

Midterm review



Midterm Announcements

- Topics on midterm:
 - Beginning of the course through today's lecture
- Exam Coverage
 - Lecture 1-12
 - Discussion 1-6
 - HW 1-3
- You may bring one double-sided 8.5 x 11 study sheet, that you prepare
- Thursday 5/30:
 - No Lecture
 - Midterm 7-9 pm

Techniques/concepts

Algorithmic techniques

- Potential method
- Divide-and-Conquer + Master Theorem
- Dynamic Programming
- Greed + Induction/Exchange

Models of Computation:

- DFAs
- Turing machines + Church-Turing thesis
- Terminology: countable vs uncountable, language, (un)decidable

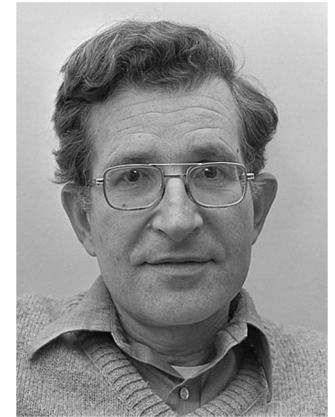
Techniques for proving undecidability

- Diagonalization/paradox
- Reduction

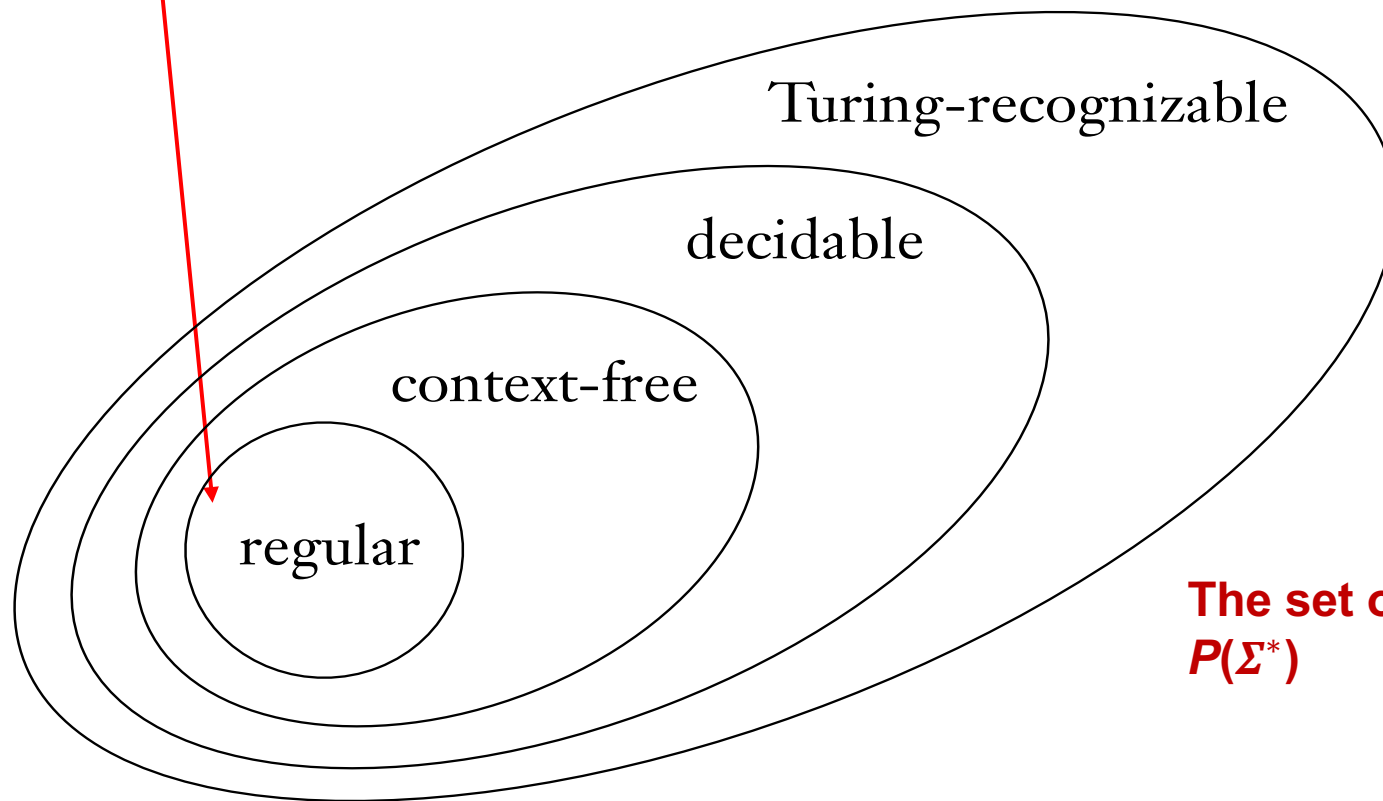
Reminder of problems + algorithms from class

- **Potential method:** GCD (Euclid)
- **Divide-and-conquer:** sorting (mergesort), closest pair, integer multiplication (Karatsuba)
- **Dynamic programming:** weighted task selection, LIS, LCS, knapsack, SSSP (Bellman-Ford), APSP (Floyd-Warshall)
- **Greedy:** unweighted task selection, MST (Kruskal)
- **Countable vs uncountable sets:** integers, rationals, reals, TMs, TM inputs, the set of all languages on a given alphabet
- **Undecidable languages:** L_{BARBER} , L_{ACC} , L_{HALT}

The Chomsky Hierarchy (1956)



“Regular Language”: Language decidable by some DFA



The set of all languages
 $P(\Sigma^*)$

More powerful “memory system” —————→

Some reference slides copied from
past lectures

Potential Method

Intuitively, a **potential function argument** says:

If I start with a finite amount of water in a leaky bucket, water eventually must stop leaking out.



Ingredients of the argument:

1. Define the “unit of time” e.g. one iteration of an algorithm
2. Define how we measure the amount of water in the bucket. This is the **potential function S_i** ← amount of water in bucket at timestep i
3. Prove that the S_0 is finite and S_i can never be negative
4. Prove that the bucket “leaks quickly”. I.e. that S_i decreases by at least some fixed amount per unit time.
5. Use this to upper bound the total number of units of time.

Divide and Conquer

Overview: Divide-and-Conquer Algorithms

Main Idea:

1. **Divide** the input into smaller sub-problems
2. **Conquer**: solve each sub-problem recursively and combine their solutions

Designing the Algorithm + Proving Correctness: an “art”

- Depends on problem structure, ad-hoc, creative

Running time Analysis: “mechanical”

- Express runtime using a recurrence
- Can often solve using the “Master Theorem”

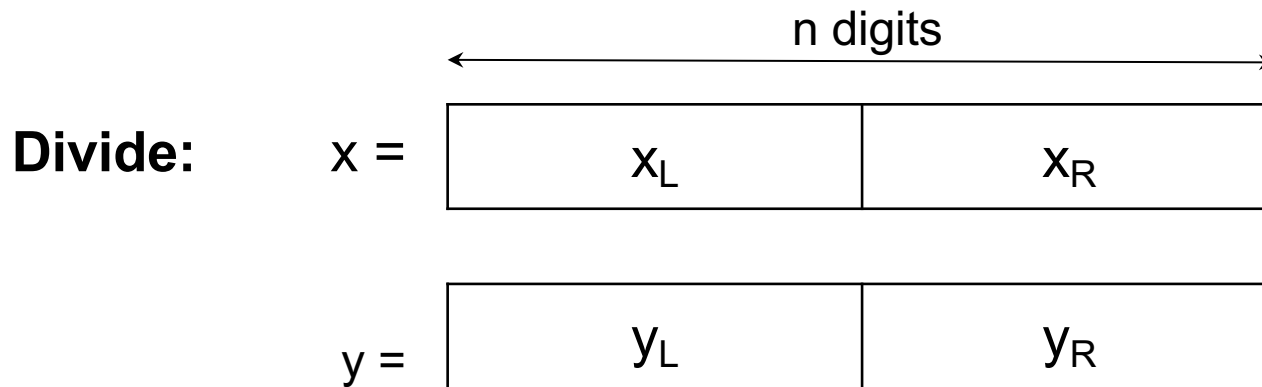
Integer Multiplication

- **Problem:** Given two n -bit numbers N_1 and N_2 , compute $N_1 \times N_2$
- **Long Multiplication:**
 - Reduce problem to n additions of $2n$ -bit numbers
 - Do each addition in $O(n)$ time
- **Runtime:** $O(n^2)$ in total!
- **Example:** What is 59×42 ?

$$\begin{array}{r}
 \begin{array}{ccccccc}
 & & & 1 & 1 & 1 & 0 & 1 & 1 & \leftarrow 59 \\
 & & & \times & 1 & 0 & 1 & 0 & 1 & 0 & \leftarrow 42 \\
 \hline
 & & & 1 & 1 & 1 & 0 & 1 & 1 & & 59 \ll 1 \\
 + & & & 1 & 1 & 1 & 0 & 1 & 1 & & 59 \ll 3 \\
 + & & 1 & 1 & 1 & 0 & 1 & 1 & & & 59 \ll 5 \\
 \hline
 2478 \longrightarrow & = & 1 & 0 & 0 & 1 & 1 & 0 & 1 & 0 & 1 & 1 & 1 & 0
 \end{array}
 \end{array}$$

Another example of divide and conquer:

Integer Multiplication



Conquer: $x \cdot y = (x_L \cdot 10^{n/2} + x_R)(y_L \cdot 10^{n/2} + y_R)$

$$= x_L y_L \cdot 10^n + (x_L y_R + x_R y_L) \cdot 10^{n/2} + x_R y_R$$

Recurrence:


Solving Recurrences

The Master Theorem

Formally: Consider the recurrence relation $T(n) = kT(n/b) + O(n^d)$, when $k, b > 1$. Then:

$$T(n) = \begin{cases} O(n^d) & \text{if } (k/b^d) < 1 \\ O(n^d \log n) & \text{if } (k/b^d) = 1 \\ O(n^{\log_b k}) & \text{if } (k/b^d) > 1 \end{cases}$$

$$T(1) = O(1)$$



Recall: k , b ,
and d are
constants

(Earlier, Gauss used the same trick in a different context)

Karatsuba's idea!

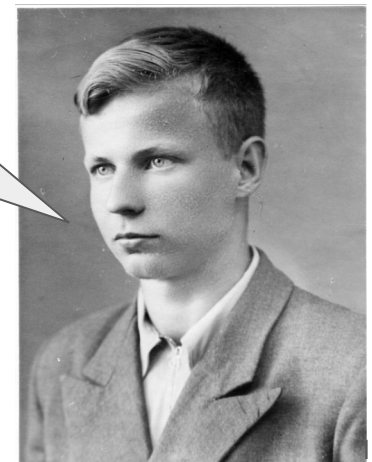
$O(n^2)$

Around 1956, the famous Soviet mathematician **Andrey Kolmogorov** conjectured that this is the *best possible way* to multiply two numbers together.

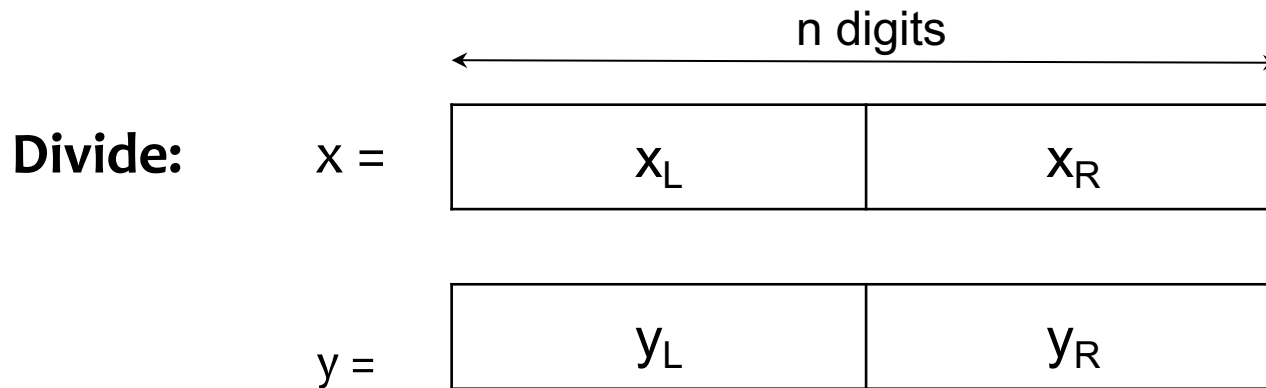
Just a few years later, Kolmogorov's conjecture was shown to be spectacularly wrong.

In 1960, Anatoly Karatsuba, a 23-year-old mathematics student in Russia, discovered a **sneaky algebraic trick** that reduces the number of multiplications needed.

We only need 3 recursive calls rather than 4!



Karatsuba's idea!



Conquer: $x \cdot y = x_L y_L \cdot 10^n + \cancel{(x_L y_R + x_R y_L)} \cdot 10^{n/2} + x_R y_R$

Recurrence $(x_L + x_R)(y_L + y_R) - x_L y_L - x_R y_R$

$O(n^{\log_2 3})$

Formally: Consider the recurrence relation $T(n) = kT(n/b) + O(n^d)$, when $k, b > 1$. Then:

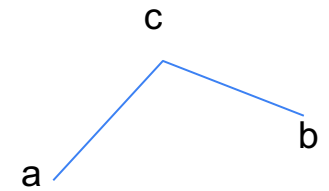
$$T(n) = \begin{cases} O(n^d) & \text{if } (k/b^d) < 1 \\ O(n^d \log n) & \text{if } (k/b^d) = 1 \\ O(n^{\log_b k}) & \text{if } (k/b^d) > 1 \end{cases}$$

Dynamic Programming

Dynamic Programming

High Level Idea: Break a complex problem into smaller (easier) subproblems subject to:

1. Principle of optimality (optimal substructure) –
a substructure of an optimal structure is itself optimal



Example: A subpath of any shortest path is itself a shortest path.

2. Overlapping sub-problems: “many” smaller subproblem are actually the “same” problem

Example: When computing the Fibonacci sequence using the rule:
 $F_n = F_{n-1} + F_{n-2}$, “many” numbers are repeated.

The DP Recipe

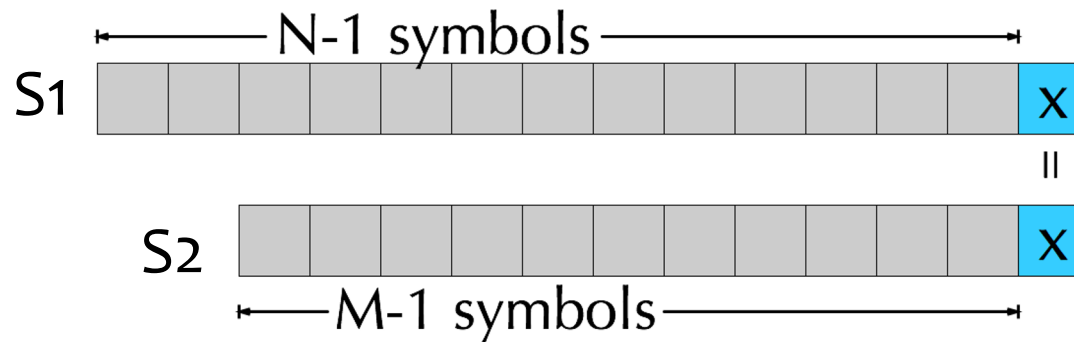
1. Write recurrence ←

usually the trickiest part
2. Size of table: How many dimensions? Range of each dimension?
3. What are the base cases?
4. To fill in a cell, which other cells do I look at? In which order do I fill the table?
5. Which cell(s) contain the final answer?
6. Running time = (size of table) \cdot (time to fill each entry)
7. To reconstruct the solution (instead of just its size) follow arrows from final answer to base case

LCS Recurrence

Part 1: Suppose the last character of S_1 and S_2 are the same
i.e. $S_1[N] = S_2[M]$

Claim. There exists an optimal solution that matches $S_1[N]$ and $S_2[M]$.
Proof.

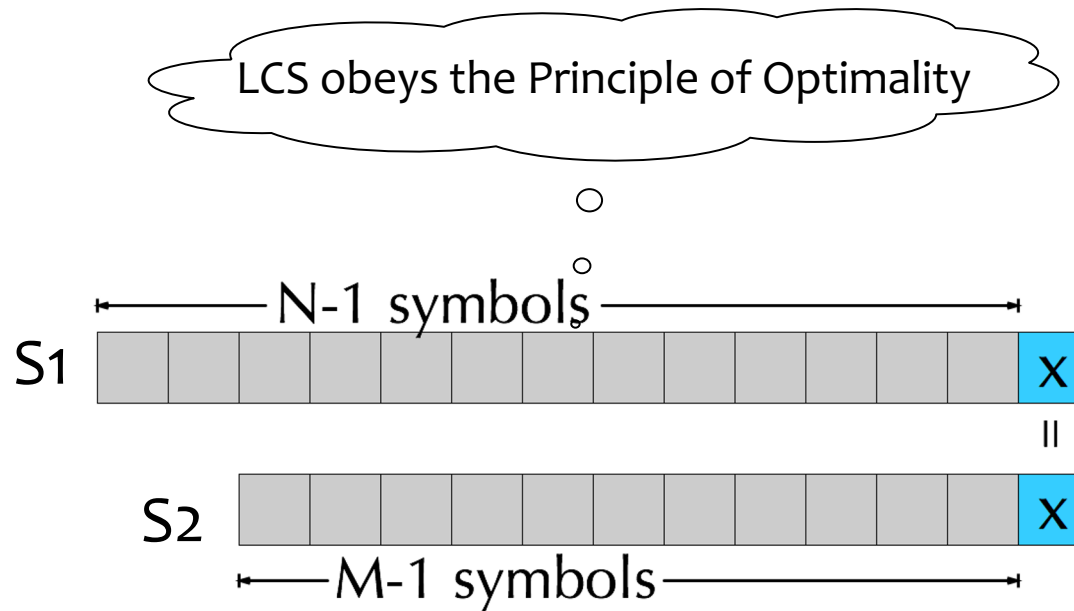


LCS Recurrence

Case 1: Suppose the last character of $S1$ and $S2$ are the same
i.e. $S1[N] = S2[M]$

Claim. There exists an optimal solution that matches $S1[N]$ and $S2[M]$.

$$\text{LCS}(S1[1..N], S2[1..M]) = \text{LCS}(S1[1..N-1], S2[1..M-1]) + 1$$



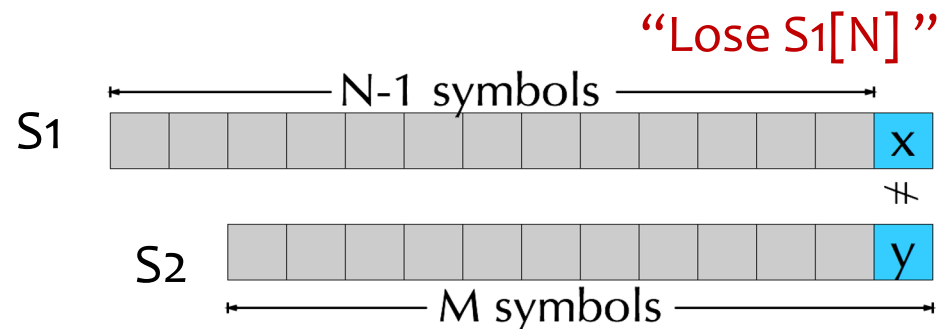
Since there's an optimal solution matching $S1[N]$ and $S2[M]$, we can **safely** add that match to our solution!

LCS Recurrence

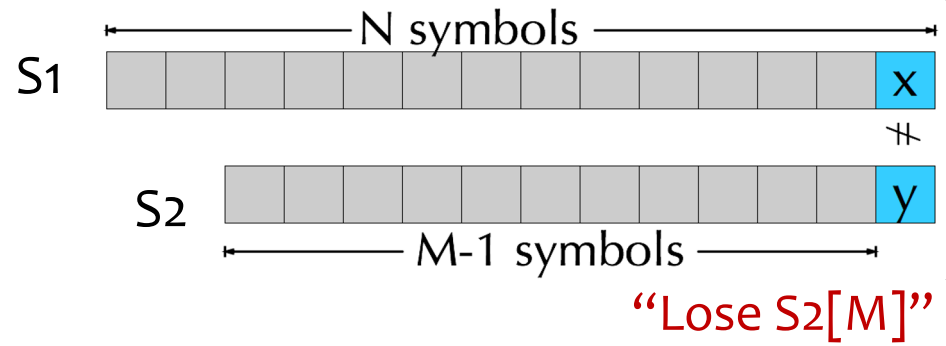
Case 2: The last character of S_1 and S_2 are **not** the same

OPT doesn't have at least one of $S_1[N]$ and $S_2[M]$ (“lose it or lose it”)

$\text{LCS}(S_1[1..N-1], S_2[1..M])$



$\text{LCS}(S_1[1..N], S_2[1..M-1])$



Full Recurrence for LCS

$$\text{LCS}(S1[1..N], S2[1..M]) = \begin{cases} \text{LCS}(S1[1..N-1], S2[1..M-1]) + 1 & \text{if } S1[N] = S2[M] \\ \max \{ \text{LCS}(S1[1..N-1], S2[1..M]), \text{LCS}(S1[1..N], S2[1..M-1]) \} & \text{otherwise} \end{cases}$$

Base cases:

$\text{LCS}(S1[1..i], \emptyset) = 0$ for all i

$\text{LCS}(\emptyset, S2[1..j]) = 0$ for all j

Let's Follow the DP Recipe

S1 = GAC S2 = AGCAT						
	∅	A	G	C	A	T
∅	0	0	0	0	0	0
G	0					
A	0					
C	0					

$LCS(S1[1..N], S2[1..M]) =$

$LCS(S1[1..N-1], S2[1..M-1]) + 1$ if $S1[N] = S2[M]$
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Greedy algorithms

General strategy commonly used for analyzing greedy algorithms:

Proof by induction using an “**exchange**” argument

The idea: Show that we can transform any **optimal solution** into the **solution given by our algorithm** by **exchanging** each piece of it out one-by-one without increasing the cost.

Key part of proof: **Exchange** shows that my greedy choice is **safe** i.e. it is in some optimal solution.

Induction formalizes the idea that *each successive choice* is **safe**.

DFAs and Turing Machines

String notation

Alphabet: A nonempty finite set Σ of symbols.

$\Sigma = \{0,1\}$ is a popular choice.

String: A finite sequence of 0 or more symbols.

(or “word”)

The empty string is denoted ϵ .

For any $a \in \Sigma$:

a^k means k a 's

a^* means ≥ 0 a 's

a^+ means ≥ 1 a 's

Σ^k means all strings over Σ of length k .

Σ^* means **all** (finite) strings over Σ .

Σ^+ means all nonempty (finite) strings over Σ

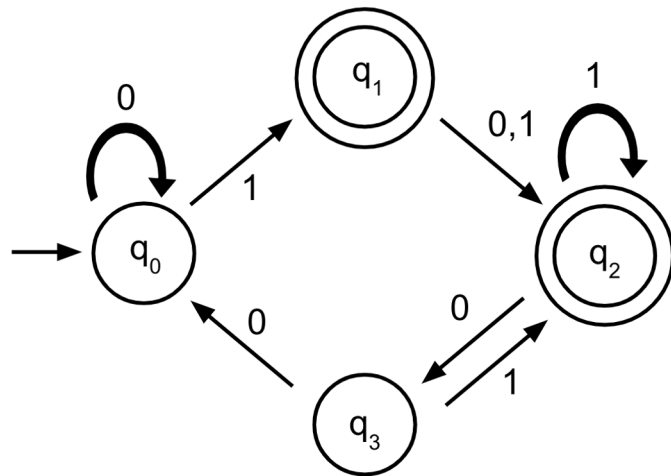
For any $a, b \in \Sigma$: $a|b$ means a OR b

Language: A collection of strings.

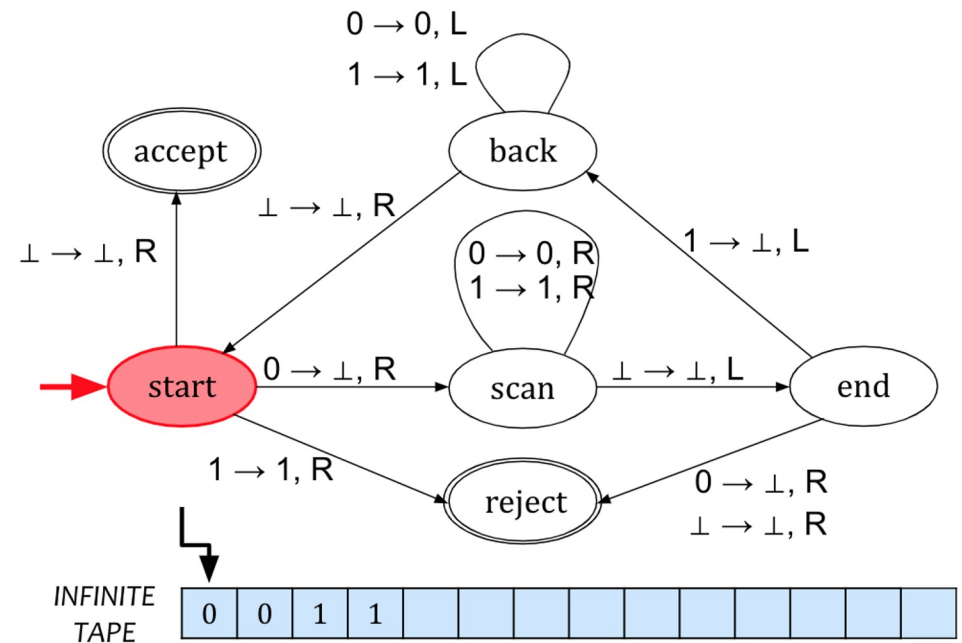
I.e. any subset $L \subseteq \Sigma^*$.

The empty language is denoted \emptyset .

DFA



Turing Machine



Undecidability

Undecidability and Reductions

Question: What are the possible outcomes of a TM **M**?

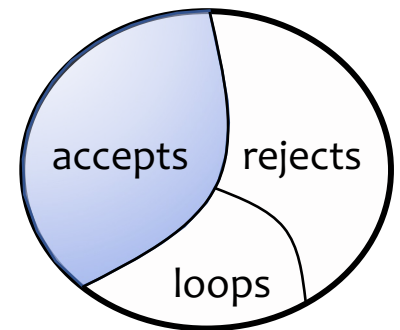
Answer: **M** either (i) accepts, (ii) rejects, or (iii) it “*loops*” (*forever*)

The language of a TM is the set of strings it accepts:

$$L(M) = \{x : M \text{ accepts } x\}$$

Definition: A Turing Machine **M** *decides* a language **L** if it:

1. accepts every string in **L**, and
2. rejects every string not in **L**
(and never loops forever)



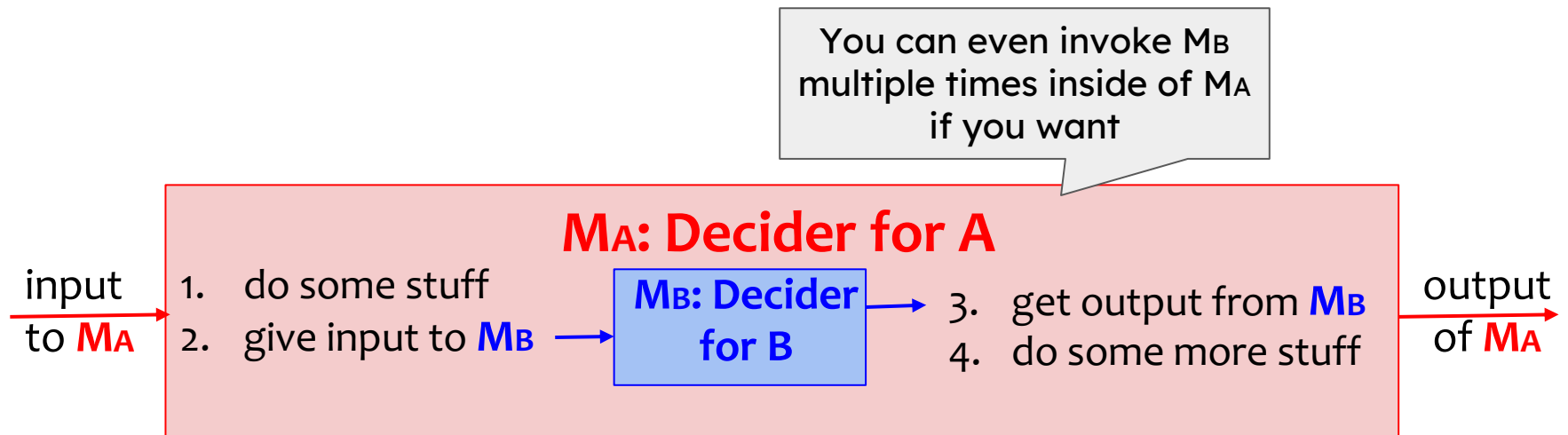
A language **L** is *decidable* if there is a TM that decides **L**.
Otherwise **L** is *undecidable*.

Turing Reduction from **A** to **B** (denoted $A \leq_T B$):

“We can use a black-box decider for **B**
as a subroutine to decide **A**.”

What it implies:

1. If **B** is decidable then **A** is decidable.
2. Contrapositive: If **A** is undecidable then **B** is undecidable.



“Problem **B** is at least as hard as Problem **A**”

New technique:
constructing new machines inside reductions

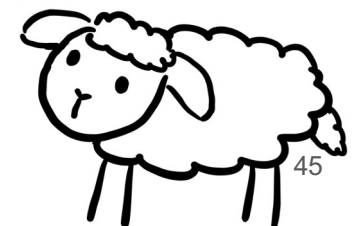
Another Undecidable Language: ϵ -Halting Problem

Input: Turing Machine M

Output: Does M halt when given input ϵ ?

Language: $L_{\epsilon\text{-HALT}} = \{\langle M \rangle : M \text{ halts on input } \epsilon\}$

This time we're only talking about a single input string, and yet it's still undecidable



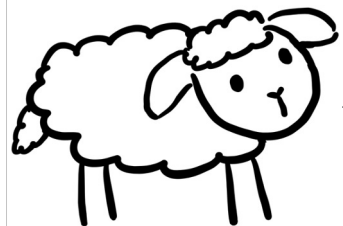
Here's a reduction from $L_{\epsilon\text{-HALT}}$ to L_{HALT} ,
showing $L_{\epsilon\text{-HALT}}$ is undecidable!

$M_{\epsilon\text{-HALT}}(\langle M \rangle)$:

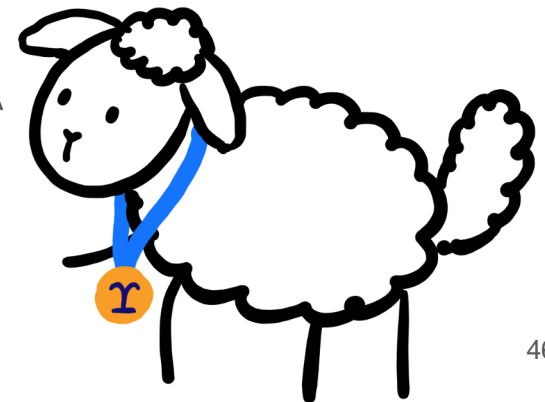
Run $M_{\text{HALT}}(\langle M \rangle, \epsilon)$

If it accepts: accept

If it rejects: reject



Something is
off...



Reduction from L_{HALT} to $L_{\epsilon\text{-HALT}}$ (i.e. $L_{\text{HALT}} \leq_T L_{\epsilon\text{-HALT}}$)

We need to implement:

M_{HALT} takes two inputs: $\langle M \rangle, x$

M halts on input $x \Rightarrow M_{\text{HALT}}$ accepts

M loops on input $x \Rightarrow M_{\text{HALT}}$ rejects

Suppose we have:

$M_{\epsilon\text{-HALT}}$ takes one input: $\langle M' \rangle$

M' halts on input $\epsilon \Rightarrow M_{\epsilon\text{-HALT}}$ accepts

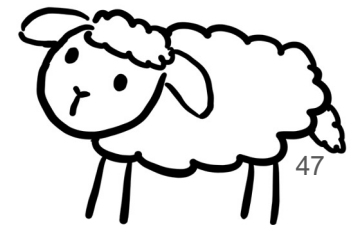
M' loops on input $\epsilon \Rightarrow M_{\epsilon\text{-HALT}}$ rejects

We need to specify the pseudocode:

$M_{\text{HALT}}(\langle M \rangle, x)$:

Run $M_{\epsilon\text{-HALT}}(\langle M \rangle)$ and answer as M_{HALT}

What's wrong with this?



Reduction from L_{HALT} to $L_{\epsilon\text{-HALT}}$ (i.e. $L_{\text{HALT}} \leq_T L_{\epsilon\text{-HALT}}$)

We need to implement:

M_{HALT} takes two inputs: $\langle M \rangle, x$
 M halts on input $x \Rightarrow M_{\text{HALT}}$ accepts
 M loops on input $x \Rightarrow M_{\text{HALT}}$ rejects

Suppose we have:

$M_{\epsilon\text{-HALT}}$ takes one input: $\langle M' \rangle$
 M' halts on input $\epsilon \Rightarrow M_{\epsilon\text{-HALT}}$ accepts
 M' loops on input $\epsilon \Rightarrow M_{\epsilon\text{-HALT}}$ rejects

We need to specify the pseudocode:

$M_{\text{HALT}}(\langle M \rangle, x)$:

Let M_x be a TM that ignores its input and runs $M(x)$

What is next ??

$M_x(w)$:

Run $M(x)$ and answer as M does

Note: We will not run M_x ,
we just constructed it.
Why can't we run M_x ?

Key idea: Construct new machine

We “hardcode” string x into the
“hardware” of the TM M_x .



Reduction from L_{HALT} to $L_{\epsilon\text{-HALT}}$ (i.e. $L_{\text{HALT}} \leq_T L_{\epsilon\text{-HALT}}$)

We need to implement:

M_{HALT} takes two inputs: $\langle M \rangle, x$
 M halts on input $x \Rightarrow M_{\text{HALT}}$ accepts
 M loops on input $x \Rightarrow M_{\text{HALT}}$ rejects

Suppose we have:

$M_{\epsilon\text{-HALT}}$ takes one input: $\langle M' \rangle$
 M' halts on input $\epsilon \Rightarrow M_{\epsilon\text{-HALT}}$ accepts
 M' loops on input $\epsilon \Rightarrow M_{\epsilon\text{-HALT}}$ rejects

We need to specify the pseudocode:

$M_{\text{HALT}}(\langle M \rangle, x)$:

Let M_x be a TM that ignores its input and runs $M(x)$

What is next ??

$M_x(w)$:

Run $M(x)$ and answer as M

We are allowed to use $M_{\epsilon\text{-HALT}}(\langle M' \rangle)$ as a subroutine, with the input of our choice

Reduction from L_{HALT} to $L_{\epsilon\text{-HALT}}$ (i.e. $L_{\text{HALT}} \leq_T L_{\epsilon\text{-HALT}}$)

We need to implement:

M_{HALT} takes two inputs: $\langle M \rangle, x$
 M halts on input $x \Rightarrow M_{\text{HALT}}$ accepts
 M loops on input $x \Rightarrow M_{\text{HALT}}$ rejects

Suppose we have:

$M_{\epsilon\text{-HALT}}$ takes one input: $\langle M' \rangle$
 M' halts on input $\epsilon \Rightarrow M_{\epsilon\text{-HALT}}$ accepts
 M' loops on input $\epsilon \Rightarrow M_{\epsilon\text{-HALT}}$ rejects

We need to specify the pseudocode:

$M_{\text{HALT}}(\langle M \rangle, x)$:

$M_x(w)$:

Run $M(x)$ and answer as M

Let M_x be a TM that ignores its input and runs $M(x)$

Run $M_{\epsilon\text{-HALT}}(\langle M_x \rangle)$ and answer as $M_{\epsilon\text{-HALT}}$

Analysis:

M halts on $x \rightarrow M_x(w)$ halts for all w including $w = \epsilon \rightarrow M_{\epsilon\text{-halt}}(M_x)$ accepts

M loops on $x \rightarrow M_x(w)$ loops for all w including $w = \epsilon \rightarrow M_{\epsilon\text{-halt}}(M_x)$ rejects

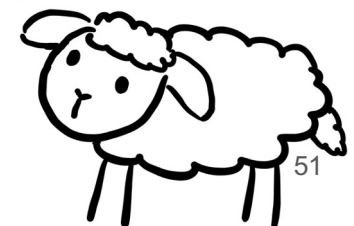
Another Undecidable Language: Empty Language Problem

Input: Turing Machine **M**

Output: Does **M** accept any input string at all?

Language: $L_E = \{ \langle M \rangle \mid M \text{ is a Turing machine and } L(M) = \emptyset \}$

This time we're only
talking about no
input string at all,
and yet it's still
undecidable



Reduction from L_{ACC} to L_E (i.e. $L_{ACC} \leq_T L_E$)

We need to implement:

M_{ACC} takes two inputs: $\langle M \rangle, x$

M accepts input $x \Rightarrow M_{ACC}$ accepts

M rejects input $x \Rightarrow M_{ACC}$ rejects

Suppose we have:

M_E takes one input: $\langle M' \rangle$

$L(M') = \emptyset \Rightarrow M_E$ accepts

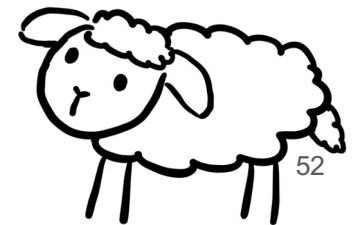
$L(M') \neq \emptyset \Rightarrow M_E$ rejects

We need to specify the pseudocode:

$M_{ACC}(\langle M \rangle, x)$:

Run $M_E(\langle M \rangle)$ and answer as M_{ACC}

What's wrong with this?



Reduction from L_{ACC} to L_E (i.e. $L_{ACC} \leq_T L_E$)

We need to implement:

M_{ACC} takes two inputs: $\langle M \rangle, x$

M accepts input $x \Rightarrow M_{ACC}$ accepts

M rejects input $x \Rightarrow M_{ACC}$ rejects

Suppose we have:

M_E takes one input: $\langle M' \rangle$

$L(M') = \emptyset \Rightarrow M_E$ accepts

$L(M') \neq \emptyset \Rightarrow M_E$ rejects

We need to specify the pseudocode:

$M_{ACC}(\langle M \rangle, x)$:

$M_x(w)$:

Reject if $w \neq x$

else Run $M(x)$ and answer as M does

Let M_x be a TM that rejects all inputs except x and runs $M(x)$

What is next ??

Note: We will not run M_x ,
we just constructed it.
Why can't we run M_x ?

Key idea: Construct new machine

We “hardcode” string x into the
“hardware” of the TM M_x .



Reduction from L_{ACC} to L_E (i.e. $L_{ACC} \leq_T L_E$)

We need to implement:

M_{ACC} takes two inputs: $\langle M \rangle, x$

M accepts input $x \Rightarrow M_{ACC}$ accepts

M rejects input $x \Rightarrow M_{ACC}$ rejects

Suppose we have:

M_E takes one input: $\langle M' \rangle$

$L(M') = \emptyset \Rightarrow M_E$ accepts

$L(M') \neq \emptyset \Rightarrow M_E$ rejects

We need to specify the pseudocode:

$M_{ACC}(\langle M \rangle, x)$:

$M_x(w)$:

Reject if $w \neq x$

else Run $M(x)$ and answer as M does

Let M_x be a TM that rejects all inputs except x and runs $M(x)$

What is next ??

We are allowed to use $M_E(\langle M' \rangle)$ as a subroutine, with the input of our choice

Reduction from L_{ACC} to L_E (i.e. $L_{ACC} \leq_T L_E$)

We need to implement:

M_{ACC} takes two inputs: $\langle M \rangle, x$

M accepts input $x \Rightarrow M_{ACC}$ accepts

M rejects input $x \Rightarrow M_{ACC}$ rejects

Suppose we have:

M_E takes one input: $\langle M' \rangle$

$L(M') = \emptyset \Rightarrow M_E$ accepts

$L(M') \neq \emptyset \Rightarrow M_E$ rejects

We need to specify the pseudocode:

$M_{ACC}(\langle M \rangle, x)$:

Let M_x be a TM that rejects all inputs except x and runs $M(x)$

Run $M_E(\langle M_x \rangle)$ and answer as the opposite of M_E

$M_x(w)$:

Reject if $w \neq x$

else Run $M(x)$ and answer as M does

Analysis:

M accepts $x \rightarrow M_x(w)$ rejects all w except $w = x \rightarrow M_E(M_x)$ rejects

M rejects $x \rightarrow M_x(w)$ rejects all w including $w = x \rightarrow M_E(M_x)$ accepts

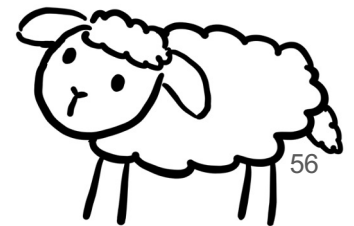
Another Undecidable Language: Regular Language Problem

Input: Turing Machine **M**

Output: Does **M** accept a regular language?

Language: $L_{\text{REGULAR}} = \{ \langle M \rangle \mid M \text{ is a Turing machine and } L(M) \text{ is a regular language} \}$

This time we're talking about a regular language, and it's still undecidable



Reduction from L_{ACC} to L_{REGULAR} (i.e. $L_{\text{ACC}} \leq_T L_{\text{REGULAR}}$)

We need to implement:

M_{ACC} takes two inputs: $\langle M \rangle, x$

M accepts input $x \Rightarrow M_{\text{ACC}}$ accepts

M rejects input $x \Rightarrow M_{\text{ACC}}$ rejects

Suppose we have:

M_{REGULAR} takes one input: $\langle M' \rangle$

$L(M')$ is regular $\Rightarrow M_{\text{REGULAR}}$ accepts

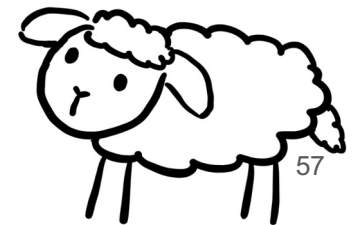
$L(M')$ is not regular $\Rightarrow M_{\text{REGULAR}}$ rejects

We need to specify the pseudocode:

$M_{\text{ACC}}(\langle M \rangle, x)$:

Run $M_{\text{REGULAR}}(\langle M \rangle)$ and answer as M_{ACC}

What's wrong with this?



Reduction from L_{ACC} to L_{REGULAR} (i.e. $L_{\text{ACC}} \leq_T L_{\text{REGULAR}}$)

We need to implement:

M_{ACC} takes two inputs: $\langle M \rangle, x$

M accepts input $x \Rightarrow M_{\text{ACC}}$ accepts

M rejects input $x \Rightarrow M_{\text{ACC}}$ rejects

Suppose we have:

M_{REGULAR} takes one input: $\langle M' \rangle$

$L(M')$ is regular $\Rightarrow M_{\text{REGULAR}}$ accepts

$L(M')$ is not regular $\Rightarrow M_{\text{REGULAR}}$ rejects

We need to specify the pseudocode:

$M_{\text{ACC}}(\langle M \rangle, x)$:

Let M_x be a TM that accepts all inputs $0^n 1^n$ and runs $M(x)$ otherwise

What is next ??

$M_x(w)$:

Accept if $w = 0^n 1^n$

else Run $M(x)$ and answer as M does

Note: We will not run M_x ,
we just constructed it.
Why can't we run M_x ?

Key idea: Construct new machine

We “hardcode” string x into the
“hardware” of the TM M_x .



Reduction from L_{ACC} to L_{REGULAR} (i.e. $L_{\text{ACC}} \leq_T L_{\text{REGULAR}}$)

We need to implement:

M_{ACC} takes two inputs: $\langle M \rangle, x$

M accepts input $x \Rightarrow M_{\text{ACC}}$ accepts

M rejects input $x \Rightarrow M_{\text{ACC}}$ rejects

Suppose we have:

M_{REGULAR} takes one input: $\langle M' \rangle$

$L(M')$ is regular $\Rightarrow M_{\text{REGULAR}}$ accepts

$L(M')$ is not regular $\Rightarrow M_{\text{REGULAR}}$ rejects

We need to specify the pseudocode:

$M_{\text{ACC}}(\langle M \rangle, x)$:

$M_x(w)$:

Accepts if $w = 0^n 1^n$

else Runs $M(x)$ and answer as M does

Let M_x be a TM that accepts all inputs $0^n 1^n$ and runs $M(x)$ otherwise

What is next ??

We are allowed to use $M_E(\langle M' \rangle)$ as a subroutine, with the input of our choice

Reduction from L_{ACC} to L_{REGULAR} (i.e. $L_{\text{ACC}} \leq_T L_{\text{REGULAR}}$)

We need to implement:

M_{ACC} takes two inputs: $\langle M \rangle, x$

M accepts input $x \Rightarrow M_{\text{ACC}}$ accepts

M rejects input $x \Rightarrow M_{\text{ACC}}$ rejects

Suppose we have:

M_{REGULAR} takes one input: $\langle M' \rangle$

$L(M')$ is regular $\Rightarrow M_{\text{REGULAR}}$ accepts

$L(M')$ is not regular $\Rightarrow M_{\text{REGULAR}}$ rejects

We need to specify the pseudocode:

$M_{\text{ACC}}(\langle M \rangle, x)$:

$M_x(w)$:

Accepts if $w = 0^n 1^n$

else Runs $M(x)$ and answer as M does

Let M_x be a TM that accepts all inputs $0^n 1^n$ and runs $M(x)$ otherwise

Run $M_{\text{REGULAR}}(\langle M_x \rangle)$ and answer as M_{REGULAR}

Analysis:

M accepts $x \rightarrow M_x(w)$ accepts all inputs $w \rightarrow M_{\text{REGULAR}}(M_x)$ accepts

M rejects $x \rightarrow M_x(w)$ rejects all inputs except $w = 0^n 1^n \rightarrow M_{\text{REGULAR}}(M_x)$ rejects