

# Great Theoretical Ideas In Computer Science

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CS 15-251

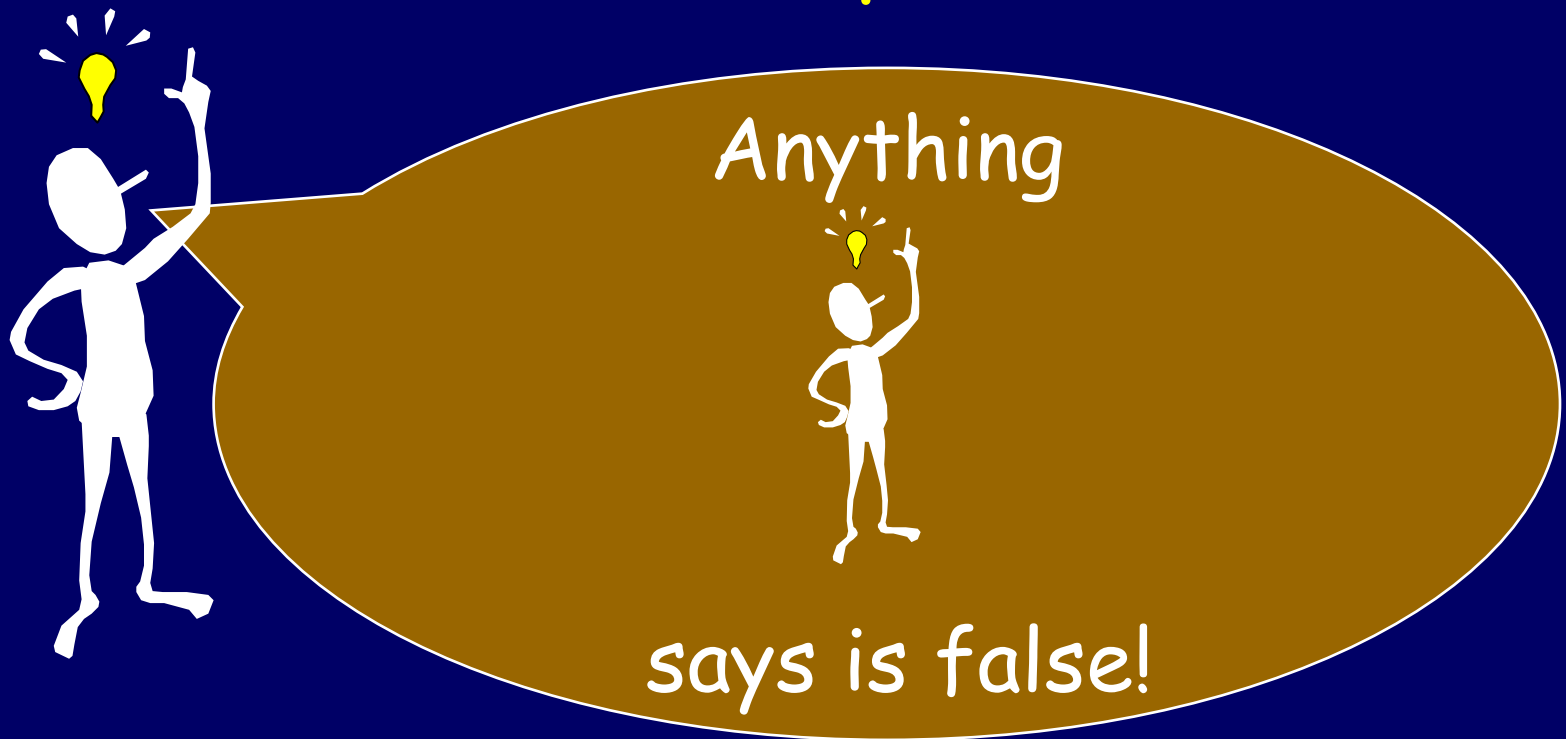
Fall 2005

Lecture 26

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Carnegie Mellon University

## Turing's Legacy: The Limits Of Computation.





# The HELLO assignment

Write a JAVA program to output the word "HELLO" 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.



# Grading Script

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

$$G(P) = \begin{cases} \text{Pass, if } P \text{ prints only the word} \\ \quad \text{"HELLO" and halts.} \\ \text{Fail, otherwise.} \end{cases}$$

How exactly might such a script work?

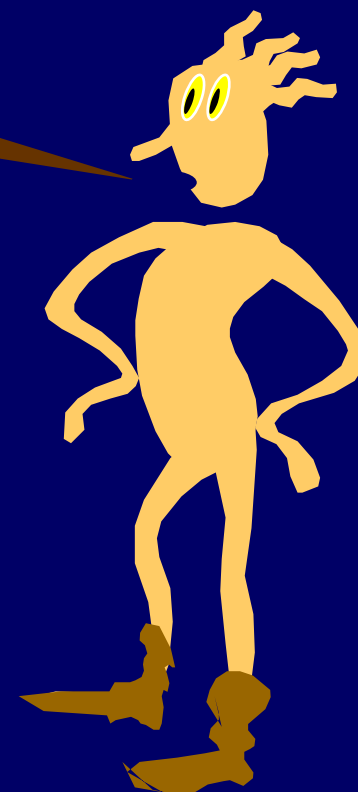


# What does this do?

```
#include <stdio.h> main(t,_,a)char *a;{return!0<t?t<3?main(-79,-  
13,a+main(-87,1-_, main(-  
86,0,a+1)+a)):1,t<_?main(t+1,_,a):3,main(-94,-  
27+t,a)&& t==2?_<13? main(2,_,+1,"%s %d %d\n"):9:16:t<0?t<-  
72?main(_,t,  
"@n'+,#'/*{}w+/w#cdnr/+,{r/*de}+,/*{*+,/w{%,/w#q#n+,#{l,+,/n{n+,/  
+#n+,/#\ ;#q#n+,/+k#;*+,/'r :!d*3,}{w+K w'K:'+}e#';dq#'\ \n  
q#+d'K#!/+k#;q#r}eKK#}w'r}eKK{nl]'/#;#q#n')})#}w')}{nl]'/+#n';d}rw'  
i;#\ )}{nl]!/n{n#'; r{#w'r nc{nl]'/#{l,+ 'K {rw' iK;[{nl]'/w#q#n'wk nw' \  
iwk{KK{nl]!/w{%'l##w#' i; :{nl]/'*{q#ld;r'}{nlwb!/*de}'c \ ;;{nl'-  
{rw]'/+,#}##*}#nc,',#nw]'/+kd'+e}+;#rdq#w! nr/' ') }+}{rl#{n' ')# \  
'+}##(!!/" ) :t<-50?_==*a?putchar(31[a]):main(-  
65,_,a+1):main((*a=='/')+t,_,a+1)  
:0<t?main(2,2,"%s"): *a=='/'||main(0,main(-61,*a, "!ek;dc i@bK'(q)-  
[w]*%n+r3#l,{: \nuwloca-O;m .vpbks,fxntdCeghiry"),a+1);}
```



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





# Nasty Program

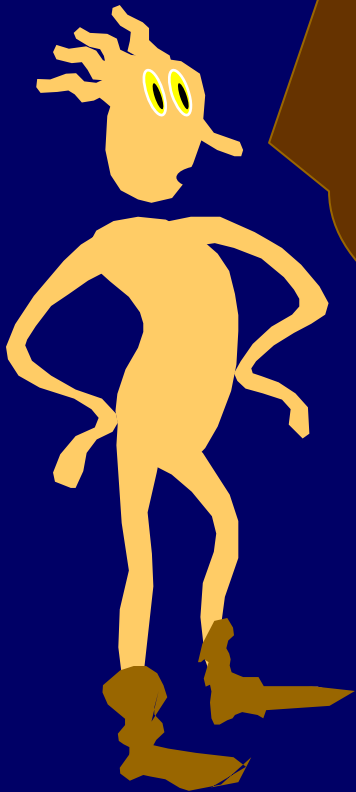
```
n:=0;  
while (n is not a counter-example  
       to the Riemann Hypothesis) {  
    n++;  
}  
print "Hello";
```

The nasty program is a PASS if and only if the Riemann Hypothesis is true.



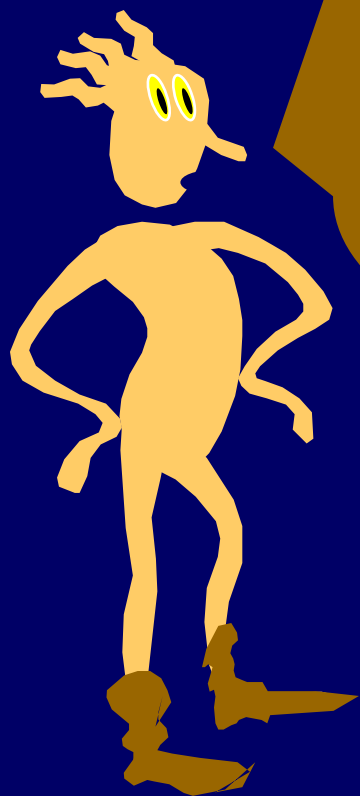
Despite the simplicity of  
the HELLO assignment,  
there is no program to  
correctly grade it!

And we will prove this.





The theory of what can and can't be computed by an ideal computer is called Computability Theory or Recursion Theory.







From Lecture 25:

Are all reals describable?

**NO**

Are all reals computable?

**NO**

We saw that  
computable  $\Rightarrow$  describable,  
but do we also have  
describable  $\Rightarrow$  computable?



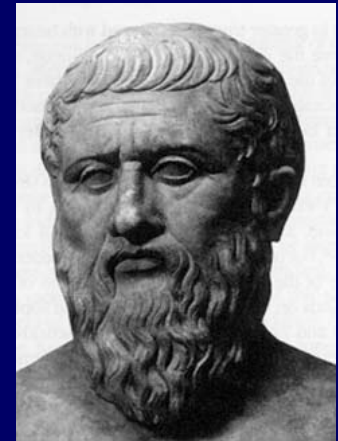
The "grading function" we just described  
is not computable! (We'll see a proof soon.)



# Infinite RAM Model

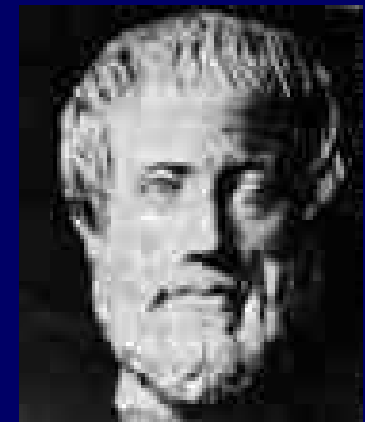
## Platonic Version:

One memory location for each natural number  $0, 1, 2, \dots$



## Aristotelian Version:

Whenever you run out of memory, the computer contacts the factory. A maintenance person is flown by helicopter and attaches 100 Gig of RAM and all programs resume their computations, as if they had never been interrupted.





# Computable Function

Fix any finite set of symbols,  $\Sigma$ .

Fix any precise programming language, e.g., Java.

A program is any finite string of characters that is syntactically valid.

A function  $f : \Sigma^* \rightarrow \Sigma^*$  is computable if there is a program  $P$  that when executed on an ideal computer, computes  $f$ .

That is, for all strings  $x$  in  $\Sigma^*$ ,  $f(x) = P(x)$ .



# Computable Function

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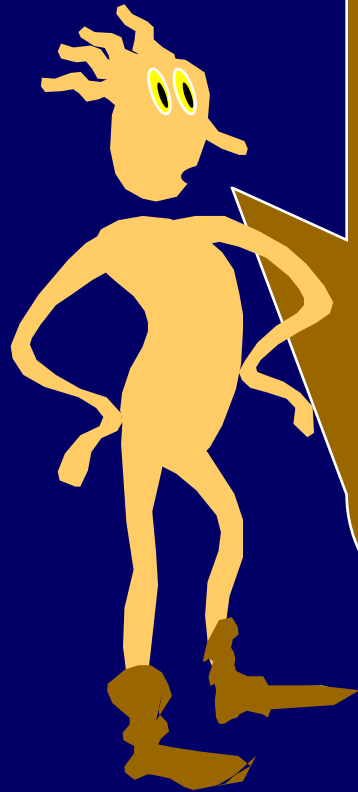
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That is, for all strings  $x$  in  $\Sigma^*$ ,  $f(x) = P(x)$ .

**Hence: countably many computable functions!**



There are only  
countably many Java  
programs.



Hence, there are only  
countably many  
computable functions.



# Uncountably many functions

$$f: \Sigma^* \rightarrow \Sigma^*$$

The functions  $f: \Sigma^* \rightarrow \{0,1\}$  are in 1-1 onto correspondence with the subsets of  $\Sigma^*$  (the powerset of  $\Sigma^*$  ).

Subset $S$ of $\Sigma^*$	$\Leftrightarrow$	Function $f_S$
$x$ in $S$	$\Leftrightarrow$	$f_S(x) = 1$
$x$ not in $S$	$\Leftrightarrow$	$f_S(x) = 0$

$$\# \text{ of subsets of } \Sigma^* = | \text{ Powerset of } \Sigma^* |$$



# Uncountably many functions

The functions  $f: \Sigma^* \rightarrow \{0,1\}$  are in 1-1 onto correspondence with the subsets of  $\Sigma^*$  (the powerset of  $\Sigma^*$  ).

Hence, the set of all  $f: \Sigma^* \rightarrow \{0,1\}$  has the same size as the power set of  $\Sigma^*$ .

And since  $\Sigma^*$  is countably infinite, its power set is uncountably infinite.

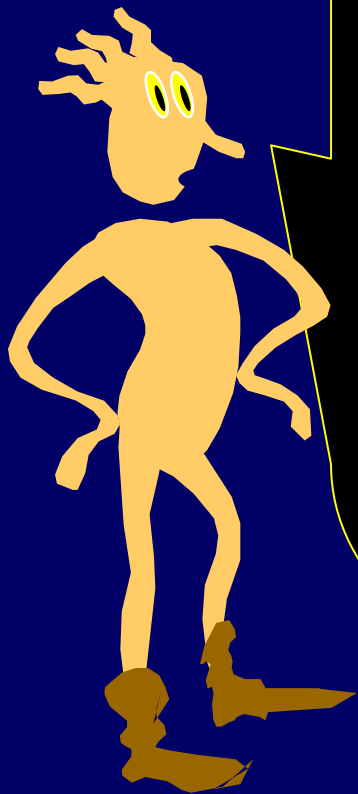
$$\text{size of Powerset}(A) > \text{size of } A.$$



Countably many  
computable functions.

Uncountably many  
functions from  $\Sigma^*$  to  $\{0,1\}$ .

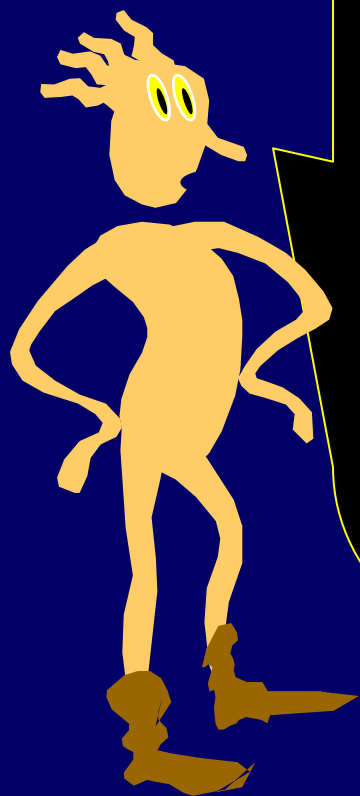
Thus, most functions  
from  $\Sigma^*$  to  $\{0,1\}$  are not  
computable.







Can we explicitly  
**describe** an incomputable  
function?



Can we **describe** an  
interesting incomputable  
function?



# Notation And Conventions

Fix a single programming language (Java)

$P$  When we write **program  $P$**  we are talking about the text of the source code for  $P$

$P(x)$   $P(x)$  means **the output** that arises from running program  $P$  on input  $x$ , assuming that  $P$  eventually halts.

$P(x) = \perp$  means  $P$  did not halt on  $x$



# The meaning of $P(P)$

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

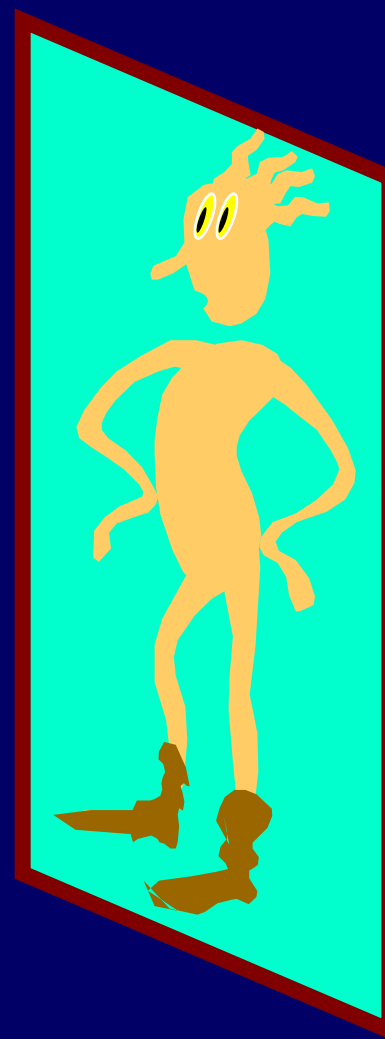
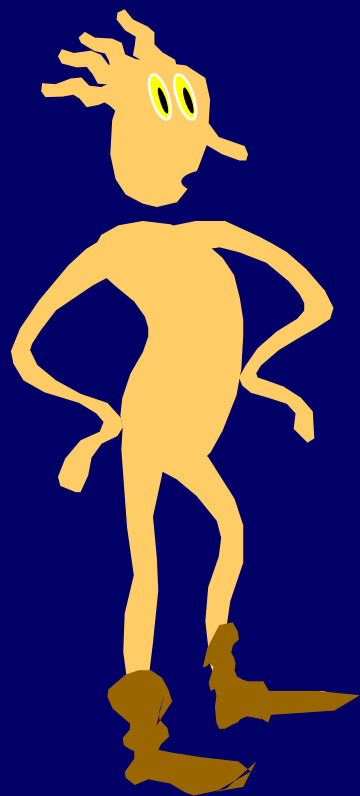
```
Input I
{
  P
}
{
}
```

$P(P)$   
= output  
when  
is run.

```
Input I = P
{
}
{
}
```



$P(P)$  ... So that's what I look like





# The Halting Set K

## Definition:

K is the set of all programs P such that P(P) halts.

$$K = \{ \text{Java } P \mid P(P) \text{ halts} \}$$



# 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

HALT(P) = yes if and only if  $P \in K$



# The Halting Problem

$$K = \{P \mid P(P) \text{ halts} \}$$

Is there a program HALT such that:

$\text{HALT}(P) = \text{yes, if } P \in K$

$\text{HALT}(P) = \text{no, if } P \notin K$

HALT decides whether or not any given program is in  $K$ .



**THEOREM:** There is no program to  
solve the halting problem  
(Alan Turing 1937)

Suppose a program HALT existed that solved  
the halting problem.

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 CONFUSE.





# CONFUSE

```
CONFUSE(P)
{ if (HALT(P))
    then loop forever;           //i.e., we dont halt
  else exit;                     //i.e., we halt
  // text of HALT goes here
}
```

Does CONFUSE(CONFUSE) halt?



# CONFUSE

```
CONFUSE(P)
{ if (HALT(P))
    then loop forever;           //i.e., we dont halt
  else exit;                     //i.e., we halt
  // text of HALT goes here }
```

HALT(P)  
= { yes if P(P) halts  
no otherwise

Suppose CONFUSE(CONFUSE) halts  
then HALT(CONFUSE) = TRUE  
⇒ CONFUSE will loop forever on input CONFUSE

Suppose CONFUSE(CONFUSE) does not halt

**CONTRADICTION**

⇒ CONFUSE will halt on input CONFUSE



# Alan Turing (1912-1954)

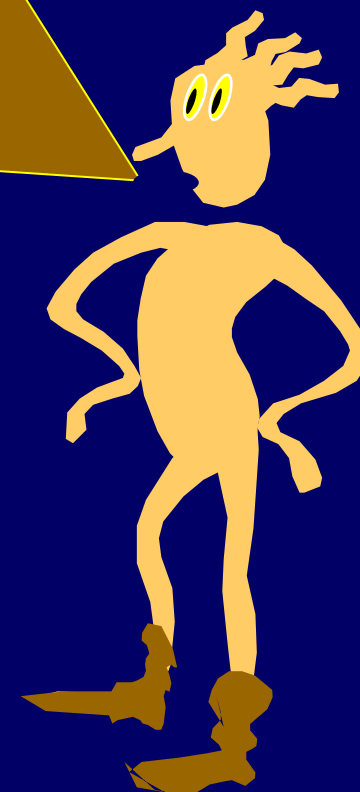
Theorem: [1937]

There is no program to  
solve the halting  
problem





Turing's argument is essentially the reincarnation of Cantor's **Diagonalization argument** that we saw in the previous lecture.





## All Programs (the input)

	$P_0$	$P_1$	$P_2$	...	$P_j$	...
$P_0$						
$P_1$						
...						
$P_i$						
...						

All Programs

Programs (computable functions) are countable,  
so we can put them in a (countably long) list



# All Programs (the input)

All Programs

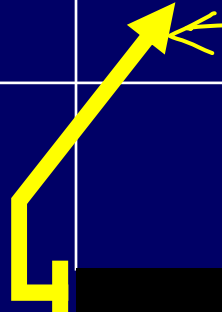
	$P_0$	$P_1$	$P_2$	...	$P_j$	...
$P_0$						
$P_1$						
...						
$P_i$						
...						

$P_0(P_j)$  halts?

does  $P_i(P_j)$  halt?



Yes if  $P_0(P_0)$  halts  
No o.w.



YES, if  $P_i(P_j)$  halts  
No, otherwise



# All Programs (the input)

All Programs

	$P_0$	$P_1$	$P_2$	...	$P_j$	...
$P_0$	$N d_0^Y$					
$P_1$		$Y d_1^N$				
...			$N \leftarrow \dots \rightarrow Y$			
$P_i$				$N d_i^Y$		
...					$Y \leftarrow \dots \rightarrow N$	

*Confuse will say*

Let  $d_i = \text{HALT}(P_i)$

CONFUSE( $P_i$ ) halts iff  $d_i = \text{no}$   
(The CONFUSE function is the negation of the diagonal.)

Hence CONFUSE cannot be on this list.

# Alan Turing (1912-1954)

Theorem: [1937]

There is no program to solve the halting problem

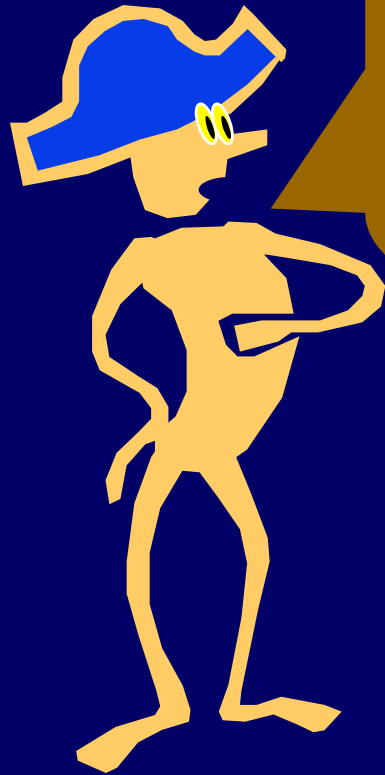


if you could solve halting problem, then  
CONFUSE would be computable  
but CONFUSE is not computable (by prev. diagonalization argument)  
 $\Rightarrow$  halting problem is not solvable.





From last lecture:



Is there a real number that can be described, but not computed?

$R_K = \text{"halting real"}$

Consider the real number  $R_K$  whose binary expansion has a 1 in the  $j^{\text{th}}$  position iff  $P_j \in K$  (i.e., if the  $j^{\text{th}}$  program halts).





# Proof that $R_K$ cannot be computed

Suppose it is, and program **FRED** computes it.  
then consider the following program:

```
MYSTERY(program text P)
  for j = 0 to forever do {
    if (P == Pj)
      then use FRED to compute jth bit of  $R_K$ 
  }
  return YES if (bit == 1), NO if (bit == 0)
}
```

**MYSTERY** solves the halting problem!



# Computability Theory: Vocabulary Lesson

We call a set  $S \subseteq \Sigma^*$  decidable or recursive if there is a program  $P$  such that:

$P(x) = \text{yes}$ , if  $x \in S$

$P(x) = \text{no}$ , if  $x \notin S$

We already know: the halting set  $K$  is undecidable



# Decidable and Computable

Subset $S$ of $\Sigma^*$	$\Leftrightarrow$	Function $f_S$
$x$ in $S$	$\Leftrightarrow$	$f_S(x) = 1$
$x$ not in $S$	$\Leftrightarrow$	$f_S(x) = 0$

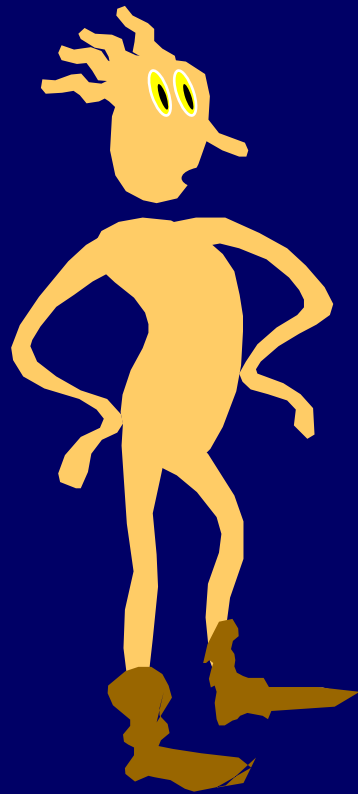
Set  $S$  is decidable  $\Leftrightarrow$  function  $f_S$  is computable

Sets are "decidable" (or undecidable), whereas functions are "computable" (or not)



# Oracles and Reductions

# Oracle For Set S



Is  $x \in S$ ?



YES/NO

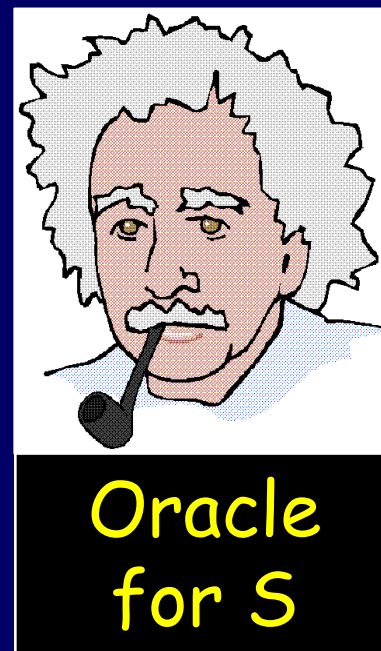
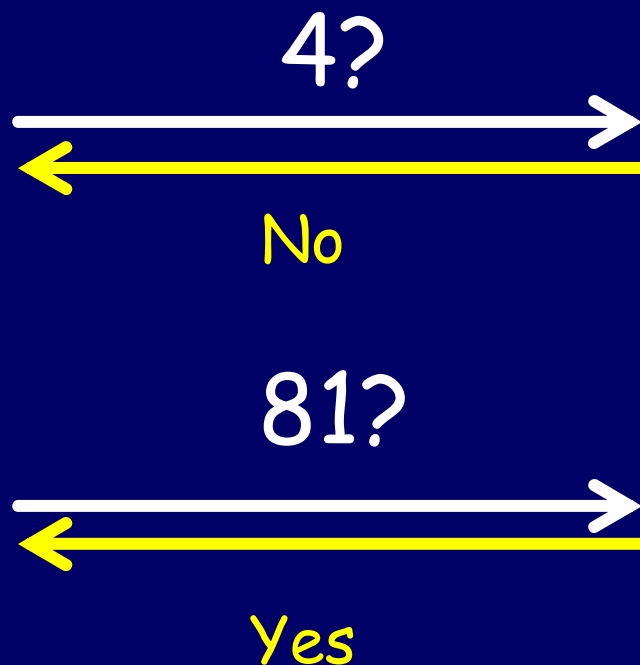
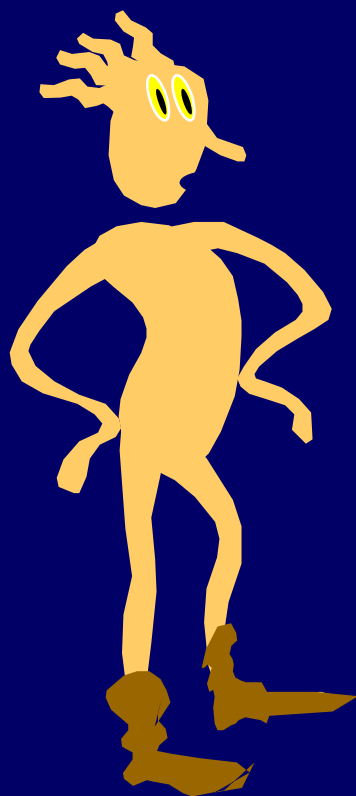


Oracle  
for S



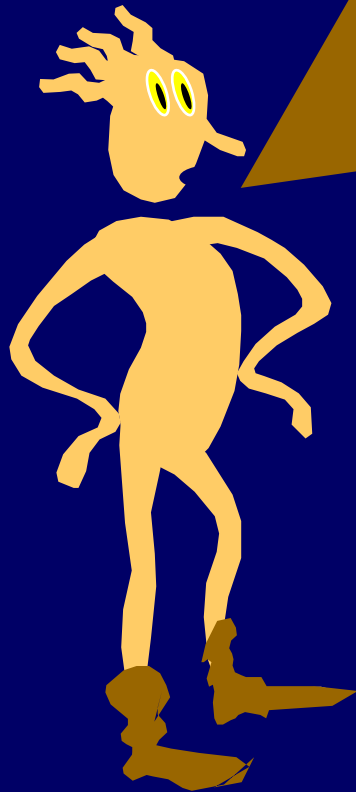
# Example Oracle

$S = \text{Odd Naturals}$





$K_0$  = the set of programs that take no input and halt



Hey, I order an oracle for the famous halting set  $K$ , but when I opened the package it was an oracle for the different set  $K_0$ .




**GIVEN:**  
Oracle  
for  $K_0$

But you can use this oracle for  $K_0$  to build an oracle for  $K$ .




$K_0$  = the set of programs that take  
no input and halt

$P = [\text{input } I; Q]$   
Does  $P(P)$  halt?



**BUILD:**  
Oracle  
for  $K$

Does  $[I := P; Q]$  halt?

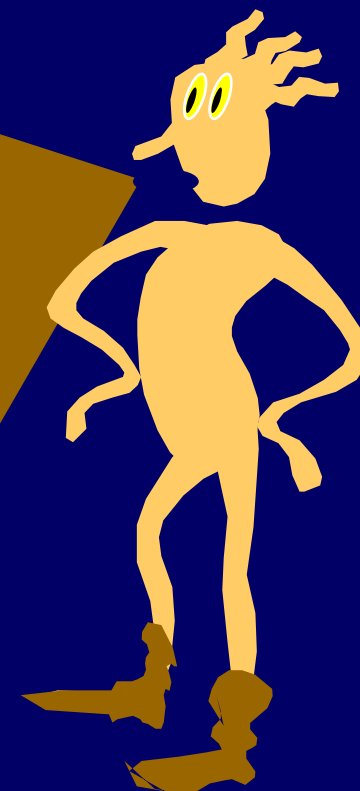


**GIVEN:**  
Oracle  
for  $K_0$



We've reduced the problem of deciding membership in  $K$  to the problem of deciding membership in  $K_0$ .

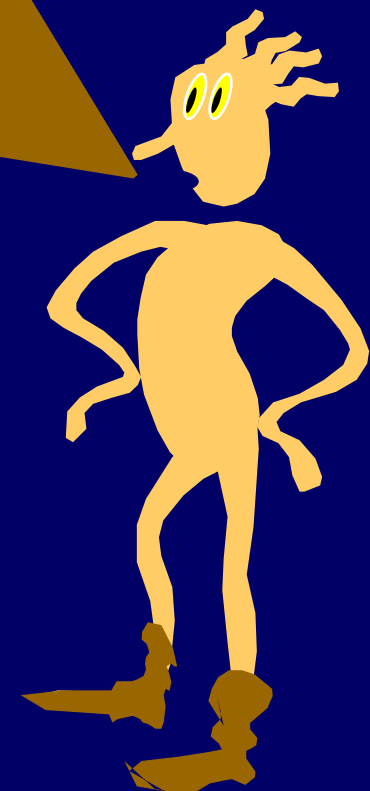
Hence, deciding membership for  $K_0$  must be at least as hard as deciding membership for  $K$ .





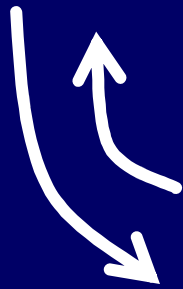
Thus if  $K_0$  were decidable  
then  $K$  would be as well.

We already know  $K$  is not  
decidable, hence  $K_0$  is not  
decidable.



HELLO = the set of program that  
print hello and halt

Does P halt?

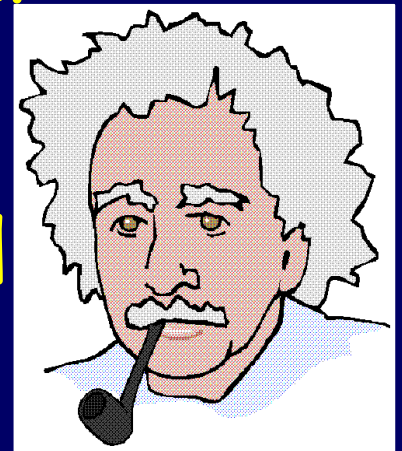


Let P' be P with all print  
statements removed.



**BUILD:**  
Oracle  
for  $K_0$

Is [P'; print HELLO]  
a hello program?



**GIVEN:**  
HELLO  
Oracle



Hence, the set  
HELLO is not  
decidable.


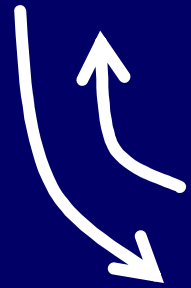





EQUAL = All  $\langle P, Q \rangle$  such that P and Q have identical output behavior on all inputs

Is P in set HELLO?

Let HI = [print HELLO]



**BUILD:**  
HELLO  
Oracle



**GIVEN:**  
EQUAL  
Oracle



Halting with input,  
Halting without input,  
HELLO, and  
EQUAL are all  
undecidable.







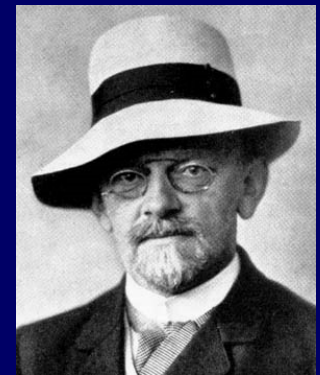
# Diophantine Equations

Does polynomial  $4X^2Y + XY^2 = 0$  have an integer root?  
I.e., does it have a zero at a point where all variables are integers?

$D = \{\text{multi-variant integer polynomials } P \mid P \text{ has a root where all variables are integers}\}$

**Famous Theorem:**  $D$  is undecidable!

[This is the solution to Hilbert's  
10<sup>th</sup> problem]



Hilbert



# Resolution of Hilbert's 10<sup>th</sup> Problem: Dramatis Personae



Martin Davis, Julia Robinson, Yuri Matiyasevich (1982)

and...



# Good old Fibonaccimal...

Define “Fibonaccimal numbers” as follows:

Consider a sequence of digits  $S = (a_n, a_{n-1}, \dots, a_3, a_2, a_1)$ , where (i) each  $a_i \in \{0, 1\}$ ; (ii) no consecutive 1's occurs in  $S$ , i.e., for all  $1 \leq i \leq n-1$ ,  $a_i + a_{i+1} \leq 1$ ; and (iii)  $S$  has no leading zero, i.e.,  $a_n = 1$ . We call  $S$  a “Fibonaccimal number” of length  $n$  and interpret it as the number

$$\sum_{i=1}^n a_i F_i$$

For example,  $(1) = F_1 = 1$ ,  $(1, 0) = F_2 = 2$ ,  $(1, 0, 0) = F_3 = 3$ ,  $(1, 0, 1) = F_3 + F_1 = 4$ ,  $(1, 0, 0, 0) = F_4 = 5$ , etc. Note that  $(1, 1, 0)$  would **not** be a valid Fibonaccimal number.

- (20 points) Show that any positive integer  $N$  can be expressed in the “Fibonaccimal” representation.
- (15 points) Prove also that the representation is unique for all positive integer. That is, for each integer  $N \geq 1$ , if  $S_1$  and  $S_2$  both represent  $N$ , then the two sequences  $S_1$  and  $S_2$  are identical.

**Zeckendorf's Theorem:** Every number can be represented uniquely in the Fibonaccimal representation!



# Polynomials can encode programs.

There is a computable function

$F$ : Java programs that take no input  $\rightarrow$   
Polynomials over the integers


Such that

program  $P$  halts  $\Leftrightarrow F(P)$  has an integer root




$D =$  the set of all integers  
polynomials with integer roots

Does program  $P$   
halt?



**BUILD:**  
HALTING  
Oracle

$F(P)$  has  
integer root?

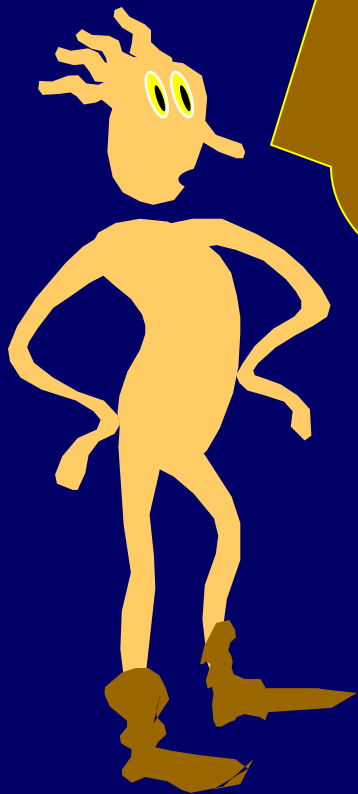


**GIVEN:**  
Oracle  
for  $D$





Problems that have no obvious relation to halting, or even to computation can encode the Halting Problem in non-obvious ways.





# Self-Reference Puzzle

Write a program that prints itself out as output. No calls to the operating system, or to memory external to the program.



# HW12: Auto Cannibal Maker

Write a program `AutoCannibalMaker` that takes the text of a program `EAT` as input and outputs a program called `SELFEAT`.

When `SELFEAT` is executed, it should output `EAT(SELFEAT)`





Suppose HALT with no input was programmable in JAVA.

Write a program AutoCannibalMaker that takes the text of a program EAT as input and outputs a program called  $SELF_{EAT}$ .

When  $SELF_{EAT}$  is executed it should output  $EAT(SELF_{EAT})$

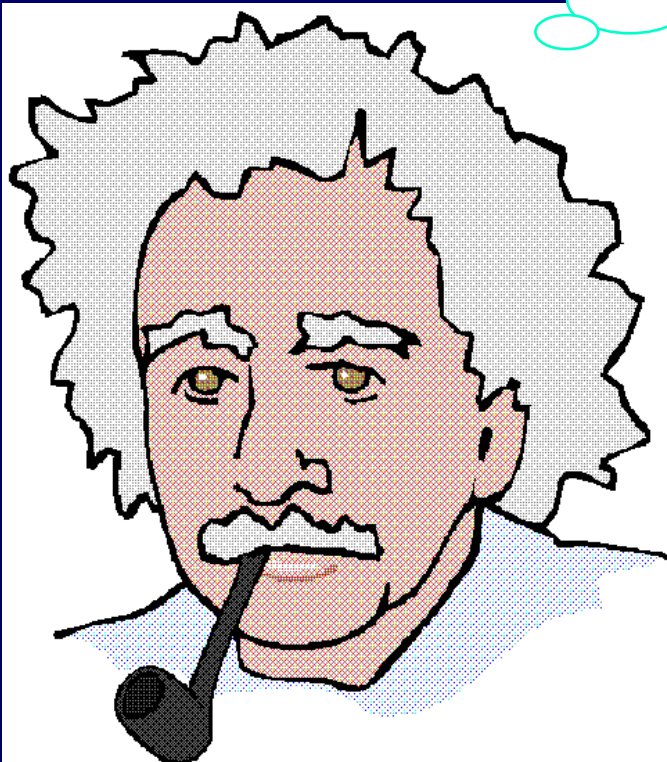
Let  $EAT(P) = \text{halt}$ , if  $P$  does not halt  
loop forever, otherwise.

What does  $SELF_{EAT}$  do?

**Contradiction! Hence EAT does not have a corresponding JAVA program.**



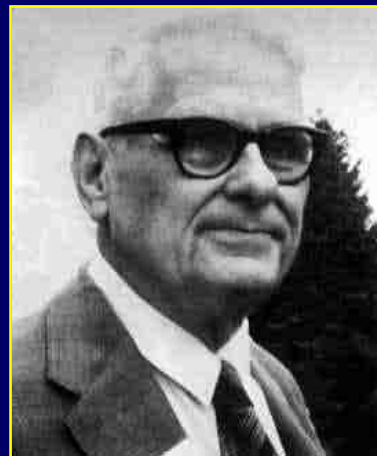
PHILOSOPHICAL  
INTERLUDE





# CHURCH-TURING THESIS

Any well-defined procedure that can be grasped and performed by the human mind and pencil/paper, can be performed on a conventional digital computer with no bound on memory.





The Church-Turing Thesis is NOT a theorem. It is a statement of belief concerning the universe we live in.

Your opinion will be influenced by your religious, scientific, and philosophical beliefs.



# Empirical Intuition

No one has ever given a counter-example to the Church-Turing thesis. I.e., no one has given a concrete example of something humans compute in a consistent and well defined way, but that can't be programmed on a computer. The thesis is true.



## Mechanical Intuition

The brain is a machine. The components of the machine obey fixed physical laws. In principle, an entire brain can be simulated step by step on a digital computer. Thus, any thoughts of such a brain can be computed by a simulating computer. The thesis is true.



# Spiritual Intuition

The mind consists of part matter and part soul. Soul, by its very nature, defies reduction to physical law. Thus, the action and thoughts of the brain are not simulable or reducible to simple components and rules. The thesis is false.



# Quantum Intuition

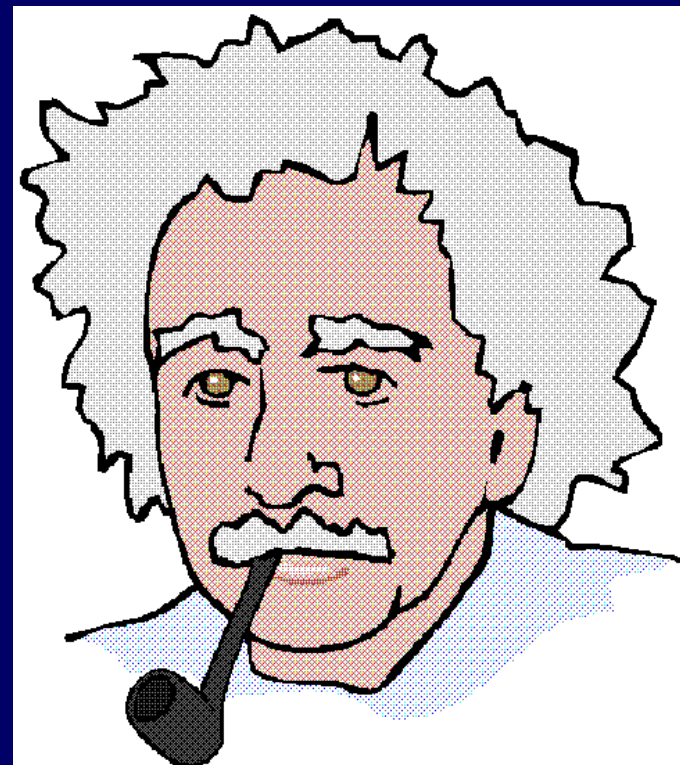
The brain is a machine, but not a classical one. It is inherently quantum mechanical in nature and does not reduce to simple particles in motion. Thus, there are inherent barriers to being simulated on a digital computer. The thesis is false. However, the thesis is true if we allow quantum computers.





There are many other viewpoints you might have concerning the Church-Turing Thesis.

But this ain't philosophy class!





Another important notion



# Computability Theory: Vocabulary Lesson

We call a set  $S \subseteq \Sigma^*$  enumerable or recursively enumerable (r.e.) if there is a program  $P$  such that:

$P$  prints an (infinite) list of strings.

- Any element on the list should be in  $S$ .
- Each element in  $S$  appears after a finite amount of time.



Is  
the halting set  $K$   
enumerable?





# Enumerating K

```
EnumerateK {  
  for n = 0 to forever {  
    for W = all strings of length < n do {  
      if W(W) halts in n steps then output W;  
    }  
  }  
}
```

K is not decidable, but  
it is enumerable!

Let  $K' = \{ \text{Java } P \mid P(P) \text{ does not halt} \}$

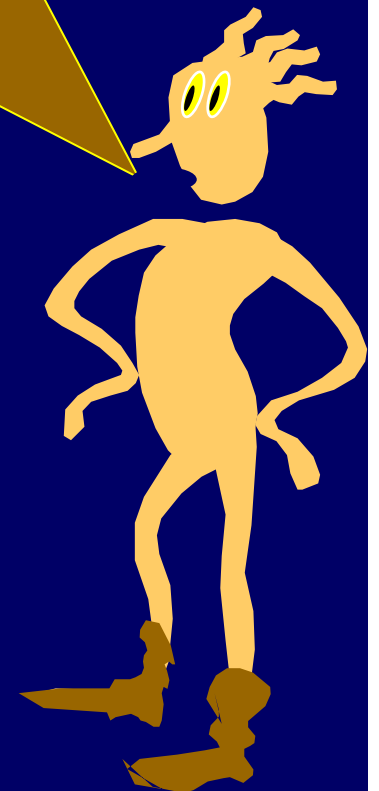
Is  $K'$  enumerable?

If both  $K$  and  $K'$  are enumerable,  
then  $K$  is decidable. (why?)





Now that we have established that the Halting Set is undecidable, we can use it for a jumping off point for more "natural" undecidability results.





Do these theorems about  
the limitations of  
computation tell us  
something about the  
limitations of human  
thought?

