

# Minimum Spanning Tree (MST)

Hengfeng Wei

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## Cut Property

$$G = (V, E, w)$$

## Cut Property (I)

$X$  : A part of some MST  $T$  of  $G$

$(S, V \setminus S)$  : A **cut** such that  $X$  does **not** cross  $(S, V \setminus S)$   $\wedge$

$e$  : **A** lightest edge across  $(S, V \setminus S)$

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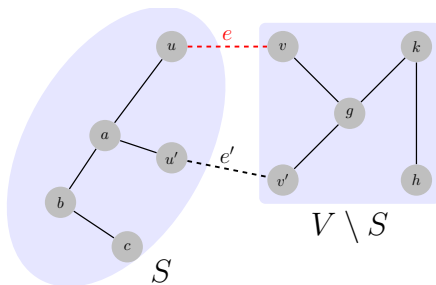
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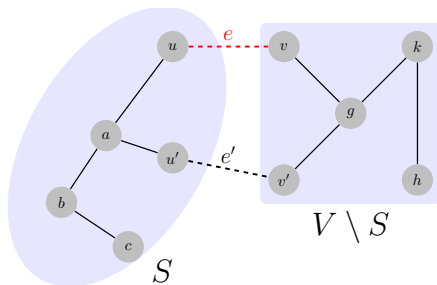
Correctness of Prim's and Kruskal's algorithms.

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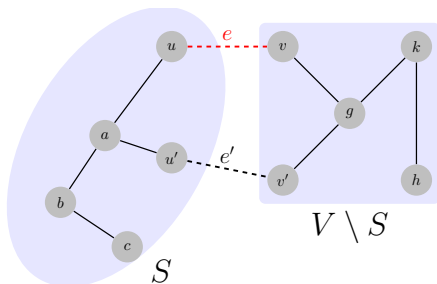
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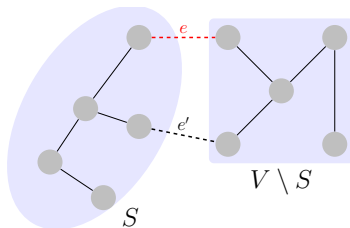
“a”  $\rightarrow$  “the”  $\Rightarrow$  “some”  $\rightarrow$  “all”

## Cut Property (II)

A cut  $(S, V \setminus S)$

Let  $e = (u, v)$  be **a** lightest edge across  $(S, V \setminus S)$

$\exists$  MST  $T$  of  $G : e \in T$

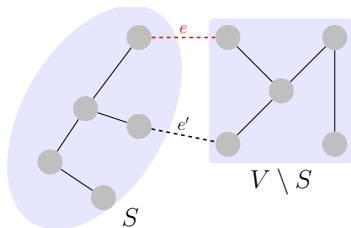


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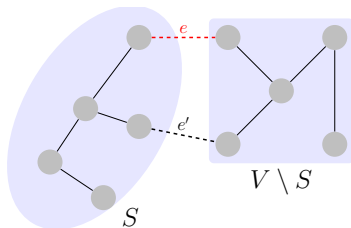
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### Application of Cut Property [Problem: 10.15 (3)]

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## Wrong Divide&Conquer Algorithm for MST [Problem: 10.21]

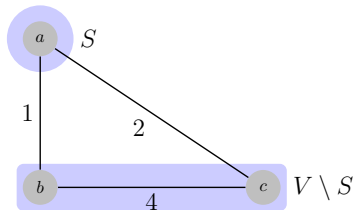
$$(V_1, V_2) : \left| |V_1| - |V_2| \right| \leq 1$$

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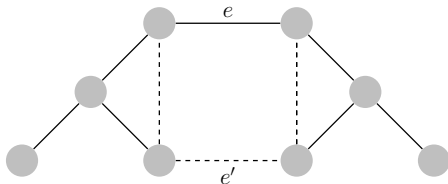


# Cycle Property

## Cycle Property [Problem: 10.19(b)]

- ▶ Let  $C$  be any cycle in  $G$
- ▶ Let  $e = (u, v)$  be **a** maximum-weight edge in  $C$

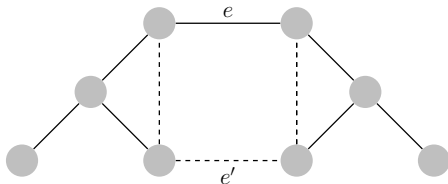
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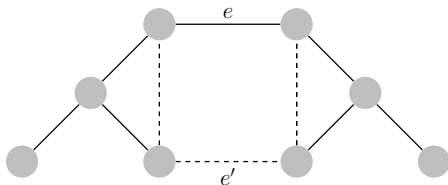


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*“On the Shortest Spanning Subtree of a Graph  
and the Traveling Salesman Problem”*

— **Kruskal**, 1956.

## Application of Cycle Property [Problem: 10.15 (1)]

$$G = (V, E), \quad |E| > |V| - 1$$

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## Cycle Property

## Application of Cycle Property [Problem: 10.15 (5)]

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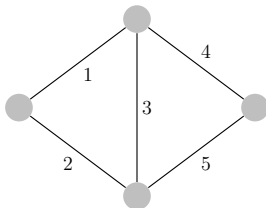
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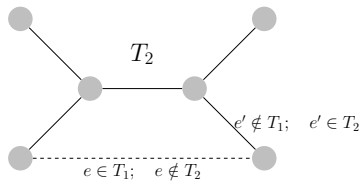
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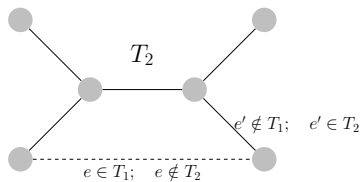
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$$e \in T_1 \setminus T_2 \text{ (w.l.o.g.)}$$

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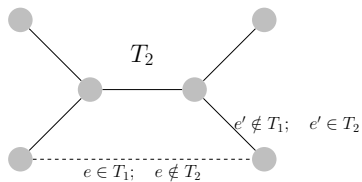
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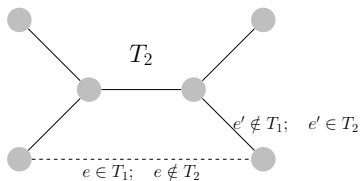
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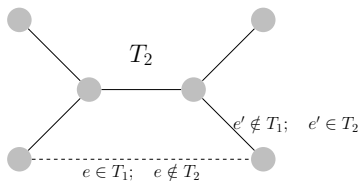
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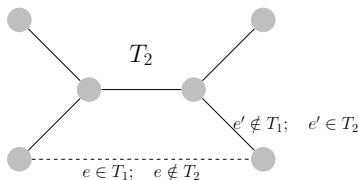
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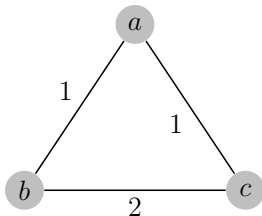
$$T' = T_2 + \{e\} - \{e'\} \implies w(T') < w(T_2)$$

## Condition for Uniqueness of MST [Problem: 10.18 (2)]

Unique MST  $\nRightarrow$  Equal weights.

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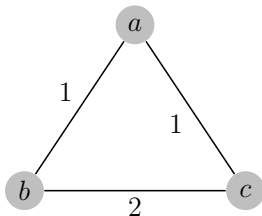


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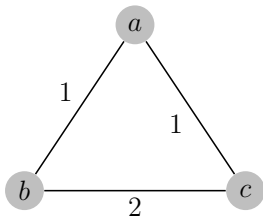
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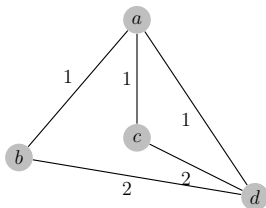
*Minimum-weight edge across any cut is unique  $\Rightarrow$  Unique MST.*

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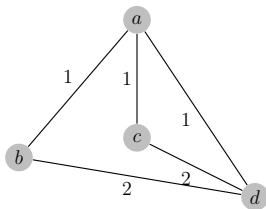
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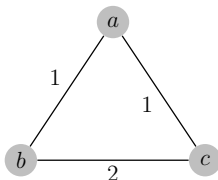
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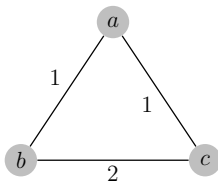




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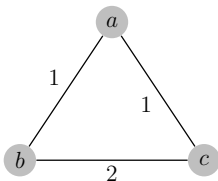


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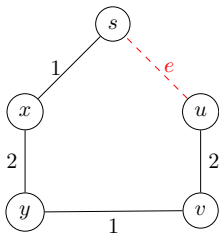
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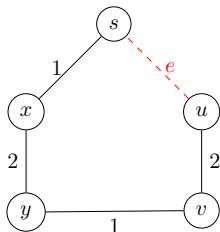
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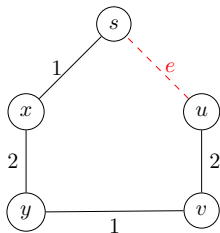
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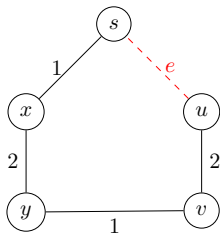
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# Variants of MST

## Adding a Vertex $v$ to MST $T$ [Problem: 10.7]

$$G' = (V', E') : V' = V + \{v\}, E' = E + E_v$$

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“On Finding and Updating Spanning Trees and Shortest Paths”, 1975

“Algorithms for Updating Minimum Spanning Trees”, 1978

Feedback Edge Set (FES): [Problem: 10.8]

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$\text{FES} \iff G \setminus \text{Max-ST}$

## MST with Specified Leaves: [Problem: 10.11]

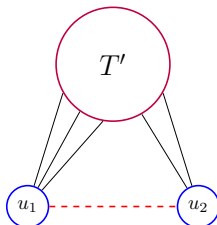
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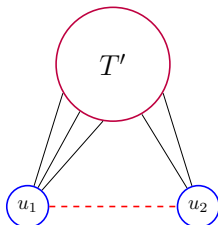
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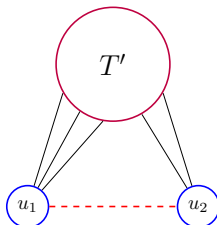


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MST  $T'$  of  $G' = G \setminus U$

Attach  $\forall u \in U$  to  $T'$  (with lightest edge)

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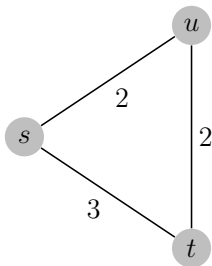
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Compute MST on  $G'$

# MST v.s. Shortest Path

## MST vs. Shortest Paths [Problem: 10.15 (6)]

✗ The shortest path between  $s$  and  $t$  is necessarily part of some MST.



## Sharing Edges [Problem: 10.9]

$$G = (V, E, w), \quad w(e) > 0, \quad s \in V$$

All sssp trees from  $s$  must share some edge with **all** (some) MSTs of  $G$ .

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$$\forall \text{ MST } T \text{ of } G : T \cap E' \neq \emptyset$$

