**Recap:** How do we prove that a language is undecidable?

# EECS 376 Discussion 8

Sec 27: Th 5:30-6:30 DOW 1017

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Slide deck available at course drive/Discussion/Slides/Eric Khiu

### Announcement

- Combined Discussion Sections (17 and 27)
  - ▶ March 14: Eric K will cover Discussion 8 at DOW 1017
  - ▶ March 21: Chaitanya will cover Discussion 9 at **EECS 1200**
- Bryan will cover my OH on Tue March 19 5:00-7:30 at MLB B116
- Midterm Evaluation:
  - ► Thanks for the feedback!
  - ► Want more practice problems
  - Short summary after each topic is helpful

# Agenda

- ► More on undecidability
  - ► Recording <u>here</u>
- ► The class P
- The class NP
- ► P vs NP
- ► SAT and Cook Levin Theorem (if time)

# Recap: Decidable Language

- A language L is decidable iff there exists a TM that
  - ightharpoonup accepts all  $x \in L$
  - ▶ rejects all  $x \notin L$
  - ► halts on all inputs
- One way to prove that a language is decidable is by describing a TM that decides it (i.e., a decider)
- Note 1: You are allowed to hardcode constant values in your machine (seen in HW6)
- Note 2: If some deciders are known to exists, you can use them in your machine (e.g.,  $D_S$  and  $D_T$  from last week for  $S \setminus T$ )

# Recap: Turing Reductions

- ▶ Suppose we want to show that  $A \leq_T B$
- Step 1: Identify the inputs of  $D_A$  and  $D_B$ 
  - ▶ Is the input a number? A string? Multiple strings? A machine?
- Step 2: Draft Desired Behavior of D<sub>A</sub>
  - ► Choose between "return same" and "return opposite"
  - ▶ Return same:  $x \in A \Leftrightarrow \cdots \Leftrightarrow x' \in B \Leftrightarrow D_B(x')$  accepts  $\Leftrightarrow D_A(x)$  accepts
  - ▶ Return opposite:  $x \in A \Leftrightarrow \cdots \Leftrightarrow x' \notin B \Leftrightarrow D_B(x')$  rejects  $\Leftrightarrow D_A(x)$  accepts

Note: Here we condense the two cases using iff

- Step 3: Generate input(s) for D<sub>B</sub>
  - ▶ Return same: How to generate x', possibly using x, such that  $x \in A \Rightarrow x' \in B$  and  $x \notin A \Rightarrow x' \notin B$ ?
  - ▶ Return opposite: How to generate x', possibly using x, such that  $x \in A \Rightarrow x' \notin B$  and  $x \notin A \Rightarrow x' \in B$ ?

# Recap: Undecidability Proof

- $\blacktriangleright$  Know:  $L_{BARBER}$  (or any undecidable language) is undecidable
- ► Task: Prove *L* is undecidable
- We use proof by contradiction:
  - ► Suppose for contradiction that <u>L</u> is decidable
  - ▶ Show that  $L_{BARBER} \leq_T L$
  - ▶ By this theorem: Suppose  $A \leq_T B$ . If B is decidable, then A is decidable.
  - ▶ Since we have  $L_{BARBER} \leq_T L$  and  $L_{\underline{i}\underline{s}}$  decidable by assumption
  - ▶ Therefore,  $L_{BARBER}$  is now decidable. Contradiction.

**Course Notes** 

- Another thing you are allowed to do is to create a machine (without running it) and pass it to the backbox decider
- For example, I want to use the black box decider  $D_E$  that decides  $L_E = \{\langle M \rangle : L(M) = \emptyset\}$

to build a decider for  $L_{ACC}$ . I can do the following:

```
D_A = "On input (\langle M \rangle, x):

Construct M' as follows: TODO

Run D_F on \langle M' \rangle and return same"
```

- Discuss: Why do I have to create M'? Why can't I just use M?
  - ightharpoonup The input of  $D_E$  must be a machine
  - $\blacktriangleright$  We don't know L(M), so we can't tell if  $D_E$  accepts/ rejects M

 $\blacktriangleright$  For example, I want to use the black box decider  $D_E$  that decides

$$L_E = \{ \langle M \rangle : L(M) = \emptyset \}$$

to build a decider for  $L_{ACC}$ . I can do the following:

```
D_A = "On input (\langle M \rangle,x):

Construct M' as follows: TODO

Run D_E on \langle M' \rangle and return same"
```

- Correctness proof draft
  - $(\langle M \rangle, x) \in L_{ACC} \Rightarrow M \text{ accepts } x \Rightarrow \dots \Rightarrow D_E(\langle M' \rangle) \text{ accepts } \Rightarrow D_A(\langle M \rangle, x) \text{ accepts}$
  - ▶  $(\langle M \rangle, x) \notin L_{ACC} \Rightarrow M$  does not accept  $x \Rightarrow ... \Rightarrow D_E(\langle M' \rangle)$  rejects  $\Rightarrow D_A(\langle M \rangle, x)$  rejects

 $\triangleright$  For example, I want to use the black box decider  $D_E$  that decides

$$L_E = \{ \langle M \rangle : L(M) = \emptyset \}$$

to build a decider for  $L_{ACC}$ . I can do the following:

```
D_A = "On input (\langle M \rangle,x):

Construct M' as follows: TODO

Run D_E on \langle M' \rangle and return same"
```

- Correctness proof draft
  - ▶  $(\langle M \rangle, x) \in L_{ACC} \Rightarrow M$  accepts  $x \Rightarrow ... \Rightarrow L(M') = \emptyset \Rightarrow D_E(\langle M' \rangle)$  accepts  $\Rightarrow D_A(\langle M \rangle, x)$  accepts
  - $(\langle M \rangle, x) \notin L_{ACC} \Rightarrow M$  does not accept  $x \Rightarrow ... \Rightarrow L(M') \neq \emptyset \Rightarrow D_E(\langle M' \rangle)$  rejects  $\Rightarrow D_A(\langle M \rangle, x)$  rejects

### **Brainstorm Time**

- Correctness proof draft
  - $(\langle M \rangle, x) \in L_{ACC} \Rightarrow M \text{ accepts } x \Rightarrow ... \Rightarrow L(M') = \emptyset \Rightarrow D_A(\langle M' \rangle) \text{ accepts}$
  - ▶  $(\langle M \rangle, x) \notin L_{ACC} \Rightarrow M$  does not accept  $x \Rightarrow ... \Rightarrow L(M') \neq \emptyset \Rightarrow D_A(\langle M' \rangle)$  rejects
- **Brainstorm 1:** How to make  $L(M') = \emptyset$  happen?
  - ▶ Just make *M'* rejects all inputs!
    - ► M'= "On input w: Reject"

Trigger this if M accepts x

- **Brainstorm 2:** How to make  $L(M') \neq \emptyset$  happen?
  - ▶ Just make *M'* accepts some inputs, say "duck"
    - ▶ M'= "On input w: If w = 'duck' then Accept Else Reject"
  - ▶ Even easier: make M' accepts all inputs, i.e.,  $L(M') = \Sigma^*$ 
    - ► M'= "On input w: Accept"

Trigger this if M does not accepts x

# Putting Everything together...

```
► D_A = "On input (\langle M \rangle,x):
Construct M' as follows:
```

```
M' = "On input w:
   Run M on x
   If M accepts x then Reject
   Else Accept"
```

Run  $D_E$  on  $\langle M' \rangle$  and return same"

- Correctness Proof:
  - $(\langle M \rangle, x) \in L_{ACC} \Rightarrow M \text{ accepts } x \Rightarrow M' \text{ rejects all inputs } \Rightarrow L(M') = \emptyset \Rightarrow D_E(\langle M' \rangle) \text{ accepts } \Rightarrow D_A(\langle M \rangle, x) \text{ accepts}$
  - ►  $(\langle M \rangle, x) \notin L_{ACC} \Rightarrow M$  does not accept  $x \Rightarrow M'$  accepts all inputs  $\Rightarrow L(M') \neq \emptyset \Rightarrow D_E(\langle M' \rangle)$  rejects  $\Rightarrow D_A(\langle M \rangle, x)$  rejects

# Unit 3: Complexity

**Course Notes** 

# Complexity: Introduction

- Last unit: What *can* and *can't* a computer solve
- This unit: What can and can't a computer solve efficiently
- ▶ Complexity Class: DTIME(t(n)) is the *class* of all languages decidable by a TM with time complexity O(t(n))

# The Class P

**Course Notes** 

### The Class P

▶ **Definition:** *P* is the class of languages decidable by a polynomial-time Turing machine, where

$$P = \bigcup_{k \ge 1} DTIME(n^k)$$

► Given the significant difference between polynomial and exponential time, we informally consider *P* to be the class of efficiently decidable languages

**Discuss:** Given the definition of class P, what do we need to show to prove that a language is in class P?

- Give the algorithm of the efficient decider (TM)
- Correctness proof (from last unit)
- Runtime analysis (NEW!)

# **Example: Spanning Trees**

- A spanning tree of a graph G = (V, E) is a subset of edges where every vertex is included in the subgraph
- Consider the following language:  $L_{SPAN-k}\{\langle G, k \rangle: G \text{ has a spanning tree of weight less than } k\}$
- We can decide this language efficiently:

```
D = "On input (\langle G, k \rangle):

MST \leftarrow KRUSKAL(G)

If WEIGHT(MST) < k then accept; else reject"
```

# **Example: Spanning Trees**

 $L_{SPAN-k}\{\langle G, k \rangle: G \text{ has a spanning tree of weight less than } k\}$ 

```
D = "On input (\langle G, k \rangle):

MST \leftarrow KRUSKAL(G) // O(|E|\log|E|)

If WEIGHT(MST) < k then accept; else reject"
```

#### Correctness analysis:

- ▶  $\langle G, k \rangle \in L_{SPAN-k} \Rightarrow \exists$  spanning tree T of G s.t. Weight(T) < kDef of MST
  - $\Rightarrow$  Weight(MST)  $\leq$  Weight  $(T) < k \Rightarrow D(\langle G, k \rangle)$  accepts
- ▶  $\langle G, k \rangle \notin L_{SPAN-k} \Rightarrow \text{Weight}(T) \geq k$  for all spanning trees T of  $G \Rightarrow \text{Weight}(MST) \geq k$  since MST is a spanning tree  $\Rightarrow D(\langle G, k \rangle)$  rejects

#### Runtime analysis:

▶ Kruskal Algorithm runs in  $O(|E| \log |E|)$ : efficient

# Example: GCD

- ▶ Prove that the language  $GCD = \{(x, y, g) : \gcd(x, y) = g\}$  is in class P
- Consider the following decider:

```
D = "On input (x,y,g): G \leftarrow 0

If x < g or y < g or g < 0 then reject

for d = 1, ..., \min(x,y) do

if d divides both x and y then G \leftarrow d

If G = g then accept; else reject"
```

- Correctness analysis:
  - $\blacktriangleright$   $(x,y,g) \in GCD \Leftrightarrow g = \gcd(x,y) \Leftrightarrow g$  is the last d getting assigned to  $G \Leftrightarrow G = g \Leftrightarrow D(x,y,g)$  accepts
- Runtime analysis:
  - $ightharpoonup O(\min(x,y))$ : efficient

**Discuss:** What is wrong with this proof?

# Exercise: L<sub><376376</sub>

Show that the following language is in P

 $L_{<376376} = \{(\langle M \rangle, x) : M \text{ is a TM that halts on } x \text{ in less than } |x|^{376376} \text{ steps}\}$ 

- ▶ Let *D* be the efficient decider for  $L_{\leq 376376}$
- Correctness Proof Draft
  - $(\langle M \rangle, x) \in L_{<376376} \Rightarrow$   $\Rightarrow D(\langle M \rangle, x) \text{ accepts}$
  - $(\langle M \rangle, x) \notin L_{<376376} \Rightarrow$   $\Rightarrow D(\langle M \rangle, x) \text{ rejects}$
- **Exercise:** Design the decider to fill in the two blanks above + runtime analysis
- ▶ Hint: Consider  $|x|^k$  for small x and k for intuition

# Exercise: L<sub><376376</sub>

 $L_{<376376} = \{(\langle M \rangle, x): M \text{ is a TM that halts on } x \text{ in less than } |x|^{376376} \text{ steps}\}$ 

Consider the following decider:

```
D = "On input (\langle M \rangle, x):

Counter \leftarrow 1

While M has not halt on x do

If counter \geq |x|^{376376} then reject

Execute the (Counter)th step of M on x

Counter \leftarrow Counter + 1

accept"
```

Or alternatively,

```
D = "On input (\langle M \rangle, x):
Simulate execution of M(x) for up to |x|^{376376}-1 steps
If M halts during this execution then accept; else reject"
```

# Exercise: L<sub><376376</sub>

 $L_{<376376} = \{(\langle M \rangle, x): M \text{ is a TM that halts on } x \text{ in less than } |x|^{376376} \text{ steps}\}$ 

```
D = "On input (\langle M \rangle, x):
 Simulate execution of M(x) for up to |x|^{376376}-1 steps
 If M halts during this execution then accept; else reject"
```

#### Correctness Analysis

- ►  $(\langle M \rangle, x) \in L_{\langle 376376} \Rightarrow M \text{ will halt on } x \text{ within } |x|^{376376} 1 \text{ steps} \Rightarrow D(\langle M \rangle, x) \text{ accepts}$
- ►  $(\langle M \rangle, x) \notin L_{<376376} \Rightarrow M \text{ won't}$  halt on  $x \text{ within } |x|^{376376} 1 \text{ steps} \Rightarrow D(\langle M \rangle, x) \text{ rejects}$

#### Runtime analysis

▶ Running  $|x|^{376376} - 1$  steps of a program is polynomial w.r.t. |x|, the only other work done is returning a bool, so this decider is efficient

# TL; DPA

- ▶ *P* is the class of languages decidable by a polynomial-time Turing machine
- To prove that a language is in class P
  - ▶ Give the algorithm of the efficient decider
  - Correctness analysis
  - Runtime analysis (new)

### Take Home Exercise 1

- Let  $L_1, L_2 \in P$ . Determine whether the following statements are always/sometimes/ never true (This can be helpful to put on your cheatsheet!)
  - $ightharpoonup \overline{L_1} \in P$
  - $ightharpoonup L_1 \cap L_2 \in P$
  - $ightharpoonup L_1 \cup L_2 \in P$
  - $L_1 \setminus L_2 \in P$

# The Class NP

**Course Notes** 

### Starter: Verifiers and Certificates

Consider the following language

$$PAIRSUM = \{(S, k) : \exists a, b \in S \text{ s. t. } a + b = k\}$$

- ▶ Determine if the followings are in *PAIRSUM* 
  - $S_1 = \{2,4,6\}, k_1 = 6$
  - $S_2 = \{2,4,6\}, k_2 = 7$

**Share with us:** What was your thought process?

### **Verifiers and Certificates**

- lackbox A certificate c is an additional information used to check whether an input x is in a language L
- ightharpoonup A verifier V for a language L is a TM that takes in (x,c) that satisfies:
  - $\forall x \in L$ , there exists some certificate c such that V(x,c) accepts
  - $\blacktriangleright$   $\forall x \notin L$ , there is no c such that V(x,c) accepts
- ► For  $PAIRSUM = \{(S, k): \exists a, b \in S \text{ s. t. } a + b = k\}, x = (S, k), \text{ we can have } c = (a, b),$  and we can build a verifier as follows:

```
V = "On input (x = (S, k), c = (a, b)):

if a \notin S or b \notin S then reject

if a + b = k then accept; else reject"
```

**Note:** You format how you want the certificate to look like!

# Formatting Certificate

▶ Be creative! There is no *one correct way* to format the certificate. For example, we could have

```
V = "On input (x = (S, k), c = (e^a, e^b)):

if \ln e^a \notin S or \ln e^b \notin S then reject

if e^a \cdot e^b = e^k then accept; else reject"
```

► You can even take in a certificate and ignore it!

```
V = "On input (x = (S, k), c = "duck"):

for pairs (a, b): a, b \in S do

if a + b = k then accept

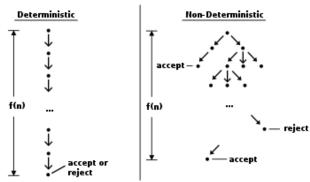
reject"
```

### The Class NP

- ► A language is *efficiently verifiable* if there exists an *efficient verifier* that verifies it
  - Note 1: The certificate must be polynomial in |x|
  - Note 2: Since the runtime of V is polynomial in |x|, the machine halts on any input
- ▶ **Definition:** *NP* is the set of **efficiently verifiable languages**
- To prove that a language is in class *NP* 
  - ► Give the algorithm of the efficient verifier
  - Correctness analysis
  - Runtime analysis

# Why is it called NP? (Out of scope)

There is an alternative but equivalent definition often used that says the class NP is the set of languages that have a Non-deterministic Polynomial-time (efficient) decider



- Don't worry about this definition in this class, we will only use the definition on the previous slide
- Main takeaway: All NP languages are decidable (Will prove  $NP \subseteq EXP$  in HW7 EC)

# Example: PairSum

- ▶ Prove that  $PAIRSUM = \{(S, k): \exists a, b \in S \text{ s. t. } a + b = k\}$  is in class NP.
- Efficient Verifier:

```
V = "On input (x = (S, k), c = (a, b)):

if a \notin S or b \notin S then reject

if a + b \neq k then reject

accept"
```

#### Runtime analysis:

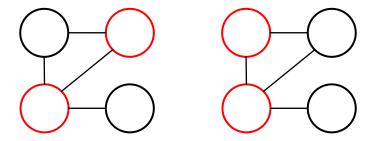
▶ It takes O(|S|) to check if a and b are in S, and O(1) to check if a + b = k. Therefore, verifier is efficient

#### Correctness analysis:

- ►  $(S,k) \in PAIRSUM \Rightarrow \exists a,b \in S$ :  $a+b=k \Rightarrow V$  will accept when given this (a,b) pair as certificate
- ►  $(S,K) \notin PAIRSUM \Rightarrow \nexists a,b \in S: a+b=k \Rightarrow V$  will never accept any (a,b) certificate

# Exercise: *k*-CLIQUE

- A clique of an undirected graph G = (V, E) is a subset of vertices where every pair of vertices have an edge in E
- ► For example:



- ightharpoonup A k-clique is a clique with k vertices
- Prove that the following language is in class NP

k- $CLIQUE = {\langle G = (V, E), k \rangle : G \text{ is an undirected graph that has a } k$ -clique}

## Exercise: *k*-CLIQUE

k- $CLIQUE = {\langle G = (V, E), k \rangle : G \text{ is an undirected graph that has a } k$ -clique}

- ▶ Let F be an efficient verifier for k-CLIQUE
- Step 1: Format of the certificate
  - ▶ Let  $V' \subseteq V$  such that |V'| = k
- Step 2: Correctness proof draft
  - ▶  $(G,k) \in k-CLIQUE \Rightarrow \exists V' \subseteq V \text{ s.t. } V' \text{ is a clique of size } k \Rightarrow F \text{ will accept when given this } V' \text{ subset as certificate}$
  - ►  $(G,k) \in k-CLIQUE \Rightarrow \exists V' \subseteq V \text{ s.t. } V' \text{ is a clique of size } k \Rightarrow$   $\Rightarrow F \text{ will never accept any } V' \text{ certificate}$
- Step 3: Construct efficient verifier
  - **Exercise:** Give an algorithm of the efficient verifier
  - ▶ Hint: What does "every pair of vertices in V' have an edge in E" mean?

## Exercise: *k*-CLIQUE

k- $CLIQUE = {\langle G = (V, E), k \rangle : G \text{ is an undirected graph that has a } k$ - clique}

#### Efficient Verifier

```
F = "On input (G = (V, E), V'):

If |V'| \neq k or \exists v \in V' : v \notin V then reject

E' \leftarrow \bigcup_{u,v \in V'} (u,v)

If E' = E then accept; else reject"
```

#### Runtime analysis:

- It takes O(|V|) to check if every vertex in V' is in V
- It takes O(|E|) to check if there is an edges between every pair of vertices in V'

#### Correctness Analysis

- ▶  $(G,k) \in k-CLIQUE \Rightarrow \exists V' \subseteq V \text{ s.t. } V' \text{ is a clique of size } k \Rightarrow \bigcup_{u,v \in V'} (u,v) = E \Rightarrow F \text{ will } \underline{\text{accept when given this }} V' \text{ subset as certificate}$
- ►  $(G,k) \in k-CLIQUE \Rightarrow \nexists V' \subseteq V$  s.t. V' is a clique of size  $k \Rightarrow \forall V', |V'| \neq k$  or  $V' \nsubseteq V$  $\bigcup_{u,v \in V'} (u,v) \neq E \Rightarrow F$  will never accept any V' certificate

## TL; DPA

- ► *NP* is the set of efficiently verifiable languages
- To prove that a language is in class *NP* 
  - ► Give the algorithm of the efficient verifier
  - Correctness analysis
  - Runtime analysis (both certificate's size and verifier's runtime must be polynomial)
- Useful phrases for correctness analysis:
  - ▶ Verifier *V* will accept when given this *c* as certificate
  - Verifier V will never accept any certificate c

### Take Home Exercise 2

- Let  $L_1, L_2 \in NP$ . Determine whether the following statements are always/sometimes/never true/unknown.
  - ▶  $\overline{L_1} \in NP$
  - $ightharpoonup L_1 \cap L_2 \in NP$
  - $\blacktriangleright L_1 \cup L_2 \in NP$
  - $L_1 \setminus L_2 \in NP$

# P vs NP

**Course Notes** 

### P vs NP Starter

**Discuss:** Which of the following statements is/are true?

A.  $\forall L \in P, L \in NP$ 

B.  $\forall L \in NP, L \in P$ 

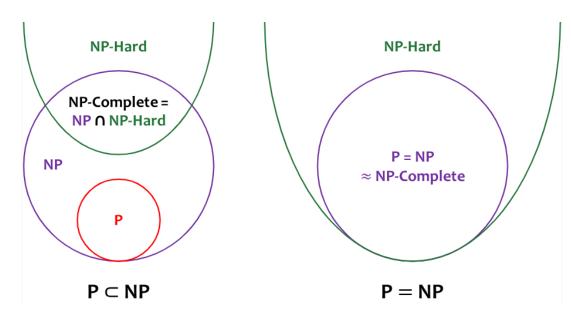
C.  $\exists L \in P$ :  $L \notin NP$ 

**D.**  $\exists$ *L* ∈ *NP*:  $L \notin P$ 

- ▶ A is true, you will prove this in HW 7  $(P \subseteq NP)$
- C is false since A is true
- ▶ B and D are unknown!
  - ▶ If B is true, then all languages in NP are in P, so P = NP
  - ▶ If D is true, then there exists a language in NP that is not in P, so  $P \neq NP$

# Relationship Between P and NP

► There is no proof as to whether P = NP



If P = NP, then all languages in NP are NP-complete, except the two trivial languages  $\Sigma^*$  and  $\emptyset$ .

# Our First NP-Complete Language

- ► We don't know if P = NP, but we've been able to establish relationships between the problems within NP
- Imagine some "hard" language in NP such that if we could decide this language efficiently, then we'd be able to decide all languages in NP efficiently
  - ► Knowledge about only this one language would give us a result for the entire class NP
  - ► This type of language is known as NP-Complete
- ► The language SAT is NP-Complete by the Cook Levin Theorem
  - Now if we could decide SAT efficiently, we could decide any language in NP efficiently, which would mean that NP  $\subseteq$  P and thus P=NP!

# The Language SAT

- ► Literal: Boolean variable with a value of TRUE or FALSE (such as x or  $\neg x$ )
- ▶ Boolean Formula  $\phi$ : formula made up of literals and logical operators (such as  $x \land \neg y$  or  $x \lor y \lor z$ )
- Satisfying assignment: a set of truth values assigned to each literal in a boolean formula  $\phi$  such that  $\phi$  evaluates to true  $SAT = \{\langle \phi \rangle : \phi \text{ is a satisfiable Boolean formula}\}$
- ► Example:  $x \lor \neg y \in SAT$ ;  $x \land \neg x \in SAT$
- ► The first step in the Cook Levin proof is to show that SAT is in NP

# High Level Cook Levin Theorem Proof

- ► The meat of the Cook Levin theorem is a reduction from an arbitrary language *L* in NP to SAT
- ► This reduction takes the form of a function *f* that meets the following requirements:
  - $x \in L$  implies that  $f(x) \in SAT$
  - $x \notin L$  implies that  $f(x) \notin SAT$
  - f is computable in polynomial time
- ▶ As L is in NP, we know there is an efficient verifier for L
  - lacktriangleright f can inspect V's "source code" to build a corresponding (poly-sized) formula  $\phi$
  - $\phi$  is designed so that it is satisfied by some assignment of its variables if and only if V(x,c) would accept for some c