

COMP108

Data Structures and Algorithms

Greedy Algorithm (Part II Minimum Spanning Tree)

Professor Prudence Wong

pwong@liverpool.ac.uk

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Minimum Spanning Tree (MST)

Given an **undirected connected** graph G

- ▶ The edges are labelled by weight

Spanning tree of G

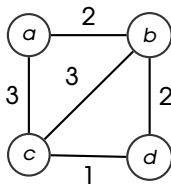
- ▶ a tree containing all vertices in G

Minimum spanning tree of G

- ▶ a spanning tree of G with minimum weight

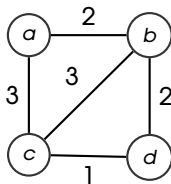
Examples

Graph G (edge label is weight)

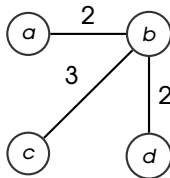
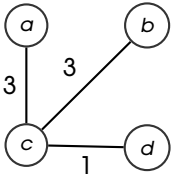
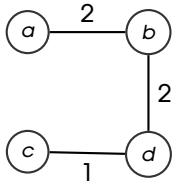


Examples

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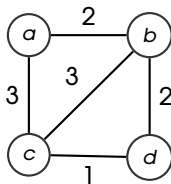


Spanning trees of G

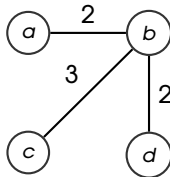
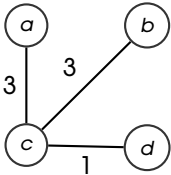
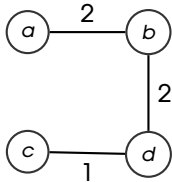


Examples

Graph G (edge label is weight)



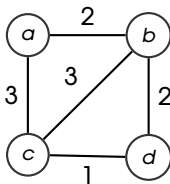
Spanning trees of G



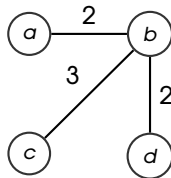
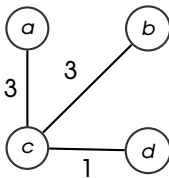
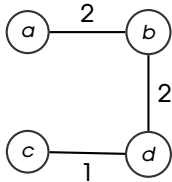
Which is MST?

Examples

Graph G (edge label is weight)



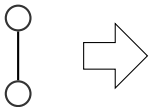
Spanning trees of G



Which is MST?

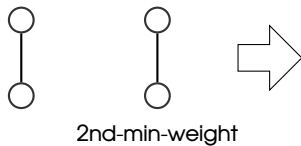
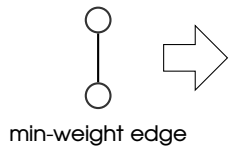
How many possible spanning trees?

Idea of Kruskal's algorithm - MST

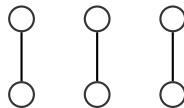
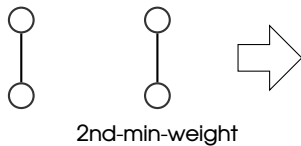
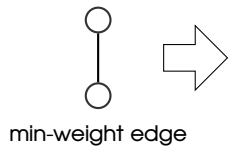


min-weight edge

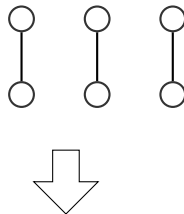
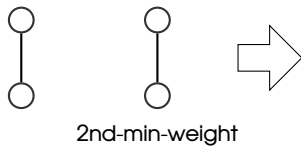
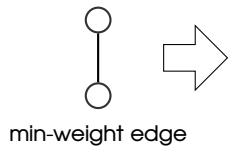
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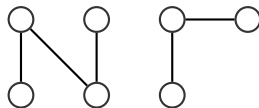
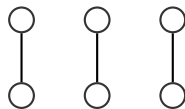
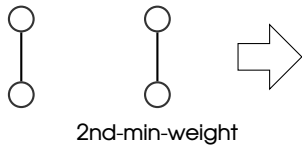
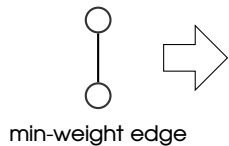
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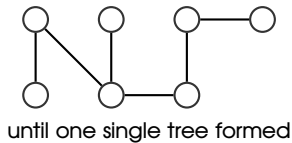
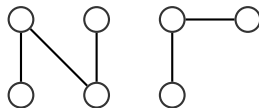
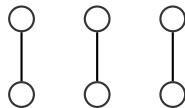
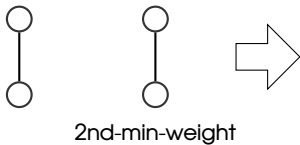
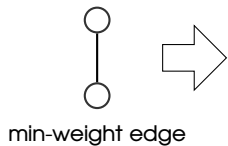
Idea of Kruskal's algorithm - MST



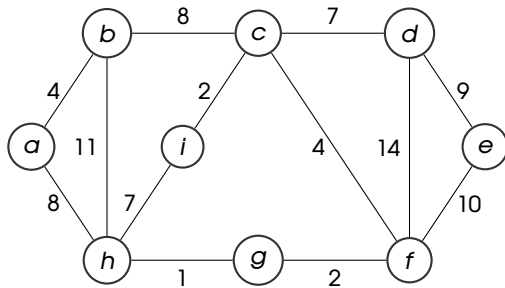
Idea of Kruskal's algorithm - MST



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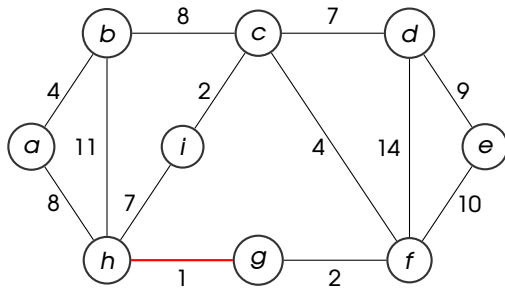
Kruskal's algorithm - MST



Arrange edges from smallest to largest weight

| | | |
|--|----------|----|
| | (g, h) | 1 |
| | (c, i) | 2 |
| | (f, g) | 2 |
| | (a, b) | 4 |
| | (c, f) | 4 |
| | (c, d) | 7 |
| | (h, i) | 7 |
| | (a, h) | 8 |
| | (b, c) | 8 |
| | (d, e) | 9 |
| | (e, f) | 10 |
| | (b, h) | 11 |
| | (d, f) | 14 |

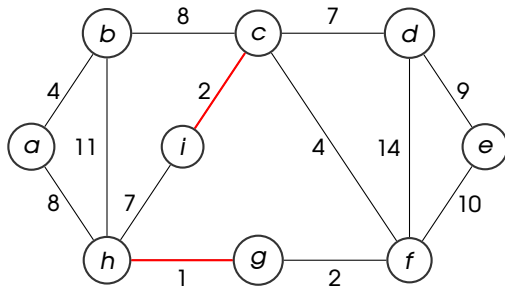
Kruskal's algorithm - MST



Choose the minimum weight edge

| | | |
|---|--------|----|
| ✓ | (g, h) | 1 |
| | (c, i) | 2 |
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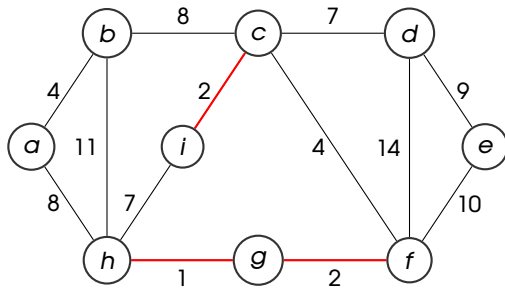
Kruskal's algorithm - MST



Choose the next minimum weight edge

| | | |
|---|--------|----|
| ✓ | (g, h) | 1 |
| ✓ | (c, i) | 2 |
| | (f, g) | 2 |
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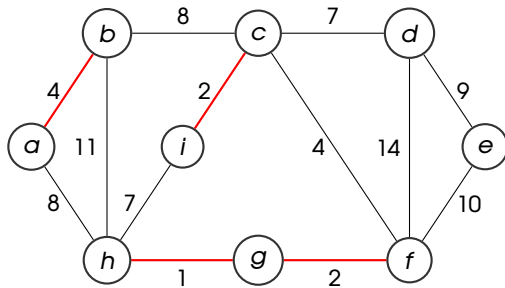
Kruskal's algorithm - MST



Continue as long as no cycle forms

| | | |
|---|--------|----|
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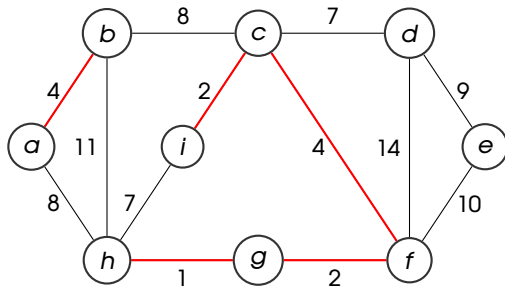
Kruskal's algorithm - MST



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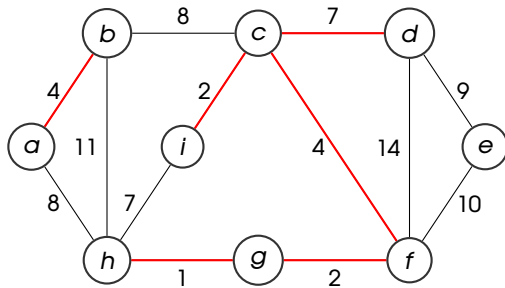
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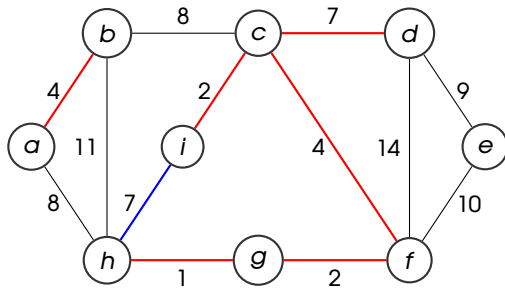
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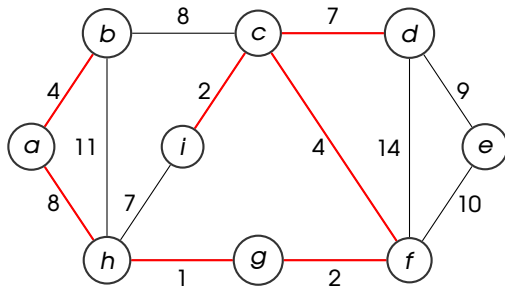
Kruskal's algorithm - MST



next edge cannot be included, otherwise, cycle is formed

| | | |
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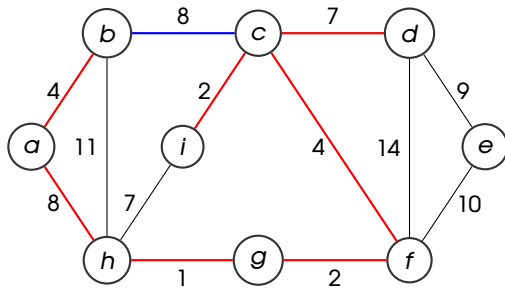
Kruskal's algorithm - MST



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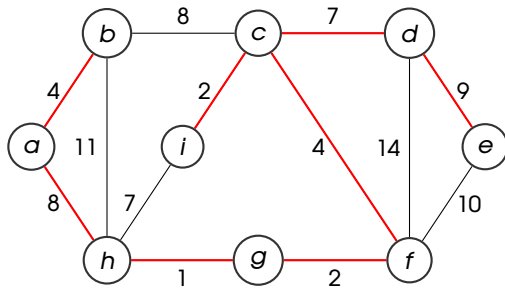
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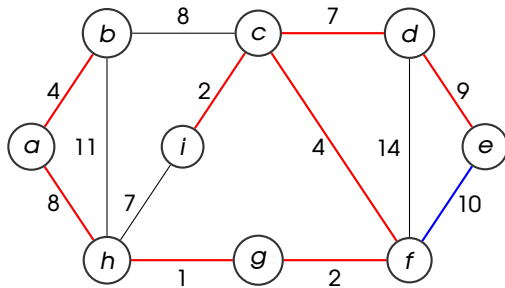
Kruskal's algorithm - MST



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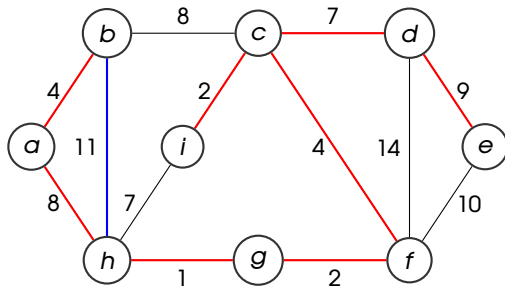
Kruskal's algorithm - MST



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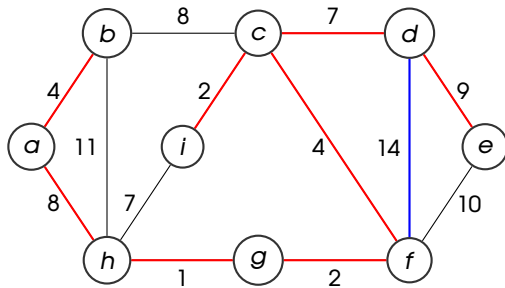
Kruskal's algorithm - MST



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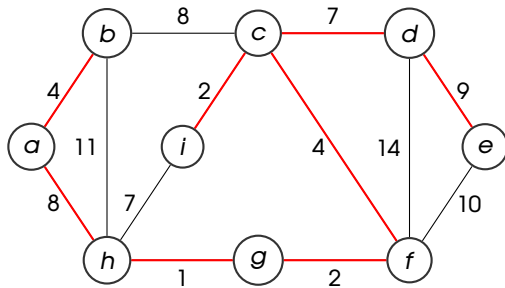
Kruskal's algorithm - MST



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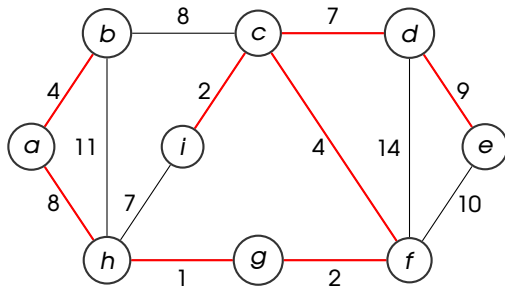
Kruskal's algorithm - MST



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MST is found when all edges are examined

Kruskal's algorithm - MST



| | | |
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| ✓ | (g, h) | 1 |
| ✓ | (c, i) | 2 |
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Order of edges selected (g, h), (c, i), (f, g), (a, b), (c, f), (c, d), (a, h), (d, e)

Kruskal's algorithm - MST

Kruskal's algorithm is **greedy** in the sense that

- ▶ it always attempt to select the **smallest** weight edge to be included in the MST

Pseudo code

// Given an undirected connected graph $G = (V, E)$

$T \leftarrow \emptyset$

$E' \leftarrow E$

while $E' \neq \emptyset$ do

begin

end

Pseudo code

// Given an undirected connected graph $G = (V, E)$

$T \leftarrow \emptyset$

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while $E' \neq \emptyset$ do

begin

 pick an edge e in E' with minimum weight

end

Pseudo code

// Given an undirected connected graph $G = (V, E)$

$T \leftarrow \emptyset$

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begin

 pick an edge e in E' with minimum weight

 if adding e to T does not form cycle then

 add e to T , i.e., $T \leftarrow T \cup \{e\}$

end

Pseudo code

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$T \leftarrow \emptyset$

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while $E' \neq \emptyset$ do

begin

 pick an edge e in E' with minimum weight

 if adding e to T does not form cycle then

 add e to T , i.e., $T \leftarrow T \cup \{e\}$

 remove e from E' , i.e., $E' \leftarrow E' \setminus \{e\}$

end

Pseudo code

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$T \leftarrow \emptyset$

$E' \leftarrow E$

while $E' \neq \emptyset$ do

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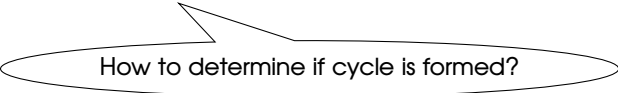
pick an edge e in E' with minimum weight

if adding e to T does not form cycle then

add e to T , i.e., $T \leftarrow T \cup \{e\}$

remove e from E' , i.e., $E' \leftarrow E' \setminus \{e\}$

end



How to determine if cycle is formed?

How to determine if cycle is formed? n is # vertices; m is # edges

When we consider a new edge $e = (u, v)$, there may be three cases:

if u & v are both non-colored, then edge can be selected and given a new color;

$O(1)$ 1. at most one of u and v is end point of an already chosen edge

if u or v are not colored (one of them is colored, the other isn't), can select, give uncolor vertex

$O(1)$ 2. u and v both belong to the same partial tree that has been already chosen

if u & v are the same color, then can't select

$O(n)$ 3. u and v belong to two separate partial trees that have been already chosen

if u & v have different colors $C1$ and $C2$, then can select, but we need to recolor so that every vertices of $C2$ to $C1$

Use coloring

n is # vertices; m is # edges

Pseudo code

// Given an undirected connected graph $G = (V, E)$

sorting before: $O(m \log m)$

$T \leftarrow \emptyset$ $O(1)$

$E' \leftarrow E$ $O(1)$

while $E' \neq \emptyset$ do $O(m)$

begin

pick an edge e in E' with minimum weight pre-sorting: $O(1)$

if adding e to T does not form cycle then $O(n)$

add e to T , i.e., $T \leftarrow T \cup \{e\}$ $O(1)$

remove e from E' , i.e., $E' \leftarrow E' \setminus \{e\}$ $O(1)$

end

Time complexity?

$O(nm) \Rightarrow \text{polynomial}$

Summary

Summary: Kruskal's algorithm for Minimum Spanning Tree

Next: Dijkstra's algorithm for Single-Source Shortest-Paths

For note taking

