# Halting, Undecidability, and Maybe Some Complexity 

Lecture 9
Tuesday, September 22, 2020

## Quote

"Young man, in mathematics you don't understand things. You just get used to them." - John von Neumann.

Algorithms \& Models of Computation

## 9.1

Cantor's diagonalization argument

## You can not count the real numbers

```
I = (0, 1).
N}={1,2,3,\ldots}\mathrm{ the integer numbers
Claim (Cantor)
\(|\mathbb{N}| \neq|I|\)
```

Claim (Warm-up)
$|\mathbb{N}| \leq|I|$

## Proof

$|\mathbb{N}| \leq|I|$ exists a one-to-one mapping from $\mathbb{N}$ to $I$. One such mapping is $f(i)=1 / i$, which readily implies the claim.

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## You can not count the real numbers II

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\boldsymbol{I}=(0,1), \mathbb{N}=\{1,2,3, \ldots\}
$$

## Claim (Cantor)

$|\mathbb{N}| \neq|\boldsymbol{I}|$, where $\boldsymbol{I}=(0,1)$.

## Proof.

Write every number in $(0,1)$ in its decimal expansion. E.g.
$1 / 3=0.33333333333333333333$
Assume that $|\mathbb{N}|=|/|$. Then there exists a one-to-one mapping $f: \mathbb{N} \rightarrow /$. Let $\beta_{i}$ be the $i$ th digit of $f(i) \in(0,1)$
$\boldsymbol{d}_{\boldsymbol{i}}=$ any number in $\{0,1,2,3,4,5,6,7,8,9\} \backslash\left\{d_{i-1}, \beta_{i}\right\}$
$D=0 . d_{1} d_{2} d_{3} \ldots \in(0,1)$
$\boldsymbol{D}$ is a well defined unique number in $(0,1)$,
But there is no $\boldsymbol{j}$ such that $f(\boldsymbol{j})=\boldsymbol{D}$. A contradiction.

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The matrix...

|  | $\boldsymbol{f}(1)$ | $\boldsymbol{f}(2)$ | $\boldsymbol{f}(3)$ | $\boldsymbol{f}(4)$ | $\cdots$ |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | 1 | 1 | 0 | 0 | $\cdots$ |
| 2 | 0 | $\mathbf{1}$ | 0 | 1 | $\cdots$ |
| 3 | 1 | 0 | $\mathbf{1}$ | 1 | $\cdots$ |
| 4 | 0 | 1 | 0 | $\mathbf{0}$ | $\cdots$ |
| $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ | $\ddots$ |

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|  | $\boldsymbol{f}(1)$ | $\boldsymbol{f}(2)$ | $\boldsymbol{f}(3)$ | $\boldsymbol{f}(4)$ | $\cdots$ |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | $\boldsymbol{\beta}_{1}=1$ | 1 | 0 | 0 | $\cdots$ |
| 2 | 0 | $\boldsymbol{\beta}_{2}=\mathbf{1}$ | 0 | 1 | $\ldots$ |
| 3 | 1 | 0 | $\boldsymbol{\beta}_{3}=\mathbf{1}$ | 1 | $\ldots$ |
| 4 | 0 | 1 | 0 | $\boldsymbol{\beta}_{4}=\mathbf{0}$ | $\ldots$ |
| $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ | $\ddots$ |

$$
\boldsymbol{d}_{\boldsymbol{i}}=\text { any number in }\{0,1,2,3,4,5,6,7,8,9\} \backslash\left\{\boldsymbol{d}_{\boldsymbol{i}-1}, \boldsymbol{\beta}_{\boldsymbol{i}}\right\}
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| :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | 1 | 1 | 0 | 0 | $\ldots$ |
| 2 | 0 | $\mathbf{1}$ | 0 | 1 | $\ldots$ |
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| 4 | 0 | 1 | 0 | $\mathbf{0}$ | $\ldots$ |
| $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ | $\ddots$ |

$d_{i}=$ any number in $\{0,1,2,3,4,5,6,7,8,9\} \backslash\left\{\boldsymbol{d}_{i-1}, \boldsymbol{\beta}_{i}\right\}$
$\Rightarrow \forall i \beta_{i} \neq d_{i}$.

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$D=0.23232323 \ldots$
$\boldsymbol{D}$ can not be the $\boldsymbol{i}$ column, because $\boldsymbol{\beta}_{\boldsymbol{i}} \neq \boldsymbol{d}_{\boldsymbol{i}}$.

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| :--- | :--- | :--- | :--- | :--- | :--- |
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$\Longrightarrow \forall i \boldsymbol{\beta}_{\boldsymbol{i}} \neq \boldsymbol{d}_{\boldsymbol{i}}$.
$\boldsymbol{D}=0.23232323 \ldots$
$\boldsymbol{D}$ can not be the $\boldsymbol{i}$ column, because $\boldsymbol{\beta}_{\boldsymbol{i}} \neq \boldsymbol{d}_{\boldsymbol{i}}$. But $\boldsymbol{D}$ can not be in the matrix...

## The liar paradox

When one day an expedition was sent to the spatial coordinates that Voojagig had claimed for this planet they discovered only a small asteroid inhabited by a solitary old man who claimed repeatedly that nothing was true, though he was later discovered to be lying.

- The Hitchhiker Guide to the Galaxy
© The liar's paradox: This sentence is false
(2) Related to Russell's paradox.
- Omnipotence paradox: Can [an omnipotent being] create a stone so heavy that it cannot lift it?


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## THE END

## (for now)

## 9.2

Introduction to the halting theorem

## The halting problem

Halting problem: Given a program $\boldsymbol{Q}$, if we run it would it stop?
Can one build a program $P$, that always stops, and solves the halting problem.

## Theorem ("Halting theorem")

There is no program that always stops and solves the halting problem

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## Intuition, why solving the Halting problem is really hard

## Definition

An integer number $\boldsymbol{n}$ is a weird number if

- the sum of the proper divisors (including 1 but not itself) of $\boldsymbol{n}$ the number is $>\boldsymbol{n}$,
- no subset of those divisors sums to the number itself.

70 is weird. Its divisors are $1,2,5,7,10,14,35.1+2+5+7+10+14+35=74$. No subset of them adds up to 70 .

```
Open question: Are there are any odd weird numbers?
Write a program \(P\) that tries all odd numbers in order, and check if they are weird. The
programs stops if it found such number.
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If can solve halting problem $\Longrightarrow$ can resolve this open problem.

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## If you can halt, you can prove or disprove anything...

(1) Consider any math claim $C$.
(2) Prover algorithm $P_{C}$ :
(A) Generate sequence of all possible proofs (sequence of strings) into a pipe/queue.
(B) $\langle\boldsymbol{p}\rangle \leftarrow$ pop top of queue.
(C) Feed $\langle\boldsymbol{p}\rangle$ and $\langle\boldsymbol{C}\rangle$, into a proof verifier ( "easy").
(D) If $\langle\boldsymbol{p}\rangle$ valid proof of $\langle\boldsymbol{C}\rangle$, then stop and accept.
(E) Go to (B)
(3) $P_{C}$ halts $\Longleftrightarrow C$ is true and has a proof
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## THE END

## (for now)

## Algorithms \& Models of Computation

## 9.3

The halting theorem

## Encodings

$M$ : Turing machine
$\langle M\rangle$ : a binary string uniquely describing $M$ (i.e., it is a number. $w$ : An input string
$\langle M, w\rangle$ : A unique binary string encoding both $M$ and input $w$


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\mathbf{A}_{\mathrm{TM}}=\{\langle M, w\rangle \mid M \text { is a TM and } M \text { accepts } w\} .
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## Complexity classes



## $\mathbf{A}_{\text {TM }}$ is TM recognizable...

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## Lemma

$\mathbf{A}_{\mathrm{TM}}$ is Turing recognizable.

## Proof.

Input: $\langle M, w\rangle$.
Using UTM simulate running $M$ on $w$. If $M$ accepts $w$ then accept, if $M$ rejects then reject. Otherwise, the simulation runs forever

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## $\mathbf{A}_{\text {TM }}$ is not TM decidable!

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Theorem (The halting theorem.)
$\mathbf{A}_{\mathrm{TM}}$ is not Turing decidable.

```
Proof: Assume A
Halt: TM deciding A}\mp@subsup{\mathbf{A}}{\textrm{TM}}{}\mathrm{ . Halt always halts, and works as follows:
Halt}(\langleM,w\rangle)={\begin{array}{ll}{\mathrm{ accept }M\mathrm{ accepts w}}\\{\mathrm{ reject }M\mathrm{ does not accept w.}}
```


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## Theorem (The halting theorem.)

$\mathbf{A}_{\mathrm{TM}}$ is not Turing decidable.
Proof: Assume $\mathbf{A}_{\mathrm{TM}}$ is TM decidable...
Halt: TM deciding $\mathbf{A}_{\mathrm{TM}}$. Halt always halts, and works as follows:


## $\mathbf{A}_{\text {TM }}$ is not TM decidable!

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\mathbf{A}_{\mathrm{TM}}=\{\langle M, w\rangle \mid M \text { is a TM and } M \text { accepts } w\} .
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$\mathbf{A}_{\mathrm{TM}}$ is not Turing decidable.
Proof: Assume $\mathbf{A}_{\mathrm{TM}}$ is TM decidable...
Halt: TM deciding $\mathbf{A}_{\mathrm{TM}}$. Halt always halts, and works as follows:

$$
\text { Halt }(\langle M, w\rangle)= \begin{cases}\text { accept } & M \text { accepts } w \\ \text { reject } & M \text { does not accept } w .\end{cases}
$$

## Halting theorem proof continued 1

We build the following new function:

| Flipper $(\langle M\rangle)$ |
| :---: |
| res $\leftarrow$ Halt $(\langle M, M\rangle)$ |
| if res is accept then |
| reject |
| else $\quad$ accept |

Flipper always stops:


## Halting theorem proof continued 1

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## Halting theorem proof continued 2

$$
\text { Flipper }(\langle M\rangle)= \begin{cases}\text { reject } & M \text { accepts }\langle M\rangle \\ \text { accept } & M \text { does not accept }\langle M\rangle .\end{cases}
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Flipper is a TM（duh！），and as such it has an encoding 〈Flipper〉．Run Flipper on itself：

$$
\text { Flipper }(\langle\text { Flipper }\rangle)= \begin{cases}\text { reject } & \text { Flipper accepts 〈Flipper〉 } \\ \text { accept } & \text { Flipper does not accept }\langle\text { Flipper }\rangle .\end{cases}
$$

## This is absurd．Ridiculous even！

Assumption that Halt exists is false．$\Rightarrow \mathbf{A}_{\mathrm{TM}}$ is not TM decidable

## Halting theorem proof continued 2

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\text { Flipper }(\langle M\rangle)= \begin{cases}\text { reject } & M \text { accepts }\langle M\rangle \\ \text { accept } & M \text { does not accept }\langle\boldsymbol{M}\rangle .\end{cases}
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This is absurd. Ridiculous even!
Assumption that Halt exists is false. $\Longrightarrow \mathrm{A}_{\mathrm{TM}}$ is not TM decidable.

## Halting theorem proof continued 2

$$
\text { Flipper }(\langle M\rangle)= \begin{cases}\text { reject } & M \text { accepts }\langle M\rangle \\ \text { accept } & M \text { does not accept }\langle M\rangle\end{cases}
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Flipper is a TM (duh!), and as such it has an encoding 〈Flipper〉. Run Flipper on itself:

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\text { Flipper }(\langle\text { Flipper }\rangle)= \begin{cases}\text { reject } & \text { Flipper accepts }\langle\text { Flipper }\rangle \\ \text { accept } & \text { Flipper does not accept }\langle\text { Flipper }\rangle .\end{cases}
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This is absurd. Ridiculous even!
Assumption that Halt exists is false. $\Longrightarrow \mathbf{A}_{\mathrm{TM}}$ is not TM decidable.

## But where is the diagonalization argument????

|  | $\left\langle M_{1}\right\rangle$ | $\left\langle M_{2}\right\rangle$ | $\left\langle M_{3}\right\rangle$ | $\left\langle M_{4}\right\rangle$ | $\ldots$ |
| :--- | :--- | :--- | :--- | :--- | :--- |
| $M_{1}$ | rej | acc | rej | rej | $\ldots$ |
| $M_{2}$ | rej | acc | rej | acc | $\ldots$ |
| $M_{3}$ | acc | acc | acc | rej | $\ldots$ |
| $M_{4}$ | rej | acc | acc | rej | $\ldots$ |
| $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ | $\ddots$ |

## THE END

## (for now)

## 9.4 Unrecognizable

## TM recognizable

## Definition

Language $L$ is $T M$ decidable if there exists $M$ that always stops, such that $L(M)=\boldsymbol{L}$.

## Definition

Language $\mathbf{L}$ is TM recognizable if there exists $M$ that stops on some inputs, such that $L(M)$

## Theorem (Halting)



## TM recognizable

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Language $L$ is TM decidable if there exists $M$ that always stops, such that $L(M)=\boldsymbol{L}$.

## Definition

Language $L$ is TM recognizable if there exists $M$ that stops on some inputs, such that $L(M)=L$.

## Theorem (Halting)

$\mathbf{A}_{\mathrm{TM}}=\{\langle\boldsymbol{M}, \boldsymbol{w}\rangle \mid M$ is a TM and $M$ accepts $w\}$. is TM recognizable, but not decidable.

## TM recognizable

## Lemma

If $L$ and $\bar{L}=\Sigma^{*} \backslash L$ are both $T M$ recognizable, then $L$ and $\bar{L}$ are decidable.

```
Proof.
M: TM recognizing L
Mc:TM recognizing}\overline{L
Given input x, using UTM simulating running M and M}\mp@subsup{M}{c}{}\mathrm{ on x in parallel. One of
them must stop and accept. Return result.
    L}\mathrm{ is decidable
```


## TM recognizable

## Lemma

If $L$ and $\bar{L}=\Sigma^{*} \backslash L$ are both TM recognizable, then $L$ and $\bar{L}$ are decidable.

## Proof.

$M$ : TM recognizing $L$.
$M_{c}$ : TM recognizing $\bar{L}$.
Given input $x$, using UTM simulating running $M$ and $M_{c}$ on $x$ in parallel. One of them must stop and accept. Return result.
$\Longrightarrow L$ is decidable.

## Complement language for $\mathbf{A}_{T M}$

$$
\overline{\mathbf{A}_{\mathrm{TM}}}=\Sigma^{*} \backslash\{\langle\boldsymbol{M}, \boldsymbol{w}\rangle \mid M \text { is a } \mathrm{TM} \text { and } \boldsymbol{M} \text { accepts } \boldsymbol{w}\} .
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## But don't really care about invalid inputs. So, really:



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\overline{\mathbf{A}_{\mathrm{TM}}}=\{\langle M, w\rangle \mid M \text { is a TM and } M \text { does not accept } w\} .
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## Complement language for $\mathbf{A}_{\text {TM }}$ is not TM-recognizable

## Theorem

The language

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\overline{\mathbf{A}_{\mathrm{TM}}}=\{\langle M, w\rangle \mid M \text { is a TM and } M \text { does not accept } \boldsymbol{w}\} .
$$

is not TM recognizable.

```
Proof.
ATM is TM-recognizable.
If }\overline{\mp@subsup{\mathbf{A}}{TM}{}}\mathrm{ is TM-recognizable
(by Lemma)
A
```


## Complement language for $\mathbf{A}_{T M}$ is not TM-recognizable

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## Proof.

$\mathbf{A}_{\mathrm{TM}}$ is TM-recognizable.
If $\overline{\mathbf{A}_{\mathrm{TM}}}$ is TM-recognizable
$\Rightarrow$ (by Lemma)
$\mathbf{A}_{\mathrm{TM}}$ is decidable. A contradiction.

## Complement language for $\mathbf{A}_{\text {TM }}$ is not TM-recognizable

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Algorithms \& Models of Computation

## 9.5 <br> Turing complete

## Equivalent to a program

## Definition

A system is Turing complete if one can simulate a Turing machine using it.
(1) Programming languages (yey!)
(2) $\mathrm{C}++$ templates system (boo).
(3) John Conway's game of life.
( - Many games (Minesweeper)
(5) Post's correspondence problem.

## Equivalent to a program

## Definition

A system is Turing complete if one can simulate a Turing machine using it.
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- Many games (Minesweeper).
( Post's correspondence problem.


## Post's correspondence problem

$S$ : set of domino tiles.
$\frac{a b b}{b \boldsymbol{b}}$ : domino piece a string at the top and a string at the bottom.
Example:

$$
S=\left\{\begin{array}{c|}
\hline b \\
\hline c a \\
\hline a b \\
\hline a b \\
\hline
\end{array}, \begin{array}{c}
c a \\
\hline a b c \\
\hline c
\end{array}\right\} .
$$

## Matching dominos

$$
S=\left\{\begin{array}{c|}
\hline b \\
\hline c a \\
\hline a b \\
\hline a b \\
\hline a \\
\hline a \\
\hline a b c \\
\hline c \mid
\end{array}\right\} .
$$

match for $S$ : ordered list of dominos from $S$, such that top strings make same string as bottom strings. Example:


[^0]
## Matching dominos

$$
S=\left\{\begin{array}{c}
\hline b \\
\hline c a \\
\left.\hline \frac{a}{a b}, \begin{array}{|c|}
\hline c a \\
\hline a \\
\hline a b c \\
\hline c
\end{array}\right\} . . . . ~ . ~
\end{array}\right.
$$

match for $S$ : ordered list of dominos from $S$, such that top strings make same string as bottom strings. Example:

| $a$ | $b$ | $c a$ | $a$ | $a b c$ |
| :---: | :---: | :---: | :---: | :---: |
| $a b$ | $c a$ | $a$ | $a b$ | $c$ |

(1) Can use same domino more than once
(2) Do not have to use all pieces of $S$

## Matching dominos

$$
S=\left\{\begin{array}{c}
\hline b \\
\hline c a \\
\hline
\end{array}, \begin{array}{|c|}
\hline a \\
a b \\
\hline
\end{array}, \frac{c a}{a}, \begin{array}{|c}
a b c \\
c
\end{array}\right\}
$$

match for $S$ : ordered list of dominos from $S$, such that top strings make same string as bottom strings. Example:

| $a$ | $b$ | $c a$ | $a$ | $a b c$ |
| :---: | :---: | :---: | :---: | :---: |
| $a b$ | $c a$ | $a$ | $a b$ | $c$ |

(1) Can use same domino more than once.
(2) Do not have to use all pieces of $S$.

## Post's Correspondence Problem

Post's Correspondence Problem (PCP) is deciding whether a set of dominos has a match or not.
modified Post's Correspondence Problem (MPCP): PCP + a special tile.
Matches for MPCP have to start with the special tile.

## Theorem

The MPCP problem is undecidable.

## THE END

## (for now)


[^0]:    (1) Can use same domino more than once
    (2) Do not have to use all pieces of $S$

