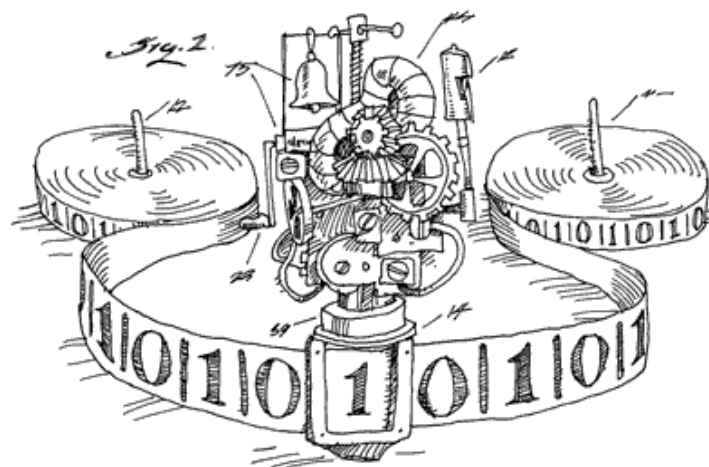


EECS 376: Foundations of Computer Science

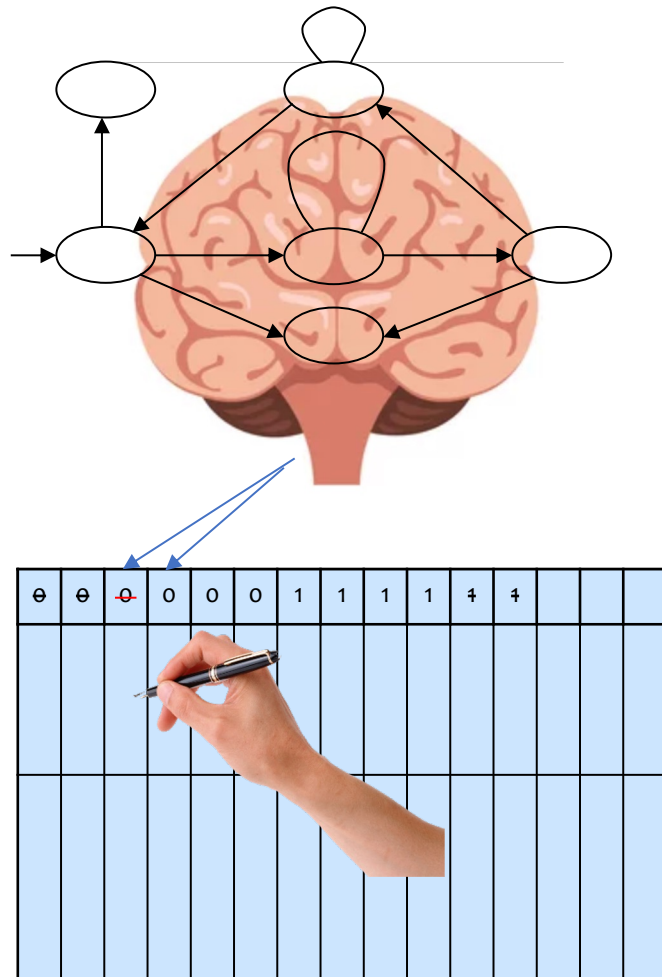
Lecture 10 - Diagonalization and Undecidability



Today's Agenda

- Recap: Turing Machines, Church-Turing thesis
- Deciders (vs “loopers”) and decidability
- Diagonalization and an undecidable language

Turing Machines: Essential Features



1. **Finite alphabets:** input & tape

2. **Finite “brain”/logic/“code”:**
state machine

3. **Infinite storage:** “tape”

4. Sequence of *local* computations,
specified by the code:

- Read a single symbol
- Write a single symbol
- Move a single cell
- Update active state

5. Runs until it enters a
terminal state—if ever!

Decision Programs

- Q: Suppose we run a TM on string. What are the possible outcomes?
 - either: (i) accepts, (ii) rejects, or (iii) “loops” (forever)

- **Definition:** A TM M **decides** language L if :
 1. M accepts every string $x \in L$ (“accepts”), and
 2. M rejects every string $x \notin L$ (“rejects”).

We say that M is a **decider** (for L), and L is **decidable**.

- **Note:** By definition, M does not loop on any input!

no loop
allowed!

Code vs TMs

- **Claim:** Given any TM, we can simulate it using a Boolean function on string written in C++ code.
- **Q:** Given any Boolean function on strings written in C++ code, can we simulate it using a TM?
- **A:** Yes. It is tedious to prove.
- **Church-Turing thesis:**
 - TM can simulate any model of computation.

```
bool simulateM(string x):  
// - hard-coded transition function of TM M  
// - copy x into array representing a tape  
// - repeatedly read/write/move according M  
return accept/reject according to M
```

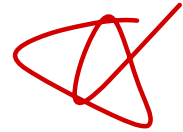
Take away: $TM \equiv \text{"bool } M(\text{string } x)\text{"}$

Summary So Far

- **General:** Any *finite* object (integer, graph, PDF, C++ code) can be encoded as a finite string. A TM takes a finite string as input.
- **Church–Turing thesis:**
“Anything that is computable by some physical device
(a ‘computer’) is computable by some **Turing machine.**”
- **In short:** Turing Machines = computer programs.
- **Implication:** If a problem *is not* decidable by a TM, it *cannot* be solved by any computer! (including future/alien technology)

Proving Decidability

Proving Decidability



- **Q:** To prove that a language L is decidable, must we design an *actual* TM?
- **A:** No! *Simulation* lets us write an algorithm in C++ or pseudocode.
- **Example:**
 - $L = \{(n, m) \mid n \text{ and } m \text{ are coprime}\}.$

CoPrime(n, m):

If $n < m$, swap n and m .

If **Euclid**(n, m) = 1, return “accept”

Else return “reject”.

Euclid(x, y): // for $x \geq y > 0$

if($x \bmod y = 0$), return y .

else return **Euclid**($y, x \bmod y$)

- **Analysis (Correctness):**
 - By definition, $\text{gcd}(n, m) = 1 \Leftrightarrow n \text{ and } m \text{ are coprime}.$
 - **Euclid**(x, y) always halts and returns $\text{gcd}(x, y)$.
 - There exists a TM that simulates **CoPrime**, **Euclid** and therefore decides L .

Undecidable Languages?

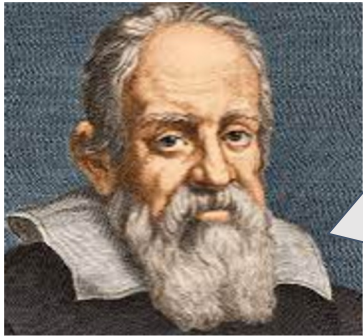
- **Question:** Do there exist undecidable languages?
i.e., are there problems that no computer can solve?
- **The goal of today's lecture:** There exists an undecidable language L .
- **The key idea of today's lecture:**
 - Let \mathcal{L} be the set of *all* languages and \mathcal{M} be the set of all TMs, say both over the alphabet $\Sigma = \{0,1\}$.
 - If we could show that $|\mathcal{M}| < |\mathcal{L}|$, we would be done!
 - **Why:** Each TM M decides at most 1 language.
 - **Problem:** Both $|\mathcal{L}|$ and $|\mathcal{M}|$ are infinite! Can we do anything about it?

Before Proving Undecidability:

Introduction to Countable and Uncountable Sets

How can we compare the “size” of infinite sets?

203 Review: Countability



Galileo (1638)

The attributes “equal,” “greater,” and “less,” are not applicable to infinite, but only to finite, quantities.



Georg Cantor (1895)

Actually yes they are

- * **Definition:** A set S is **countable** if it is “no larger than” the naturals $\mathbb{N} = \{0, 1, 2, \dots\}$, i.e. $|S| \leq |\mathbb{N}|$.
- * **Equivalently:** S is countable if there exists a 1-to-1 (injective) function $f: S \rightarrow \mathbb{N}$.
- * We can also show S is countable by demonstrating how to list all the elements in S such that each element $s \in S$ appears somewhere on the list. Why?

Transfinite Cardinal Numbers

- Cardinality of a *finite* set is simply the number of elements in the set.
- Cardinalities of *infinite* sets are not natural numbers, but are special objects called *transfinite cardinal numbers*.
- $\aleph_0 \equiv |\mathbf{N}|$, is the *first transfinite cardinal* number.
- *continuum hypothesis* claims that $|\mathbf{R}| = \aleph_1$, the *second transfinite cardinal*.

Ordinals (con.)

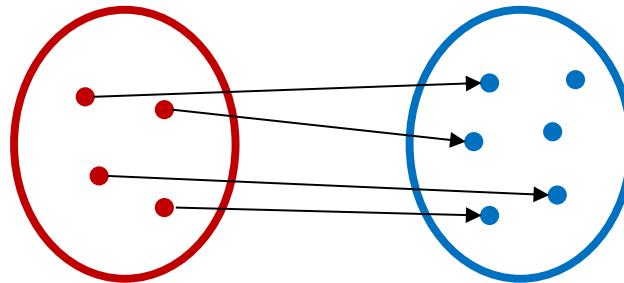
- The **least ordinal** is (vacuously) $= \emptyset$. We take:
- $0 = \emptyset$
- $1 = \{\emptyset\} = \{0\}$
- $2 = \{\emptyset, \{\emptyset\}\} = \{0, 1\}$
- $3 = \{\emptyset, \{\emptyset\}, \{\emptyset, \{\emptyset\}\}\} = \{0, 1, 2\}$
- $4 = \dots = \{0, 1, 2, 3\}$
and so on. In general, we have
$$n = \{0, 1, 2, \dots, n-1\}$$

Ordinals (con.)

- So, every **natural number** is an **ordinal**.
- But the ordinals continue after the natural numbers leave off. If ω denotes the smallest ordinal which is not a natural number, then ω is the set of natural numbers.
- Then the next ordinal after ω is $\omega \cup \{\omega\} = \omega + 1$, and so on .

Functions and Set Cardinality

- A function $f: A \rightarrow B$ maps each element $x \in A$ to an element $f(x) \in B$.
- A function f is **injective** (**1-to-1**) if no two elements in A are mapped to the same element of B .
 - Formally: f injective means $\nexists a, a'. a \neq a' \wedge f(a) = f(a')$.



- If an injective $f: A \rightarrow B$ exists, then $|A| \leq |B|$.
- If injective $f: A \rightarrow B$ and $g: B \rightarrow A$ exist, then $|A| = |B|$.
- This is the **definition** of “ \leq ” and “ $=$ ” for set cardinality.

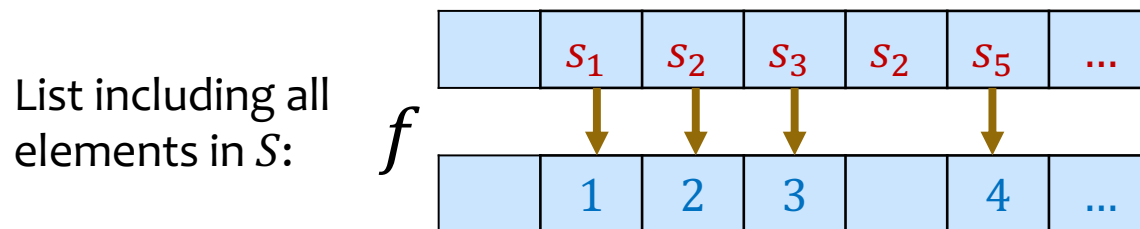
Warning:
properties of
“ \leq ” for finite
values do not
necessarily
apply to
infinite values

Countable Sets

- **Def:** A set S is countable if it is “no larger than” the naturals $\mathbb{N} = \{0, 1, 2, \dots\}$, i.e., $|S| \leq |\mathbb{N}|$.
- **Equivalently:** S is countable if \exists an injective function $f: S \rightarrow \mathbb{N}$.
- **Claim:** Any finite set is countable.
- **Proof:**
 - Let $S = \{s_1, \dots, s_n\}$ be a set with n elements.
 - Then $f: S \rightarrow \mathbb{N}$, $f(s_i) = i$ is an injection from S to \mathbb{N} .
- **Q:** Which infinite sets are countable (“countably infinite”)?

Proving Countability

- **Recall:** S is countable if there is an injective $f: S \rightarrow \mathbb{N}$.
- We can prove that a set is countable by explicitly defining such a function.
- Or, we can show how to list elements of S (possibly with duplicates) so that each element must appear at some finite position in the list.
 - **This is enough.** It implicitly defines an injective $f: S \rightarrow \mathbb{N}$.



Countably Infinite Sets

- **By Definition:** $\mathbb{N} = \{0, 1, 2, 3, 4, \dots\}$.
- Is \mathbb{Z} countable (listable)?
 - First try: $\mathbb{Z} = \{0, 1, 2, 3, 4, \dots, -1, -2, -3, -4, \dots\}$.
 - **Does not work!** (What is the exact position of “-1” in the list?)
 - **2nd Try:** List $\mathbb{Z} = \{0, 1, -1, 2, -2, 3, -3, 4, -4, 5, -5, \dots\}$.
- Is \mathbb{Q}^+ countable (listable)?
 - How to list \mathbb{Q}^+ : First list all x/y with $x + y = 1$, then $x + y = 2$, etc.

	1	2	3	4	...
1	1/1	1/2	1/3	1/4	...
2	2/1	2/2	2/3	2/4	...
3	3/1	3/2	3/3	3/4	...
4	4/1	4/2	4/3	4/4	...
...

More Countably Infinite Sets: Finite Binary Strings

- Let $S = \{0,1\}^*$ be the set of all finite binary strings.
- **Claim:** S is countable.
- **Proof:** List the elements of S in *lexicographic order*:
 - by length, and then
 - in sorted order among strings with equal length.

$S: \epsilon, 0, 1, 00, 01, 10, 11, 000, \dots$
- Every element of S appears in the list.

Diagonalization:



Showing $|\text{Countable set}| < |\text{Uncountable set}|$



Proving Uncountability via Diagonalization

- **Q:** How do we show that a set S is uncountable?
- **A:** Prove that no injective $f: S \rightarrow \mathbb{N}$ exists.
- **How? Proof by contradiction! Template:**
 1. Assume there exists a list of elements of S such that every element $x \in S$ appears somewhere in the list.
 2. Use it to ‘construct’ some $x^* \notin S$ that is not in the list.
 3. Contradiction! So, no such list can exist.
- **Diagonalization** is the usual technique for step 2

First Example:

Set of infinite-length binary sequences is uncountable

- Now let S be the set of infinite-length binary sequences.
- Suppose there is some list (s_1, s_2, s_3, \dots) of all elements of S .
- Let $s_i[j]$ be the j th bit of s_i .
- Take the ‘diagonal’ bits and flip them:
 - $x^*[j] = \overline{s_j[j]} = 1 - s_j[j]$.

s_1	0	1	1	0	1	0	...
s_2	1	0	0	0	0	0	...
s_3	0	1	1	1	0	1	...
s_4	0	0	0	0	0	0	...
s_5	1	1	1	1	1	1	...
...

x^*	1	1	0	1	0	...	
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First Example:

Set of infinite-length binary sequences is uncountable

- **Claim:** x^* is not in the list!
- **Proof:** If it were in the list, then for some i , $s_i = x^*$.
- By construction, $x^*[i] = 1 - s_i[i] \neq s_i[i]$, so $x^* \neq s_i$.
- This contradicts the original assumption that it was **possible** to list the elements of S . Hence S is not countable.

s_1	0	1	1	0	1	0	...
s_2	1	0	0	0	0	0	...
s_3	0	1	1	1	0	1	...
s_4	0	0	0	0	0	0	...
s_5	1	1	1	1	1	1	...
...

x^*	1	1	0	1	0	...	
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First Example:

Set of infinite-length binary sequences is uncountable

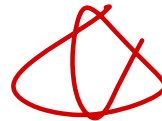
- **Conclusion:** The set of all *infinite* binary sequences is uncountable.
- **Diagonalization Summary:** For any *candidate* list of such sequences, there is a sequence not in that list.

Cantor's Theorem

Cantor's Theorem:

For any set X ,

$$|X| < |P(X)|.$$



Proving Undecidability via Diagonalization

Plan: How to show the existence of undecidable language

- **Recall:**
- Let \mathcal{L} be the set of all languages.
- Let \mathcal{M} be the set of all TMs.
- Will show that $|\mathcal{M}| < |\mathcal{L}|$.

• **Q1:** Is \mathcal{M} countable?

• **A:** Yes. (We'll see.)

• **Q2:** Is \mathcal{L} countable?

• **A:** No! (We'll see.)

The set of TMs is countable

- **Claim:** The set of Turing Machines is countable.
- **Idea:** Use lexicographical ordering on source code.
(Every TM has an encoding as a finite-length string!)

易见.

$\{0,1\}^* = \{0, 1, 00, 01, \dots\}$
↓ ↓ ↓ ↓
1 2 3 4
(可列)

或者: 7-tuple 是

finite 的, 因而

我们可以用一个

binary string 去 encode, 因而 $M \subseteq \{0,1\}^*$

而 $\{\text{all binary strings}\} = \{0,1\}^*$ 也是 countable 的 $\Rightarrow M$ 是

“bool **A**(string x): return F”

“bool **A**(string x): return T”

“bool **A**(string x): for i=1...x: ...”

“bool **A**(string x): let x=x-1 ...”

The set of Languages is uncountable

$$L \subseteq \Sigma^* \text{ A infinite}$$

- **Claim:** Any language L can be represented by an infinite binary sequence.
- **Idea:** List all input strings $\Sigma^* = \{s_1, s_2, s_3, \dots\}$
 - Then $L: x_1 x_2 x_3 \dots$, where $x_i = 1$ if $s_i \in L$ and 0 otherwise.
- **Example:** Suppose $\Sigma = \{0,1\}$.
 - $\Sigma^* = \{\epsilon, 0, 1, 00, 01, 10, 11, 000, 001, \dots\}$
 - $L: \quad 1 \ 0 \ 0 \ 1 \ 1 \ 1 \ 1 \ 0 \ 0 \dots$

Language L decided by
“bool **M**(string x): **return** ($|x|$ is even)”

Conclude:

There exists an undecidable language

- The set \mathcal{M} of all TMs is countable, $|\mathcal{M}| \leq |\mathbb{N}|$
- The set \mathcal{L} of all languages is uncountable, $|\mathcal{L}| > |\mathbb{N}|$.
- So $|\mathcal{M}| < |\mathcal{L}|$.
- Each TM decides at most one decidable language.
- So there exists an undecidable language.
- Next: Can also prove this directly using a diagonalization argument too.

Another way to show: There exists an undecidable language \

- Construct a table T representing all decidable languages.

- Columns: list all input strings $\Sigma^* = \{s_1, s_2, s_3, \dots\}$
- Rows: list all TMs $\{M_1, M_2, M_3, \dots\}$
- $T[i, j] = 1$ iff machine M_i accepts string s_j , 0 otherwise.

- Claim:** No TM decides the language represented by L^* .

$$L^*[j] = 1 - T[j, j]$$

	s_1	s_2	s_3	s_4	s_5	s_6	...
$L(M_1)$	1	0	0	1	1	0	...
$L(M_2)$	0	1	1	0	0	0	...
$L(M_3)$	1	1	1	1	1	1	...
$L(M_4)$	0	0	0	0	0	0	...
$L(M_5)$	1	0	1	0	0	0	...
...

- Proof.** If L^* is decidable then $L^* = L(M_i)$ for some i . But $s_i \in L(M_i) \Leftrightarrow s_i \notin L^*$, so $L^* \neq L(M_i)$. Contradiction.

L^*	0	0	0	1	1	...	

Conclusion

- **Theorem:** There exists an undecidable language L^* .
- **Interpretation:** There is a “problem” that no computer program can solve correctly (on all inputs).
- **Question:** What problem does L^* represent? Do we care about it? Would it be useful to solve?
- **Answer:** We do not know, since the proof is ‘non-constructive’: only shows existence of L^* !
- **Next time:** Some explicit undecidable languages.