

A decorative graphic on the left side of the slide, consisting of a network of white lines and small circles on a dark blue background, resembling a circuit board or a tree structure.

# DECIDABILITY

DISCRETE MATHEMATICS AND THEORY 2

MARK FLORYAN

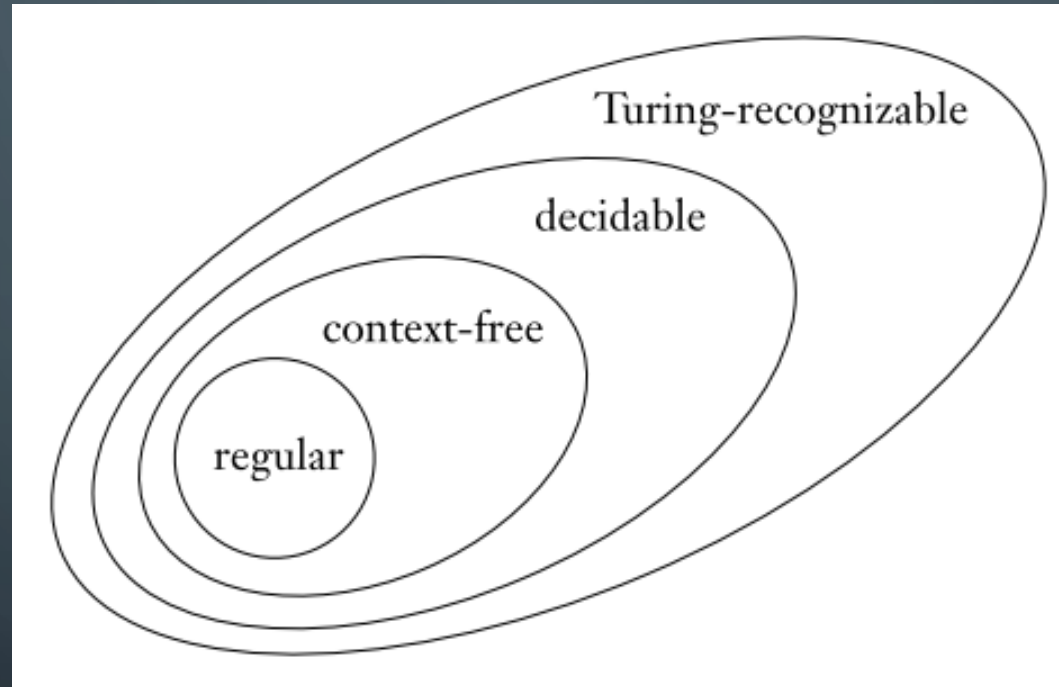
# GOALS!

1. Let's revisit the concept of **decidable languages**, and find some.

2. Let's find some examples of **undecidable languages**, and even some examples of **unrecognizable languages**.

3. Let's introduce the concept of reductions, which can expedite / simplify proofs that certain problems are **undecidable** or **unrecognizable**.

# THE BIG PICTURE!



The background is a dark blue gradient. In the corners, there are decorative white line art elements resembling circuit boards or neural networks, with lines and small circles.

# PART 1: DECIDABLE LANGUAGES

# DECIDABLE LANGUAGES

Recall that a **decidable language** is a language for which a Turing Machine exists that computes it and always halts.

Let's look at a few more decidable languages and eventually start discovering some undecidable languages.

# DECIDABLE LANGUAGES

**Example:**  $A_{DFA} = \{(B, w) \mid B \text{ is a DFA that accepts input string } w\}$

Can you describe a Turing Machine that decides this language?

# DECIDABLE LANGUAGES

**Example:**  $A_{DFA} = \{(B, w) \mid B \text{ is a DFA that accepts input string } w\}$

$M =$  “On input  $\langle B, w \rangle$ :

1. Simulate  $B$  on input  $w$
2. If  $B$  ends in accept state, accept. Otherwise, reject.”

*Let's briefly discuss some of the implementation details involved in this.*

$w$  is finite,  $B$  is also guaranteed to halt. So the simulation must be possible and it must halt.

# DECIDABLE LANGUAGES

**Example:**  $A_{NFA} = \{(B, w) \mid B \text{ is an NFA that accepts input string } w\}$

How about this one? How would you design the machine this time?



# DECIDABLE LANGUAGES

**Example:**  $A_{NFA} = \{(B, w) \mid B \text{ is an NFA that accepts input string } w\}$

N = “On input  $\langle B, w \rangle$ :

1. Convert NFA B into DFA C using procedure given previously.
2. Run Turing Machine M from previous slide on  $\langle C, w \rangle$
3. If M accepts, then accept. Otherwise, reject.”

# MORE DECIDABLE LANGUAGES

All of the following languages are similarly decidable:

$$A_{REX} = \{R, w \mid R \text{ is a reg. exp. that generates } w\}$$

Does a given expression generate this string?

$$E_{DFA} = \{A \mid A \text{ is a DFA and } L(A) = \emptyset\}$$

Is language of the DFA empty?

$$EQ_{DFA} = \{A, B \mid A, B \text{ are DFA} \wedge L(A) = L(B)\}$$

Do two DFAs recognize the same language?

...and analogous languages for Context-Free Grammars (CFGs)

The background is a dark blue gradient. In the corners, there are white line-art illustrations of circuit boards or neural networks, with lines and small circles representing components.

## PART 2: UNDECIDABLE LANGUAGES

# DO UNDECIDABLE LANGUAGES EXIST?

Are there problems that are unsolvable by computers (Turing Machines)?

# DO UNDECIDABLE LANGUAGES EXIST?

*Many of these problems are recognizable, but not decidable.*

Are there problems that are unsolvable by computers (Turing Machines)?

*Yes! In fact, many simple and common problems are undecidable.*

*This has profound philosophical implications in Computer Science. Some things are fundamental limitations that computers cannot overcome.*

# DO UNDECIDABLE LANGUAGES EXIST?

**Theorem:** The language  $A_{TM} = \{(M, w) \mid M \text{ is a TM and } M \text{ accepts } w\}$  is undecidable.

This language *is Turing-Recognizable* though. Here is how:

U = "On input  $\langle M, w \rangle$ :

1. Simulate  $M$  on input  $w$
2. If  $M$  ever accepts, then accept.
3. If  $M$  ever reject, then reject.

Note that if  $M$  loops forever, then so will  $U$

# DO UNDECIDABLE LANGUAGES EXIST?

**Theorem:** The language  $A_{TM} = \{(M, w) \mid M \text{ is a TM and } M \text{ accepts } w\}$  is undecidable.

*Okay, let's prove it.  
Intuitively, what is the  
potential issue here?*

*This is one of the most famous  
proofs in Computer Science*

# DO UNDECIDABLE LANGUAGES EXIST?

**Theorem:** The language  $A_{TM} = \{(M, w) \mid M \text{ is a TM and } M \text{ accepts } w\}$  is undecidable.

Step 1: For the sake of contradiction,  
assume  $A_{TM}$  is decidable

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

If  $A_{TM}$  is decidable, then  
there must exist a machine  
that decides it. Let's call that  
machine  $H$

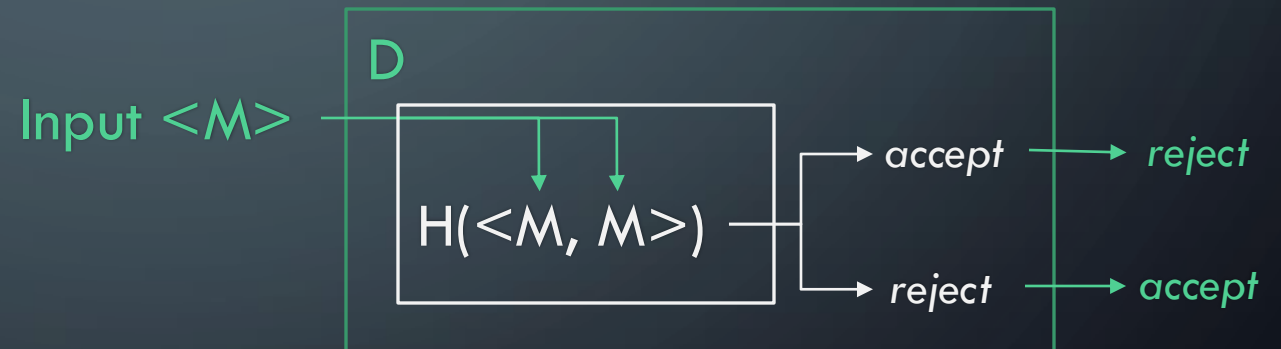


# DO UNDECIDABLE LANGUAGES EXIST?

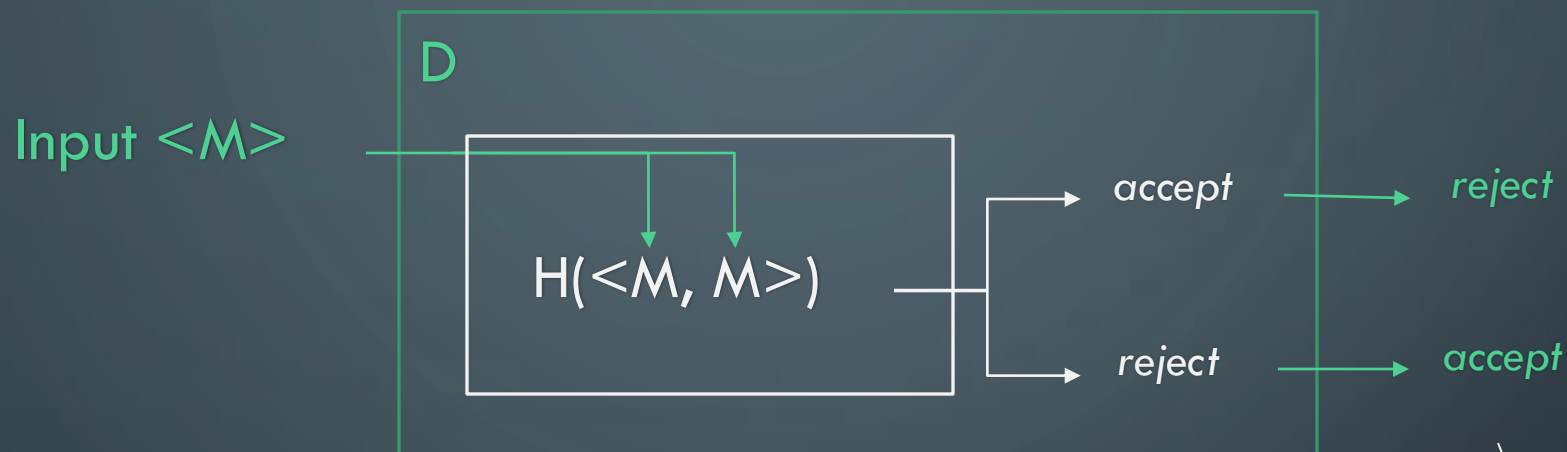
**Theorem:** The language  $A_{TM} = \{(M, w) \mid M \text{ is a TM and } M \text{ accepts } w\}$  is undecidable.

Step 2: Construct a new machine  $D$  that uses  $H$  as a subroutine.

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



# SOME COMMENTS ON MACHINE D

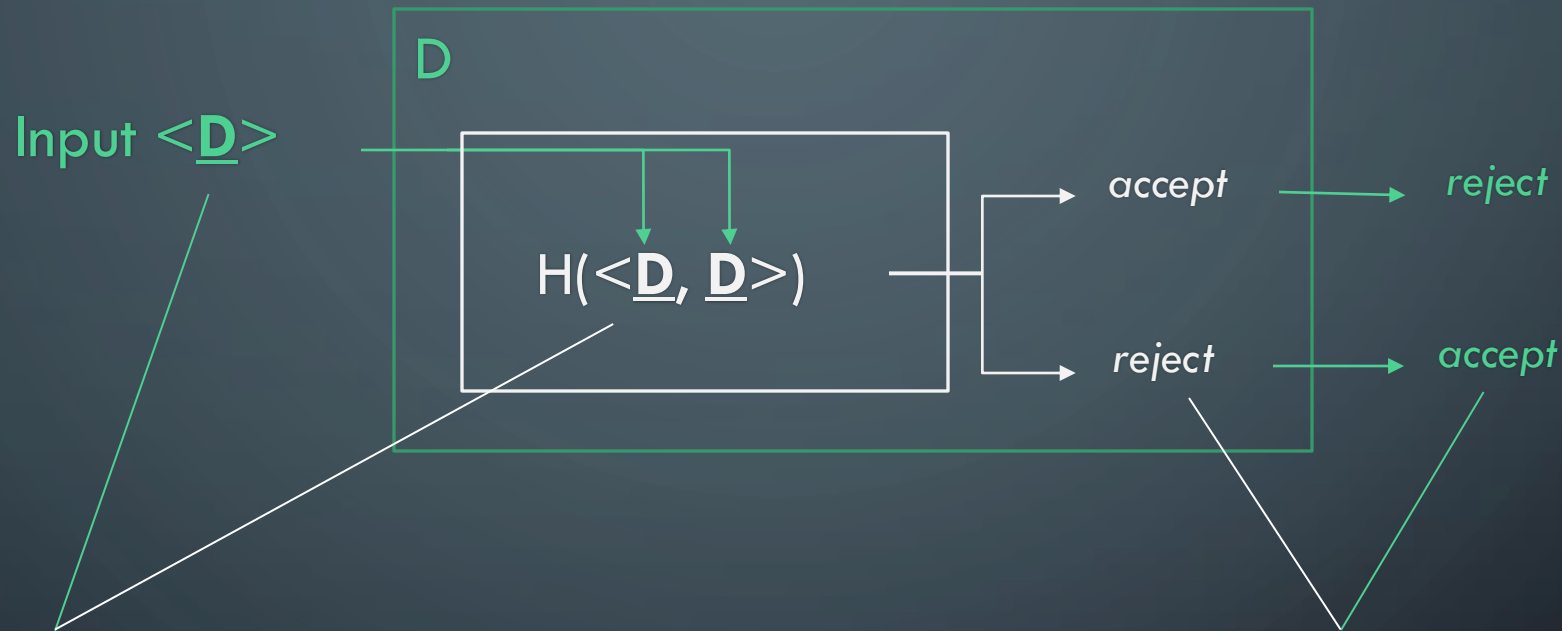


*What does it mean to run a machine with itself as input?  
Is this even possible?*

*Notice that we flip the output here. This will be important for creating the contradiction*

# SOME COMMENTS ON MACHINE D

Step 3: Run the machine  $D$  with itself ( $D$ ) as input. What happens?

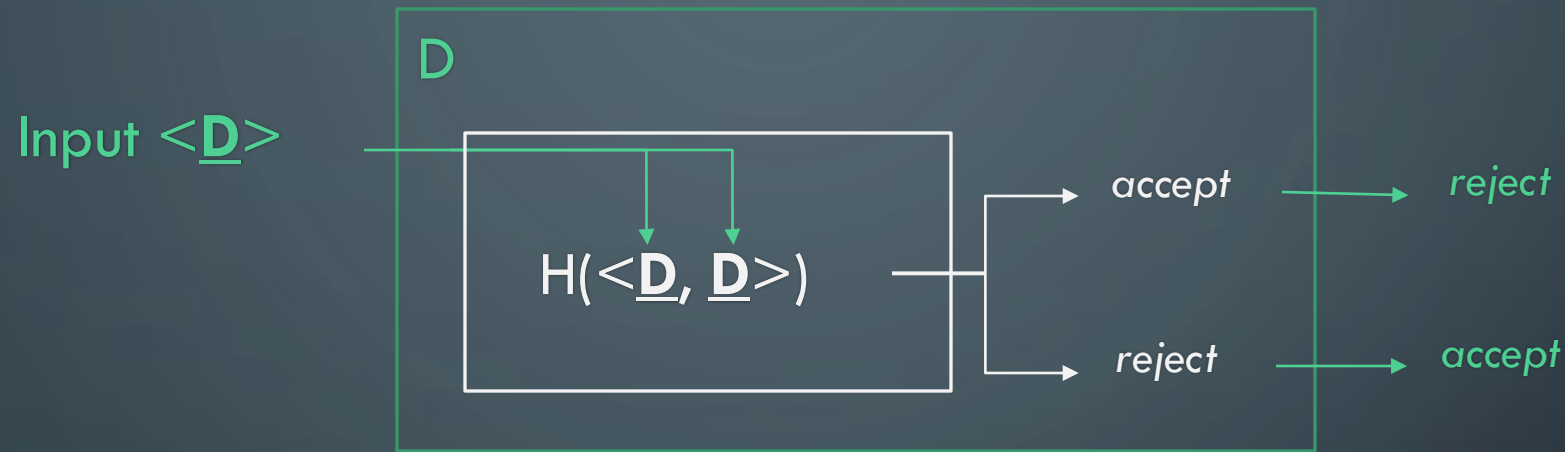


Notice that  $D$  is running with itself as input in two places, once overall (green square) and once simulated inside of  $H$

Which means these outputs should match because they are the output of the exact same thing ( $D$  running on  $D$  as input)

# SOME COMMENTS ON MACHINE D

Step 3: Run the machine  $D$  with itself ( $D$ ) as input. What happens?



Q.E.D.: This is a contradiction because if  $H$  exists ( $A_{TM}$  is decidable), then there is at least one set of inputs where  $H$  produces the wrong answer (well, it cannot produce the right answer by definition).

# DO UNDECIDABLE LANGUAGES EXIST?

This is really a proof by diagonalization

	$\langle M_1 \rangle$	$\langle M_2 \rangle$	$\langle M_3 \rangle$	$\langle M_4 \rangle$	$\dots$	$\langle D \rangle$	$\dots$
$M_1$	<u>accept</u>	reject	accept	reject		accept	
$M_2$	accept	<u>accept</u>	accept	accept	$\dots$	accept	$\dots$
$M_3$	reject	reject	<u>reject</u>	reject		reject	
$M_4$	accept	accept	reject	<u>reject</u>		accept	
$\vdots$			$\vdots$		$\ddots$		
$D$	reject	reject	accept	accept		<u>?</u>	
$\vdots$			$\vdots$				$\ddots$

# DO UNDECIDABLE LANGUAGES EXIST?

This is really a proof by diagonalization

Each entry is a machine's output when another machine's description is given as input

	$\langle M_1 \rangle$	$\langle M_2 \rangle$	$\langle M_3 \rangle$	$\langle M_4 \rangle$	...	$\langle D \rangle$	...
$M_1$	<u>accept</u>	reject	accept	reject		accept	
$M_2$	accept	<u>accept</u>	accept	accept	...	accept	...
$M_3$	reject	reject	<u>reject</u>	reject		reject	
$M_4$	accept	accept	reject	<u>reject</u>		accept	
$\vdots$			$\vdots$		$\ddots$		
$D$	reject	reject	accept	accept		<u>?</u>	
$\vdots$			$\vdots$				$\ddots$

But this entry has to be both accept and reject at the same time, leading to the contradiction

$D$  is defined to be the machine that has the opposite output from the corresponding diagonal (see green outlines)

# DO UNDECIDABLE LANGUAGES EXIST?

**Theorem:** The language  $A_{TM} = \{(M, w) \mid M \text{ is a TM and } M \text{ accepts } w\}$  is undecidable.

Thus it is proven, and there is at least one undecidable language

## PART 3: NON-RECOGNIZABLE LANGUAGES?



# NON-TURING RECOGNIZABILITY?

Is it possible to find languages that are NOT Turing recognizable?

Yes, but we will need to discuss  
the idea of the complement of  
a language first.

# DEFINITION: COMPLEMENT OF A LANGUAGE

The **complement** of a language  $\mathcal{L}$  is the set of strings that do NOT belong to  $\mathcal{L}$ .  
In other words,  $\overline{\mathcal{L}(A)} = \{x \in A \mid x \notin \mathcal{L}(A)\}$

Some Examples:

$\mathcal{L}(A)$

Strings containing less than ten 1's

DFA  $\langle D \rangle$  accepts string  $\langle w \rangle$

TM  $\langle M \rangle$  halts on input  $\langle w \rangle$

$\overline{\mathcal{L}(A)}$

Strings containing ten or more 1's

DFA  $\langle D \rangle$  rejects string  $\langle w \rangle$

TM  $\langle M \rangle$  loops forever on input  $\langle w \rangle$

# MORE ON COMPLEMENTS

TM  $\langle M \rangle$  halts on input  $\langle w \rangle$

Some Turing Machine  
Executes on input / tape

**Accept**: *Input on tape is in language*

**Reject**: *Input on tape is NOT in language*

**Loop**: *TM runs forever, never reaching accept or reject state*

In language above, Accepts (Yes) is easy because if machine halts we are sure it is a Yes

However, detecting the Looping Forever case is difficult to ascertain. Is the machine just taking a long time?

# MORE ON COMPLEMENTS

TM  $\langle M \rangle$  loops forever on input  $\langle w \rangle$

Some Turing Machine  
Executes on input / tape

```
graph LR; A[Some Turing Machine Executes on input / tape] --> B["Accept: Input in language"]; A --> C["Reject: Input Not in language"]; A --> D["Loop: TM runs forever"];
```

Accept: Input in language

Reject: Input Not in language

Now, Rejecting (No) is easy. If we halt then we output Reject (No).

Loop: TM runs forever

Now, distinguishing between Halt (Yes) and Looping Forever is hard. Is the machine just taking a long time and we should really reject or is it actually looping forever?

# CO-TURING RECOGNIZABLE

A language  $\mathcal{L}$  is **co-Turing recognizable** iff the complement  $\bar{\mathcal{L}}$  is Turing recognizable.

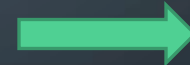
$\mathcal{L}(A)$

TM  $\langle M \rangle$  loops  
forever on input  $\langle w \rangle$



$\overline{\mathcal{L}(A)}$

TM  $\langle M \rangle$  halts on  
input  $\langle w \rangle$



Is recognizable  
as shown earlier

# ANOTHER WAY TO DEFINE DECIDABILITY

**Theorem**: A language is decidable if and only if it is Turing-recognizable and it is co-Turing-recognizable

How to prove this?

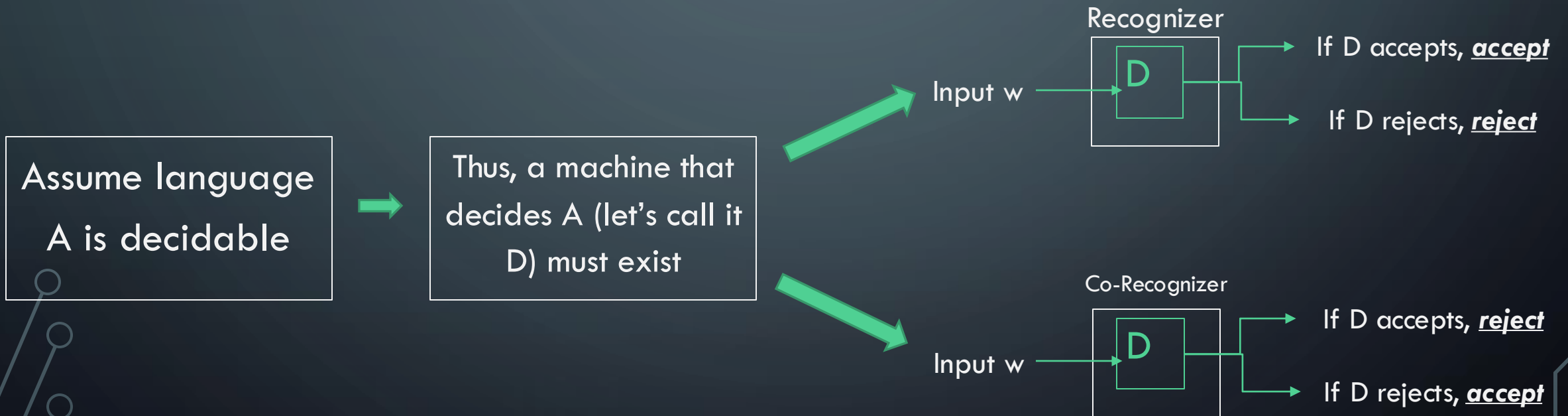
**Direction 1**: If language is decidable  $\rightarrow$  It is T-Rec. and Co-T-Rec.

**Direction 2**: If language is T-Rec. and Co-T-Rec.  $\rightarrow$  It is decidable

# PROVING THE THEOREM

**Theorem:** A language is decidable if and only if it is Turing-recognizable and it is co-Turing-recognizable

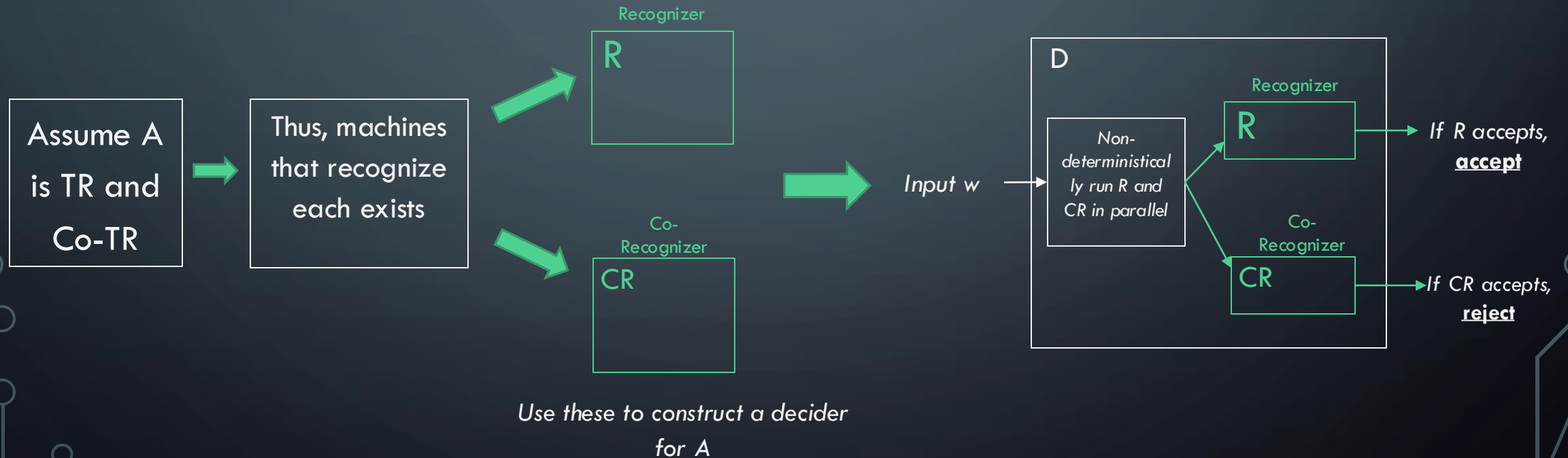
**Direction 1:** If language is decidable  $\rightarrow$  It is T-Rec. and Co-T-Rec.



# PROVING THE THEOREM

**Theorem:** A language is decidable if and only if it is Turing-recognizable and it is co-Turing-recognizable

**Direction 2:** If language is T-Rec. and Co-T-Rec.  $\rightarrow$  It is decidable





# UNRECOGNIZABILITY!

Finally ready to find an unrecognizable language

**Theorem:**  $\overline{A_{TM}}$  is unrecognizable.

Recall that  $A_{TM} = \{(M, w) \mid M \text{ is a TM and } M \text{ accepts } w\}$ , thus:

$\overline{A_{TM}} = \{(M, w) \mid M \text{ is a TM and } M \text{ rejects } w \text{ or loops forever}\}$

# UNRECOGNIZABILITY!

Finally ready to find an unrecognizable language

**Theorem:**  $\overline{A_{TM}}$  is unrecognizable.

Can you prove it?

Assume for sake of contradiction that  $\overline{A_{TM}}$  is recognizable

This means that  $\overline{A_{TM}}$  (assumed) and  $A_{TM}$  (proven earlier) are both recognizable

Thus,  $A_{TM}$  is decidable by earlier theorem (both it and complement are recognizable)

**Contradiction!  $A_{TM}$  is undecidable as proven earlier.**

The background is a dark blue gradient. In the corners, there are white line-art illustrations of circuit boards or neural networks, with lines and small circles representing components.

## PART 4: INTRODUCTION TO REDUCIBILITY

# WHAT IS REDUCIBILITY?

**Reduction**: A process through which problems are related to one another through comparison. This comparison establishes that one problem can be solved if the other is.

**Problem A**: Enter Japan during Covid

Get Covid Visa Exception

Book ticket(s)

Travel on plane, etc.

Go visit Obaachan

This one was hard!

These are all easy!

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Reduces to

**Problem B**: Get Covid Visa Exception.

Retrieve Marriage Paperwork  
(Japan)

Acquire invite from citizen

Bring paperwork to embassy in DC

...

Now this one  
is hard!

# WHAT IS REDUCIBILITY?

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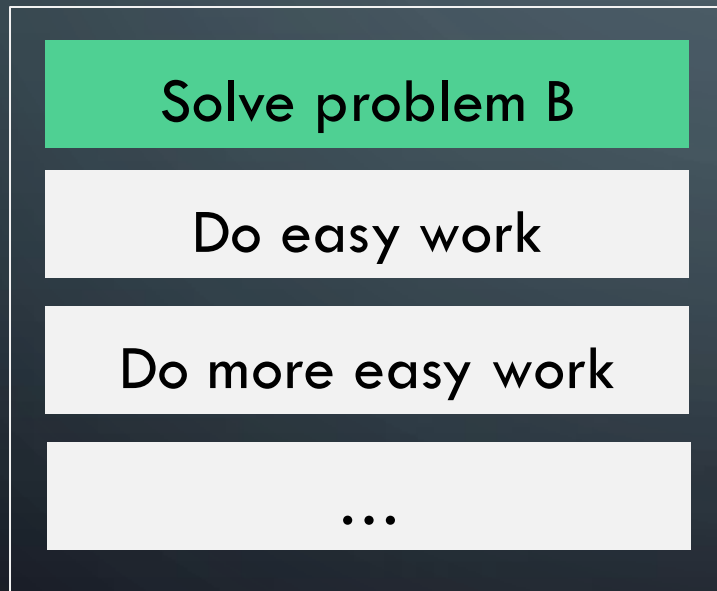
...

**Question:** What if it is a **FACT** that “Problem A: Enter Japan During Covid” is impossible to accomplish? What can you then conclude is also impossible? Why?

# REDUCTION PROCESS

**Reduction**: A reduction exists between problems **A** and **B** if a solution to **B** can be used to develop a solution for **A**.

Problem A



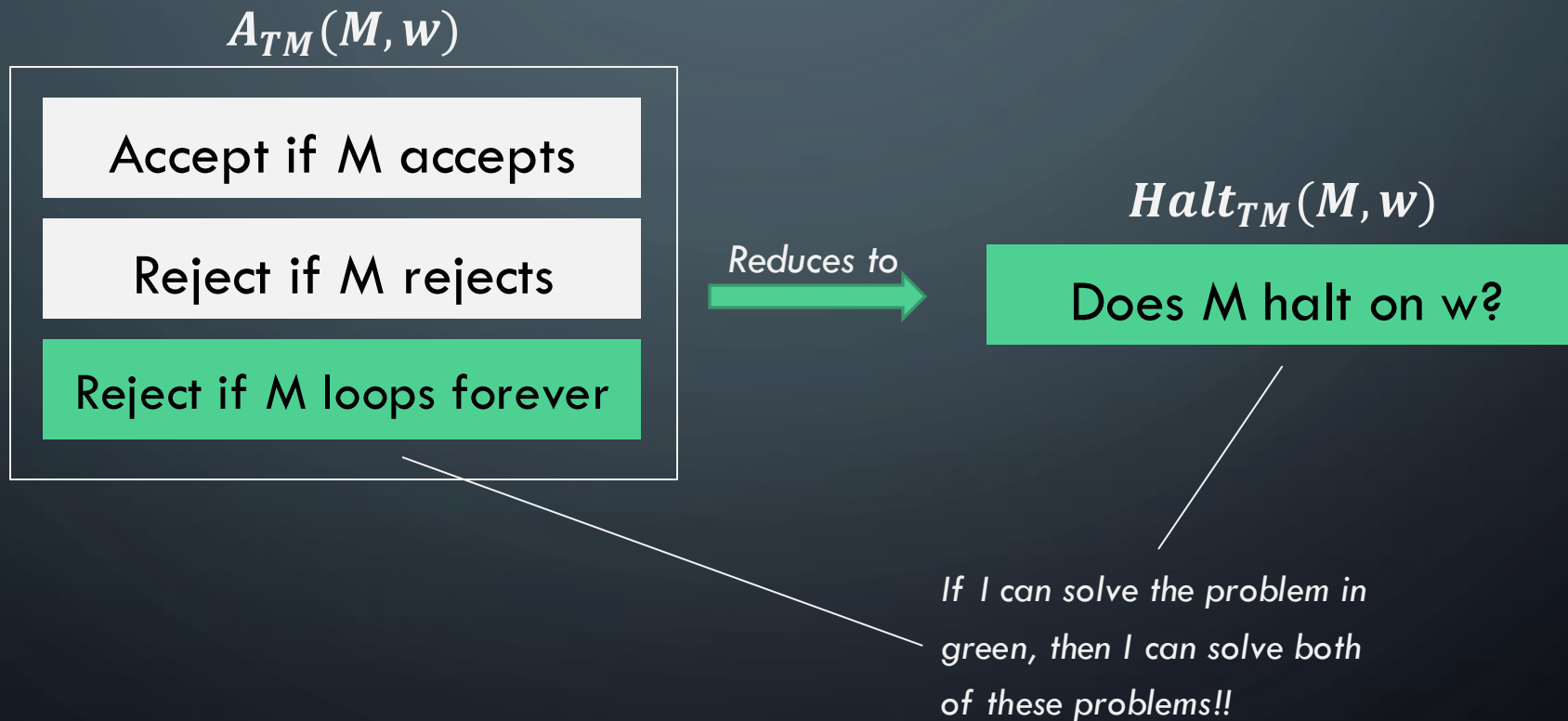
Reduces to

Problem B

Solve problem B

# THE HALTING PROBLEM

**The Halting Problem:** Given a Turing machine, does it halt:  
 $Halt_{TM} = \{(M, w) \mid M \text{ is a TM and } M \text{ halts on input } w\}$





# THE HALTING PROBLEM

$A_{TM}(M, w)$

Accept if  $M$  accepts

Reject if  $M$  rejects

Reject if  $M$  loops forever

Reduces to

$Halt_{TM}(M, w)$

Does  $M$  halt on  $w$ ?

Assume for the sake of contradiction, that  $Halt_{TM}$  is decidable. Thus, some machine  $R$  exists that decides it.

Machine  $M$ , on input  $w$ :

- Invoke  $R$  on  $(M, w)$  to see if  $M$  halts. If not, reject.
- Else simulate  $M$  on input  $w$ :
  - If  $M$  accepts, then accept.
  - If  $M$  rejects, then reject.

Then, this machine would decide  $A_{TM}$ , but that contradicts our theorem that  $A_{TM}$  is undecidable. Thus,  $halt$  is also undecidable

# THE HALTING PROBLEM

**Theorem:**  $\text{Halt}_{TM}$  is undecidable

*Proof was simplified by using a  
proof by contradiction via a valid  
reduction from  $A_{TM}$*

# TM EMPTINESS TESTING

**Emptiness Test:** Can you use a similar reduction to show  $E_{TM}$  is undecidable?

$$E_{TM} = \{M \mid M \text{ is a TM and } L(M) = \emptyset\}$$

In other words, test  
whether the given  
machine never accepts

# TM EMPTINESS TESTING

**Emptiness Test**: Can you use a similar reduction to show  $E_{TM}$  is undecidable?

$$E_{TM} = \{M \mid M \text{ is a TM and } L(M) = \emptyset\}$$

*Step 0: Assume, for sake of contradiction, a machine  $R$  decides  $E_{TM}$*

*Step 1: Modify  $M$ :*

**$M_1$  = “on input  $x$ :**  
**if  $x \neq w$ , reject**  
**otherwise, run  $M$  on  $w$ , accept iff  $M$  does“**

*\*Notice that  $w$  is  
hardcoded into  
description of  $M_1$*

*Why is this  
helpful?*

# TM EMPTINESS TESTING

**Emptiness Test:** Can you use a similar reduction to show  $E_{TM}$  is undecidable?

$$E_{TM} = \{M \mid M \text{ is a TM and } L(M) = \emptyset\}$$

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*Step 1: Modify  $M$ :*

**$M_1$  = “on input  $x$ :**  
**if  $x \neq w$ , reject**  
**otherwise, run  $M$  on  $w$ , accept iff  $M$  does“**

Key Idea:  $M_1$  can  
**only** accept  $w$

*Step 2: Solve  $A_{TM}$*

**$S$  = “on input  $(M, w)$ :**  
**Construct  $M_1$  as described**  
**Run  $R$  on input  $M_1$**   
**Flip the output of  $R$ “**

So, testing emptiness on  $M_1$  =  
testing acceptance of  $M$  on  $w$

# TM EMPTINESS TESTING

**Emptiness Test:** Can you use a similar reduction to show  $E_{TM}$  is undecidable?

$$E_{TM} = \{M \mid M \text{ is a TM and } L(M) = \emptyset\}$$

*Thus,  $E_{TM}$  is undecidable via reduction from  $A_{TM}$ !!*

# ONE MORE EXAMPLE

**Regular?**: Prove this language is undecidable through reduction.

$$Reg_{TM} = \{M \mid M \text{ is a TM and } L(M) \text{ is a regular language}\}$$

If we can decide this,  
can we use it to  
decide  $A_{TM}$ ?

Similar idea!  
Construct a machine  
that recognizes non-  
regular languages

# ONE MORE EXAMPLE

**Regular?**: Prove this language is undecidable through reduction.

$$Reg_{TM} = \{M \mid M \text{ is a TM and } L(M) \text{ is a regular language}\}$$

Step 0: For sake of contradiction, assume  $Reg_{TM}$  is decidable, thus a machine  $R$  exists that decides it.

Similar idea!  
Construct a machine  
that recognizes non-  
regular languages

Step 1: Construct  $M_2$ :

$M_2 =$  “on input  $x$ :  
if  $x$  has form  $0^n 1^n$ , accept  
else, run  $M$  on  $w$  and accept iff  $M$  accepts”



# ONE MORE EXAMPLE

**Regular?**: Prove this language is undecidable through reduction.

$$Reg_{TM} = \{M \mid M \text{ is a TM and } L(M) \text{ is a regular language}\}$$

Step 0: For sake of contradiction, assume  $Reg_{TM}$  is decidable, thus a machine  $R$  exists that decides it.

**Observe:**

If  $M$  accepts  $w$ , then  $M_2$  accepts  $\Sigma^*$

If  $M$  rejects/loops  $w$ , then  $M_2$  accepts  $0^n 1^n$

Step 1: Construct  $M_2$ :

**$M_2$  = “on input  $x$ :**

**if  $x$  has form  $0^n 1^n$ , accept**

**else, run  $M$  on  $w$  and accept iff  $M$  accepts“**

# ONE MORE EXAMPLE

**Regular?**: Prove this language is undecidable through reduction.

$$Reg_{TM} = \{M \mid M \text{ is a TM and } L(M) \text{ is a regular language}\}$$

Step 0: For sake of contradiction, assume  $Reg_{TM}$  is decidable, thus a machine  $R$  exists that decides it.

Step 2: Recognize  $A_{TM}$

**$S =$  on input  $(M, w)$ :**

**Construct  $M_2$  as described earlier**

**Run  $R$  on  $M_2$**

**Accept IFF  $R$  accepts**

Why does this work?

$L(M_2)$  will be regular if  
 $M$  accepts  $w$ ?