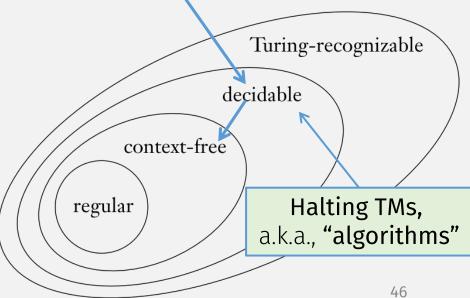


November 8, 2022



Announcements

- HW 7 in
 - Due Mon Nov 7 11:59pm EST
- HW 8 out
 - Due Mon Nov 14 11:59pm EST

Last Time: Decider Turing Machines

- 2 classes of Turing Machines
 - Recognizers (all TMs): may loop forever
 - A TM that loops on an input does not accept that input
 - Deciders (subset of TMs) (algorithms) always halt
 - And then either accept or reject
- Decider definitions must include a termination argument:
 - Explains (informally) why every step in the TM halts
 - (Pay special attention to loops)

Last Time: Decidable Languages About DFAs

- $A_{\mathsf{DFA}} = \{\langle B, w \rangle | B \text{ is a DFA that accepts input string } \}$
 - Decider TM: implements B DFA's extended δ fn

<u>Remember:</u> TMs = programs ing TM = programming

Creating TM = programming Previous theorems = library

- $A_{\mathsf{NFA}} = \{ \langle B, w \rangle | B \text{ is an NFA that accepts input string } w \}$
 - Decider TM: uses NFA \rightarrow DFA algorithm + A_{DFA} decider
- $A_{REX} = \{\langle R, w \rangle | R \text{ is a regular expression that generates string } w\}$
 - Decider TM: uses $\mathbf{RegExpr} \rightarrow \mathbf{NFA}$ algorithm + A_{NFA} decider

Flashback: Why Study Algorithms About Computing

2. To predict what programs will do

(without running them!)

```
unction check(n)
   // check if the number n is a prime
 var factor; // if the checked number is not a prime, this is its first factor
  // try to divide the checked number by all numbers till its square root
  for (c=2; (c <= Math.sqrt(n)); c++)
     if (n%c == 0) // is n divisible by c?
        { factor = c; break}
  return (factor);
   // end of check function
unction communicate()
                         checked number
                                               rime, this is its first factor
  var factor; // if the
                        necked number is not
                         number.value;
                                                t the checked number
 if ((isNaN(i)) || (i <
                         0) || (Math.floor(i = i))
   { alert ("The checked
                         iect should be a
le positive number")};
    factor = check (i);
    if (factor == 0)
       {alert (i + " is a prime")} ;
      // end of communicate function
```

Not possible for all programs! But ...



???

Predicting What <u>Some</u> Programs Will Do ...

What if: look at <u>weaker</u> computation models ... like DFAs and regular languages!

$$E_{\mathsf{DFA}} = \{ \langle A \rangle | A \text{ is a DFA and } L(A) = \emptyset \}$$

 E_{DFA} is a language ... of DFA descriptions, i.e., $(Q, \Sigma, \delta, q_0, F)$...

... where the language of <u>each</u> DFA ... must be { }, i.e., DFA accepts no strings

Is there a decider that accepts/rejects DFA descriptions ...

... by predicting something about the DFA's language (by analyzing its description)

The key question we are studying:

Can we compute something about the computation of a program, by analyzing only its source code?

Analogy

DFA's description: a program's source code ::

DFA's language: what the program computes

Important: don't confuse the different languages here!

$$E_{\mathsf{DFA}} = \{ \langle A \rangle | A \text{ is a DFA and } L(A) = \emptyset \}$$

Decider:

T = "On input $\langle A \rangle$, where A is a DFA:

- **1.** Mark the start state of A.
- 2. Repeat until no new states get marked:
- 3. Mark any state that has a transition coming into it from any state that is already marked.
- **4.** If no accept state is marked, accept; otherwise, reject."

I.e., this is a "reachability" algorithm ...

Termination argument?

If loop marks at least 1 state on

each iteration, then it eventually

terminates because there are finite

states; else loop terminates

... check if accept states are "reachable" from start state

Note: Machine does not "run" the DFA!

... it computes something about the DFA's language (computation) by analyzing it's description (source code)

 $EQ_{\mathsf{DFA}} = \{\langle A, B \rangle | \ A \ \text{and} \ B \ \text{are DFAs and} \ L(A) = L(B) \}$

I.e., Can we compute whether two DFAs are "equivalent"?



Replacing "**DFA**" with "**program**" = A "**holy grail**" of computer science!



$$EQ_{\mathsf{DFA}} = \{\langle A, B \rangle | \ A \ \text{and} \ B \ \text{are DFAs and} \ L(A) = L(B) \}$$

A Naïve Attempt (assume alphabet {a}):

- 1. Simulate:
 - A with input a, and
 - B with input a
 - **Reject** if results are different, else ...
- 2. Simulate:
 - A with input aa, and
 - B with input aa
 - **Reject** if results are different, else ...

• ...

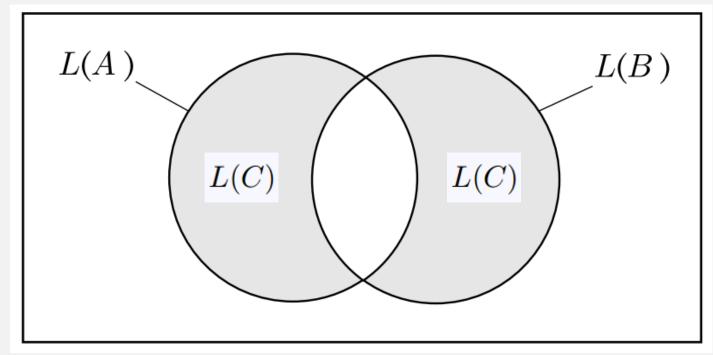
This might not terminate! (Hence it's not a decider)

Can we compute this <u>without</u> <u>simulating</u> running the DFAs?

 $EQ_{\mathsf{DFA}} = \{\langle A, B \rangle | \ A \ \text{and} \ B \ \text{are DFAs and} \ L(A) = L(B) \}$

Trick: Use Symmetric Difference

Symmetric Difference



$$L(C) = \left(L(A) \cap \overline{L(B)}\right) \cup \left(\overline{L(A)} \cap L(B)\right)$$

$$L(C) = \emptyset \text{ iff } L(A) = L(B)$$

$$EQ_{\mathsf{DFA}} = \{\langle A, B \rangle | \ A \ \text{and} \ B \ \text{are DFAs and} \ L(A) = L(B) \}$$

Construct **decider** using 2 parts:

NOTE: This only works because: negation, i.e., set complement, and intersection is closed for regular languages

- 1. Symmetric Difference algo: $L(C) = \left(L(A) \cap \overline{L(B)}\right) \cup \left(\overline{L(A)} \cap L(B)\right)$
 - Construct C = Union, intersection, negation of machines A and B
- 2. Decider T (from "library") for: $E_{DFA} = \{\langle A \rangle | A \text{ is a DFA and } L(A) = \emptyset \}$
 - Because $L(C) = \emptyset$ iff L(A) = L(B)

F = "On input $\langle A, B \rangle$, where A and B are DFAs:

- 1. Construct DFA C as described.
- **2.** Run TM T deciding E_{DFA} on input $\langle C \rangle$.
- **3.** If T accepts, accept. If T rejects, reject."

Termination argument?

Predicting What <u>Some</u> Programs Will Do ...

microsoft.com/en-us/research/project/slam/

SLAM is a project for checking that software satisfies critical behavioral properties of the interfaces it uses and to aid software engineers in designing interfaces and software that ensure reliable and correct functioning. Static Driver Verifier is a tool in the Windows Driver Development Kit that uses the SLAM verification engine.



"Things like even software verification, this has been the Holy Grail of computer science for many decades but now in some very key areas, for example, driver verification we're building tools that can do actual proof about the software and how it works in order to quarantee the reliability." Bill Gates, April 18, 2002. Keynote address at WinHec 2002



Static Driver Verifier Research Platform README

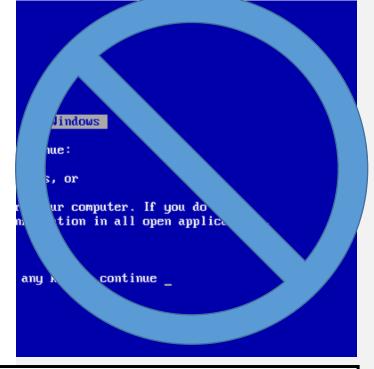
Overview of Static Driver Verifier Research Platform

Static Driver Verifier (SDV) is a compile-time static verification Research Platform (SDVRP) is an extension to SDV that allows Model checking

- Support additional frameworks (or APIs) and write custd From Wikipedia, the free encyclopedia
- Experiment with the model checking step.

Its "language"

In computer science, model checking or property checking is a method for checking whether a finite-state model of a system meets a given specification (also known as correctness). This is typically



Summary: Algorithms About Regular Langs

- $A_{\mathsf{DFA}} = \{ \langle B, w \rangle | \ B \text{ is a DFA that accepts input string } w \}$
 - Decider: Simulates DFA by implementing extended δ function
- $A_{\mathsf{NFA}} = \{ \langle B, w \rangle | \ B \text{ is an NFA that accepts input string } w \}$
 - **Decider**: Uses **NFA** \rightarrow **DFA** decider + A_{DFA} decider
- $A_{\mathsf{REX}} = \{ \langle R, w \rangle | R \text{ is a regular expression that generates string } w \}$
 - Decider: Uses RegExpr \rightarrow NFA decider + A_{NFA} decider
- $E_{\mathsf{DFA}} = \{ \langle A \rangle | A \text{ is a DFA and } L(A) = \emptyset \}$
 - Decider: Reachability algorithm Lang of the DFA
- $EQ_{\mathsf{DFA}} = \{ \langle A, B \rangle | A \text{ and } B \text{ are DFAs and } L(A) = L(B) \}$

Remember:

TMs = programs

Creating TM = programming

Previous theorems = library



Decider: Uses complement and intersection closure construction + E_{DFA} decider

Next: Algorithms (Decider TMs) for CFLs?

What can we predict about CFGs or PDAs?

 $A_{\mathsf{CFG}} = \{ \langle G, w \rangle | G \text{ is a CFG that generates string } w \}$

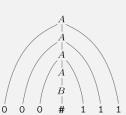
- This is a very practically important problem ...
- ... equivalent to:
 - Algorithm to parse "program" w for PL with grammar G?
- A Decider for this problem could ...?
 - Try every possible derivation of G, and check if it's equal to w?



- E.g., what if there are rules like: $S \rightarrow 0S$ or $S \rightarrow S$
- This TM would be a recognizer but not a decider

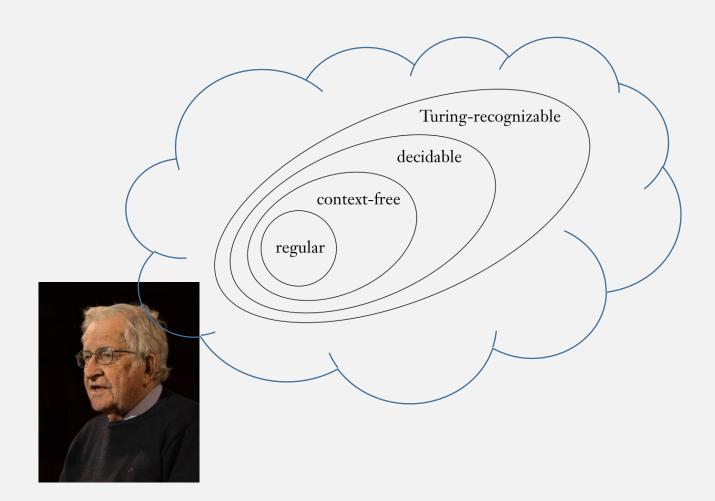
Idea: can the TM stop checking after some length?

• I.e., Is there upper bound on the number of derivation steps?



Chomsky Normal Form

Noam Chomsky



He (sort of) invented this course too!

Chomsky Normal Form

A context-free grammar is in *Chomsky normal form* if every rule is of the form $A \to BC \qquad \text{2 rule shapes}$ $A \to a \qquad \text{Terminals only}$ where a is any terminal and A, B, and C are any variables—except that B and C may not be the start variable. In addition, we permit the rule $S \to \varepsilon$, where S is the start variable.

Chomsky Normal Form Example

Makes the string long enough

Convert variables to terminals

- $S \rightarrow AS \mid AB$
- $A \rightarrow a$
- $B \rightarrow \mathbf{b}$

- To generate string of length: 2
 - Use S rule: 1 time; Use A or B rules: 2 times
 - $S \Rightarrow AB \Rightarrow aB \Rightarrow ab$
 - Derivation total steps: 1 + 2 = 3
- To generate string of length: 3
 - Use S rule: 2 times; A or B rules: 3 times
 - $S \Rightarrow AS \Rightarrow AAB \Rightarrow aAB \Rightarrow aaB \Rightarrow aab$
 - Derivation total steps: 2 + 3 = 5
- To generate string of length: 4
 - Use S rule: 3 times; A or B rules: 4 times
 - $S \Rightarrow AS \Rightarrow AAS \Rightarrow AAAB \Rightarrow aAAB \Rightarrow aaAB \Rightarrow aaaB \Rightarrow aaab$
 - Derivation total steps: 3 + 4 = 7

A context-free grammar is in *Chomsky normal form* if every rule is of the form



 $A \rightarrow BC$ 2 rule shapes

where a is any terminal and A, B, and C are any variables—except that B and C may not be the start variable. In addition, we permit the rule $S \to \varepsilon$, where S is the start variable.

Chomsky Normal Form: Number of Steps

To generate a string of length *n*:

n-1 steps: to generate n variables

Makes the string long enough

+ n steps: to turn each variable into a terminal Convert string to terminals

<u>Total</u>: *2n - 1* steps

(A *finite* number of steps!)

Chomsky normal form

$$A \rightarrow BC$$
 Use *n*-1 times

$$A \rightarrow a$$
 Use $n \text{ times}$

 $A_{\mathsf{CFG}} = \{ \langle G, w \rangle | \ G \text{ is a CFG that generates string } w \}$

Proof: create the decider:

S = "On input $\langle G, w \rangle$, where G is a CFG and w is a string:

We first
need to
prove this is
true for all
CFGs!

- 1. Convert G to an equivalent grammar in Chomsky normal form.
- 2. List all derivations with 2n-1 steps, where n is the length of w; except if n=0, then instead list all derivations with one step.
- 3. If any of these derivations generate w, accept; if not, reject."

Step 1: Conversion to Chomsky Normal Form is an algorithm ...

Step 2:

Step 3:

Termination argument?

Thm: Every CFG has a Chomsky Normal Form

Proof: Create algorithm to convert any CFG into Chomsky Normal Form

Chomsky normal form

 $A \rightarrow a$

- 1. Add <u>new start variable</u> S_{θ} that does not appear on any RHS A o BC
 - I.e., add rule $S_0 \rightarrow S$, where S is old start var

$$S oup ASA \mid aB$$
 $A oup B \mid S$
 $B oup b \mid arepsilon$
 $S_0 oup S$
 $S oup ASA \mid aB$
 $A oup B \mid S$
 $A oup B \mid S$
 $B oup b \mid arepsilon$

Thm: Every CFG has a Chomsky Normal Form

Chomsky normal form

- 1. Add new start variable S_0 that does not appear on any RHS $A \to BC$
 - I.e., add rule $S_0 \rightarrow S$, where S is old start var
- 2. Remove all "empty" rules of the form $A \rightarrow \varepsilon$
 - A must not be the start variable
 - Then for every rule with A on RHS, add new rule with A deleted
 - E.g., If $R \rightarrow uAv$ is a rule, add $R \rightarrow uv$
 - Must cover all combinations if A appears more than once in a RHS
 - E.g., if $R \rightarrow uAvAw$ is a rule, add 3 rules: $R \rightarrow uvAw$, $R \rightarrow uAvw$, $R \rightarrow uvAw$

Thm: Every CFG has a Chomsky Normal Form

Chomsky normal form

- 1. Add new start variable S_0 that does not appear on any RHS $A \rightarrow BC$ $A \rightarrow a$
 - I.e., add rule $S_0 \rightarrow S$, where S is old start var
- 2. Remove all "empty" rules of the form $A \rightarrow \epsilon$
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 - Must cover all combinations if A appears more than once in a RHS
 - E.g., if $R \rightarrow uAvAw$ is a rule, add 3 rules: $R \rightarrow uvAw$, $R \rightarrow uAvw$, $R \rightarrow uAvw$, $R \rightarrow uAvw$, $R \rightarrow uAvw$
- 3. Remove all "unit" rules of the form $A \rightarrow B$
 - Then, for every rule $B \rightarrow u$, add rule $A \rightarrow u$

$$S_0 o S$$
 $S o ASA \mid aB \mid a \mid SA \mid AS \mid S$
 $A o B \mid S$
 $B o b$

Remove, no add (same variable)

$$S_0
ightarrow S \mid ASA \mid \mathbf{a}B \mid \mathbf{a} \mid SA \mid AS$$

 $S
ightarrow ASA \mid \mathbf{a}B \mid \mathbf{a} \mid SA \mid AS$
 $A
ightarrow B \mid S$
 $B
ightarrow \mathbf{b}$

 $S_0 o ASA \mid \mathtt{a}B \mid \mathtt{a} \mid SA \mid AS$ $S o ASA \mid \mathtt{a}B \mid \mathtt{a} \mid SA \mid AS$ A
ightarrow S b $\mid ASA \mid$ a $B \mid$ a $\mid SA \mid AS$

Remove, then add S RHSs to S_0 Remove, then add S RHSs to A

Termination argument of this algorithm?

Thm: Every CFG has a Chomsky Normal Form

Chomsky normal form

 $S_0 \rightarrow ASA \parallel aB \mid a \mid SA \mid AS$

 $S o ASA \mid \mathtt{a}B \mid \mathtt{a} \mid SA \mid AS$

 $A
ightarrow \mathbf{b} \, | \, ASA \, | \, \mathbf{a}B \, | \, \mathbf{a} \, | \, SA \, | \, AS$

- 1. Add new start variable S_0 that does not appear on any RHS $A \to BC$
 - I.e., add rule $S_0 \rightarrow S$, where S is old start var
- 2. Remove all "empty" rules of the form $A \rightarrow \epsilon$
 - A must not be the start variable
 - Then for every rule with A on RHS, add new rule with A deleted
 - E.g., If $R \rightarrow uAv$ is a rule, add $R \rightarrow uv$
 - Must cover all combinations if A appears more than once in a RHS
 - E.g., if $R \rightarrow uAvAw$ is a rule, add 3 rules: $R \rightarrow uvAw$, $R \rightarrow uAvw$, $R \rightarrow uAvw$, $R \rightarrow uAvw$, $R \rightarrow uAvw$
- 3. Remove all "unit" rules of the form $A \rightarrow B$
 - Then, for every rule $B \rightarrow u$, add rule $A \rightarrow u$
- 4. Split up rules with RHS longer than length 2
 - E.g., $A \rightarrow wxyz$ becomes $A \rightarrow wB$, $B \rightarrow xC$, $C \rightarrow yz$
- 5. Replace all terminals on RHS with new rule
 - E.g., for above, add $W \rightarrow w, X \rightarrow x, Y \rightarrow y, Z \rightarrow z$

$$S_0
ightarrow AA_1 \mid UB \mid$$
 a $\mid SA \mid AS$ $S
ightarrow AA_1 \mid UB \mid$ a $\mid SA \mid AS$ $A
ightarrow$ b $\mid AA_1 \mid UB \mid$ a $\mid SA \mid AS$ $A_1
ightarrow SA$ $U
ightarrow$ a $U
ightarrow$ a $U
ightarrow$ b

 $B \to b$

 $A_{\mathsf{CFG}} = \{ \langle G, w \rangle | \ G \text{ is a CFG that generates string } w \}$

Proof: create the decider:

S = "On input $\langle G, w \rangle$, where G is a CFG and w is a string:

We first
need to
prove this is
true for all
CFGs!

- **1.** Convert G to an equivalent grammar in Chomsky normal form.
 - 2. List all derivations with 2n-1 steps, where n is the length of w; except if n=0, then instead list all derivations with one step.
 - 3. If any of these derivations generate w, accept; if not, reject."

Termination argument:

Step 1: any CFG has only a finite # rules

Step 2: 2n-1 = finite # of derivations to check

Step 3: only 1 step

$$E_{\mathsf{CFG}} = \{ \langle G \rangle | G \text{ is a } \mathsf{CFG} \text{ and } L(G) = \emptyset \}$$

Recall:

$$E_{\mathsf{DFA}} = \{ \langle A \rangle | A \text{ is a } \mathsf{DFA} \text{ and } L(A) = \emptyset \}$$

T = "On input $\langle A \rangle$, where A is a DFA:

- **1.** Mark the start state of A.
- 2. Repeat until no new states get marked:
- 3. Mark any state that has a transition coming into it from any state that is already marked.
- **4.** If no accept state is marked, accept; otherwise, reject."

"Reachability" (of accept state from start state) algorithm

Can we compute "reachability" for a CFG?

$$E_{\mathsf{CFG}} = \{ \langle G \rangle | G \text{ is a CFG and } L(G) = \emptyset \}$$

 $\underline{\text{Proof}}$: create **decider** that calculates reachability for grammar G

• Go backwards, start from terminals, to avoid getting stuck in looping rules

R = "On input $\langle G \rangle$, where G is a CFG:

- **1.** Mark all terminal symbols in *G*.
- 2. Repeat until no new variables get marked:
- 3. Mark any variable A where G has a rule $A \to U_1U_2 \cdots U_k$ and each symbol U_1, \ldots, U_k has already been marked.
- 4. If the start variable is not marked, accept; otherwise, reject."

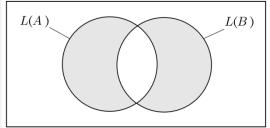
Loop marks 1 new variable on each iteration or stops: it eventually terminates because there are a finite # of variables



$$EQ_{\mathsf{CFG}} = \{ \langle G, H \rangle | \ G \ \text{and} \ H \ \text{are CFGs and} \ L(G) = L(H) \}$$

Recall:
$$EQ_{DFA} = \{\langle A, B \rangle | A \text{ and } B \text{ are DFAs and } L(A) = L(B) \}$$

Used Symmetric Difference



$$L(C) = \emptyset \text{ iff } L(A) = L(B)$$

- where C = complement, union, intersection of machines A and B
- Can't do this for CFLs!
 - Intersection and complement are <u>not closed</u> for CFLs!!!

Intersection of CFLs is <u>Not</u> Closed!

Proof (by contradiction), Assume intersection is closed for CFLs

Then intersection of these CFLs should be a CFL:

$$A = \{ \mathtt{a}^m \mathtt{b}^n \mathtt{c}^n | \, m, n \geq 0 \}$$
 $B = \{ \mathtt{a}^n \mathtt{b}^n \mathtt{c}^m | \, m, n \geq 0 \}$

- But $A \cap B = \{ \mathbf{a}^n \mathbf{b}^n \mathbf{c}^n | n \ge 0 \}$
- ... which is not a CFL! (So we have a contradiction)

Complement of a CFL is not Closed!

Assume CFLs closed under complement, then:

if
$$G_1$$
 and G_2 context-free

$$\overline{L(G_1)}$$
 and $\overline{L(G_2)}$ context-free From the assumption

$$L(G_1) \cup L(G_1)$$
 context-free Union of CFLs is closed

$$\overline{L(G_1)} \cup \overline{L(G_1)}$$
 context-free From the assumption

$$L(G_1) \cap L(G_2)$$
 context-free

DeMorgan's Law!

 $EQ_{\mathsf{CFG}} = \{ \langle G, H \rangle | \ G \ \text{and} \ H \ \text{are CFGs and} \ L(G) = L(H) \}$



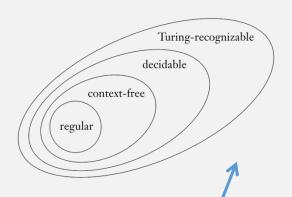
- There's no algorithm to decide whether two grammars are equivalent!
- It's not recognizable either! (Can't create any TM to do this!!!)
 - (details later)
- I.e., this is an impossible computation!

Summary Algorithms About CFLs

- $A_{\mathsf{CFG}} = \{ \langle G, w \rangle | G \text{ is a CFG that generates string } w \}$
 - Decider: Convert grammar to Chomsky Normal Form
 - Then check all possible derivations up to length 2|w| 1 steps
- $E_{\mathsf{CFG}} = \{ \langle G \rangle | G \text{ is a CFG and } L(G) = \emptyset \}$
 - Decider: Compute "reachability" of start variable from terminals
- $EQ_{\mathsf{CFG}} = \{\langle G, H \rangle | \ G \ \text{and} \ H \ \text{are CFGs and} \ L(G) = L(H) \}$
 - We couldn't prove that this is decidable!
 - (So you cant use this theorem when creating another decider)

The Limits of Turing Machines?

- TMs represent all possible "computations"
 - I.e., any (Python, Java, ...) program you write is a TM



- But some things are not computable? I.e., some langs are out hére?
- To test the limit of a computational model, we can see what it can compute about other computational model
 - Thought: Is there a decider (algorithm) to determine whether a TM is an decider?

Hmmm, this doesn't feel right ...



Next time: Is A_{TM} decidable?

 $A_{\mathsf{TM}} = \{ \langle M, w \rangle | \ M \text{ is a TM and } M \text{ accepts } w \}$



Check-in Quiz 11/8

On gradescope