

## Graphs review (App. B)

Digraph: (directed graph)  $G=(V,E)$

- set  $V$  of vertices
- set  $E$  of edges  $\in V \times V$  (ordered pair of vertices)

Undirected graph:  $E$  contains undirected pair of vertices

- $|E| \in O(V^2)$   
 $\hookrightarrow$  because  $\leq C_n$  at most
- if  $G$  is connected, then  $|E| \geq |V|-1$
- $\lg |E| \in \Theta(\lg |V|)$  for connected undirected graphs

## Graph representation

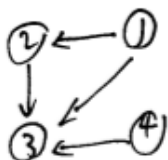
① Adjacency Matrix of  $G=(V,E)$

where  $V=\{1,2,\dots,n\}$  is the  $n \times n$  matrix of  $A$  given by

$$A[i,j] = \begin{cases} 1 & \text{if } (i,j) \in E \\ 0 & \text{if } (i,j) \notin E \end{cases}$$

- for weighted graph, 1 will be replaced w/ weight

e.g.



A	1	2	3	4
1	0	1	1	0
2	0	0	1	0
3	0	0	0	0
4	0	0	1	0

storage for adjacency matrix:  $\Theta(V^2)$

good for dense representation

↳ such as a complete graph

② adjacency list of  $v \in V$  is the list  $\text{adj}[v]$  of vertices adjacent to  $v$

e.g.  $\text{Adj}[1] = \{2, 3\}$

$2 = \{3\}$

$3 = \{ \}$

$4 = \{3\}$

good for sparse graph

↳ such as trees,  
internet nodes,

Q: what's the length of the list.

$$|\text{Adj}[v]| = \begin{cases} \text{degree}(v) & \text{for undirected} \\ \text{out-degree}(v) & \text{for directed} \end{cases}$$

handshaking Lemma (undirected graph)

$$\sum_{v \in V} \text{degree}(v) = 2|E|$$

Thus for undirected graph, adjacency list cost  $\Theta(|V| + |E|)$

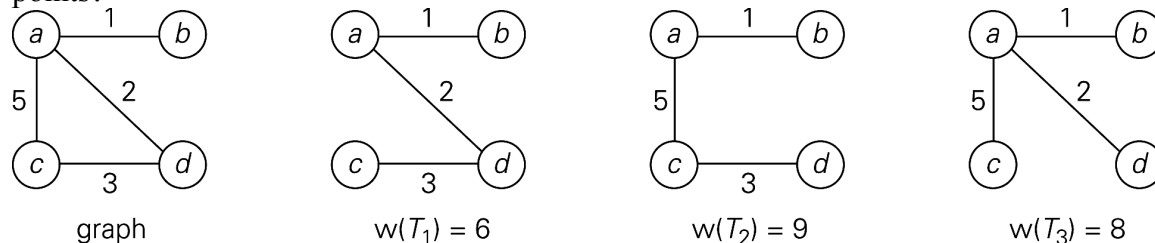
storage. same for digraphs

Adjacency list usually out-performs adjacency matrix but the matrix is used some of the very important algorithms due to the easiness of matrix operations.

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**Minimum spanning tree (MST)**

**Why?**

Given a set of points (cities), how do you use the minimum amount of wire to connect these points?



**FIGURE 9.1** Graph and its spanning trees;  $T_1$  is the minimum spanning tree

**Definitions**

Spanning tree of a connected graph  $G$ : a connected acyclic subgraph of  $G$  that includes all of  $G$ 's vertices

Minimum spanning tree of a weighted, connected graph  $G$ : a spanning tree of  $G$  of minimum total weight

**Problem:**

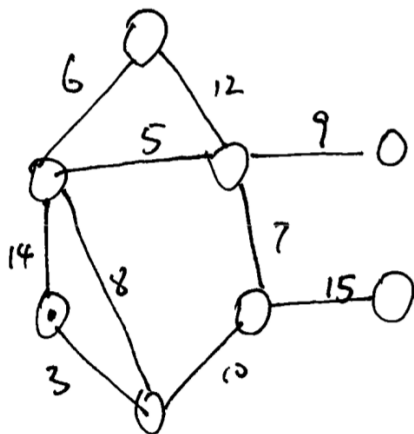
**Input:** Connected undirected graph  $G=(V,E)$  with weight function  $N:E \rightarrow \mathbb{R}$

For simplicity, all weights are distinct (i.e. the function is one to one)

**Output:** A spanning tree  $T$  (connects all vertices) of minimum weight

$$W(T) = \sum_{(u,v) \in T} w(u,v)$$

There are many applications of MST on clustering, and point connecting problem e.g.



- edges have to be in
- include 9 & 15
  - 3 has to be there because the dot node has two choices to be connected.
  - 6 is there for a similar reason
  - 5, 7, 8 have to be there because we have 4 connected components to be connected.

### Prim's algorithm

**Idea:** build the MST by adding in the **nearest** node into the tree in each iteration. (the greedy idea comes from the nearest)

### Procedure

- Start with tree  $T_1$  consisting of one (any) vertex and “grow” tree one vertex at a time to produce MST through a series of expanding subtrees  $T_1, T_2, \dots, T_n$
- On each iteration, construct  $T_{i+1}$  from  $T_i$  by adding vertex not in  $T_i$  that is closest to those already in  $T_i$  (this is a “greedy” step!)
- Stop when all vertices are included

### Pseudo-code

**PRIM**( $G, w, r$ )

$Q = \emptyset$

**for** each  $u \in G.V$

$u.key = \infty$

$u.\pi = \text{NIL}$

**INSERT**( $Q, u$ )

**DECREASE-KEY**( $Q, r, 0$ )      //  $r.key = 0$

**while**  $Q \neq \emptyset$

$u = \text{EXTRACT-MIN}(Q)$

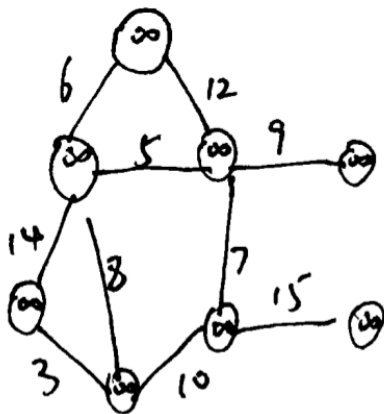
**for** each  $v \in G.Adj[u]$

**if**  $v \in Q$  and  $w(u, v) < v.key$

$v.\pi = u$

**DECREASE-KEY**( $Q, v, w(u, v)$ )

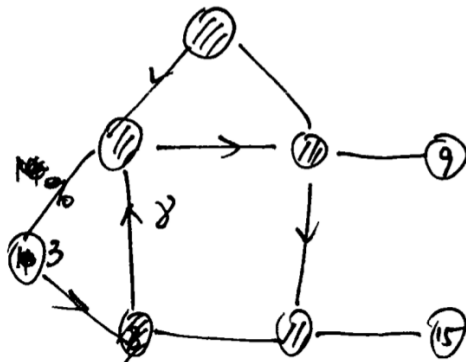
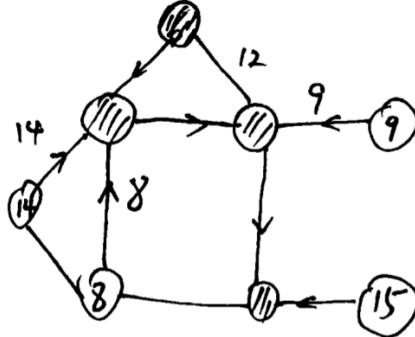
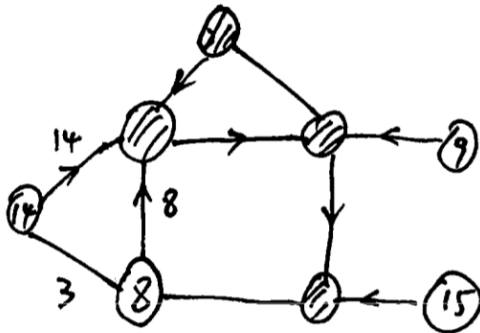
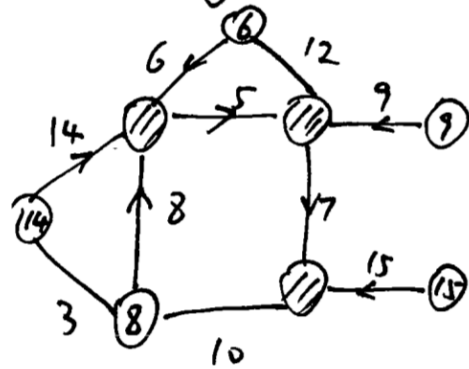
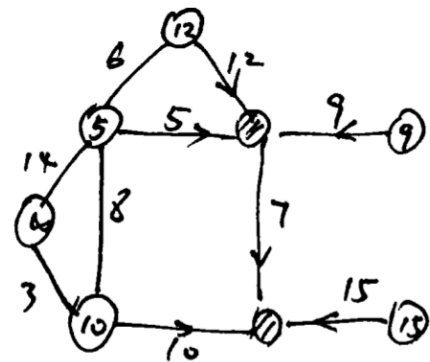
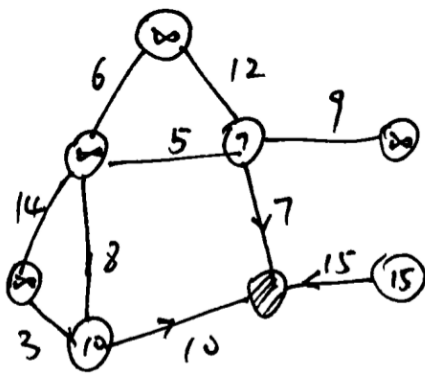
E.g. Find the MST on the example graph above



⊗ : already part of MST

○ : in  $Q$

→ pointer

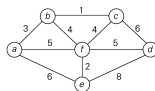


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Then just add 9 and 15 to the tree

## Notes

- Proof by induction that this construction actually yields MST
- Needs priority queue for locating closest fringe vertex
- Efficiency
  - $O(n^2)$  for weight matrix representation of graph and array implementation of priority queue
  - $O(m \log n)$  for adjacency list representation of graph with  $n$  vertices and  $m$  edges and min-heap implementation of priority queue

## Exercise



Tree vertices	Remaining vertices	Illustration
$a(-, -)$	<b><math>b(a, 3)</math></b> $c(-, \infty)$ $d(-, \infty)$ $e(a, 6)$ $f(a, 5)$	
$b(a, 3)$	<b><math>c(b, 1)</math></b> $d(-, \infty)$ $e(a, 6)$ $f(b, 4)$	
$c(b, 1)$	$d(c, 6)$ $e(a, 6)$ <b><math>f(b, 4)</math></b>	
$f(b, 4)$	$d(f, 5)$ <b><math>e(f, 2)</math></b>	
$e(f, 2)$	<b><math>d(f, 5)</math></b>	
$d(f, 5)$		

**FIGURE 9.2** Application of Prim's algorithm. The parenthesized labels of a vertex in the middle column indicate the nearest tree vertex and edge weight; selected vertices and edges are shown in bold.

## Kruskal's algorithm

**Idea:** Since MST is a tree and we can build this tree, why not order the edges and build up the tree with edges that don't make circles.

### Steps

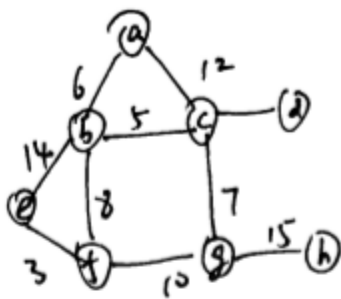
- Sort the edges in nondecreasing order of lengths
- "Grow" tree one edge at a time to produce MST through a series of expanding forests  $F_1, F_2, \dots, F_{n-1}$

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- On each iteration, add the next edge on the sorted list unless this would create a cycle. (If it would, skip the edge.)

e.g. same graph

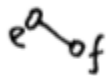




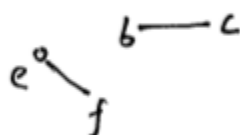
Sort by edge: ef bc ab cg bf cd de gh

grow by edge:

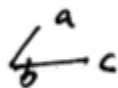
ef ✓



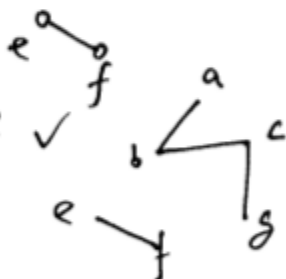
ef bc ✓



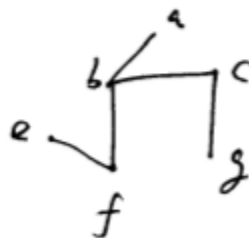
ef bc ab ✓



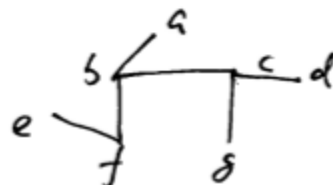
ef bc ab cg ✓



ef bc ab cg bf ✓

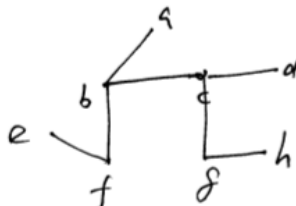


ef bc ab cg bf cd ✓



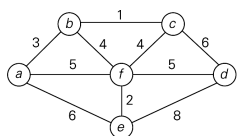
ef bc ab cg bf cd be X  
 ↳ will introduce a cycle

ef bc ab cg bf cd gh ✓



done

## Exercise



Tree edges	Sorted list of edges	Illustration
	<b>bc</b> 1 ef 2 ab 3 bf 4 cf 4 af 5 df 5 ae 6 cd 6 de 8	
bc 1	bc 1 <b>ef</b> 2 ab 3 bf 4 cf 4 af 5 df 5 ae 6 cd 6 de 8	
ef 2	bc 1 ef 2 <b>ab</b> 3 bf 4 cf 4 af 5 df 5 ae 6 cd 6 de 8	
ab 3	bc 1 ef 2 ab 3 <b>bf</b> 4 cf 4 af 5 df 5 ae 6 cd 6 de 8	
bf 4	bc 1 ef 2 ab 3 bf 4 cf 4 <b>df</b> 5 ae 6 cd 6 de 8	
df 5		

FIGURE 9.4 Application of Kruskal's algorithm. Selected edges are shown in bold.