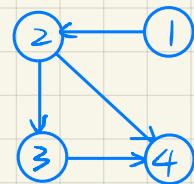


# Lecture 7 Graph I



Def:  $G = (V, E)$   $V$ : set of vertex  $|V|$ : size of  $V$

$E$ : set of edge  $|E|$ : size of  $E$

e.g.  $V = \{1, 2, 3, 4\}$   $E = \{(1,2), (1,3), (2,3), (3,4)\}$

Adjacency list  $\text{Adj}[u] = \{v : (u,v) \in E\}$  e.g. 1: 

2
---

 3: 

4
---

  
2: 

3	4
---	---

 4: 

--

  
Storage space:  $O(|V| + |E|)$

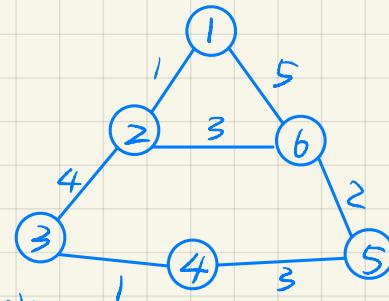
Adjacency Matrix  $a_{ij} = 1$  if  $(i,j) \in E$   
 $= 0$  otherwise  
 Storage space:  $O(|V|^2)$

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

## Edge Direction

directed graph edge  $(u,v)$  is an arrow

undirected graph edge  $(u,v)$  is a line.



## Edge Weight

$w(u,v)$ .  
 Store in adjacency list

Vertex: weight		
1:	2: 1	6: 5
2:	1: 1	3: 4
3:	2: 4	4: 1

4:	3: 1	5: 3
5:	4: 3	6: 2
6:	1: 5	2: 3

## Loop and multiedges

\* simple graph: no loop no edge

## Undirected graph terms

neighbor: vertex adjacent

neighborhood  $N(v)$  set of all neighbors

Degree of vertex  $v$   $\text{Deg}(v)$  number of edge connected to  $v$ .

Theorem 1.  $\sum_{v \in V} \text{deg}(v) = 2|E|$

Theorem 2.  $G$  has even number of odd-degree vertices

# Directed graph terms

edge  $(u, v)$  initial vertex  $u$   
end vertex  $v$

↓ adjacent to ↑ adjacent from

Degree      in-degree of  $v$        $\deg^-(v)$   
                out-degree of  $v$        $\deg^+(v)$

$$\sum_{v \in V} \deg^-(v) = \sum_{v \in V} \deg^+(v)$$

## Subgraph

Add/remove vertices/edge of graph

## Special graph

Complete (each pair one edge)      cycle       $d$ -dimensional cubes (bit string)

## Bipartite graph

vertex set divided into 2 disjoint sets

## Graph Isomorphism

$a, b$  adjacent in  $G_1 \Leftrightarrow F(a), F(b)$  adjacent in  $G_2$

\* test  
 1. define function  $F$  in  $G_2$       \* same adjacency matrix  
 2. check each edges

\* not isomorphic: different no. of vertices/edge  
not corresponding degree

## Connectivity.

path:  $x_0 \rightarrow x_n$       if  $x_0 = x_n$ , path = cycle

Connected graph      connected component

Cut vertex, cut edge      disconnected

Vertex cut: subset  $V'$ : removal from connected graph make graph disconnected.

Vertex connectivity: minimum size of vertex cut

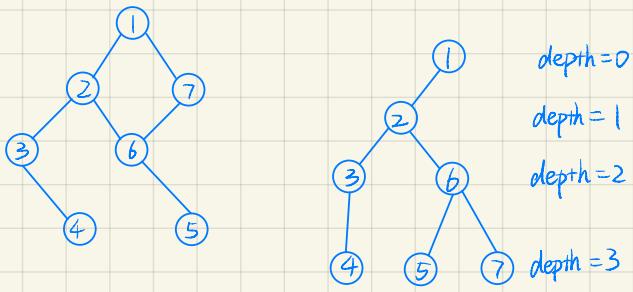
Graph Traversal      Start from source vertex  $s$

visit all vertices of graph in certain order  
produce search tree

Operation	The resulting vertex set	The resulting edge set
Add an edge $e$	$V$	$E \cup \{e\}$
Remove an edge $e$	$V$	$E - \{e\}$
Add a vertex $v$	$V \cup \{v\}$	$E$
Remove a vertex $v$	$V - \{v\}$	the set of edges of $E$ that do not contain $v$

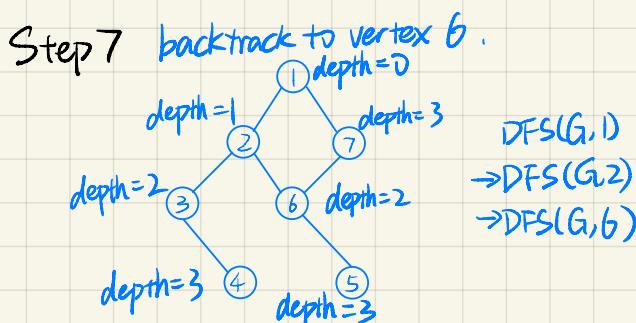
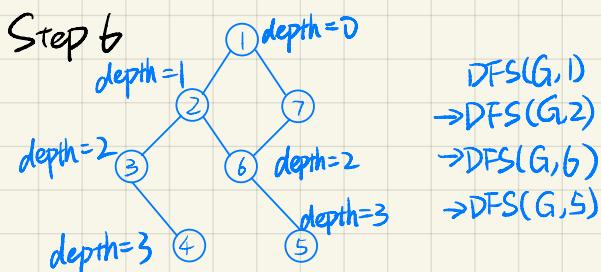
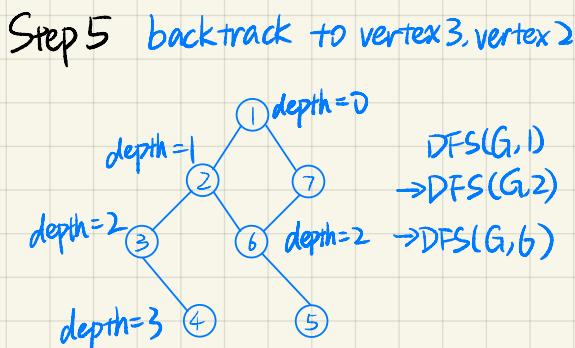
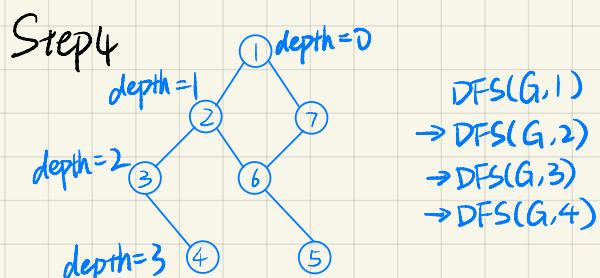
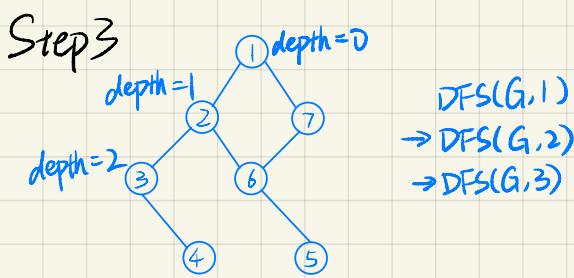
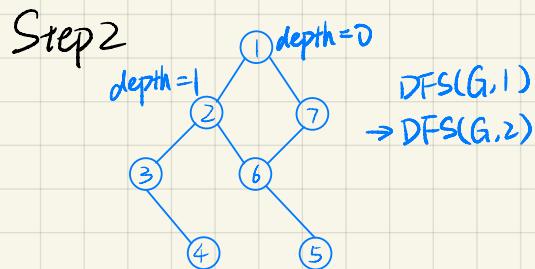
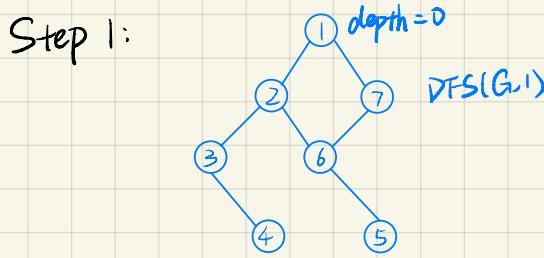
# Depth-first Search (DFS)

Source vertex  $s$   
 visit a vertex deeper in graph  
 root:  $s$  parent of  $u$ :  $u.p$   
 tree depth of  $u$ :  $u.\text{depth}$



Algorithm DFS-Main ( $G, s$ )  
 for each vertex  $u \in G.V$   
 $u.\text{depth} \leftarrow \infty$   
 $u.p \leftarrow \text{NIL}$   
 $s.\text{depth} \leftarrow 0$   
 $\text{DFS}(G, s)$

$\text{DFS}(G, s)$   
 for each  $v \in G.\text{adj}[u]$   
 if  $v.\text{depth} = \infty$   
 $v.\text{depth} \leftarrow u.\text{depth} + 1$   
 $v.p \leftarrow u$   
 $\text{DFS}(G, v)$



# Breadth-First Search (BFS)

source vertex  $s$

visit all vertices closer to  $s$

root:  $s$

parent of  $u$ :  $u.p$

distance from  $s$  to  $u$   $u.d$

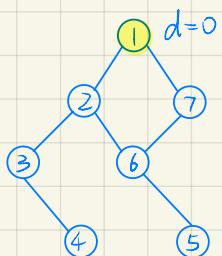
Queue used in BFS (FIFO property)

enqueue ( $S, x$ )    dequeue ( $S$ )

$O(1)$

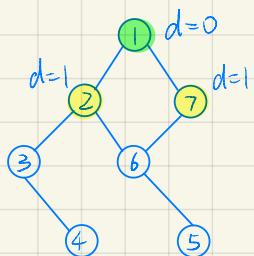
$O(1)$

Steps: [Beginning]  $Q = (1: \underline{0})$

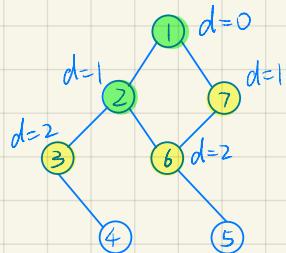


● vertex in  $Q$   
● dequeued vertex

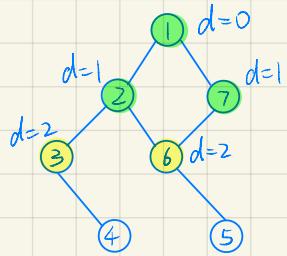
[Iteration 1]  $Q = (2: \underline{1}), (7: \underline{1})$



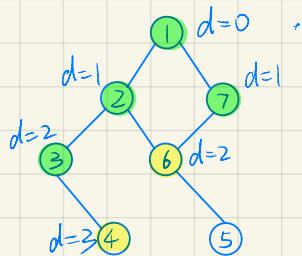
[Iteration 2]  $Q = (7: \underline{1}), (3: \underline{2}), (6: \underline{2})$



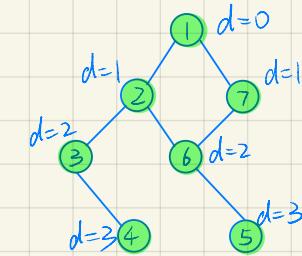
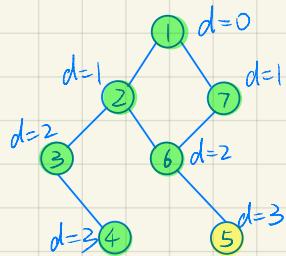
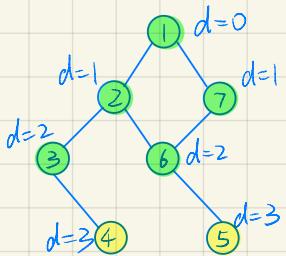
[Iteration 3]  $Q = (3: \underline{2}), (6: \underline{2})$



[Iteration 4]  $Q = (6: \underline{2}), (4: \underline{3})$



[Iteration 5]  $Q = (4: \underline{3}), (5: \underline{3})$  [Iteration 6]  $Q = (5: \underline{3})$  [Iteration 7]  $Q = \emptyset$



Algorithm  $\text{BFS}(G, s)$

foreach vertex  $u \in G.V - \{s\}$

$u.d \leftarrow \infty$ ;  $u.p \leftarrow \text{NIL}$

$s.d \leftarrow 0$ ;  $s.p \leftarrow \text{NIL}$

$Q \leftarrow \text{create a FIFO queue}$

enqueue ( $G, s$ )

while  $Q \neq \emptyset$

$u \leftarrow \text{dequeue}(Q)$

for each  $v \in G.\text{adj}[u]$

if  $v.d = \infty$

$v.d \leftarrow u.d + 1$

$v.p \leftarrow u$

enqueue ( $Q, v$ )

## DFS/BFS: Print Path

Trace the parent vertex iteratively  
Print in reverse order

Algorithm PrintPath(G, S, v)

```
create a list L
repeat
    insert v into list L
    v ← v.p
until v.p = NIL
print L in reverse order.
```

Application:

decide path from vertex t to S

find edge that serve as bridge (connection)

check graph is bipartite graph

# Lecture 8 Graph II

Euler path and Circuits no repeat edge  
begin vertex same as end vertex

Euler circuit: simple circuit contain every edge of graph

Euler path simple path contain every edge of graph

Theorem 1: each vertex has even degree

Theorem 2: exactly two vertices with odd degree

How to find ... circuit find cycle and delete, repeat until empty, merge cycle

How to find ... path add dummy edge to join 2 odd-degree vertices, remove dummy edge

## Hamilton path and circuits

Hamilton circuit: simple circuit pass through every vertex of graph

Hamilton path: simple path pass through every vertex of graph

test ... circuit:  $n$  vertices - no adjacent vertex  $v \& u$

$\deg(u) + \deg(v) \geq n \rightarrow$  has Hamilton circuit

## Shortest path problem

edge weight  $w(u,v)$  \* adjacency list

path  $\rightarrow$  adjacent vertex sequence.

\* Min-heap  
node value  $\leq$  child's value

### Dijkstra's Algorithm

init( $G, s$ )

foreach vertex  $v \in G.V$

$v.d \leftarrow \infty$

$v.p \leftarrow \text{NIL}$

$s.d \leftarrow 0$

relax( $u, v$ )

if  $v.d > u.d + w(u, v)$

$v.d \leftarrow u.d + w(u, v)$

$v.p \leftarrow u$

Dijkstra( $G, s$ )

init( $G, s$ )

$S \leftarrow \emptyset$

build heap( $Q, G.V$ )

while  $Q \neq \emptyset$

$u \leftarrow \text{extract min}(Q)$

$S \leftarrow S \cup \{u\}$

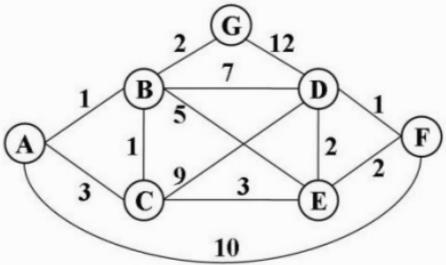
foreach vertex  $v \in G.\text{adj}[u]$

relax( $u, v$ )

if  $v.d$  is updated

decrease key( $Q, v$ )

Q1) Consider the following undirected & weighted graph:



- (a) Step through Dijkstra's algorithm to calculate the single-source shortest paths from A to every other vertex. Show your steps below. Update the old values and write in new ones, from left to right within each cell, as the algorithm proceeds. Also list the vertices in the order which you extracted (i.e. marked them known). Finally, indicate the lowest-cost path from node A to node F. Write down:

\*shortest path tree

[Initialization]	$Q = (A: \underline{0}), (B: \underline{\infty}), (C: \underline{\infty}), (D: \underline{\infty}), (E: \underline{\infty}), (F: \underline{\infty}), (G: \underline{\infty})$
[Iteration 1]	Extract vertex <b>A</b> , update vertices <b>B, C, F</b> A: $d=0$
[Iteration 2]	$Q = (B: \underline{1}), (C: \underline{3}), (D: \underline{\infty}), (E: \underline{\infty}), (F: \underline{10}), (G: \underline{\infty})$ Extract vertex <b>B</b> , update vertices <b>C, D, E, G</b> A: $d=0$ , B: $d=1$
[Iteration 3]	$Q = (C: \underline{2}), (D: \underline{8}), (E: \underline{6}), (F: \underline{10}), (G: \underline{3})$ Extract vertex <b>C</b> , update vertices <b>D, E</b> A: $d=0$ , B: $d=1$ , C: $d=2$
[Iteration 4]	$Q = (D: \underline{8}), (E: \underline{5}), (F: \underline{10}), (G: \underline{3})$ Extract vertex <b>G</b> , update vertices <b>D</b> A: $d=0$ , B: $d=1$ , C: $d=2$ , G: $d=3$
[Iteration 5]	$Q = (D: \underline{8}), (E: \underline{5}), (F: \underline{10})$ Extract vertex <b>E</b> , update vertices <b>D, F</b> A: $d=0$ , B: $d=1$ , C: $d=2$ , G: $d=3$ , E: $d=5$
[Iteration 6]	$Q = (D: \underline{7}), (F: \underline{7})$ Extract vertex <b>D &amp; F</b> (regardless their order) A: $d=0$ , B: $d=1$ , C: $d=2$ , G: $d=3$ , E: $d=5$ , D: $d=7$ , F: $d=7$ $Q = \emptyset$

Planar graph

planar  $\rightarrow$  no crossing edge

Euler's formula

$$\text{no. of region} = \text{edge} - \text{vertices} + 2$$

Graph coloring

no adjacent vertices have same color.

# Lecture 9 Graph III

Flow network :  $G = (V, E)$

producer: source vertex  $s$   
 consumer: sink vertex  $t$ .

Format: flow/capacity.

$$c(u,v) \geq f(u,v) \geq 0$$

$$\text{flow conversion: } \sum_{v \in V} f(v, n) = \sum_{v \in V} f(n, v)$$

Modeling: add dummy vertex for both edge

Maximum Flow Problem

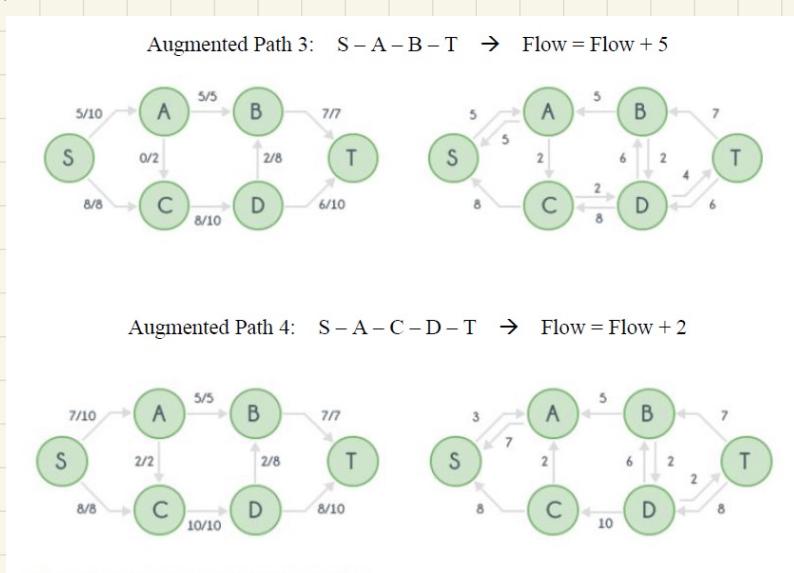
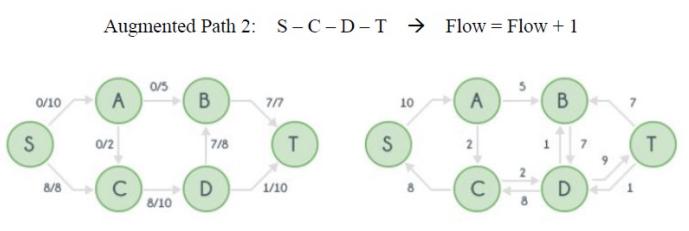
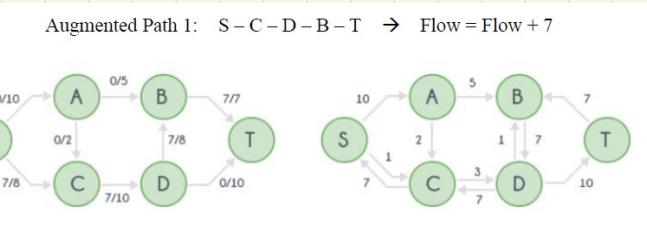
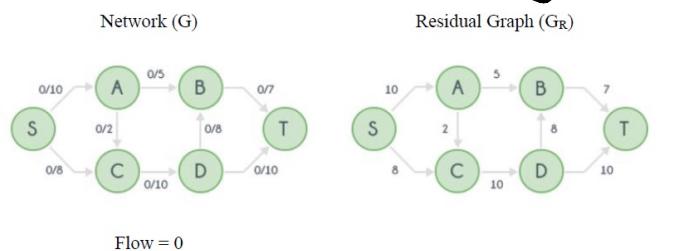
value of flow  $f$   $|f|$  find max value of  $|f|$

Residual Network  $G_f = (G, V, E_f)$

Augmenting path simple path from  $s$  to  $t$  in residual network

residual capacity min value of  $c_f$  in path.

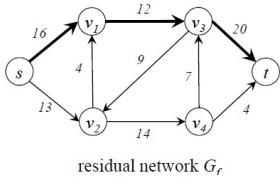
Ford - Fulkerson algorithm



# Edmonds-Karp Algorithm using BFS fewest edge less path

## Iteration 1

- 1. Find a path from  $s$  to  $t$ , by BFS on the residual network  $G_f$ 
  - The path  $\langle s, v_1, v_3, t \rangle$  (with the fewest edges)
  - Distances from  $s$  to vertices  $(s, v_1, v_2, v_3, v_4, t)$ : 0, 1, 1, 2, 2, 3
- 2. The minimum residual capacity  $c_f(u, v)$  on the path is 12
- 3. Update the flow

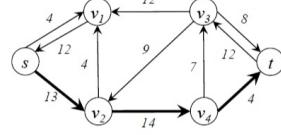


residual network  $G_f$

## Iteration 2

### Iteration 2

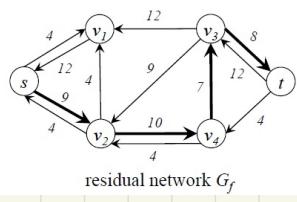
- 1. Find a path from  $s$  to  $t$ , by BFS on the residual network  $G_f$ 
  - The path  $\langle s, v_2, v_4, t \rangle$  (with the fewest edges)
  - Distances from  $s$  to vertices  $(s, v_1, v_2, v_3, v_4, t)$ : 0, 1, 1, 3, 2, 3
- 2. The minimum residual capacity  $c_f(u, v)$  on the path is 4
- 3. Update the flow on  $G$



residual network  $G_f$

## Iteration 3

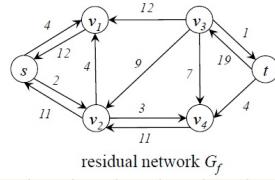
- 1. Find a path from  $s$  to  $t$ , by BFS on the residual network  $G_f$ 
  - The path  $\langle s, v_2, v_4, v_3, t \rangle$  (with the fewest edges)
  - Distances from  $s$  to vertices  $(s, v_1, v_2, v_3, v_4, t)$ : 0, 1, 1, 3, 2, 4
- 2. The minimum residual capacity  $c_f(u, v)$  on the path is 7
- 3. Update the flow on  $G$



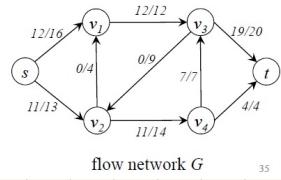
residual network  $G_f$

## Final result

- 1. BFS cannot find any path from  $s$  to  $t$ , on the residual network  $G_f$ 
  - Distances from  $s$  to vertices  $(s, v_1, v_2, v_3, v_4, t)$ : 0, 1, 1,  $\infty$ , 2,  $\infty$
  - Thus the algorithm terminates
  - We can derive the corresponding flow network  $G$
- 2. The maximum flow  $|f|$  is:  $11 + 12 = 23$



residual network  $G_f$



flow network  $G$

35