

## Lecture 18: Important Undecidable Problems (and what to do about them)

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## Menu

- What does undecidability mean for problems real people (not just CS theorists) care about?
- What do you do when your application's requirements require "solving" an undecidable problem?

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### Undecidability + Rice + Church-Turing

**Language and Problems:** any problem can be restated as a language recognition problem

**Undecidability:** undecidable languages that cannot be decided by *any* Turing Machine

**Rice's Theorem:** *all* nontrivial properties about the language of a TM are undecidable

**Church-Turing Thesis:** *any* mechanical computation can be done by some TM

**Conclusion:** any nontrivial property about general mechanical computations cannot be decided!

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### Program Halting Problem

- **Input:** a program  $P$  in some programming language
- **Output:** **true** if  $P$  terminates; **false** if  $P$  runs forever.

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### Examples

halts("2+2") **True**

```
halts("def f(n):
  if n==0: return 1
  else: return n * f(n-1)
f(10)") True
```

```
halts("def f(n):
  if n==0: return 1
  else: return n * f(n-1)
f(10.5)") False
```

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### Tougher Example

```
halts("
def isPerfectNumber(n): # n is perfect if factors sum to n
  divs = findDivisors(n)
  return n == sum(divs)
i = 3
while not isPerfectNumber (i): i = i + 2
print i")
```

**Unknown** Note: it is unknown where an odd perfect number exists. (Numbers up to  $10^{300}$  have been tried without finding one yet.)

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If you had **halts**, you could prove or disprove nearly every open mathematical problem!

- Does an odd perfect number exist?
- Reimann hypothesis: The real part of any non-trivial zero of the Riemann zeta function is  $\frac{1}{2}$ .
- Goldbach conjecture: Every number  $> 2$  is the sum of three primes (including 1).
- Poincaré conjecture: Every simply connected closed three-manifold is homeomorphic to the three-sphere.
- ...

This suggests it is unlikely halts exists...but doesn't prove it (yet).

## More Convincing Non-Existence Proof

```
def paradox():  
    if halts("paradox()"):  
        while True: print "You lose"  
    else:  
        return "You lose"
```

If **halts**("paradox()") is **True**: paradox() loops forever  
If **halts**("paradox()") is **False**: paradox() halts

Neither option makes sense, so halts must not exist!

## Recall from Lecture 16...

Assume there exists some TM  $H$  that **decides**  $A_{TM}$ .

Define  $D \langle M \rangle$  = Construct a TM that:

Outputs the **opposite** of the result of simulating  $H$  on input  $\langle M, \langle M \rangle \rangle$

If  $D$  **accepts**  $\langle D \rangle$ :  
 $H(D, \langle D \rangle)$  **accepts** and  $D \langle D \rangle$  **rejects**  
If  $D$  **rejects**  $\langle D \rangle$ :  
 $H(D, \langle D \rangle)$  **rejects** and  $D \langle D \rangle$  **accepts**

Whatever  $D$  does, it must do the opposite, so there is a contraction!

## Alternate Proof: Reduction

- A Python procedure that solves halts must not exist, since if it did we could:

- Write a TM simulator in Python:

```
def simulateTM(M,w):
```

```
    # simulates M on input w
```

- Determine if a TM  $M$  halts on  $w$  using halts:

```
    halts("simulateTM(M,w)")
```

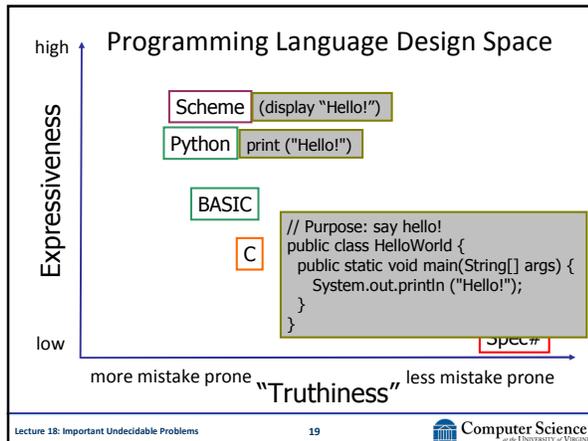
- But, we know  $HALT_{TM}$  is undecidable. Hence, **halts** for Python must not exist.

Does this work for Java?

## Universal Programming Language

- Definition: a programming language that can describe every algorithm.
- Equivalently: a programming language that can simulate every Turing Machine.
- Equivalently: a programming language in which you can implement a Universal Turing Machine.





## Are any Important Problems Undecidable?

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### Virus Detection

- **Input:** a program  $P$
- **Output:** **True** if executing  $P$  would cause a file on the host computer to be "infected"; **False** otherwise.

Rough Proof:

```
def halts(P):
    return isVirus("removePossibleInfections(P)
    infectFile()")
```

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### Therefore: Anti-Virus programs cannot exist!

"The Art of Computer Virus Research and Defense"  
Peter Szor, Symantec

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### Vulnerability Detection

- **Input:** a program  $P$
- **Output:** **True** if there is some input  $w$ , such that running  $P$  on  $w$  leads to a security compromise; **False** otherwise.

Rough Proof:

```
def haltsOnInput(P,w): # we know this doesn't exist either
    return isVulnerable("P(w)
    compromiseSecurity()")
```

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### Example: Morris Internet Worm (1988)

- $P = \text{fingerd}$ 
  - Program used to query user status (running on most Unix servers)
- $\text{isVulnerable}(P)?$ 

Yes, for  $w = \text{"nop}^{400} \text{pushl } \$68732f \text{ pushl } \$6e69622f \text{ movl } sp,r10 \text{ pushl } \$0 \text{ pushl } \$0 \text{ pushl } r10 \text{ pushl } \$3 \text{ movl } sp,ap \text{ chmk } \$3b\text{"}$

  - Worm infected several thousand computers (~10% of Internet in 1988)

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## Impossibility of Vulnerability Detection



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## “Solving” Undecidable Problems

- Undecidable means there is no program that
  1. **Always** gives the correct answer, and
  2. **Always** terminates
- Must give up one of these:
  - Giving up #2 is not acceptable in most cases
  - Must give up #1: none of the anti-virus or vulnerability detection products are always correct
- Or change the problem
  - e.g., detect file infections during an execution, make resilient execution environments, etc.

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## Actual isVirus Programs

- Sometimes give the wrong answer:
  - “False positive”: say  $P$  is a virus when it isn’t
  - “False negative”: say  $P$  is safe when it is
- Database of known viruses: if  $P$  matches one of these, it is a virus
- Clever virus authors can make viruses that change each time they propagate
  - It is undecidable to determine if a given program is the same as a known virus
  - Emulate program for a **limited number** of steps; if it doesn’t do anything bad, assume it is safe

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## Recap

- If you can simulate a Turing Machine with programming language  $PL$ , it is a *universal programming language*
- There is no algorithm for deciding halts for  $P \in PL$ : if there was, we could decide  $A_{TM}$ .
- There is no way to determine in general if  $P \in PL$  is a virus, or a program containing vulnerabilities, or any interesting property...
- We can build algorithms that get it right some of the time (and this can be valuable).

PS5 is due Tuesday

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