

# CS251

Great Ideas  
in

*Theoretical*

Computer Science



## Limits of Human Reasoning

## Last Time

Diagonalize against **the set of all decidable languages:**

$\overline{\text{SELF-ACCEPTS}}$  ( $\overline{\text{SA}}$ ) is undecidable.

$$\begin{array}{l} \overline{\text{SELF-ACCEPTS}} \leq \text{SELF-ACCEPTS} \leq \text{ACCEPTS} \\ \leq \text{HALTS} \leq \text{SAT} \leq \text{NEQ} \end{array}$$

**Undecidable problems  
not involving Turing Machines**

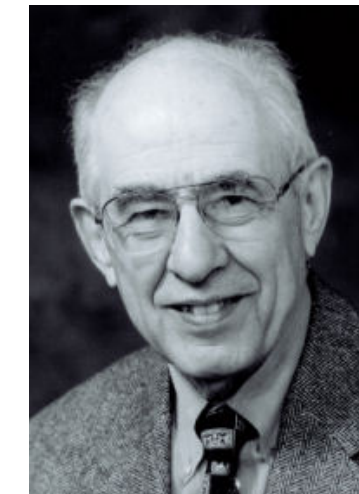
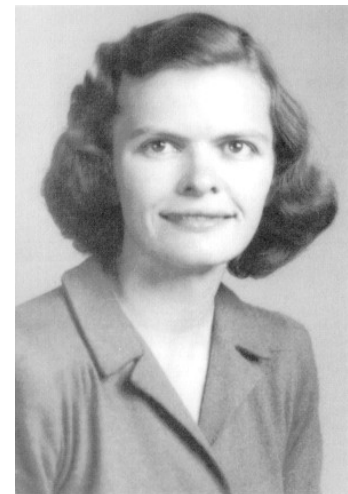
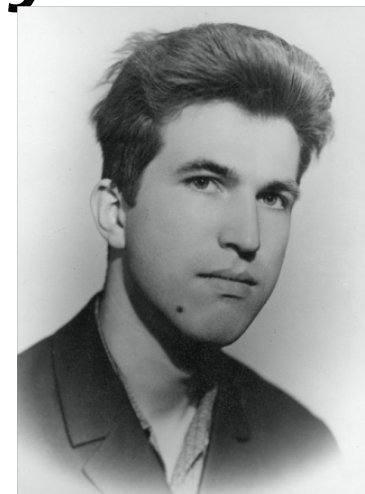
# Hilbert's 10th Problem

Determining if a given multivariate polynomial with integral coefficients has an integer root.

e.g.  $5xy^2z + 8yz^3 + 100x^{99}$

**Undecidable!**

Proved in 1970 by Matiyasevich-Robinson-Davis-Putnam.



Does it have a **real** root? **Decidable!**

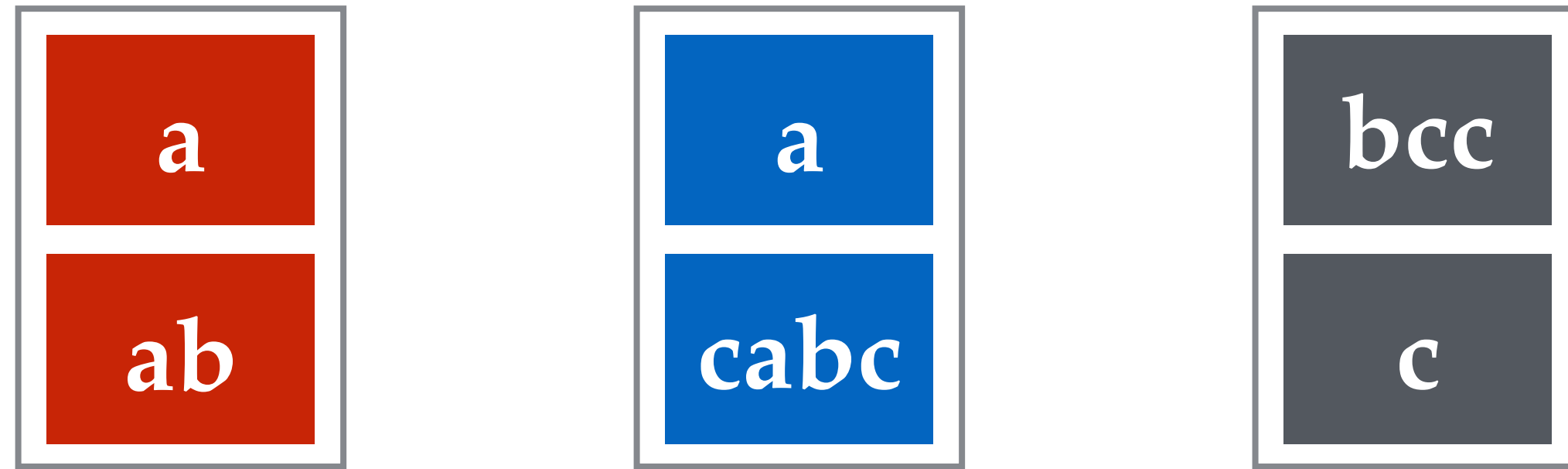
Proved in 1951 by Tarski.



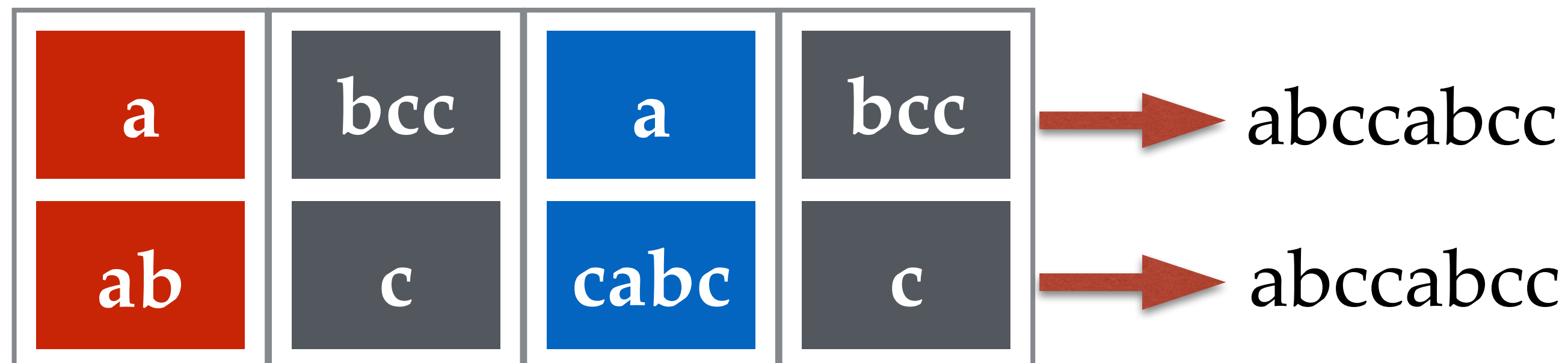
Does it have a **rational** root? **No one knows!**

# Post's Correspondence Problem (PCP)

**Input:** A finite collection of "dominoes" having strings written on each half.



**Output:** *Accept* if it is possible to match the strings.

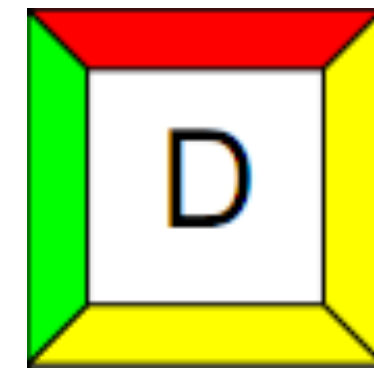
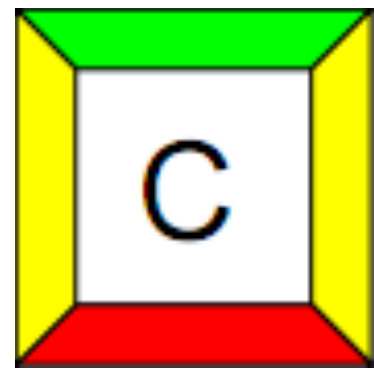
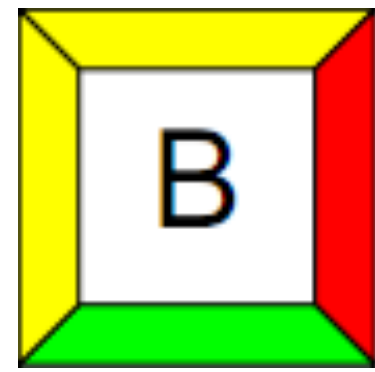
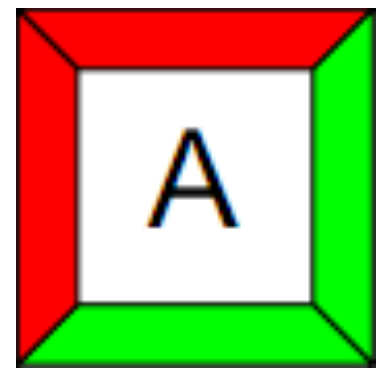


**Undecidable!**

Proved in 1946 by Post.

# Wang Tiles

**Input:** A finite collection of "Wang Tiles" (squares) with colors on the edges.



**Output:** *Accept* iff it is possible to make an infinite grid from copies of the given squares, where touching sides must color-match.

**Undecidable!**

Proved in 1966 by Berger.

# Mortal Matrices

**Input:** Two  $21 \times 21$  matrices of integers  $U$  and  $V$ .

**Output:** **Accept** iff it is possible to multiply  $U$  and  $V$   
(multiple times in any order)  
to get to the 0 matrix.

**Undecidable!**

Proved in 2007 by Halava, Harju, Hirvensalo.

All languages

$\mathcal{P}(\Sigma^*)$

Finitely describable

HALTS

ACCEPTS

WANG-TILES

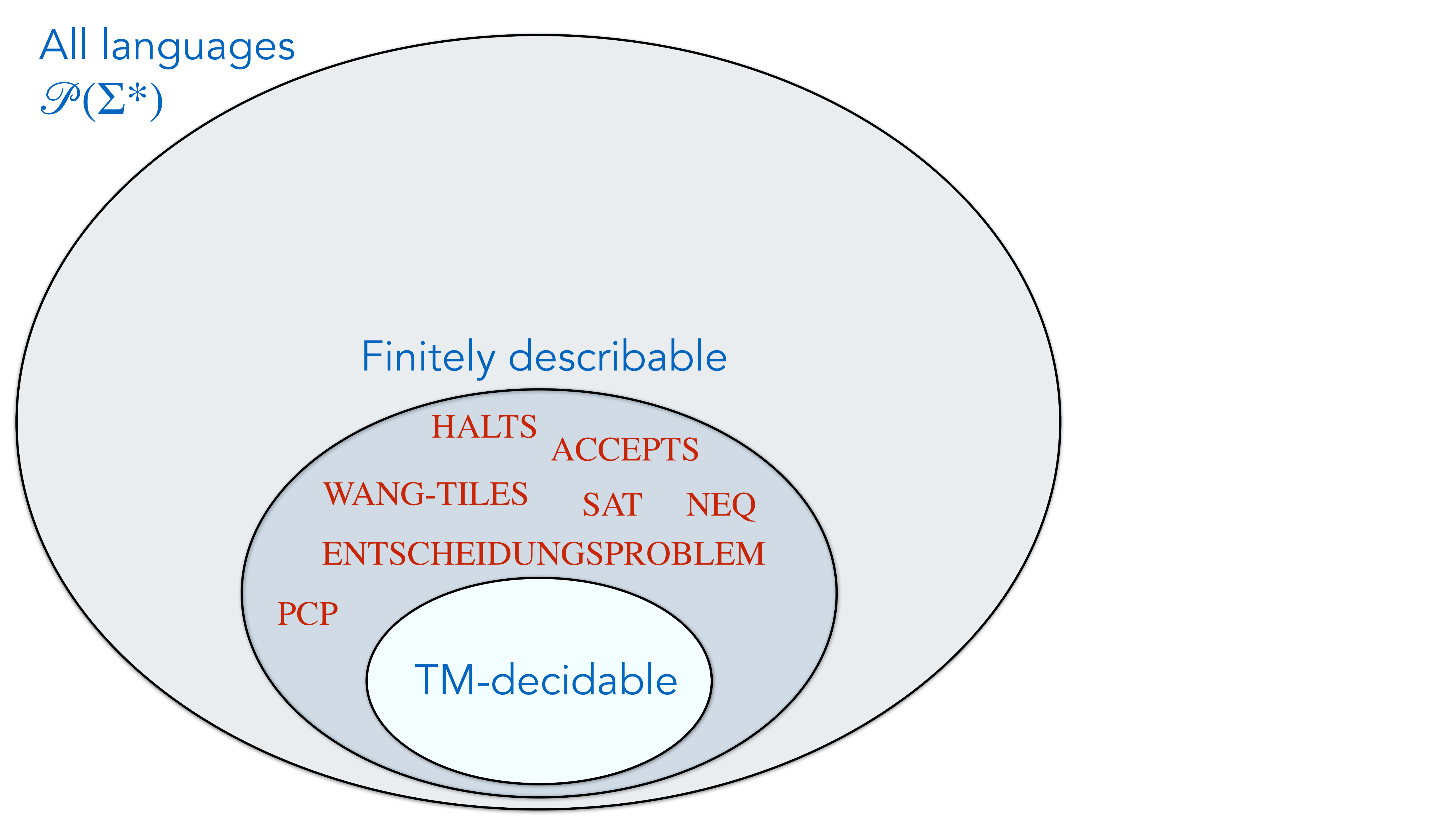
SAT

NEQ

ENTSCHEIDUNGSPROBLEM

PCP

TM-decidable





## **Completed:**

Formally define computation.

Understand the limits of computation.

## **Next:**

Understand (logical) human reasoning and its limits.

**Good Old Regular Mathematics  
(GORM)**

# GORM: Good Old Regular Mathematics

Real World

Abstract World

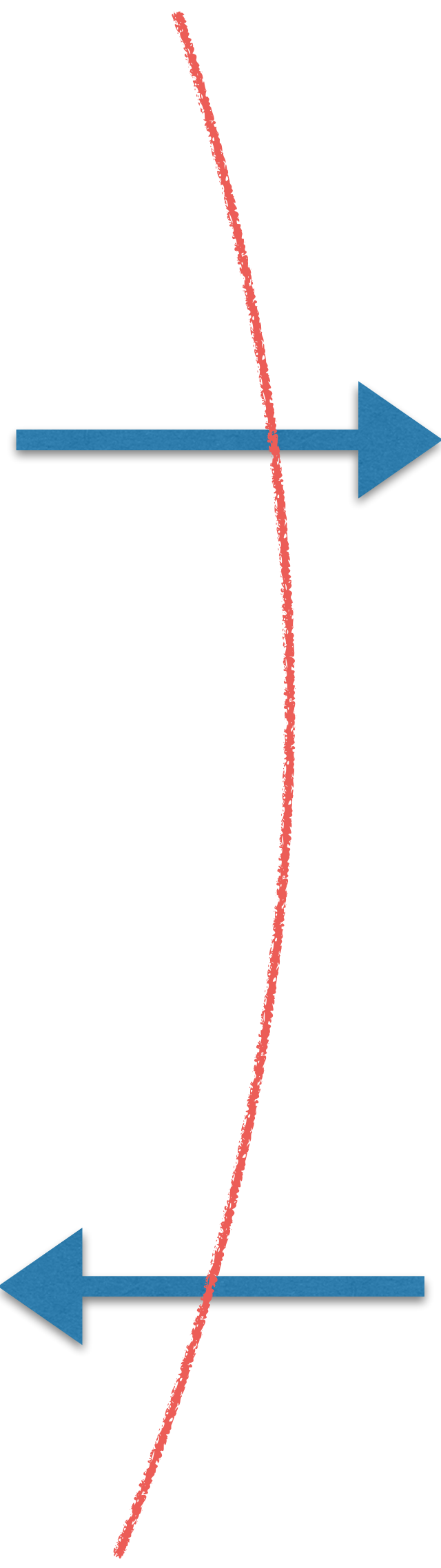
Something of interest

Mathematical Model

logic

New Knowledge

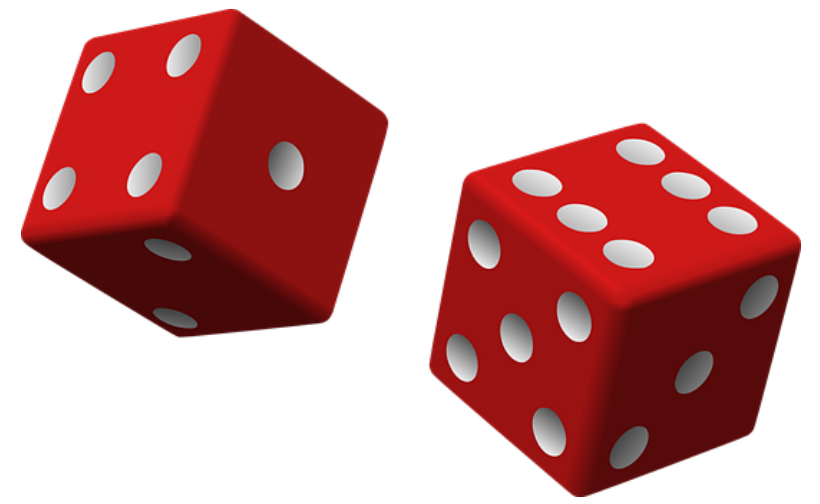
Applications



# GORM: Good Old Regular Mathematics

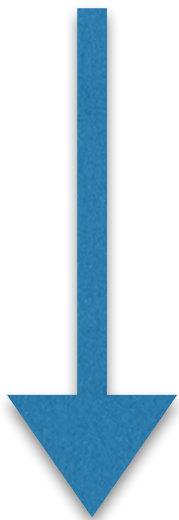
Real World

Gambling

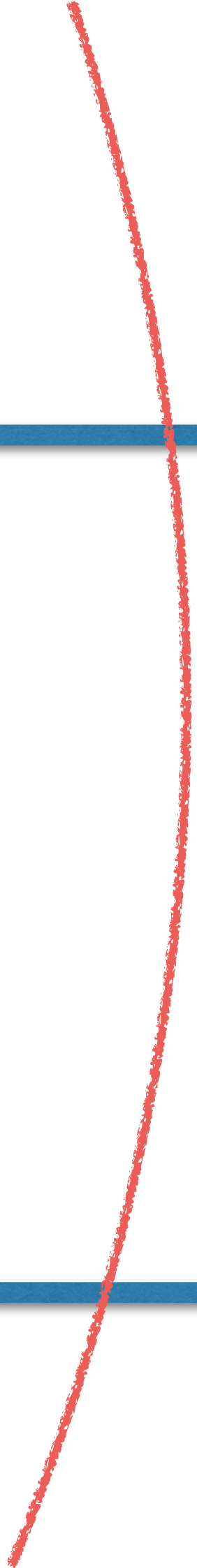
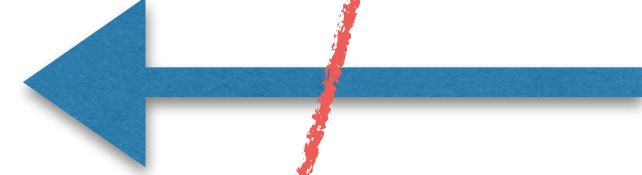
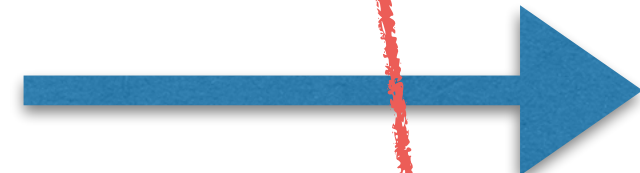


Abstract World

Probability Theory



New Knowledge



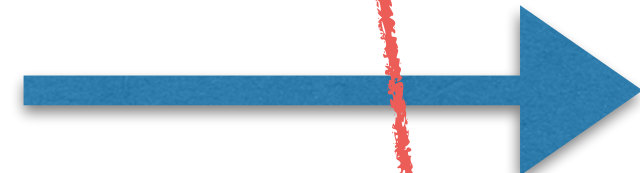
Applications

# GORM: Good Old Regular Mathematics

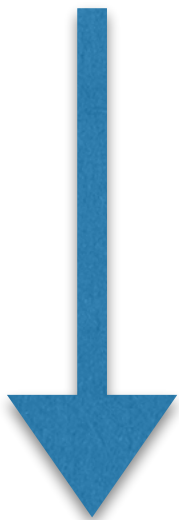
Real World

Abstract World

Farming

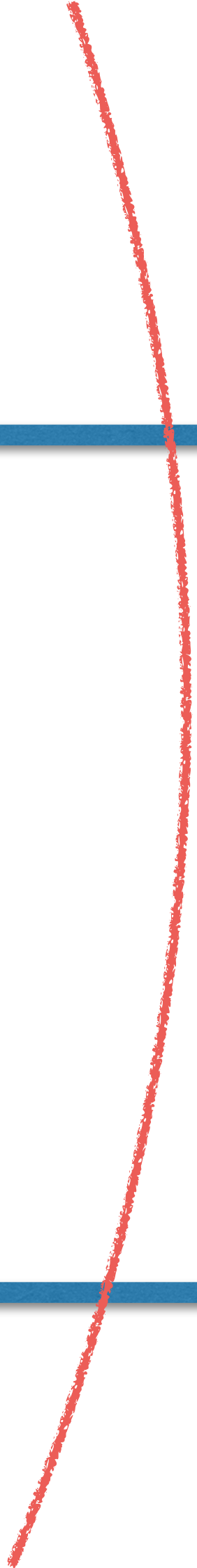
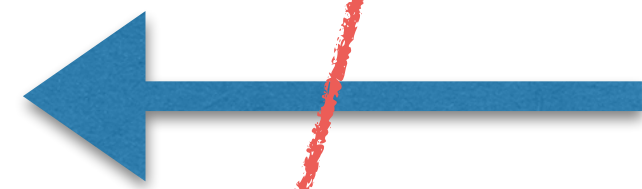


Plane  
Geometry



New  
Knowledge

Applications



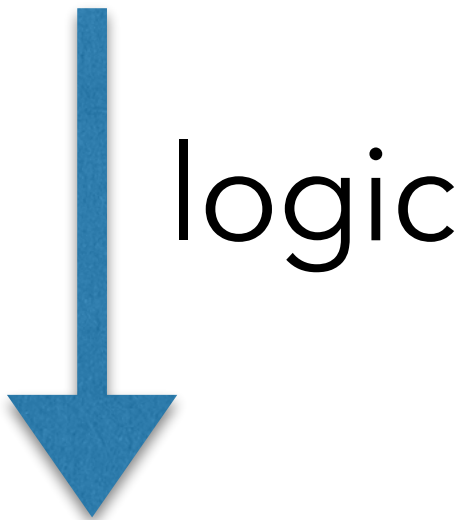
# FORM: Formalization of GORM

Real World

Abstract World

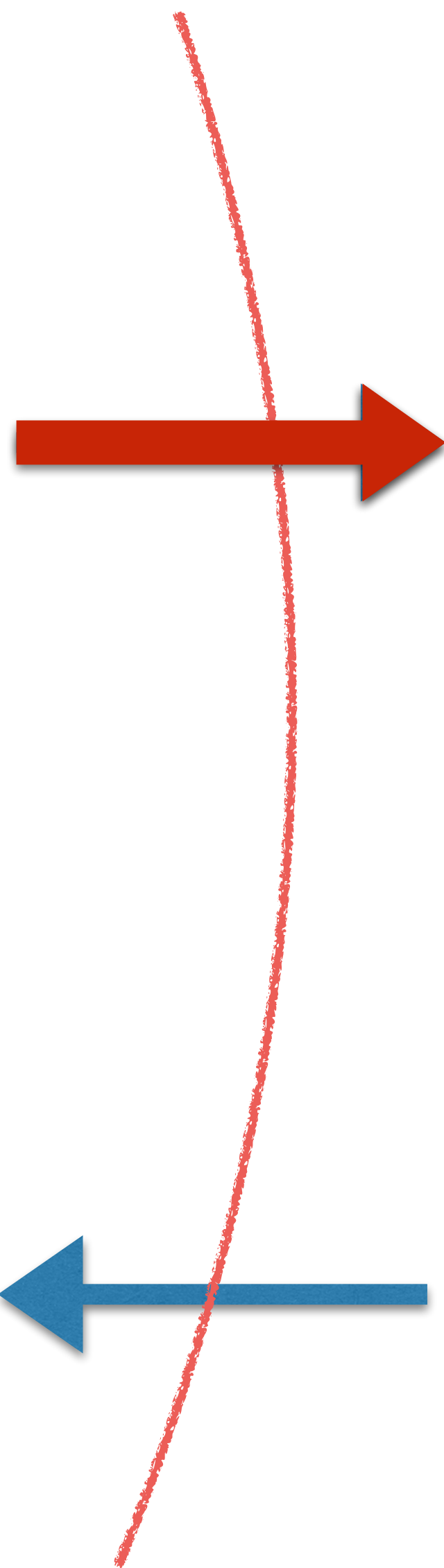
Mathematical Reasoning  
(GORM)

Mathematical Model



New Knowledge

Applications



# FORM: Formalization of GORM

**Real World**

**Abstract World**

**Mathematical Statement**

**Axiom**

**Deduction Rule**

**Proof**

**Truth**

Mathematical  
Model



# Elements of Mathematical Reasoning (Informal)

**Statement:** A well-formed sentence with a truth value.

**Axiom:** An obviously true statement.

**Deduction Rule:** A rule allowing you to derive new true statements from other true statements.

**Proof:** A chain of deductions, starting from axioms, and ending at the statement.

knowledge  $\equiv$  proof

**Hope:** **truth**  $\equiv$  provable



## **Part 1:**

**Essential components of FORM**

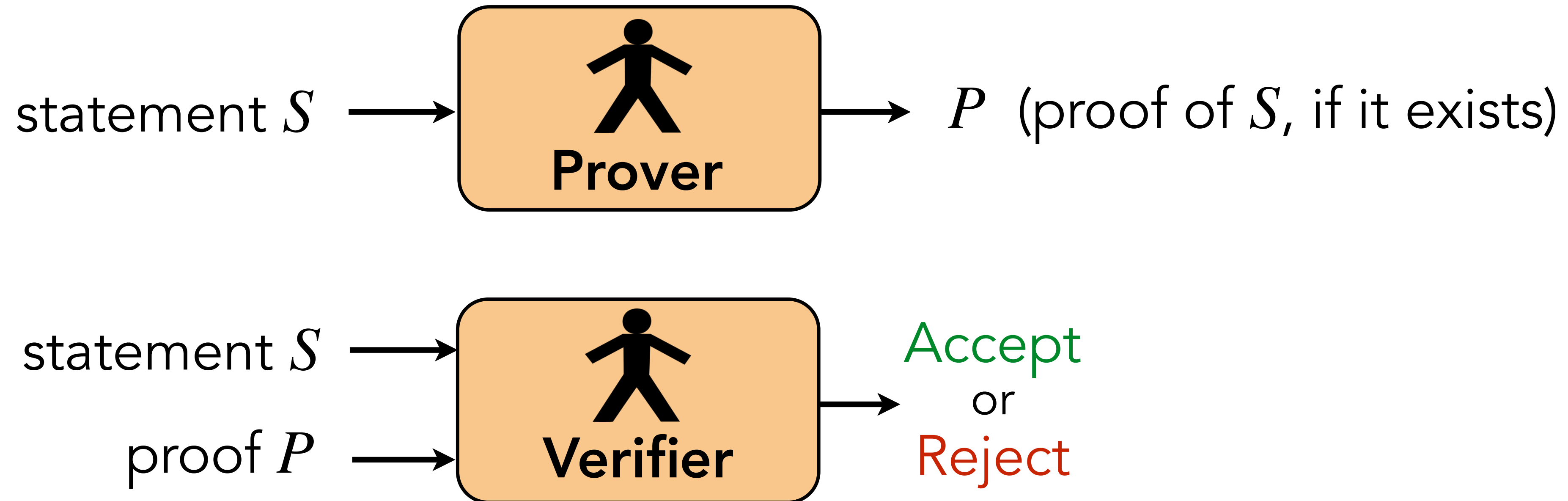
## **Part 2:**

**Proving interesting properties of FORM  
(and therefore GORM)**

**Part 1:**

**Essential components of FORM**

# GORM is a computational process

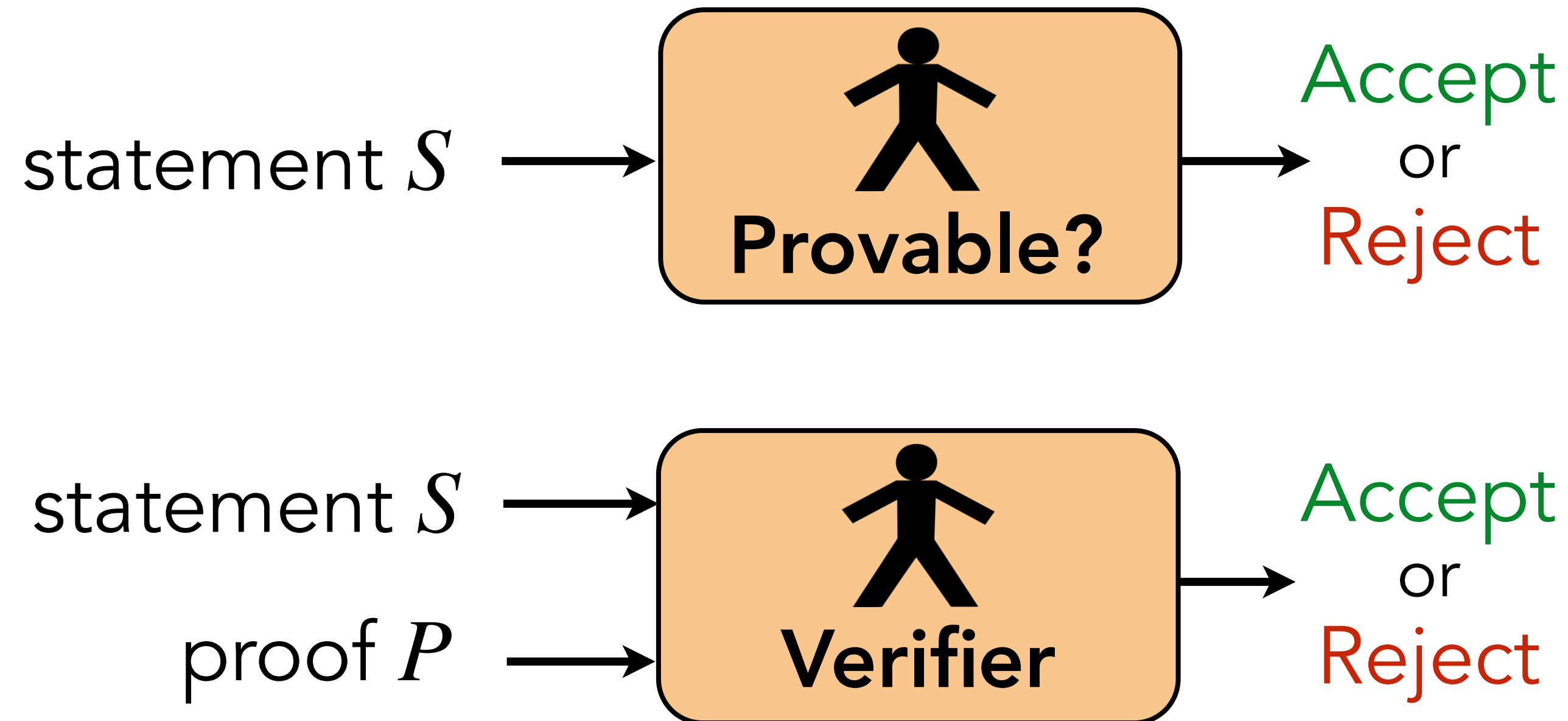


Statements and proofs are represented as **finite-length strings**.



Want verification to be (efficiently) decidable.

# GORM is a computational process



**N** Statements and proofs are represented as **finite-length strings**.

**N** Want verification to be (efficiently) decidable.

# FORM: Formalization of GORM

FORM is a mathematical model (formalization) of GORM such that:

- For every statement  $S$  in GORM with a truth value, there is a precise representation of  $S$  in FORM (denoted by  $\langle S \rangle$ ).
- For every argument  $P$  in GORM, there is a precise representation of  $P$  in FORM (denoted by  $\langle P \rangle$ ).
- FORM specifies a decider TM  $V$  (called a *verifier*) such that  $V(\langle S \rangle, \langle P \rangle)$  accepts iff  $P$  is a proof of  $S$ .

$S$  is **provable** means  $\exists w \in \Sigma^*$  such that  $V(\langle S \rangle, w)$  accepts.

# From Verifier to Prover

Let  $V$  be the verifier. We can build a prover from it:

```
def Prover( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return  $w$ 
```

```
def isProvable( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return True  
      if  $V(\langle \neg S \rangle, w)$  accepts: return False
```



Is there an agreed upon FORM that we can work with?

# The Church-Turing Thesis of Mathematics



# GORM-to-ZFC Thesis

## Church-Turing Thesis (GORA-to-TM Thesis):

TM is the right model for an algorithm.

Every algorithm compiles down to a TM.

## GORM-to-ZFC Thesis:

The *Zermelo–Fraenkel-Choice (ZFC) axiomatic system* is the right model for GORM.

Every GORM-statement compiles down to a ZFC-statement.

Every GORM-proof compiles down to a ZFC-proof.

## **Part 1:**

**Essential components of FORM**

## **Part 2:**

**Proving interesting properties of FORM  
(and therefore GORM)**

Part 2:

**Proving interesting properties of FORM  
(and therefore GORM)**

# Properties you want from FORM

## 1. Consistency

For every statement  $S$ , **at most** one of  $S$  or  $\neg S$  is provable.

Not consistent  $\implies$  Any statement is provable.

## 2. Soundness

If  $S$  is provable, then  $S$  is true.

(false statements are not provable)

Soundness  $\implies$  Consistency.

## 3. Completeness

For every statement  $S$ , **at least** one of  $S$  or  $\neg S$  is provable.

Want to prove  $T$ .

AFSOC  $\neg T$ .

Derive (prove)  $S$ .

Derive (prove)  $\neg S$ .

Contradiction. ■

# Properties you want from an axiomatic system

## 1. Consistency

For every statement  $S$ , **at most** one of  $S$  or  $\neg S$  is provable.

## 2. Soundness

If  $S$  is provable, then  $S$  is true.

(false statements are not provable)

## 3. Completeness

For every statement  $S$ , **at least** one of  $S$  or  $\neg S$  is provable.



**Sound & Complete  $\implies$  truth  $\equiv$  provable.**

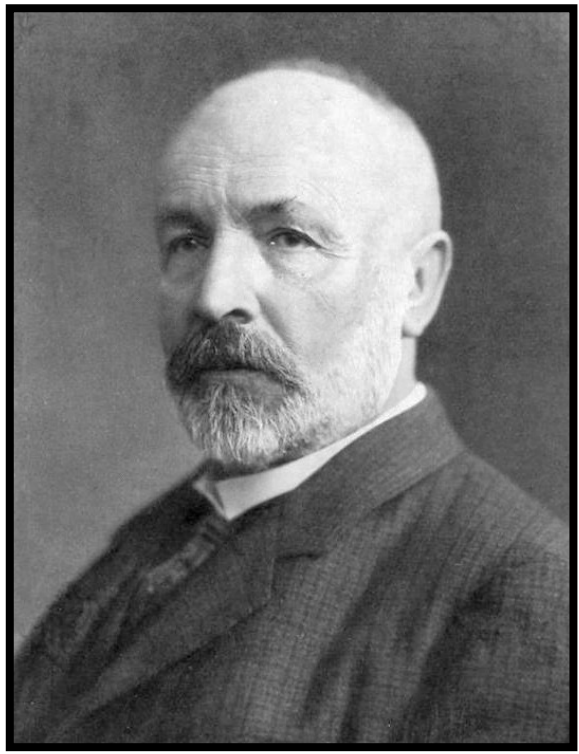
# Hilbert's Program

- Formalize GORM. (Create FORM)
- Prove FORM is **complete**.
- Prove FORM is **consistent**.

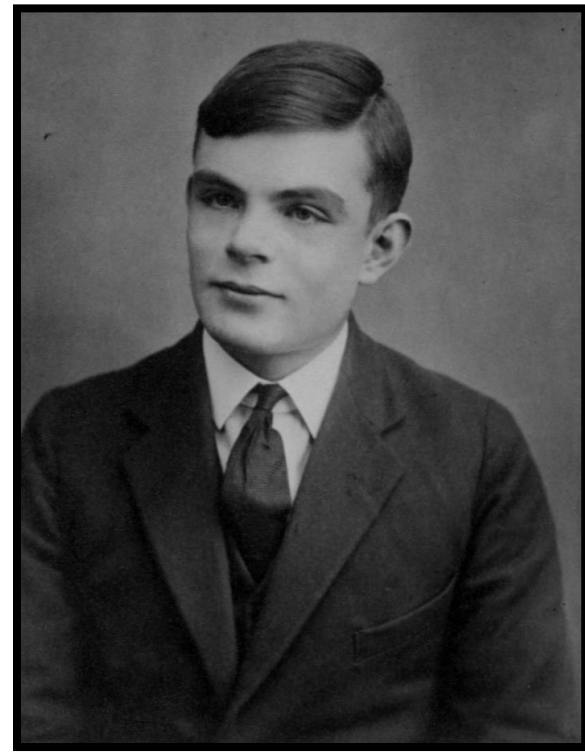
Puzzle: Why not prove **soundness**?



Is Hilbert's Program achievable?



**finite  
vs  
infinite**



**limits of  
computation**



**limits of  
human reasoning**



**Contrapositive:**

"Satisfactory" FORM



Compute the uncomputable

# The Plan

**0th Incompleteness Theorem**

**1st Incompleteness Theorem** (Soundness version #1)

**1st Incompleteness Theorem** (Soundness version #2)

**1st Incompleteness Theorem** (Consistency version)

**2nd Incompleteness Theorem**

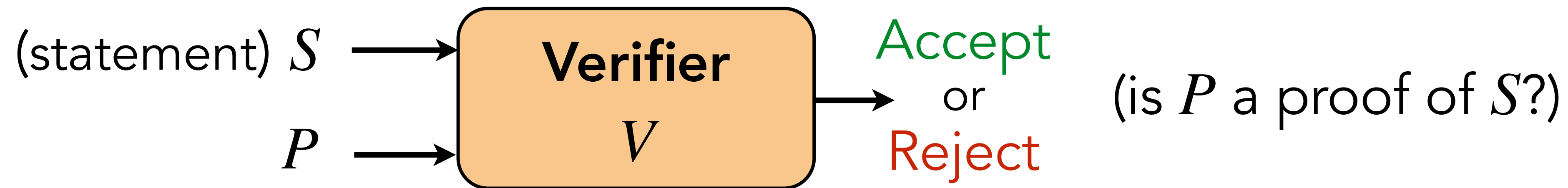


# The Setting

The FORM we are using: **ZFC axiomatic system.**

## GORM-to-ZFC Thesis:

For every GORM-statement and GORM-proof, there is a corresponding ZFC-statement and ZFC-proof.



## Terminology:

$S$  is **provable**: there is a proof of  $S$  in ZFC

$S$  is **independent**: Neither  $S$  nor  $\neg S$  is provable

**Incompleteness**:  $\exists$  an independent  $S$

# The Plan

**0th Incompleteness Theorem**

**1st Incompleteness Theorem** (Soundness version #1)

**1st Incompleteness Theorem** (Soundness version #2)

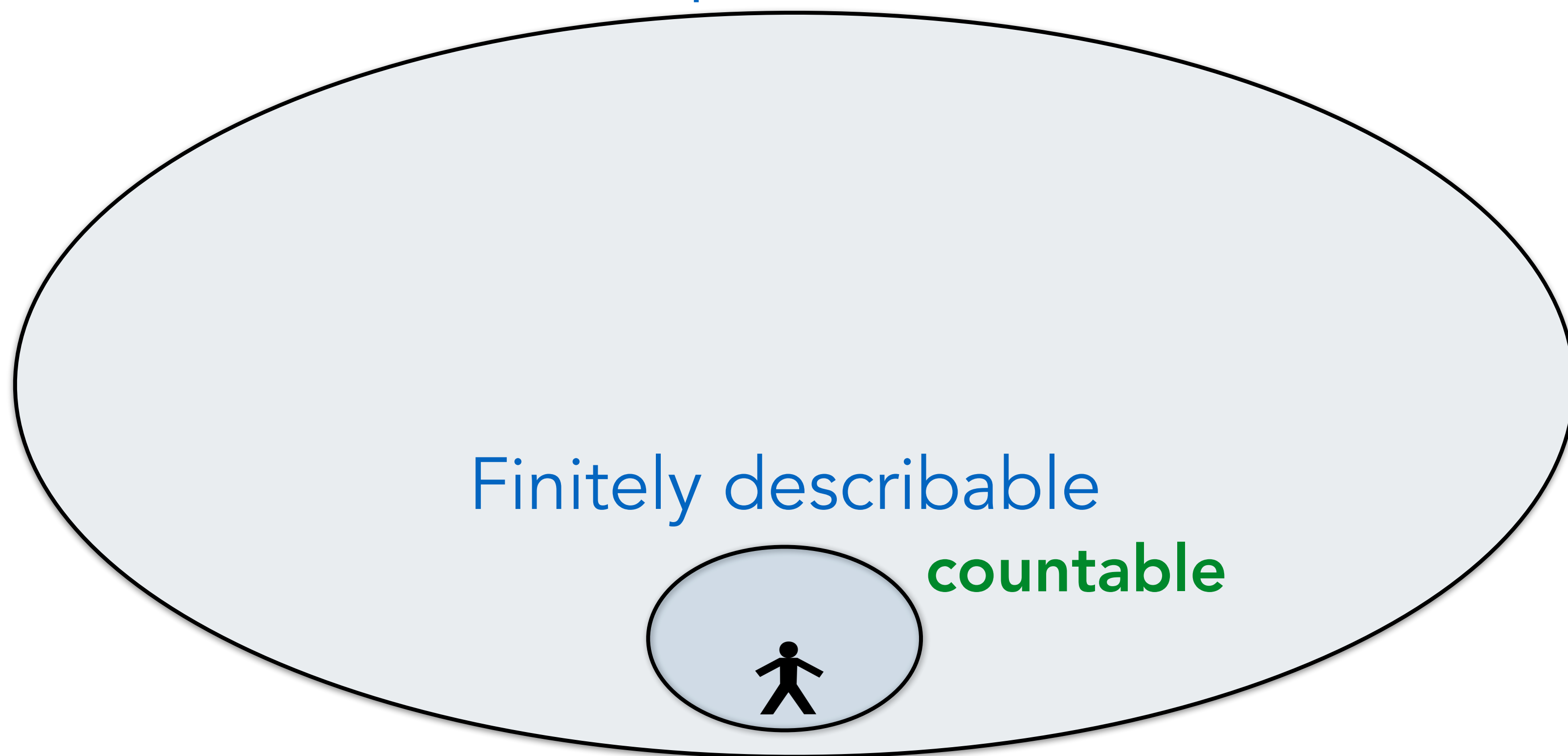
**1st Incompleteness Theorem** (Consistency version)

**2nd Incompleteness Theorem**

# 0th Incompleteness Theorem

# The 0th Incompleteness Theorem

Mathematical Concepts **uncountable**



**Observation:** We can't hope to reason about everything!

# The Plan

**0th Incompleteness Theorem**

**1st Incompleteness Theorem** (Soundness version #1)

**1st Incompleteness Theorem** (Soundness version #2)

**1st Incompleteness Theorem** (Consistency version)

**2nd Incompleteness Theorem**

# **1st Incompleteness Theorem** (Soundness version #1)

# 1st Incompleteness Theorem (Soundness version #1)



Can ZFC be both **sound** & **complete**?

Assume it is. Then **truth**  $\equiv$  **provable**.

We can then compute/decide *any* truth!!!

```
def Resolve( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return True  
      if  $V(\langle \neg S \rangle, w)$  accepts: return False
```

# 1st Incompleteness Theorem (Soundness version #1)



Can ZFC be both **sound** & **complete**?

Assume it is. Then **truth**  $\equiv$  **provable**.

We can then compute/decide *any* truth!!!

```
def isTrue( $\langle S \rangle$ ):  
    for  $k = 1, 2, 3, \dots$   
        for every string  $w$  of length  $k$ :  
            if  $V(\langle S \rangle, w)$  accepts: return True  
            if  $V(\langle \neg S \rangle, w)$  accepts: return False
```

```
def  $M_{\text{HALTS}}(\langle M, x \rangle)$  :  
    return isTrue( $\langle "M(x) \text{ halts}" \rangle$ )
```



# 1st Incompleteness Theorem (Soundness version #1)



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Assume it is. Then **truth**  $\equiv$  **provable**.

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  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return True  
      if  $V(\langle \neg S \rangle, w)$  accepts: return False
```

```
def  $M_{SAT}(\langle M \rangle)$  :  
  return isTrue( $\langle " \exists x$  such that  $M(x)$  accepts" $\rangle$ )
```

# 1st Incompleteness Theorem (Soundness version #1)



Can ZFC be both **sound** & **complete**?

Assume it is. Then **truth**  $\equiv$  **provable**.

We can then compute/decide *any* truth!!!

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def isTrue( $\langle S \rangle$ ):  
    for  $k = 1, 2, 3, \dots$   
        for every string  $w$  of length  $k$ :  
            if  $V(\langle S \rangle, w)$  accepts: return True  
            if  $V(\langle \neg S \rangle, w)$  accepts: return False
```

```
def  $M_{\overline{SA}}$ ( $\langle M \rangle$ ) : # complement of SELF-ACCEPTS  
    return isTrue( $\langle "M$  does not self-accept" $\rangle$ )
```

# 1st Incompleteness Theorem (Soundness version #1)

```
def Resolve( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return True  
      if  $V(\langle \neg S \rangle, w)$  accepts: return False
```

```
def  $M_{\overline{SA}}(\langle M \rangle)$  :  
  return Resolve( $\langle "M$  does not self-accept" $\rangle$ )
```

## Theorem:

ZFC cannot be both sound and complete.  
I.e. if ZFC is sound, then it is **incomplete**.

# The Plan

**0th Incompleteness Theorem**

**1st Incompleteness Theorem** (Soundness version #1)

**1st Incompleteness Theorem** (Soundness version #2)

**1st Incompleteness Theorem** (Consistency version)

**2nd Incompleteness Theorem**

**1st Incompleteness Theorem** (Soundness version #2)

# 1st Incompleteness Theorem (Soundness version #2)



Assume ZFC is sound. What is an explicit statement  $S$  independent of ZFC?

```
def Resolve( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return True  
      if  $V(\langle \neg S \rangle, w)$  accepts: return False
```

```
def  $M_{\overline{SA}}(\langle M \rangle)$  :  
  return Resolve( $\langle "M$  does not self-accept" $\rangle$ )
```

## Observations:

- $M_{\overline{SA}}$  is not a correct decider for  $\overline{SA}$ .
- So for some input (for some  $M$ ),  $M_{\overline{SA}}$  doesn't give the right answer.
- So  $\exists M$  such that  $\text{Resolve}(\langle "M$  does not self-accept" $\rangle)$  doesn't give the right answer.
- So  $\exists M$  such that " $M$  does not self-accept" is independent!

# 1st Incompleteness Theorem (Soundness version #2)



Assume ZFC is sound. What is an explicit statement  $S$  independent of ZFC?

```
def Resolve( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
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```

```
def  $M_{\overline{SA}}(\langle M \rangle)$  :  
  return Resolve( $\langle "M$  does not self-accept" $\rangle$ )
```

	$\langle M_1 \rangle$	$\langle M_2 \rangle$	$\langle M_3 \rangle$	$\dots$
$M_1$	0	$\infty$	1	$\dots$
$M_2$	1	1	1	$\dots$
$M_3$	1	0	$\infty$	$\dots$
$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\dots$
$\overline{SA}$	1	0	1	$\dots$

# 1st Incompleteness Theorem (Soundness version #2)



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	$\langle M_1 \rangle$	$\langle M_2 \rangle$	$\langle M_3 \rangle$	$\dots$
$M_1$	0	$\infty$	1	$\dots$
$M_2$	1	1	1	$\dots$
$M_3$	1	0	$\infty$	$\dots$
$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\dots$
$\overline{SA}$	1	0	1	$\dots$



# 1st Incompleteness Theorem (Soundness version #2)



Assume ZFC is sound. What is an explicit statement  $S$  independent of ZFC?

```
def Resolve( $\langle S \rangle$ ):
  for  $k = 1, 2, 3, \dots$ 
    for every string  $w$  of length  $k$ :
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```

```
def  $M_{\overline{SA}}(\langle M \rangle)$  :
  return Resolve( $\langle "M$  does not self-accept" $\rangle$ )
```

	$\langle M_1 \rangle$	$\langle M_2 \rangle$	$\langle M_3 \rangle$	$\langle M_{\overline{SA}} \rangle$	$\dots$
$M_1$	0	$\infty$	1	0	$\dots$
$M_2$	1	1	1	$\infty$	$\dots$
$M_3$	1	0	$\infty$	0	$\dots$
$M_{\overline{SA}}$	1	0	1	$\infty$	$\dots$
$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$	$\vdots$
$\overline{SA}$	1	0	1		$\dots$

## Conclusions:

- $M_{\overline{SA}}$  does not give the right answer when the input is  $\langle M_{\overline{SA}} \rangle$ .
- $I = "M_{\overline{SA}}$  does not self-accept" is independent of ZFC.

# 1st Incompleteness Theorem (Soundness version #2)

```
def Resolve( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return True  
      if  $V(\langle \neg S \rangle, w)$  accepts: return False
```

```
def  $M_{\overline{SA}}(\langle M \rangle)$  :  
  return Resolve( $\langle "M$  does not self-accept" $\rangle$ )
```

**Definition:**  $I = "M_{\overline{SA}}$  does not self-accept"

**Theorem:** If ZFC is sound,  
" $M_{\overline{SA}}(\langle M_{\overline{SA}} \rangle)$  does not accept" is **independent** of ZFC.

# 1st Incompleteness Theorem (Soundness version #2)

```
def Resolve( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return True  
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```

```
def  $M_{\overline{SA}}(\langle M \rangle)$  :  
  return Resolve( $\langle "M$  does not self-accept" $\rangle$ )
```

**Definition:**  $I = "M_{\overline{SA}}$  does not self-accept"

**Theorem:** ZFC is sound  $\rightarrow I$  is independent of ZFC.

**Theorem:** ZFC is sound  $\rightarrow I$ .



Can we replace "ZFC sound" with "ZFC consistent"?

# The Plan

**0th Incompleteness Theorem**

**1st Incompleteness Theorem** (Soundness version #1)

**1st Incompleteness Theorem** (Soundness version #2)

**1st Incompleteness Theorem** (Consistency version)

**2nd Incompleteness Theorem**

# **1st Incompleteness Theorem** (Consistency version)

# 1st Incompleteness Theorem (Soundness version #2)

```
def Resolve( $\langle S \rangle$ ):  
  for  $k = 1, 2, 3, \dots$   
    for every string  $w$  of length  $k$ :  
      if  $V(\langle S \rangle, w)$  accepts: return True  
      if  $V(\langle \neg S \rangle, w)$  accepts: return False
```

```
def  $M_{\overline{SA}}(\langle M \rangle)$  :  
  return Resolve( $\langle "M$  does not self-accept" $\rangle$ )
```

**Definition:**  $I = "M_{\overline{SA}}$  does not self-accept"

**Theorem:** ZFC is consistent  $\rightarrow I$  is independent of ZFC.

**Theorem:** ZFC is consistent  $\rightarrow I$ .

# The Plan

**0th Incompleteness Theorem**

**1st Incompleteness Theorem** (Soundness version #1)

**1st Incompleteness Theorem** (Soundness version #2)

**1st Incompleteness Theorem** (Consistency version)

**2nd Incompleteness Theorem**

## **2nd Incompleteness Theorem**



# Reductions for provability

# Reductions for provability

Proving  $S$  **reduces** to proving  $T$  means: " $T \rightarrow S$ " is provable.

If  $S$  **reduces** to  $T$  then:

$$T \text{ provable} \implies S \text{ provable}$$
$$S \text{ unprovable} \implies T \text{ unprovable}$$


Can use reductions to expand the landscape of **unprovability**.

# 2nd Incompleteness Theorem

Proving  $S$  **reduces** to proving  $T$  means: " $T \rightarrow S$ " is provable.

If  $S$  **reduces** to  $T$  then:

$$T \text{ provable} \implies S \text{ provable}$$
$$S \text{ unprovable} \implies T \text{ unprovable}$$

$I = "M_{\overline{SA}}$  does not self-accept" is **unprovable**.

So any  $T$ , such that  $I$  reduces to  $T$ , is **unprovable**.

**Theorem:** ZFC is consistent  $\rightarrow I$ .

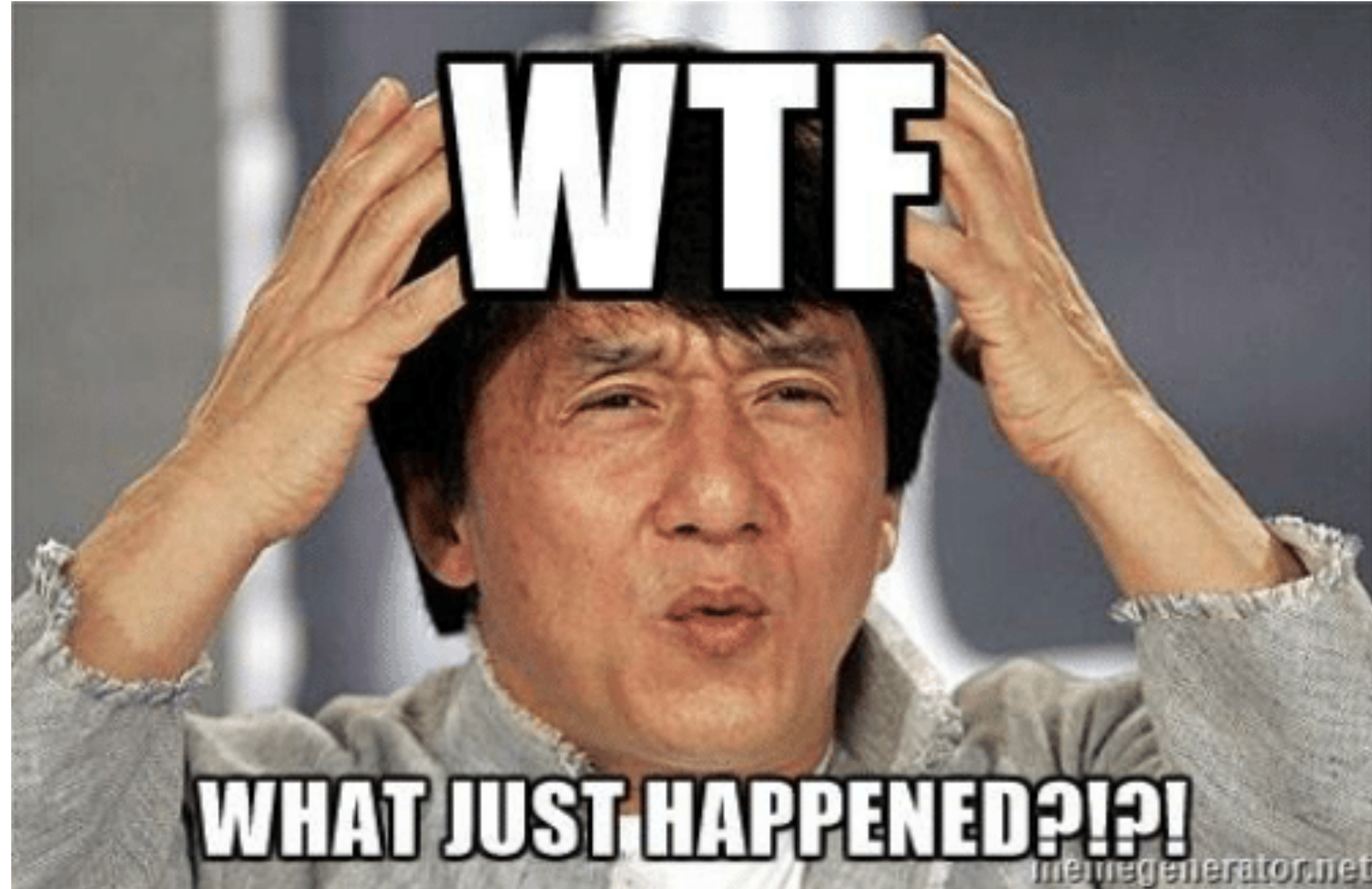
**By GORM-to-ZFC Thesis**

$\exists$  GORM-proof of theorem  $\longrightarrow \exists$  ZFC-proof of theorem

# 2nd Incompleteness Theorem

## Theorem:

If ZFC is consistent, "ZFC is consistent" is not provable.



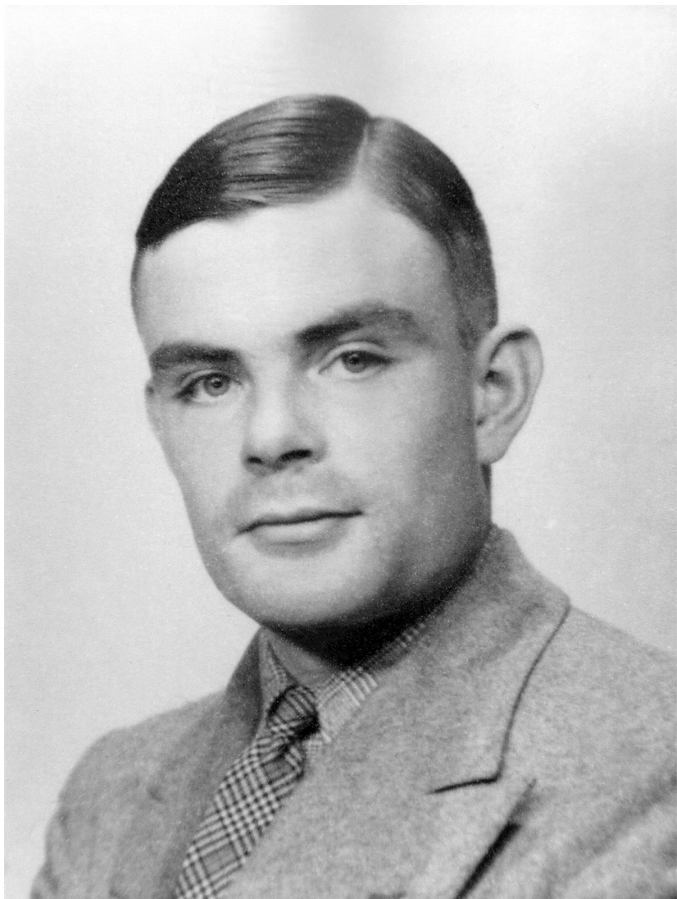
# Hilbert's Program

- Formalize GORM. (Create FORM)
- Prove FORM is **complete**.
- Prove FORM is **consistent**.



# Hilbert's Program

- Formalize GORM. (Create FORM)
- Prove FORM is **complete**.
- Prove FORM is **consistent**.
- Prove  $\text{isProvable}$  is **decidable**.



$\text{isProvable}$  is undecidable!

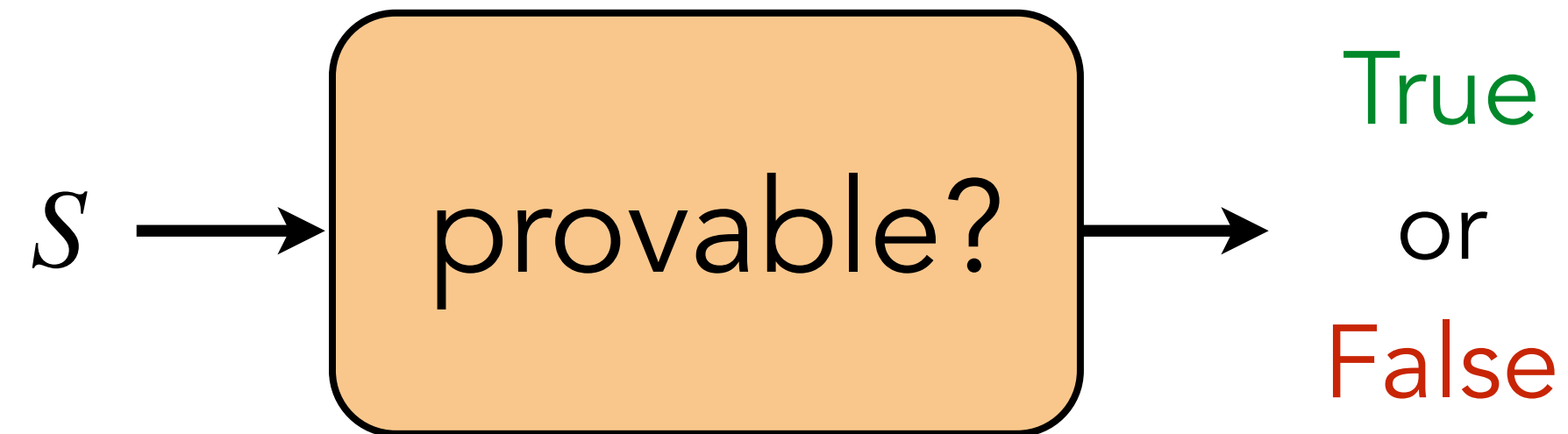


# That's all for PART 1 of CS251

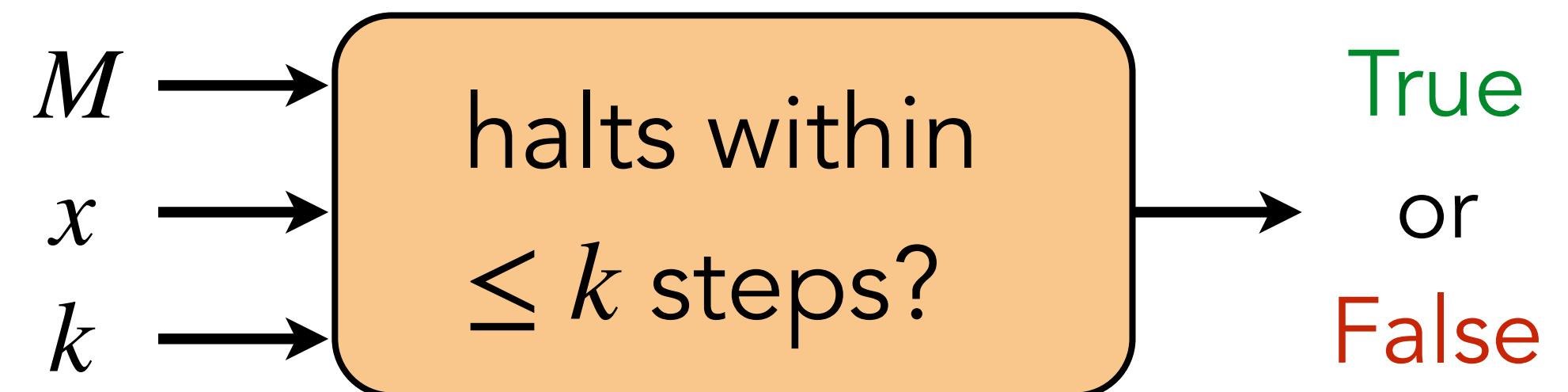
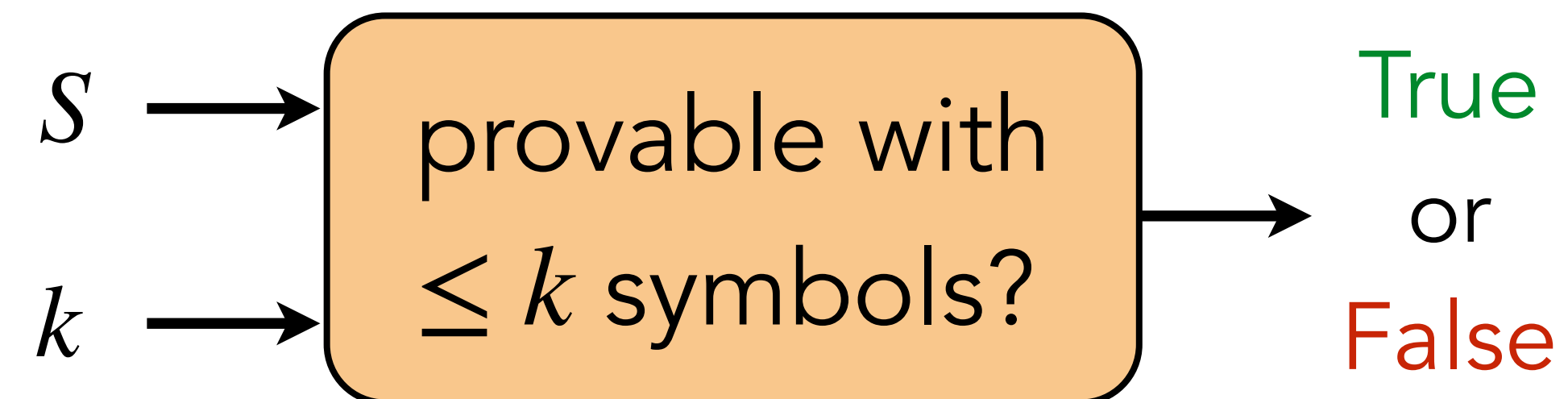
- Foundations of math.
- Birth of computer science.
- Formalizing computation.
- Uncountability  $\rightarrow$  Uncomputability  $\rightarrow$  Unprovability.

# What is next?

Yes, the following (and many more) are uncomputable:



What about:



**These are computable!** But are they **practically computable?**

# What is next?



We enter the land of **complexity theory** and the famous "**P** vs **NP**".