

# CSE 417: Algorithms and Computational Complexity

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## Graphs & Graph Algorithms II

Autumn 2002  
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## Depth-First Search

- Follow the first path you find as far as you can go
- Back up to last unexplored edge when you reach a dead end, then go as far you can
- Naturally implemented using recursive calls or a stack

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## DFS(v) – Recursive version

Global Initialization: mark all vertices "undiscovered"

```

DFS(v)
  mark v "discovered"
  for each edge {v,x}
    if (x is "undiscovered")
      DFS(x)
  end for
  mark v "fully-explored"
  
```

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## DFS(v)

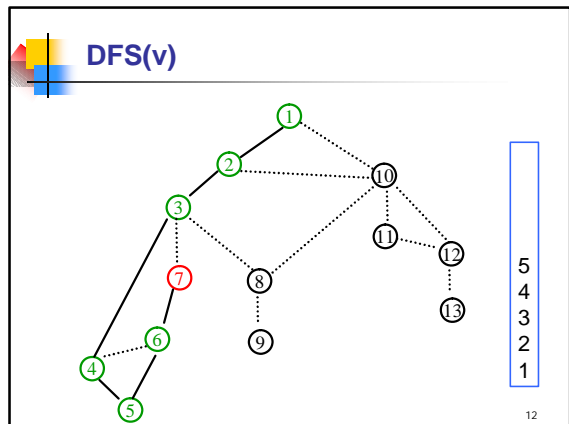
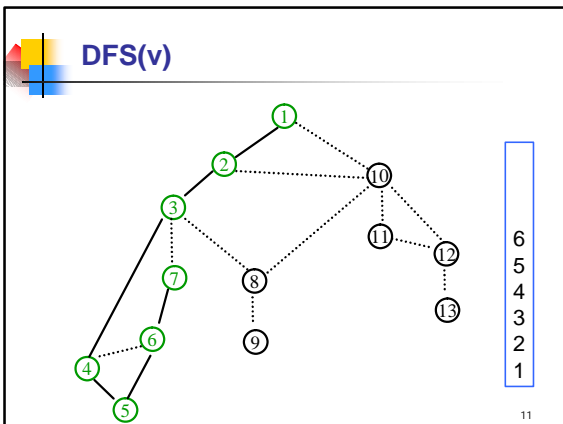
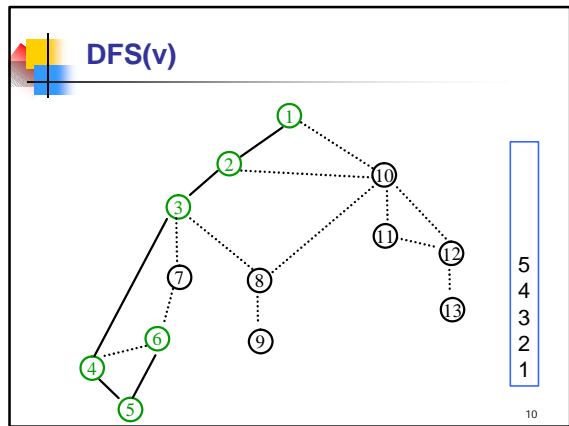
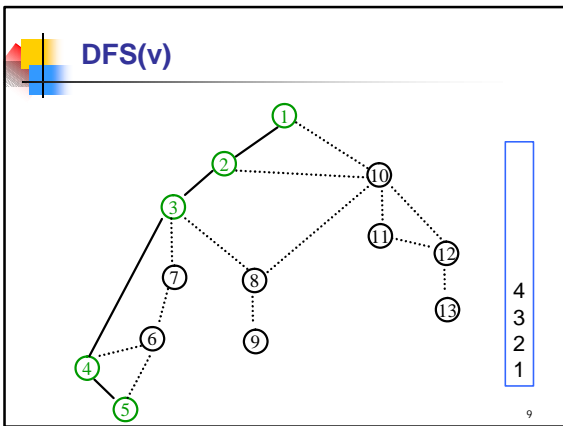
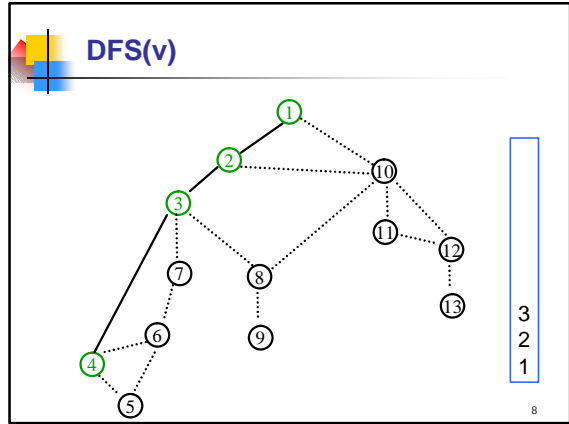
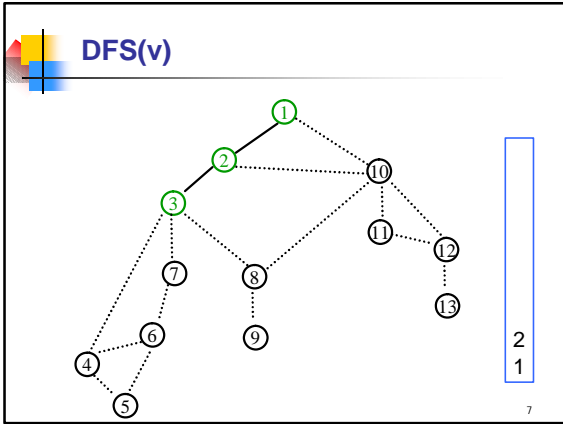
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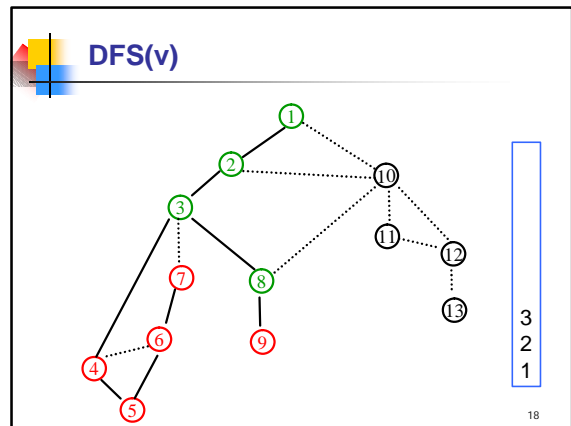
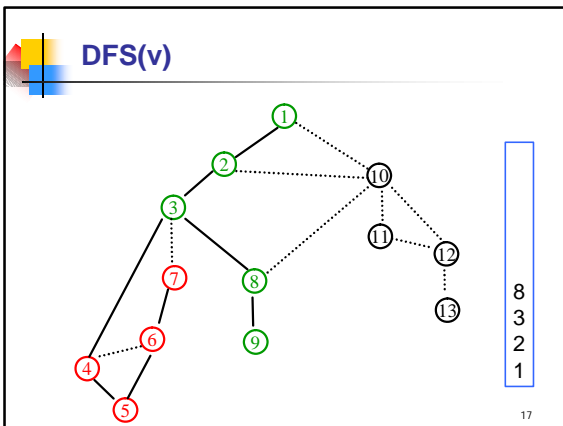
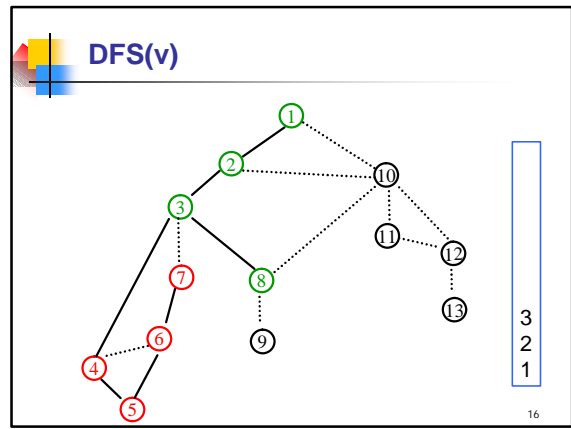
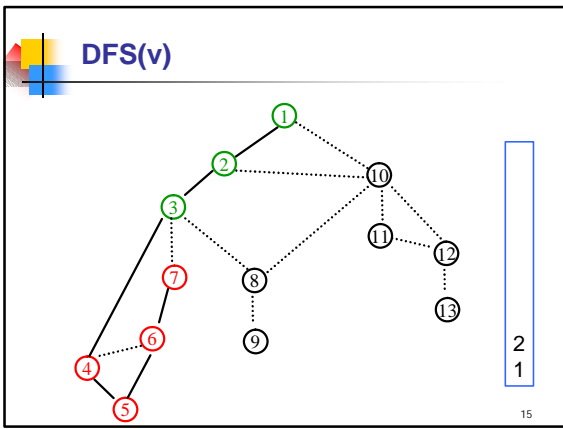
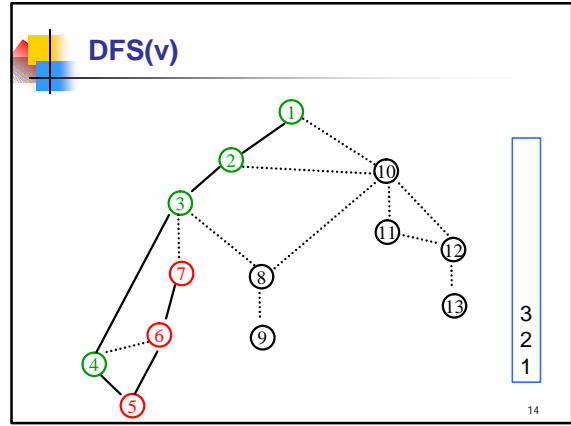
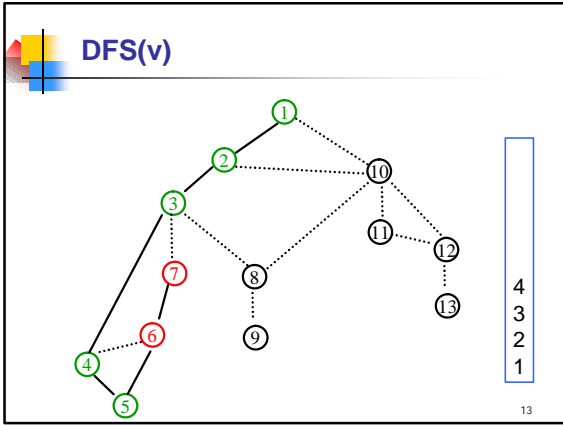
## DFS(v)

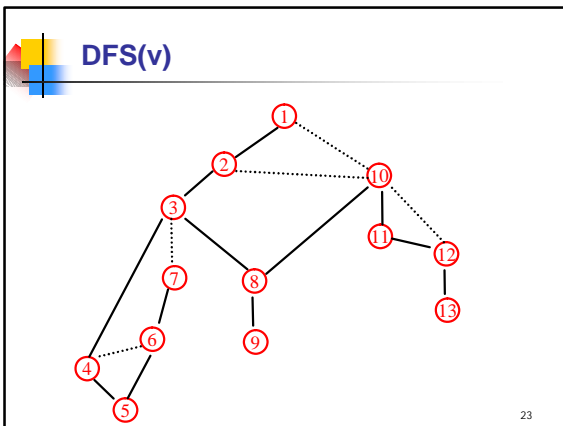
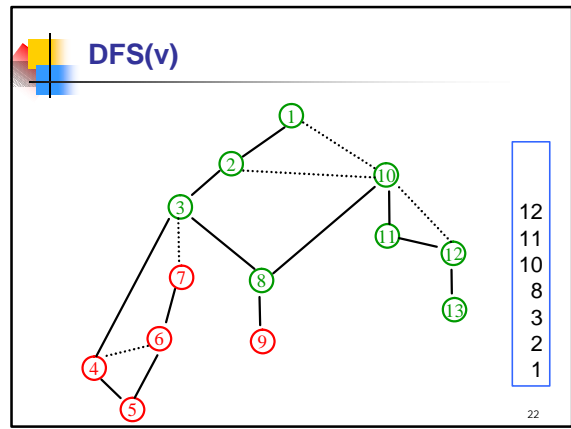
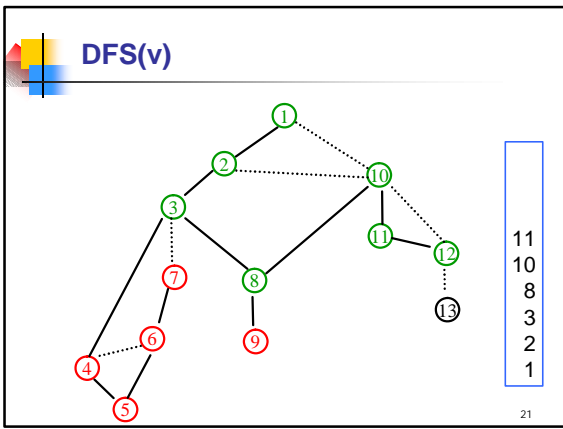
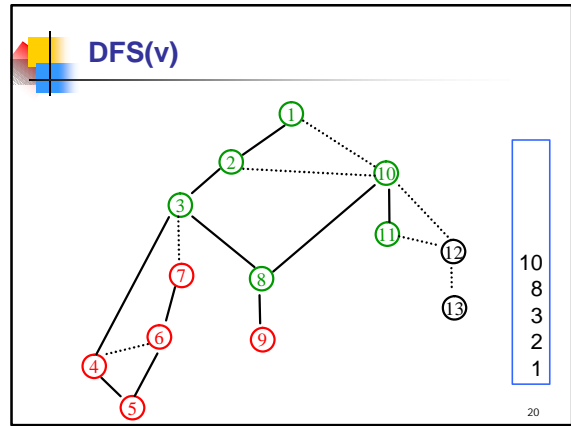
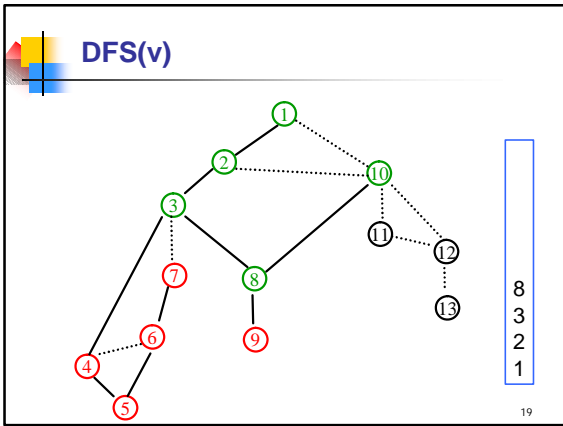
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## DFS(v)

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**Properties of DFS(v)**

- Like **BFS(v)**:
  - **DFS(v)** visits **x** if and only if there is a path in **G** from **v** to **x**
  - Edges into undiscovered vertices define a **tree**
    - "depth first spanning tree" of **G**
- Unlike the **BFS tree**:
  - the **DFS spanning tree** isn't minimum depth
  - its levels don't reflect min distance from the root
  - non-tree edges never join vertices on the same or adjacent levels
- BUT...

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### Non-tree edges

- All non-tree edges join a vertex and one of its descendants/ancestors in the DFS tree
- No cross edges!

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### Application: Articulation Points

- A node in an undirected graph is an **articulation point** iff removing it disconnects the graph
- articulation points represent vulnerabilities in a network – single points whose failure would split the network into 2 or more disconnected components

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### Articulation Points

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### Articulation Points from DFS

- Non-tree edges eliminate articulation points
- Root node is articulation point  $\Leftrightarrow$  it has more than one child
- Leaf nodes are never articulation points
- Other nodes  $u$  are articulation points  $\Leftrightarrow$ 
  - no non-tree edges going from some child of  $u$  to above  $u$  in the tree

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### Articulation Points from DFS

- For each vertex  $v$  compute
  - $small(v)$ 
    - the smallest number of a node pointed at by any descendant of  $v$  in the DFS tree (including  $v$  itself)
    - Can compute  $small(v)$  for every  $v$  during DFS at minimal extra cost
- Non-leaf, non-root node  $u$  is an articulation point  $\Leftrightarrow$  for some child  $v$  of  $u$ 
  - $small(v) = DFSnumber(u)$
  - Easy to compute and check during DFS

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### DFS(v) – Recursive version

Global Initialization:  
 mark all vertices  $u$  "undiscovered" via  $dfsnum[u] \leftarrow -1$   
 $dfscounter \leftarrow 0$

DFS(v)

```

dfscounter  $\leftarrow$  dfscounter+1
dfsnum[v]  $\leftarrow$  dfscounter // mark v "discovered"
for each edge (v,x)
  if (dfsnum[x] = -1) // x previously undiscovered
    add edge (v,x) to DFS tree
    DFS(x)
// mark v "fully-explored"
  
```

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### DFS(v) for Finding Articulation Points

Global initialization:  $\text{dfsnum}[u] \leftarrow -1$  for all  $u$ ;  $\text{dfscounter} \leftarrow 0$

DFS(v)

```

dfscounter ← dfscounter+1
dfsnum[v] ← dfscounter
small[v] ← dfsnum[v] // initialization
for each edge (v,x)
  if (dfsnum[x] = -1) // x is undiscovered
    DFS(x)
    if (small[x] >= dfsnum[v])
      print "v is an articulation point, separating x"
      small[v] ← min(small[v], small[x])
    else if (x is not v's parent)
      small[v] ← min(small[v], dfsnum[x])
  
```

Check that (v,x) is a back edge (not a tree edge)

Note: need a separate check for the root

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### Articulation Points

DFS #	Small
1	
2	
3	
4	
5	
6	
7	
8	
9	
10	
11	
12	
13	

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### Articulation Points

DFS #	Small	Art
1	1	
2	1	
3	1	Y
4	3	
5	3	
6	3	
7	3	
8	1	Y
9	9	
10	1	Y
11	10	
12	10	Y
13	13	

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### DFS(v) for a directed graph

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### DFS(v)

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### Properties of Directed DFS

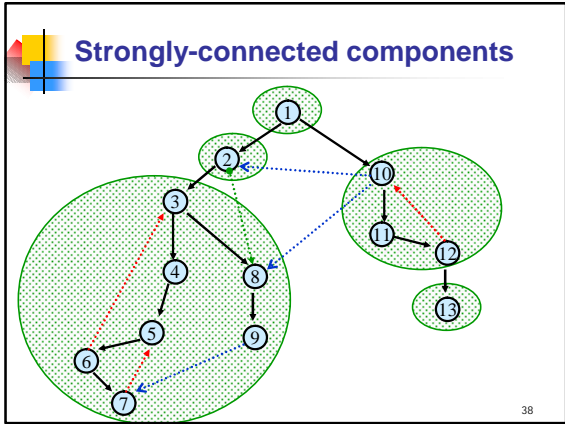
- Before DFS(v) returns, it visits all previously unvisited vertices reachable via directed paths from v
- Every cycle contains a back edge in the DFS tree

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### Strongly-connected components

- In directed graph if there is a path from  $a$  to  $b$  there might not be one from  $b$  to  $a$
- $a$  and  $b$  are **strongly connected** iff there is a path in both directions (i.e. a directed cycle containing both  $a$  and  $b$ )
- Breaks graph into components

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### Uses for SCC's

- Optimizing compilers:
  - SCC's in the program flow graph = "loops"
  - SCC's in call-graph = mutually recursive procedures
- Operating systems: If  $(u,v)$  means process  $u$  is waiting for process  $v$ , SCC's show deadlocks.
- Econometrics: SCC's might show highly interdependent sectors of the economy

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### Directed Acyclic Graphs

- If we collapse each SCC to a single vertex we get a directed graph with no cycles
  - a **directed acyclic graph** or **DAG**
- Many problems on directed graphs can be solved as follows:
  - Compute SCC's and resulting DAG
  - Do one computation on each SCC
  - Do another computation on the overall DAG

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### Simple SCC Algorithm

- $u, v$  in same SCC iff there are paths  $u \rightarrow v$  &  $v \rightarrow u$
- DFS/BFS from every  $u, v$ :
  - Time  $O(nm) = O(n^3)$

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### Better method

- Can compute all the SCC's while doing a single DFS!  $O(n+m)$  time
- We won't do the full algorithm but will give some ideas

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### Definition

The **root** of an SCC is the first vertex in it visited by DFS.

Equivalently, the root is the vertex in the SCC with the smallest number in DFS ordering.


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### Subgoal

- All members of an SCC are descendants of its root.
- Can we identify some root?
- How about the root of the first SCC completely explored by DFS?
- Key idea: **no exit from first SCC**
  - first SCC is leftmost "leaf" in collapsed DAG

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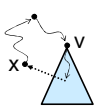
### Definition



$x$  is an *exit* from  $v$  (from  $v$ 's subtree) if

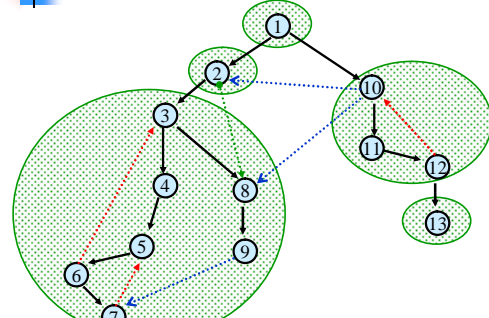
- $x$  is not a descendant of  $v$ , but
- $x$  is the head of a (cross- or back-) edge from a descendant of  $v$  (or  $v$  itself)

- Any non-root vertex  $v$  has an exit



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### Strongly-connected components



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### Finding Other Components

- Key idea: No exit from
  - 1<sup>st</sup> SCC
  - 2<sup>nd</sup> SCC, except maybe to 1<sup>st</sup>
  - 3<sup>rd</sup> SCC, except maybe to 1<sup>st</sup> and/or 2<sup>nd</sup>
  - ...

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### SCC Algorithm

$scc[v] = \text{component \#}$

```

SCC(v)
  dfsnum[v] ← dfscounter++;
  small[v] ← dfsnum[v]
  push(v)
  for all edges (v,w)
    if dfsnum[w] = -1 then
      SCC(w)
      small[v] ← min(small[v], small[w]) // tree edge
    else if dfsnum[w] < dfsnum[v] and scc[w] = 0 then
      small[v] ← min(small[v], dfsnum[w]) // cross- or back-edge
  if dfsnum[v] = small[v] then // v is root of new scc
    sccnum ← sccnum+1;
    repeat
      w = pop(); scc[w] = sccnum; // mark SCC members
    until w=v
  
```

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