

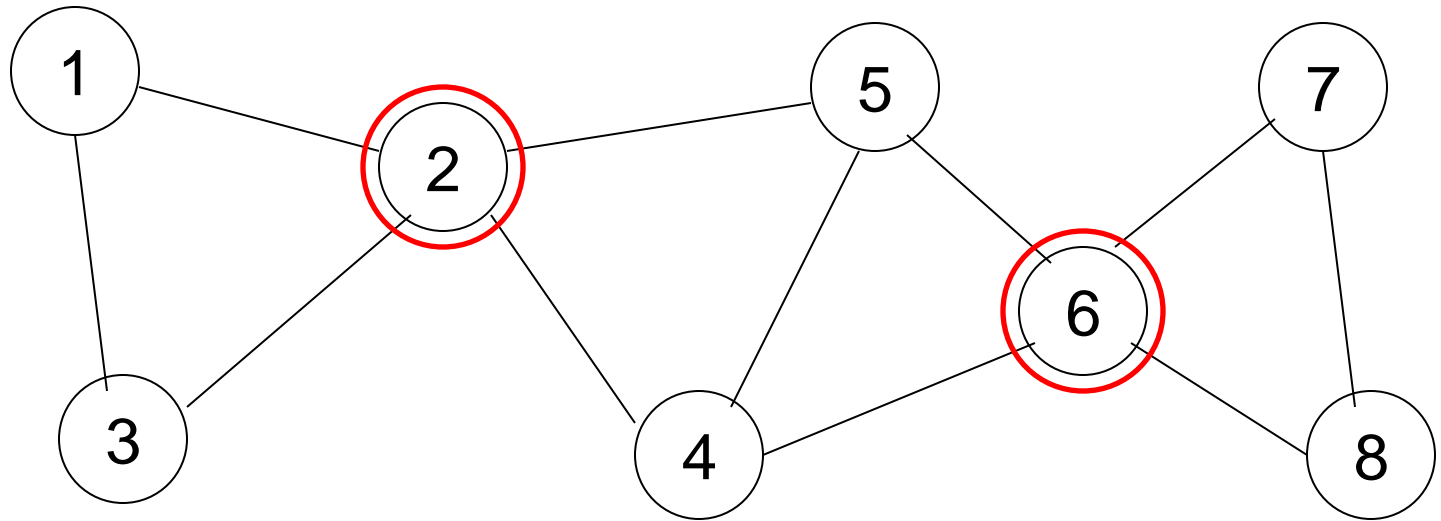
# Cut vertices, Cut Edges and Biconnected components

MTL776 Graph algorithms

# Articulation points, Bridges, Biconnected Components

- Let  $G = (V;E)$  be a connected, undirected graph.
- An **articulation point** of  $G$  is a vertex whose removal disconnects  $G$ .
- A **bridge** of  $G$  is an edge whose removal disconnects  $G$ .
- A **biconnected component** of  $G$  is a maximal set of edges such that any two edges in the set lie on a common simple cycle
- These concepts are important because they can be used to identify vulnerabilities of networks

# Articulation points – Example



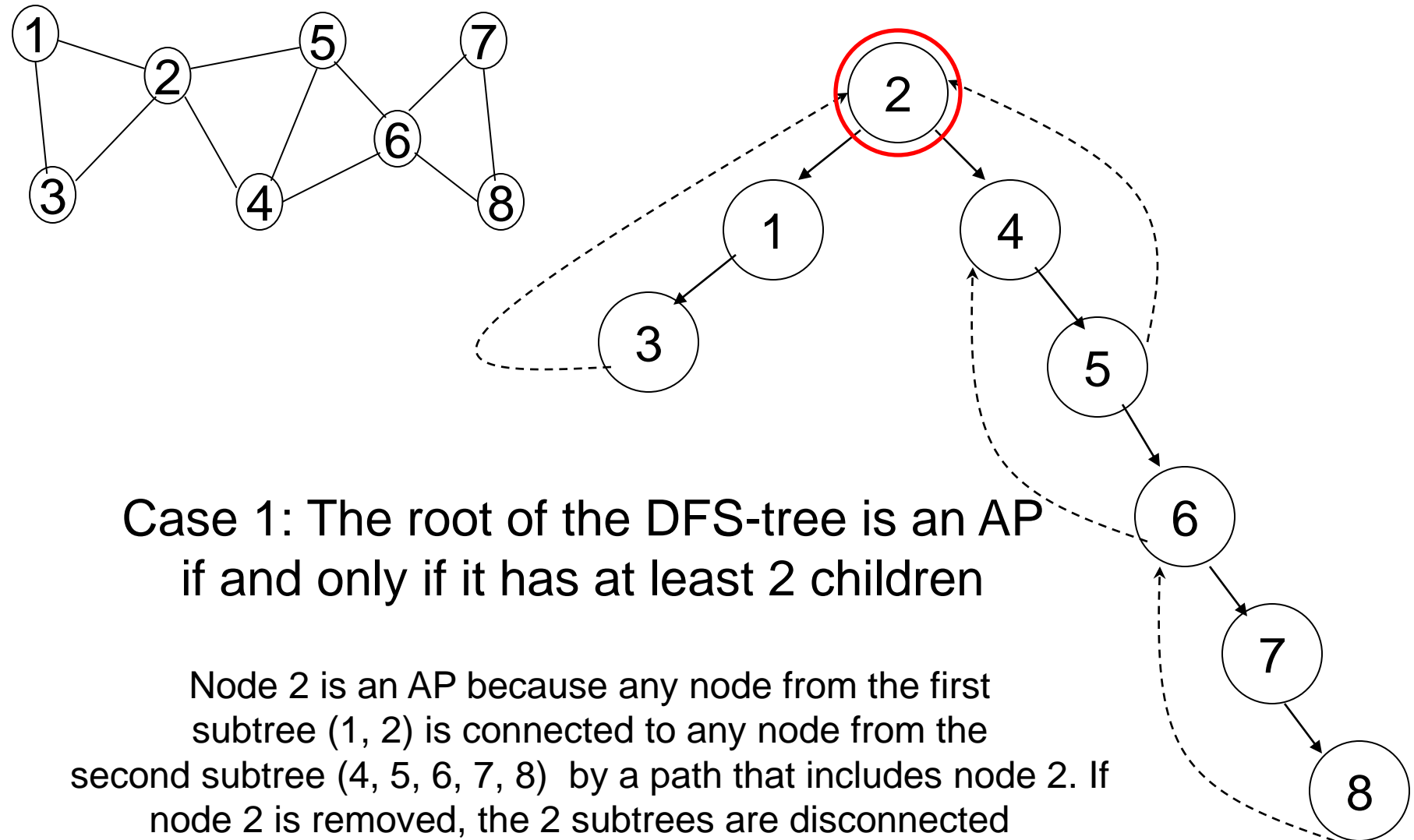
# How to find all articulation points ?

- **Brute-force approach:** one by one remove all vertices and see if removal of a vertex causes the graph to disconnect:
  - For every vertex  $v$ , do :
    - Remove  $v$  from graph
    - See if the graph remains connected (use BFS or DFS)
    - If graph is disconnected, add  $v$  to AP list
    - Add  $v$  back to the graph
- Time complexity of above method is  $O(n*(n+m))$  for a graph represented using adjacency list.
- Can we do better?

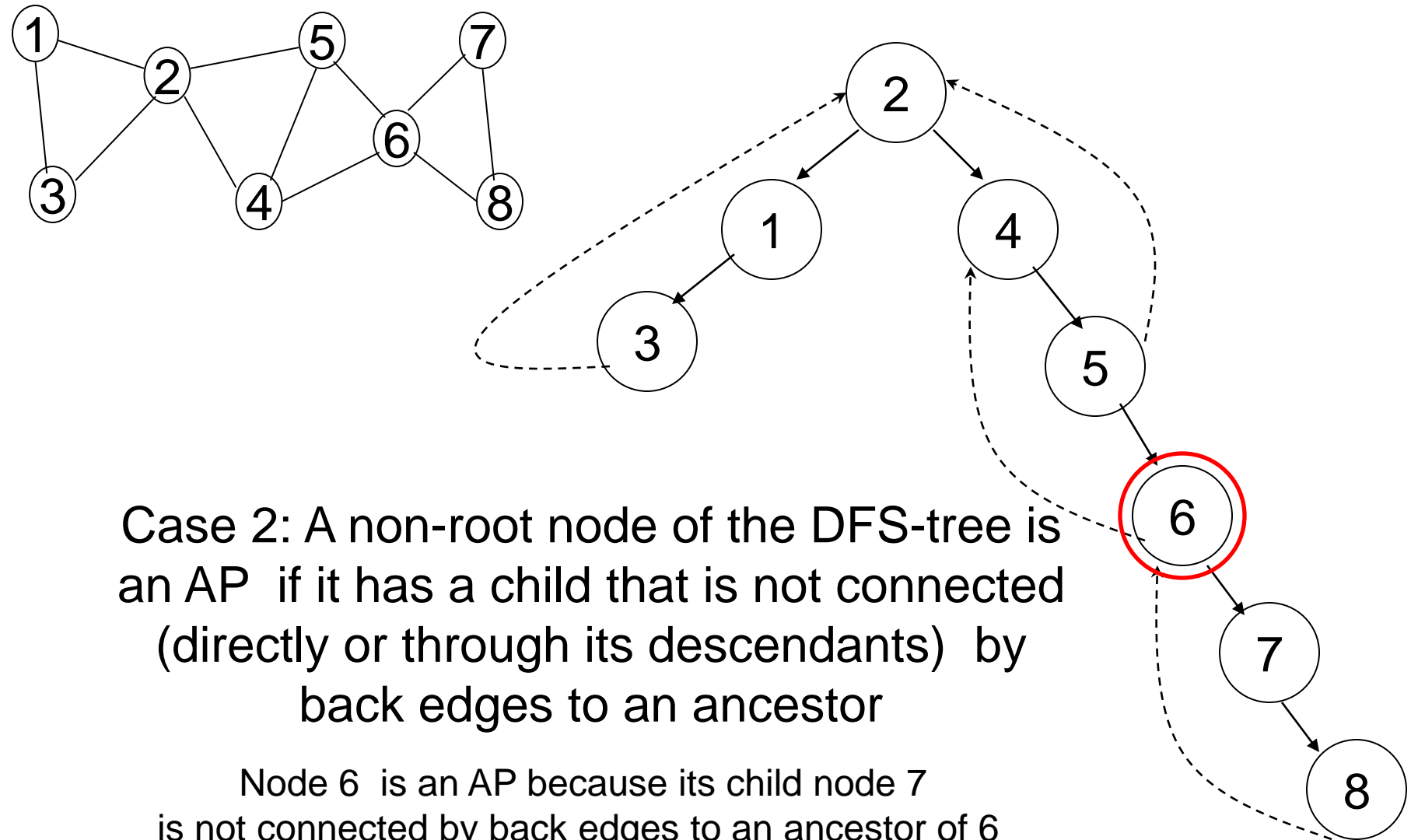
# How to find all articulation points ?

- **DFS- based-approach:**
- We can prove following properties:
  1. The root of a DFS-tree is an articulation point if and only if it has at least two children.
  2. A nonroot vertex  $v$  of a DFS-tree is an articulation point of  $G$  if and only if has a child  $s$  such that there is no back edge from  $s$  or any descendant of  $s$  to a proper ancestor of  $v$ .
  3. Leafs of a DFS-tree are never articulation points

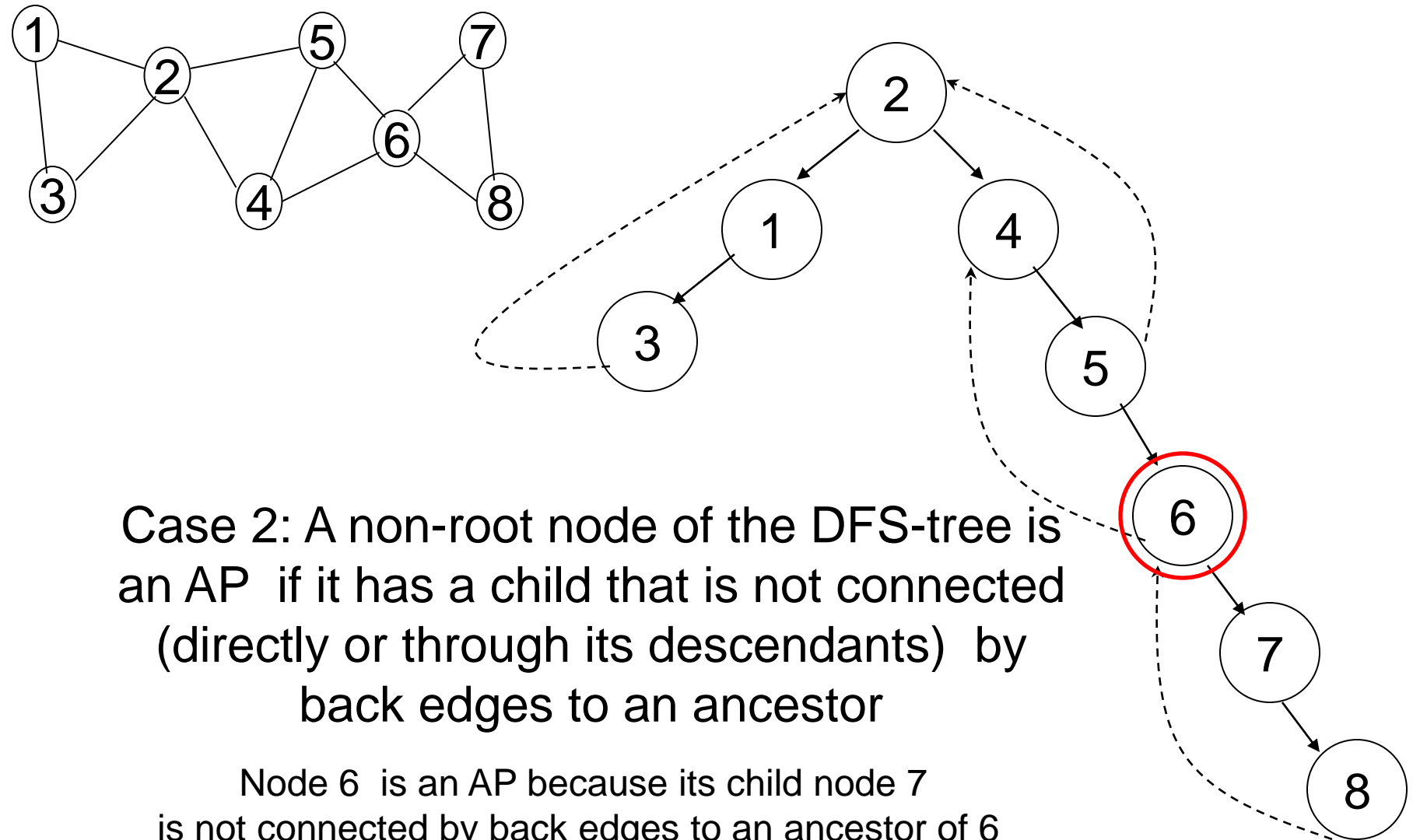
# Finding articulation points by DFS



# Finding articulation points by DFS



# Finding articulation points by DFS



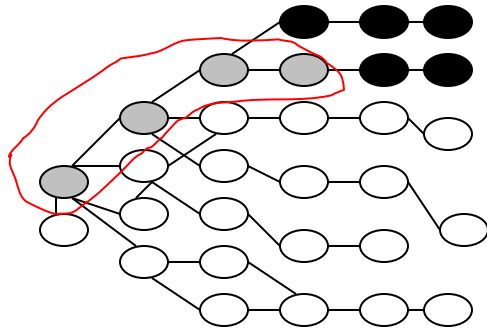


# Depth-First Search: Revisited

- *Depth-first search* is another strategy for exploring a graph
  - Explore “deeper” in the graph whenever possible
  - Edges are explored out of the most recently discovered vertex  $v$  that still has unexplored edges
  - When all of  $v$ 's edges have been explored, backtrack to the vertex from which  $v$  was discovered

# Depth-First Search

- Vertices initially colored **white**
- Then colored **gray** when discovered
- Then **black** when their exploration is finished



# Depth-First Search

- Every **vertex  $v$**  will get following **attributes**:
  - **$v.color$** : (white, grey, black) – represents its exploration status
  - **$v.pi$**  represents the “parent” node of  $v$  ( $v$  has been reached as a result of exploring adjacencies of  $pi$ )
  - **$v.d$**  represents the time when the node is discovered
  - **$v.f$**  represents the time when the exploration is finished

DFS( $G$ )

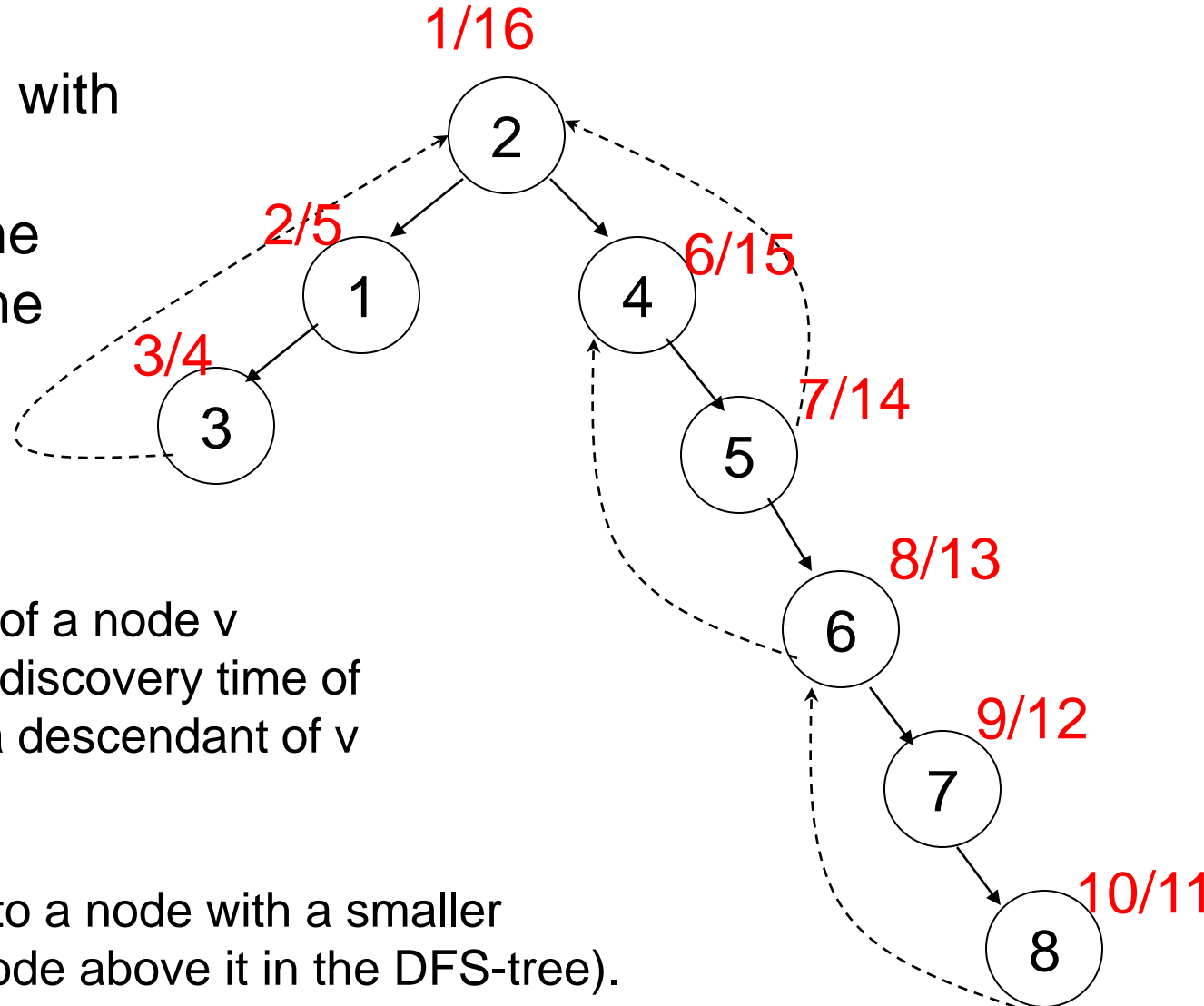
```
1  for each vertex  $u \in G.V$ 
2       $u.color = \text{WHITE}$ 
3       $u.\pi = \text{NIL}$ 
4   $time = 0$ 
5  for each vertex  $u \in G.V$ 
6      if  $u.color == \text{WHITE}$ 
7          DFS-VISIT( $G, u$ )
```

DFS-VISIT( $G, u$ )

```
1   $time = time + 1$ 
2   $u.d = time$ 
3   $u.color = \text{GRAY}$ 
4  for each  $v \in G.Adj[u]$ 
5      if  $v.color == \text{WHITE}$ 
6           $v.\pi = u$ 
7          DFS-VISIT( $G, v$ )
8   $u.color = \text{BLACK}$ 
9   $time = time + 1$ 
10  $u.f = time$ 
```

# Reminder: DFS – v.d and v.f

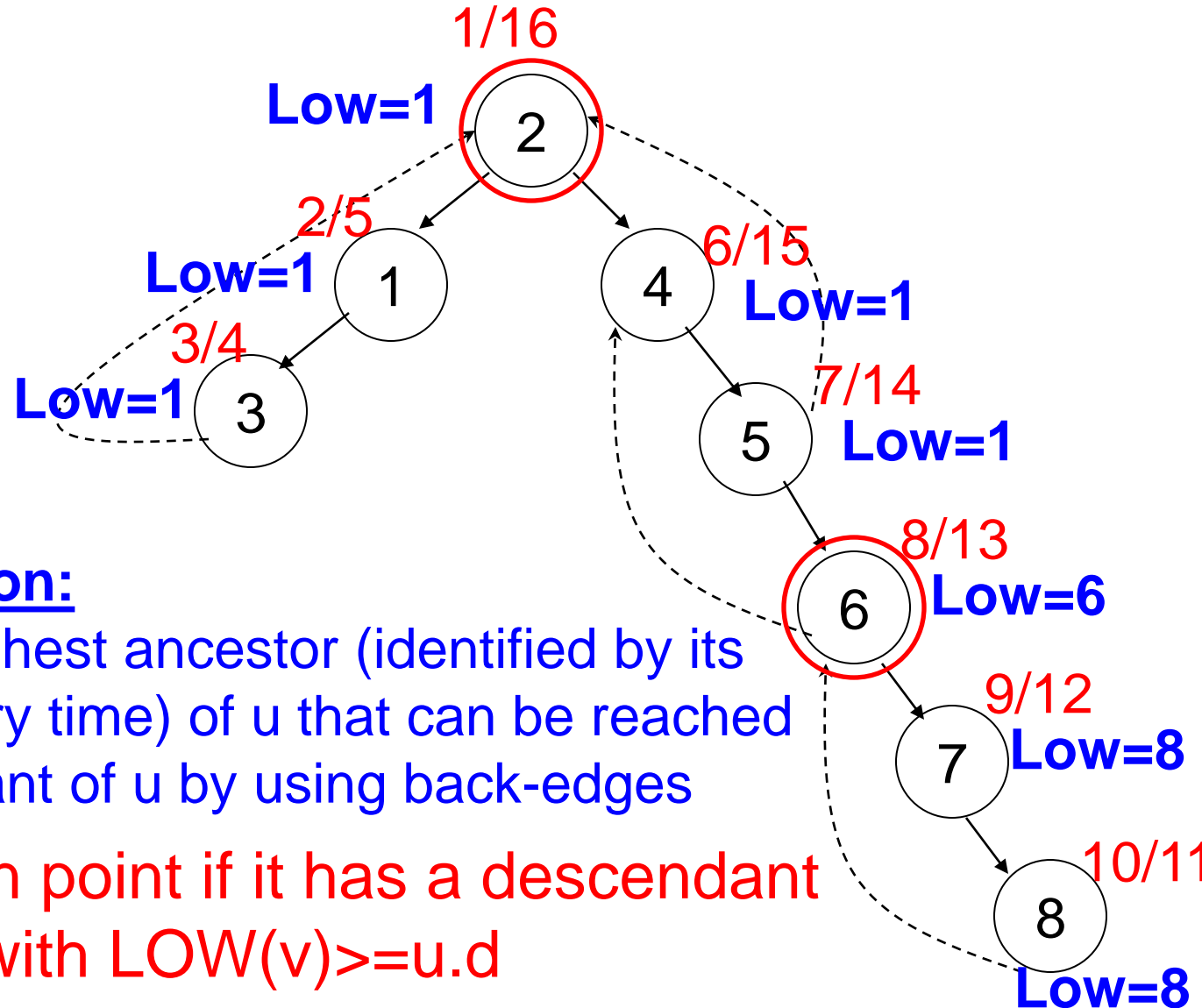
DFS associates with every vertex  $v$  its discovery time and its finish time  $v.d / v.f$



The discovery time of a node  $v$  is smaller than the discovery time of any node which is a descendant of  $v$  in the DFS-tree.

A back-edge leads to a node with a smaller discovery time (a node above it in the DFS-tree).

# The LOW function



## The LOW function:

LOW( $u$ ) = the highest ancestor (identified by its smallest discovery time) of  $u$  that can be reached from a descendant of  $u$  by using back-edges

$u$  is articulation point if it has a descendant  $v$  with  $LOW(v) \geq u.d$

# Finding Articulation Points

- *Algorithm principle:*
  - *During DFS, calculate also the values of the LOW function for every vertex*
  - *After we finish the recursive search from a child  $v$  of a vertex  $u$ , we update  $u.low$  with the value of  $v.low$ . Vertex  $u$  is an articulation point, disconnecting  $v$ , if  $v.low \geq u.d$*
  - *If vertex  $u$  is the root of the DFS tree, check whether  $v$  is its second child*
  - *When encountering a back-edge  $(u,v)$  update  $u.low$  with the value of  $v.d$*

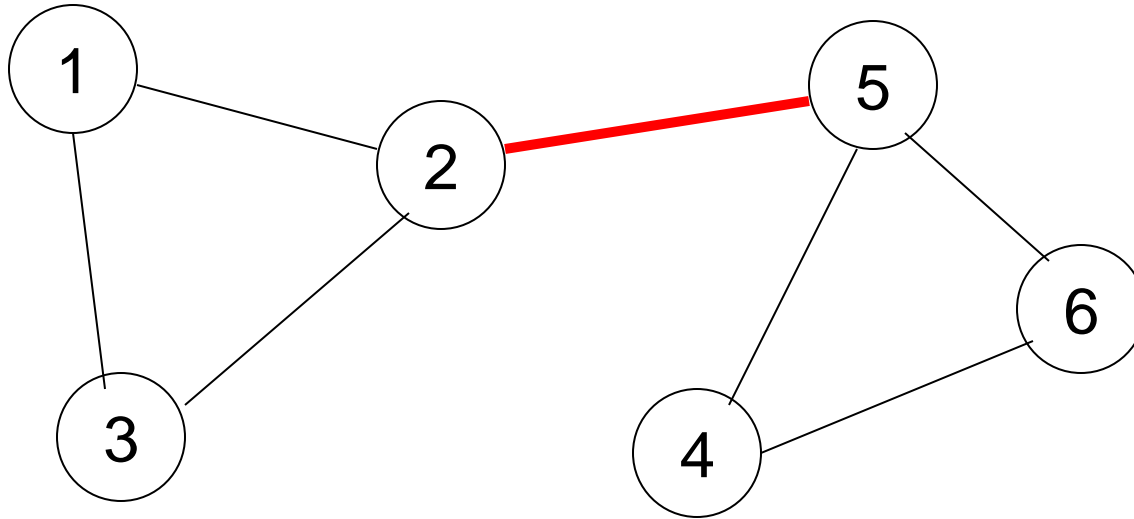
```

DFS_VISIT_AP(G, u)
    time=time+1
    u.d=time
    u.color=GRAY
    u.low=u.d
    for each v in G.Adj[u]
        if v.color==WHITE
            v.pi=u
            DFS_VISIT_AP(G, v)
            if (u.pi==NIL)
                if (v is second son of u)
                    "u is AP" // Case 1
            else
                u.low=min(u.low, v.low)
                if (v.low>=u.d)
                    "u is AP" // Case 2
        else if ((v<>u.pi) and (v.d <u.d))
            u.low=min(u.low, v.d)
    u.color=BLACK
    time=time+1
    u.f=time

```



# Bridge edges – Example



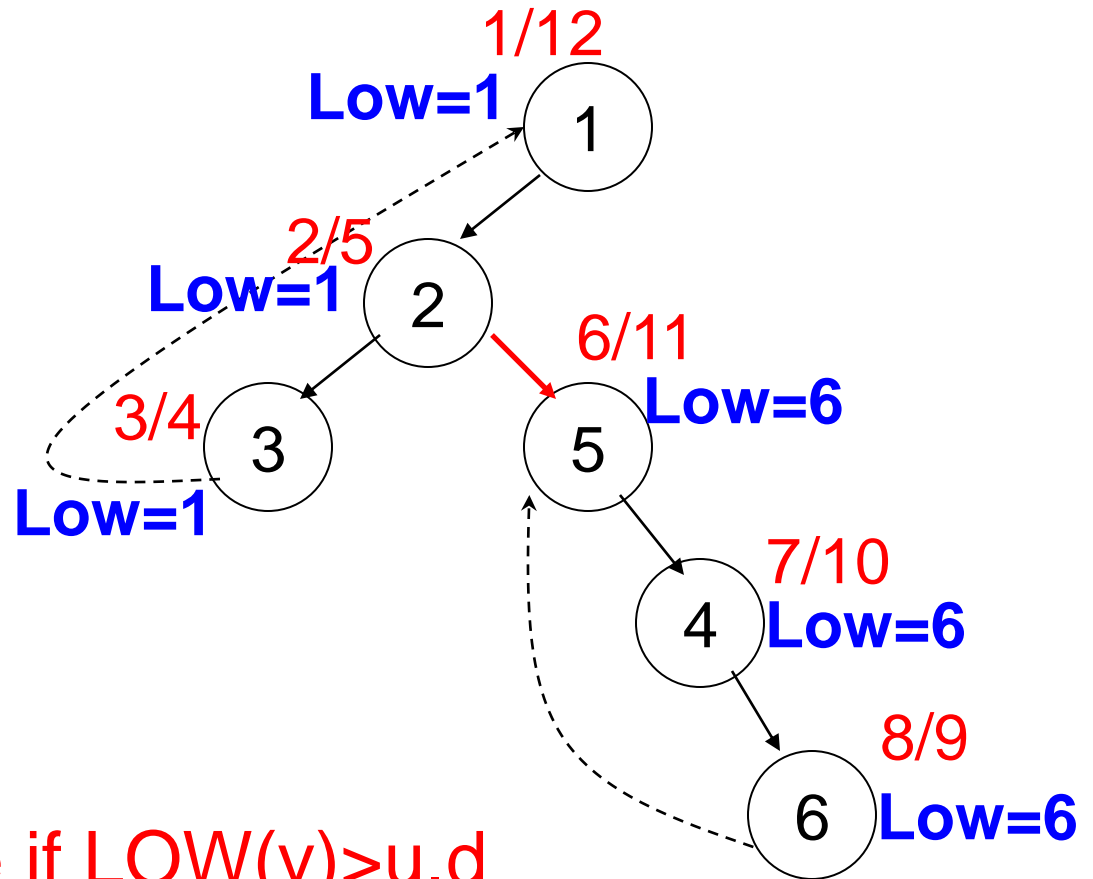
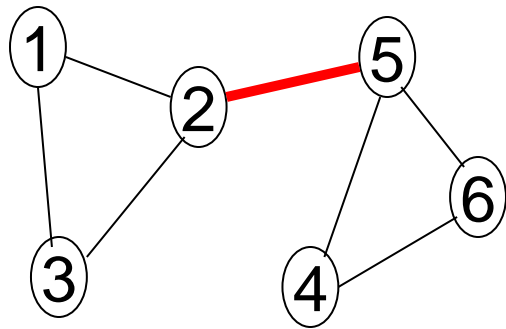
# How to find all bridges ?

- **Brute-force approach:** one by one remove all edges and see if removal of an edge causes the graph to disconnect:
  - For every edge  $e$ , do :
    - Remove  $e$  from graph
    - See if the graph remains connected (use BFS or DFS)
    - If graph is disconnected, add  $e$  to B list
    - Add  $e$  back to the graph
- Time complexity of above method is  $O(m*(n+m))$  for a graph represented using adjacency list.
- Can we do better?

# How to find all bridges ?

- **DFS- approach:**
- An edge of  $G$  is a bridge if and only if it does not lie on any simple cycle of  $G$ .
- if some vertex  $u$  has a back edge pointing to it, then no edge below  $u$  in the DFS tree can be a bridge. The reason is that each back edge gives us a cycle, and no edge that is a member of a cycle can be a bridge.
- if we have a vertex  $v$  whose parent in the DFS tree is  $u$ , and no ancestor of  $v$  has a back edge pointing to it, then  $(u, v)$  is a bridge.

# Finding bridges by DFS



(u,v) is a bridge if  $LOW(v) > u.d$

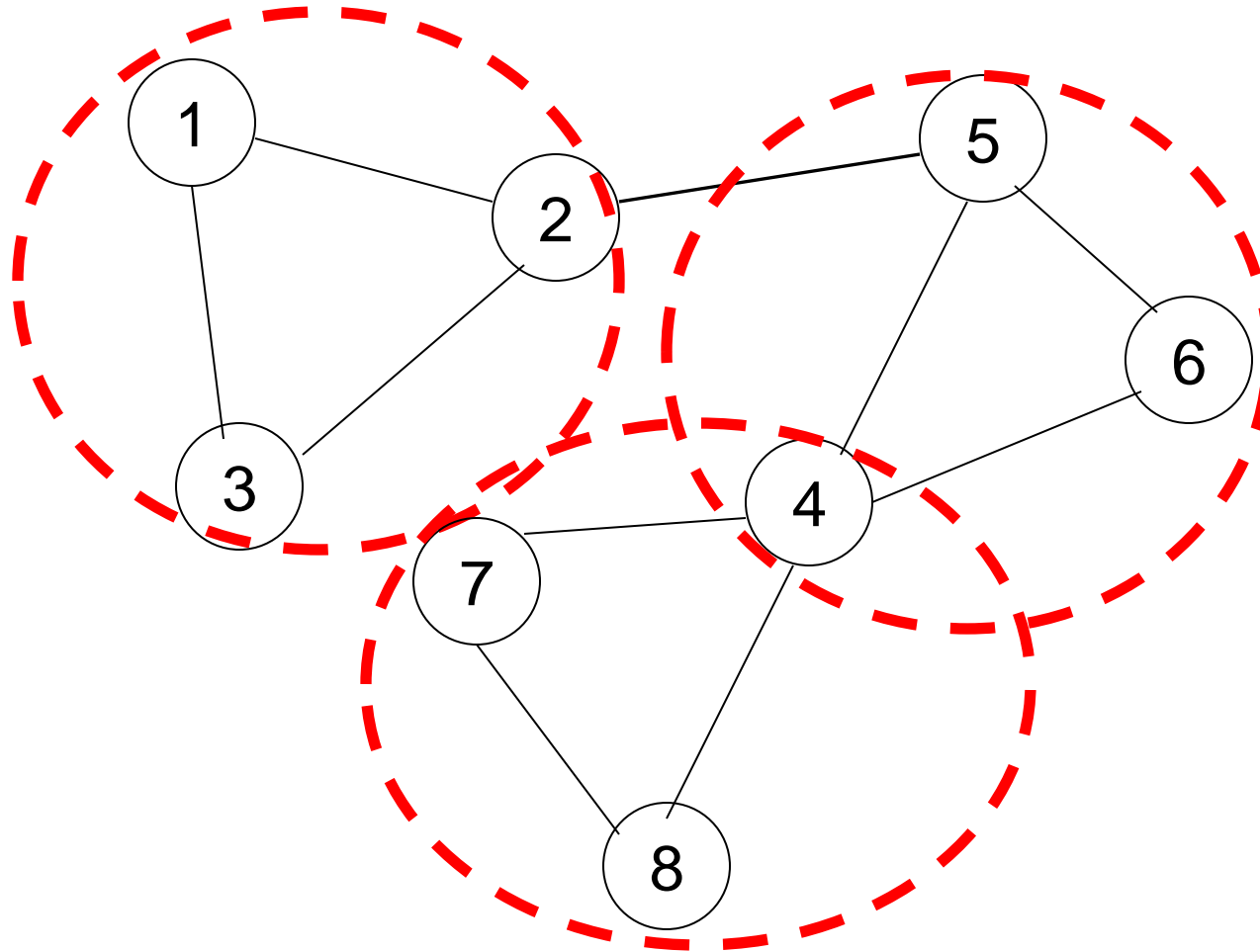
```

DFS_VISIT_Bridges(G, u)
    time=time+1
    u.d=time
    u.color=GRAY
    u.low=u.d
    for each v in G.Adj[u]
        if v.color==WHITE
            v.pi=u
            DFS_VISIT_AP(G, v)

            u.low=min(u.low, v.low)
            if (v.low>u.d)
                "(u,v) is Bridge"
        else if ((v<>u.pi) and (v.d <u.d))
            u.low=min(u.low, v.d)
    u.color=BLACK
    time=time+1
    u.f=time

```

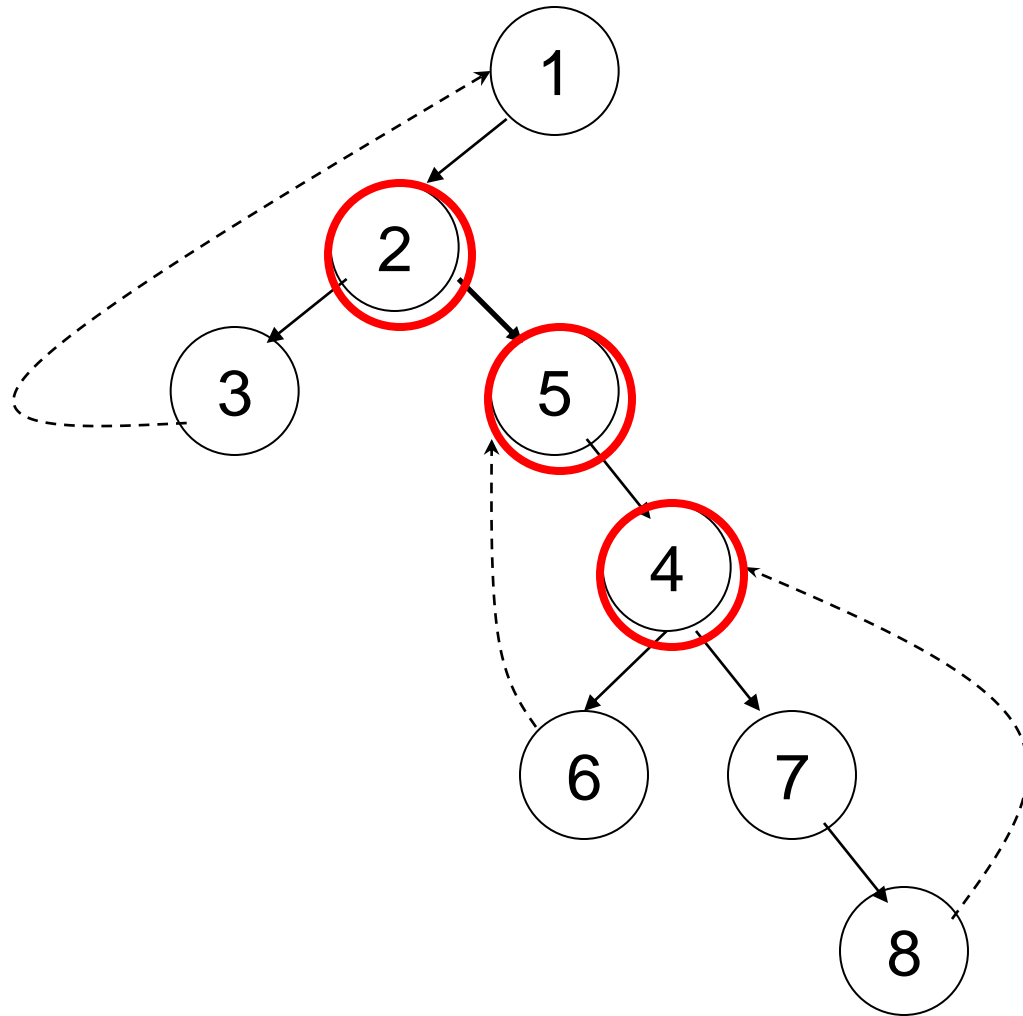
# Biconnected components – Example



# Finding biconnected components

- Two biconnected components cannot have a common edge, but they can have a common vertex
  - > We will mark the edges with an id of their biconnected component
- The common vertex of several biconnected components is an articulation point
- The articulation points separate the biconnected components of a graph. If the graph has no articulation points, it is biconnected
  - > We will try to identify the biconnected components while searching for articulation points

# Finding biconnected components





# Finding biconnected components

- *Algorithm principle:*
  - *During DFS, use a stack to store visited edges (tree edges or back edges)*
  - *After we finish the recursive search from a child  $v$  of a vertex  $u$ , we check if  $u$  is an articulation point for  $v$ . If it is, we output all edges from the stack until  $(u,v)$ . These edges form a biconnected component*
  - *When we return to the root of the DFS-tree, we have to output the edges even if the root is no articulation point (graph may be biconnecx) – we will not test the case of the root being an articulation point*

```

DFS_VISIT_BiconnectedComp(G, u)
    time=time+1
    u.d=time
    u.color=GRAY
    u.low=u.d
    u.AP=false
    for each v in G.Adj[u]
        if v.color==WHITE
            v.pi=u
            EdgeStack.push(u,v)
            DFS_VISIT_AP(G, v)
            u.low=min(u.low, v.low)
            if (v.low>=u.d)
                pop all edges from EdgeStack until (u,v)
                these are the edges of a Biconn Comp
        else if ((v<>u.pi) and (v.d <u.d))
            EdgeStack.push(u,v)
            u.low=min(u.low, v.d)

    u.color=BLACK
    time=time+1
    u.f=time

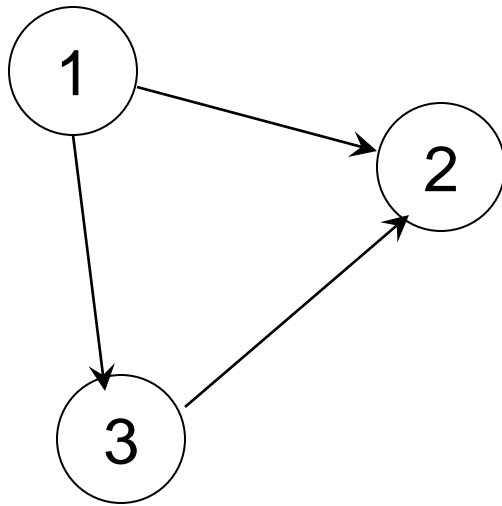
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# Applications of DFS

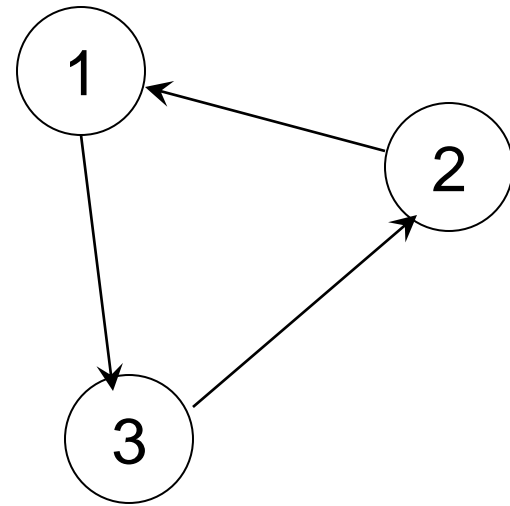
- DFS has many applications
- For undirected graphs:
  - Connected components
  - Connectivity properties
- For directed graphs:
  - Finding cycles
  - Topological sorting
  - Connectivity properties: Strongly connected components

# Directed Acyclic Graphs

- A *directed acyclic graph* or *DAG* is a directed graph with no directed cycles



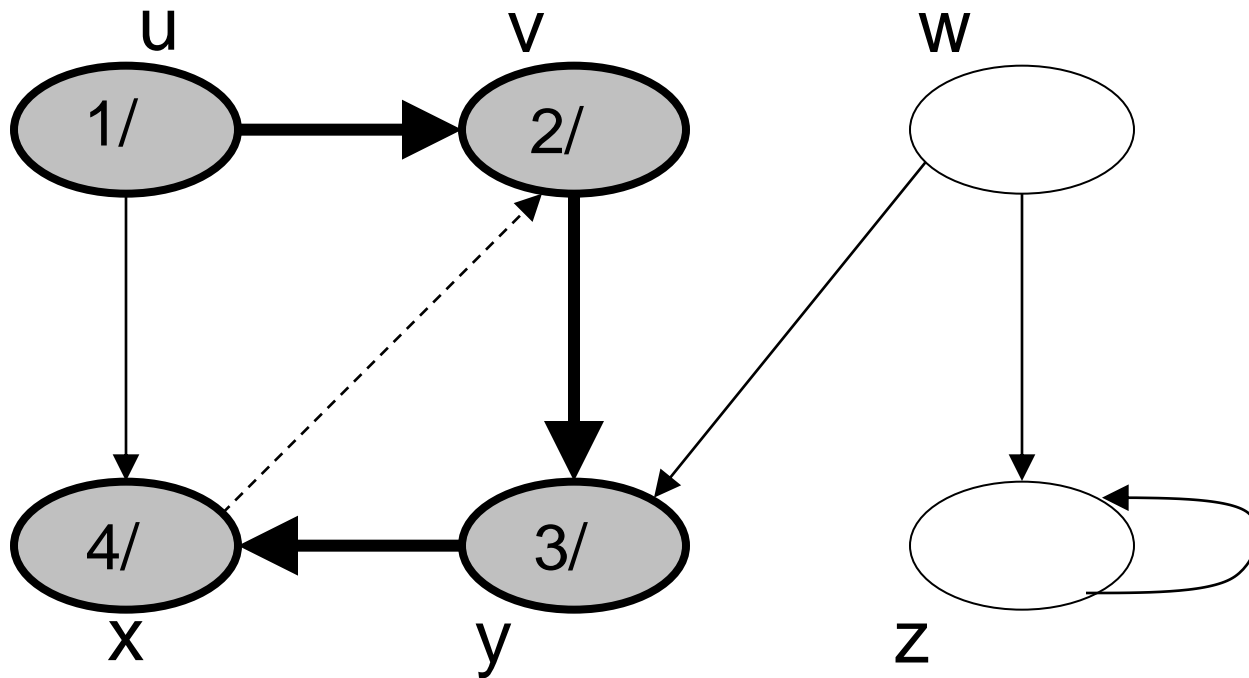
acyclic



cyclic

# DFS and cycles in graph

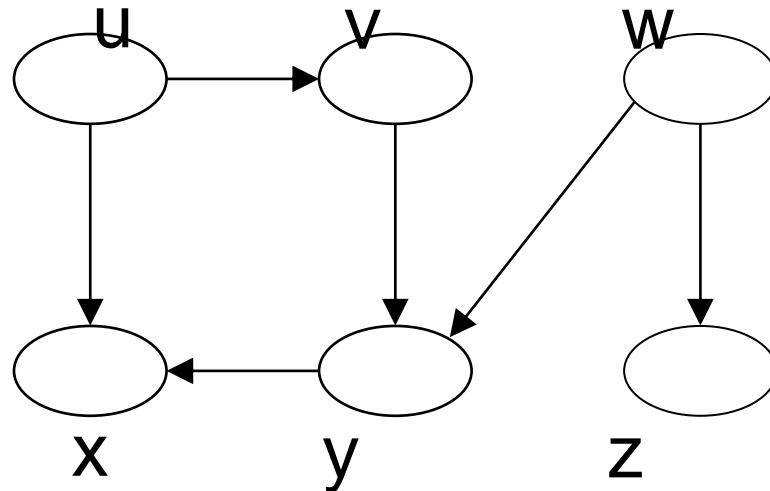
- A graph  $G$  is acyclic if a DFS of  $G$  results in no back edges



# Topological Sort

- *Topological sort* of a DAG (Directed Acyclic Graph):
  - Linear ordering of all vertices in a DAG  $G$  such that vertex  $u$  comes before vertex  $v$  if there is an edge  $(u, v) \in G$
  - This property is important for a class of *scheduling* problems

# Example – Topological Sorting



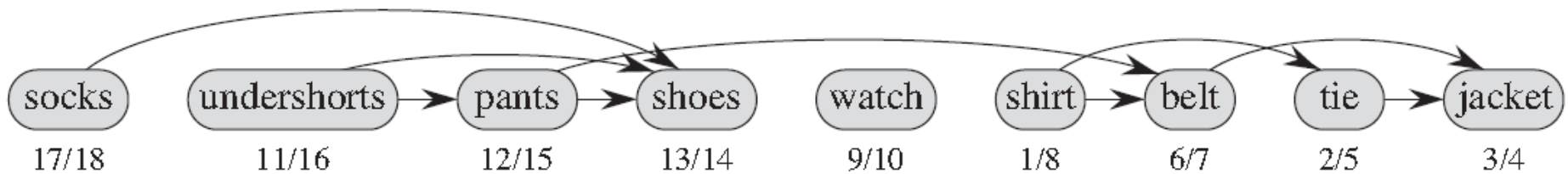
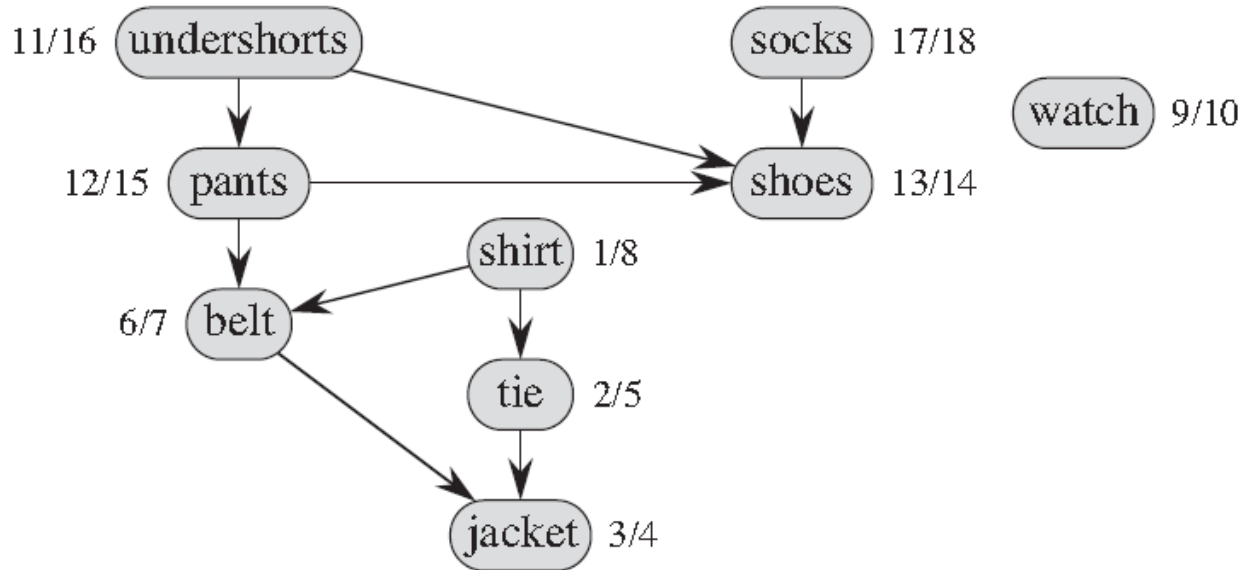
- There can be several orderings of the vertices that fulfill the topological sorting condition:
  - u, v, w, y, x, z
  - w, z, u, v, y, x
  - w, u, v, y, x, z
  - ...

# Topological Sorting

- *Algorithm principle:*
  1. *Call DFS to compute finishing time  $v.f$  for every vertex*
  2. *As every vertex is finished (BLACK) insert it onto the front of a linked list*
  3. *Return the list as the linear ordering of vertices*
  
- Time:  $O(V+E)$



# Using DFS for Topological Sorting



# Correctness of Topological Sort

- Claim:  $(u, v) \in G \Rightarrow u.f > v.f$ 
  - When  $(u, v)$  is explored,  $u$  is grey
    - $v = \text{grey} \Rightarrow (u, v)$  is back edge. Contradiction, since  $G$  is DAG and contains no back edges
    - $v = \text{white} \Rightarrow v$  becomes descendent of  $u \Rightarrow v.f < u.f$  (since it must finish  $v$  before backtracking and finishing  $u$ )
    - $v = \text{black} \Rightarrow v$  already finished  $\Rightarrow v.f < u.f$

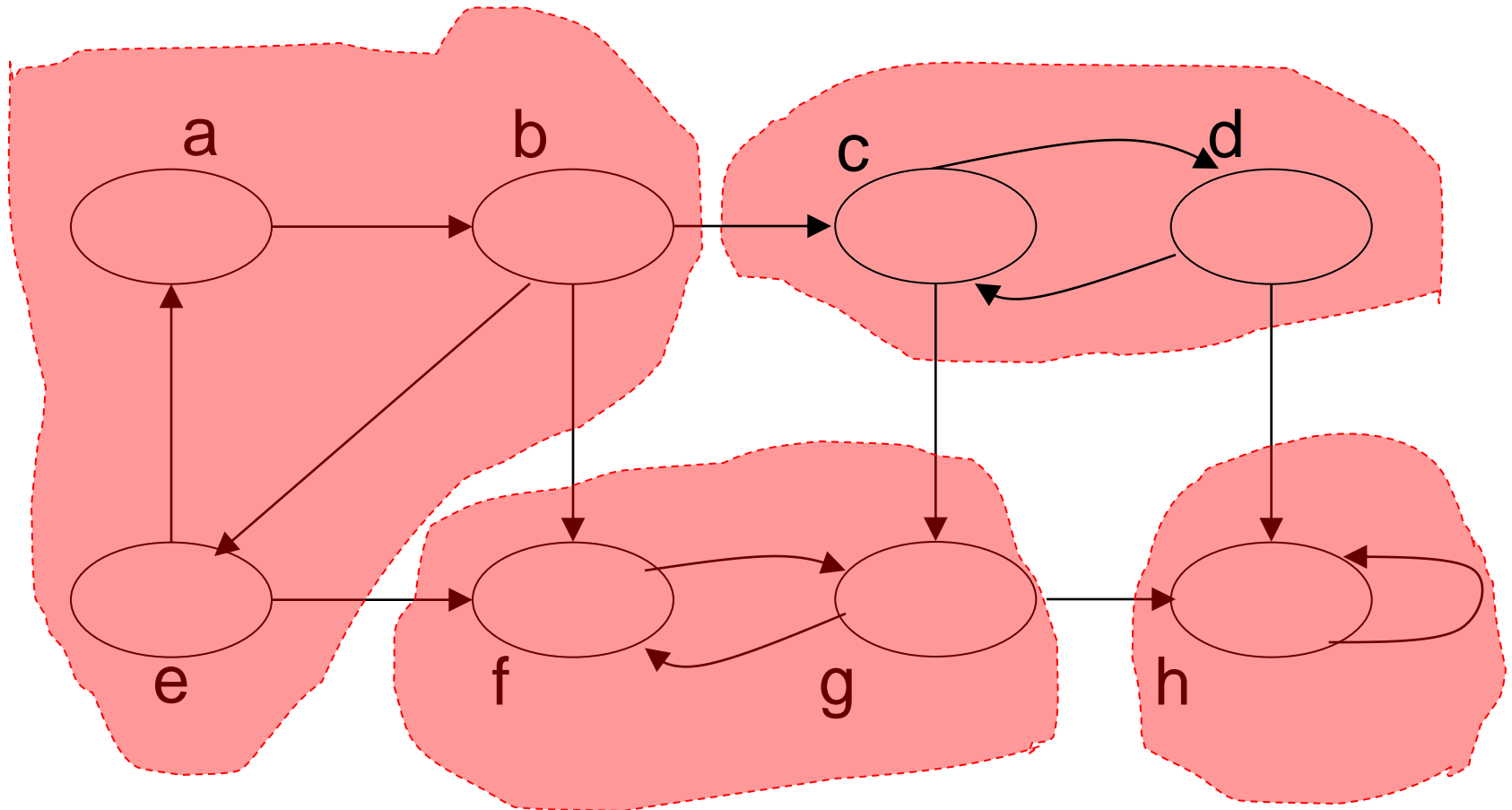
# Applications of DFS

- DFS has many applications
- For undirected graphs:
  - Connected components
  - Connectivity properties
- For directed graphs:
  - Finding cycles
  - Topological sorting
  - Connectivity properties: Strongly connected components

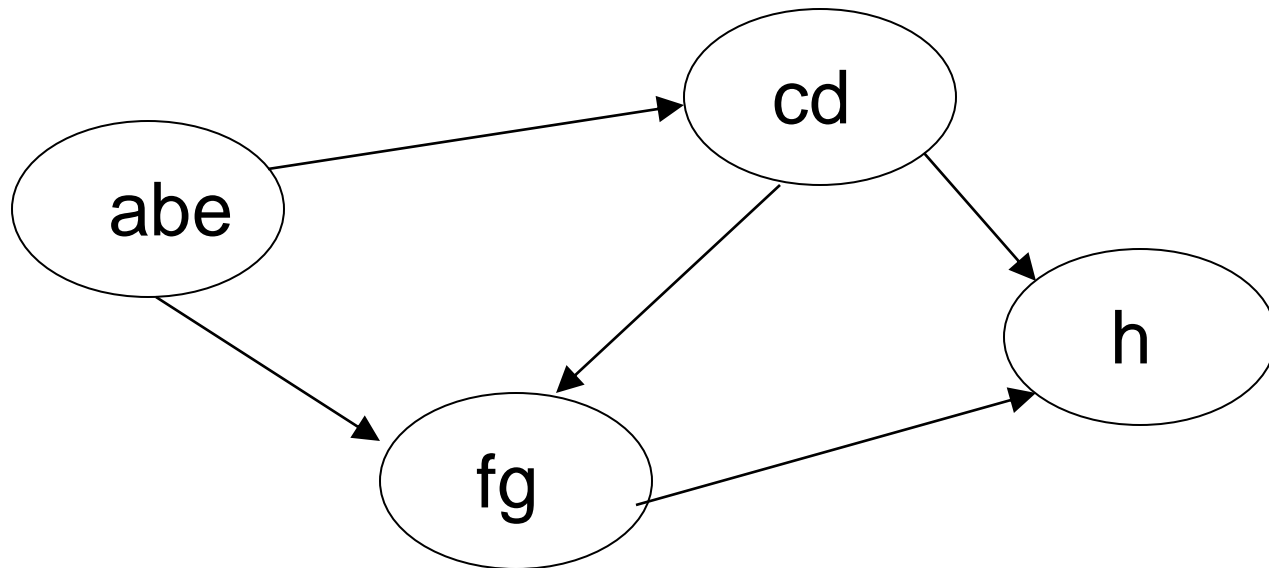
# Strongly Connected Components

- A strongly connected component of a directed graph  $G=(V,E)$  is a maximal set of vertices  $C$  such that for every pair of vertices  $u$  and  $v$  in  $C$ , both vertices  $u$  and  $v$  are reachable from each other.

# Strongly connected components - Example



# Strongly connected components – Example – The Component Graph



The Component Graph results by collapsing each strong component into a single vertex

# The Component Graph

- Property: The Component Graph is a DAG (directed acyclic graph)

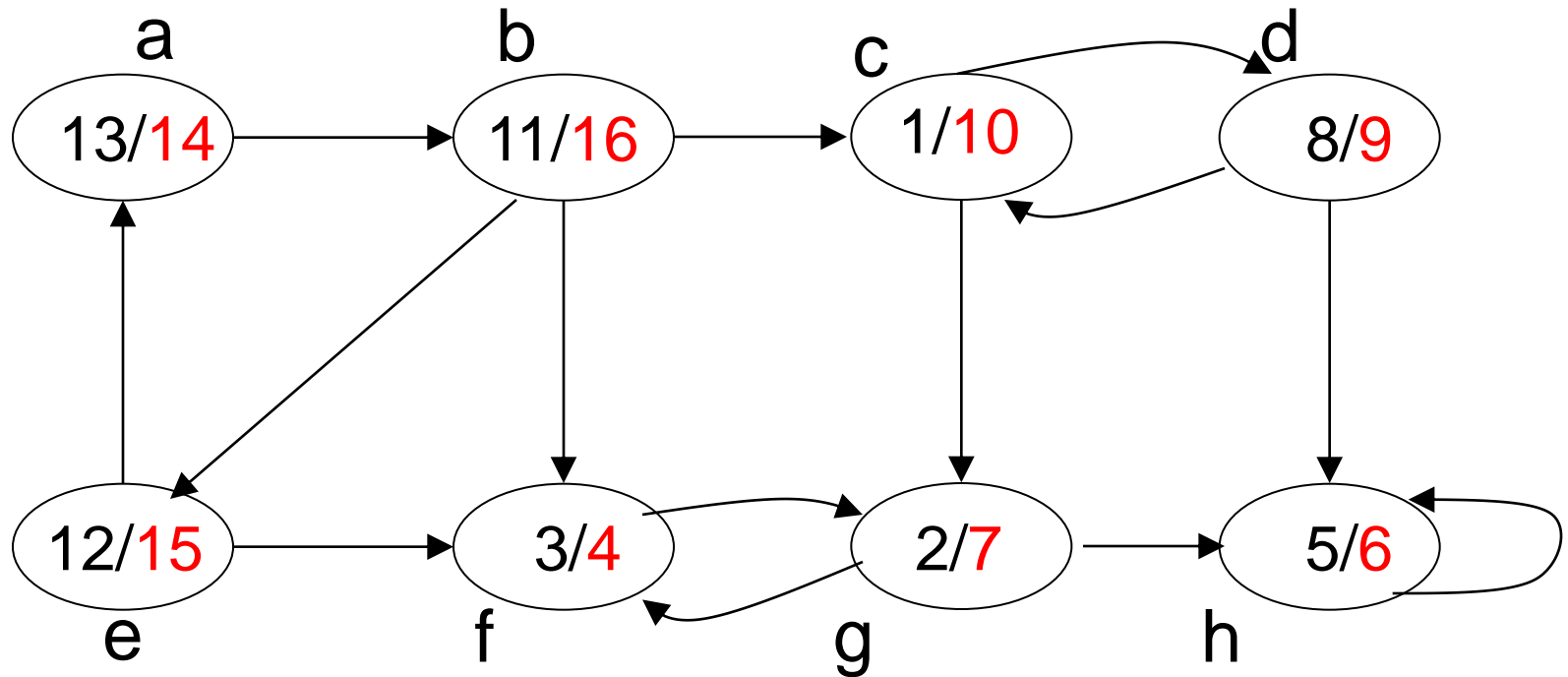
# Strongly connected components

- *Strongly connected components of a directed graph  $G$*
- *Algorithm principle:*
  1. *Call  $DFS(G)$  to compute finishing times  $u.f$  for every vertex  $u$*
  2. *Compute  $GT$*
  3. *Call  $DFS(GT)$ , but in the main loop of  $DFS$ , consider the vertices in order of decreasing  $u.f$  as computed in step 1*
  4. *Output the vertices of each  $DFS$ -tree formed in step 3 as the vertices of a strongly connected component*



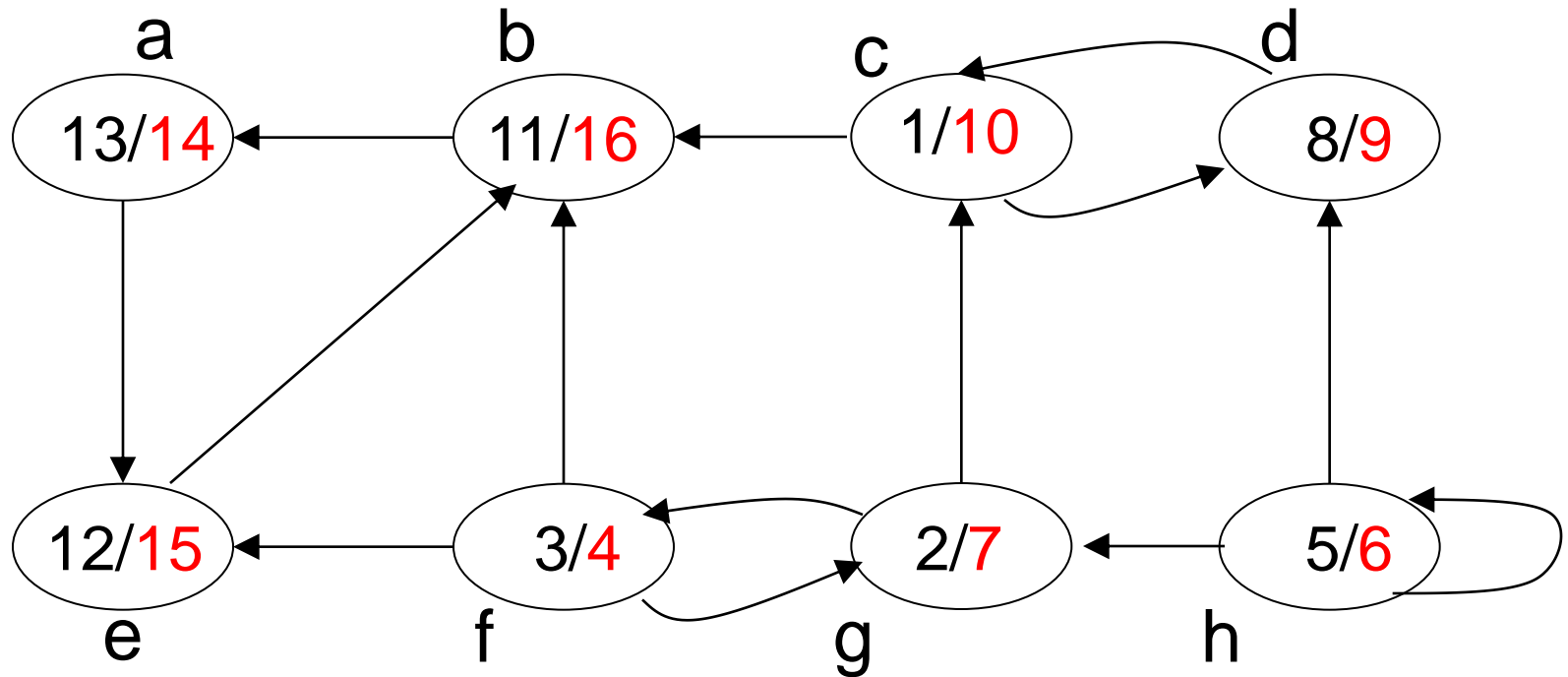
# Strongly connected components - Example

Step1: call DFS(G), compute **u.f** for all u



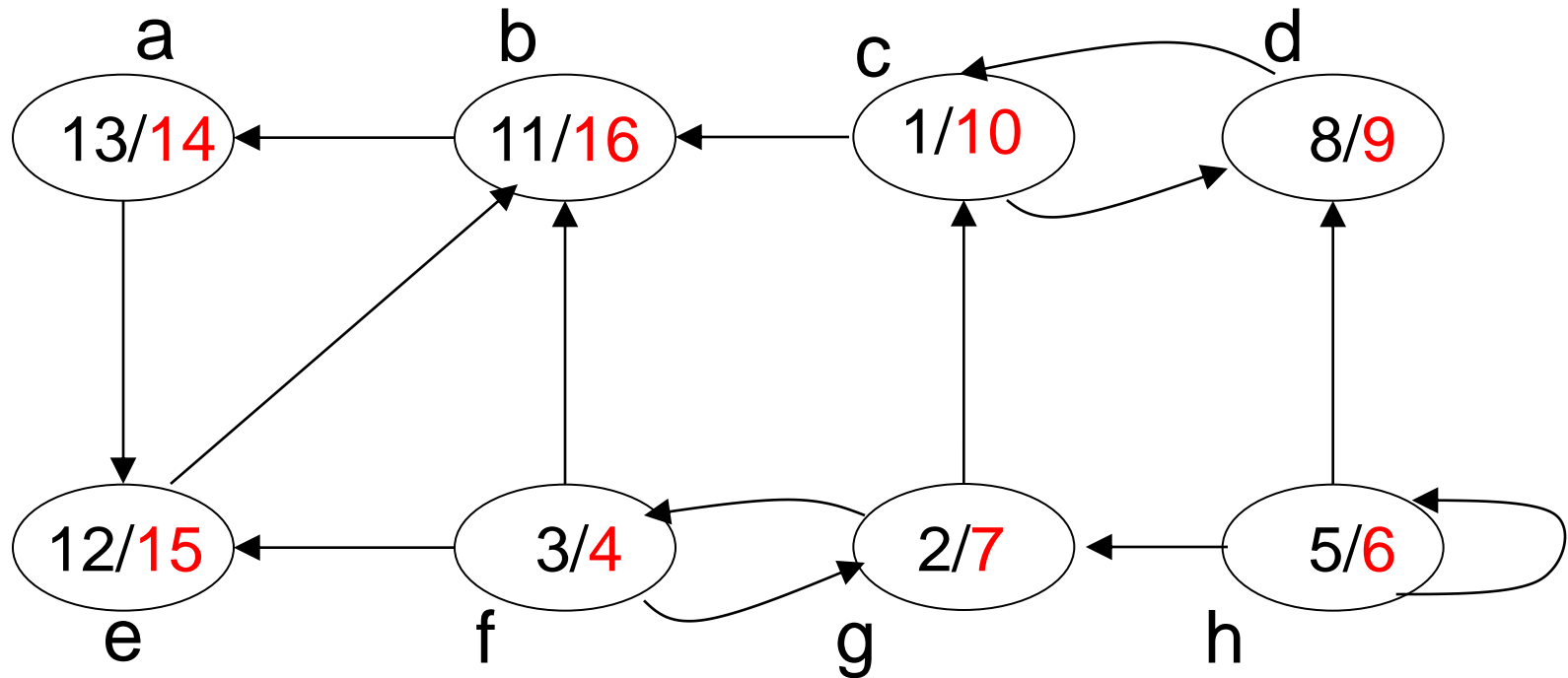
# Strongly connected components - Example

Step2: compute GT



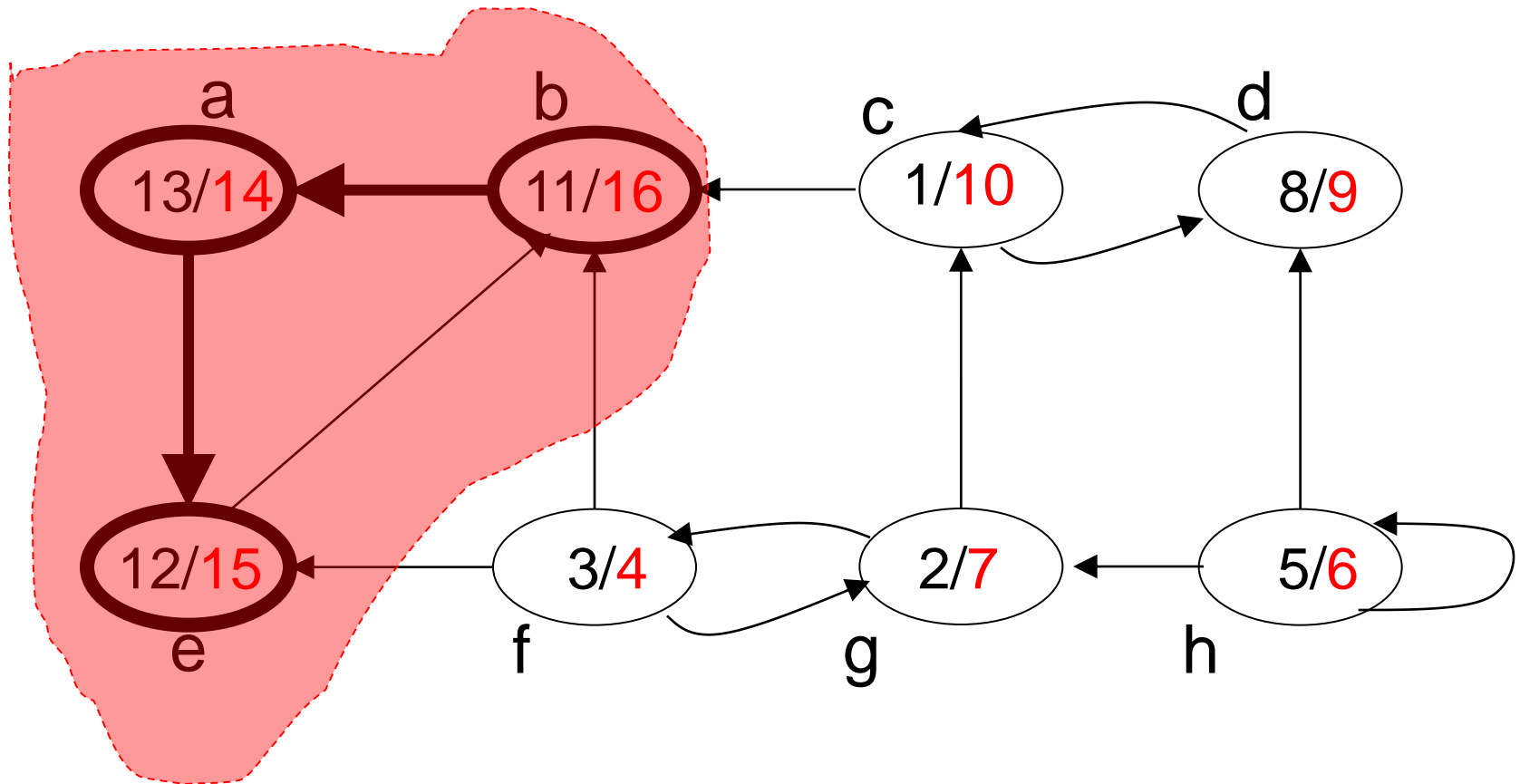
# Strongly connected components - Example

Step3: call DFS(GT), consider vertices in order of decreasing **u.f**



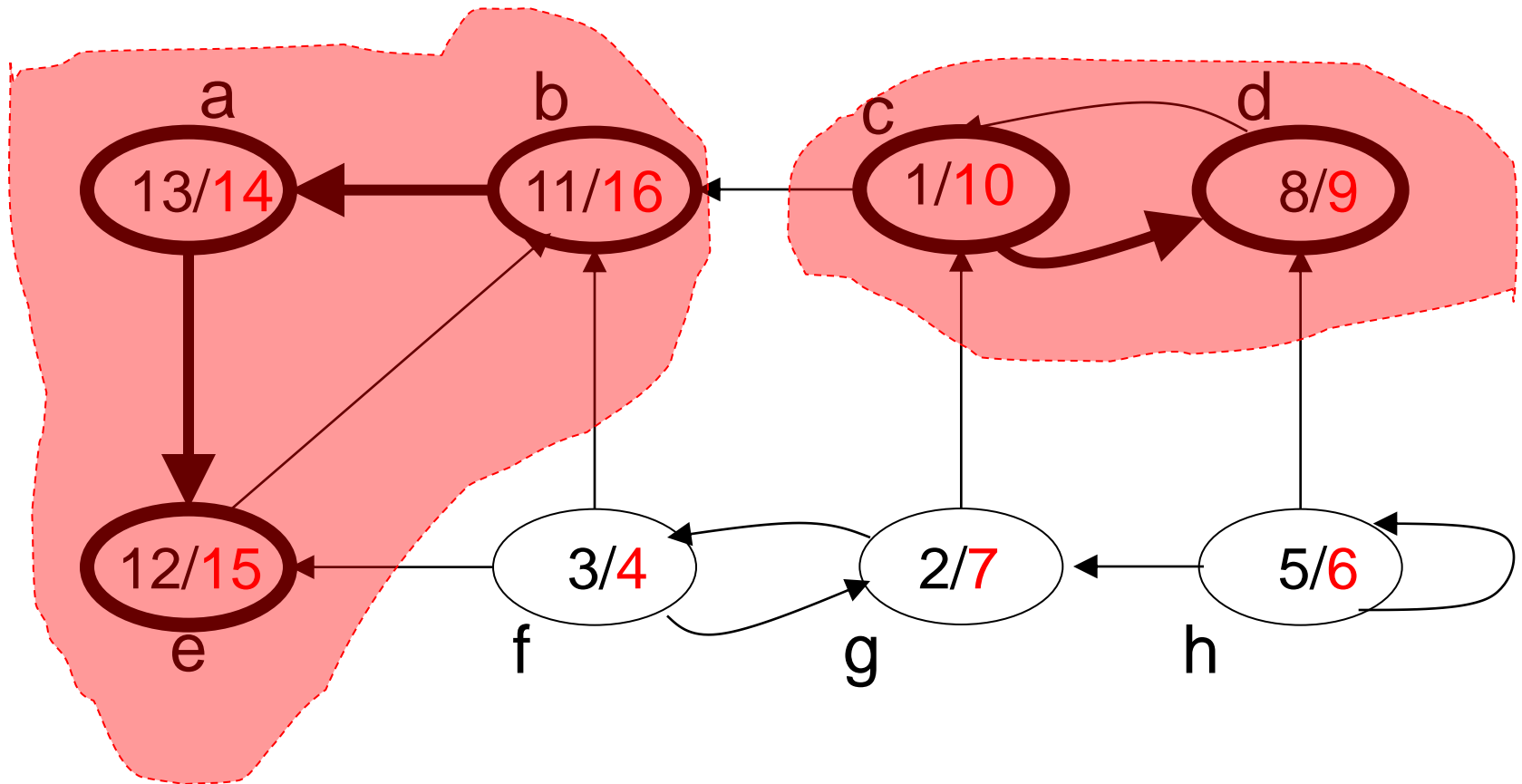
# Strongly connected components - Example

Step3: call DFS(GT), consider vertices in order of decreasing **u.f**



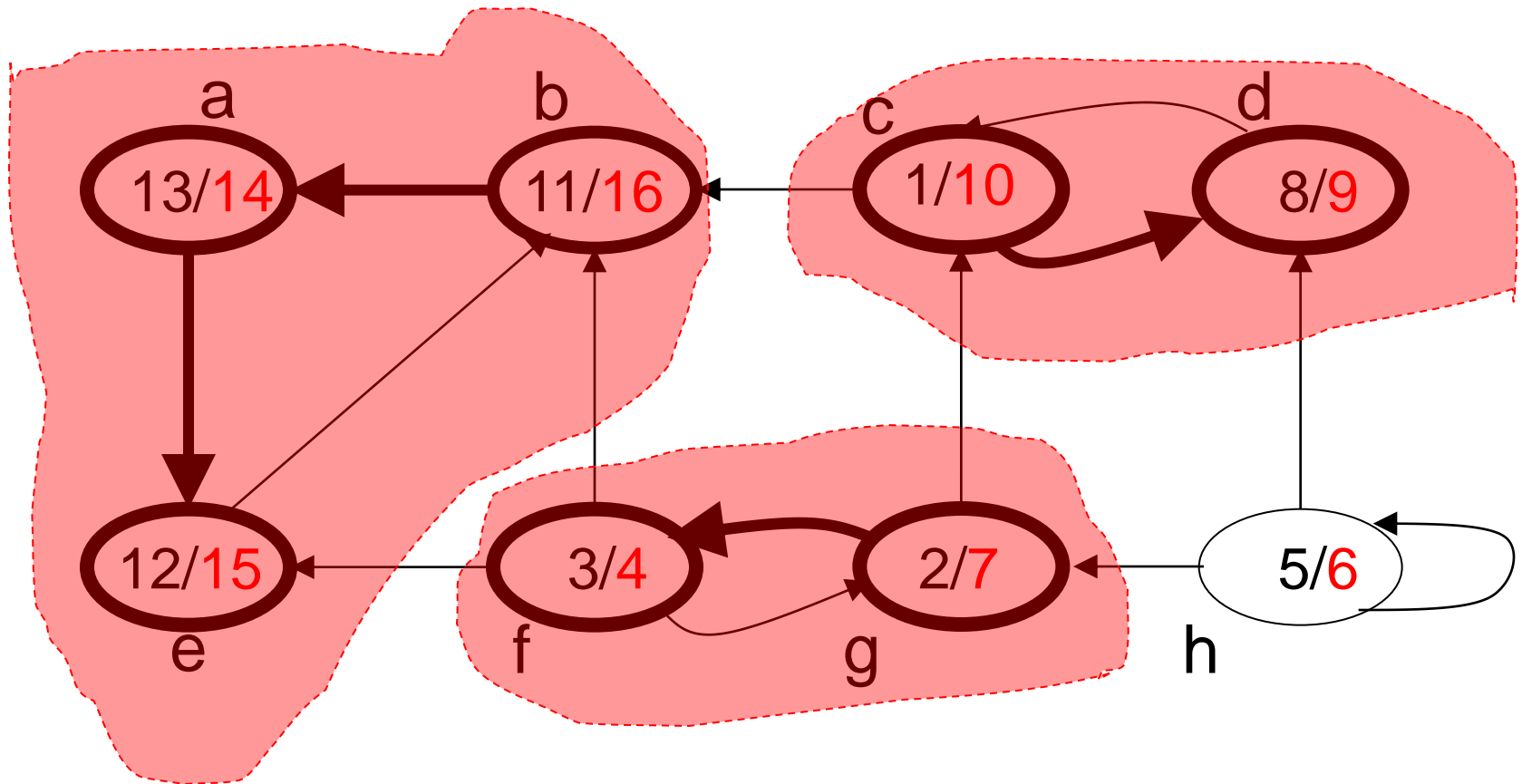
# Strongly connected components - Example

Step3: call DFS(GT), consider vertices in order of decreasing **u.f**



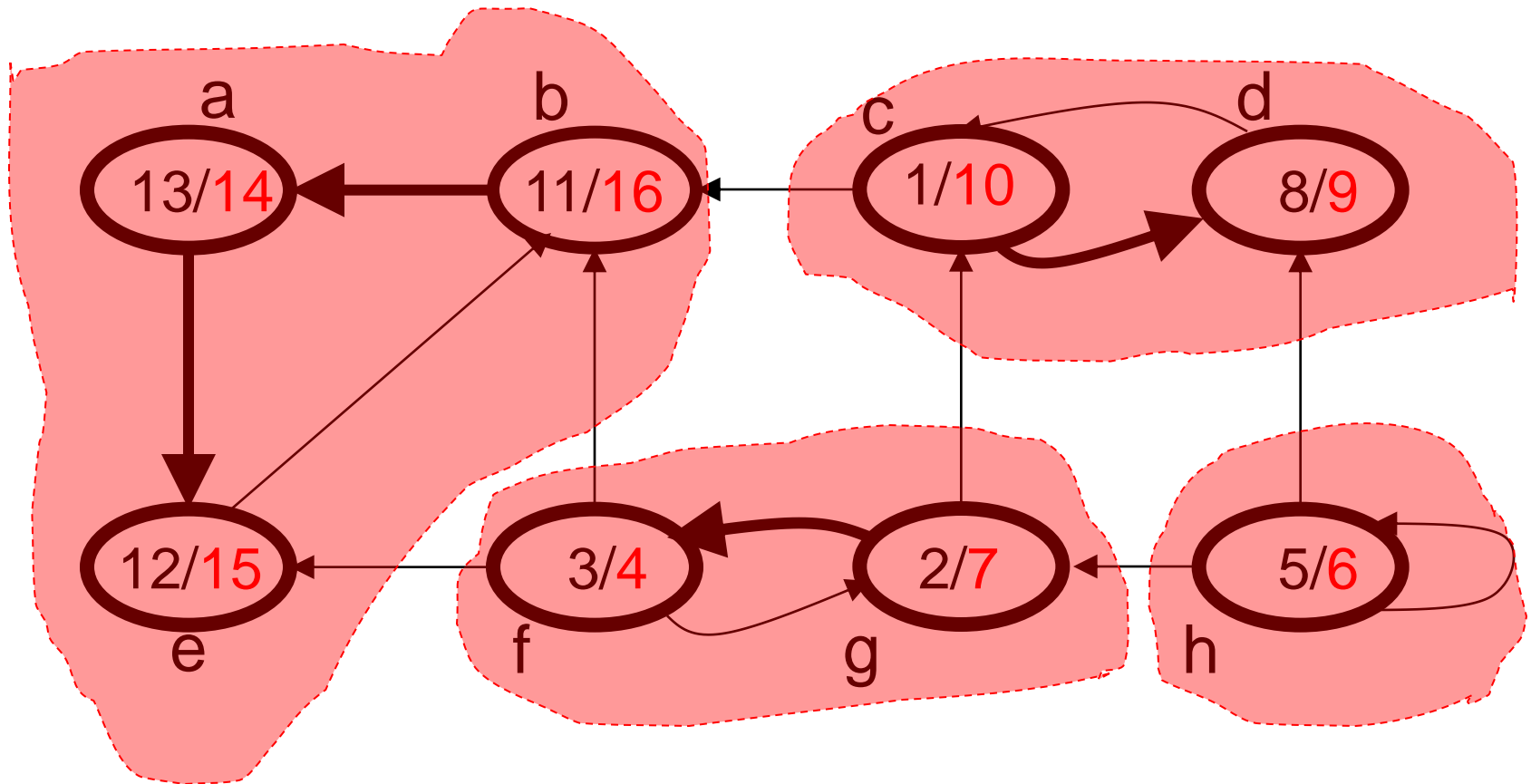
# Strongly connected components - Example

Step3: call DFS(GT), consider vertices in order of decreasing **u.f**



# Strongly connected components - Example

Step3: call DFS(GT), consider vertices in order of decreasing **u.f**



# Proof of Strong Components Algorithm

- *Theorem*

The Algorithm presented before finds the strong components of  $G$ .

- *Proof*

We must show that a set of vertices forms a strong components *if and only if* they are vertices of a tree in the DFS-forest of  $G^T$



# Proof (cont)

- *Suppose that*  $v, w$  are vertices in the same strong component
- There is a DFS search in GT which starts at a vertex  $r$  and reaches  $v$ .
- Since  $v, w$  are in the same strong component, there is a path from  $v$  to  $w$  and from  $w$  to  $v$ .  $\Rightarrow$  then  $w$  will also be reached in this DFS search
- $\Rightarrow$  Vertices  $v, w$  belong to the same spanning tree of GT.

# Proof (cont)

- *Suppose*  $v, w$  are two vertices in the same DFS-spanning tree of  $GT$ .
- Let  $r$  be the root of that spanning tree.
- Then there exists paths in  $GT$  *from*  $r$  to each of  $v$  and  $w$ .
- So there exists paths in  $G$  *to*  $r$  from each of  $v$  and  $w$ .

# Proof (cont)

- We will prove that there are paths in  $G$  from  $r$  to  $v$  and  $w$  as well
- We know that  $r.f > v.f$  (when  $r$  was selected as a root of its DFS-tree)
- If there is no path from  $r$  to  $v$ , then it is also no path from  $v$  to  $r$ , which is a contradiction
- Hence, there exists path in  $G$  from  $r$  to  $v$ , and similar argument gives path from  $r$  to  $w$ .
- So  $v$  and  $w$  are in a cycle of  $G$  and must be in the same strong component.

# Summary

- Applications of Depth-First Search
  - Undirected graphs:
    - Connected components, articulation points, bridges, biconnected components
  - Directed graphs:
    - Cyclic/acyclic graphs
    - Topological sort
    - Strongly connected components