Intro. Algorithms & Models of Computation CS/ECE 374A, Fall 2024

Halting, Undecidability, and Maybe Some Complexity

Lecture 9 Tuesday, September 24, 2024

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Quote

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

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9.1 Cantor's diagonalization argument

You can not count the real numbers

 $I = (0, 1).$ $\mathbb{N} = \{1, 2, 3, \ldots\}$ the integer numbers

Claim 9.1 (Cantor).

 $|N| \neq |I|$

Claim 9.2 (Warm-up). $|N| \leq |I|$

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

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Proof.

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You can not count the real numbers II

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I = (0, 1), N = \{1, 2, 3, \ldots\}.
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Claim 9.3 (Cantor).

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

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Write every number in (0, 1) in its decimal expansion. E.g.,
1/3 = 0.33333333333333333333 . . ..
Assume that |\mathbb{N}| = |I|. Then there exists a one-to-one mapping f : \mathbb{N} \to I. Let \beta_i be
the ith digit of f(i) \in (0,1).
d_i = any number in \{0, 1, 2, 3, 4, 5, 6, 7, 8, 9\} \setminus \{d_{i-1}, \beta_i\}D = 0.d_1d_2d_3... \in (0,1).D is a well defined unique number in (0, 1),
But there is no j such that f(j) = D. A contradiction.
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D can not be the *i* column, because $\beta_i \neq d_i$. But D can not be in the matrix...

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

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9.2 Introduction to the halting theorem

The halting problem

Halting problem: Given a program Q, if we run it would it stop?

Q: Can one build a program P, that always stops, and solves the halting problem.

Theorem 9.1 ("Halting theorem").

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

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Theorem 9.1 ("Halting theorem").

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

Definition 9.2.

An integer number n is a weird number if

- If the sum of the proper divisors (including 1 but not itself) of n the number is $> n$,
- \triangleright 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 \boldsymbol{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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- 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) $\langle \mathbf{p} \rangle$ \leftarrow pop top of queue.
	- (C) Feed $\langle \mathbf{p} \rangle$ and $\langle \mathbf{C} \rangle$, into a proof verifier ("easy").
	- (D) If $\langle \mathbf{p} \rangle$ valid proof of $\langle \mathbf{C} \rangle$, then stop and accept.
	- (E) Go to (B) .
- 3. P_C halts $\iff C$ is true and has a proof.
- 4. If halting is decidable, then can decide if any claim in math is true.

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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.

> $\mathbf{A}_{\text{TM}}=\Big\{\langle\bm{M},\bm{w}\rangle\;\Big|\;$ M is a TM and M accepts w .

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Complexity classes

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Lemma 9.1. A_{TM} is Turing recognizable.

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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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.

 A_{TM} is not TM decidable! ${\bf A}_{\rm TM} = \Big\{ \langle M, w \rangle \; \Big|$ M is a TM and M accepts w .

Theorem 9.2 (The halting theorem.). A_{TM} is not Turing decidable.

Proof: Assume A_{TM} is TM decidable... **Halt**: TM deciding A_{TM} . **Halt** always halts, and works as follows:

> $\mathsf{Halt}\big(\,\langle \mathcal{M}, \mathcal{w} \rangle\big) =$ \int accept M accepts w reject M does not accept w .

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\mathsf{Halt}\Big(\langle M, w \rangle\Big) = \begin{cases} \text{accept} & M \text{ accepts } w \\ \text{reject} & M \text{ does not accept } w. \end{cases}
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We build the following new function:

Flipper always stops:

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Flipper is a TM (duh!), and as such it has an encoding \langle Flipper \rangle . Run Flipper on itself:

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But where is the diagonalization argument????

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9.4 Unrecognizable

Definition 9.1.

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

Definition 9.2.

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

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 $A_{\text{TM}} = \Big\{ \langle M, w \rangle \Big\}$ M is a TM and M accepts w , is TM recognizable, but not

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 $A_{\text{TM}} = \Big\{ \langle M, w \rangle \Big\}$ M is a TM and M accepts w , is TM recognizable, but not decidable.

Lemma 9.4.

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

M: TM recognizing L. M_c : TM recognizing \overline{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. \implies L is decidable.

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Complement language for A_{TM}

 $\overline{\mathbf{A}_{\text{TM}}} = \mathbf{\Sigma}^* \setminus \left\{ \langle M, w \rangle \; \middle| \right.$ M is a TM and M accepts w .

But don't really care about invalid inputs. So, really:

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Complement language for A_{TM} is not TM-recognizable

Theorem 9.5.

The language

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$$

is not TM recognizable.

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

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9.5 Turing complete

Equivalent to a program

Definition 9.1.

A system is Turing complete if one can simulate a Turing machine using it.

- 1. Programming languages (yey!).
- 2. C++ templates system (boo).
- 3. John Conway's game of life.
- 4. Many games (Minesweeper).
- 5. Post's correspondence problem.

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Post's correspondence problem

S: set of **domino tiles**.

 $\frac{3DD}{bc}$: domino piece a string at the top and a string at the bottom.

Example:

abb

$$
S = \left\{ \frac{b}{ca}, \frac{a}{ab}, \frac{ca}{a}, \frac{abc}{c} \right\}.
$$

Matching dominos

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

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

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

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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 9.2

The MPCP problem is undecidable.