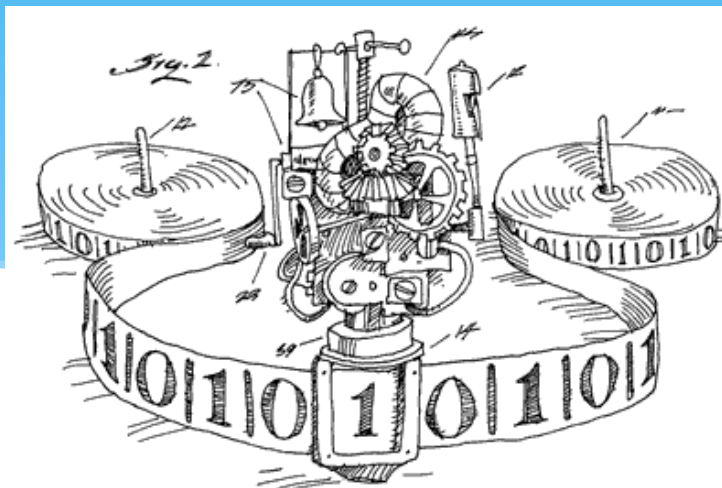


EECS 376: Foundations of Computer Science

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Last Weekend: OH**



Today's Agenda

- * Recap: (un)countability
- * “Almost all” problems are undecidable
- * The Barber Paradox & an explicit undecidable language
- * Two more undecidable problems:
 - * Accepting problem L_{ACC}
 - * Halting problem L_{HALT}
- * Turing reductions/reducibility

Review: Countability

- * A set S is *countable* if there is an ordered list of its elements (each element $s \in S$ gets its own unique natural number ID)
- * The set of all *finite* binary strings is **countable**.
 - * List the elements in lexicographic order:
 $\epsilon, 0, 1, 00, 01, 10, 11, 000, 001, \dots$
- * The set of all *infinite* binary sequences is **uncountable**.
 - * Idea: For any list of such sequences, use *diagonalization* to construct a sequence that is *not* in the list.

Language \equiv Infinite Binary Sequence

* **Claim:** A language L is equivalent to an infinite binary sequence.

* **Idea:** First, list $\Sigma^* = \{s_1, s_2, s_3, s_4, \dots\}$ lexicographically.

Then $L \equiv b_1 b_2 b_3 b_4 \dots$, where $b_i \in \{0, 1\}$ indicates if $s_i \in L$.

* **Example:** $\Sigma^* = \{\epsilon, 0, 1, 00, 01, 10, 11, 000, 001, \dots\}$

$L = \{\epsilon, \quad 00, 01, 10, 11, \quad \dots\}$

$\equiv 1\ 0\ 0\ 1\ 1\ 1\ 1\ 0\ 0\dots$

There is an Undecidable Language

- * Set of all TMs (programs) is **countable**:
 - * Can list them by their “source code” (descriptions as strings)
 - * $\langle M_1 \rangle, \langle M_2 \rangle, \langle M_3 \rangle, \dots \in \{0,1\}^*$
- * Set of all decidable languages is **countable**:
 - * Each TM decides at most one language
- * Set of all languages (infinite binary strings) is **uncountable**
- * So, there is an undecidable language!
Indeed, “**almost all**” languages are undecidable.
(Similarly, “almost all” real numbers are irrational...)

Diagonalization Yields An Undecidable Language

- * List all deciders M_i w/ their decided langs $L(M_i)$ (seq's).
- * There is a language L^* that is not in the list: 'flip the diagonal'.
- * **Claim:** No TM decides L^* . Every decider M_i appears in the list, but 'behaves incorrectly' on string s_i !

X

	s1	s2	s3	s4	s5	s6	...
M1	1	0	0	1	1	0	...
M2	0	1	1	0	0	0	...
M3	1	1	1	1	1	1	...
M4	0	0	0	0	0	0	...
M5	1	0	1	0	0	0	...
...

L^*

0	0	0	1	1	...	
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Summary

The ‘good’: We showed that there is an undecidable language

The ‘bad’: This language is “non-constructive” and “unnatural”

Q: Can we say anything about “natural” problems that we care about, or are “useful”?

The Barber Paradox

* **Sign:** “Barber B is the best barber in town! B cuts the hair of all those—and only those—who do not cut their own hair.”

* **Question:** Who cuts B ’s hair?

* **Answer:** Consider some person P .

1. P cuts own hair $\implies B$ does not cut P ’s hair.
2. P does not cut own hair $\implies B$ cuts P ’s hair.

* **Question:** What if $P = B$?

1. B cuts own hair $\implies B$ does not cut B ’s hair.
2. B does not cut own hair $\implies B$ cuts B ’s hair.

Contradiction! Such a barber cannot exist!

Barber Paradox and Diagonalization

- * Let X be a list of everyone in town, and whose hair they cut:

$$X(i, j) = \begin{cases} 1 & \text{if } P_i \text{ cuts } P_j\text{'s hair} \\ 0 & \text{otherwise} \end{cases}$$

- * Barber B is the flipped diagonal: $B(i)$ is 0 if P_i cuts P_i 's hair, else 1.
- * Thus, B is not on the list X – the barber does not exist!

	P1	P2	P3	P4	P5	...
P1	0	1	1	0	1	...
P2	1	1	0	0	0	...
P3	0	0	0	0	0	...
P4	0	1	1	1	0	...
...

B	1	0	1	0	...	
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Quote of The Day

“I would not join any club that would have me as a member.”

Groucho Marx

Barber Paradox & Computability

Source Code as Input

- * Since a program's source code is just a string, it can be passed as input to another program—or even to the program itself!

- * **Example:**

```
int M1(string s) {  
    ... return 0, else  
    return 1;  
}
```

$\langle M_1 \rangle = \text{"int M1(string s) {\n... return 0, else \n return 1;\n}\n"}$

Q: What does $M_1(\langle M_1 \rangle)$ return?

The Barber Paradox (Part 2)

- * **Sign:** “Barber B is the best barber in town! B cuts the hair of all those—and only those—who do not cut their own hair.”
- * Let’s consider a computational analogy, where:
 - * barber, people \Rightarrow program(s)
 - * hair \Rightarrow source code
 - * cut \Rightarrow accept
- * **Result:** “Program B accepts the source code of all programs—and only those programs—that do not accept their own source code.”
- * **Reminder:** The *language of a program* is the set of inputs it accepts.
 Thus,
$$L(B) = \{ \langle M \rangle : M \text{ does not accept } \langle M \rangle \}$$

The Barber Paradox (Part 2)

- * **Result:** “Program B accepts the source code of all programs—and only those programs—that do not accept their own source code.”
- * **Question:** Does program B accept its own source code?
- * **Answer:** Suppose P is a program.
 1. P accepts its own code $\implies B$ does not accept P 's code.
 2. P does not accept its own code $\implies B$ accepts P 's code.
- * **Question:** What if $P = B$?
 1. B accepts its own code $\implies B$ does not accept B 's code.
 2. B does not accept its own code $\implies B$ accepts B 's code.

Contradiction! Program B cannot exist

Barber and Diagonalization (Part 2)

- * Let X be a list of all **programs**, and whose **code** they **accept**:

$$X(i, j) = \begin{cases} 1 & \text{if } P_i \text{ accepts } P_j\text{'s code} \\ 0 & \text{otherwise} \end{cases}$$
- * **Program** B is the flipped diagonal: $B(i)$ is 0 if P_i accepts P_i 's **code**, 1 otherwise.
- * Thus, B is not on the list X - **program** B does not exist!

X

	P1	P2	P3	P4	P5	...
P1	0	1	0	1	1	...
P2	1	1	0	1	0	...
P3	0	0	0	0	0	...
P4	1	1	1	0	1	...
...

B

1	0	1	1	...	
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An Explicit Undecidable Language

- * Since no program has $L_{\text{BARBER}} = \{ \langle M \rangle : M \text{ does not accept } \langle M \rangle \}$ as its language, L_{BARBER} is *undecidable*.
- * This is our first example of an explicit undecidable language!
- * **Q:** Why do we care about this language?
- * **A:** Once we have one undecidable language, we can use it to show that **other languages** are also undecidable.

A More Useful Language

It would be useful to have a program that does the following:
Given as input a **Turing Machine M** and a **string x** , determine whether M **accepts** x .

```
bool M(string x):  
  n ← 100  
  while (n > 1): n ← n - 1  
  return T
```

Example: Does M accept $x=376$?

In other words, is the following language decidable?:

$$L_{\text{ACC}} = \{(\langle M \rangle, x) : M \text{ accepts } x\}$$

Attempt 1: Interpreter ("Universal" Turing Machine)

- * An *interpreter* is a program that takes another program as input and **simulates** its behavior.
- * Specifically, an interpreter U takes two inputs: (1) some source code $\langle M \rangle$, and (2) a string x .
- * $U(\langle M \rangle, x)$ just simulates the execution of M on x . So:
 - * M accepts $x \implies U$ accepts $(\langle M \rangle, x)$
 - * M rejects $x \implies U$ rejects $(\langle M \rangle, x)$
 - * M loops on $x \implies U$ loops on $(\langle M \rangle, x)$

Does Interpreter Decide L_{ACC} ?

- * $U(\langle M \rangle, x)$ simulates the execution of M on x :
 - * M accepts $x \implies U$ accepts $(\langle M \rangle, x)$
 - * M rejects $x \implies U$ rejects $(\langle M \rangle, x)$
 - * M loops on $x \implies U$ loops on $(\langle M \rangle, x)$
- In both cases
 $(\langle M \rangle, x) \notin L(U)$

- * The language of U is:

$$L(U) \equiv L_{ACC} = \left\{ (\langle M \rangle, x) : M \text{ accepts } x \right\}$$

- * However, U is not a decider for L_{ACC} : U loops on some inputs.
- * **Q:** Can we write a decider for L_{ACC} ?

L_{ACC} is Undecidable

* **Q:** Is there a decider for $L_{\text{ACC}} = \{ (\langle M \rangle, x) : M \text{ accepts } x \}$?

* A hypothetical decider C for L_{ACC} must behave as follows:

* M accepts $x \implies C$ accepts $(\langle M \rangle, x)$

* M does not accept $x \implies C$ rejects $(\langle M \rangle, x)$

M rejects or loops

* Could try to come up with a clever **diagonalization**.
But let's not reinvent the wheel!

* **IDEA:** show that such C would let us decide some known-undecidable language: contradiction! Via **(Turing) reduction**

L_{ACC} is Undecidable

We need to implement:

B takes one input: $\langle M \rangle$

M does not accept $\langle M \rangle \implies B$ accepts $\langle M \rangle$

M accepts $\langle M \rangle \implies B$ rejects $\langle M \rangle$

We have:

C takes two inputs: $\langle M \rangle$ and x .

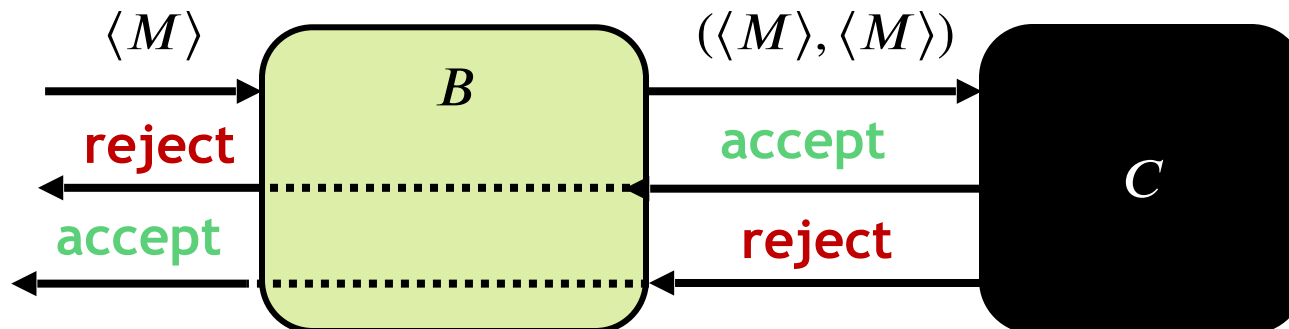
M accepts $x \implies C$ accepts $(\langle M \rangle, x)$

M doesn't accept $x \implies C$ rejects $(\langle M \rangle, x)$

- * **Proof:** Assume (for contradiction) that a decider C exists for $L_{\text{ACC}} = \{(\langle M \rangle, x) : M \text{ accepts } x\}$.

We will use C to construct a decider B for

$L_{\text{BARBER}} = \{\langle M \rangle : M \text{ does not accept } \langle M \rangle\}$:



L_{ACC} is Undecidable

We need to implement:

B takes one input: $\langle M \rangle$

M does not accept $\langle M \rangle \implies B$ accepts $\langle M \rangle$

M accepts $\langle M \rangle \implies B$ rejects $\langle M \rangle$

We have:

C takes two inputs: $\langle M \rangle$ and x

M accepts $x \implies C$ accepts $(\langle M \rangle, x)$

M doesn't accept $x \implies C$ rejects $(\langle M \rangle, x)$

* In code:

* B on input $\langle M \rangle$: (B takes one input: source code of some program M)

* Run C on $(\langle M \rangle, \langle M \rangle)$ (Ask C : “does M accept its source code”?)

* If C accepts, reject; if C rejects, accept (flip C 's answer)

* Analysis:

* B halts on any input, because C does (C is a decider).

* $\langle M \rangle \in L_{\text{BARBER}} \iff M$ does not accept $\langle M \rangle$
 $\iff C$ rejects $(\langle M \rangle, \langle M \rangle) \iff B$ accepts $\langle M \rangle$.

The Halting Problem and (More) Turing Reductions

Halting Problem

Halting Problem: Given a TM M and string x as input, decide if M halts on x .
Fundamental problem in software and hardware design!

- * **Q:** Why can't we just run M on x (using an interpreter) to see if it halts?
- * **A:** M might loop on x , so we might never produce an answer!

A hypothetical decider H for L_{HALT} takes two inputs, $\langle M \rangle$ and x :

- * M halts (accepts or rejects) on $x \implies H$ accepts $(\langle M \rangle, x)$
- * M doesn't halt (loops) on $x \implies H$ rejects $(\langle M \rangle, x)$

Show that H can't exist, using undecidability of L_{ACC} . How?
Use hypothetical H to construct a decider for L_{ACC} .
Since L_{ACC} is undecidable, we get a **contradiction**.

L_{HALT} is Undecidable

We need to implement:

C is given two inputs: $\langle M \rangle$ and x

M accepts $x \implies C$ accepts $(\langle M \rangle, x)$

M does not accept $x \implies C$ rejects $(\langle M \rangle, x)$

We have:

H takes two inputs: $\langle M \rangle$ and x

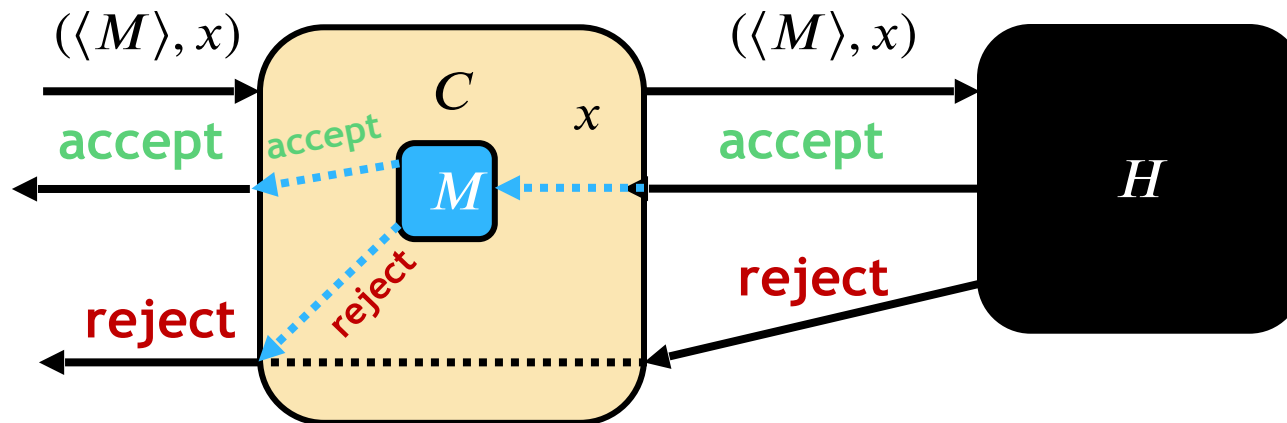
M accepts/rejects $x \implies H$ accepts $(\langle M \rangle, x)$

M loops on $x \implies H$ rejects $(\langle M \rangle, x)$

- * **Claim:** $L_{\text{HALT}} = \{(\langle M \rangle, x) : M \text{ halts on } x\}$ is undecidable.
- * **Proof:** Assume (for contradiction) that some H decides L_{HALT} .

We construct a decider C for

$L_{\text{ACC}} = \{(\langle M \rangle, x) : M \text{ accepts } x\}$:



L_{HALT} is Undecidable

We need to implement:

C is given two inputs: $\langle M \rangle$ and x

M accepts $x \implies C$ accepts $(\langle M \rangle, x)$

M does not accept $\langle M \rangle \implies C$ rejects $(\langle M \rangle, x)$

* In code:

* C on input $(\langle M \rangle, x)$: (Must answer: “does M accept x ?”)

* Run H on $(\langle M \rangle, x)$ (Ask H : “does M halt on x ?”)

* If H rejects, reject (M loops on x , so it doesn’t accept it)

* If H accepts, run M on x (M halts on x , so this simulation will terminate)

* If M accepts, accept; If M rejects, reject (answer as M does)

* **Analysis:** C halts on any input (why?). Moreover:

* M accepts $x \implies H$ accepts $(\langle M \rangle, x) \implies C$ accepts $(\langle M \rangle, x)$

* M rejects $x \implies H$ accepts $(\langle M \rangle, x) \implies C$ rejects $(\langle M \rangle, x)$

* M loops on $x \implies H$ rejects $(\langle M \rangle, x) \implies C$ rejects $(\langle M \rangle, x)$

* **Conclusion:** L_{HALT} decidable $\implies L_{\text{ACC}}$ decidable

* **Contrapositive:** L_{ACC} undecidable $\implies L_{\text{HALT}}$ undecidable



Turing Reducibility

- * **Question:** How can we show that a language is undecidable?
- * **Two Options:**
 - * Directly: L_{BARBER} is undecidable.
 - * Indirectly: If L_{HALT} is decidable then so is L_{ACC} .
- * **Definition:** Language A is *Turing reducible* to language B , written $A \leq_T B$, if there exists a TM (program) M , with access to a membership oracle (“black box”) for B , that decides A .
- * **Intuition:** solving A is “no harder than” solving B .
- * **We have shown:** $L_{\text{BARBER}} \leq_T L_{\text{ACC}} \leq_T L_{\text{HALT}}$

Conclusion and Exercises

- * **Theorem:** Suppose $A \leq_T B$. Then B is decidable $\implies A$ is decidable.
- * **Proof:** use decider for B to implement the membership oracle.
- * **Question:** How can we show *undecidability* of a language?
- * **Contrapositive:** Suppose $A \leq_T B$. Then A is undecidable $\implies B$ is undecidable.
- * **Strategy:** Pick an undecidable language A and show that $A \leq_T B$.
- * **Question 1:** Is it true that $L_{\text{HALT}} \leq_T L_{\text{ACC}}$?
- * **Question 2:** Suppose $A \leq_T B$. Must $B \leq_T A$?