

# CS/ECE 374 A: Algorithms & Models of Computation

## Undecidability

Lecture 23

April 22, 2025

# Part I

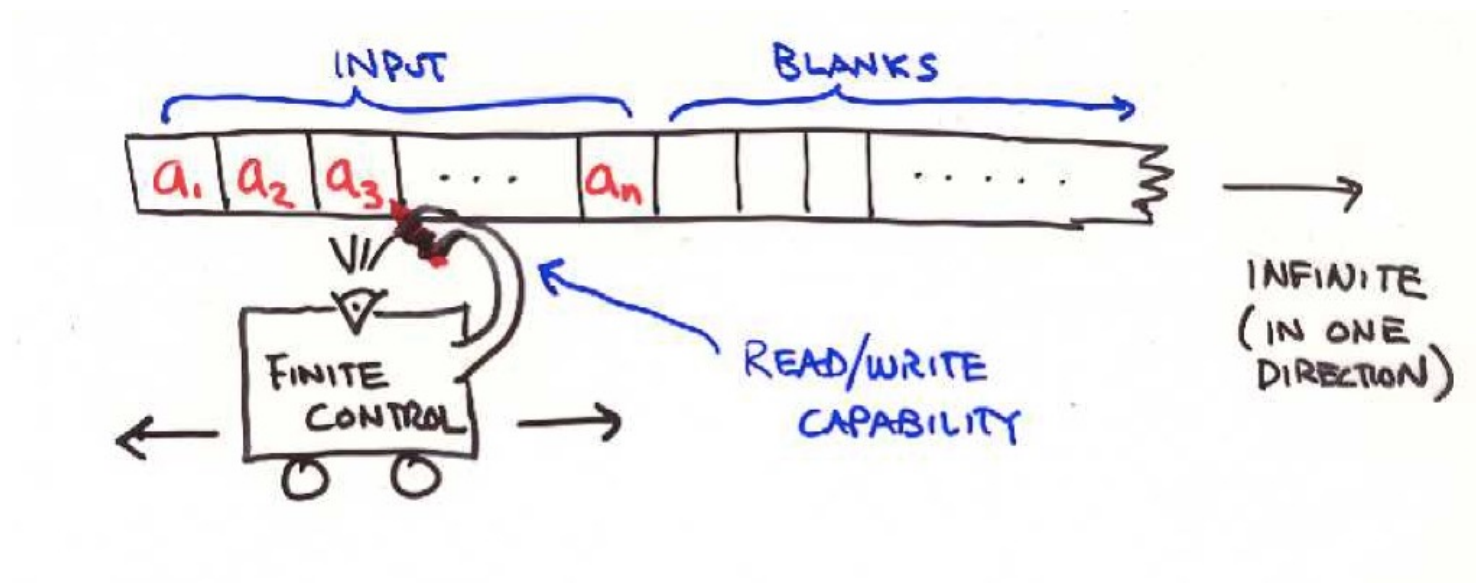
## **Formal Definitions**

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Recall: our most general form of computation was that performed by Turing Machines.

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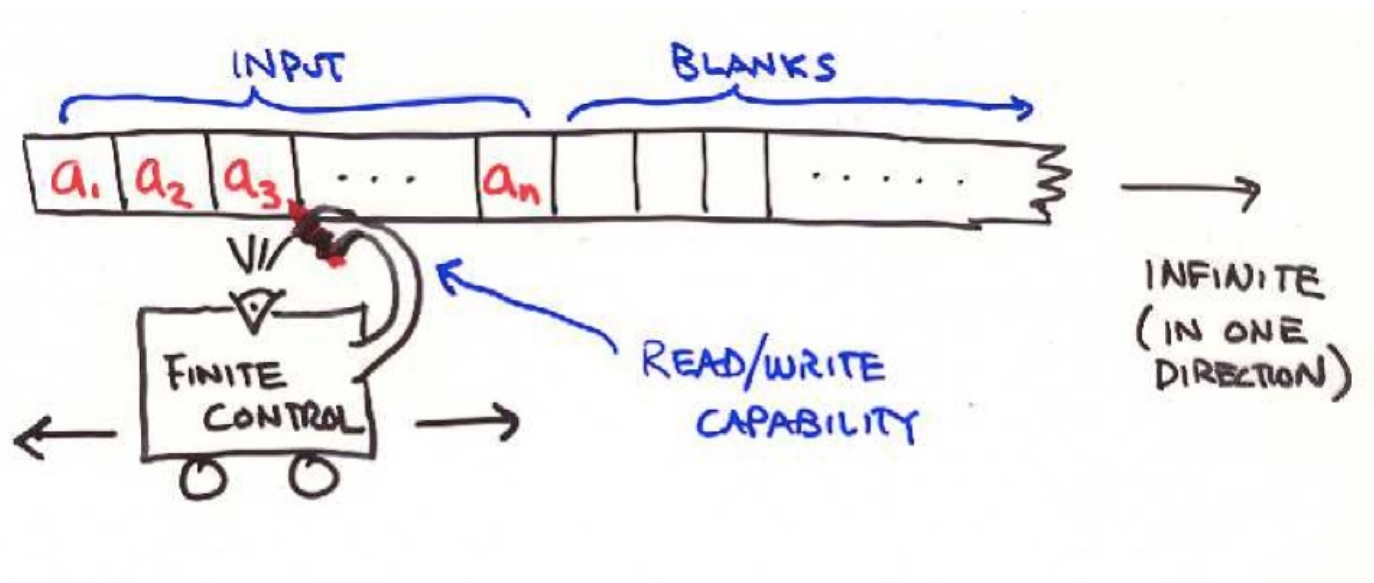
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# What is Computation?

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Each step: read the current character, write a new character, move one space, update (finite) state of head.

*Extremely* tedious to work with TMs, so we'll just extract the properties we need and work with those.

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- $\text{Reject}(M) = \{w \in \Sigma^* \mid M \text{ rejects } w\}$
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In order for a language  $L$  to be computable (aka decidable aka recursive), we require that there is a TM  $M$  such that  $\text{Accept}(M) = L$  and  $\text{Diverge}(M) = \emptyset$ .



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- If we know that  $\text{Accept}(M) = L$ , we call  $L$  “acceptable” or “recursively enumerable”.

# TM Properties: Encoding

Every TM can be encoded as a finite-length bit string.

- Each part of  $M = (Q, \Sigma, \Gamma, \delta, q_0, q_{acc}, q_{rej})$  is finite, so use whatever (reasonable) encoding you want!
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- **Modifiable:** we can (algorithmically) modify an encoding to change the behavior of its TM. (For example, switch accepting with rejecting, add pre- or post-processing, etc.)
- **Executable:** There is a universal TM  $U$  that on input  $\langle M, w \rangle$  simulates  $M(w)$ . (So  $L(U) = \{\langle M, w \rangle \mid M \text{ accepts } w\}$ .)

# Properties of Computability

## Lemma

Let  $L$  and  $L'$  be decidable languages. Then  $L \cup L'$ ,  $L \cap L'$ ,  $L - L'$ , and  $L' - L$  are decidable.

Alg: run the alg for each of  
 $L$  and  $L'$ , accept accordingly

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## Lemma

Let  $L$  be an acceptable language. Then  $L$  is decidable if and only if  $\Sigma^* - L$  is acceptable.

Alg: run acceptors for  $L$  and  $\Sigma^* - L$  in parallel  
eventually, one of them has to halt



# Part II

## The Halting Problem

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## Claim

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- Each decidable language requires its own TM—of which there are only countably many!

Are there “natural” or “interesting” undecidable languages?

# “Interesting” Undecidable Problems

Many problems throughout math and CS turn out to be undecidable:

- Do two CFGs generate the same language?
- What is the shortest program that outputs a given string?
- Does a multivariate polynomial have an integer root?
- Are two groups isomorphic?
- Can Conway's Game of Life get from one pattern to another?
- Can a given set of tiles fill the plane?

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Our focus: problems that deal with computation / the behavior of programs.



# The Halting Problem

Let  $L_{HALT} = \{\langle M, w \rangle \mid M(w) \text{ halts}\}$ .

How might you try to approach solving this problem?

Idea 1: just run  $M(w)$

if  $M(w)$  does not halt, we don't know  
when to "give up" on it.

Idea 2: look at the "code" of  $M$  and  
see if there's an infinite loop  
code can be quite complicated...

# Halting and Goldbach

```
CheckGoldbach():
```

```
     $n = 4$ 
```

```
    while True:
```

```
        flag = False
```

```
        for  $i$  from 2 to  $n - 2$ :
```

```
            if  $i$  and  $(n - i)$  are both prime:
```

```
                flag = True
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```
        If flag is False:
```

```
            return False
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     $n = n + 2$ 
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            if i and (n - i) are both prime:  
                flag = True  
        If flag is False:  
            return False  
        n = n + 2
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Does `CheckGoldbach` halt?

**Goldbach's Conjecture:** Every even integer above 4 can be written as the sum of two primes. (Open problem since 1742)

- If we could check if `CheckGoldbach` halts, we would resolve Goldbach's conjecture!

# Halting is Undecidable

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Suppose for contradiction that there is some program `TestHalt` that decides  $L_{HALT}$ . We construct the following program:

**Turing(*x*):**

Interpret *x* as the encoding of some TM  $M_x$

**if** `TestHalt( $\langle M_x, x \rangle$ )` returns True:

Enter an infinite loop

**else**

return “Done!”

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return “Done!”

What does `Turing( $\langle \text{Turing} \rangle$ )` do?

if `TestHalt` returns True: Turing infinite loops   
if `TestHalt` returns False: Turing halts 

# Part III

## Undecidability Reductions



# Halting with No Input

Our proof that  $L_{HALT}$  is undecidable relied on the ability to pass Turing its own source code—what happens if we don't allow inputs?

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$L_{HNI} = \{\langle M \rangle \mid M \text{ halts given no input}\}$  is undecidable.

Idea: show that if we can decide  $L_{HNI}$ , we can decide  $L_{HALT}$ .

```
from magic import TestHNI
```

```
TestHalt( $\langle M, w \rangle$ ):
```

Construct a new program  $P()$  that:

① runs  $M(w)$

② halts

```
return TestHNI( $\langle P \rangle$ )
```

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Idea: show that if we can decide  $L_{HNI}$ , we can decide  $L_{HALT}$ .

```
from magic import TestHNI
TestHalt( $\langle M, w \rangle$ ):
    Construct a program (machine)  $P()$  that runs  $M(w)$ 
    return TestHNI( $\langle P \rangle$ )
```

Since  $L_{HALT}$  is undecidable,  $L_{HNI}$  must be as well.

- From last lecture, this also means that writing a 124 autograder is impossible!

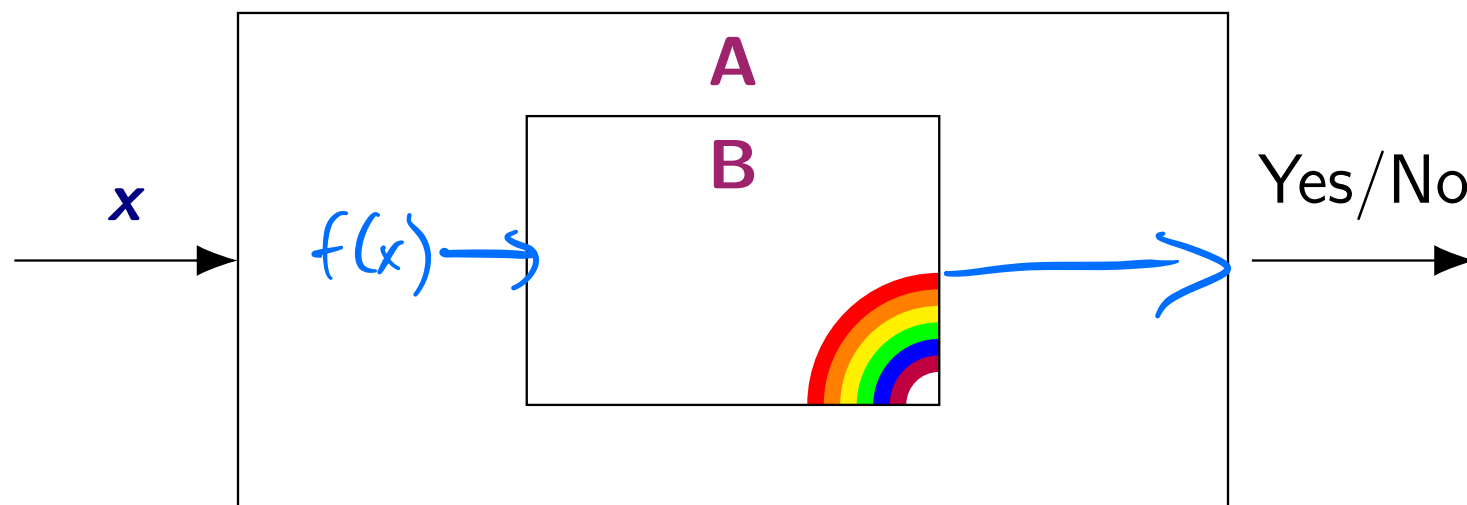
# Reducing Decision Problems

Note the nice form of the previous reduction: given an input  $\langle M, w \rangle$ , we were able to convert it into an input we could pass to `TestHNI`.

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General pattern: given two *decision* problems  $A$  and  $B$ , we can reduce  $A$  to  $B$  by giving a (computable) function  $f$  such that  $x \in L_A$  if and only if  $f(x) \in L_B$ .



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When using this type of reduction, you just have to define (a computable)  $f$  and prove that  $x \in L_A$  iff  $f(x) \in L_B$ !

- This is not the *only* way to do a reduction, but it is generally the simplest, and so the one we will use the most.

# Accepting $0^{374}$

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Let  $L_{374} = \{\langle M \rangle \mid M \text{ accepts } \text{only } 0^{374}\}$ .

We can prove  $L_{374}$  is undecidable by reducing  $L_{\text{HALT}}$  to it!

- What  $f$  has  $\langle M, w \rangle \in L_{\text{HALT}}$  iff  $f(\langle M, w \rangle) \in L_{374}$ ?

$f(\langle M, w \rangle) =$  a program  $P(x)$  that:

① simulates  $M(w)$

② accept  $x$  (iff  $x = 0^{374}$ )

$\Rightarrow$ : if  $M(w)$  halts,  $P(0^{374})$  reaches line 2 & accepts

$\Leftarrow$ : if  $M(w)$  does not halt,  $P(0^{374})$  gets stuck at ①  
It so does not accept

# Accepting Regular Language

Let  $L_{AccReg} = \{\langle M \rangle \mid \text{Accept}(M) \text{ is regular}\}$ .

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- What  $f$  has  $\langle M \rangle \in L_{HNI}$  iff  $f(\langle M \rangle) \in L_{AccReg}$ ?

# Accepting The Same Language

Let  $L_{AccSame} = \{ \langle M_1, M_2 \rangle \mid \text{Accept}(M_1) = \text{Accept}(M_2) \}$ .

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What language should we reduce to  $L_{AccSame}$ ? What function  $f$  should our reduction use?

# Takeaway Points

Determining if a program halts is *impossible* to do algorithmically.

- If such an algorithm existed, we could use it to construct a program that the algorithm is wrong about!

We can use this to prove that “most” problems about the behavior of a program are undecidable.

- If we can reduce an undecidable problem (eg,  $L_{HALT}$ ) to our problem, we know that our problem is also undecidable.
- Simplest type of reduction: give a (computable) function  $f$  such that  $\langle M, w \rangle \in L_{HALT}$  iff  $f(\langle M, w \rangle)$  is in our language.