# BU CS 332 – Theory of Computation

https://forms.gle/T38zDHBgd62avxWy7



#### Lecture 15:

- Review mid-semester feedback
- More on Reductions

Reading: Sipser Ch 5.1

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#### What helps you learn best?

- Discussion sections (17)
- In-class examples / walkthroughs (12)
- Lectures in general (10)
- Use of slides, annotations (8)
- Interaction in lecture, polls (6)
- Homework useful, appropriate length/difficulty (6)
- Office hours (4)
- Course organization, perspective (2)
- Piazza use (2)
- Automata Tutor, TM simulator (1)
- Reading (1)

### What hinders your learning?

- Automata Tutor / Morphett (1)
- Turing machines (1)
- Annotation readability (4)
- Not enough concrete examples in class (3)
- Identifying differences in definitions / types (1)
- Practice problems not exhaustive of material (1)
- Slides difficult to understand (2)
- Polls not useful (1)
- Hard to see or hear from back (2)
- Chalkboard use (2)
- Classroom distractions (1)
- Lectures boring (2)
- Classroom too warm (1)
- Lectue pace too fast (1)

- Can't make office hours (4)
- Environment not collaborative (1)
- Required discussions (1)
- Discussions in general (1)
- Discussion pace too slow (1)
- Lack of synchronization between discussion and lecture (1)
- Can't understand what HW problems are asking for (2)
- Proofs, proof assignments on homework (1)
- Homework too time-consuming, too difficult (3)
- Transferring lecture knowledge to homework (2)
- Grading (2)

#### Suggestions for course improvement

- More office hours (1)
- Zoom office hours (2)
- Don't require discussions / lecture attendance (1)
- Extend "late submission" deadline (1)
- Release grade statistics (1)
- Point to outside references (1)
- More examples (2)
- More polls, interaction (1)
- Slower lectures with more pauses (1)
- Introduce more material during lectures (1)
- More examples in class that are similar to homework (1)
- Review prerequisite material when needed (1)
- Clarify what parts of the material are most important (1)
- Record lectures (4)
- More programming examples (1)

- Use a mic (1)
- More in-class problem solving (1)
- Give more intuition leading into proofs before giving the proofs (1)
- More programming examples / exercises (2)
- More proof-based problem-solving examples (1)
- Fewer discussion problems / more time to discuss each (1)
- Synchronize discussion with previous lectures (1)
- More explanation of solutions during discussion (1)
- Shorter, but more difficult homework (1)
- Longer, but easier, homework (2)
- Make difficulty of lectures / homework closer (1)
- More homework hints (1)
- More practice problems (1)

#### Clarity of expectations

- Seems mostly clear
- Participation: Base grade determined by polls, discussion worksheets; other participation is "bonus"
- Reminder of resources to take advantage of:

Sipser textbook

Lectures (slides, recordings) Discussions (in-class meetings, posted slides) Homework feedback, posted solutions Office hours Piazza

• See Lecture 1, Slides 13-17 for more advice

#### Suggestions for self-improvement

- Keep up with readings (17)
- Review lecture / discussion materials (7)
- Attend more office hours (7)
- Time management (6)
- Do example problems in Sipser (5)
- Participate in class more actively (2)
- More organized note-taking (1)

#### Proposed Course Modifications

- Poll for more office hours
- Synchronize lecture / discussion / homework cycle correctly

- Homework more approachable and useful
  - Gradient from easier (mechanical) to harder (creative) questions
  - Mechanical problems closer to discussion / lecture examples

# Reductions

#### Reductions

A reduction from problem A to problem B is an algorithm for problem A which uses an algorithm for problem B as a subroutine

If such a reduction exists, we say "A reduces to B"

Positive uses: If A reduces to B and B is decidable, then A is also decidable

Ex.  $E_{\text{DFA}}$  is decidable  $\Rightarrow EQ_{\text{DFA}}$  is decidable

Negative uses: If A reduces to B and A is undecidable, then B is also undecidable

Ex.  $A_{\text{TM}}$  is undecidable  $\Rightarrow HALT_{\text{TM}}$  is decidable

#### Halting Problem

**Computational problem:** Given a program (TM) and input *w*, does that program halt (either accept or reject) on input *w*? **Formulation as a language:** 

 $HALT_{TM} = \{\langle M, w \rangle | M \text{ is a TM that halts on input } w\}$ 

Ex. M = "On input x (a natural number in binary): For each y = 1, 2, 3, ...: If  $y^2 = x$ , accept. Else, continue."

M' = "On input x (a natural number in binary): For each y = 1, 2, 3, ..., x : If  $y^2 = x$ , accept. Else, continue. Reject." Halting Problem

 $HALT_{TM} = \{ \langle M, w \rangle | M \text{ is a TM that halts on input } w \}$ 

Theorem: HALT<sub>TM</sub> is undecidable

**Proof:** Suppose for contradiction that there exists a decider *H* for  $HALT_{TM}$ . We construct a decider for *V* for  $A_{TM}$  as follows:

On input  $\langle M, w \rangle$ :

- 1. Run *H* on input  $\langle M, w \rangle$
- 2. If *H* rejects, reject
- 3. If *H* accepts, run *M* on *w*
- If *M* accepts, accept
  Otherwise, reject.



## Halting Problem

Computational problem: Given a program (TM) and input *w*, does that program halt on input *w*?

- A central problem in formal verification
- Dealing with undecidability in practice:
  - Use heuristics that are correct on most real instances, but may be wrong or loop forever on others
  - Restrict to a "non-Turing-complete" subclass of programs for which halting is decidable
  - Use a programming language that lets a programmer specify hints (e.g., loop invariants) that can be compiled into a formal proof of halting

#### Emptiness testing for TMs

$$E_{\text{TM}} = \{ \langle M \rangle | M \text{ is a TM and } L(M) = \emptyset \}$$

**Theorem:** *E*<sub>TM</sub> is undecidable

**Proof:** Suppose for contradiction that there exists a decider R for  $E_{\text{TM}}$ . We construct a decider for  $A_{\text{TM}}$  as follows:

On input  $\langle M, w \rangle$ :

1. Run *R* on input ???

#### This is a reduction from $A_{\rm TM}$ to $E_{\rm TM}$

Emptiness testing for TMs



 $E_{\text{TM}} = \{ \langle M \rangle | M \text{ is a TM and } L(M) = \emptyset \}$ 

Theorem: *E*<sub>TM</sub> is undecidable

**Proof:** Suppose for contradiction that there exists a decider *R* for  $E_{TM}$ . We construct a decider for  $A_{TM}$  as follows:

On input  $\langle M, w \rangle$ :

2. Run *R* on input  $\langle N \rangle$ 

1. Construct a TM *N* as follows:

What do we want out of machine *N*?

- a) L(N) is empty iff M accepts w
- b) L(N) is non-empty iff M accepts w
- c) L(M) is empty iff N accepts w
- d) L(M) is non-empty iff N accepts w

#### This is a reduction from $A_{TM}$ to $E_{TM}$

3. If *R* 

, accept. Otherwise, reject

#### Emptiness testing for TMs

$$E_{\text{TM}} = \{ \langle M \rangle | M \text{ is a TM and } L(M) = \emptyset \}$$

Theorem:  $E_{TM}$  is undecidable

**Proof:** Suppose for contradiction that there exists a decider R for  $E_{\text{TM}}$ . We construct a decider for  $A_{\text{TM}}$  as follows:

On input  $\langle M, w \rangle$ :

1. Construct a TM *N* as follows:

"On input *x*:

Run *M* on *w* and output the result."

2. Run *R* on input  $\langle N \rangle$ 

3. If *R* rejects, accept. Otherwise, reject

#### This is a reduction from $A_{\rm TM}$ to $E_{\rm TM}$

Interlude: Formalizing Reductions (Sipser 6.3)



Informally: A reduces to B if a decider for B can be used to construct a decider for A

One way to formalize:

- An oracle for language B is a device that can answer questions "Is w ∈ B?"
- An *oracle TM M<sup>B</sup>* is a TM that can query an oracle for *B* in one computational step

# A is Turing-reducible to B (written $A \leq_T B$ ) if there is an oracle TM $M^B$ deciding A

#### Equality Testing for TMs

 $EQ_{\text{TM}} = \{ \langle M_1, M_2 \rangle | M_1, M_2 \text{ are TMs and } L(M_1) = L(M_2) \}$ Theorem:  $EQ_{\text{TM}}$  is undecidable

**Proof:** Suppose for contradiction that there exists a decider R for  $EQ_{TM}$ . We construct a decider for  $E_{TM}$  as follows:

On input  $\langle M \rangle$ :

1. Construct TMs  $N_1$ ,  $N_2$  as follows:  $N_1 = N_2 =$ 

2. Run *R* on input  $\langle N_1, N_2 \rangle$ 3. If *R* accepts, accept. Otherwise, reject.

This is a reduction from  $E_{\rm TM}$  to  $EQ_{\rm TM}$ 

#### Equality Testing for TMs

What do we want out of the machines  $N_1, N_2$ ? a)  $L(M) = \emptyset$  iff  $N_1 = N_2$  b)  $L(M) = \emptyset$  iff  $L(N_1) = L(N_2)$ c)  $L(M) = \emptyset$  iff  $N_1 \neq N_2$  d)  $L(M) = \emptyset$  iff  $L(N_1) \neq L(N_2)$ 

On input  $\langle M \rangle$ :

1. Construct TMs  $N_1$ ,  $N_2$  as follows:  $N_1 = N_2 =$ 

2. Run *R* on input  $\langle N_1, N_2 \rangle$ 3. If *R* accepts, accept. Otherwise, reject.

This is a reduction from  $E_{\rm TM}$  to  $EQ_{\rm TM}$ 

#### Equality Testing for TMs

 $EQ_{\text{TM}} = \{ \langle M_1, M_2 \rangle | M_1, M_2 \text{ are TMs and } L(M_1) = L(M_2) \}$ Theorem:  $EQ_{\text{TM}}$  is undecidable

**Proof:** Suppose for contradiction that there exists a decider R for  $EQ_{TM}$ . We construct a decider for  $A_{TM}$  as follows:

On input  $\langle M \rangle$ :

1. Construct TMs  $N_1$ ,  $N_2$  as follows:  $N_1 = N_2 =$ 

2. Run *R* on input  $\langle N_1, N_2 \rangle$ 3. If *R* accepts, accept. Otherwise, reject.

This is a reduction from  $E_{\rm TM}$  to  $EQ_{\rm TM}$ 

#### Regular language testing for TMs

 $REG_{TM} = \{\langle M \rangle | M \text{ is a TM and } L(M) \text{ is regular} \}$ 

Theorem: *REG*<sub>TM</sub> is undecidable

**Proof:** Suppose for contradiction that there exists a decider R for  $REG_{TM}$ . We construct a decider for  $A_{TM}$  as follows:

On input  $\langle M, w \rangle$ :

1. Construct a TM *N* as follows:

#### 2. Run R on input $\langle N \rangle$

3. If *R* accepts, accept. Otherwise, reject

This is a reduction from  $A_{TM}$  to  $REG_{TM}$ 

#### Regular language testing for TMs

 $REG_{TM} = \{\langle M \rangle | M \text{ is a TM and } L(M) \text{ is regular} \}$ 

Theorem: *REG*<sub>TM</sub> is undecidable

**Proof:** Suppose for contradiction that there exists a decider R for  $REG_{TM}$ . We construct a decider for  $A_{TM}$  as follows:

On input  $\langle M, w \rangle$ :

1. Construct a TM *N* as follows:

N = "On input x,

1. If  $x \in \{0^n 1^n \mid n \ge 0\}$ , accept

2. Run TM M on input w

3. If *M* accepts, accept. Otherwise, reject."

2. Run *R* on input  $\langle N \rangle$ 

3. If *R* accepts, accept. Otherwise, reject

This is a reduction from  $A_{\rm TM}$  to  $REG_{\rm TM}$ 

# Other undecidable problems

## Problems in Language Theory

Apparent dichotomy:

- TMs seem to be able to solve problems about the power of weaker computational models (e.g., DFAs)
- TMs can't solve problems about the power of TMs themselves

Question: Are there undecidable problems that do not involve TM descriptions?

A <sub>DFA</sub>	A <sub>TM</sub>
decidable	undecidable
<b>E</b> <sub>DFA</sub>	<b>E</b> <sub>TM</sub>
decidable	undecidable
<b>EQ</b> <sub>DFA</sub>	<b>EQ</b> <sub>TM</sub>
decidable	undecidable

Undecidability of mathematics [Sipser 6.2] Peano arithmetic: Formalization of mathematical statements about the natural numbers, using +,×, ≤

Ex: "There exist infinitely many primes"

Theorem [Church, Turing]:

TPA = {  $\langle \varphi \rangle$  |  $\varphi$  is a true statement in PA } is undecidable

Proof skeleton:

#### Gödel's First Incompleteness Theorem [Sipser 6.2]

Theorem: There exists a true statement  $\varphi$  in Peano arithmetic that is not provable

Proof idea:

Suppose for contradiction that every true statement is provable. Then TPA = PPA where

 $PPA = \{ \langle \varphi \rangle \mid \varphi \text{ is a } provable \text{ statement in PA} \}$ 

Claim: PPA is Turing-recognizable

A simple undecidable problem <u>Post Correspondence Problem (PCP) [Sipser 5.2]:</u> Domino:  $\left[\frac{a}{ab}\right]$ . Top and bottom are strings. Input: Collection of dominos.  $\left[\frac{aa}{aba}\right], \left[\frac{ab}{aba}\right], \left[\frac{ba}{aa}\right], \left[\frac{abab}{b}\right]$ 

Match: List of some of the input dominos (repetitions allowed) where top = bottom

$$\begin{bmatrix} ab \\ aba \end{bmatrix}, \begin{bmatrix} aa \\ aba \end{bmatrix}, \begin{bmatrix} ba \\ aa \end{bmatrix}, \begin{bmatrix} aa \\ aba \end{bmatrix}, \begin{bmatrix} abab \\ b \end{bmatrix}$$

Problem: Does a match exist?

This is undecidable

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CS332 - Theory of Computation

#### **Computation History Method**

A sequence of configurations  $C_0, \ldots, C_\ell$  is an accepting computation history for TM M on input w if

- 1.  $C_0$  is the start configuration  $q_0 w_1 \dots w_n$
- 2. Every  $C_{i+1}$  legally follows from  $C_i$
- 3.  $C_{\ell}$  is an accepting configuration

Reduction from the undecidable language  $A_{\rm TM}$  to a language L using the following idea:

Given an input  $\langle M, w \rangle$  to  $A_{TM}$ , the ability to solve L enables checking the existence of an accepting computation history for M on w