

# CS6033 Lecture 7

## Slides/Notes

### Elementary Graph Algorithms (Notes, Ch 20)

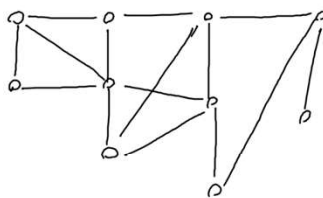
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#### Elementary Graph Algorithms.

Graph:  $G = (V, E)$   $V$ : set of vertices,  $E$ : set of edges.

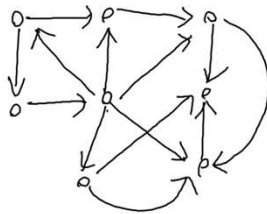
Undirected graph:



$$\left( \circ \longleftrightarrow \circ \equiv \circ - \circ \right)$$

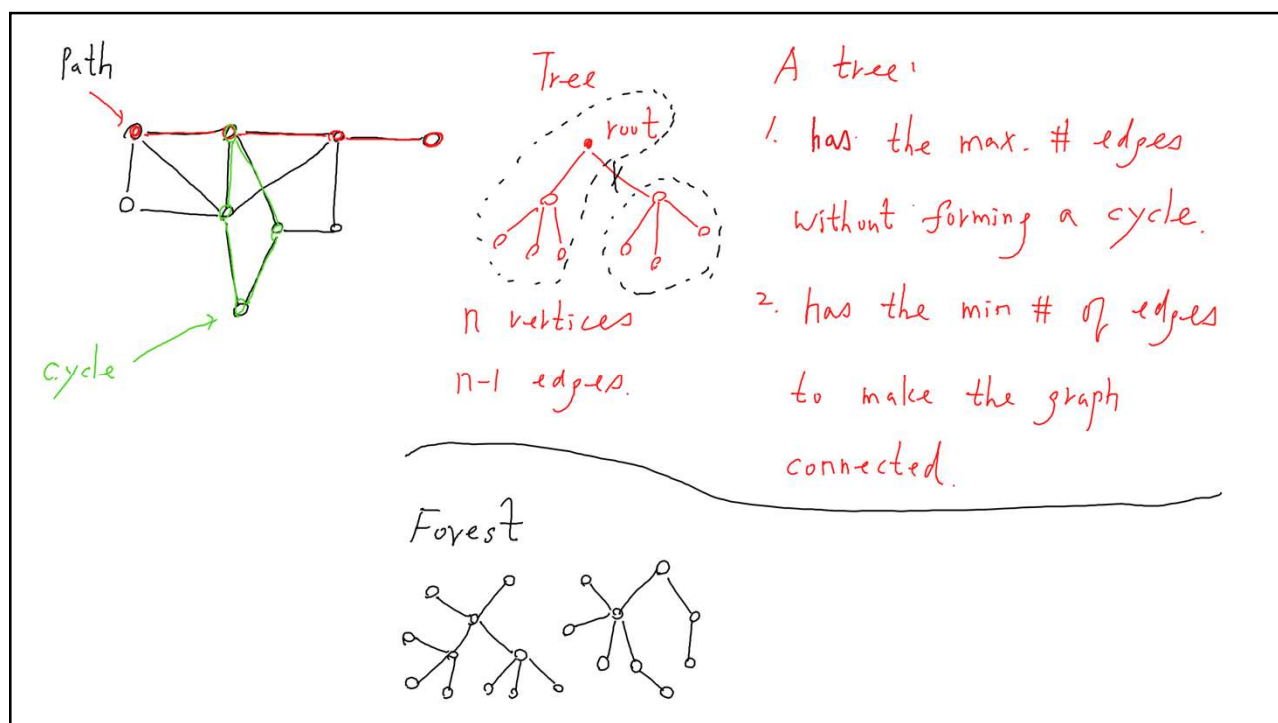
weighted graphs

directed graph:



unweighted graphs

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Representations of Graphs :  $G = (V, E)$   $|E| \leq \binom{V}{2} = \frac{V(V-1)}{2} = O(V^2)$

1. Adjacency List. eg.  $E \sim V \sim V\sqrt{V}$ .
2. Adjacency Matrix.

Directed graph:

Query:  $(1, 5) \in E$ ?

$A_{15} = 1$  ?  $O(1)$  time

weighted graph.

Adjacency List:

Space:  $O(V + E)$

Adjacency Matrix: (A)

	1	2	3	4	5
1	0	0	0	0	0
2	0	0	0	1	0
3	0	0	0	1	0
4	0	0	0	0	1
5	0	0	1	0	0

Space:  $O(V^2)$

$A_{ij} = \begin{cases} 1 & \text{if } (i, j) \in E \\ 0 & \text{else.} \end{cases}$

$A_{ij} = \begin{cases} w(i, j) & \text{if } (i, j) \in E \\ 0 & \text{else.} \end{cases}$

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Undirected graph

A. List space:  $O(V+E)$

```

1 → 2 → 3 → 4
2 → 1 → 4 → 5
3 → 1 → 7
4 → 1 → 2 → 5 → 6
5 → 2 → 4
6 → 4 → 7
7 → 3 → 6
  
```

Each edge is represented twice  
 Total size of the edge lists is  $2|E|$ .  
 = Total degree of all vertices

Def: The degree of a vertex  $v$ ,  $\deg(v)$ , is the total # edges incident on  $v$

In directed graph 
 in-degree  
 out-degree  
 of  $v$   
  
 in-deg(v)=2  
 out-deg(v)=3

A. Matrix space:  $O(V^2)$

	1	2	3	4	5	6	7
1	0	1	1	1	0	0	0
2	1	0	0	1	1	0	0
3	1	0	0	0	0	0	1
4	1	1	0	0	1	1	0
5	0	1	0	1	0	0	0
6	0	0	0	1	0	0	1
7	0	0	1	0	0	1	0

$(i,j) \in E$   
 $A_{ij} = 1 = A_{ji}$   
Symmetric matrix.  
 $A^T = A$  ( $A^T$ : transpose of  $A$ .  $(A^T)_{ij} = A_{ji}$ )

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2 Main Graph Traversal Methods

1. Breadth-First Search (BFS)
2. Depth-First Search (DFS)

BFS:

Use a FIFO queue (First-in-first-out)

BFS tree

black edges - tree edges.

Run time:  $O(V+E)$

(wave-front propagation)

Q

1	2	3	4	5	6	7	8	9	10
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↑ ↑ ↑ ↑ ↑ ↑ ↑ ↑ ↑ ↑

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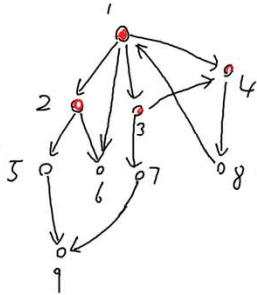
## Depth-First Search

Each vertex is colored:

white: not yet visited.  
gray: visited but not yet finished  
black: finished.

Use a stack.

Label each vertex with  $\begin{cases} \text{discovery time: time first visited} \\ \text{finish time: time the vertex is finished.} \end{cases}$



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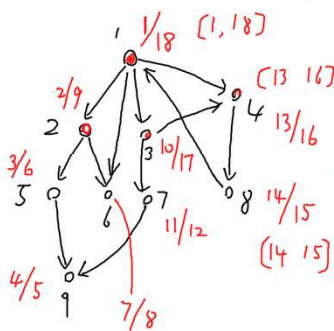
## Depth-First Search

Each vertex is colored:

white: not yet visited.  
gray: visited but not yet finished  
black: finished.

Use a stack.

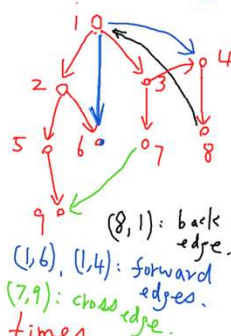
Label each vertex with  $\begin{cases} \text{discovery time: time first visited} \\ \text{finish time: time the vertex is finished.} \end{cases}$



stack

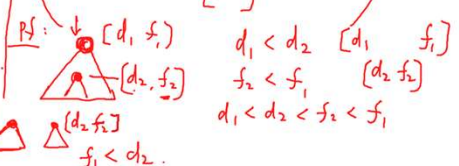


DFS-tree: red edges are the tree edges of DFS-tree.



Lemma: All intervals are either disjoint or nested.

(disjoint:  $[ ] [ ]$ )  
(nested:  $[ [ ] ]$ )



\* Each vertex has discovery & finish times.

forming an interval [discovery, finish]

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## Classification of Edges by DFS

1. Tree edge:  $(u, v) \in \text{DFS tree}$ .  $v$  is a child of  $u$  in DFS tree.  
 $v$  is white when  $(u, v)$  is explored.
2. Back edge:  $v$  is an ancestor of  $u$ .  $v$  is gray when  $(u, v)$  is explored.
3. Forward edge:  $v$  is a descendant of  $u$  but not a child of  $u$ .  
 $\Rightarrow v$  is black when  $(u, v)$  is explored.
4. Cross edge:  $v$  is in a different subtree from  $u$  and  $v$  is visited before  $u$ .  
 $\Rightarrow v$  is black when  $(u, v)$  is explored.

For undirected graphs:

Claim: There are only tree edges and back edges

PF:

Forward edge?



$(v, u) = (u, v)$   
is back edge

$\Rightarrow$  There is NO forward edge or cross edge.



cross edge?



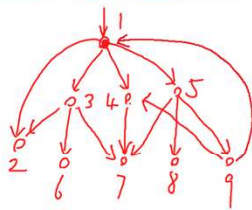
$(v, u)$  is tree edge

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Similarly, we can classify edges by BFS

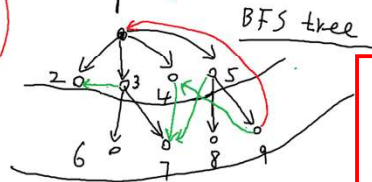
Eg.

BFS:



Use a FIFO queue

(First-in-first-out)

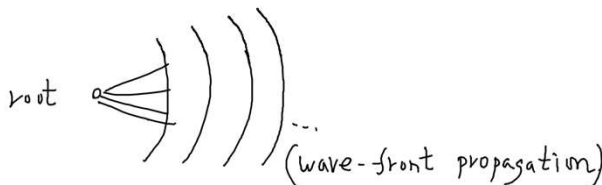


tree edges: black

cross edges:  $(3,2), (4,7), (5,7), (9,4)$

back edge:  $(9,1)$ .

Q



(wave-front propagation)

'forward edge'  $(u, v)$ ?



$\Rightarrow$  No, in BFS,

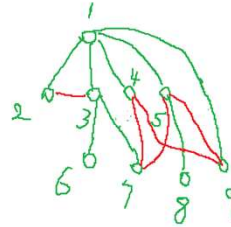
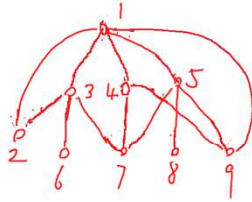
$(u, v)$  is a tree edge

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Similarly, we can classify edges by BFS on undirected graphs

Eg.

BFS:



tree edges:

$(1,2), (1,3), (1,4), (1,5), (1,9)$

$(2,3), (3,4), (4,5)$

cross edges:

$(2,9), (4,7), (4,9), (5,7), (5,9)$



"back edge"  $(9,1)$ ?

$\Rightarrow$  No, in undirected graph  
 $(1,9)$  is a tree edge