

24 January 2025

Greedy Algorithms:

Minimum Spanning Tree

Plan

\* Minimum Spanning Tree (MST) Problem

\* Announcements

\* Greedy Algorithms

# Minimum Spanning Tree

vertices  
edges weights

Given a connected,  
undirected,  
weighted graph  $G = (V, E, w)$

Find a minimum spanning tree  $T = (V, E' \subseteq E)$

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↓  
 $\forall u, v \in V$ ,  
 $u$  and  $v$   
connected  
in  $T$

↓  
graph with  
no cycles



# Minimum Spanning Tree

Given a <sup>connected,</sup>  
undirected, <sup>weighted</sup> graph  $G = (V, E, w)$

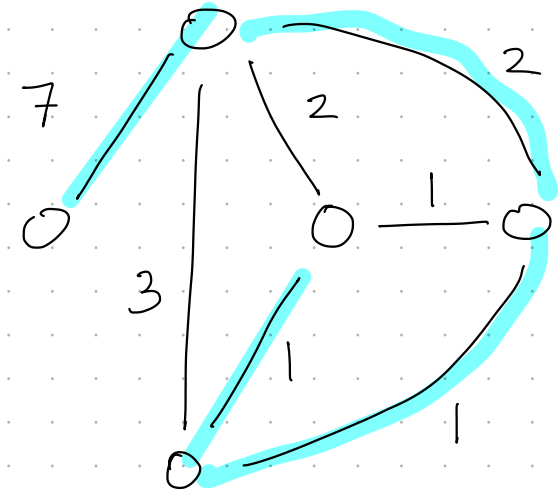
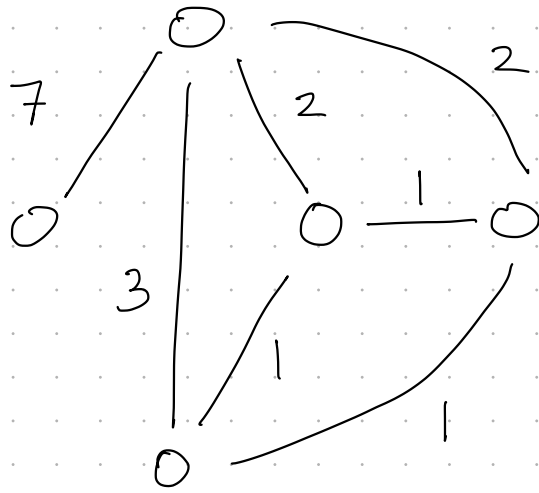
Find a minimum spanning tree  $T = (V, E' \subseteq E)$

minimize  
sum of  
edge weights.

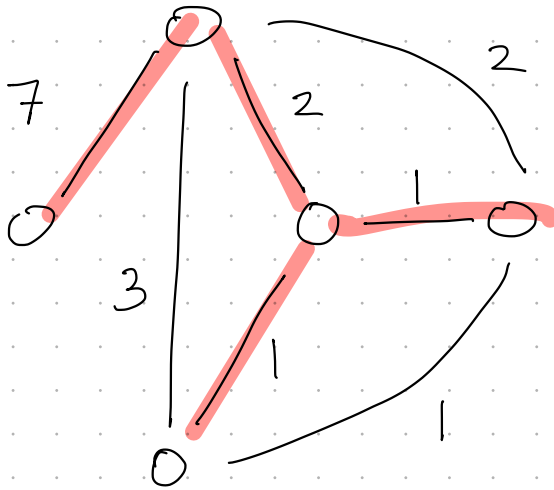
$$w_T = \sum_{e \in T} w_e$$

$\forall u, v \in V$ ,  
 $u$  and  $v$   
connected  
in  $T$

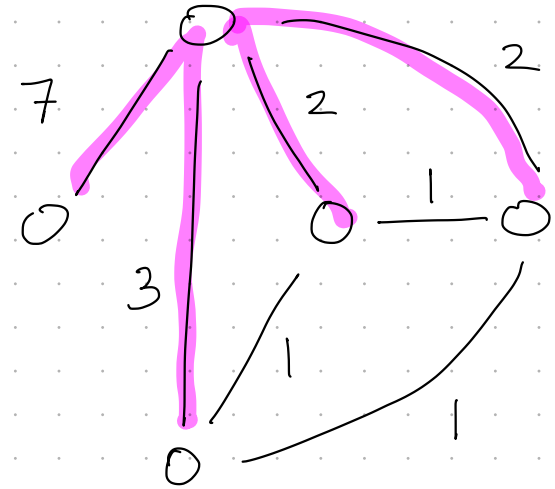
graph with  
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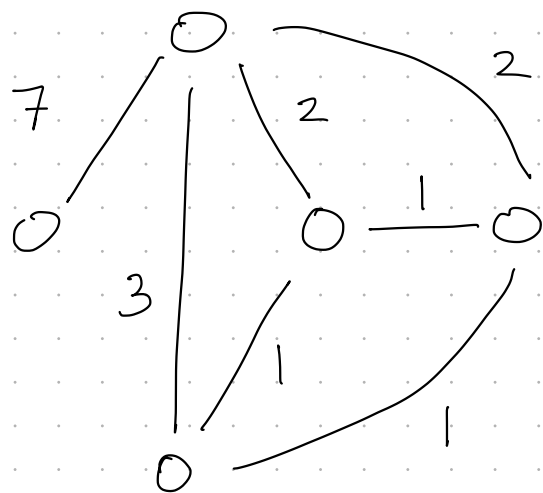
$$W_T = 11$$



$$W_T = 11$$



$$W_T = 14$$



# Announcements

Update to wording  
of HWQ Q1(d)

\* Canvas published (SORRY!)

\* KT added to CAMP.

\* OH start this afternoon

↳ Prof. Kim → Gates 203, 1-3p

↳ See full schedule on course page.

## Locations

Rhodes 590

Rhodes 655



large room for "peak" OH

dedicated 4820  
space 24/7.

# MST Algorithms

Given a weighted graph  $G = (V, E, W)$

Return a minimum spanning tree.

Approach.

Greedy Algorithms

# Greedy Algorithms

Design Paradigm. Choose solution "greedily"

Myopic  $\rightarrow$  local decisions that "look good"

Irrevocable  $\rightarrow$  once we make a decision,  
we never reconsider.

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Advantage.

Fast & Local

Running Time?

Greedy Prototype.

① Sort by "priority"

$O(n \log n)$

② Iterate through elems in priority order

$\hookrightarrow$  Make decision about elem.

"constant"  $O(1)$  time

$O(n)$

# Greedy Algorithms

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## Greedy Prototype

① Sort by "priority"

Design of Greedy Algorithm  $\leftarrow$

② Iterate through elems in priority order

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# Greedy Algorithms

Design Paradigm. Choose solution "greedily"

Myopic  $\rightarrow$  local decisions that "look good"

Irrevocable  $\rightarrow$  once we make a decision,  
we never reconsider.

Warning. Challenging to analyze correctness

More often than not,

Greedy approaches are incorrect.

# Greedy Algorithms for MST

Given graph  $G = (V, E, W)$

## Greedy Prototype

① Sort by "priority"

weights

edges

② Iterate through elems in priority order  
↳ Make decision about elem.

## Two MST Algs.

On input  $G = (V, E, W)$

Step ①. Sort edges by weight

$$W_{e_1} < W_{e_2} < \dots < W_{e_m}$$

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Add Min

Delete Max

## Two MST Algs.

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Step ①. Sort edges by weight

$$W_{e_1} < W_{e_2} < \dots < W_{e_m}$$

### Add Min

$$T = (V, \{\})$$

For  $i = 1 \rightarrow m$ .

if  $T \cup \{e_i\}$   
does not form a cycle

Add  $e_i$  to  $T$ .

Return  $T$ .

### Delete Max

$$T = (V, E)$$

For  $i = m \rightarrow 1$ .

if  $T \setminus \{e_i\}$   
is still connected

Remove  $e_i$  from  $T$

Return  $T$ .

Which algorithm (if any) is correct?

Given a tree  $T$ , how do we know that  
 $T$  is / is not a min spanning tree?

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Simplifying Assumption.

Assume edge weights are distinct.

Given  $G$ , are there any edges  
that MUST NOT be in  
the MST?

(Consider cycles w/in  $G$ .)

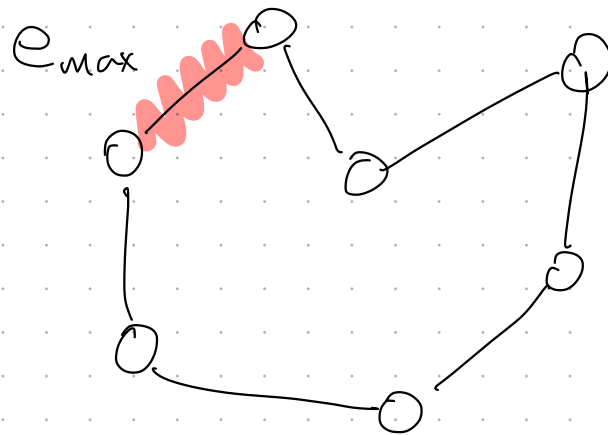


The Cycle Lemma.  $G = (V, E, W)$  w/ distinct edge weights.

Suppose  $C$  is a cycle within  $G$  and  
let  $e_{\max}$  be the edge in  $C$  of  
maximum weight.

Then,

$e_{\max}$  is NOT in the MST of  $G$ .

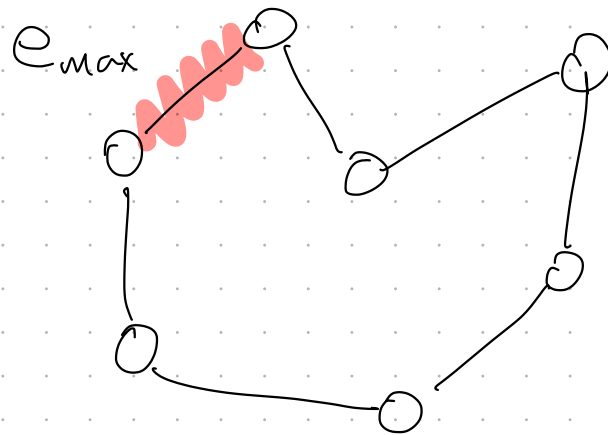


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Corollary. DeleteMax returns the MST of  $G$ .

↳ KT "Reverse Delete"

# Proof of Correctness of Delete Max

(assuming Cycle Lemma)

## Delete Max

$T = (V, E)$

For  $i = m \rightarrow 1$ .

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# Proof of Correctness of Delete Max (assuming Cycle Lemma)

By contradiction,

Suppose the MST is  $T^*$ , but Delete Max returns  $T \neq T^*$

$\Rightarrow$  Delete Max deletes some edge  $(u,v) \in T^*$ .

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## Delete Max

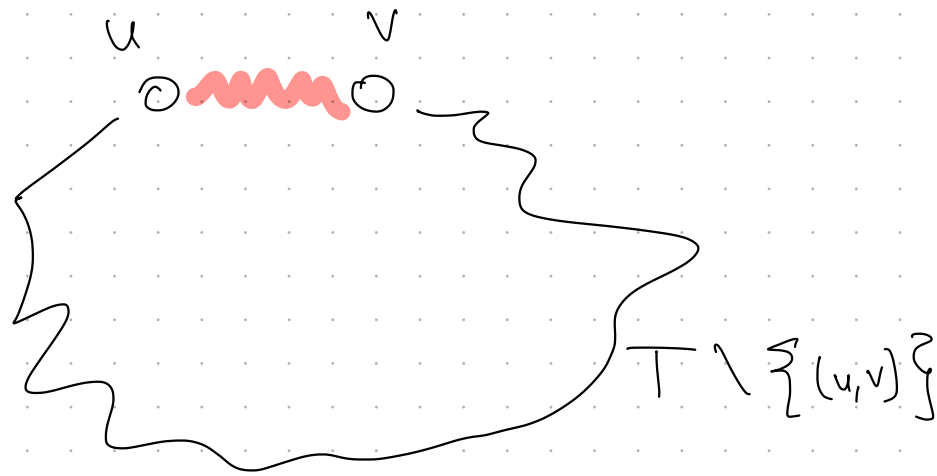
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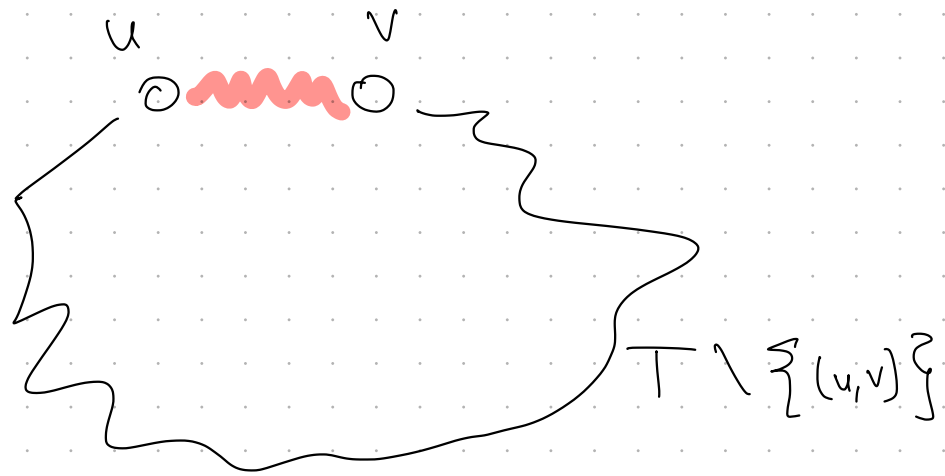
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But why did we remove  $(u,v)$ ?

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Return  $T$ .

By removal order (greatest  $\rightarrow$  least)  
 $(u,v)$  is the max wt. edge  
in cycle!

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$\Rightarrow$  By the Cycle Lemma  
 $(u,v) \notin T^*$

(A contradiction)





So, to complete proof of correctness for Delete Max  
we need to prove the Cycle Lemma.

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we need to prove the Cycle Lemma.

### Assumptions

- ①  $G = (V, E, W)$  w/ distinct edge wts.
- ②  $C$  is a cycle in  $G$  containing  $e_{\max}$
- ③  $e_{\max}$  is the max wt edge on  $C$

### Conclusion

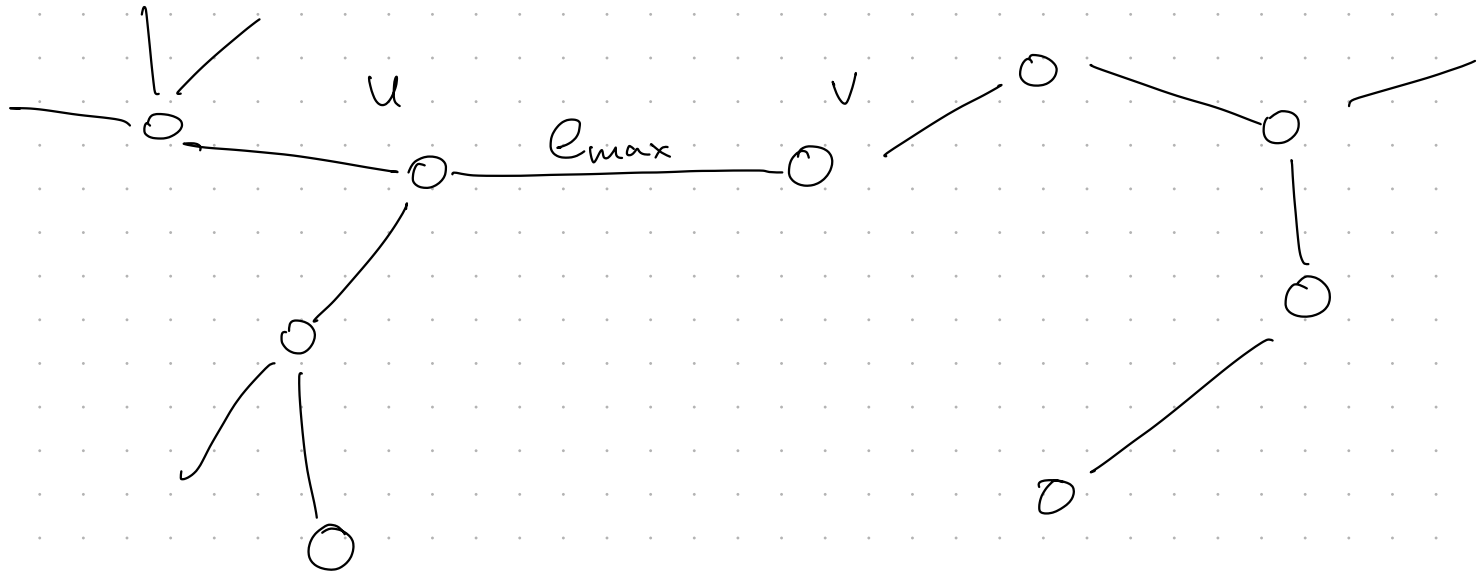
\*  $e_{\max}$  is NOT in MST.

Next.      Exchange Argument

Pf. By exchange argument.

Suppose  $T$  is a spanning tree s.t.  $e_{\max} = (u, v) \in T$

We show that  $T$  is NOT the minimum spanning tree.

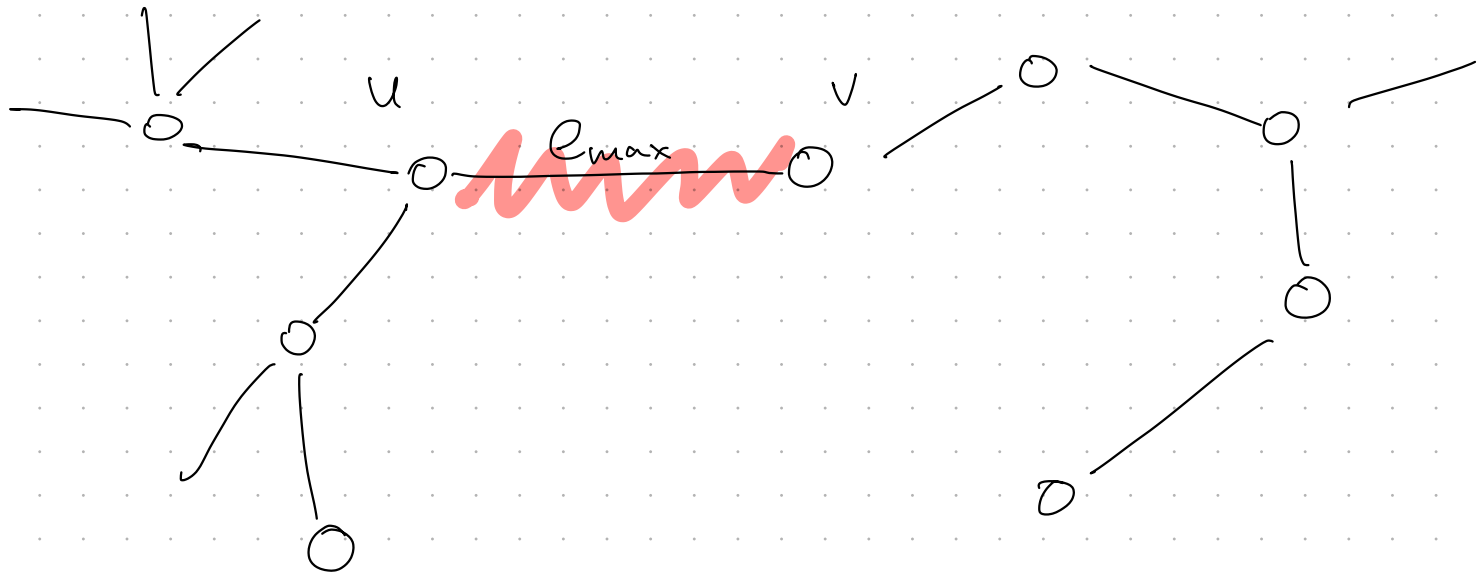


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Suppose  $T$  is a spanning tree s.t.  $e_{\max} = (u, v) \in T$

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Consider removing  $e_{\max}$  from  $T$ .

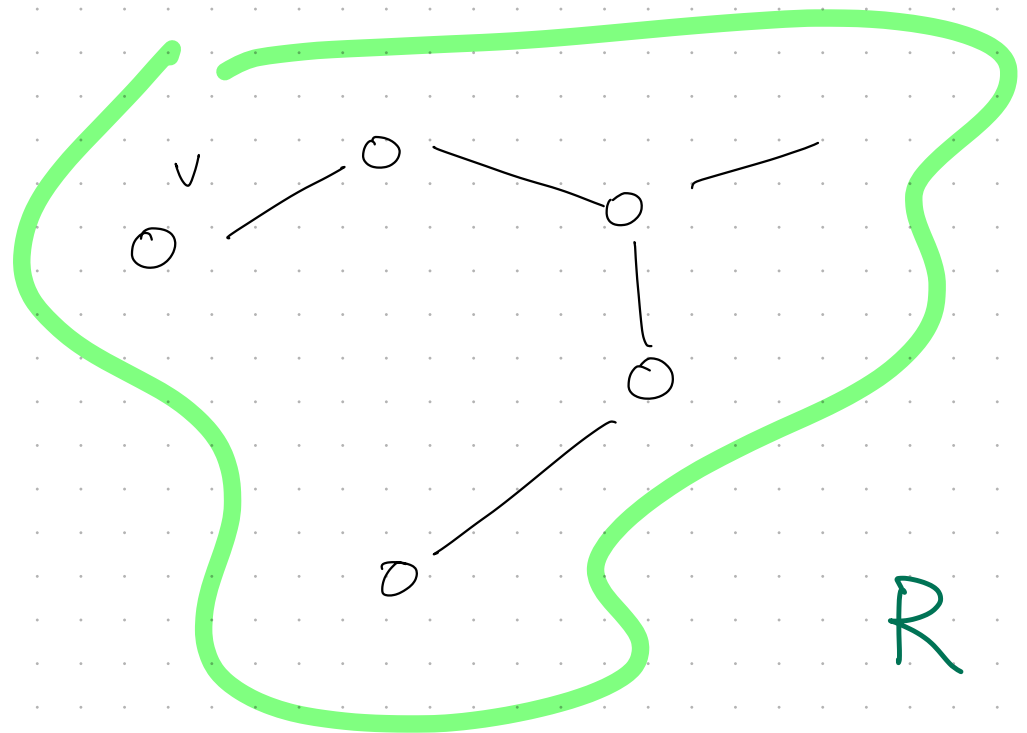
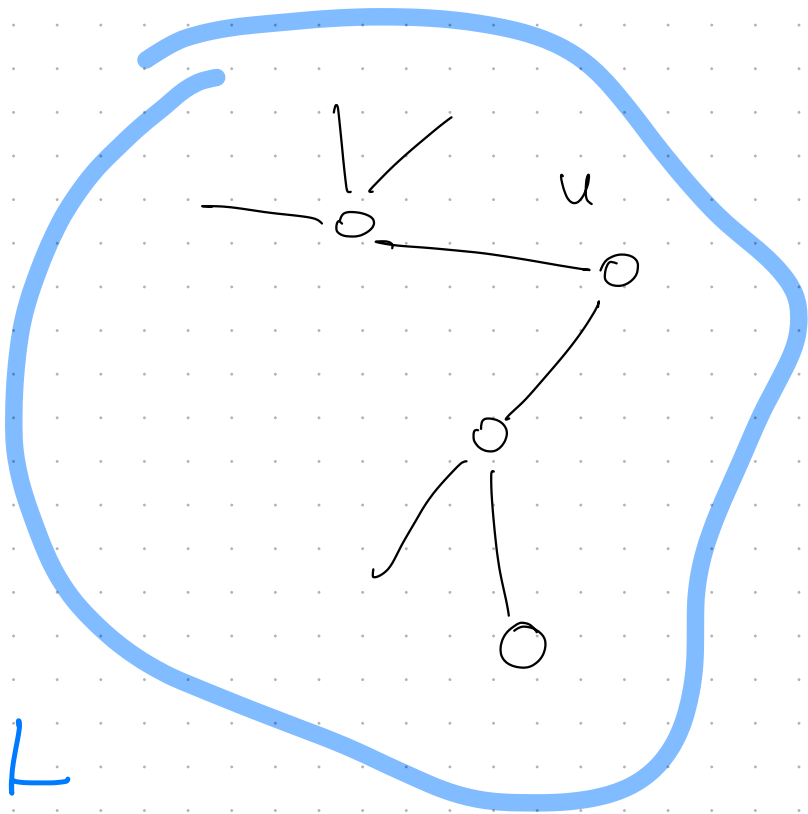


Pf. By exchange argument.

Suppose  $T$  is a spanning tree s.t.  $e_{\max} = (u, v) \in T$

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Disconnects  $T$  into two pieces.



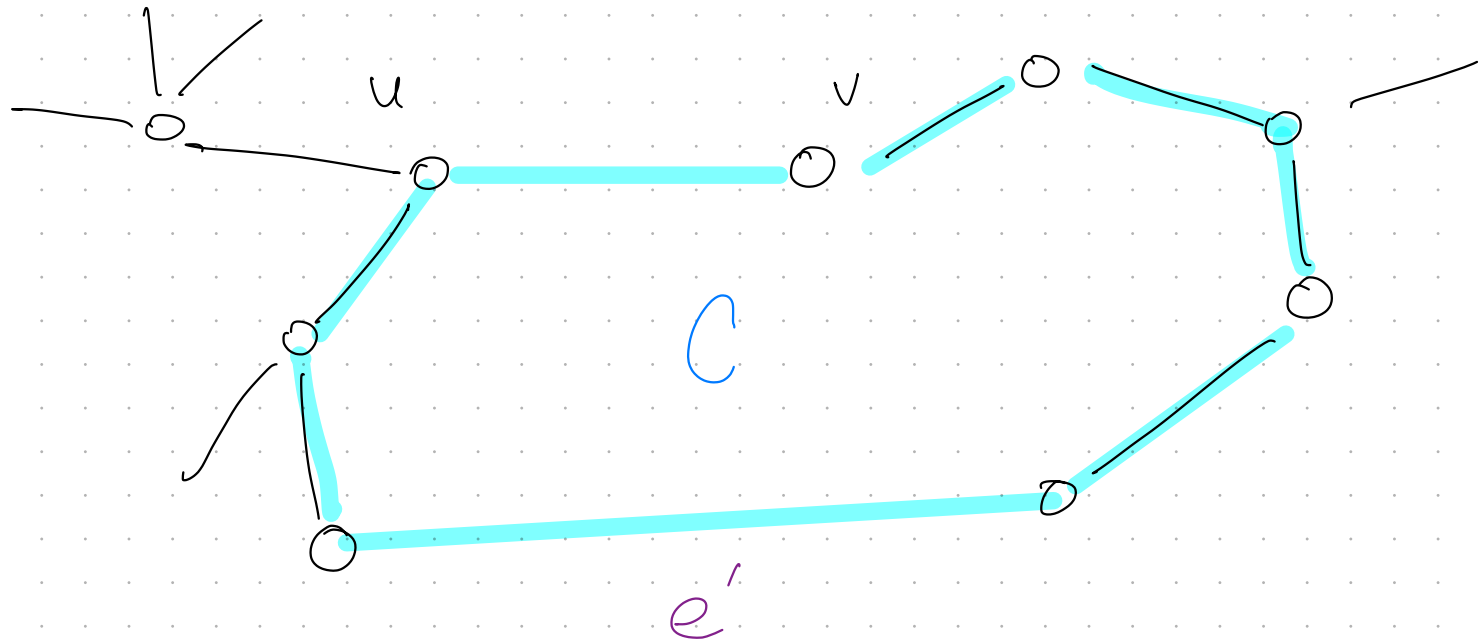
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Suppose  $T$  is a spanning tree s.t.  $e_{\max} = (u, v) \in T$

We show that  $T$  is NOT the minimum spanning tree.

By ②,  $e_{\max}$  is in some cycle  $C$  within  $G$ .

$\Rightarrow$  there exists some edge  $e' \in C$  (but not in  $T$ )  
from  $L$  to  $R$



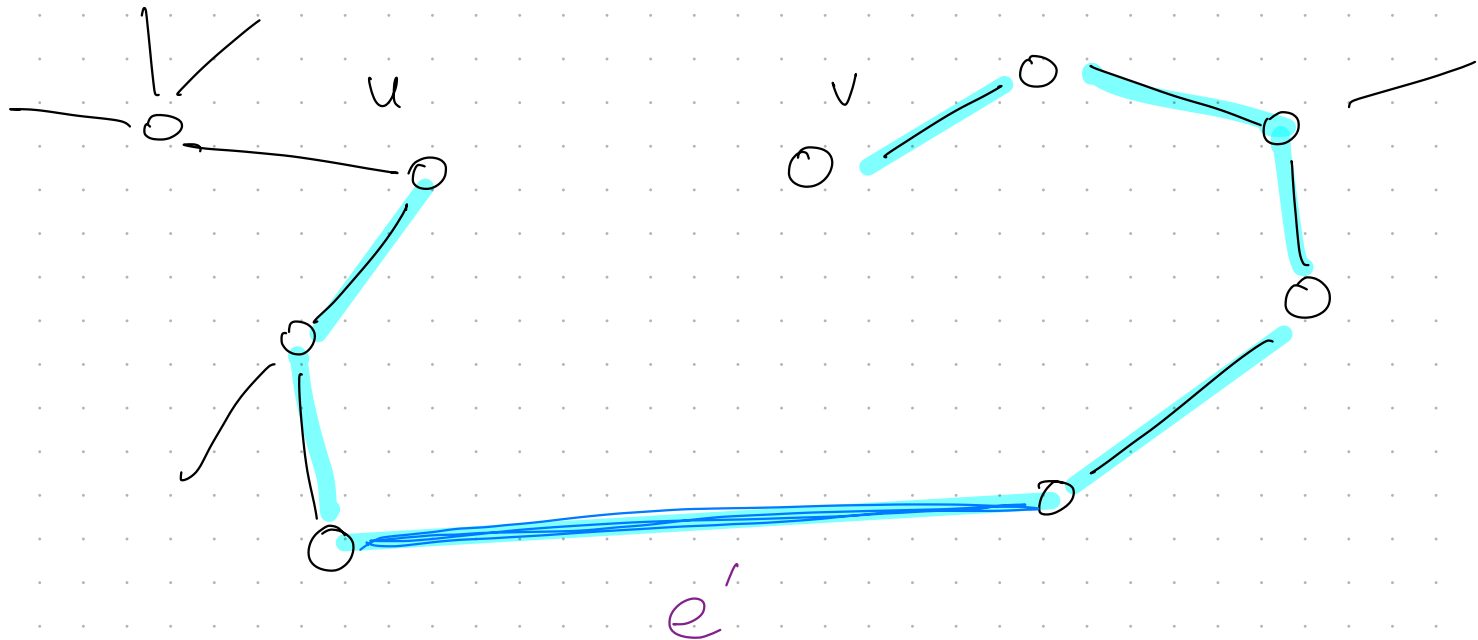
Pf. By exchange argument.

Suppose  $T$  is a spanning tree s.t.  $e_{\max} = (u, v) \in T$

We show that  $T$  is NOT the minimum spanning tree.

Consider exchanging  $e'$  for  $e_{\max}$ .

$$T' = T \setminus \{e_{\max}\} \cup \{e'\}$$



## Claims.

①  $T'$  has smaller weight than  $T$

②  $T'$  is a tree

③  $T'$  is connected (i.e. a spanning tree)



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①  $T'$  has smaller weight than  $T$

- $e_{\max}$  is the max wt. edge on  $C$
- exchanged for  $e' \in C$ .

$\} w_{T'} < w_T$   
by ① & ③

②  $T'$  is a tree

③  $T'$  is connected (i.e. a spanning tree)

## Claims.

①  $T'$  has smaller weight than  $T$

②  $T'$  is a tree

- if we add  $e'$  to  $T$ , we only introduce 1 cycle
- Removing  $e_{\max}$  breaks this cycle.

③  $T'$  is connected (i.e. a spanning tree)

## Claims.

①  $T'$  has smaller weight than  $T$

②  $T'$  is a tree

③  $T'$  is connected (i.e. a spanning tree)

- Original  $T$  was spanning.

- Any path using  $e_{\max}$  can use detour along  $C$  to go from  $u \leftrightarrow v$ .

Pf. By exchange argument.

Suppose  $T$  is a spanning tree s.t.  $e_{\max} = (u, v) \in T$

We show that  $T$  is NOT the minimum spanning tree.

Thus,  $T'$  is a spanning tree w/  $w_{T'} < w_T$

so  $T$  is NOT the MST.  $\square$

