

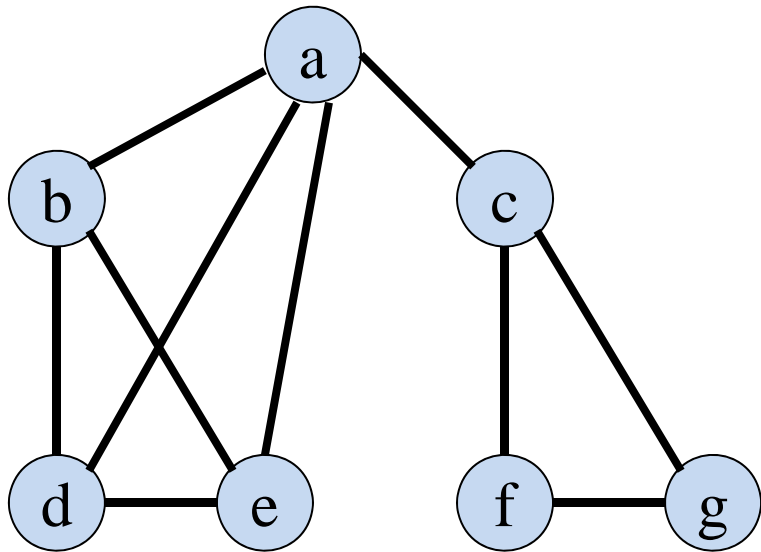
# Undirected Graphs: Depth First Search

- Similar to the algorithm for directed graphs
- $(v, w)$  is similar to  $(v,w)$   $(w,v)$  in a digraph
- for the depth first spanning forest (dfs), each connected component in the graph will have a tree in the dfs
  - (if the graph has one component, the dfs will consist of one tree)
- in the dfs for **digraphs**, there were 4 kinds of edges: **tree, forward, back** and **cross**
- for a **graph** there are 2: **tree** and **back** edges (forward and back edges are not distinguished and there are no cross edges)

# Undirected Graphs: Depth First Search

- **Tree edges:**
  - edges  $(v,w)$  such that  $\text{dfs}(v)$  directly calls  $\text{dfs}(w)$  (or vice versa)
- **Back edges:**
  - edges  $(v,w)$  such that neither  $\text{dfs}(v)$  nor  $\text{dfs}(w)$  call each other directly (e.g.  $\text{dfs}(w)$  calls  $\text{dfs}(x)$  which calls  $\text{dfs}(v)$  so that  $w$  is an ancestor of  $v$ )
- in a dfs, the vertices can be given a dfs number similar to the directed graph case

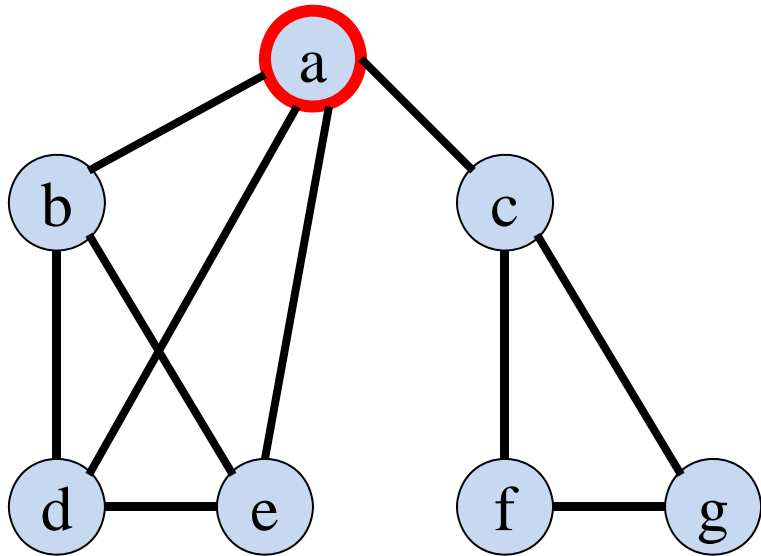
# DFS: Example



start: a  
a b d e c f g

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

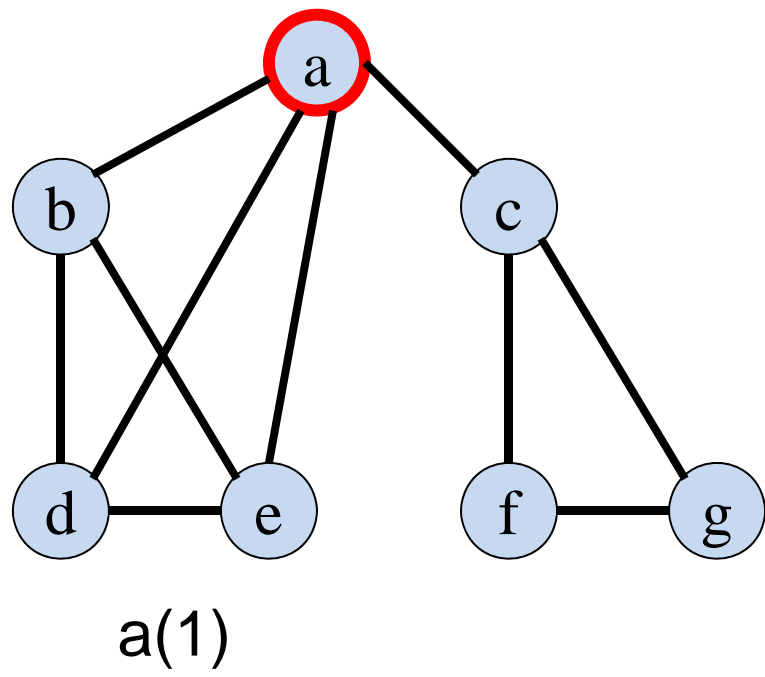
# DFS: Example



a(1)

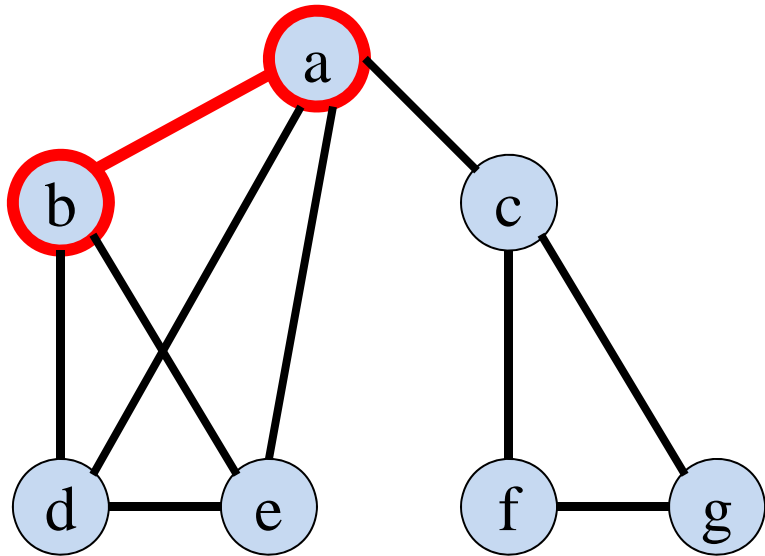
a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

# DFS: Example



a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

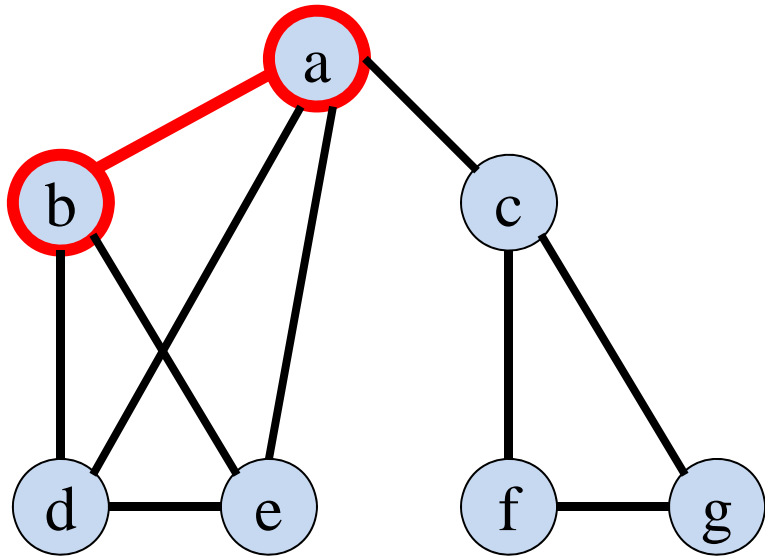
# DFS: Example



a(1) → b(2)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

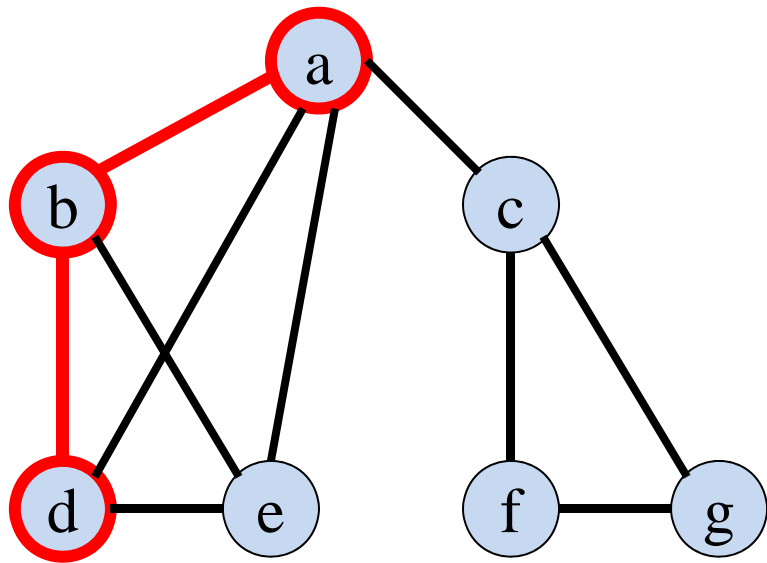
# DFS: Example



a(1) → b(2)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

# DFS: Example

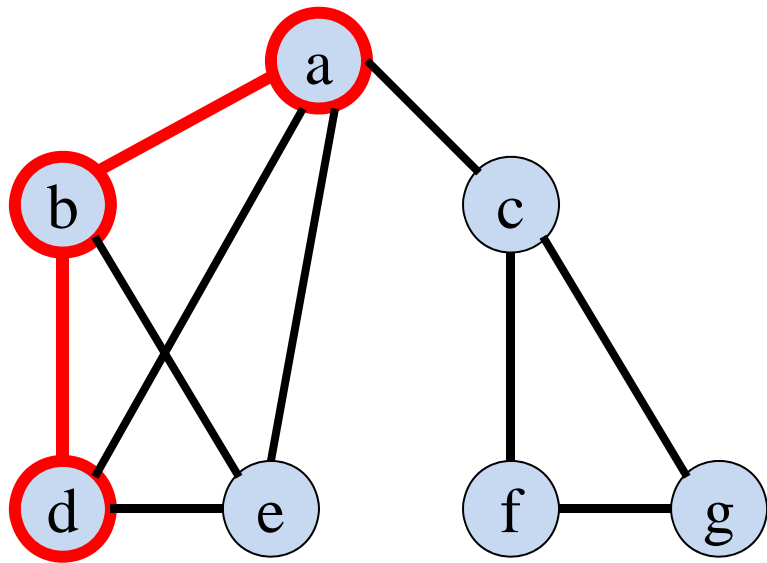


a(1) → b(2) → d(3)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		



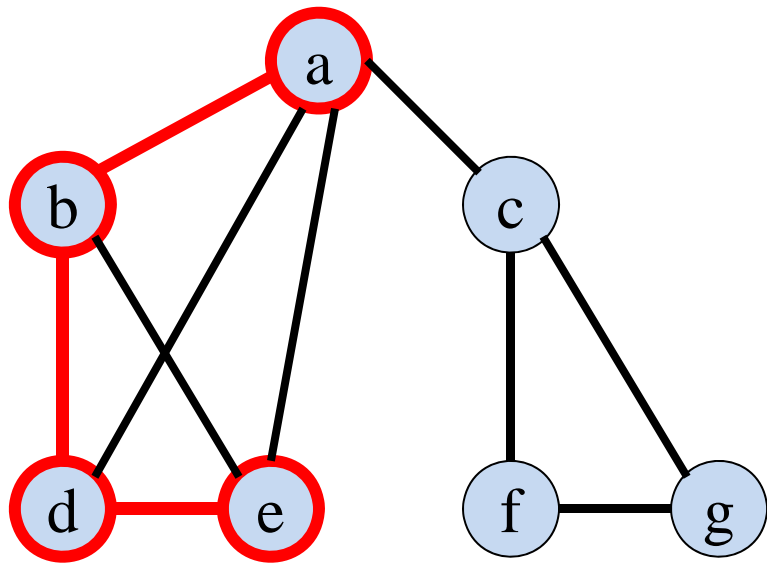
# DFS: Example



a(1) → b(2) → d(3)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

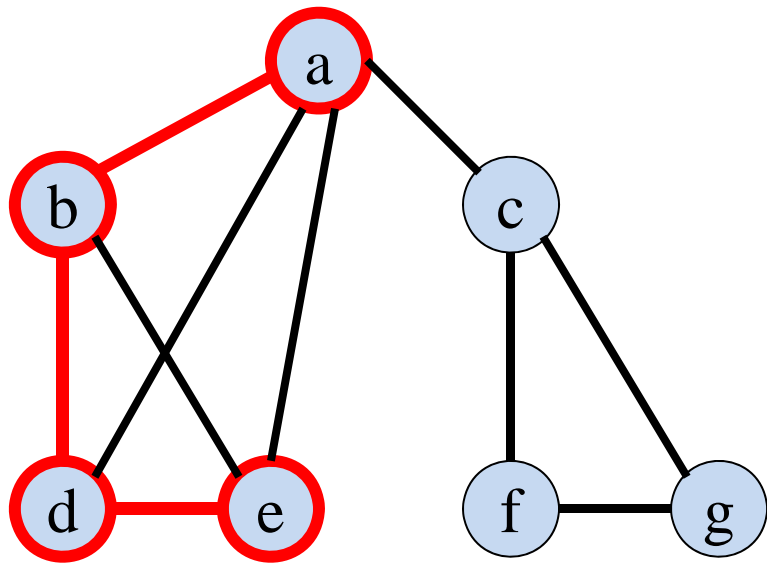
# DFS: Example



a(1) → b(2) → d(3) → e(4)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

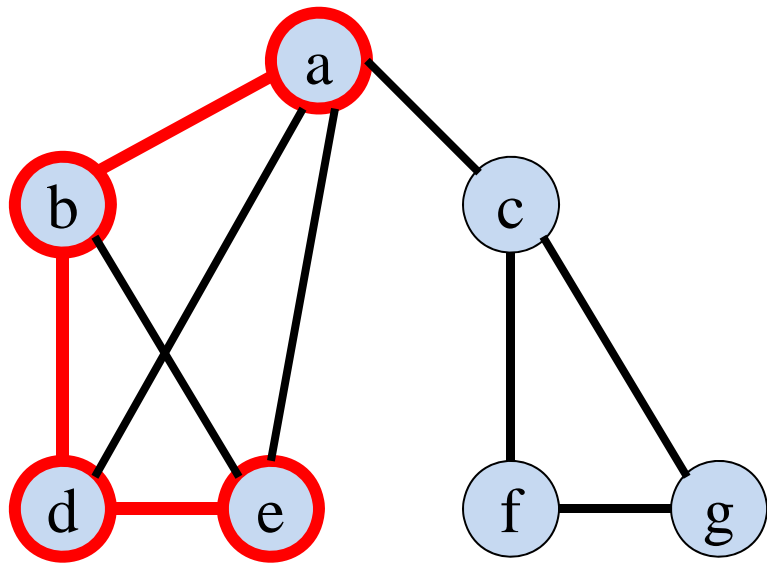
# DFS: Example



a(1) → b(2) → d(3) → e(4)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

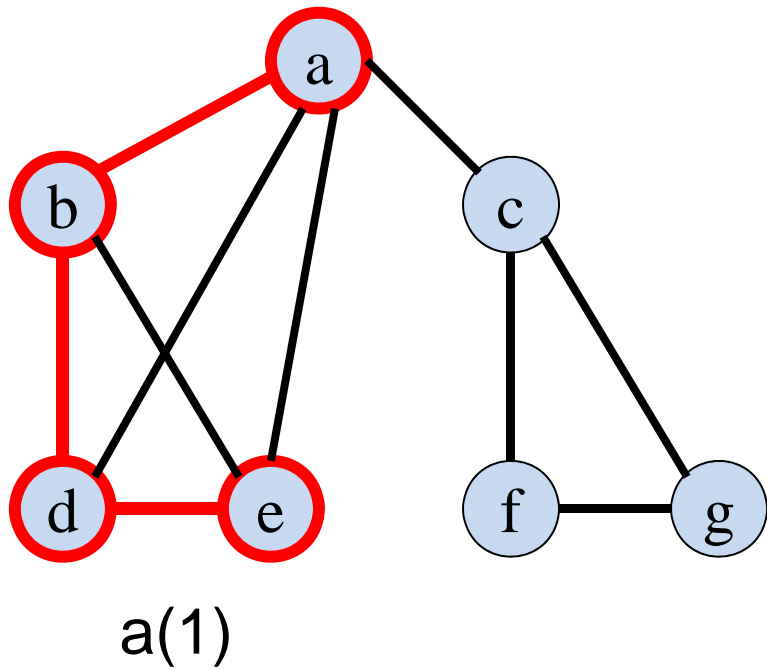
# DFS: Example



a(1) → b(2)

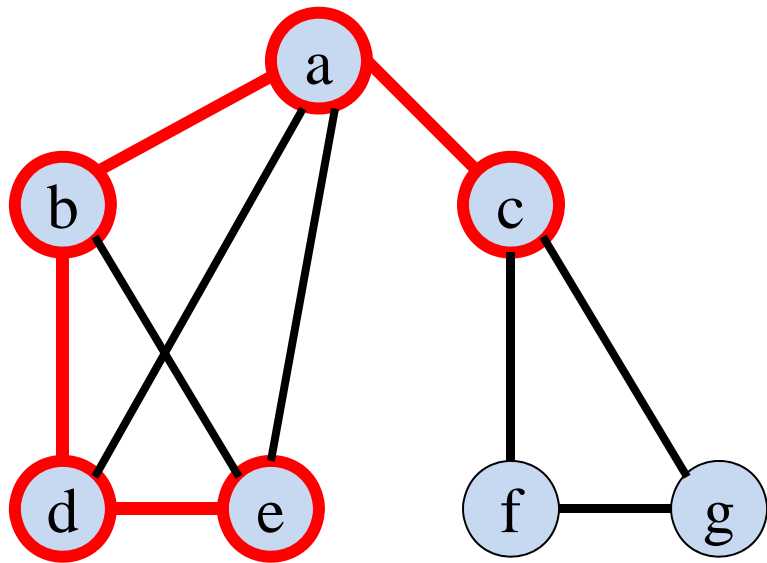
a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

# DFS: Example



a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

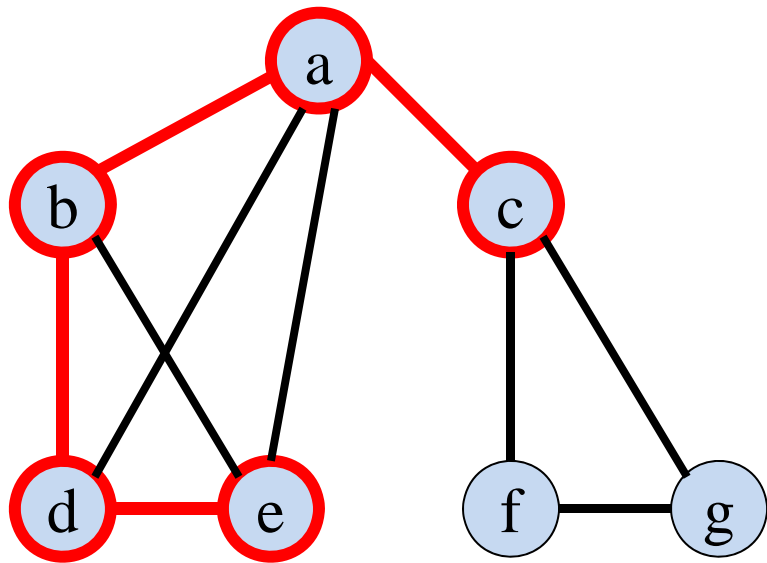
# DFS: Example



a(1) → c(5)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

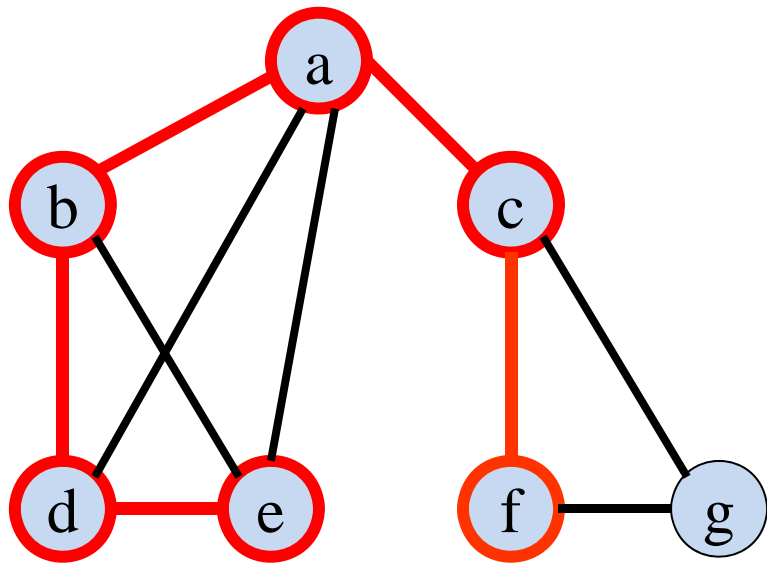
# DFS: Example



a(1) → c(5)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

# DFS: Example

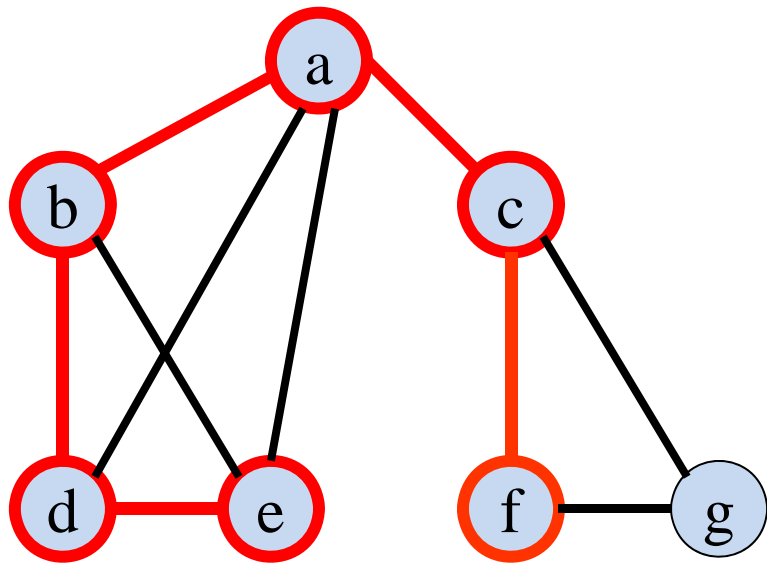


a(1) → c(5) → f(6)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		



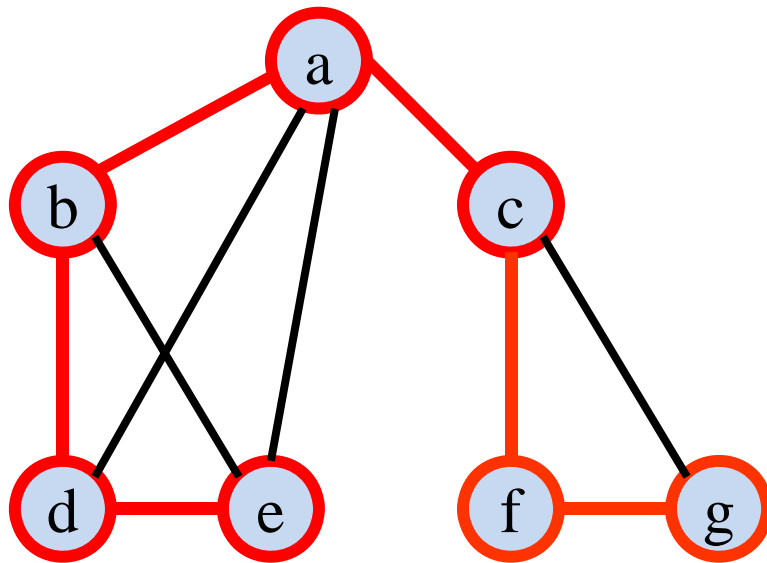
# DFS: Example



a(1) → c(5) → f(6)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

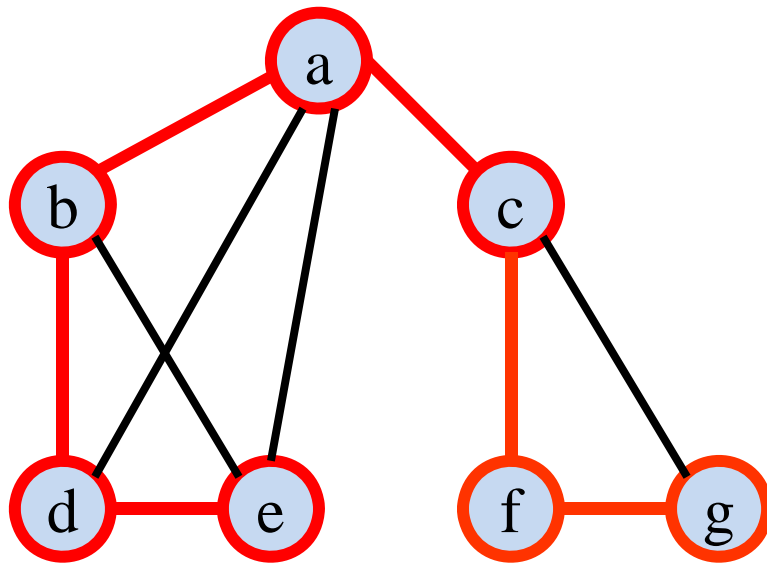
# DFS: Example



a(1) → c(5) → f(6) → g(7)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

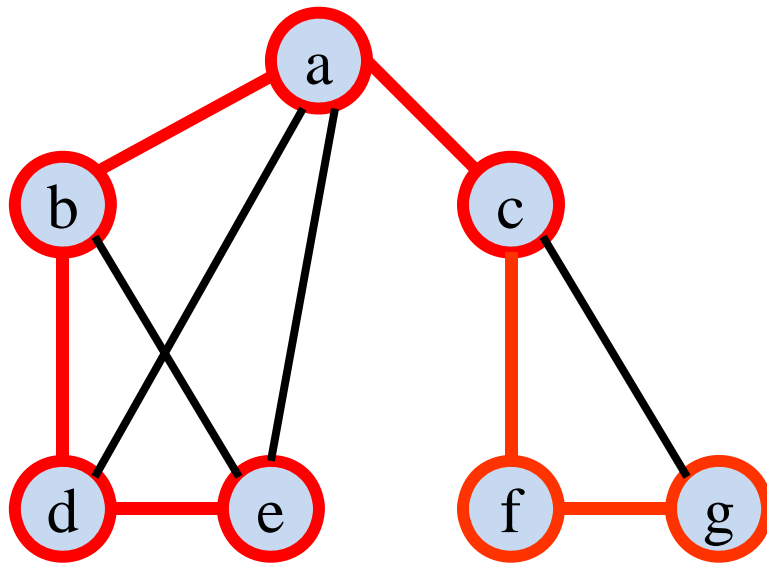
# DFS: Example



a(1) → c(5) → f(6) → g(7)

a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

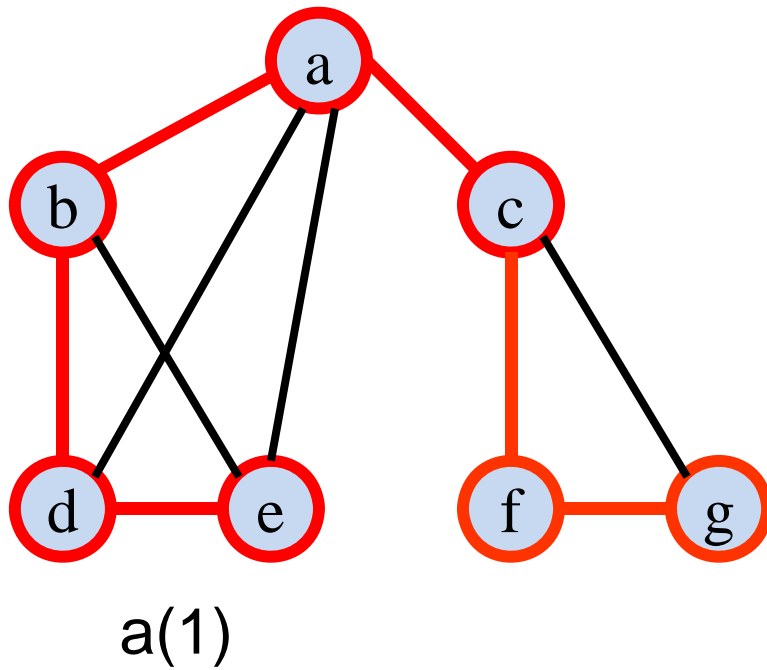
# DFS: Example



a(1) → c(5)

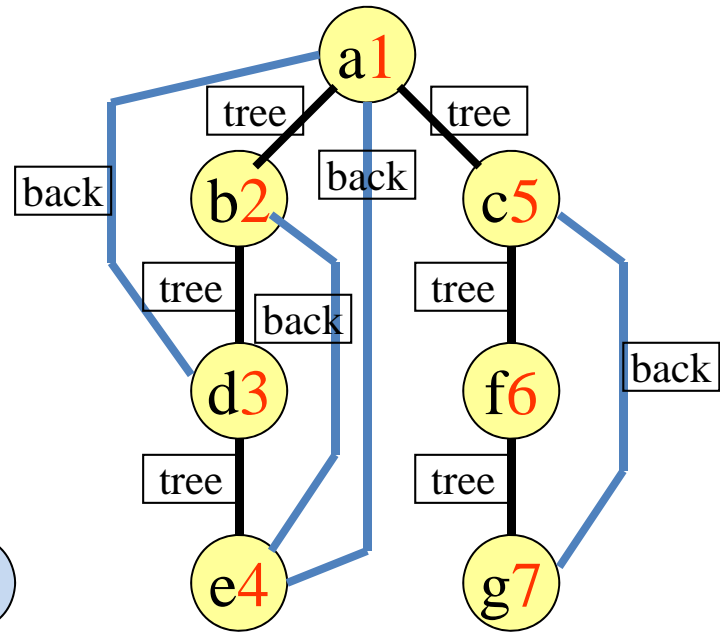
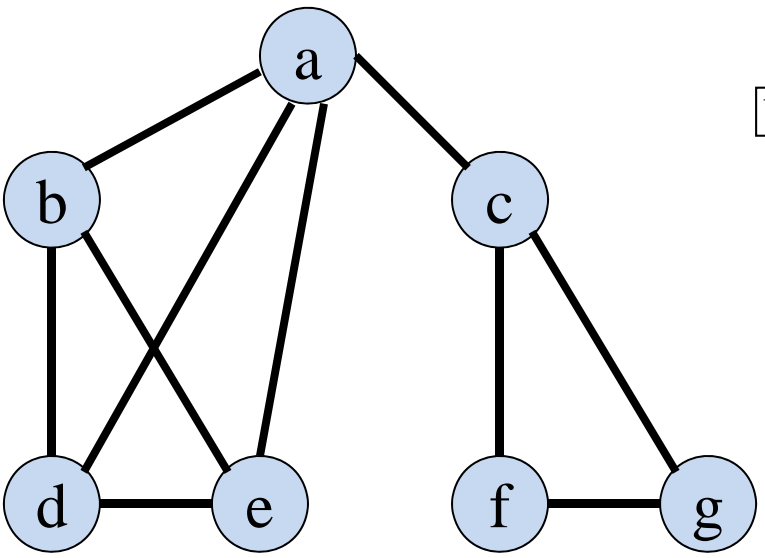
a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

# DFS: Example



a	b	c	d	e
b	a	d	e	
c	a	f	g	
d	a	b	e	
e	a	b	d	
f	c	g		
g	c	f		

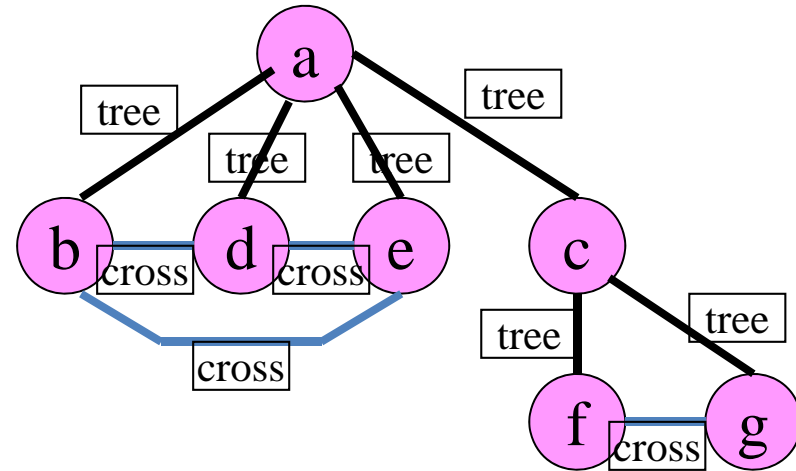
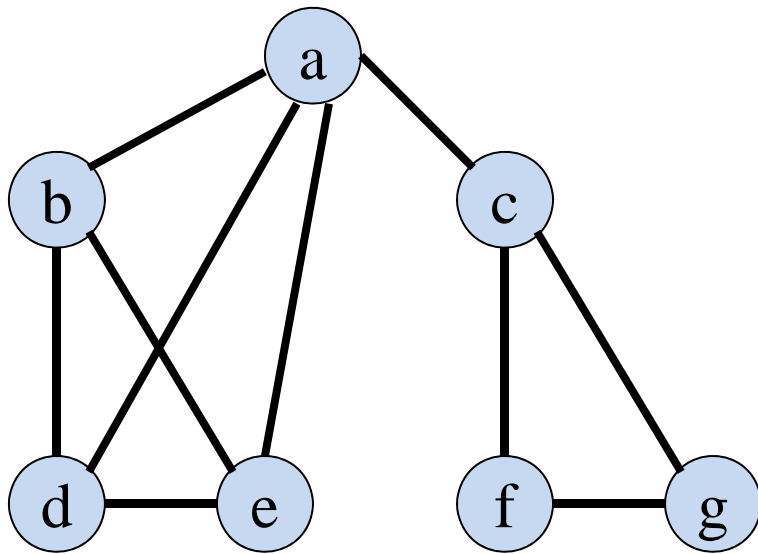
# DFSF: Example (Depth-First Spanning Forest)



# Undirected Graphs: Breadth First Search

- for each vertex  $v$ , visit all the adjacent vertices first
- a breadth-first spanning forest can be constructed
  - consists of
    - tree edges: edges  $(v,w)$  such that  $v$  is an ancestor of  $w$  (or vice versa)
    - cross edges: edges which connect two vertices such that neither is an ancestor of the other
- NB the search only works on one connected component
  - if the graph has several connected components then apply bfs to each component

# [ BFSF: Example ]



Note that this represents the MST for an unweighted undirected graph



# [ BFSF: algorithm (Breadth-First Spanning Forest) ]

```
    bfs ( )
    {
        mark v visited; enqueue (v);
        while ( not is_empty (Q) ) {
            x = front (Q); dequeue (Q);
            for each y adjacent to x if y unvisited {
                mark y visited; enqueue (y);
                insert ( (x, y) in T );
            }
        }
    }
```

# [ Articulation Point ]

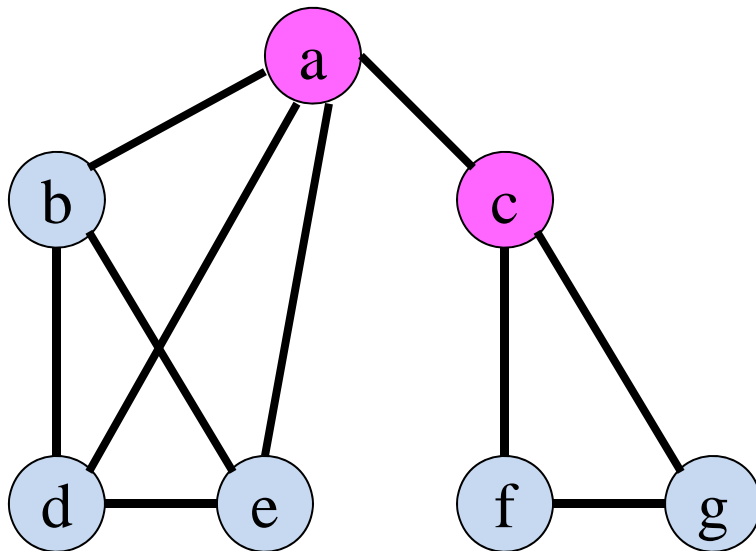
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- An articulation point of a graph is a vertex  $v$  such that if  $v$  and its incident edges are removed, a **connected component** of the graph is broken into two or more pieces
- a **connected component** with no articulation points is said to be **biconnected**
- the dfs can be used to help find the biconnected components of a graph
- finding articulation points is one problem concerning the **connectivity** of graphs

# [ Connectivity ]

- finding articulation points is one problem concerning the connectivity of graphs
- a graph has **connectivity  $k$**  if the deletion of any  $(k-1)$  vertices fails to disconnect the graph (what does this mean?)
  - e.g. a graph has connectivity 2 or more iff it has no articulation points i.e. iff it is biconnected
- the higher the connectivity of a graph, the more likely the graph is to survive failure of some of its vertices
  - e.g. a graph representing sites which must be kept in communication (computers / military / other )

## Articulation Points / Connectivity: Example



- articulation points are **a** and **c**
- removing **a** gives  $\{b,d,e\}$  and  $\{c,f,g\}$
- removing **c** gives  $\{a,b,d,e\}$  and  $\{f,g\}$
- removing any other vertex does not split the graph

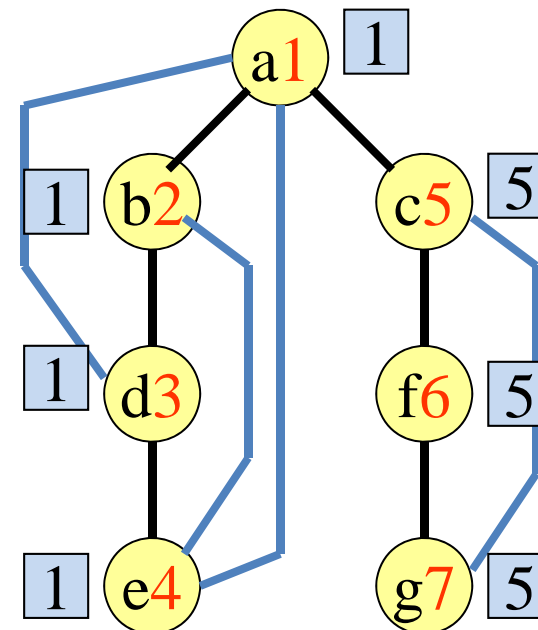
# Articulation Points: Algorithm

- Perform a **dfs of the graph**, computing the df-number for each vertex  $v$   
(df-numbers order the vertices as in a pre-order traversal of a tree)
- for each vertex  $v$ , compute  $\text{low}(v)$  - the smallest df-number of  $v$  or any vertex  $w$  reachable from  $v$  by following down 0 or more tree edges to a descendant  $x$  of  $v$  ( $x$  may be  $v$ ) and then following a back edge  $(x, w)$
- compute  **$\text{low}(v)$**  for each vertex  $v$  by visiting the vertices in post-order traversal
- when  $v$  is processed,  **$\text{low}(y)$**  has already been computed for all children  $y$  of  $v$

# Articulation Points: Algorithm

- $low(v)$  is taken to be the **minimum** of
  - $df\text{-number}(v)$
  - $df\text{-number}(z)$  for any vertex  $z$  where  $(v,z)$  is a back edge
  - $low(y)$  for any child  $y$  of  $v$
- example
  - $e = \min(4, (1,2), -)$
  - $d = \min(3, 1, 1)$   $b = \min(2, -, 1)$
  - $g = \min(7, 5, -)$   $f = \min(6, -, 5)$
  - $c = \min(5, -, 5)$
  - $a = \min(1, -, (1,5))$

## example



# Articulation Points: Algorithm

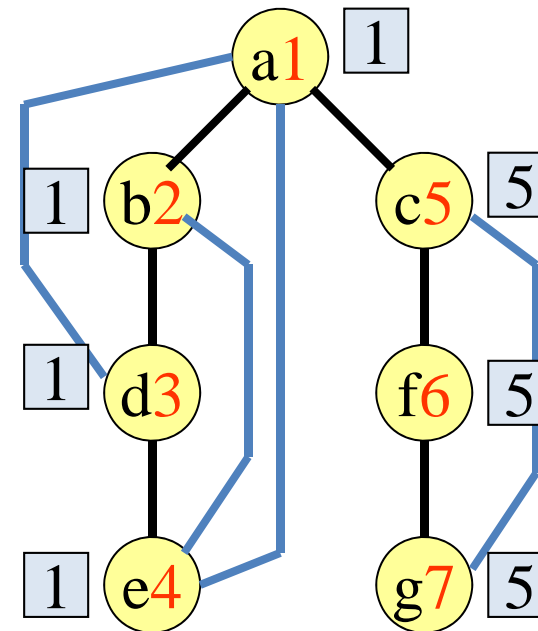
- the root is an AP iff it has 2 or more children
  - since it has no **cross edges**, removal of the root must disconnect the sub-trees rooted at its children
  - removing a  $\Rightarrow$  {b, d, e} and {c, f, g}
- a vertex  $v$  (other than the root) is an AP iff there is some child  $w$  of  $v$  such that  $\text{low}(w) \geq \text{df-number}(v)$ 
  - $v$  disconnects  $w$  and its descendants from the rest of the graph
  - if  $\text{low}(w) < \text{df-number}(v)$  there must be a way to get from  $w$  down the tree and back to a proper ancestor of  $v$  (the vertex whose df-number is  $\text{low}(w)$ ) and therefore deletion of  $v$  does not disconnect  $w$  or its descendants from the rest of the graph

# Articulation Points: Example 1

- root - 2 or more children
- other vertices
  - some child  $w$  of  $v$  such that  $\text{low}(w) \geq \text{df-number}(v)$

- example

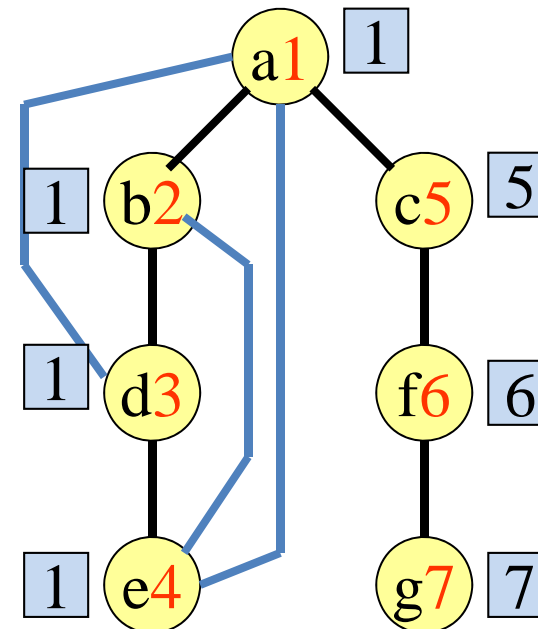
- **(a)** root  $\geq 2$  children
- b  $\text{low}(e) = 1$   $\text{dfn} = 2$
- **(c)**  $\text{low}(g) = 5$   $\text{dfn} = 5$
- d  $\text{low}(e) = 1$   $\text{dfn} = 3$
- e N/A
- f  $\text{low}(g) = 5$   $\text{dfn} = 6$
- g N/A





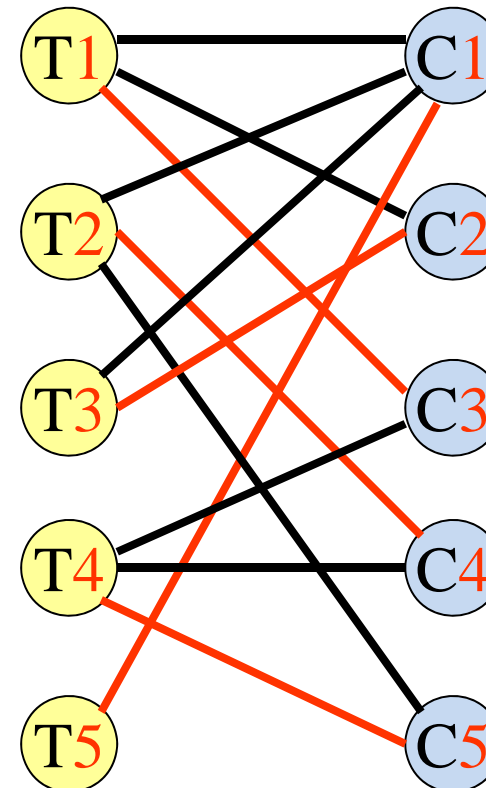
# Articulation Points: Example 2

- root - 2 or more children
- other vertices
  - some child  $w$  of  $v$  such that  $low(w) \geq dfn(v)$
- example
  - **(a)** root  $\geq 2$  children
  - b  $low(e) = 1$   $dfn = 2$
  - **(c)**  $low(g) = 7$   $dfn = 5$
  - d  $low(e) = 1$   $dfn = 3$
  - e N/A
  - **(f)**  $low(g) = 7$   $dfn = 6$
  - g N/A



# Bipartite Graph

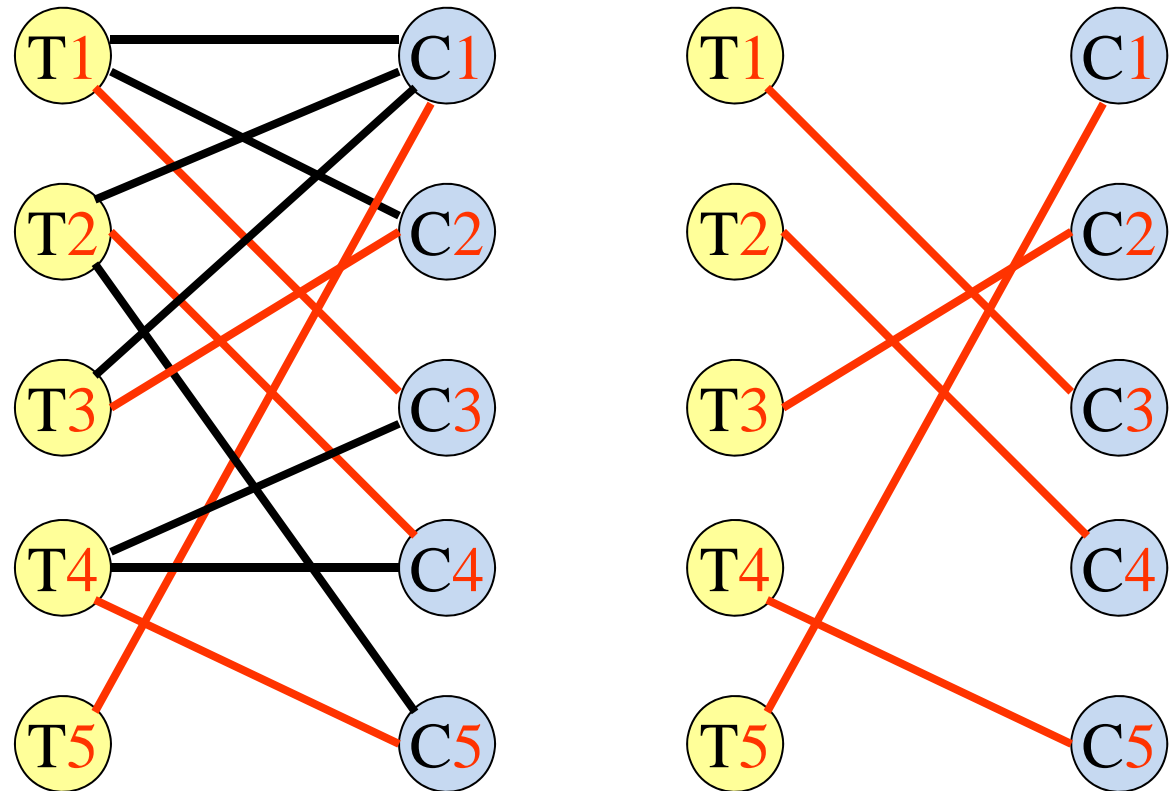
- A graph  $G$  is **bipartite** if  $V$  is the disjoint union of  $V_1$  and  $V_2$  such that no  $x_i$  and  $x_j$  in  $V_1$  are adjacent (similarly  $y_i$  and  $y_j$  in  $V_2$ )
- example
  - set of courses
  - set of teachers
  - edge  $\Rightarrow$  can teach course
  - (marriage problem!)



# Bipartite Graph: Matching Problem

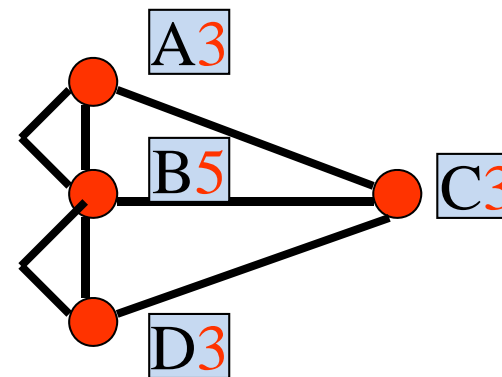
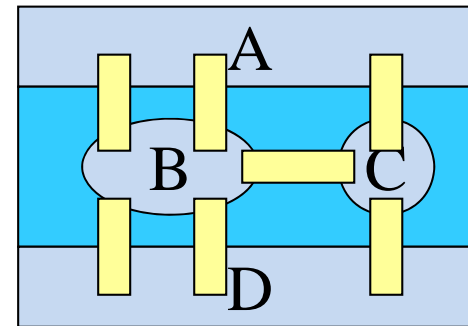
- A matching in a bipartite graph (BG) is a set of edges whose end points are distinct
- a matching is **complete** if every member of  $V_1$  is the end point of one of the edges in the matching
- a matching is **perfect** if every member of  $V$  is the end point of one of the edges in the matching
- in a BG where  $V = V_1$  disjoint union  $V_2$ , there is a **complete matching** iff for every subset  $C$  of  $V_1$  there are at least  $|C|$  vertices in  $V_2$  adjacent to members of  $C$
- in a BG where  $V = V_1$  disjoint union  $V_2$ , there is a **perfect matching** iff for every subset  $C$  of  $V_1$  there are at least  $|C|$  vertices in  $V_2$  adjacent to members of  $C$  and  $|V_1| = |V_2|$

# [ BG Matching: Example ]



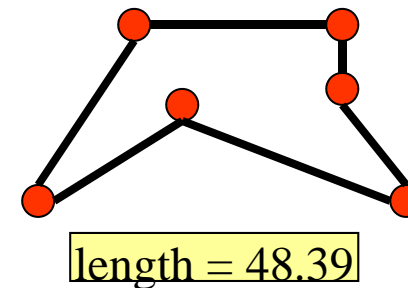
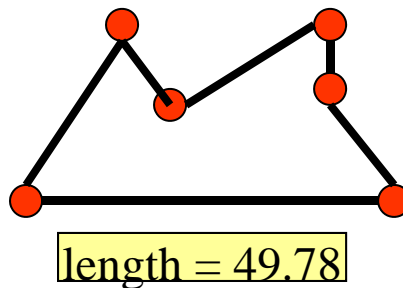
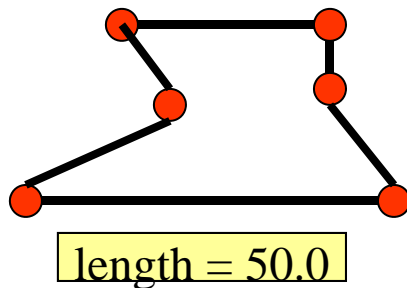
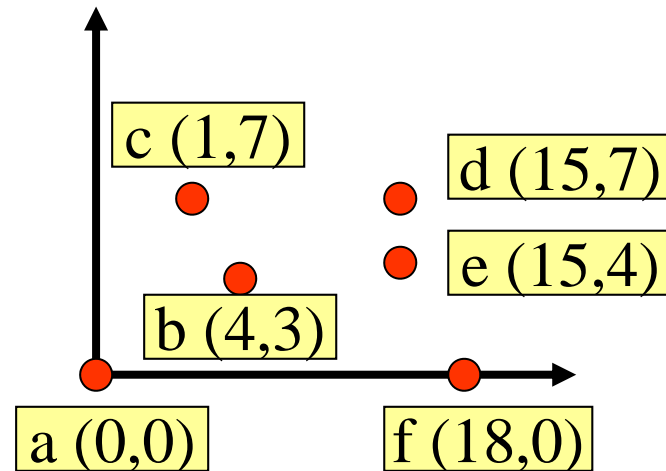
# Königsberg Bridge Problem (Euler)

- Find a cycle in the graph  $G$  that includes all the vertices and all the edges in  $G$  –  
**Euler Cycle**
- if  $G$  has an Euler cycle, then  $G$  is connected and every vertex has an **even degree**
- **degree( $v$ )** = number of edges incident on  $v$



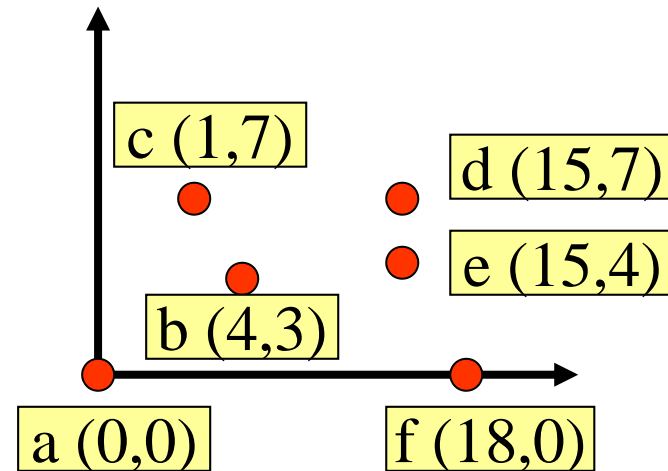
# Hamiltonian Cycle

- **Hamiltonian cycle**: cycle in a graph  $G = (V, E)$  which contains each vertex in  $V$  exactly once, except for the starting and ending vertex that appears twice
- **degree(v) = 2 for all v in V**



# [ TSP Problem ]

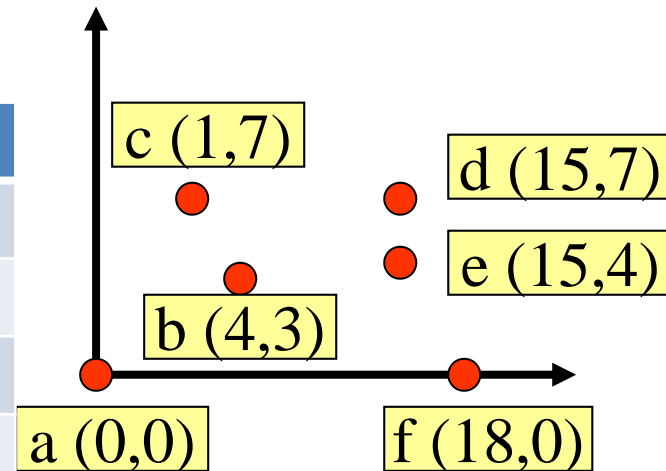
- What may we assume?
- Graph is fully connected
- a-b,5 = 5
- a-c,  $\sqrt{50}$  = 7+
- a-d,  $\sqrt{274}$  = 16+
- a-e,  $\sqrt{241}$  = 15+
- a-f,18 = 18
- b-c,5 = 5
- b-d,  $\sqrt{137}$  = 11+
- b-e,  $\sqrt{122}$  = 11+



# TSP Problem

Start estimating!

	a	b	c	d	e	f
a		5	7+	16+	15+	18
b	5		5	11+	11+	15+
c	7+	5		14	14+	18+
d	16+	11+	14		3	7+
e	15+	11+	14+	3		5
f	18	15+	18+	7+	5	

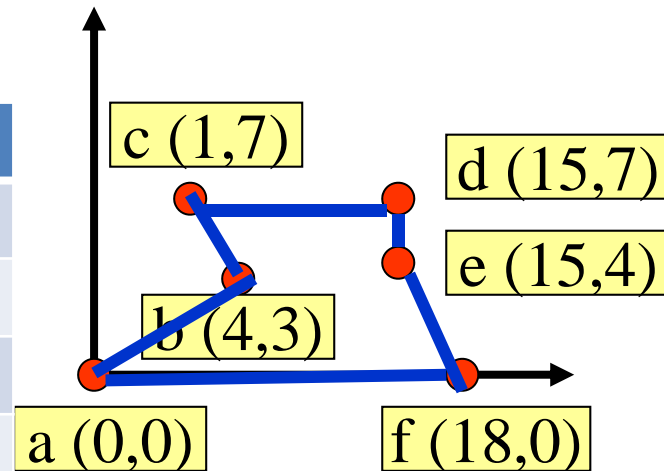




# TSP Problem

Start estimating!

	a	b	c	d	e	f
a		<b>5</b>	7+	16+	15+	<b>18</b>
b	<b>5</b>		<b>5</b>	11+	11+	15+
c	7+	<b>5</b>		<b>14</b>	14+	18+
d	16+	11+	<b>14</b>		<b>3</b>	7+
e	15+	11+	14+	<b>3</b>		<b>5</b>
f	<b>18</b>	15+	18+	7+	<b>5</b>	

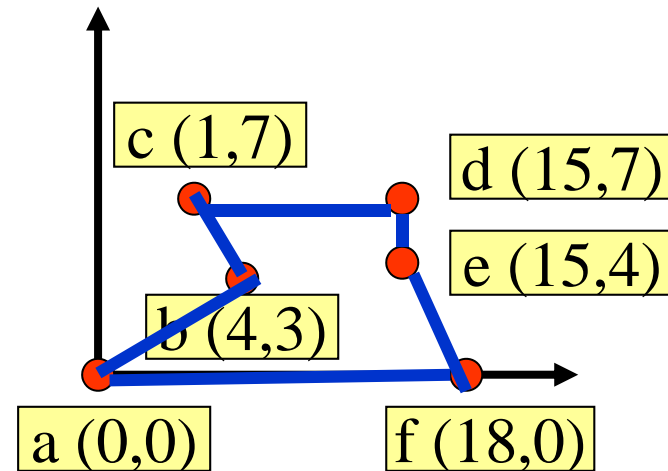


# TSP Problem

Adapt Kruskal PQ plus  
degree max 2 (see below)

1. d-3-e
2. a-5-b, b-5-c, e-5-f
3. c-14-d
4. a-18-f

$(0,0,0,1,1,0) \rightarrow (1,1,0,1,1,0) \rightarrow$   
 $(1,2,1,1,1,0) \rightarrow (1,2,1,1,2,1) \rightarrow$   
 $(1,2,2,2,2,1) \rightarrow (2,2,2,2,2,2)$



# Travelling Salesman Problem (TSP)

- Euler / Hamilton
  - E visits each edge once
  - H visits each vertex once
- to find an Euler cycle -  $O(n)$
- Hamilton
  - factorial or exponential
- Hamilton - applications
  - TSP
  - knight's tour of  $n * n$  board
- TSP
  - Find the minimum-length Hamiltonian cycle for  $G$
  - salesman starts and ends at  $x$
- **TSP Algorithm**
  - **variant of Kruskal's**
  - **edge acceptance conditions**
    - **degree( $v$ ) should not  $\geq 3$**
    - **no cycles unless # selected edges =  $|V|$**
    - **greedy / near-optimal**

# [ Graphs: Summary 1 ]

## ■ Directed Graphs

- $G = (V, E)$
- create / destroy  $G$
- add / remove  $V$   
(=>remove  $E$ )
- add / remove  $E$
- $\text{is\_path}(v, w)$
- $\text{path\_length}(v, w)$
- $\text{is\_cycle}(v)$
- $\text{is\_connected}(G)$
- $\text{is\_complete}(G)$

## ■ Undirected Graphs

- $G = (V, E)$
- create / destroy  $G$
- add / remove  $V$   
(=>remove  $E$ )
- add / remove  $E$
- $\text{is\_path}(v, w)$
- $\text{path\_length}(v, w)$
- $\text{is\_cycle}(v)$
- $\text{is\_connected}(G)$
- $\text{is\_complete}(G)$

# [ Graphs: Summary 2 ]

- Directed Graphs
  - navigation
    - depth-first search (dfs)
    - breadth-first search (bfs)
    - **Warshall**
  - spanning forests
    - **df spanning forest (dfs)**
    - **bf spanning forest (bfs)**
  - minimum cost algorithms
    - **Dijkstra** (single path)
    - **Floyd** (all paths)
- Undirected Graphs
  - navigation
    - depth-first search (dfs)
    - breadth-first search (bfs)
    - Warshall
  - spanning forests
    - **df spanning forest (dfs)**
    - **bf spanning forest (bfs)**
  - minimum cost algorithms
    - **Prim** (spanning tree)
    - **Kruskal** (spanning tree)

# [ Graphs: Summary 3 ]

## ■ Directed Graphs

- topological sort (DAG)
- strong components
- reduced graph

## ■ Undirected Graphs

- sub-graph
- induced sub-graph
- unconnected graph-free tree
- articulation points
- connectivity
- bipartite graph & matching
- Königsberg Bridge Problem
- Hamiltonian cycles
- Travelling Salesman