



# CS311: Computational Theory

*Lecture 11: Decidability– Ch 4*



# Lecture Learning Objectives

1. *Understand Computability Theory*

# The HELLO WORLD assignment

- *Suppose your teacher tells you:*
  - *Write a JAVA program to output the word “HELLO WORLD” on the screen and halt.*
- *Space and time are not an issue.*
- *The program is for an ideal computer.*
- *PASS for any working HELLO program, no partial credit.*



# Teacher's Grading Program

- *The grading program  $G$  must be able to take any Java program  $P$  and grade it.*

*Pass, if  $P$  prints "HELLO WORLD"*

- $G(P) = \begin{cases} \text{Pass, if } P \text{ prints "HELLO WORLD"} \\ \text{Fail, otherwise.} \end{cases}$

*How exactly might such a script work?*

What kind of program could a student who hated his/her teacher hand in?



# Nasty Program

*$n:=2;$*

*While (the number  $2n$  can be written as the sum of two primes)*

*$n++;$*

*Print "HELLO WORLD";*

Despite the simplicity of the HELLO WORLD assignment, there is no program

- *The nasty program is a PASS if and only if the Goldbach conjecture is false.*



# Theory of Computation

- *The theory of computation studies*
  - *whether (computability theory or recursion theory),*
  - *and how efficiently (complexity theory)*
- *certain problems can be solved on a computer, or rather on a model of a computer.*
- *Several equivalent models of computational devices can be used:*
  - *Register machines.*
  - *Lambda calculus.*
  - *Simple while programming language (pseudo-code).*
  - *Turing machines.*
  - *...*
- *We focus on Turing machines.*



# Computability

- *Do algorithmic solutions to problems always exist?*
- *What are the limitations of computational devices?*
- *Is there any insight to which problems are algorithmically solvable and which are not?*
- *Are the unsolvable problems somehow related?*



# Complexity (CS312)

- *How do we compare the efficiency of different algorithms?*
- *How do we measure time/memory requirements?*
- *What problems are efficiently solvable?*
- *Are there solvable problems which do not have efficient algorithms?*

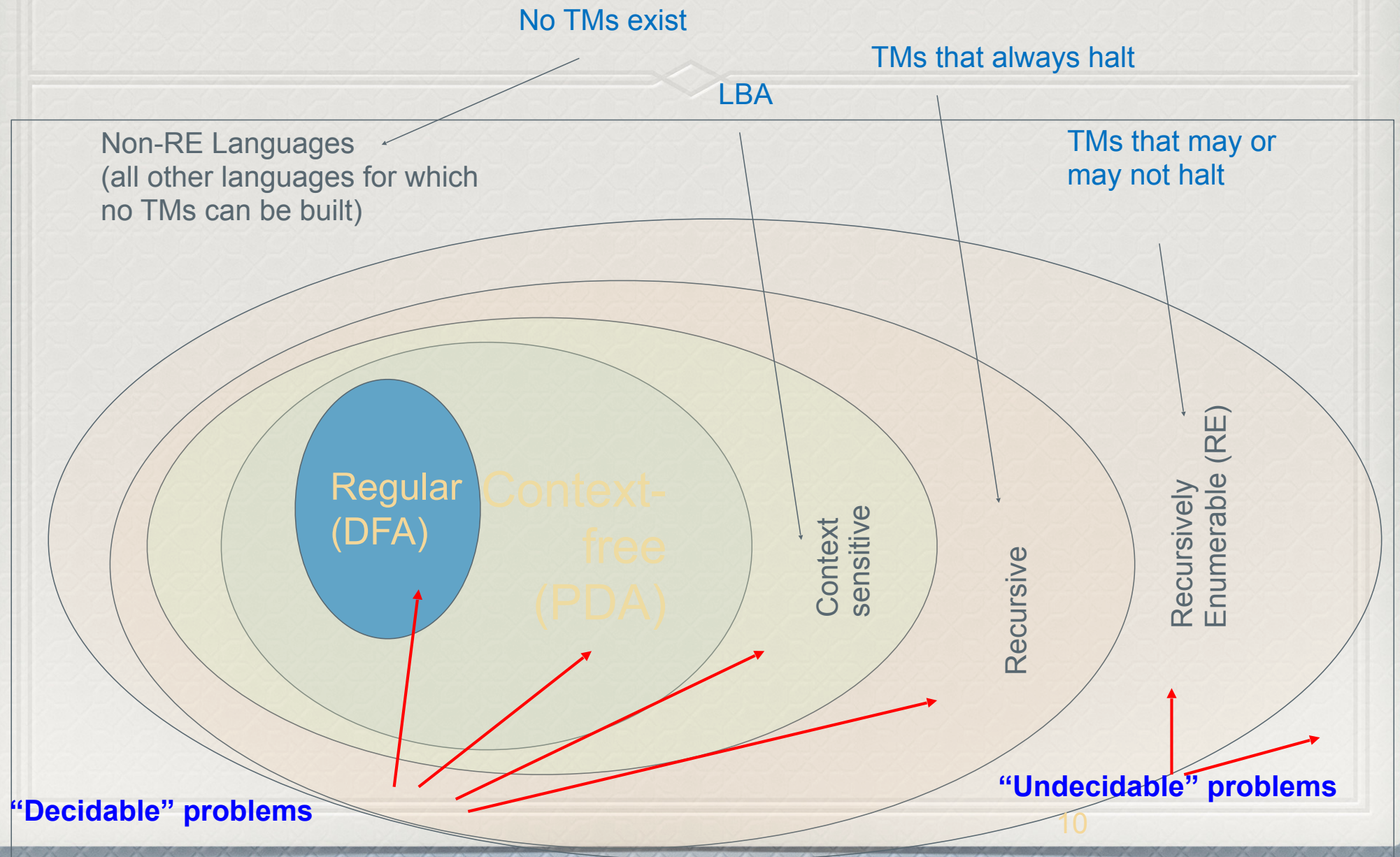


# Decidability vs. Undecidability

- *There are two types of TMs (based on halting):*
  - (Recursive)*  
*TMs that always halt, no matter accepting or non-accepting =*  
**DECIDABLE PROBLEMS**
  - (Recursively enumerable)*  
*TMs that are guaranteed to halt only on acceptance. If non-accepting, it may or may not halt (i.e., could loop forever).*
- **Undecidability:**
  - *Undecidable problems are those that are not recursive*



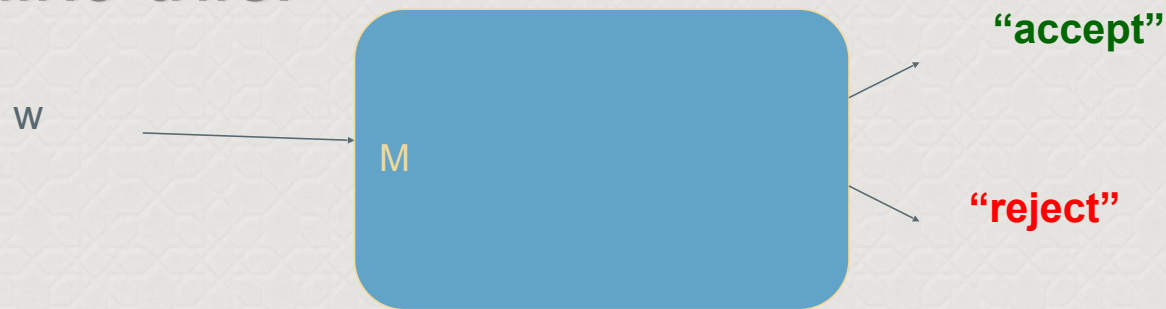
# Recursive, RE, Undecidable languages





# Recursive Languages & Recursively Enumerable (RE) languages

- Any TM for a Recursive language is going to look like this:



- Any TM for a Recursively Enumerable (RE) language is going to look like this:





# Recognizable and Decidable Languages

- **(Language of  $M$ ):** The language recognized by a TM  $M$ , or simply the language of  $M$  is  $L(M) = \{w \in \Sigma^* \mid M \text{ accepts } w\}$ .
- **(Recognizable Language):** A language  $L \subseteq \Sigma^*$  is recognizable if there exists a TM  $M$  such that  $M$  recognizes  $L$ , i.e.,  $L = L(M)$ .
- **(Decidable Language):** A language  $L \subseteq \Sigma^*$  is decidable if there exists a TM  $M$  such that  $M$  is a decider and  $M$  recognizes  $L$ , i.e.,  $L = L(M)$ .



# Example

- Consider the language  $L = \{a^n b^n c^n \mid n \geq 0\}$ .
- *Facts:*
  - $L$  is not regular,
  - $L$  is not context-free, but
  - $L$  is recognizable and even decidable language.



# Exam Questions

- *Definition of a Turing machine, configuration, computation, acceptance of a string by a TM.*
- *Definition of a decider.*
- *Definition of recognizable and decidable languages.*

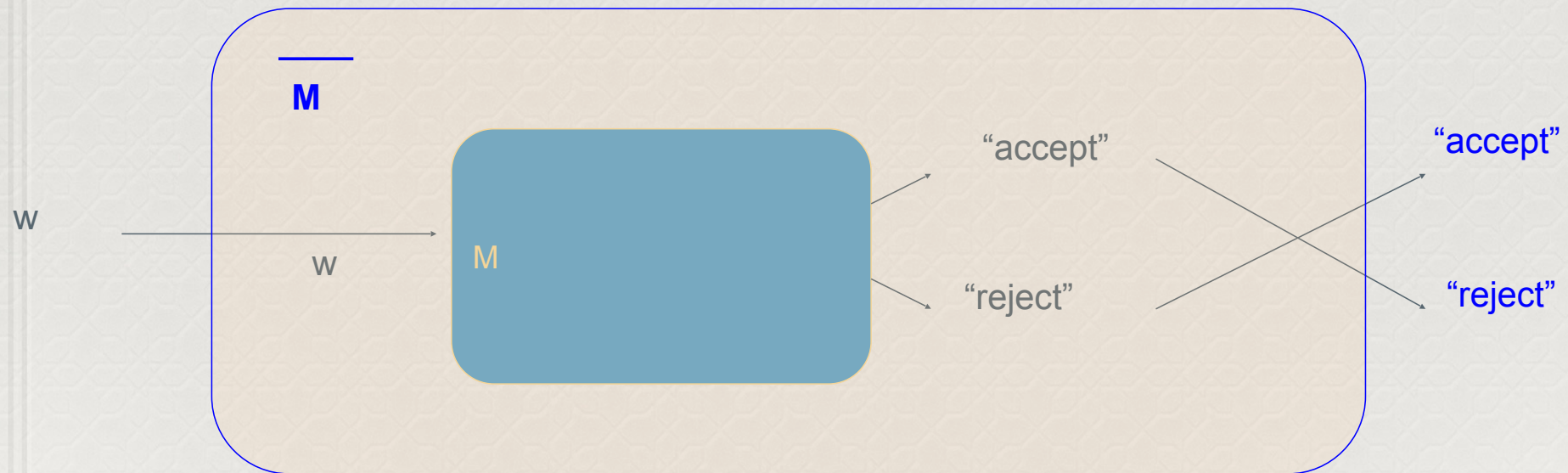


- Closure Properties of:**
- the Recursive language class, and**
  - the Recursively Enumerable language class**



# Recursive Languages are closed under complementation

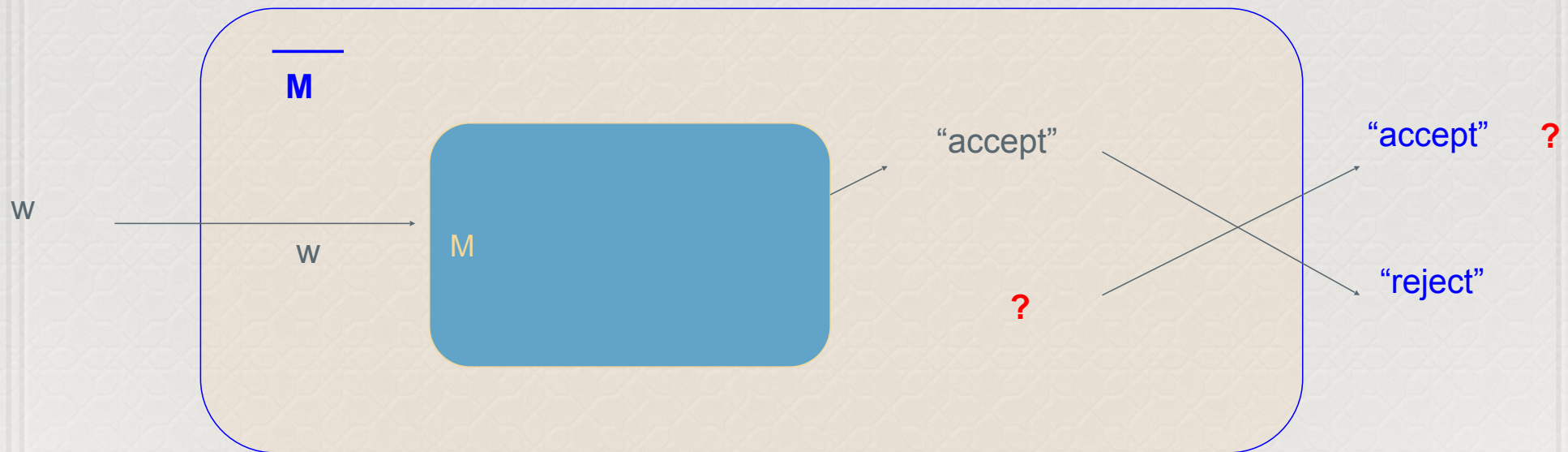
- *If  $L$  is Recursive,  $\bar{L}$  is also Recursive*





# Are Recursively Enumerable Languages closed under complementation? (NO)

- If  $L$  is RE,  $L$  need not be RE



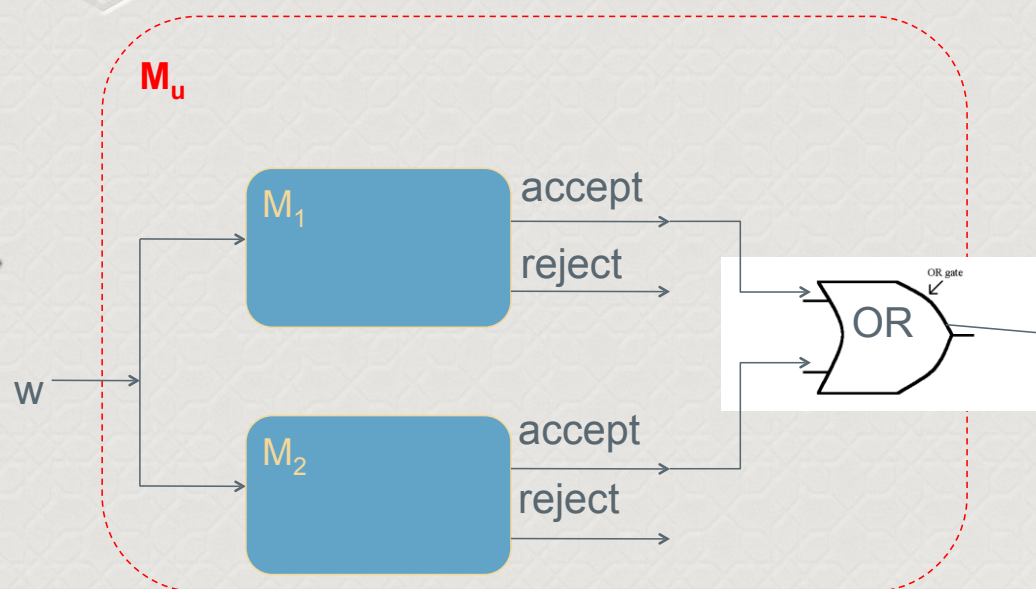


# Recursive Langs are closed under Union

Let  $M_u = \text{TM for } L_1 \cup L_2$

$M_u$  construction:

1. Make 2-tapes and copy input  $w$  on both tapes
2. Simulate  $M_1$  on tape 1
3. Simulate  $M_2$  on tape 2
4. If either  $M_1$  or  $M_2$  accepts, then  $M_u$  accepts  
– Otherwise,  $M_u$  rejects.



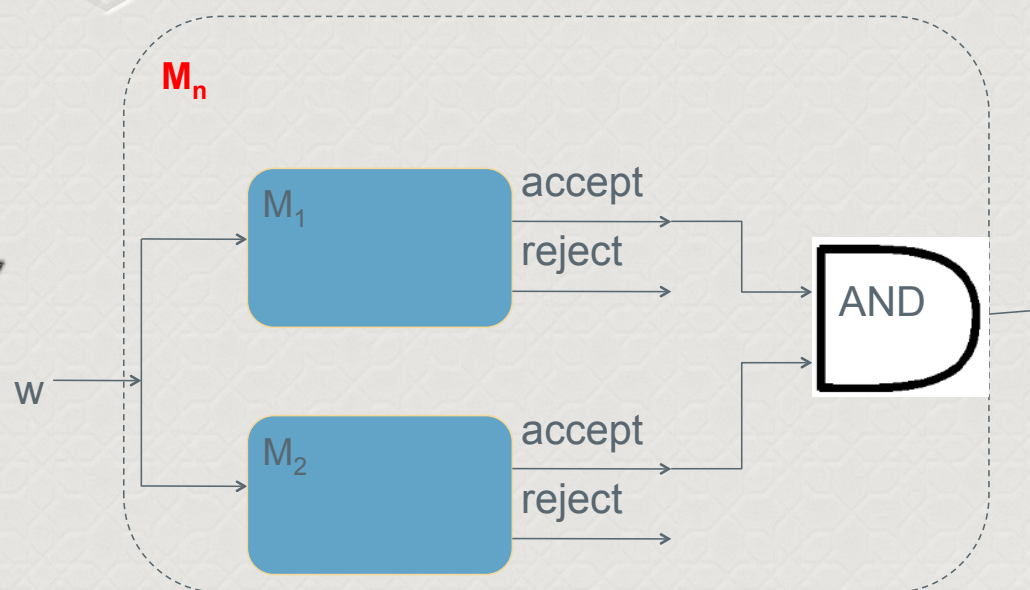


# Recursive Langs are closed under Intersection

Let  $M_n = \text{TM for } L_1 \cap L_2$

$M_n$  construction:

1. Make 2-tapes and copy input  $w$  on both tapes
2. Simulate  $M_1$  on tape 1
3. Simulate  $M_2$  on tape 2
4. If either  $M_1$  AND  $M_2$  accepts, then  $M_n$  accepts  
– Otherwise,  $M_n$  rejects.





# Other Closure Property Results

- *Recursive languages are also closed under:*
  - Concatenation
  - Kleene closure (star operator)
  - Homomorphism, and inverse homomorphism
- *RE languages are closed under:*
  - Union, intersection, concatenation, Kleene closure
- ~~*RE languages are not closed under:*~~
  - complementation



# “Languages” vs. “Problems”

*A “language” is a set of strings*

*Any “problem” can be expressed as a set of all strings that are of the form:*

- *“<input, output>”*

e.g., Problem (a+b)  $\equiv$  Language of strings of the form { “a#b, a+b” }

*$\Rightarrow$  Every problem also corresponds to a language!!*

Think of the language for a “problem” == a verifier for the problem



# Computable Functions

- *Fix any precise programming language, i.e., Java.*
- *A program is any finite string of symbols from  $\Sigma$  that a Java interpreter will run (won't give a syntax error)*
- *Recall  $\Sigma^*$  is the set of all strings of symbols.*
- *A function  $f : \Sigma^* \rightarrow \Sigma^*$  is computable if there is a program  $P$  that computes  $f$ , when  $P$  is executed on a computer with ideal memory.*
- *That is, for all strings  $x$  in  $\Sigma^*$ ,  $P(x) = f(x)$ .*



# Computable Functions - Cont'd

- *The set of all programs is a countable set!*
- *The set of all computable functions is also a countable set!*
- *Are there countably many functions from  $\Sigma^*$  to  $\Sigma^*$  ?*



# Power Sets

- *Let  $S$  be a set.*
- *The power set of  $S$  is the set of all subsets of  $S$ .*
- *We write the power set as  $\text{Power}(S)$ .*
- *Proposition: If  $S$  is finite, then  $\text{Power}(S)$  has cardinality  $2^{|S|}$*



# Theorem: For every $S$ , there is no bijection between $S$ and $\text{Power}(S)$

- Suppose  $f:S \rightarrow \mathcal{P}(S)$  is 1-1 and ONTO.
- Let  $WEIRD = \{ x \mid x \in S, x \notin f(x) \}$  There's some  $y$  in  $S$  such that  $f(y)=WEIRD$
- Is  $y$  in  $WEIRD$ ? YES or NO?
- if  $y$  in  $WEIRD$ , then  $y \in S$ , and  $y \notin f(y) = WEIRD$
- So  $y$  is not in  $WEIRD$ ... but then  $y \in S$  and  $y \notin WEIRD = f(y)$ ... So  $y$  is in  $WEIRD$ ...

Contradiction



# Theorem: There are uncountably many functions!

- *There is a bijection between - The set of all subsets of  $\Sigma^*$  (the powerset of  $\Sigma^*$ )*
- *The set of all functions  $f: \Sigma^* \rightarrow \{0, 1\}$  Take a subset  $S$  of  $\Sigma^*$ , we map it to the*
- *function  $f$  where:*
$$f(x) = 1 \quad (x \text{ in } S), \quad f(x) = 0 \quad (x \text{ not in } S)$$
- *So the set of all  $f: \Sigma^* \rightarrow \{0, 1\}$  has the same size as the powerset of  $\Sigma^*$*
- *But  $\Sigma^*$  is countable, so the powerset of  $\Sigma^*$  is uncountable! (No bijection between  $\Sigma^*$  and  $\text{Power}(\Sigma^*)$ !)*



So there are functions from  $\Sigma^*$  to  $\{0,1\}$  that are not computable.

Can we describe an uncomputable one? Can we describe an interesting, uncomputable function?



# Notation And Conventions

- *Fix any programming language*
- *When we refer to “program  $P$ ” we mean the text of the source code for  $P$*
- *$P(x)$  is the final output of program  $P$  on input  $x$ , assuming that  $P$  eventually halts*



# $P(P)$

- *It follows from our conventions that  $P(P)$  is the output obtained when we run  $P$  on the text of its own source code.*



# ***Example 1: The Halting Problem***

***An example of a recursive enumerable problem that is also undecidable***



## The Halting Problem

Non-RE Languages

Regular  
(DFA)

Context-  
free  
(PDA)

Context  
sensitive

Recursive

Recursively  
Enumerable (RE)

x



# The Famous Halting Set: K

- *K is the set of all programs P such that P(P) halts.*
- *$K = \{ \text{Program } P \mid P(P) \text{ halts} \}$*



# The Halting Problem

- *Is there a program HALT such that:*
- *$HALT(P)$  = yes, if  $P(P)$  halts*
- *$HALT(P)$  = no, if  $P(P)$  does not halt*



# The Halting Problem $K = \{P \mid P(P) \text{ halts} \}$

- *Is there a program HALT such that:*
- *$HALT(P) = \text{yes}$ , if  $P \in K$*
- *$HALT(P) = \text{no}$ , if  $P \notin K$*
- *HALTS decides whether or not any given program is in  $K$ .*



# THEOREM: There is no program that can solve the halting problem! (Alan Turing 1937)

- *Suppose a program HALT, solving the halting problem, existed:*
- *$HALT(P)$  = yes, if  $P(P)$  halts*
- *$HALT(P)$  = no, if  $P(P)$  does not halt*
- *We will call HALT as a subroutine in a new program called WEIRD.*



# The Program WEIRD(P):

*If  $\text{HALT}(P)$  then go into an infinite loop.*

*Else stop.*

*<Put text of subroutine HALT here>*

Contradiction

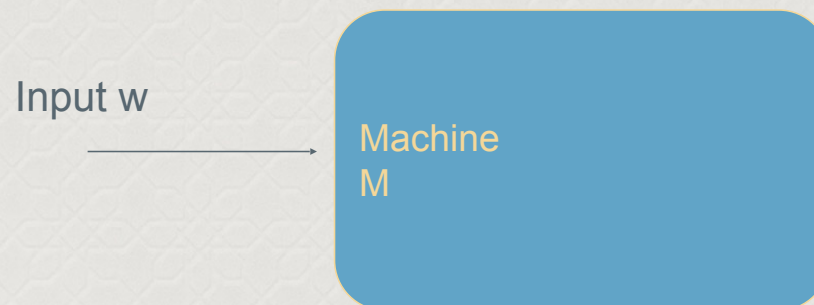
- *Does  $\text{WEIRD}(\text{WEIRD})$  halt or not?*
- *YES implies  $\text{HALT}(\text{WEIRD}) = \text{yes}$   
but then,  $\text{WEIRD}(\text{WEIRD})$  will infinite loop*
- *NO implies  $\text{HALT}(\text{WEIRD}) = \text{no}$  but then,  
 $\text{WEIRD}(\text{WEIRD})$  halts*



# What is the Halting Problem?

Definition of the “halting problem”:

- *Does a given Turing Machine  $M$  halt on a given input  $w$ ?*





# The Universal Turing Machine

- Given: TM  $M$  & its input  $w$
- Aim: Build another TM called “ $H$ ”, that will output:
  - “accept” if  $M$  accepts  $w$ , and
  - “reject” otherwise

- An algorithm for  $H$ :
  - Simulate  $M$  on  $w$

Implies:  $H$  is in RE

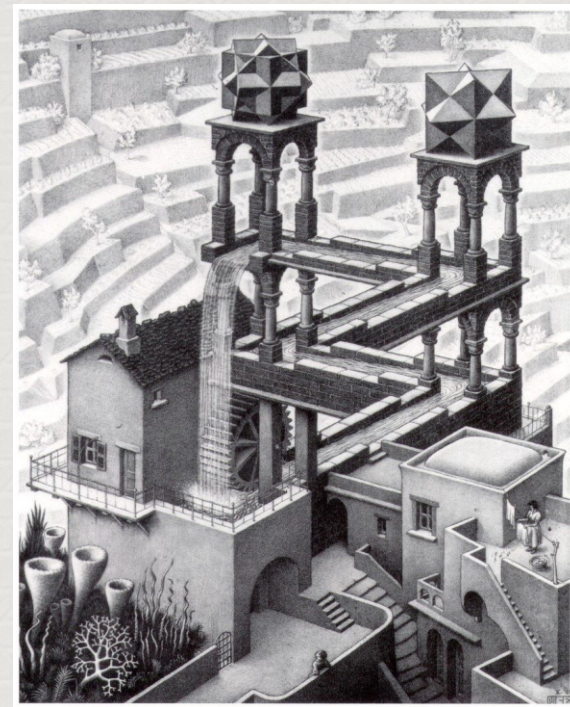
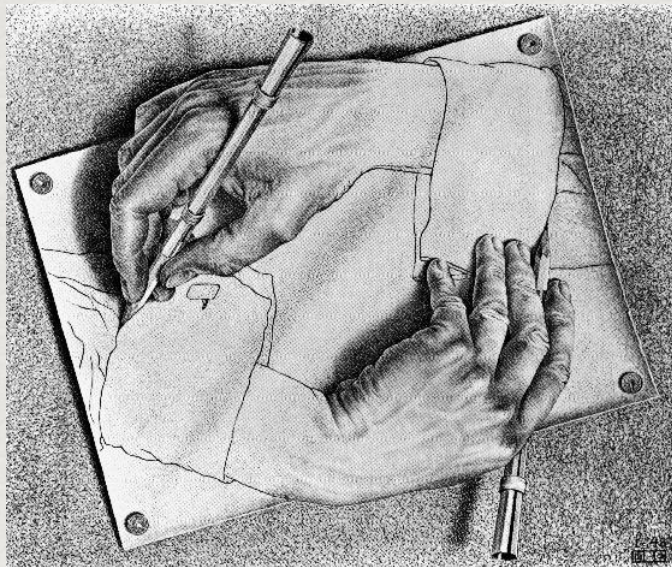
$$\text{○ } H(\langle M, w \rangle) = \begin{cases} \text{accept, if } M \text{ accepts } w \\ \text{reject, if } M \text{ does not accept } w \end{cases}$$

Question: If  $M$  does not halt on  $w$ , what will happen to  $H$ ?



# Of Paradoxes & Strange Loops

E.g., Barber's paradox, Achilles & the Tortoise (Zeno's paradox)  
MC Escher's paintings



A fun book for further reading:

**"Godel, Escher, Bach: An Eternal Golden Braid"**  
by Douglas Hofstadter (Pulitzer winner, 1980)



Turing's argument is just like the DIAGONALIZATION argument from the theory of infinities.

## Example 2: The Diagonalization Language

*Example of a language that is  
not recursive enumerable*

*(i.e, no TMs exist)*



The Diagonalization language

The Halting Problem

Non-RE Languages

x

x

Regular  
(DFA)

Context-  
free  
(PDA)

Context  
sensitive

Recursive

Recursively  
Enumerable (RE)



# A Language about TMs & acceptance

- *Let  $L$  be the language of all strings  $\langle M, w \rangle$  s.t.:*
  1.  *$M$  is a TM (coded in binary) with input alphabet also binary*
  2.  *$w$  is a binary string*
  3.  *$M$  accepts input  $w$ .*



# Enumerating all binary strings

- *Let  $w$  be a binary string*
- *Then  $1w \equiv i$ , where  $i$  is some integer*
  - *E.g., If  $w=\epsilon$ , then  $i=1$ ;*
  - *If  $w=0$ , then  $i=2$ ;*
  - *If  $w=1$ , then  $i=3$ ; so on...*
- *If  $1w \equiv i$ , then call  $w$  as the  $i^{\text{th}}$  word or  $i^{\text{th}}$  binary string, denoted by  $w_i$ .*
- **$\Rightarrow$  A canonical ordering of all binary strings:**
  - $\{\epsilon, 0, 1, 00, 01, 10, 11, 000, 100, 101, 110, \dots\}$
  - $\{w_1, w_2, w_3, w_4, \dots, w_i, \dots\}$



# Any TM $M$ can also be binary-coded

- $M = \{ Q, \{0,1\}, \Gamma, \delta, q_0, B, F \}$ 
  - Map all states, tape symbols and transitions to integers ( $\Rightarrow$  binary strings)
  - $\delta(q_i, X_j) = (q_k, X_p, D_m)$  will be represented as:  
➤  $\Rightarrow 0^i 1 0^j 1 0^k 1 0^p 1 0^m$
- Result: Each TM can be written down as a long binary string
- $\Rightarrow$  Canonical ordering of TMs:
  - $\{M_1, M_2, M_3, M_4, \dots, M_i, \dots\}$



# The Diagonalization Language

- $L_d = \{ w_i \mid w_i \notin L(M_i) \}$ 
  - *The language of all strings whose corresponding machine does not accept itself (i.e., its own code)*

(TMs)

$i$

$j$  (input word  $w$ )

	1	2	3	4	...
1	0	1	0	1	...
2	1	1	0	0	...
3	0	1	0	1	...
4	1	0	0	1	...
...					

diagonal

- Table:  $T[i,j] = 1$ , if  $M_i$  accepts  $w_j$   
 $= 0$ , otherwise.

- Make a new language called  
 $L_d = \{ w_i \mid T[i,i] = 0 \}$



# $L_d$ is not RE (i.e., has no TM)

- Proof (by contradiction):
- Let  $M$  be the TM for  $L_d$
- $\implies M$  has to be equal to some  $M_k$  s.t.  
$$L(M_k) = L_d$$
- $\implies$  Will  $w_k$  belong to  $L(M_k)$  or not?
  1. If  $w_k \in L(M_k) \implies T[k,k]=1 \implies w_k \notin L_d$
  - If  $w_k \notin L(M_k) \implies T[k,k]=0 \implies w_k \in L_d$
- A contradiction either way!!



**Why should there be languages  
that do not have TMs?**

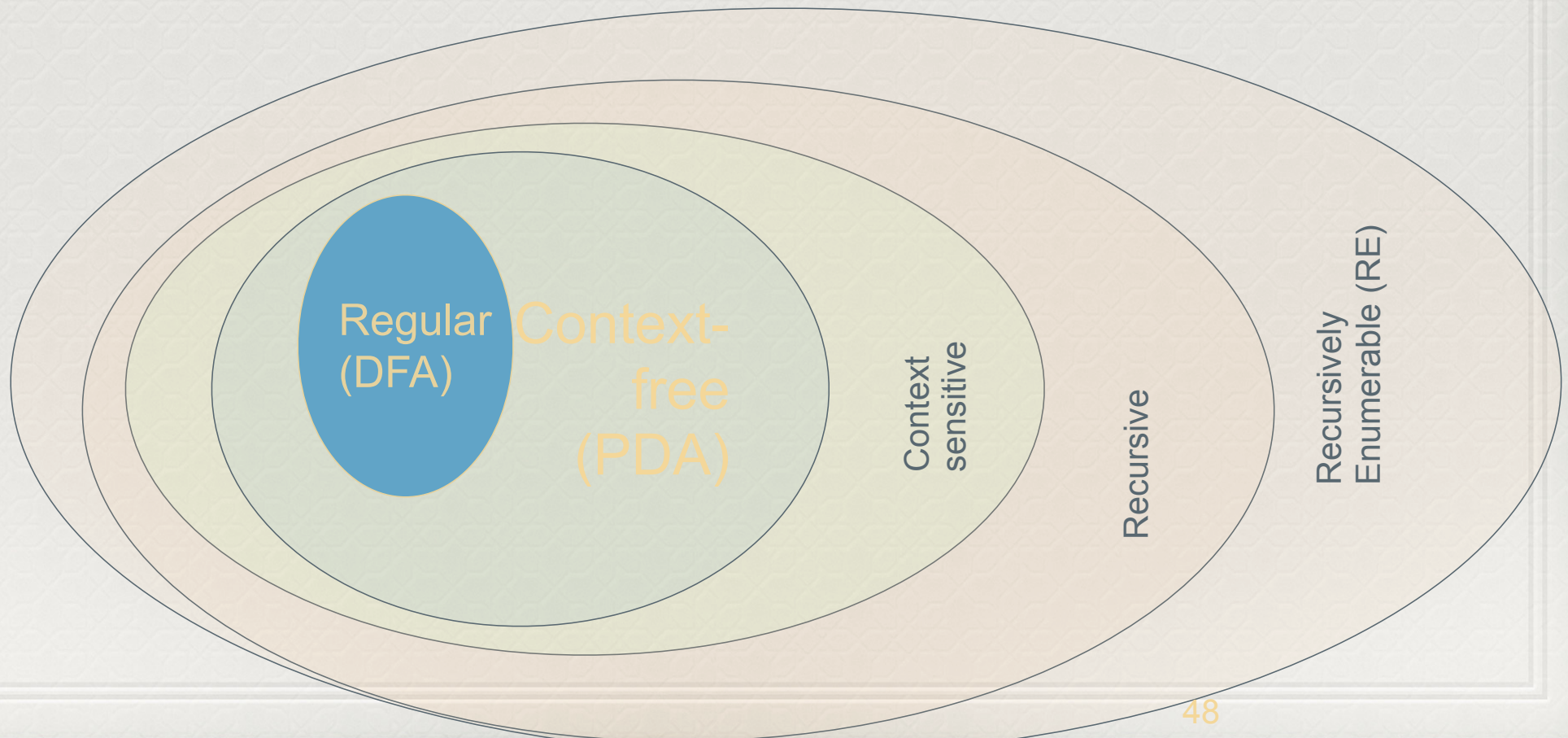
*We thought TMs can solve everything!!*



# Non-RE languages

How come there are languages here?  
(e.g., diagonalization language)

Non-RE Languages





# One Explanation

## *There are more languages than TMs*

- *By pigeon hole principle:*
- *$\implies$  some languages cannot have TMs*
- *But how do we show this?*
- *Need a way to “count & compare” two infinite sets (languages and TMs)*



# How to count elements in a set?

*Let  $A$  be a set:*

- *If  $A$  is finite  $\implies$  counting is trivial*
- *If  $A$  is infinite  $\implies$  how do we count?*
- *And, how do we compare two infinite sets by their size?*



# Cantor's definition of set "size" for infinite sets (1873 A.D.)

Let  $N = \{1, 2, 3, \dots\}$  (all natural numbers)

Let  $E = \{2, 4, 6, \dots\}$  (all even numbers)

Q) Which is bigger?

- A) Both sets are of the same size
  - **"Countably infinite"**
  - Proof: Show by one-to-one, onto set correspondence from  $N \Rightarrow E$

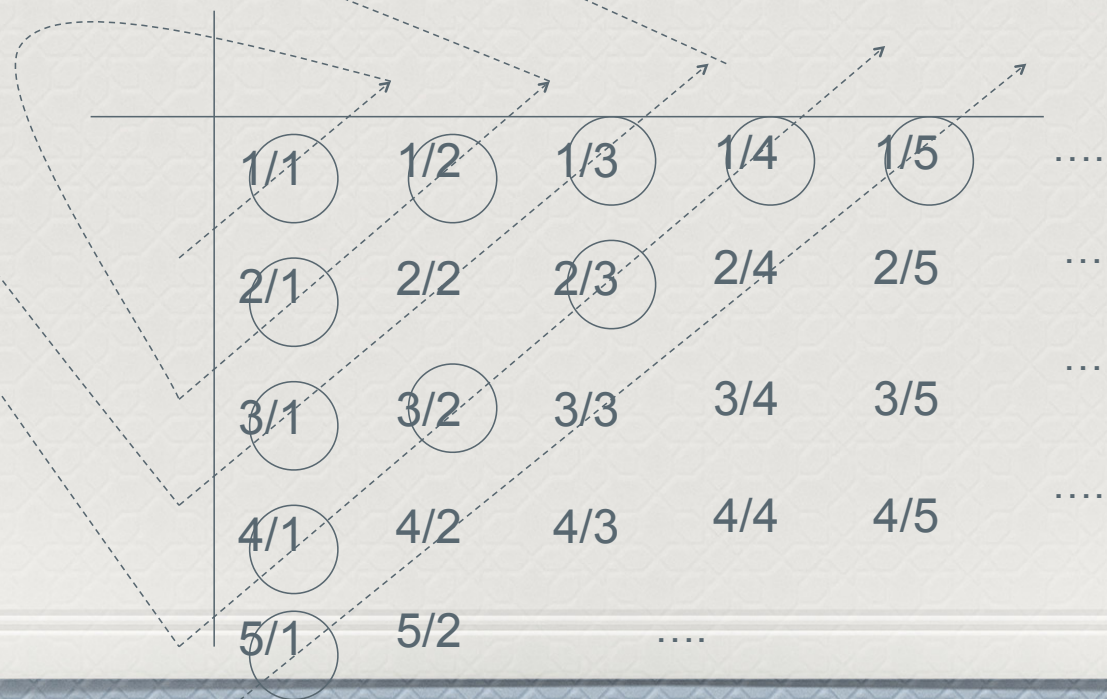
i.e, for every element in  $N$ ,  
there is a unique element in  $E$ ,  
and vice versa.

n	f(n)
1	2
2	4
3	6
.	.
.	.
.	.



# Example #3

- Let  $Q$  be the set of all rational numbers
- $Q = \{ m/n \mid \text{for all } m, n \in \mathbb{N} \}$
- Claim:  $Q$  is also countably infinite;  $\Rightarrow |Q| = |\mathbb{N}|$





Really, really big sets!  
(even bigger than countably infinite sets)

# ***Uncountable*** sets

## Example:

- *Let  $R$  be the set of all real numbers*
- *Claim:  $R$  is uncountable*

n	f(n)
1	3 . <u>1</u> 4 1 5 9 ...
2	5 . 5 <u>5</u> 5 5 5 ...
3	0 . 1 2 <u>3</u> 4 5 ...
4	0 . 5 1 4 <u>3</u> 0 ...
.	
.	
.	

Build  $x$  s.t.  $x$  cannot possibly  
occur in the table

E.g.  $x = 0 . 2 6 4 4 \dots$



# Other Non-Computable Functions

- *Concrete examples of finitary functions are Busy beaver, Kolmogorov complexity, or any function that outputs the digits of a noncomputable number, such as Chaitin's constant.*
- *Similarly, most subsets of the natural numbers are not computable. The Halting problem was the first such set to be constructed.*
- *The Entscheidungsproblem, proposed by David Hilbert, asked whether there is an effective procedure to determine which mathematical statements (coded as natural numbers) are true.*
  - *Turing and Church independently showed in the 1930s that this set of natural numbers is not computable. According to the Church–Turing thesis, there is no effective procedure (with an algorithm) which can perform these computations.*



# Therefore, some languages cannot have TMs...

- *The set of all TMs is countably infinite*
- *The set of all Languages is uncountable*
- $\implies$  *There should be some languages without TMs ( by PHP)*



# **The problem reduction technique, and reusing other constructions**



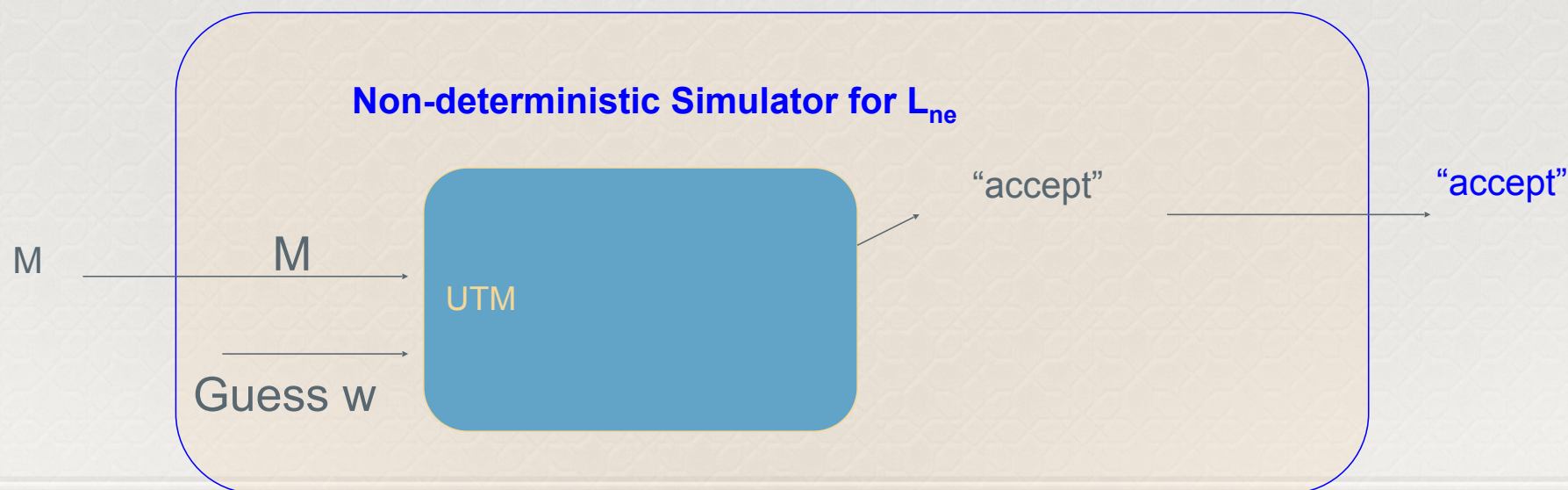
# Languages that we know about

- *Language of a Universal TM (“UTM”)*
  - $L_u = \{ \langle M, w \rangle \mid M \text{ accepts } w \}$
  - Result:  $L_u$  is in RE but not recursive
- *Diagonalization language*
  - $L_d = \{ w_i \mid M_i \text{ does not accept } w_i \}$
  - Result:  $L_d$  is non-RE



# TMs that accept non-empty languages

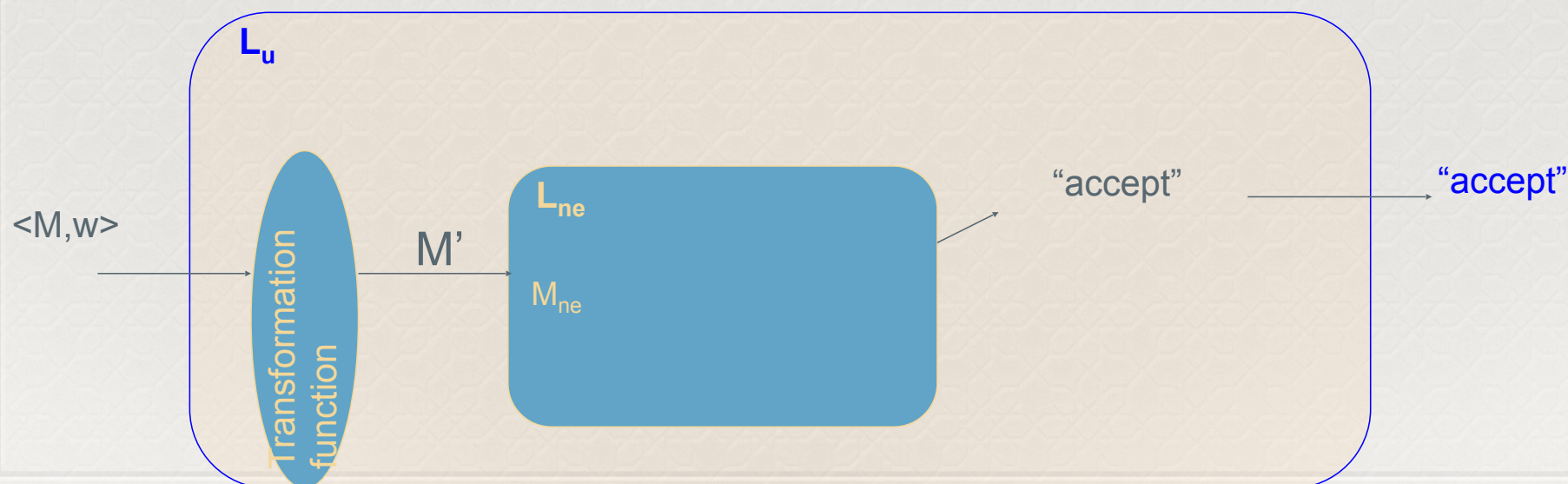
- $L_{ne} = \{ M \mid L(M) \neq \emptyset \}$
- $L_{ne}$  is RE
- Proof: (build a TM for  $L_{ne}$  using UTM)





# TMs that accept non-empty languages

- $L_{ne}$  is not recursive
- Proof: (“Reduce”  $L_u$  to  $L_{ne}$ )
  - Idea:  $M$  accepts  $w$  if and only if  $L(M') \neq \emptyset$





# Reducability

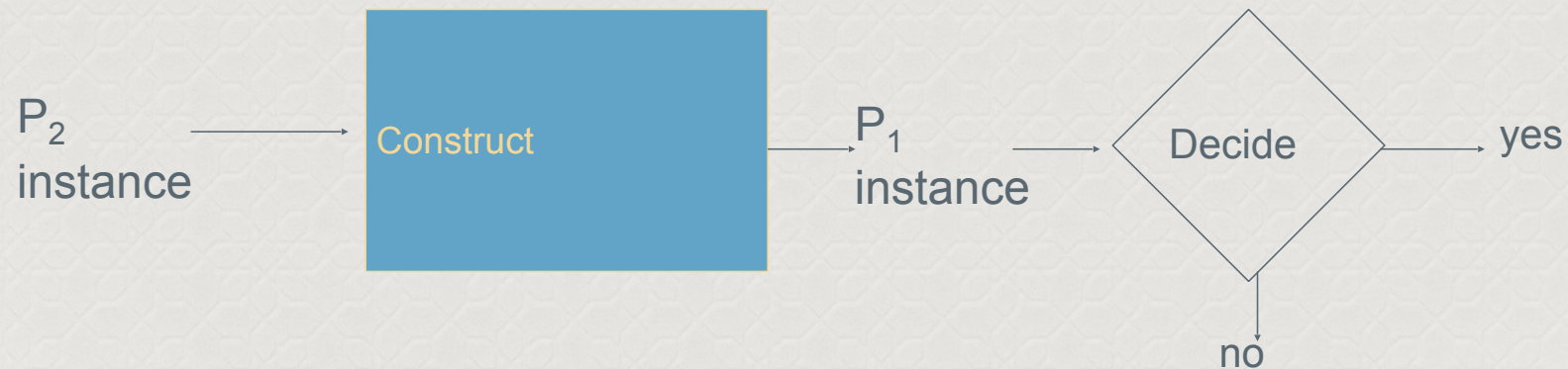
- To prove: Problem  $P_1$  is undecidable
- Given/known: Problem  $P_2$  is undecidable
- Reduction idea:
  1. “Reduce”  $P_2$  to  $P_1$ :
    - Convert  $P_2$ ’s input instance to  $P_1$ ’s input instance s.t.
      - $P_2$  decides only if  $P_1$  decides
  2. Therefore,  $P_2$  is decidable
  3. A contradiction
  4. Therefore,  $P_1$  has to be undecidable



# The Reduction Technique

Reduce  $P_2$  to  $P_1$ :

Note:  
not same as  
 $P_1 \implies P_2$



Conclusion: If we could solve  $P_1$ , then we can solve  $P_2$  as well



# Summary

- *Problems vs. languages*
- *Decidability*
  - *Recursive*
- *Undecidability*
  - *Recursively Enumerable*
  - *Not RE*
  - *Examples of languages*
- *The diagonalization technique*
- *The set of all rational numbers*
- *Reducability*