Questions



Questions?

# Summary

## Summary

- The **special halting problem** (self-application problem) is undecidable.
- However, it is semi-decidable.
- important concept in this chapter:  
Turing machines represented as **words**  
~~ Turing machines taking Turing machines as their input
- **reductions:** “embedding” a problem as a special case of another problem
- important method for proving undecidability:  
reduce from a known undecidable problem to a new problem