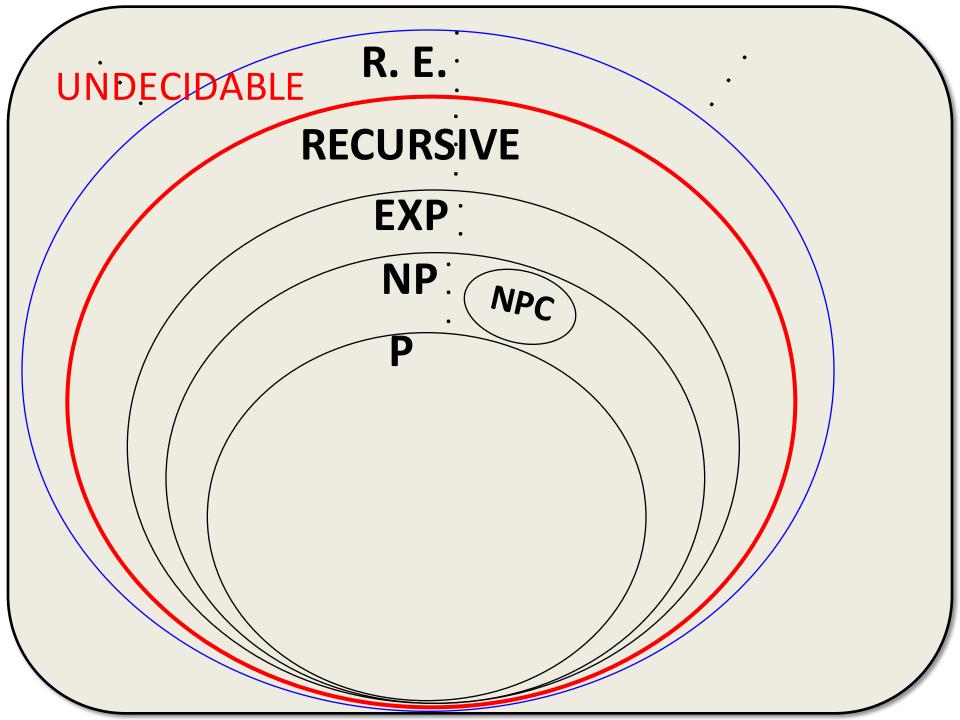
#### Undecidability and Rice's Theorem

Lecture 26, December 3 CS 374, Fall 2015



### Recap: Universal TM U

We saw a TM U such that

 $L(U) = \{ (z, w) \mid M_z \text{ accepts } w \}$ 

Thus, *U* is a stored-program computer. It reads a program *z* and executes it on data *w* 

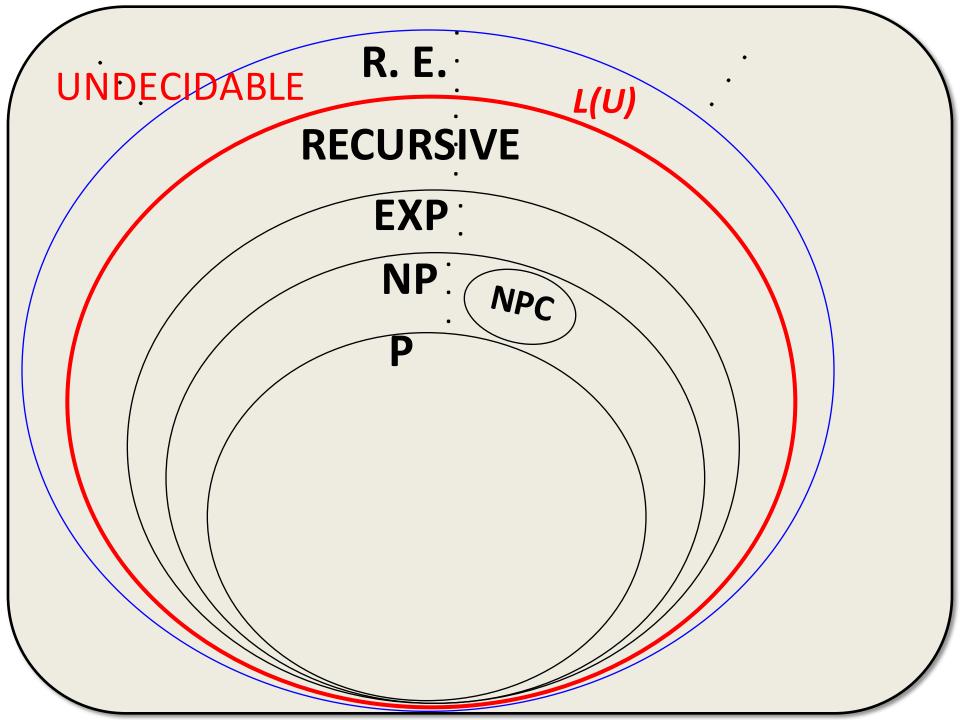
 $L(U) = \{ (z, w) | M_z \text{ accepts } w \} \text{ is r.e.}$ 

#### Recap: Universal TM U

 $L(U) = \{ (z, w) | M_z \text{ accepts } w \} \text{ is r.e.}$ 

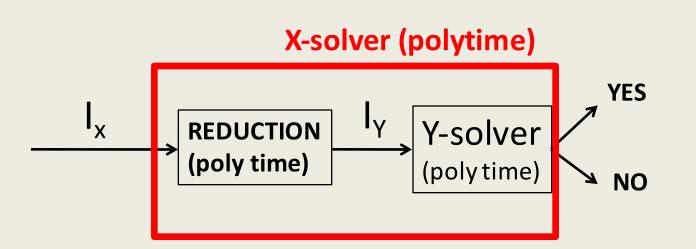
#### We proved the following: **Theorem:** *L(U)* is undecidable (i.e, not recursive)

No "algorithm" for L(U)



#### **Polytime Reductions**

#### $X \leq_p Y$ "X reduces to Y in polytime"

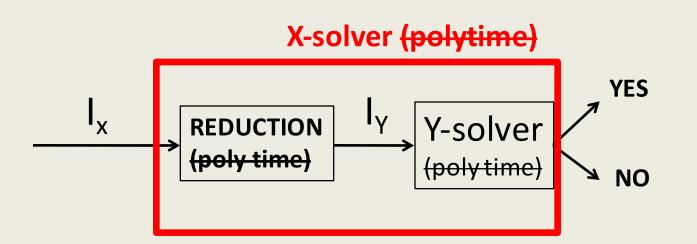


If Y can be decided in poly time, then X can be decided in poly time

If X can't be decided in poly time, then Y can't be decided in poly time

#### **Polytime** Reductions

#### X ≤ Y "X reduces to Y in polytime"



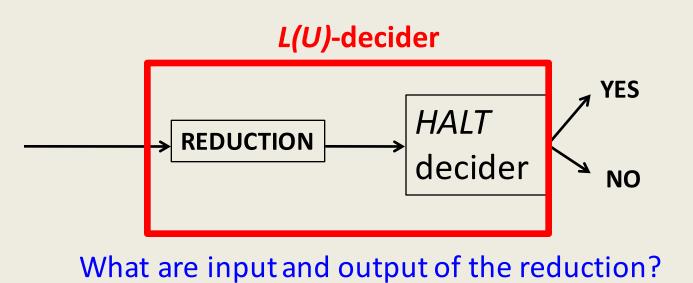
If Y can be decided in poly time, then X can be decided in poly time If X can't be decided in poly time, then Y can't be decided in poly time

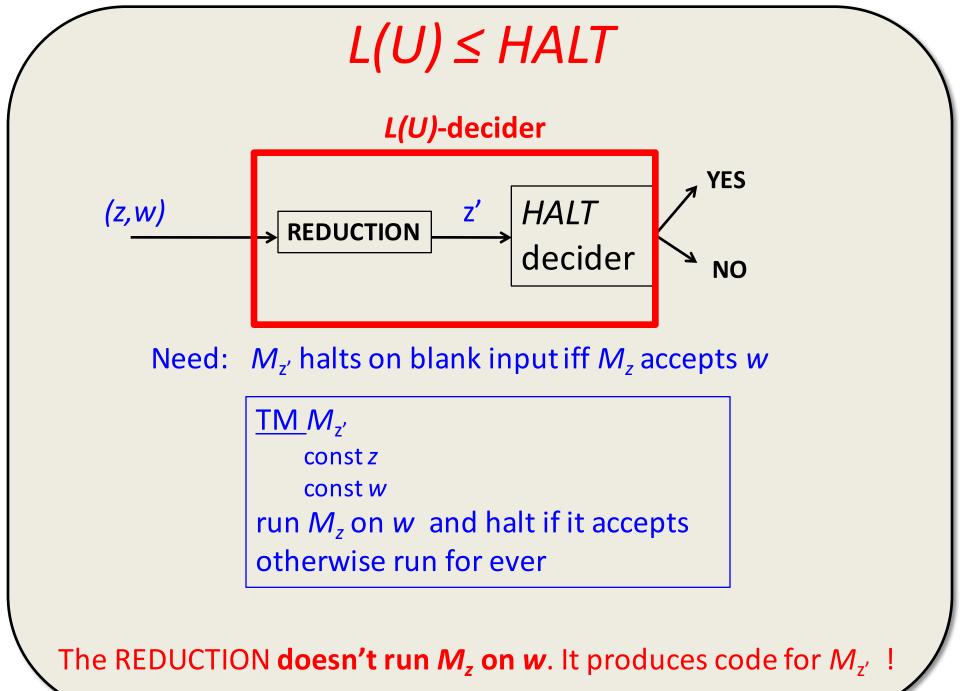
#### Reduction $X \le Y$ "X reduces to Y" **X-solver** YES I<sub>x</sub> Ιγ Y-solver REDUCTION NO

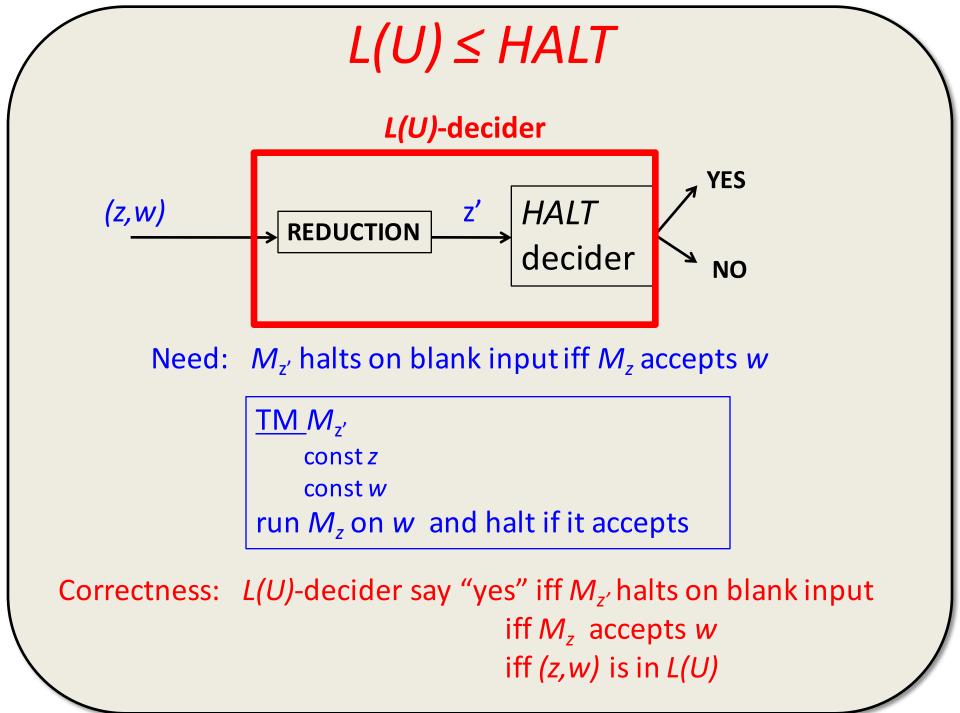
If Y can be decided, then X can be decided. If X can't be decided, then Y can't be decided

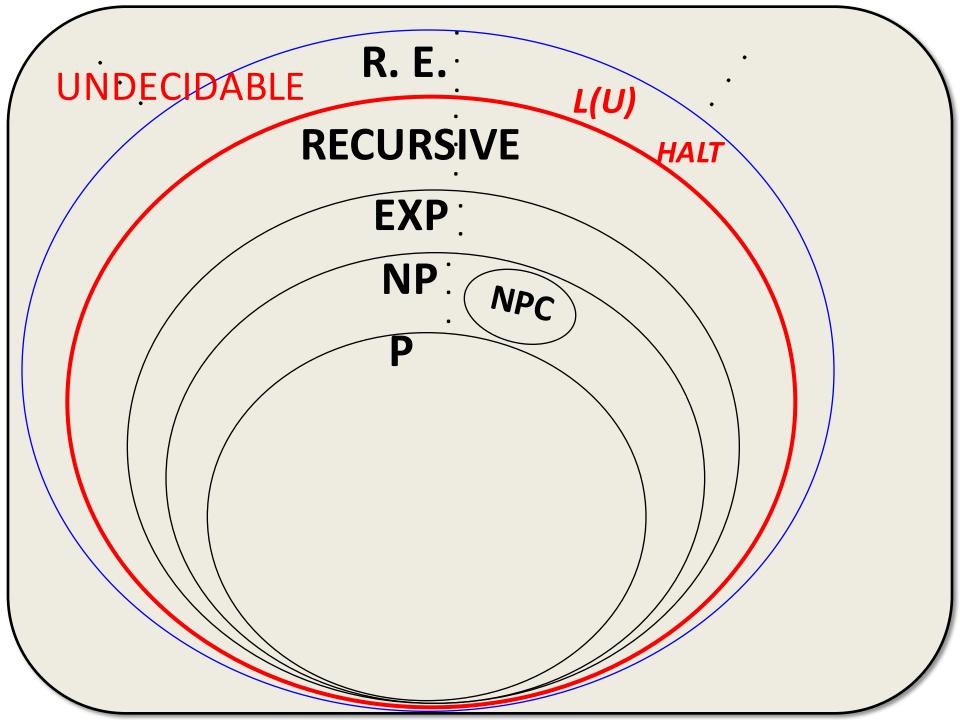
# Halting Problem

- Does given *M* halt when run on blank input?
- *HALT* = { z | *M<sub>z</sub>* halts when run on blank input}
- Show HALT is undecidable by showing
   L(U) ≤ HALT









#### Who cares about halting TMs?

- Remember, TMs = programs
- Virtually all math conjectures can be expressed as a halting-TM question.

Example: Goldbach's conjecture: *Every even number > 2 is the sum of two primes.* 

#### Program Goldbach

#### goldbach()

```
n = 4
WHILE is-sum-of-two-primes(n)
n = n+2
STOP AND SAY NO
```

is-sum-of-two-primes(n): boolean FOR  $p \le q < n$ IF p,q, prime AND p+q=n THEN RETURN TRUE RETURN FALSE

goldbach() halts iff Goldbach's conjecture is false

#### Deciding mathematical truth

#### prove-theorem(T)

w = " "
WHILE NOT is-a-proof-of (w,T)
 w = lexicographically-next-string(w)
OUTPUT T + "is true"

prove-theorem(T) halts iff there is a proof of T.

#### CS 125 assignment:

• Write a program that outputs "Hello world".

```
main()
```

```
printf("Hello world");
```

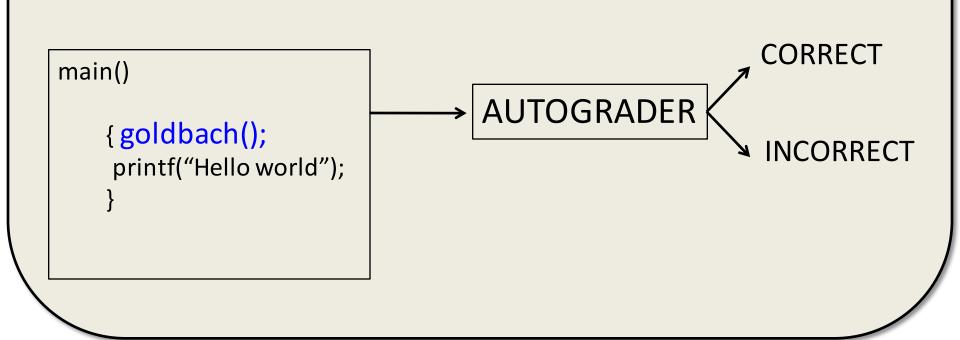
- Can we write an auto-grader?
- If so; we can solve Goldbach's conjecture...

#### goldbach()

n = 4 WHILE is-sum-of-two-primes(n) n = n+2

STOP AND SAY NO

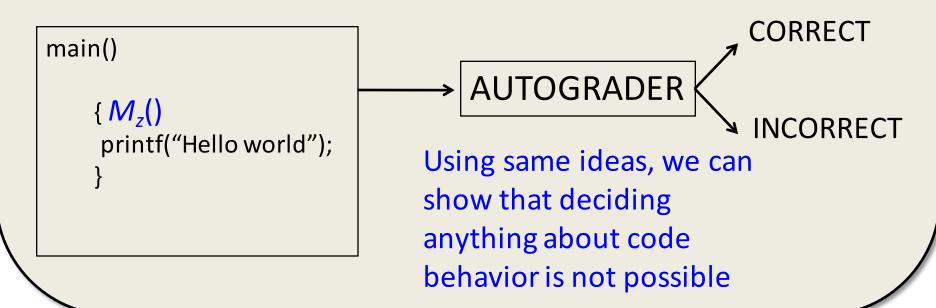
#### is-sum-of-two-primes(n): boolean FOR $p \le q < n$ IF p,q, prime AND p+q=n THEN RETURN TRUE RETURN FALSE



# Deciding halting problem

• Given string *z*, to determine if program *M*<sub>z</sub> halts, do the following:

So, deciding if a program prints "Hello world" is solving the halting problem



#### More reductions about languages

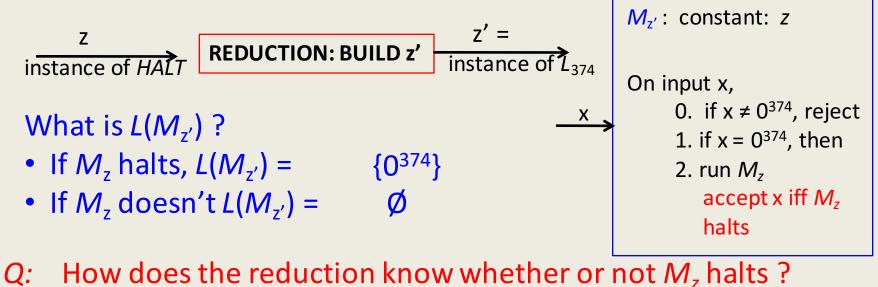
 We'll show other languages involving program behavior are undecidable:

• 
$$L_{374} = \{  | L(M) = \{0^{374}\} \}$$

- L<sub>≠Ø</sub> = {<M> | L(M) is nonempty}
- L<sub>pal</sub> = {<M> | L(M) = palindromes}
- many many others

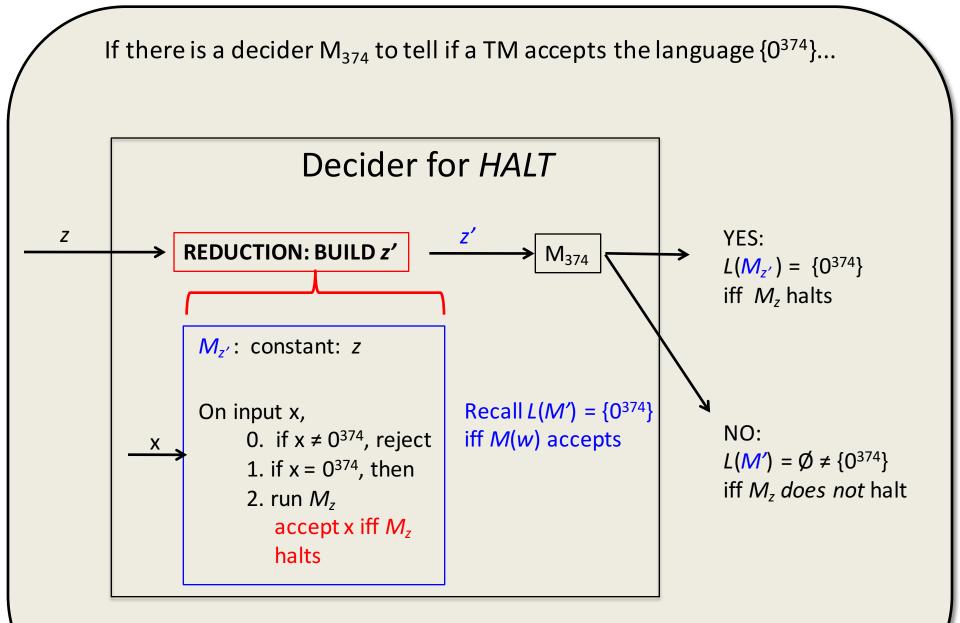
# $L_{374} = \{ z \mid L(M_z) = \{0^{374}\} \}$ is undecidable

- Given a TM *M*, telling whether it accepts only the string 0<sup>374</sup> is not possible
- Proved by showing  $HALT \le L_{374}$



A: It doesn't have to. It just builds (code for)  $M_{z'}$ 

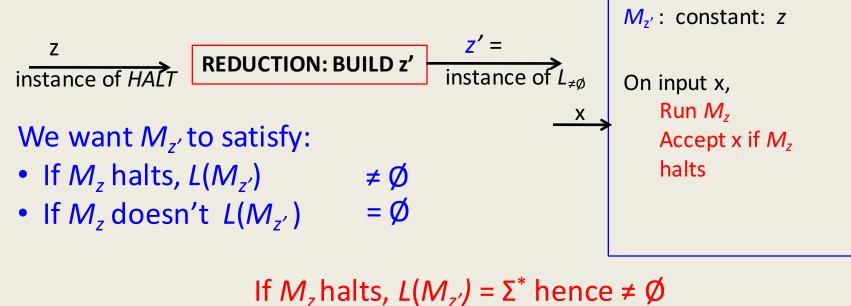
mein () read imput X  $\text{Nun } M_{z}()$  $if (x = 0)^{374}$ acopt X accuptelne sjelt



Since HALT is not decidable,  $M_{374}$  doesn't exist, and  $L_{374}$  is undecidable

# $\mathcal{L}_{\neq \emptyset} = \{ \leq \mathcal{M} > \mid L(\mathcal{M}) \text{ is nonempty} \} \text{ is undecidable}$

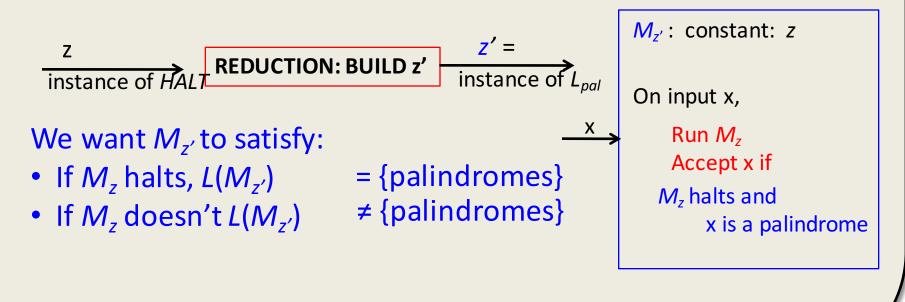
- Given a TM *M*, telling whether it accepts any string is undecidable
- Proved by showing  $HALT \leq L_{\neq \emptyset}$



If  $M_z$  doesn't,  $L(M_{z'}) = \emptyset$ 

#### $L_{pal} = \{ z \mid L(M_z) = palindromes \}$ is undecidable

- Given a TM *M*, telling whether it accepts the set of palindromes is undecidable
- Proved by showing  $HALT \leq L_{pal}$



Lots of undecidable problems about languages accepted by programs

- Given *M*, is *L*(*M*) = {palindromes}?
- Given M, is  $L(M) \neq \emptyset$ ?
- Given *M*, is  $L(M) = \{0^{374}\}$
- Given *M*, is *L*(*M*)
- Given M

Gi

Intain *any word?* 

(M) meet these formal specs?

, does  $L(M) = \Sigma^*$ ?



• Q: What can we decide about the languages accepted by programs?

# A: NOTHING !

except "trivial" things

#### Properties of r.e. languages

 A Property of r.e. languages is a predicate P of r.e. languages.

i.e.,  $P: \{L \mid L \text{ is r.e.}\} \rightarrow \{\text{true, false}\}$ 

**Important:** we are only interested in r.e languages

- Examples:
  - *P*(*L*) = "*L* contains 0<sup>374</sup>"
  - P(L) = "L contains at least 5 strings"
  - *P*(*L*) = "*L* is empty"
  - $P(L) = "L = \{0^n 1^n | n \ge 0\}"$

#### Properties of r.e. languages

- A *Property of r.e. languages* is a predicate *P* of r.e. languages.
  - i.e.,  $P: \{L \mid L \text{ is r.e.}\} \rightarrow \{\text{true, false}\}$
- L = L(M) for some TM iff L is r.e by definition.
- We will thus think of a *Property of r.e. languages* as a set { z | L(M<sub>z</sub>) satisfies predicate P}
- Note that each property P is thus a set of strings
   L(P) = { z | L(M<sub>z</sub>) satisfies predicate P}
- Question: For which P is L(P) decidable?

#### **Trivial Properties**

- A property is *trivial* if either *all* r.e. languages satisfy it, or *no* r.e. languages satisfy it.
- { z | L(M<sub>z</sub>) is r.e}.... why is this "trivial" ?
   EVERY language accepted by an M is r.e. by def'n
- {  $z \mid L(M_z)$  is not r.e}.... why is this "trivial" ?
- {  $z \mid L(M_z) = \emptyset$  or  $L(M_z) \neq \emptyset$ }.... why "trivial"?
- Clearly, trivial properties are decidable
- Because if P is trivial then  $L(P) = \emptyset$  or  $L(P) = \Sigma^*$

#### Rice's Theorem

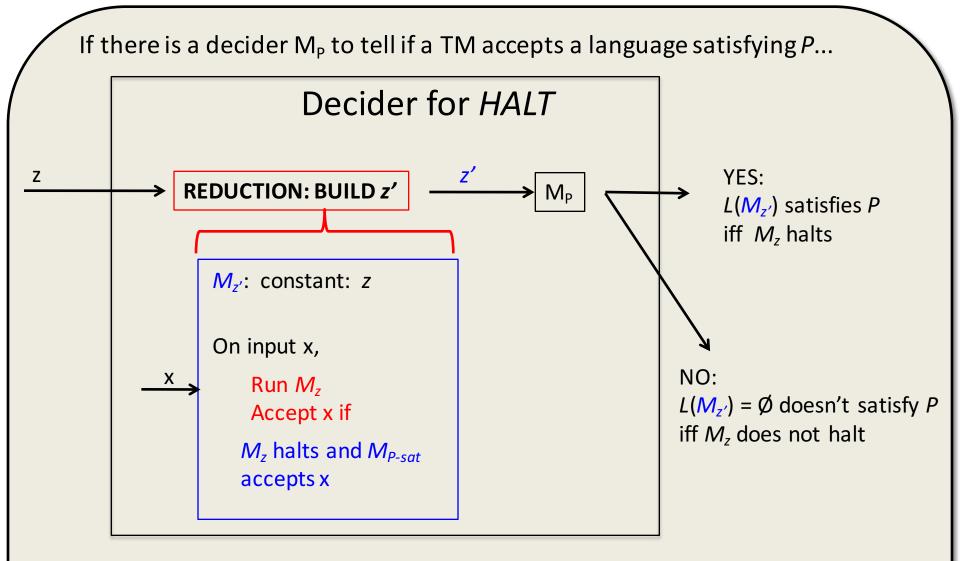
*Every* nontrivial property of r.e. languages is undecidable

So, there is virtually nothing we can decide about behavior (language accepted) by programs

Example: auto-graders don't exist (if submissions are allowed to run an arbitrary (but finite) amount of time).

# Proof

- Let *P* be a non-trivial property
- Let  $L(P) = \{ z \mid L(M_z) \text{ satisfies predicate } P \}$
- Show L(P) is undecidable
- Assume Ø does not satisfy P
- Assume L(M<sub>P-sat</sub>) satisfies P for some TM M<sub>P-sat</sub>
   There must be at least one such TM (why?)



If  $M_z$  doesn't halt then  $L(M_{z'}) = \emptyset$ If  $M_z$  does halt then  $L(M_{z'}) = L(M_{P-sat})$ Since HALT is not decidable,  $M_P$  doesn't exist, and L(P) is undecidable

#### What about assumption

- We assumed Ø does not satisfy P
- What if Ø does satisfy P?
- Then consider

L(P') = { <M> | L(M) doesn't satisfy predicate P}

- Then Ø isn't in L(P')
- Show *L(P')* is undecidable
- So L(P) isn't either (by closure under complement)

Properties of r.e Languages are **Not** properties of **programs/TMs** 

- *P* is defined on languages, not the machines which might accept them.
- {<M> | M at some point moves its head left} is a property of the *machine behavior*, not the language accepted.
- {<*A.py*> | program *A* has 374 lines of code}
- {<A.py> | A accepts "Hello World"} this really is a predicate on L(A)

#### Properties about TMs

- sometimes decidable:
  - $\{ z \mid M_z \text{ has } 374 \text{ states} \}$
  - $\{ z \mid M_z \text{ uses } \le 374 \text{ tape cells on blank input} \}$ 
    - 374 x  $|\Gamma|^{32}$  x  $|Q_M|$
  - $\{ z \mid M_z \text{ never moves head to left} \}$
- sometimes undecidable
  - $\{ z \mid M_z \text{ halts on blank input} \}$
  - $\{ z \mid M_z, on input "0110", eventually writes "2" \}$

# Today

- Quick recap halting & undecidability
- Undecidability via reductions
- Rice's theorem
- ICES
  - pick up TWO forms (Chandra + Manoj)
  - return to same location

# Final Thoughts

Theory of Computation and Algorithms are fundamental to Computer Science

Of immense pragmatic importance Of great interest to mathematics Of great interest to natural sciences (physics, biology, chemistry)

Of great interest to social sciences too!

# Final Thoughts

Grades are important but only in short term No one will ask you how well you did in CS 374 in a year or two

Use your algorithmic/theory/analytical skills to differentiate yourself from other IT professionals

# **Other Theory Courses**

- "new" 473 (Theory 2) Jeff in Spring'16, Chandra in Fall'16
- Approximation algorithms (Chandra Spring'16)
- Computational Complexity (Kolla, Spring'16)
- Algorithmic Game Theory (Mehta, Spring '16)
- Randomized algorithms, Data structures, Computational Geometry, Algorithms for Big Data ...

# Other "Theory ish" Courses

- Machine learning, statistical learning, ...
- Logic and formal methods
- Graph theory, combinatorics, ...
- Coding theory, information theory, signal processing
- Computational biology

