

Note 13 Graph Algorithm II

Disjoint Set, MST, Single Source Shortest Path

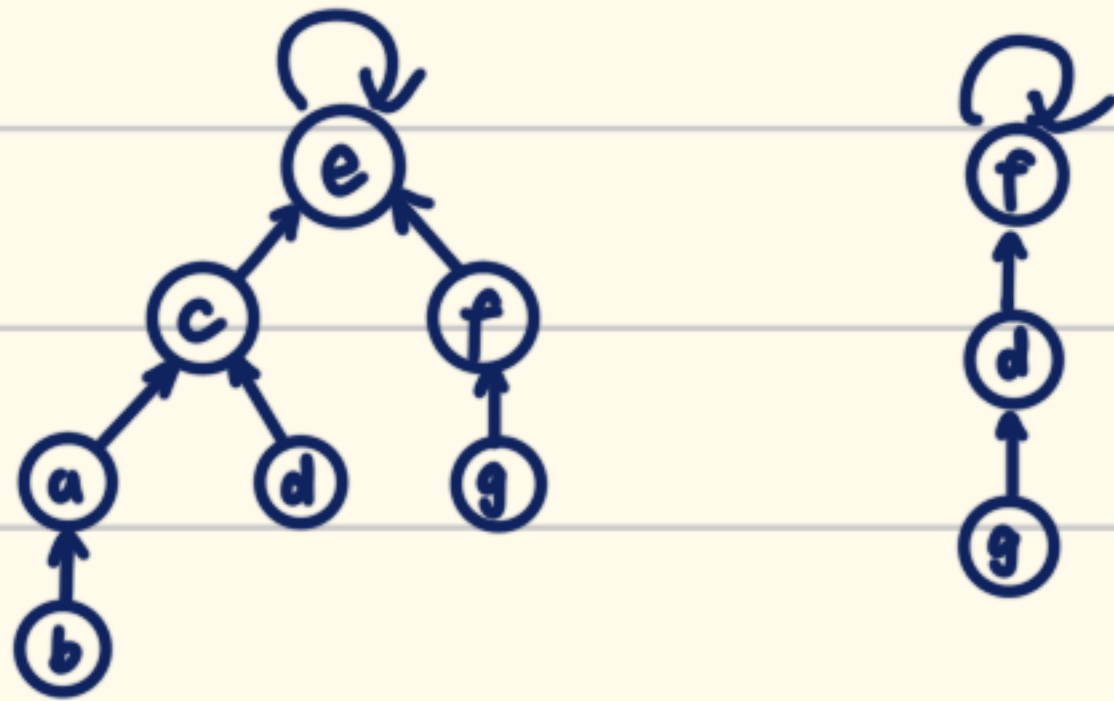
1. Disjoint Set 并查集

1. Basic Operations:

- ① **MAKE-SET(x)**: build a new set, only contains x.
- ② **UNION(x, y)**: union the sets that contain x and y (S_x and S_y) into a new set
- ③ **FIND-SET(x)**: return the pointer that symbolizes the set that contains x.

2. Disjoint Set Forests:

① Representation of a set



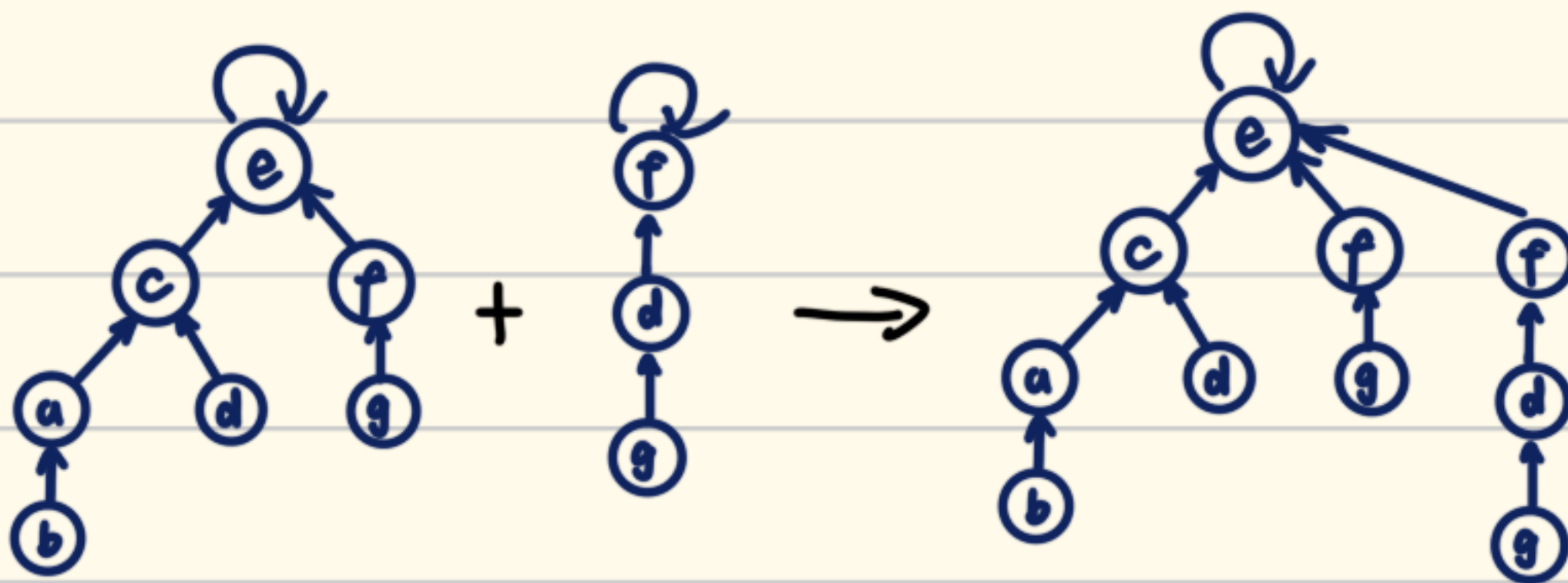
MAKE-SET(x)

1. $p[x] \leftarrow x$
2. $rank[x] \leftarrow 0$

- the **root** of each set represents the set. It's the father of itself.

② union by rank (in **UNION(x, y)**)

- method 1: attach the tree with fewer nodes to the other with more nodes.
- method 2: attach the tree shorter (smaller rank) to the other higher.



UNION(x, y)

1. **LINK(FIND-SET(x), FIND-SET(y))**

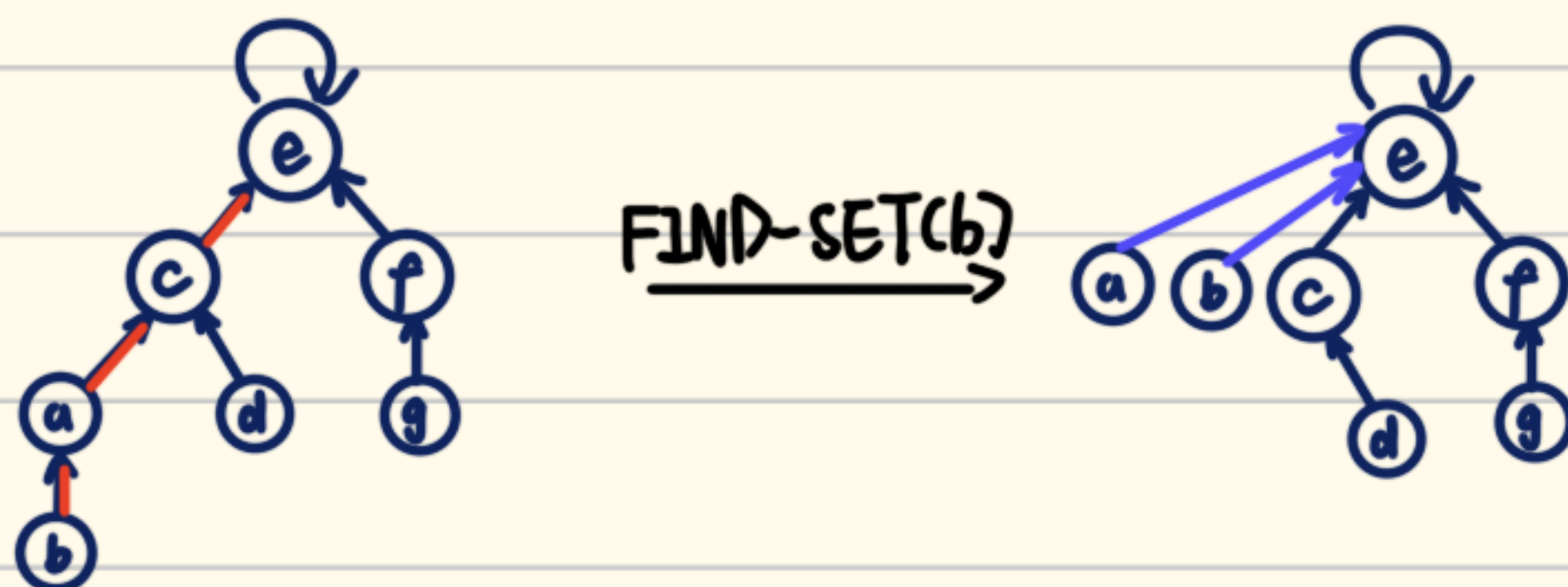
LINK(x, y)

1. **if** $rank[x] > rank[y]$
2. **then** $p[y] \leftarrow x$
3. **else** $p[x] \leftarrow y$
4. **if** $rank[x] = rank[y]$
5. **then** $rank[y] \leftarrow rank[y] + 1$

when equally high, update the height

③ path compression (in **FIND-SET(x)**)

When operating **FIND-SET(x)**, directly connect all nodes on the path from the node to the root to the root.



FIND-SET(x)

1. **if** $x \neq p[x]$
2. **then** $p[x] \leftarrow \text{FIND-SET}(p[x])$
3. **return** $p[x]$

compress the path when recursing back

3. Time Complexity Analysis

Using Amortized Analysis, we can get the time complexities of 3 operations above (When implementing set in "Disjoint Set Forest")

• MAKESET: $O(1)$

• FINDSET: $O(\alpha(N))$

• UNION: $O(\alpha(N))$

$$\alpha = \begin{cases} 0, & 0 \leq n \leq 2 \\ 1, & n = 3 \\ 2, & 4 \leq n \leq 7 \\ 3, & 8 \leq n \leq 2047 \\ 4, & 2047 \leq n \leq A_4(1) \gg 10^{30} \end{cases}$$

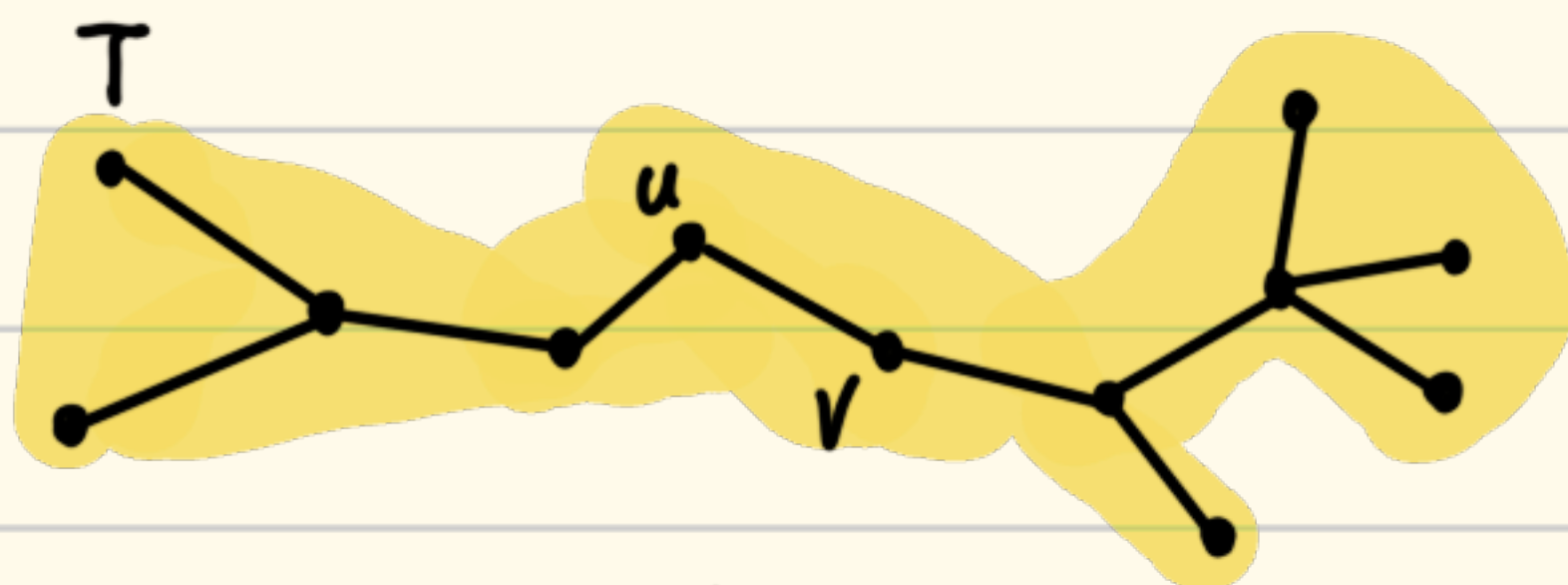
$$A_k(j) = \begin{cases} j+1 & \text{if } k=0 \\ A_{k-1}^{(j+1)}(j) & \text{if } k \geq 1 \end{cases}$$

11. Minimum Spanning Tree

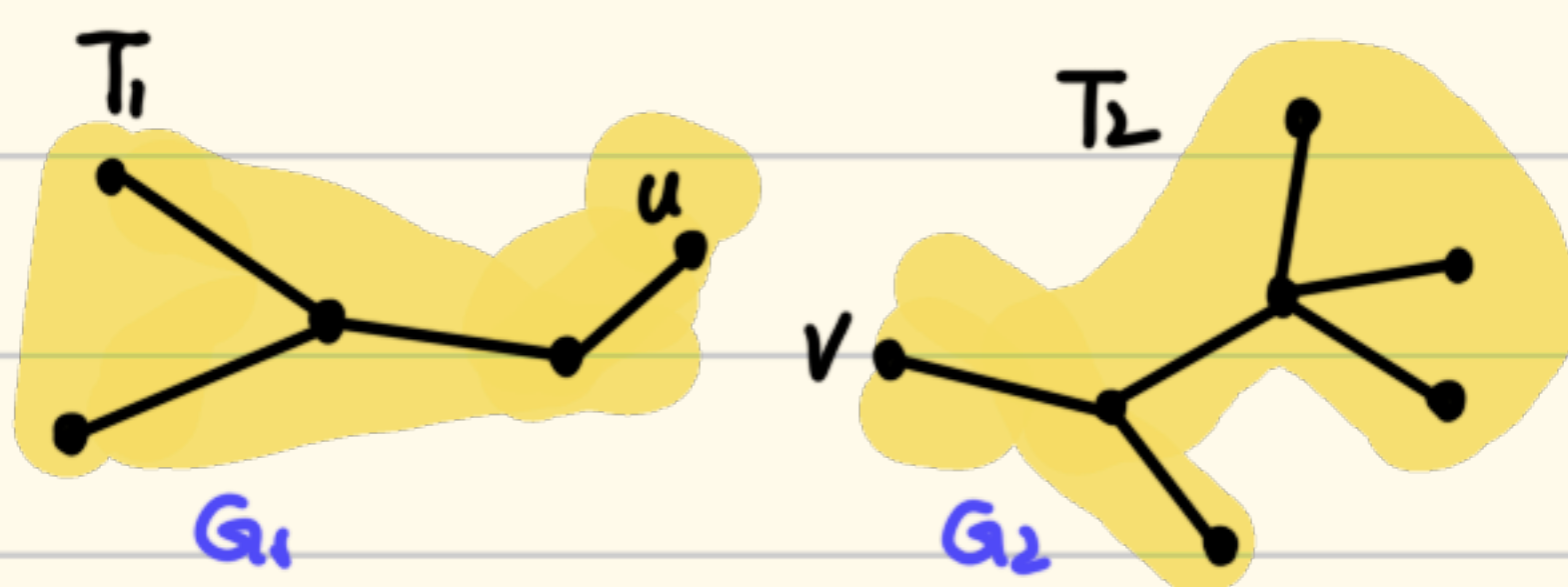
(1) Problem Analysis

1. Optimal Substructure (Idea of Dynamic Programming)

Minimum spanning tree T of $G(V, E)$



↓ Remove (u, v)



T is partitioned into subtrees T_1 & T_2

Let $\begin{cases} G_1 = (V_1, E_1) & \text{the subgraph of } G \text{ induced by the vertices of } T_1 \\ G_2 = (V_2, E_2) & \text{the subgraph of } G \text{ induced by the vertices of } T_2 \end{cases}$

• Theorem: T_1 is an MST of G_1

T_2 is an MST of G_2

• Proof: Since $w(T) = w(u, v) + w(T_1) + w(T_2)$

If T_1' were a lower-weight spanning tree than T_1 for G_1

then for $T' = \{(u, v)\} \cup T_1' \cup T_2$:

$$w(T') = w(u, v) + w(T_1') + w(T_2)$$

$$\leq w(u, v) + w(T_1) + w(T_2) = w(T)$$

This is not right. $\therefore T_1$ is MST of G_1 , T_2 is MST of G_2 .

子问题最优 } $\Rightarrow$ 可用动态规划
子问题重叠 }

→ A locally optimal choice is globally optimal.

2. Greedy Analysis (Idea of Greedy Algorithm)

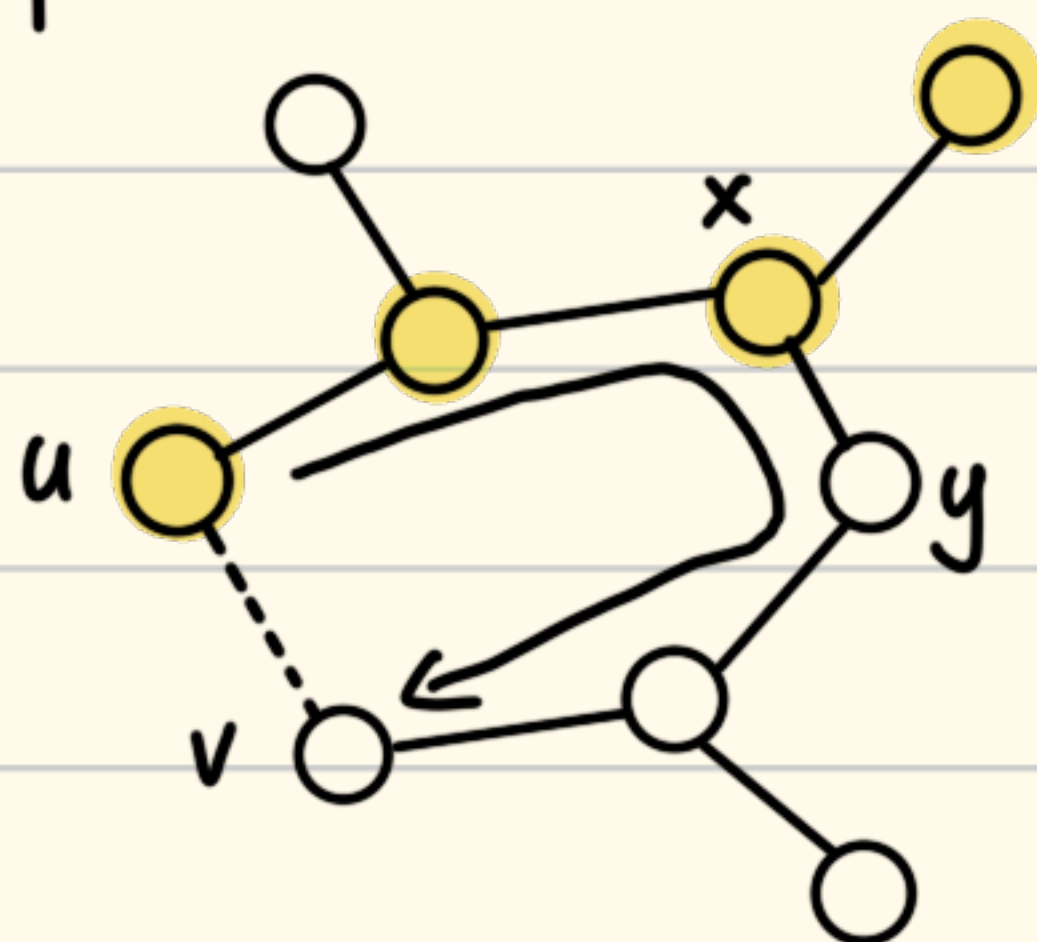
• Theorem: Let T be the MST of $G=(V, E)$, let $A \subseteq V$

Suppose that $(u, v) \in E$ is the least-weight edge connecting A to $V-A$

Then $(u, v) \in T$ (T is one of the MST if there're several)

• Proof:

● : $e \in A$ ○ : $e \in V-A$



假定所有MST不含 (u, v)

∴ u, v 分别在 A 与 $V-A$

∴ T 中必有另一边 (x, y) 横跨切割, $x \in A, y \in V-A$

$w(x, y) > w(u, v)$

将 (x, y) 删除, 增加 (u, v) , 构造新的生成树 T'

$T' = T - \{(x, y)\} \cup \{(u, v)\}$

$w(T') = w(T) - w(x, y) + w(u, v) < w(T)$

∴ T' 是最小生成树 ∴ $w(T) \leq w(T')$ ∴ 矛盾, 假设不成立

∴ $(u, v) \in$ one of the MST

(II). Kruskal Algorithm

1. 对所有边按照权重从小到大依次排序

每次找到权重最小且连接两个不同集合的边 (u, v) , 放入生成树

MST-KRUSKAL(G, w)

1. $A \leftarrow \emptyset$

2. for each vertex $v \in V[G]$

3. do MAKE-SET(v)

4. sort the edges of E into nondecreasing order by weight w .

5. for each edge $(u, v) \in E$, taken in nondecreasing order by weight.

6. do if FIND-SET(u) $\neq$ FIND-SET(v)

7. then $A \leftarrow A \cup \{(u, v)\}$

8. UNION(u, v)

9. return A

2. Time Complexity:

• Sort Edges in Line 4: $O(E \lg E)$

• Line 5-8: $O(V)$ 个 MAKESET, $O(E)$ 个 FIND-SET 和 UNION

$O((V+E) \lg(V))$

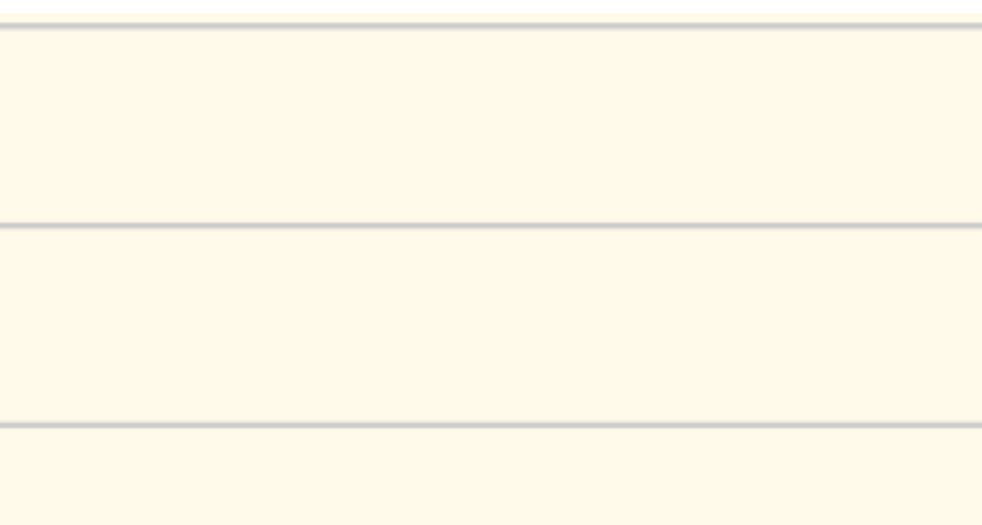
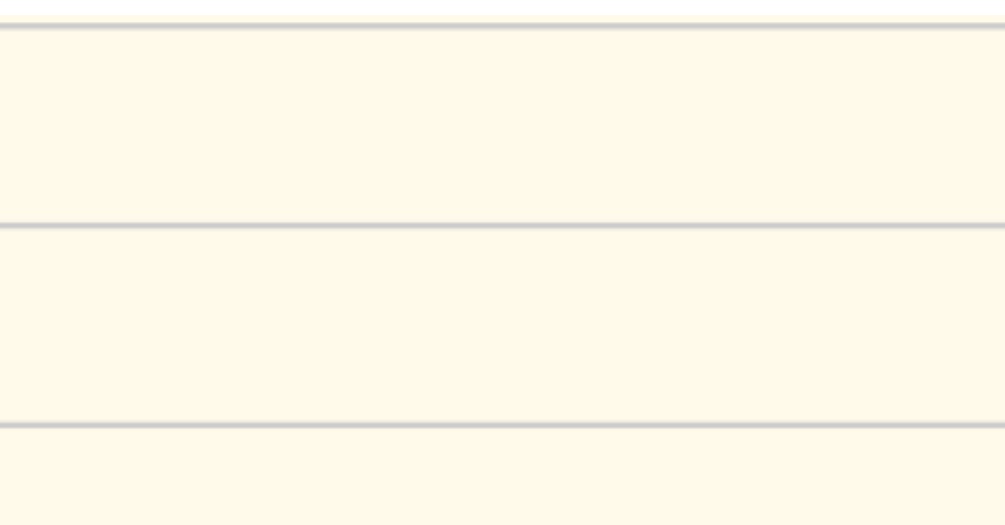
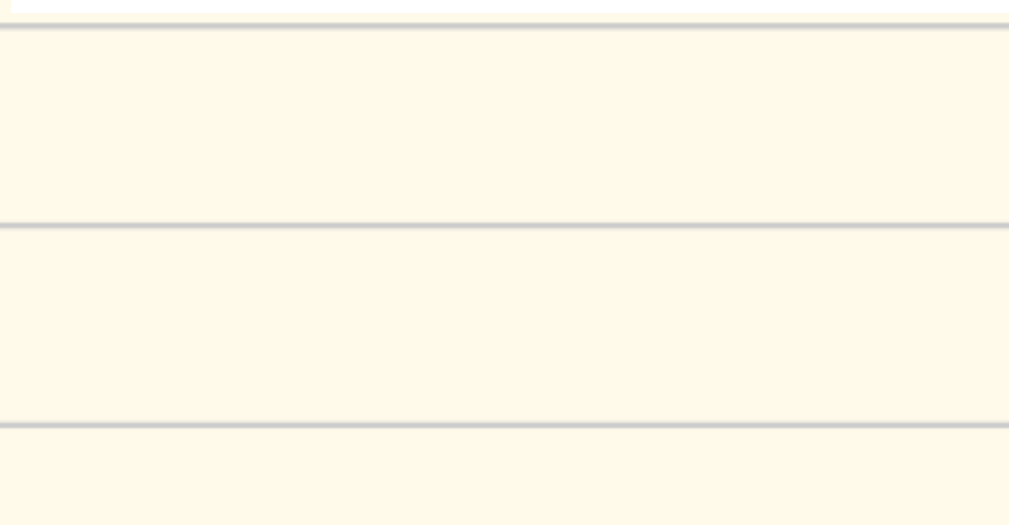
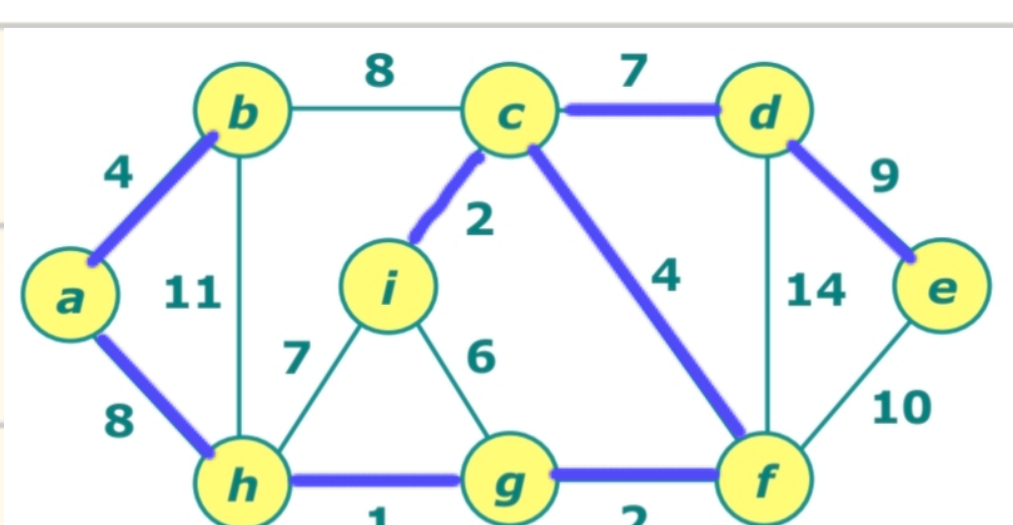
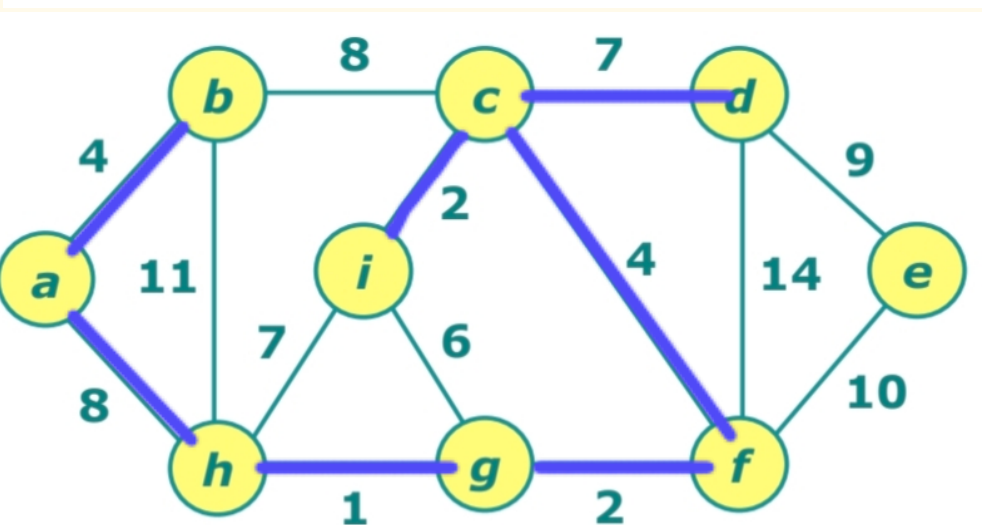
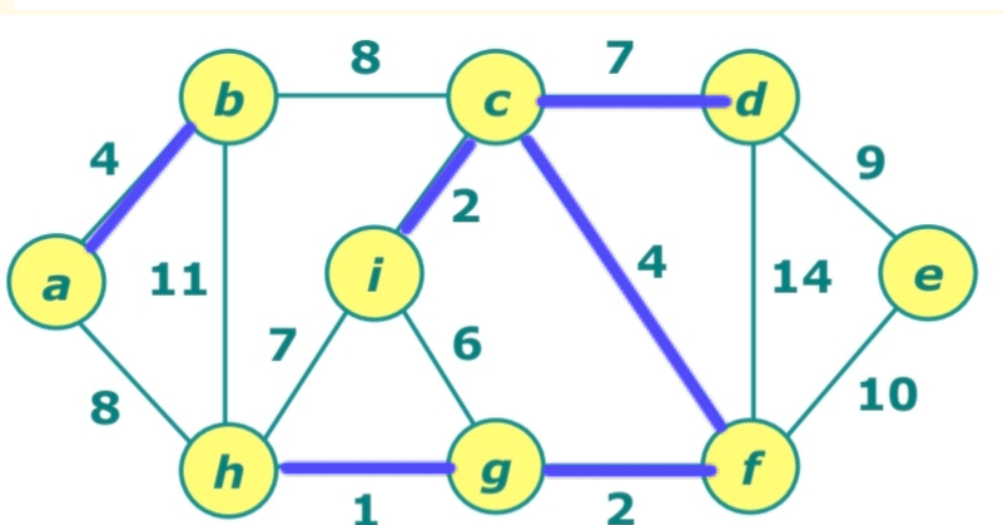
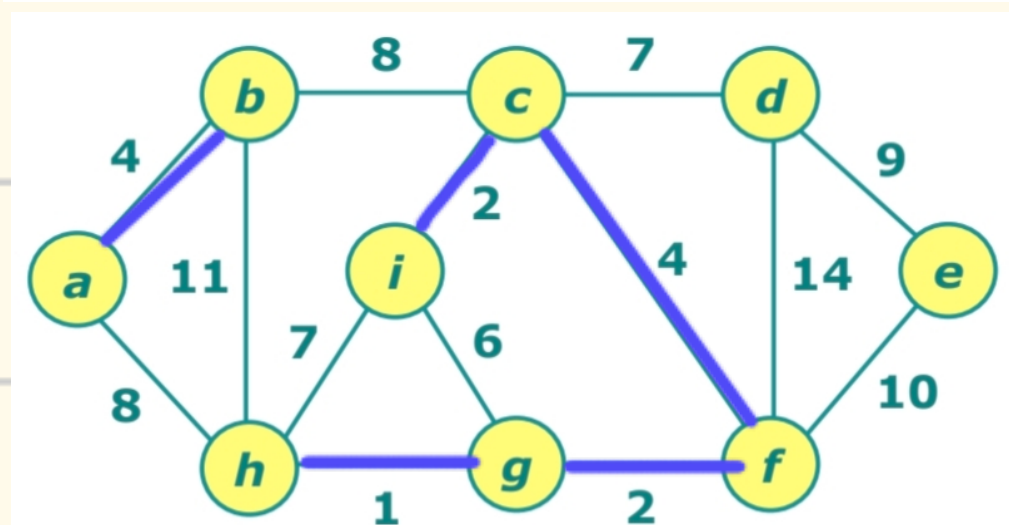
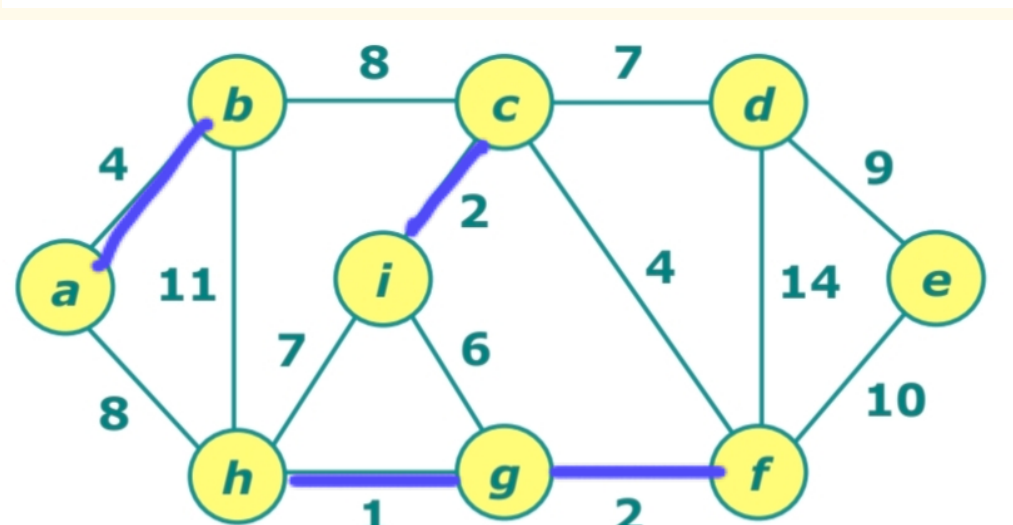
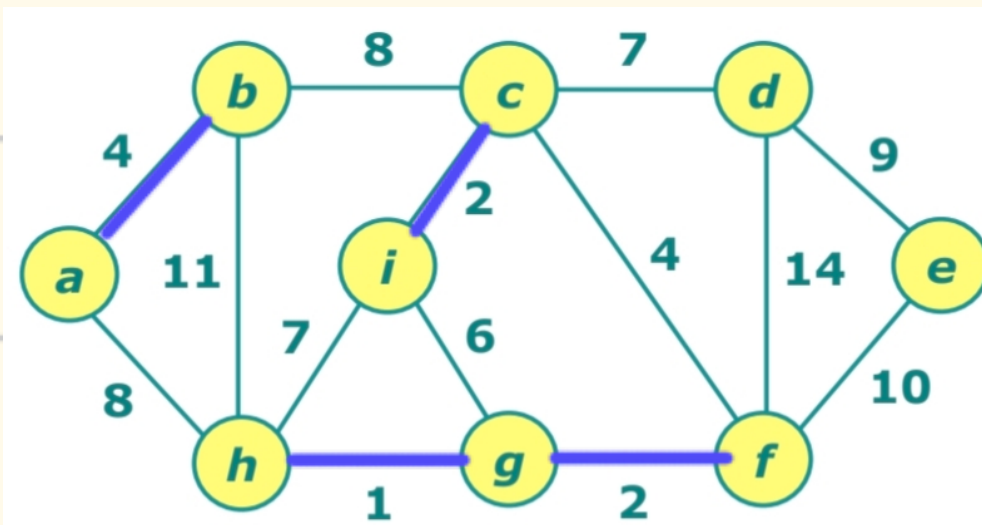
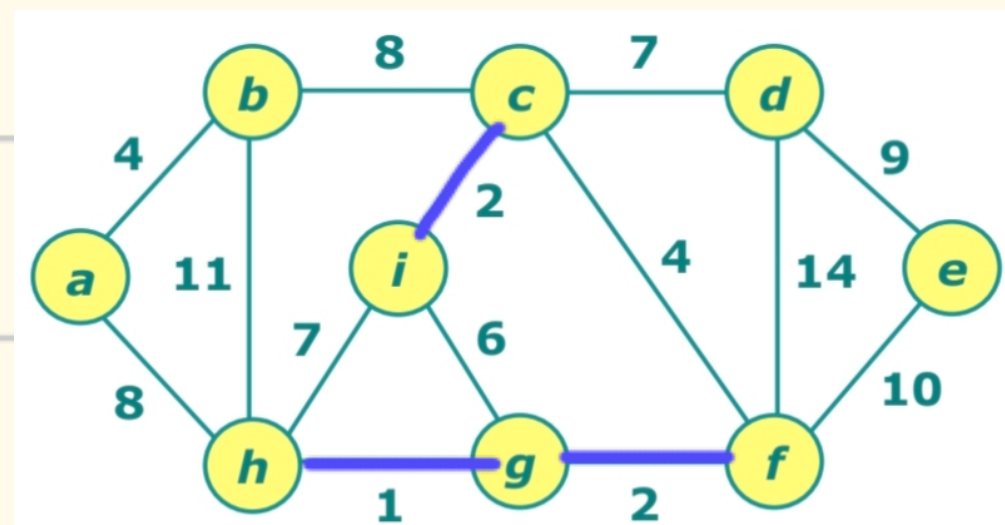
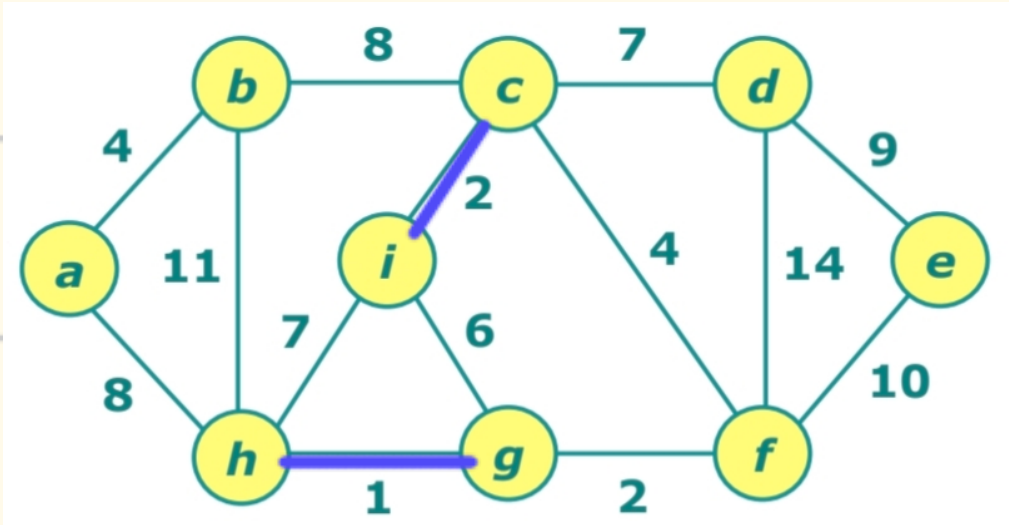
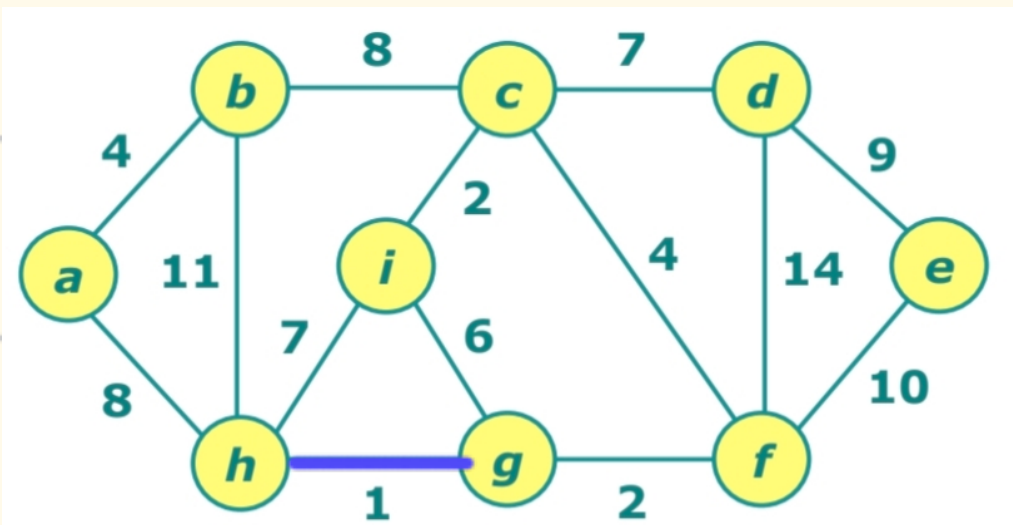
由于连通: $|V|-1 \leq |E| \leq |V|^2$

$$\Rightarrow O(\lg V) = O(\lg E), O(V) \leq O(E)$$

$$O((V+E) \lg(V)) \leq O((V+E) \lg E) \leq O(E \lg E) = O(E \lg V)$$

$$\Rightarrow \text{Time Complexity: } O(E \lg V)$$

3. Example



(III). Prim Algorithm

1. 集合A总构成一棵树，算法每次从连接A与 $\bar{A}$ 的所有边中，选择一条权重最小的边加入A中

Implementation Trick: Maintain $V-A$ as a priority queue Q with the

weight of the least weight edge connecting it to a vertex in A .

(类似Dijkstra实现的想法，在类似BFS的操作中不断更新)

MST-PRIM(G, w, r)

```

1 for each  $u \in G.V$ 
2    $u.key = \infty$ 
3    $u.\pi = NIL$ 
4  $r.key = 0$ 
5  $Q = G.V$ 
6 while  $Q \neq \emptyset$ 
7    $u = \text{EXTRACT-MIN}(Q)$ 
8   for each  $v \in G.Adj[u]$ 
9     if  $v \in Q$  and  $w(u, v) < v.key$ 
10       $v.\pi = u$ 
11       $v.key = w(u, v)$ 

```

→ least weight edge connecting to A

→ 前继节点

→ update the weight and predecessor

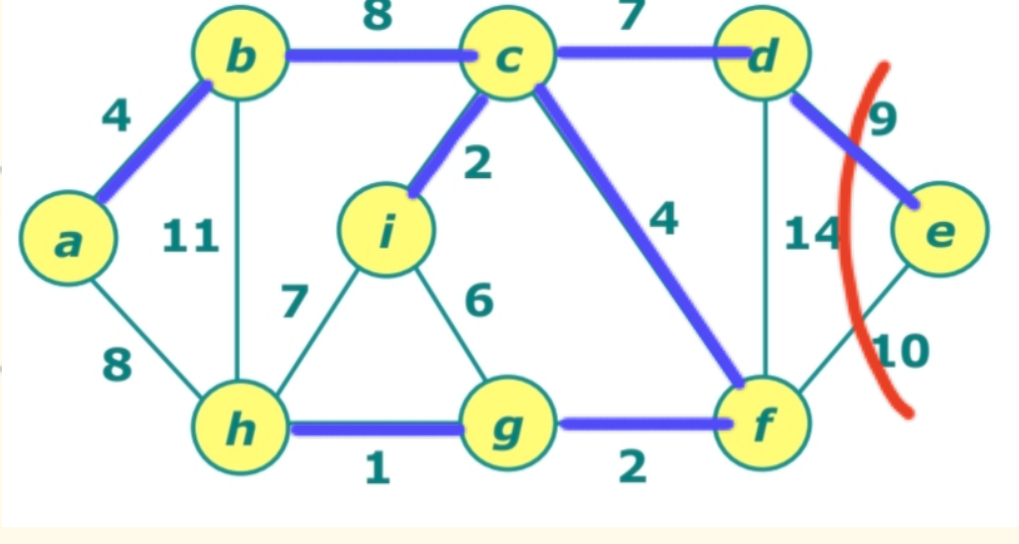
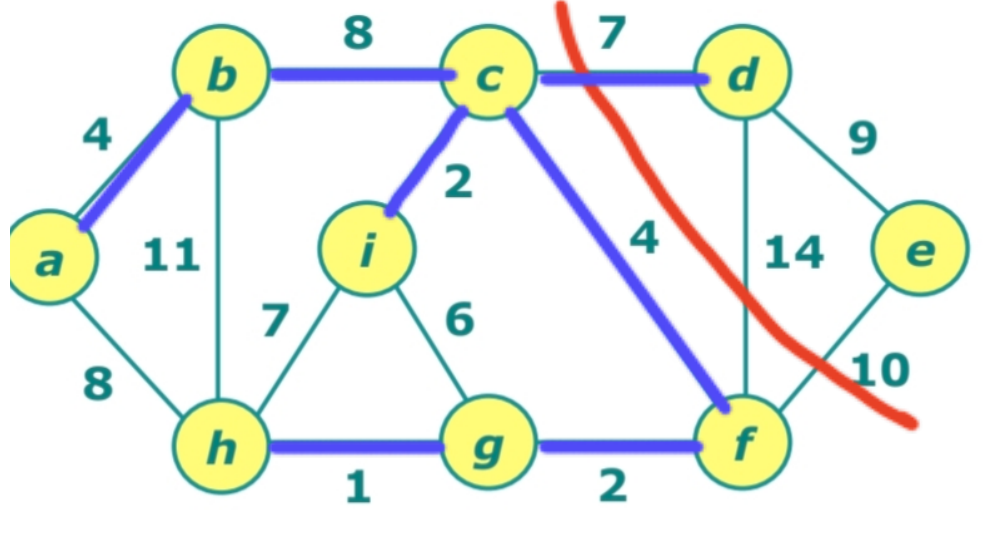
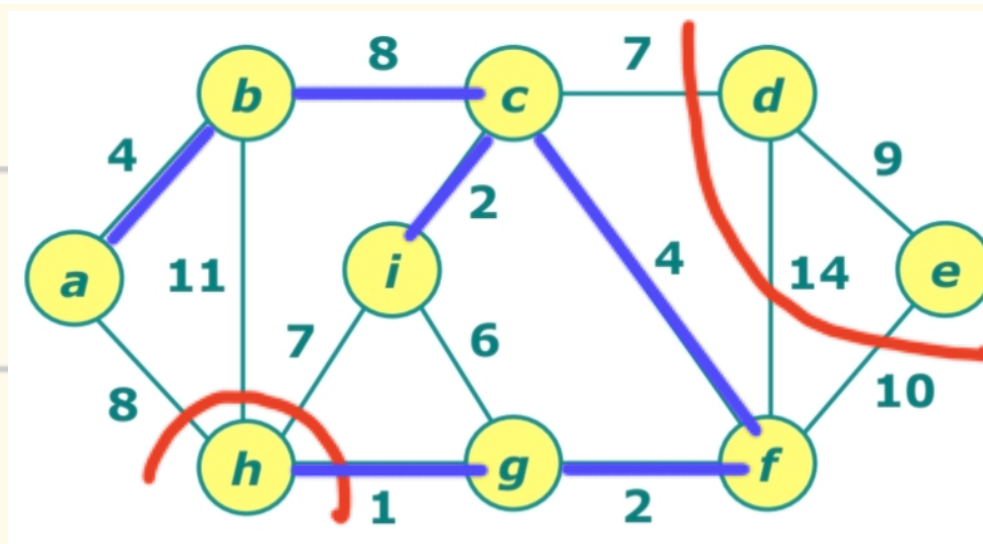
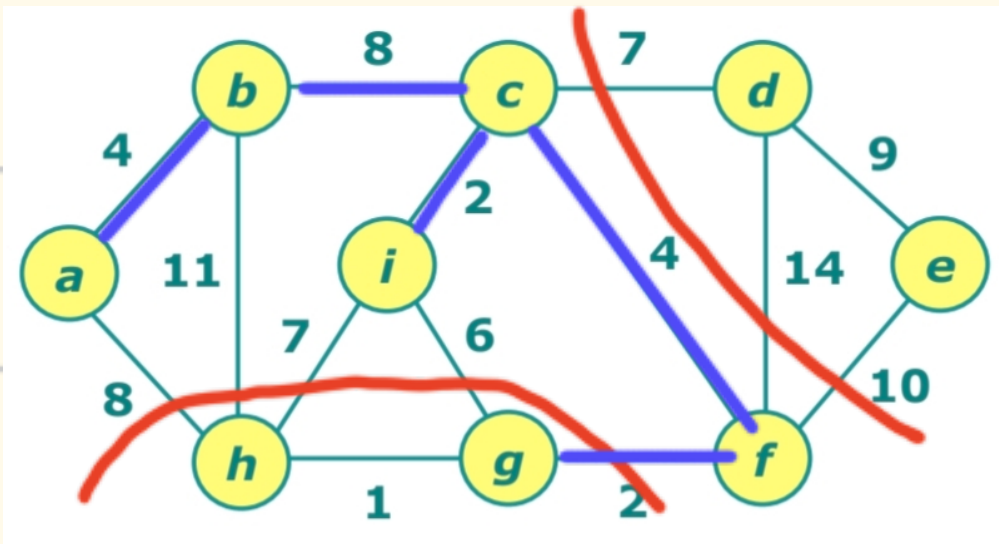
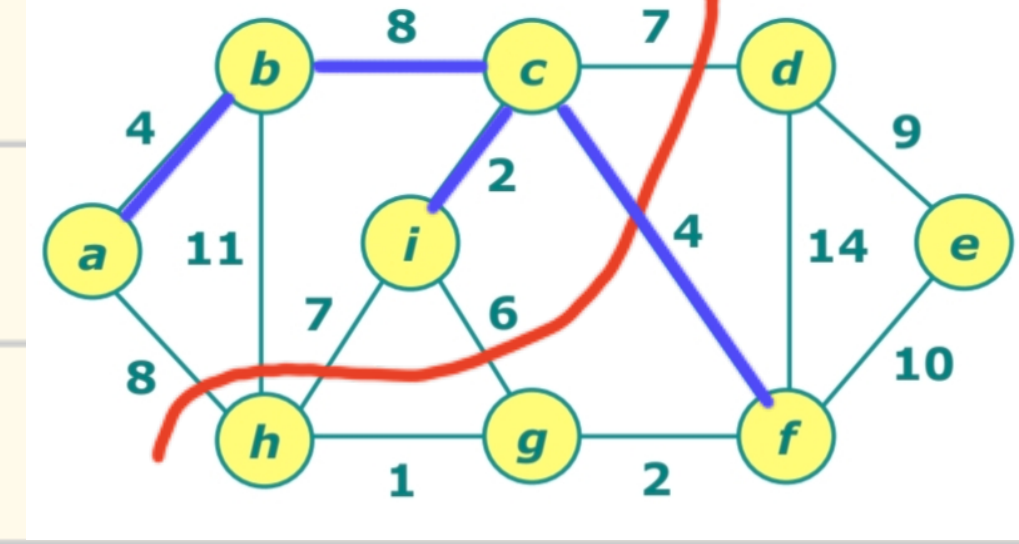
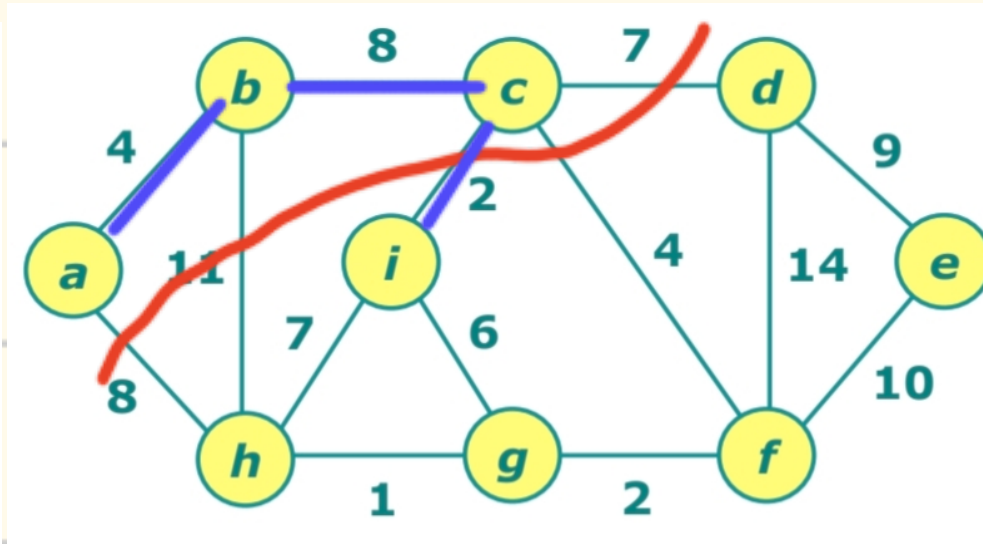
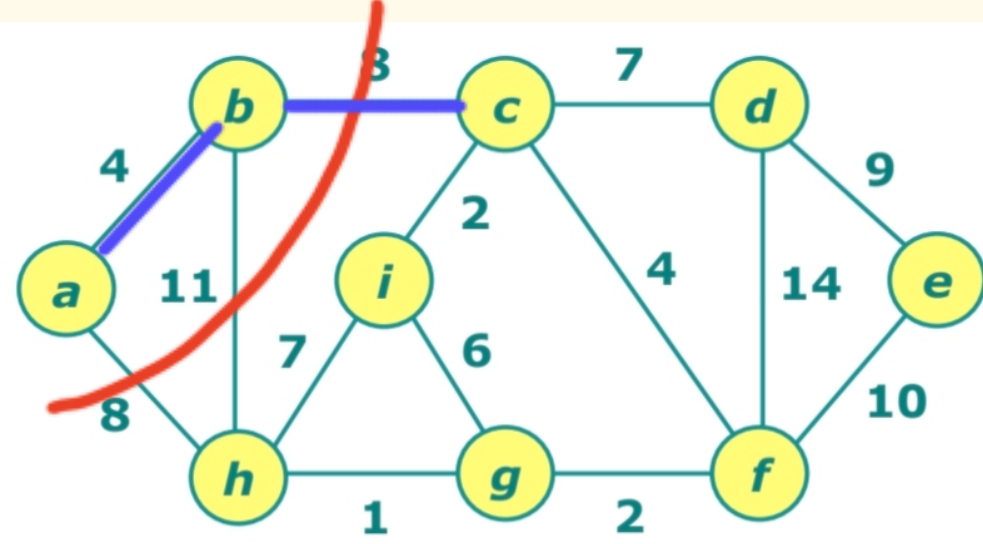
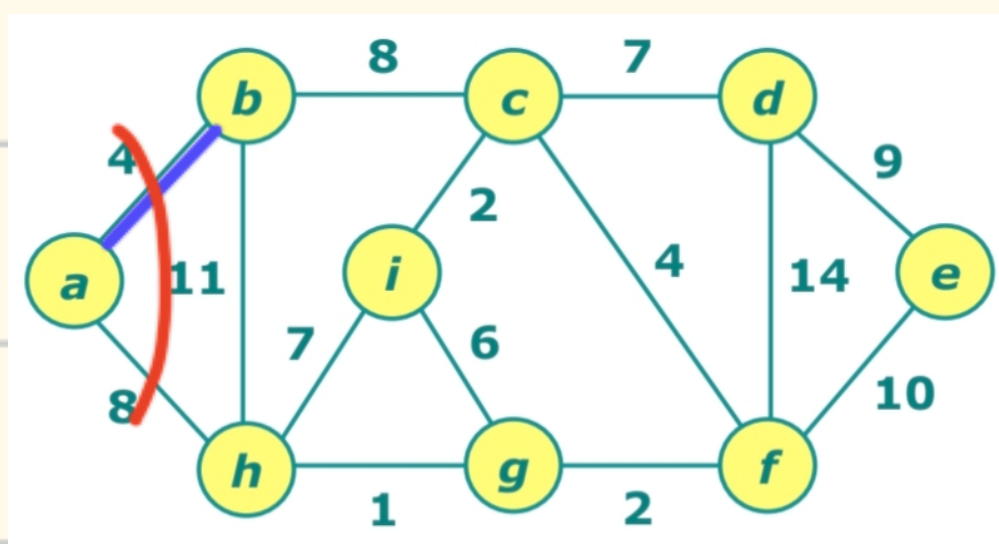
2. Time Complexity

Line 6-7: Extract-Min: $O(V \lg V)$ (each pop of a heap is $O(\lg V)$)

E 次边，可能有 decrease-key 操作 ($O(E \lg V)$)

$$\Rightarrow O(V \lg V + E \lg V) = O(E \lg V)$$

3. Example



II. Single Source Shortest Paths

(I) Problem Analysis :

- Dynamic Programming:

最短路径中的一部分也是从其出发点至终点的最短路径

- Greedy:

可以每次选 $V-S$ 中最近/最轻的结点加入

(II) Dijkstra's algorithm

1. Algorithm

- (1) Maintain a set S of vertices whose shortest path distances from s are known
- (2) At each step add to S the vertex $v \in V-S$ whose distance estimate from S is minimal
- (3) Update the distance estimates of vertices adjacent to v .

The idea of Dijkstra is similar to Prim, but kind of different

DIJKSTRA(G, w, s)

```

1. for each vertex  $v \in V[G]$ 
2.   do  $d[v] \leftarrow \infty$ 
3.    $\pi(v) \leftarrow \text{NIL}$ 
4.  $d[s] \leftarrow 0$ 
5.  $S \leftarrow \emptyset$ 
6.  $Q \leftarrow V[G]$ 
7. while  $Q \neq \emptyset$ 
8.   do  $u \leftarrow \text{EXTRACT-MIN}(Q)$ 
9.    $S \leftarrow S \cup \{u\}$ 
10.  for each vertex  $v \in \text{Adj}[u]$ 
11.    do if  $d[v] > d[u] + w(u, v)$ 
12.       then  $d[v] \leftarrow d[u] + w(u, v)$ 
13.           $\pi(v) \leftarrow u$ 

```

Relaxation step.

Implicit DECREASE-KEY.

2. Time Complexity

从 fringe 里面 extract-min 了 V 次, 每次 $O(\lg V) \Rightarrow O(V \lg V)$

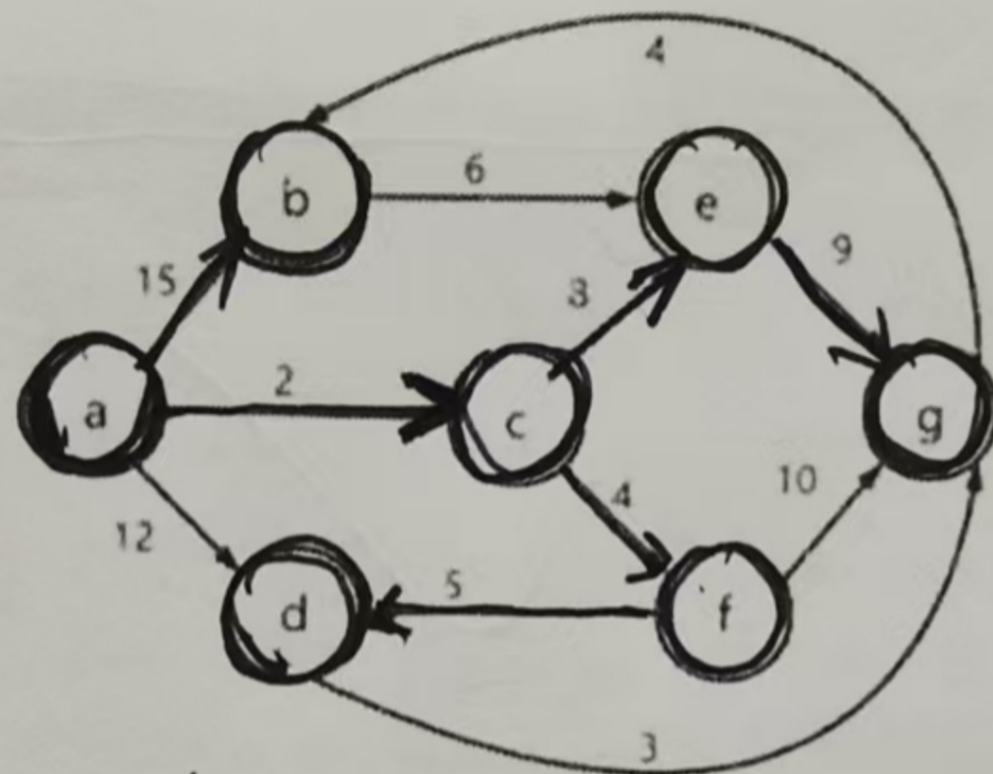
E 条边, 每次 relax 时可能 decrease key, 每次 $O(\lg V) \Rightarrow O(E \lg V)$

$\therefore O(V) \leq O(E)$ (假设是连通图), $O(\lg V) = O(\lg E)$

$\therefore$ Time complexity: $O((V+E) \lg V) = O(E \lg V)$

3. Example:

4. 写出用 Dijkstra 算法求的的下图 G 中顶点 a 到其他各顶点的最短路径, 并给出执行过程表:



fringe: $a:0$

visited: $\{a\}$

↓

fringe: $c:2 \mid d:12 \mid b:15$

visited: $\{a:0\}$

↓

fringe: $e:5 \mid f:6 \mid d:12 \mid b:15$

visited: $\{a:0, c:2\}$

↓

fringe: $f:6 \mid d:12 \mid g:14 \mid b:15$

visited: $\{a:0, c:2, e:5\}$

fringe: $d:11 \mid g:14 \mid b:15$

visited: $\{a:0, c:2, e:5, f:6\}$

fringe:

$g:14 \mid b:15$

visited: $\{a:0, c:2, e:5, f:6, d:11\}$

fringe:

$b:15$

visited: $\{a:0, c:2, e:5, f:6, d:11, g:14\}$

fringe: $\square$

visited:

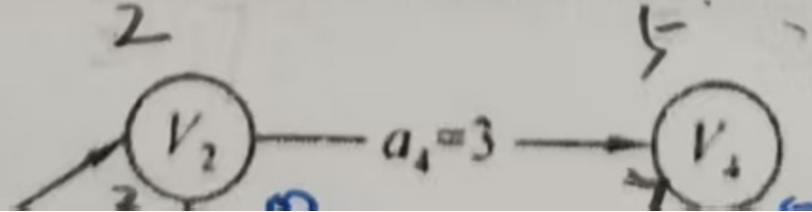
$\{a:0, c:2, e:5, f:6, d:11, g:14, b:15\}$

5. 下图所示为一个用 AOE 网表示的工程, 试回答:

Activity On Edges

(1) 完成此工程至少需要多少时间?

(2) 那些活动加速可以缩短完成工程所需时间?



4. Condition:

When using Dijkstra, there shouldn't be negative-weighted edges.

(III) Shortest Paths in Weighted DAG

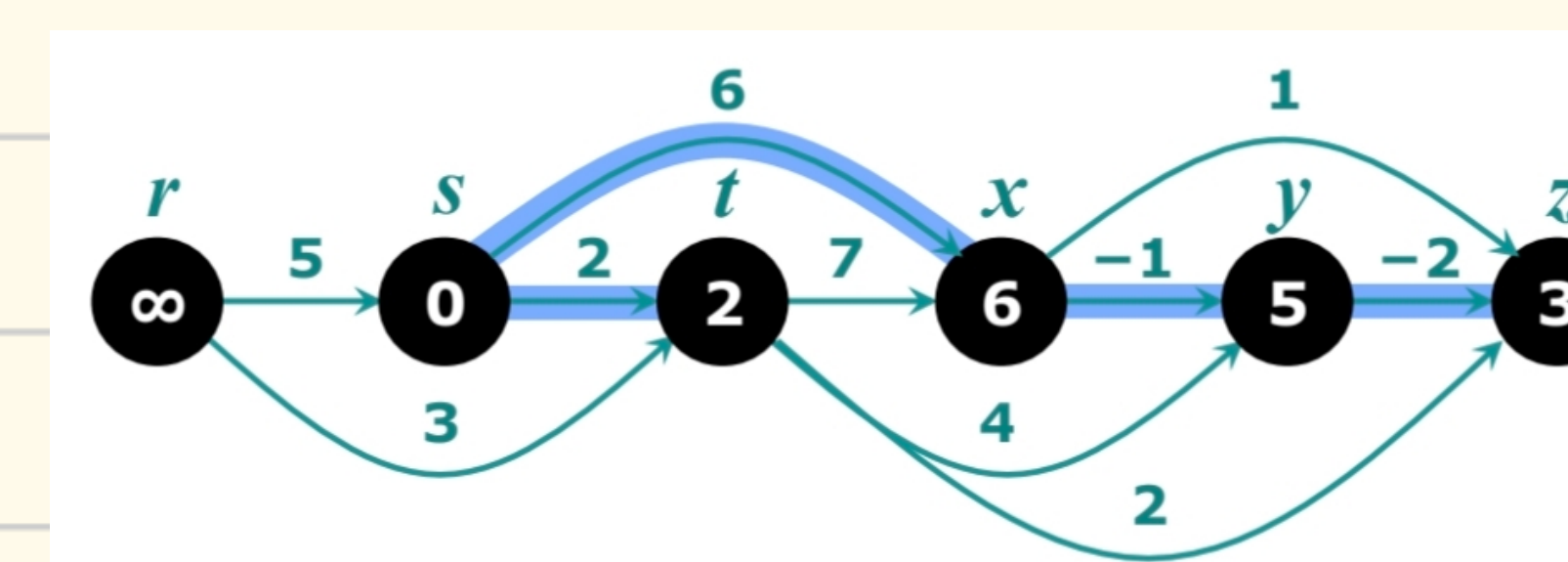
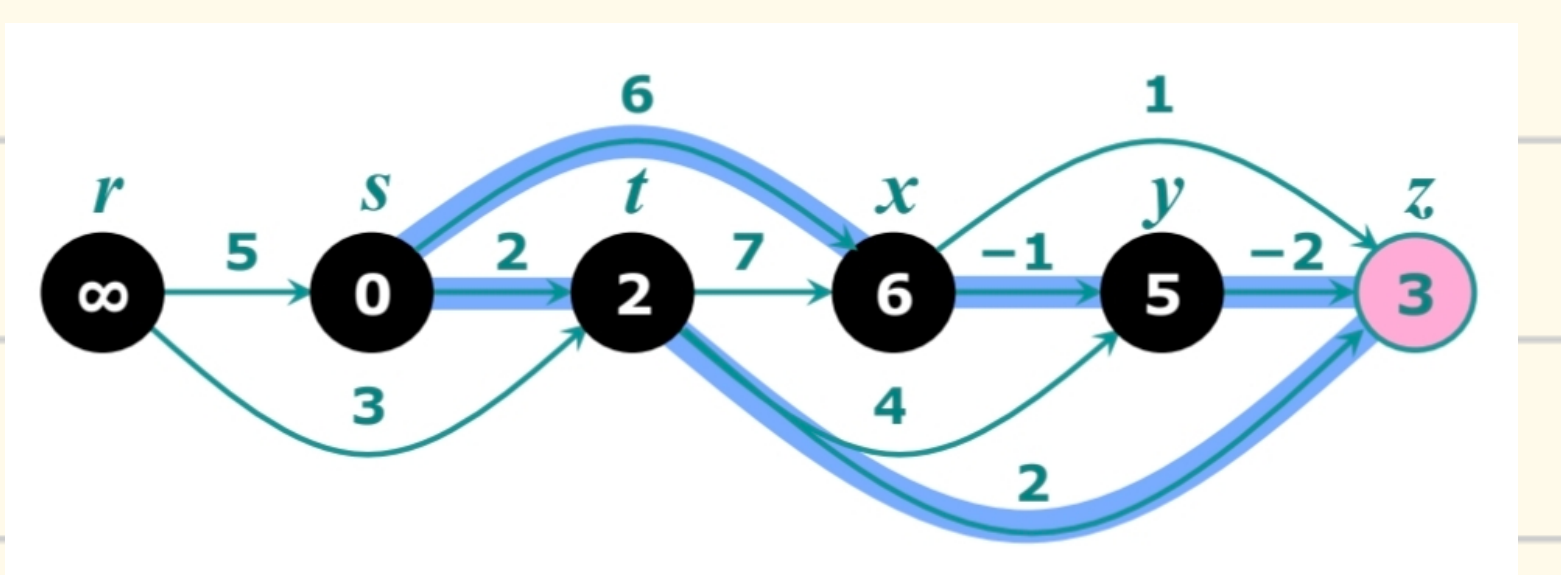
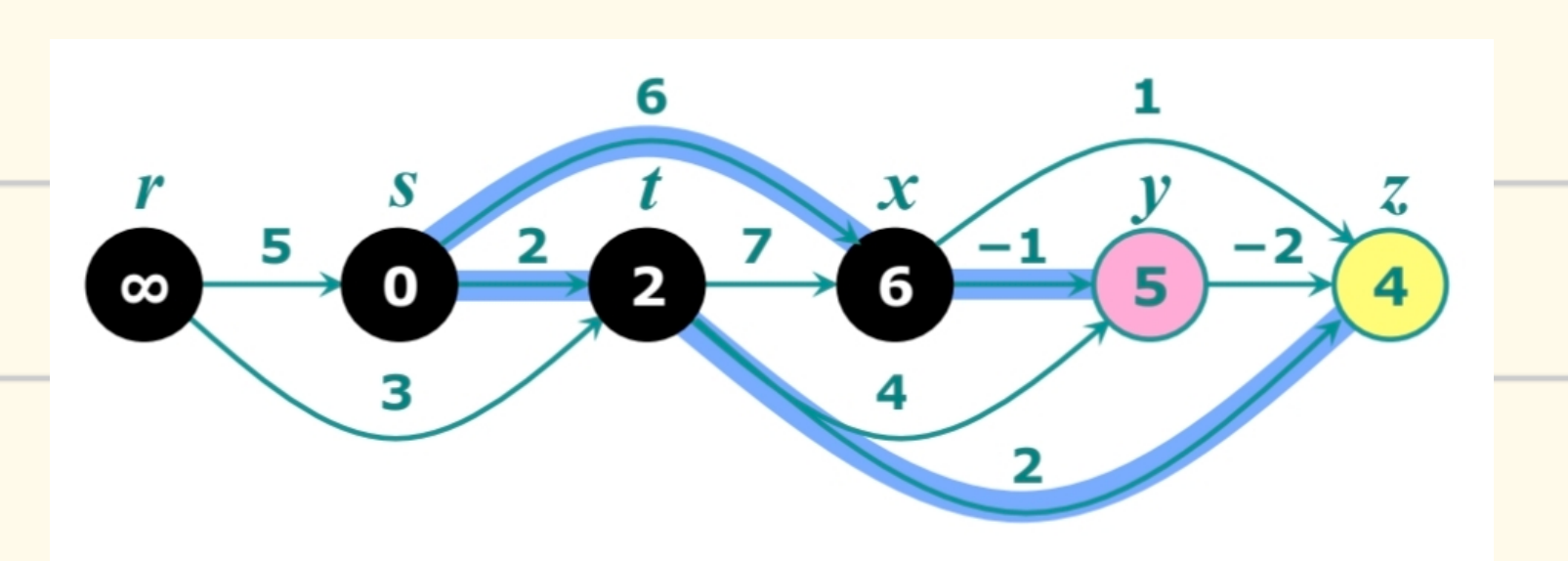
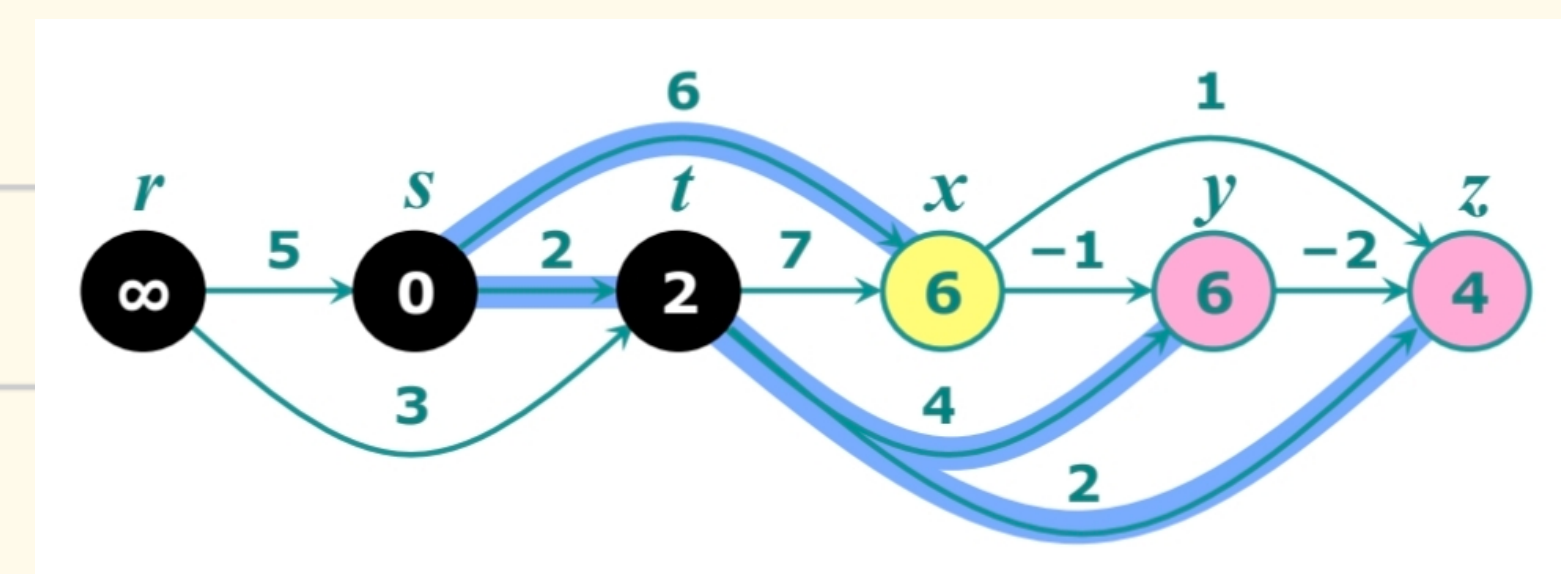
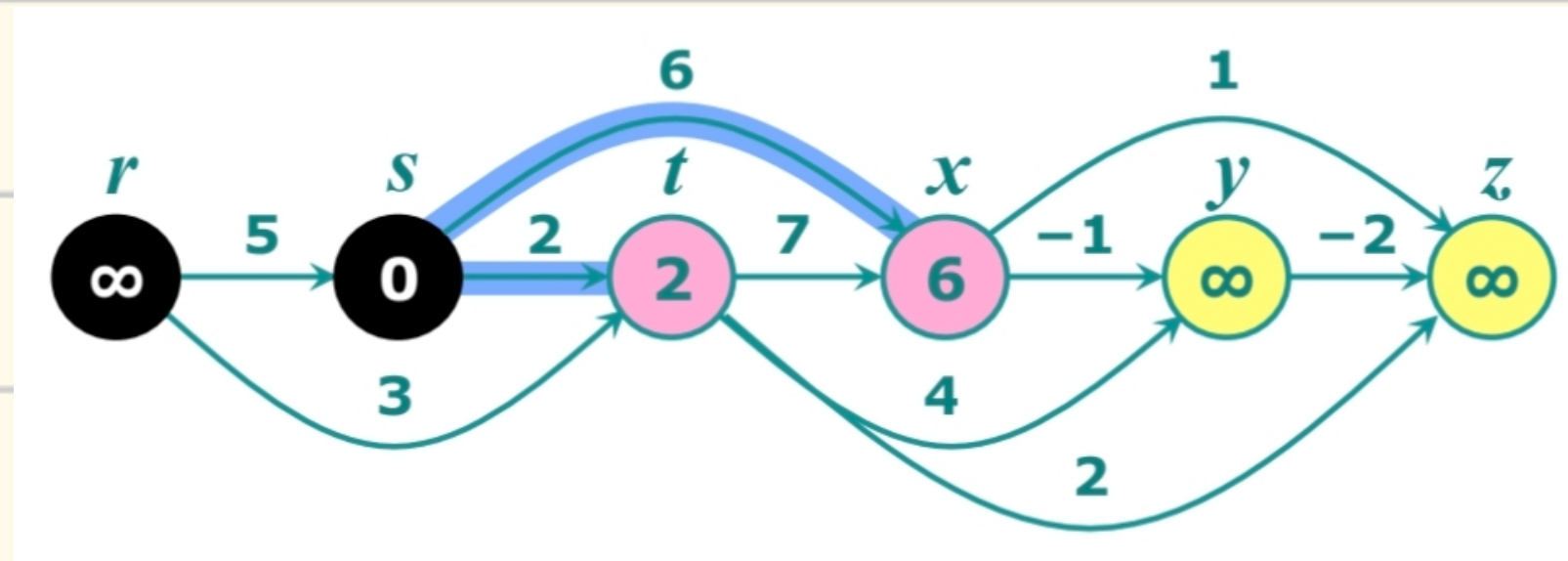
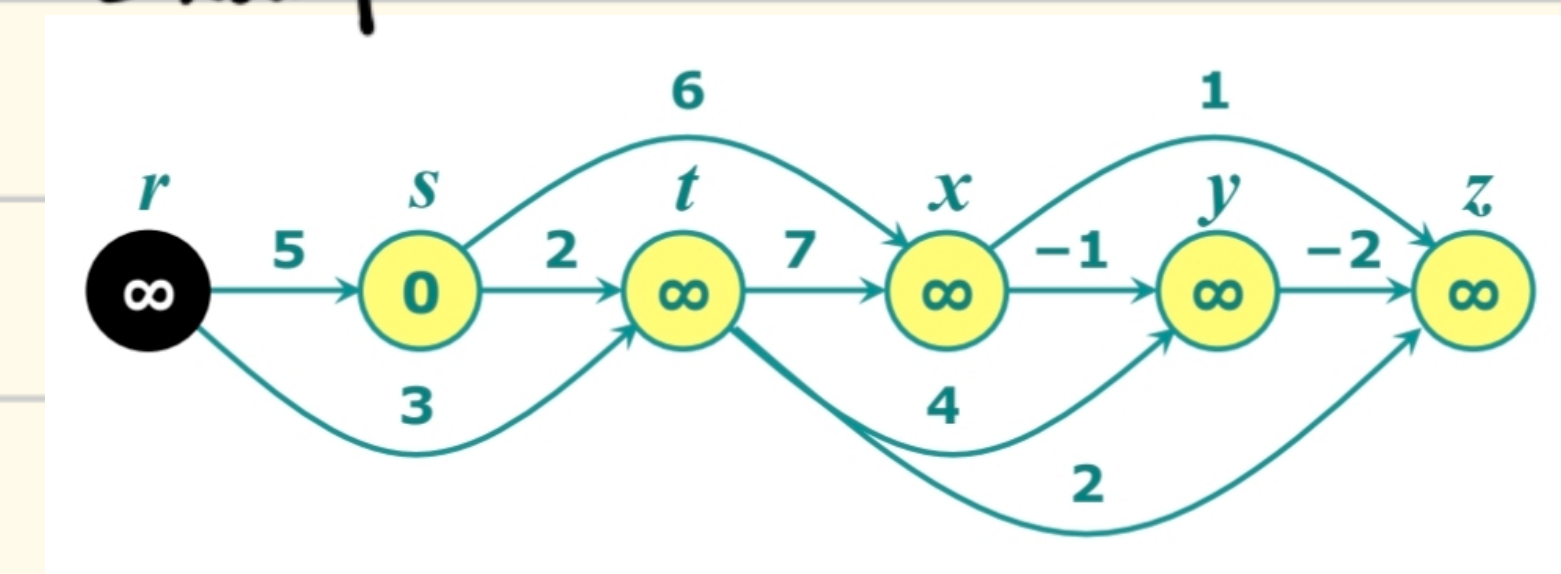
1. Algorithm

DAG-SHORTEST-PATH(G, w, s)

1. Topologically sort the vertices of G
2. for each vertex $v \in V[G]$
3. do $d[v] \leftarrow \infty$
4. $\pi(v) \leftarrow \text{NIL}$
5. $d[s] \leftarrow 0$
6. for each vertex u , taken in topologically sorted order
7. do for each vertex $v \in \text{Adj}[u]$
8. do if $d[v] > d[u] + w(u, v)$
9. then $d[v] \leftarrow d[u] + w(u, v)$
10. $\pi(v) \leftarrow u$

按拓扑排序顺序进行 relax, 无需再维护一个 fringe

2. Example:



(IV.) Bellman - Ford Algorithm

1. Algorithm

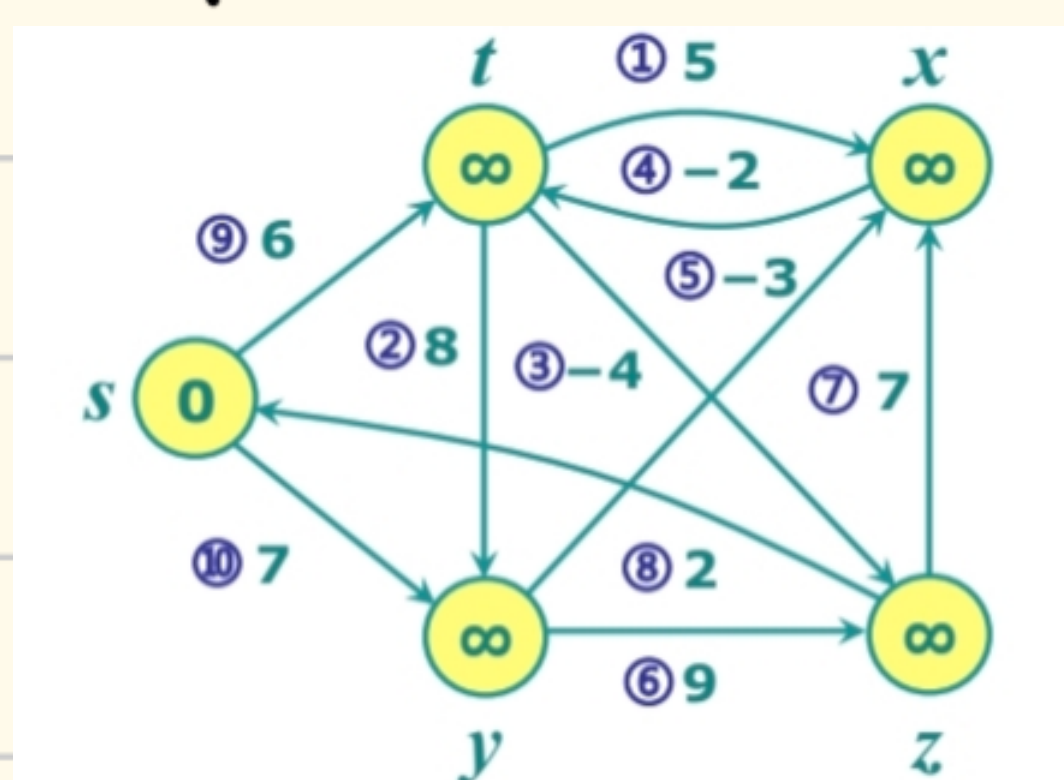
BELLMAN-FORD(G, w, s)

1. **for** each vertex $v \in V[G]$
2. **do** $d[v] \leftarrow \infty$
3. $\pi(v) \leftarrow \text{NIL}$
4. $d[s] \leftarrow 0$
5. **for** $i \leftarrow 1$ **to** $|V[G]| - 1$
6. **do for** each edge $(u, v) \in E[G]$
7. **do if** $d[v] > d[u] + w(u, v)$
8. **then** $d[v] \leftarrow d[u] + w(u, v)$
9. $\pi(v) \leftarrow u$
10. **for** each edge $(u, v) \in E[G]$
11. **do if** $d[v] > d[u] + w(u, v)$
12. **then return** FALSE
13. **return** TRUE

由于最短路径一定包括不多于 $|V|-1$ 条边, 故只要对每条边做 $|V|-1$ 次 relaxation 就一定能找到最短路径 (每次都对所有边松弛)

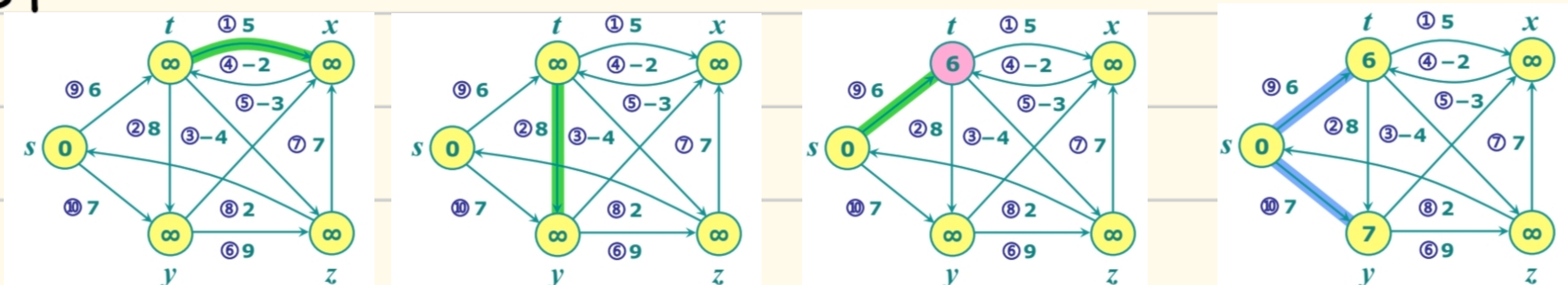
2. Time Complexity: $O(V^2E)$

3. Example.

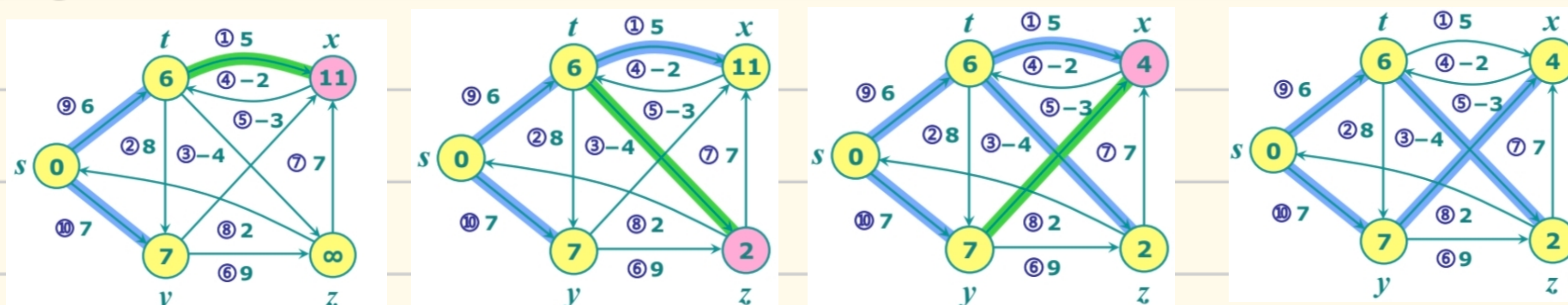


Order of edge relaxation.

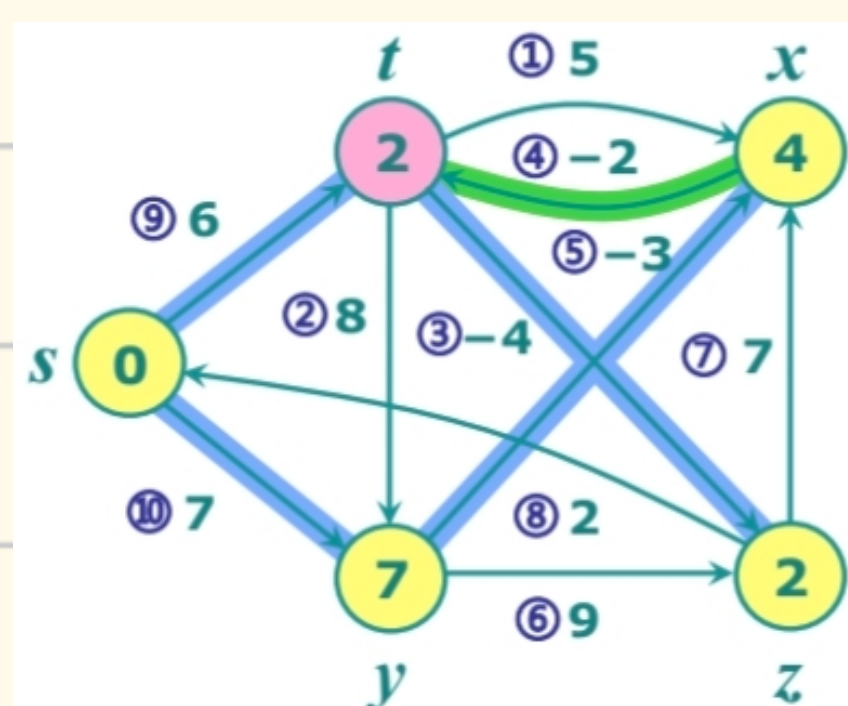
Pass 1:



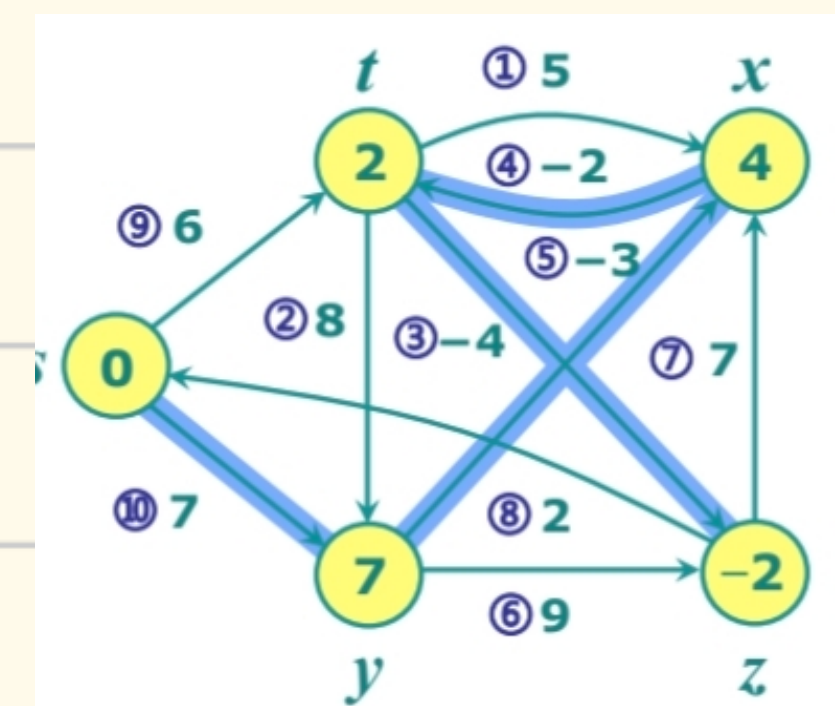
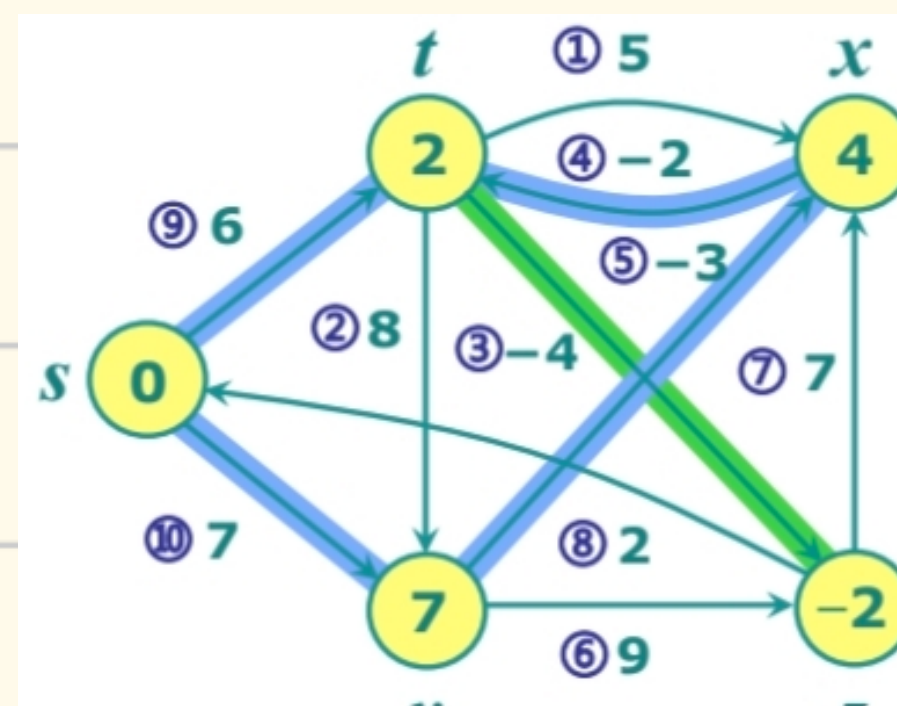
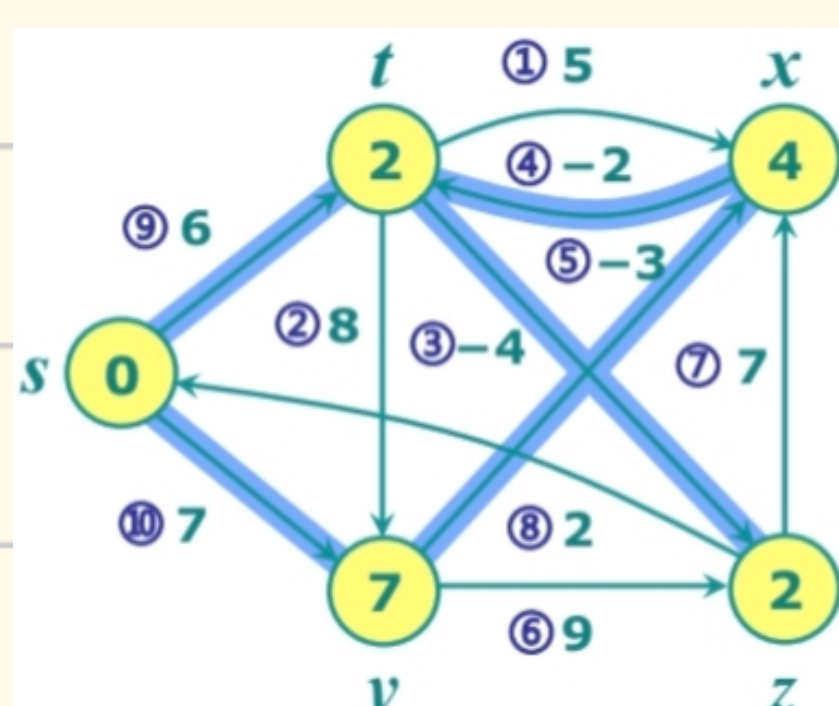
Pass 2:



Pass 3:



Pass 4:



Algorithms	Negative-Weighted Edges	Cycle	Negative-Weighted Cycle	Time Complexity
Dijkstra	X	✓	X	$O(E \lg V)$
A*	X	✓	X	$O(E \lg V)$
Dag Shortest Path	✓	X	X	$O(V+E)$
Bellman-Ford	✓	✓	X	$O(VE)$