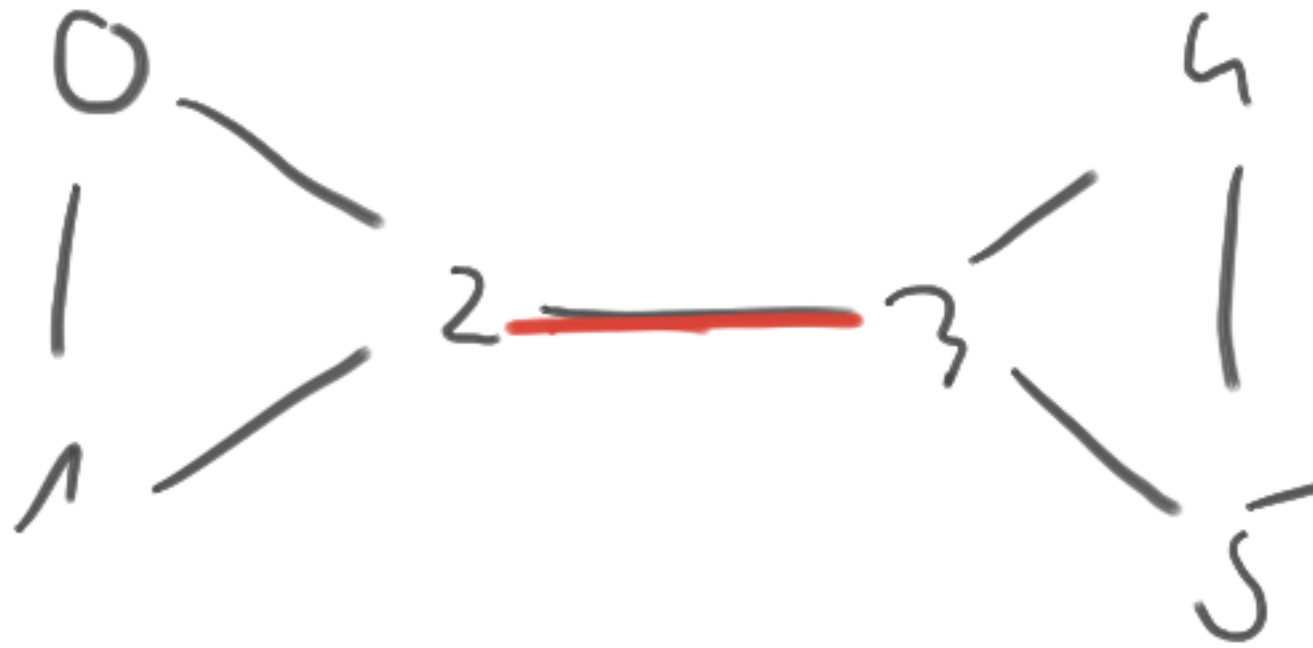


# Tutorium #5

25/11/2022

Given a connected undirected graph  $G = (V, E)$  (without self loops), return all bridges

An edge is a bridge iff it's removal increases the number of SCC (which is the same to CC, since undirected)



$e \in E$  is bridge  $\Leftrightarrow$  it doesn't belong to a cycle

```
def findBridges(graph):
    lowestReachableVertex = [INFTY * graph.numberOfNodes]
    bridges = []

    // start with first vertex 0, and discoveryTime 0
    DFS(0, 0, graph)

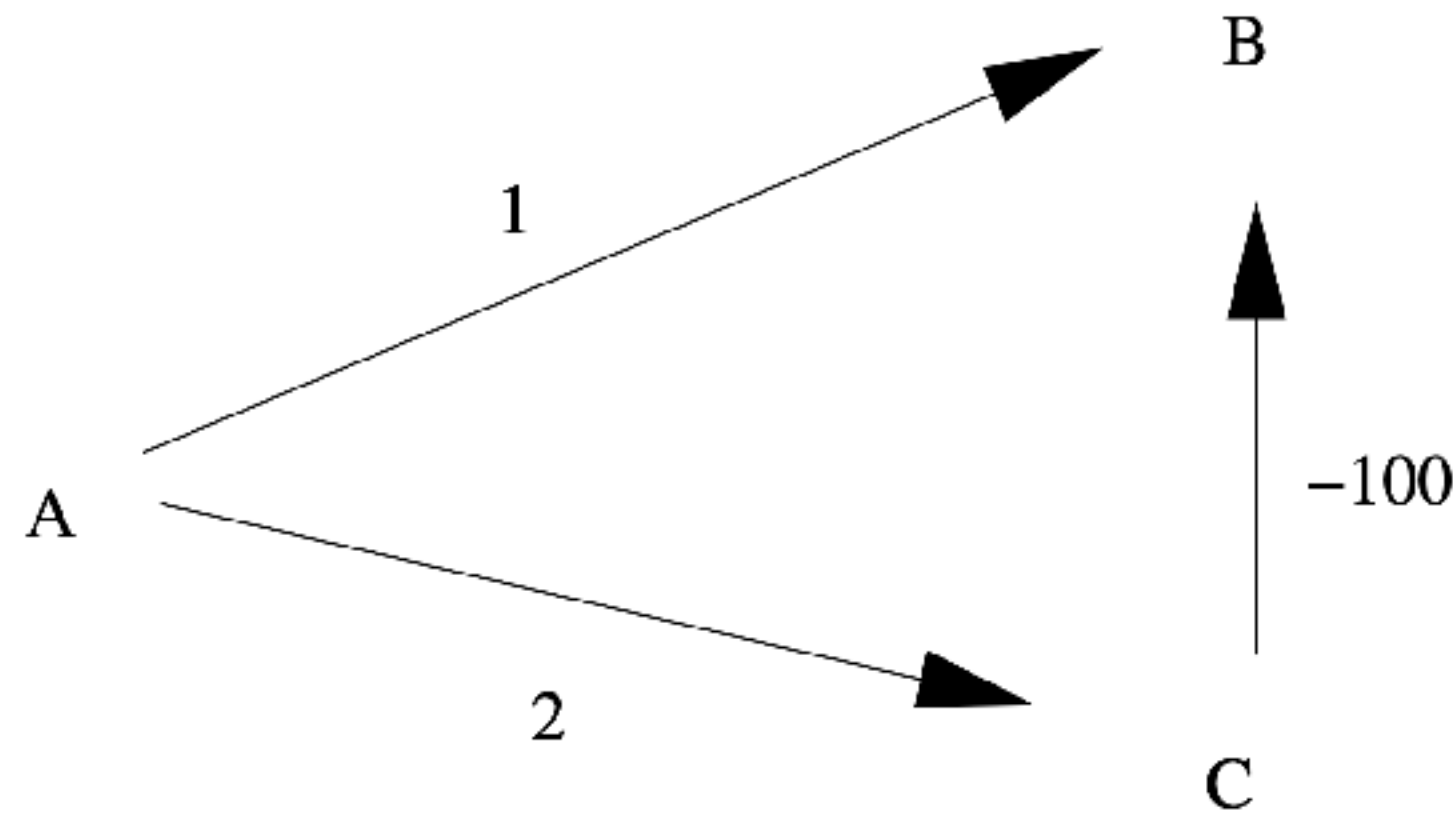
    return bridges

def DFS(node, time, graph):
    if (lowestReachableVertex[node] == INFTY):
        lowestReachableVertex[node] = time
        for neighbor in graph[node]:
            lowestReachableNode = DFS(neighbor, time + 1, graph)
            // if neighbor finds a 'larger' vertex, this edge doesn't belong to a cycle => bridge
            if (lowestReachableNode > time):
                bridges.append([node, neighbor])
            lowestReachableVertex[node] = min(lowestReachableVertex[node], lowestReachableNode)
    return lowestReachableVertex[node]
```

**Problem 1** (2 points) Give an example graph with edge costs and a start node that shows that Dijkstra may not compute shortest paths correctly if negative edge costs are allowed.

**Solution:**

In the following network pick  $A = s$ . Dijkstra relaxes the edges  $(A, B)$  and  $(A, C)$ . Afterwards the preliminary distance of  $B$  is 1 and of  $C$  is 2. Hence,  $B$  will be the next node that is settled. This is a problem as Dijkstra has the property that settled nodes have an optimal distance label. This is however not the case here since the path  $A \rightsquigarrow C \rightsquigarrow B$  gives us a shorter distance.



Note - your graph should have no neg. cycle  
- directed

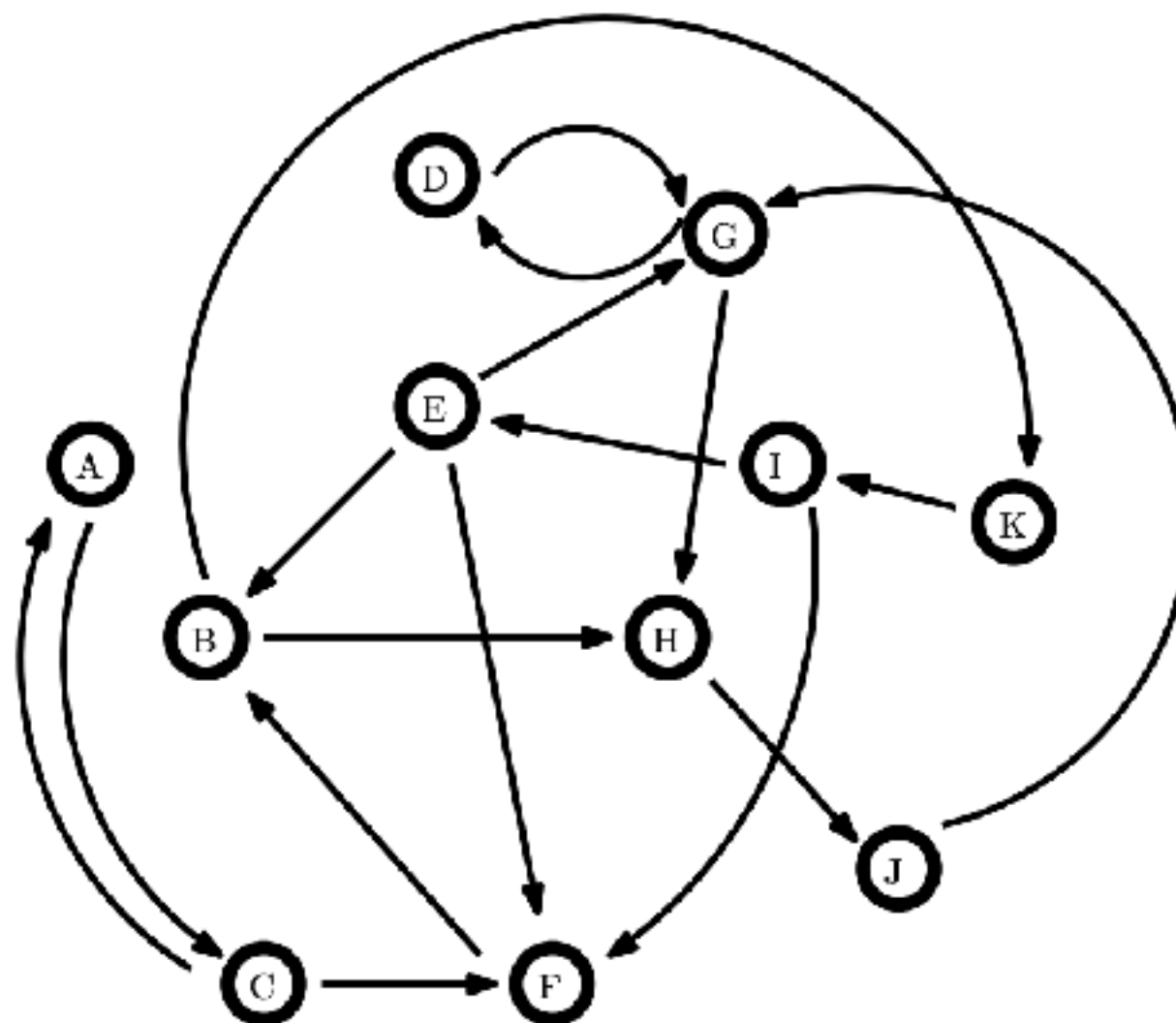
**Problem 2** (6 points)

Given is a directed graph  $G = (V, E)$  and the following relation

$$v \longleftrightarrow^* w \quad \text{iff.} \quad \text{exist paths } \langle v, \dots, w \rangle \text{ and } \langle w, \dots, v \rangle \text{ in } G$$

for  $v, w \in V$ .

1. Show  $\longleftrightarrow^*$  is an equivalence relationship.
2. Mark **all** *strongly connected components* in the following graph.



- **Reflexivity:**  $(\forall v \in V : v \leftrightarrow v)$

There is a trivial path from  $v$  to  $v$  for each vertex.

**Symmetry:**  $(v \leftrightarrow w \implies w \leftrightarrow v)$

$v \leftrightarrow w$ :

$\exists$  path from  $v$  to  $w$  and from  $w$  to  $v$  in  $G$ :

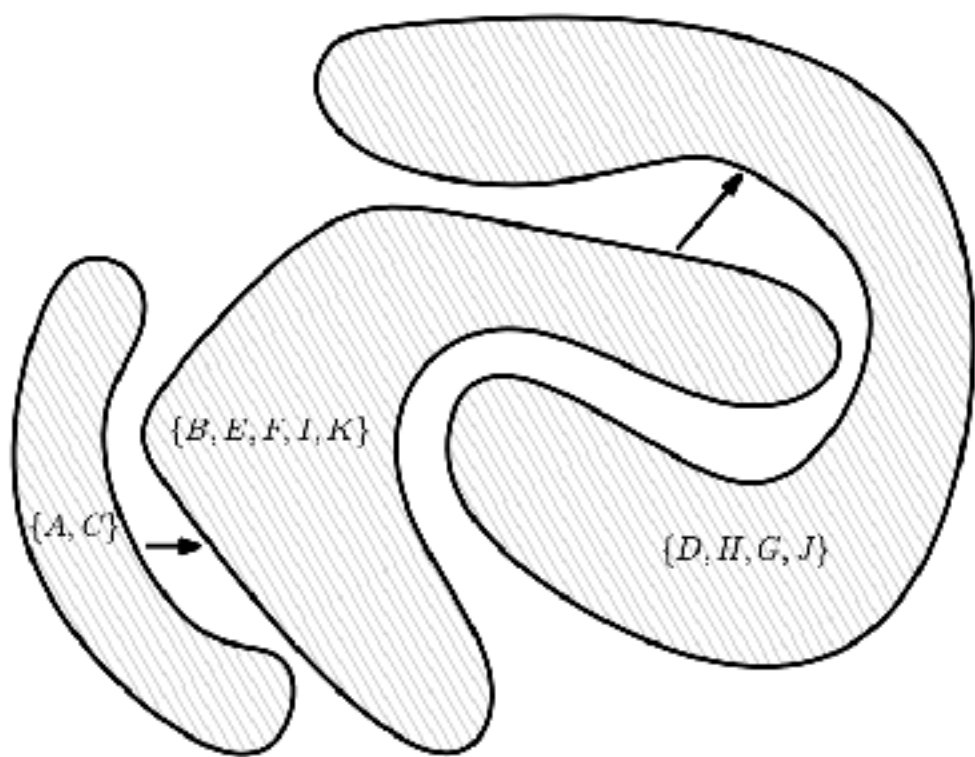
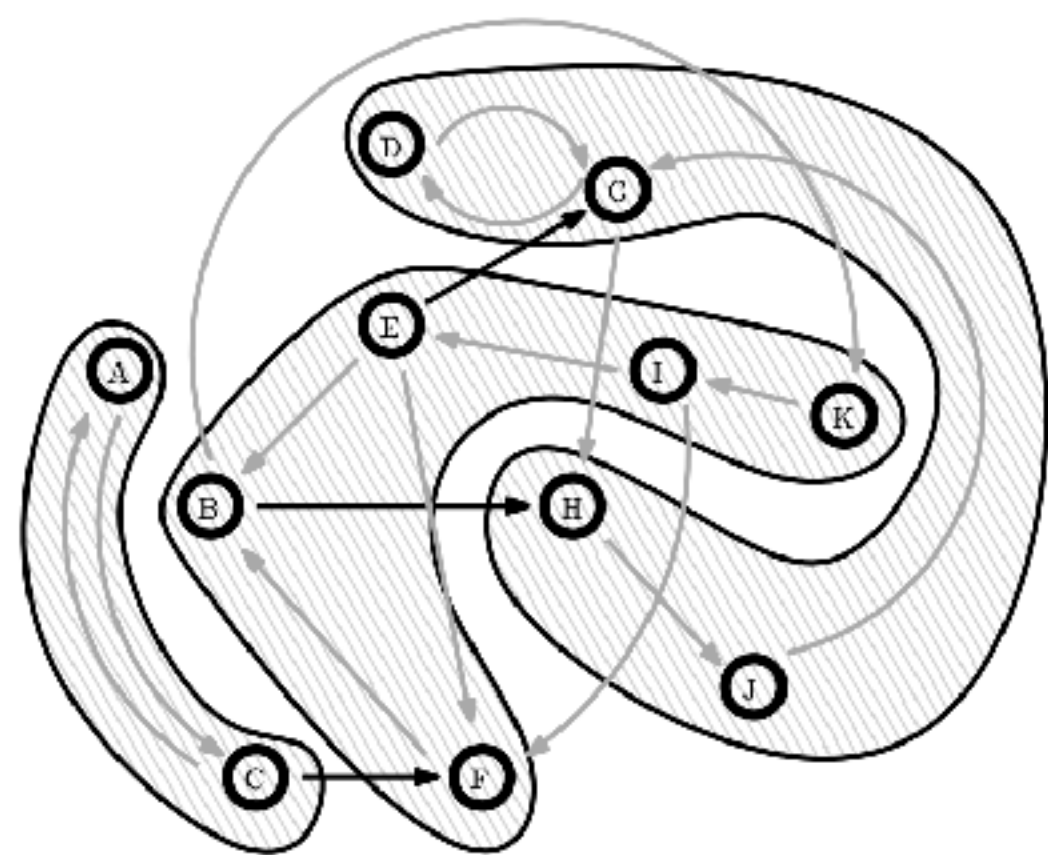
$\exists$  path from  $w$  to  $v$  and from  $v$  to  $w$  in  $G$ :

$w \leftrightarrow v$

**Transitivity:**  $(v \leftrightarrow w \text{ and } w \leftrightarrow x \implies v \leftrightarrow x)$

If  $v \leftrightarrow w$  and  $w \leftrightarrow x$ , there exist paths from  $v$  to  $w$ , from  $w$  to  $x$ , from  $x$  to  $w$  and from  $w$  to  $v$ . Therefore there exists a path from  $v$  to  $x$  consisting of the path from  $v$  to  $w$  followed by the path from  $w$  to  $x$ . The reverse path also exists as the concatenation of the reverse paths, which also exist due to our assumptions. Therefore  $v \leftrightarrow x$  and  $\leftrightarrow$  is transitive.

$\leftrightarrow$  is reflexive, symmetric and transitive and therefore an equivalence relation.



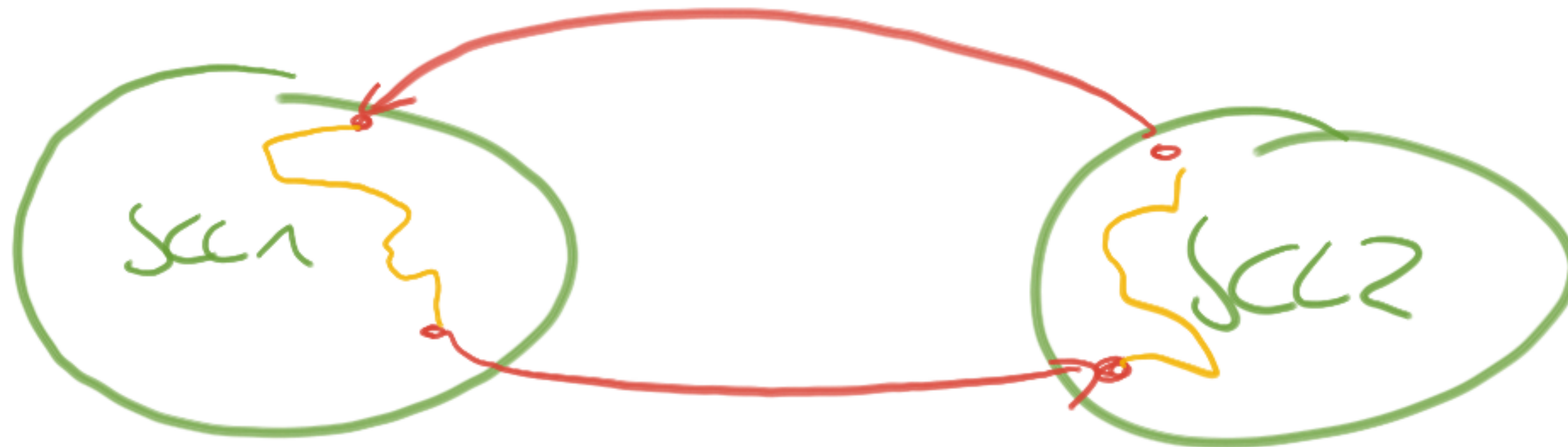
.

3. Compute and draw the SCC contracted graph.
4. Prove that the SCC contracted graph of a graph is acyclic.
5. Given is a directed, not necessarily connected graph  $G = (V, E)$ . Design a linear time algorithm that outputs all vertices from which all other vertices can be reached. (Note: this part of the exercise gives 2 points)



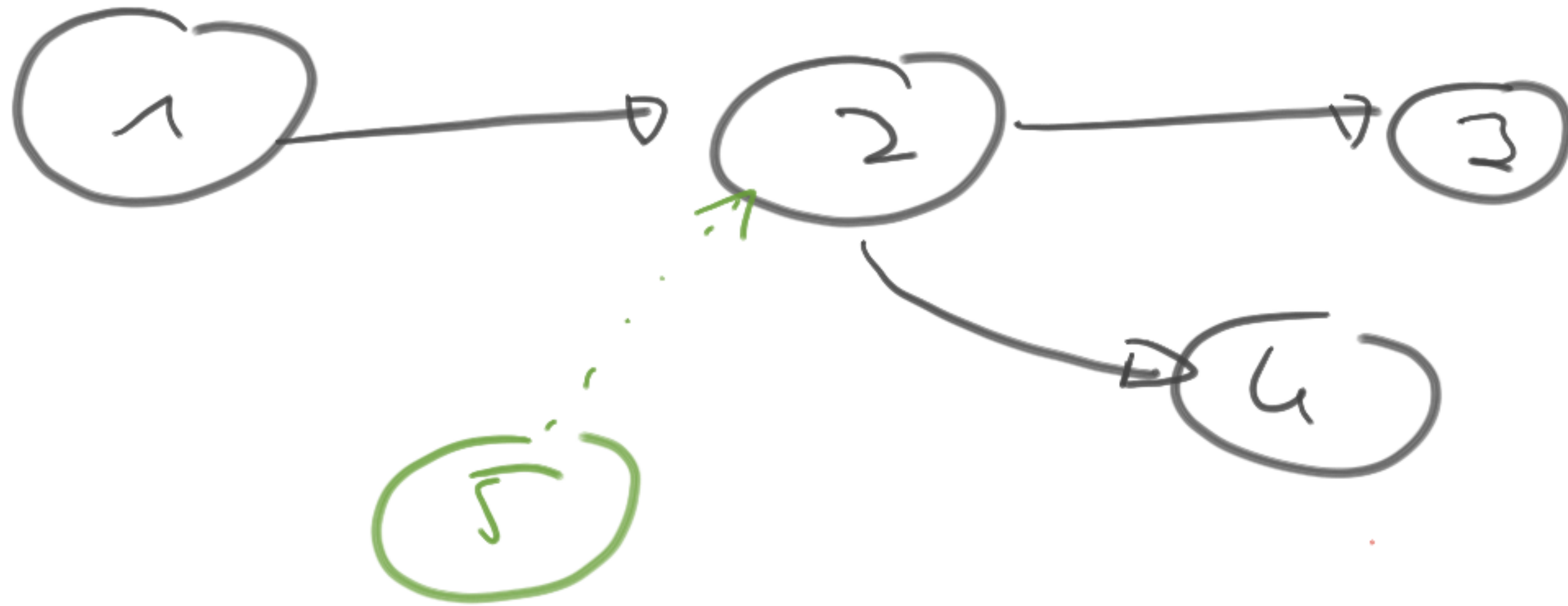
- For contradiction, assume there exists a cycle  $n_1, n_2, \dots, n_j = n_1$  with  $j > 1$ . By definition each of the vertices in the contracted graph is a maximal SCC in the original graph. As the component graph contains a cycle by assumption, there exists an edge for every component  $m \in [1, \dots, j]$  from at least one vertex  $w_{o,m}$  in  $n_m$  to a vertex  $w_{i,m+1}$  in  $n_{m+1}$ . Per definition of the SCC, there also exists a path from  $w_{i,m}$  to  $w_{o,m}$  in each component.

Let  $u$  be a node in component  $n_k$  and  $v$  be a node in a different component  $n_l$  (w.l.o.g  $k < l$ ). There exists a path from  $u$  over  $w_{o,k}, w_{i,k+1}, \dots, w_{o,l-1}, w_{i,l}$  to  $v$ . Following the same argument there exists a path from  $v$  to  $u$ . Therefore nodes  $u$  and  $v$  are in the same SCC, which results in a contradiction to the definition of  $n_k$  and  $n_l$  being maximal strongly connected components.



- First, use the algorithm from the lecture to compute the SCCs in linear time. The previous exercise shows that the contracted graph is a directed acyclic graph (DAG).

If there is only one node with in-degree 0, this node is the root and all nodes which are represented by this contracted node will be output. If there are multiple nodes with in-degree 0, no node in the graph can reach all other nodes and no node will be output.



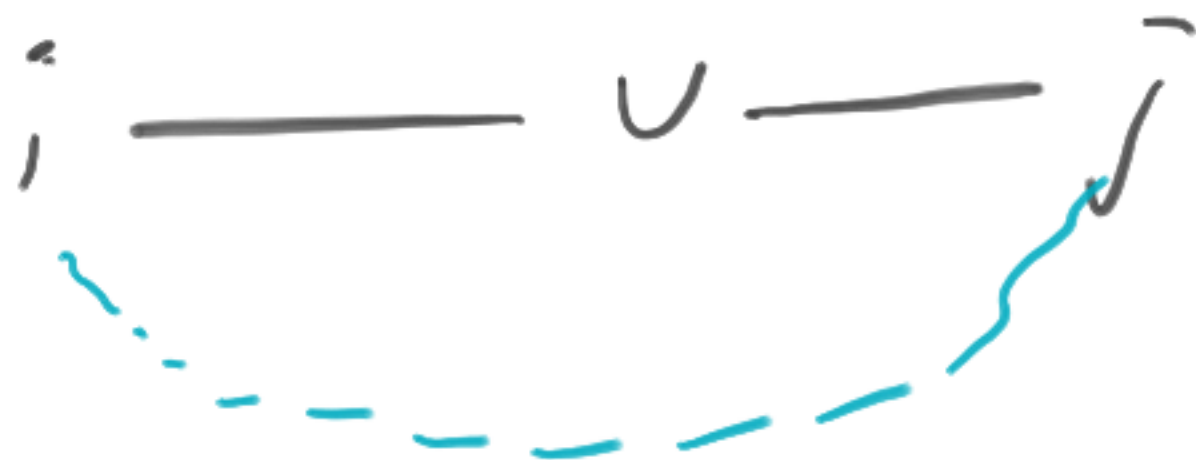
Topological  
sorting  
idea

Let  $G = (V, E)$  be a connected undirected graph. A node  $v$  is called *articulation point*, if the removal of the node increases the number of connected components.

1. Show that in a graph *without articulation points* and  $|V| \geq 3$  there is always at least one pair of nodes  $(i, j)$ ,  $i, j \in V$ , so that there are two paths  $P_1 = \langle i, \dots, j \rangle$  and  $P_2 = \langle i, \dots, j \rangle$ , that are node disjoint except for the endpoints, i.e.:  $P_1 \cap P_2 = \{i, j\}$ .

### Solution:

1. Let  $v$  be not an articulation point and  $i$  and  $j$  two  $v$  of  $v$ . On path of  $i$  and  $j$  is obviously  $P_1 = \langle (i, v), (v, j) \rangle$ . If we remove  $v$ , those edges are removed as well.  $G$  stays connected, otherwise  $v$  would be an articulation point. Hence, there must be a second  $P_2$  between  $i$  and  $j$  that is also disjoint to  $P_1$ , since  $v$  is not contained in the graph anymore.



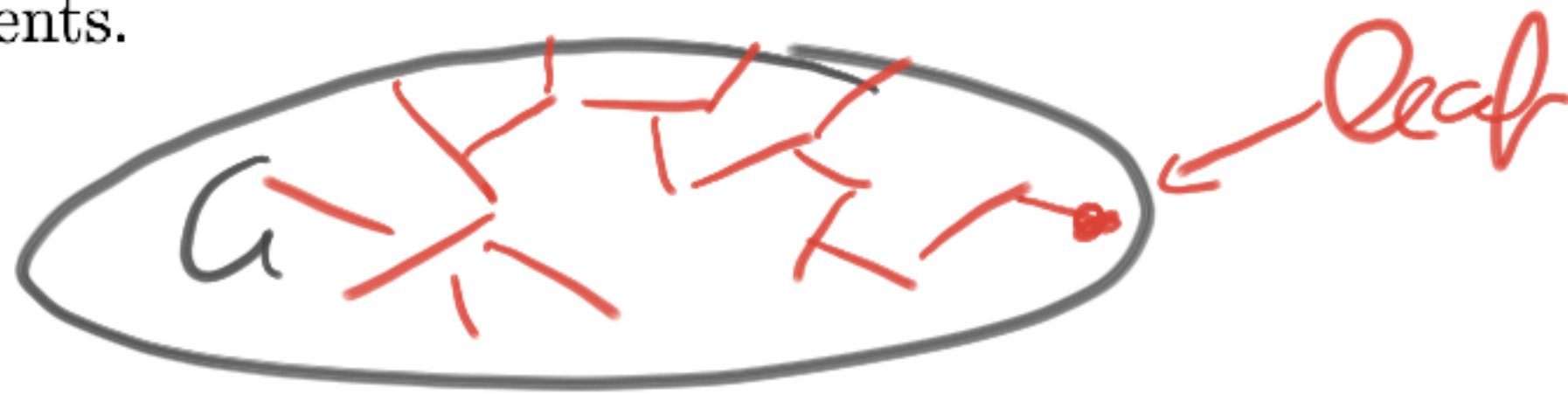


2. Show that in a graph with *articulation points* there is a node  $v$ , such that: You can remove a node  $w$ , such that starting from  $v$  there are no more paths to at least half of the remaining nodes.
3. Show, in a connected graph  $G = (V, E)$  there is always a node  $v$ , such that  $G$  is connected after  $v$  is removed.



2. Let  $w$  be an articulation point. Then  $G$  has two or more components after removal of  $v$ . One component  $K$  has the smallest number of nodes among all components. Since there are at least two components and  $K$  is the smaller one, we get that  $K$  can not contain more than  $|K| := \frac{|V \setminus \{v\}|}{2}$  nodes. If you choose a node  $v$  from  $K$ , then this node can obviously reach less than half of the remaining nodes.
3. Consider a spanning tree of  $G$ . Every leaf of the tree can be removed without increasing the number of connected components.

spanning tree



4. Complete the following DFS-Algorithm, such that in time  $O(|V| + |E|)$  it output all articulation points in a undirected graph. Describe what the functions **init**, **root(s)**, **traverseTreeEdge(v,w)**, **traverseNonTreeEdge(v,w)** and **backTrack(u,v)** do.  
First think about how you can identify articulation points via the DFS-numbering.

*Depth-first search of graph  $G = (V, E)$*

unmark all nodes

**init**

**for all**  $s \in V$  **do**

**if**  $s$  is not marked **then**

        mark  $s$

**root(s)**

        DFS( $s,s$ )

**procedure** DFS( $u,v$  : NodeID)

**for all**  $(v,w) \in E$  **do**

**if**  $w$  is marked **then**

**traverseNonTreeEdge(v,w)**

**else**

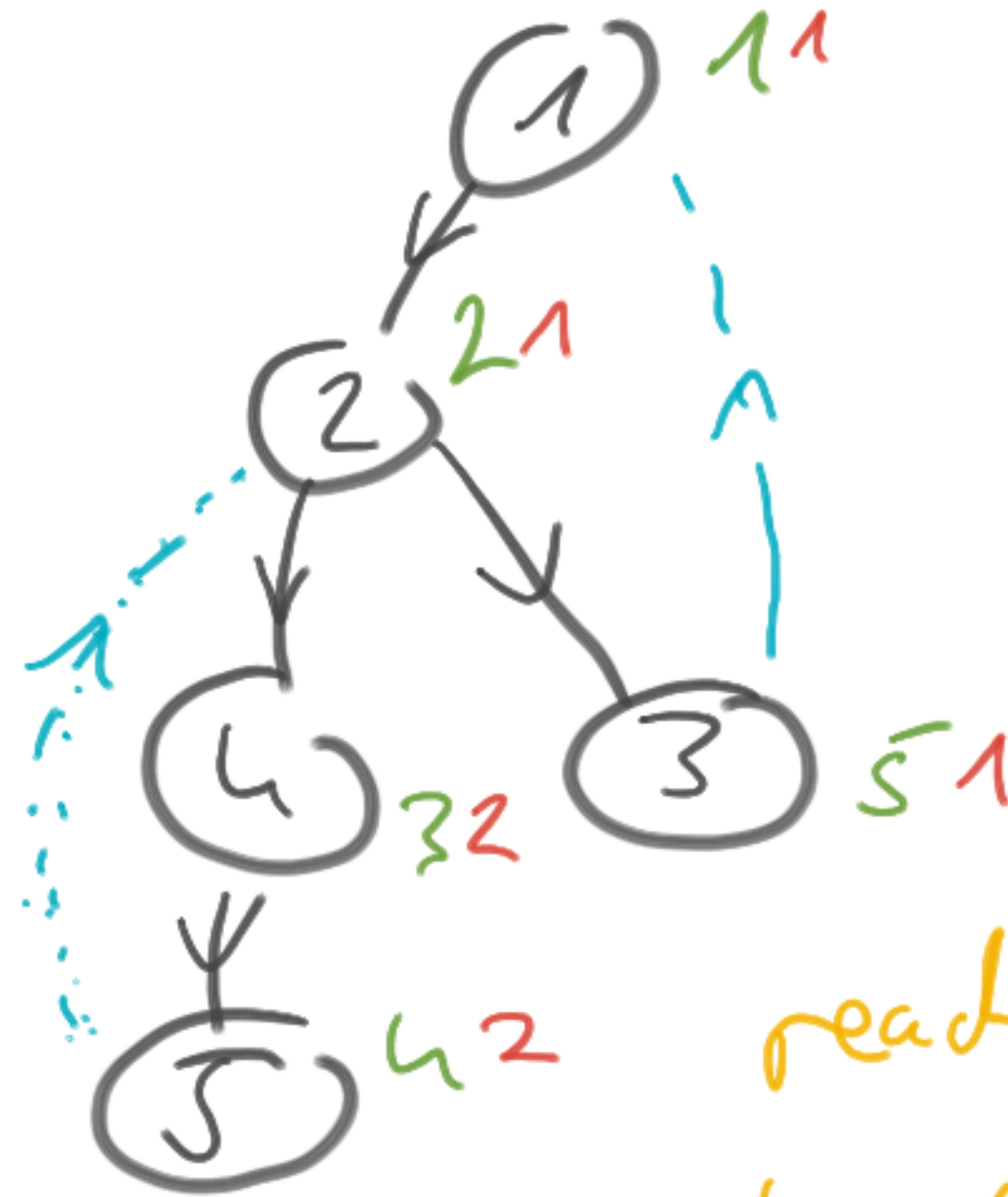
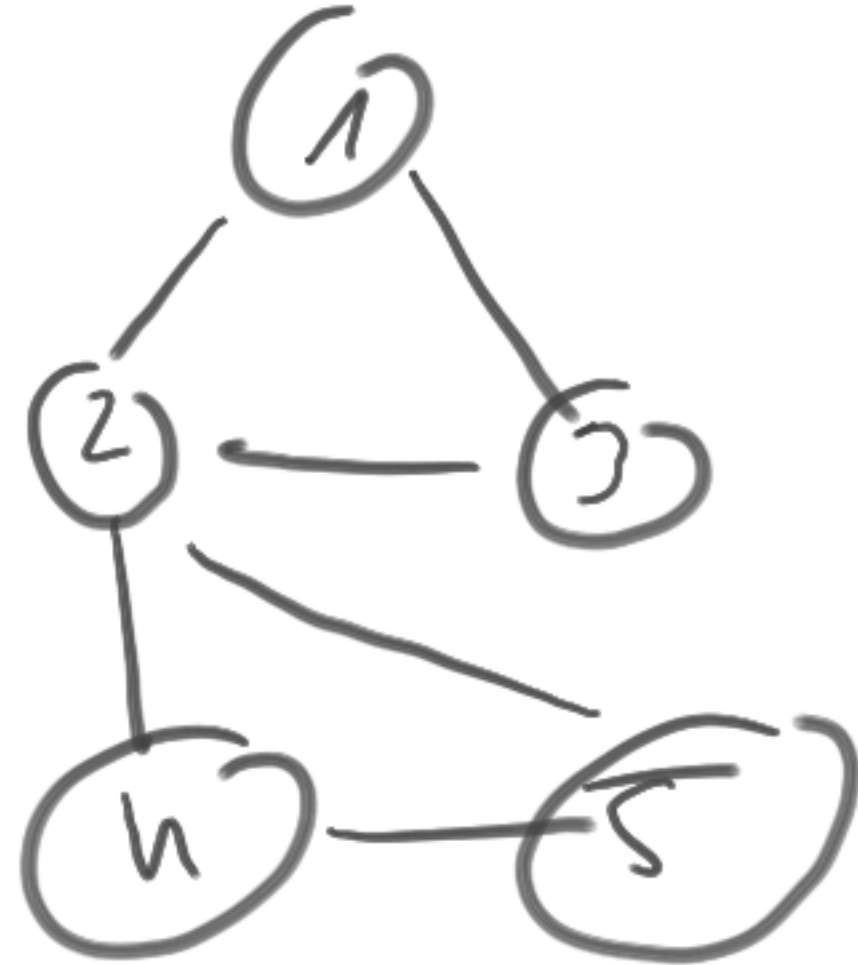
**traverseTreeEdge(v,w)**

            mark  $w$

            DFS( $v,w$ )

**backtrack(u,v)**

The problem can be solved using DFS. The following observation yields the key to the solution: A node  $v$  is always an articulation point, if he cannot reach a node that has a smaller DFS number. To check this, the minimum number of reachable DFS numbers of all subtrees have to be propagated upwards. The root is a special case and only articulation point, if it contains multiple successors.



dfsNum  
min Reachable  
when backtracking  
(2, 4), we see  
that 2 can  
reach "deeper" than  
4  $\Rightarrow$  2 is an articulation  
point

init:	dfsPos= 1; finishingTime= 1
root(s):	dfsNum[s]=dfsPos++; minimum[s] = dfsNum[s]; tree_root = s
traverseTreeEdge(v,w):	dfsNum[w]:=dfsPos++; minimum[w] = dfsnum[w]
traverseNonTreeEdge(v,w):	minimum[v] = min( dfsNum[w], minimum[v] )
backtrack(u,v):	minimum[u] = min( minimum[u], minimum[v] ) if( minimum[v] ≥ dfsNum[u] && ( tree_root ≠ u    # childs(u) > 1 ) ) output(u)





```
def articulationPoints(graph):
    seen = [False * graph.numberOfNodes]
    dfsNumber = [-1 * graph.numberOfNodes]
    minReachable = [INFTY * graph.numberOfNodes]
    rootVertex = -1
    // init
    dfsCounter = 1

    for v in graph.nodes():
        if not seen[v]:
            seen[v] = True
            dfsNumber[v] = dfsCounter++
            minReachable[v] = dfsNumber[v]
            rootVertex = v
            DFS(v, v, graph)
```



```
def DFS(u, v, graph):
    for edge in graph[v]:
        if (seen[edge.toVertex]):
            // traverseNonTreeEdge
            minReachable[v] = min(minReachable[v],
            dfsNumber[edge.toVertex])
        else:
            // traverseTreeEdge
            dfsNum[edge.toVertex] = dfsCounter++
            minReachable[edge.toVertex] = dfsNumber[edge.toVertex]

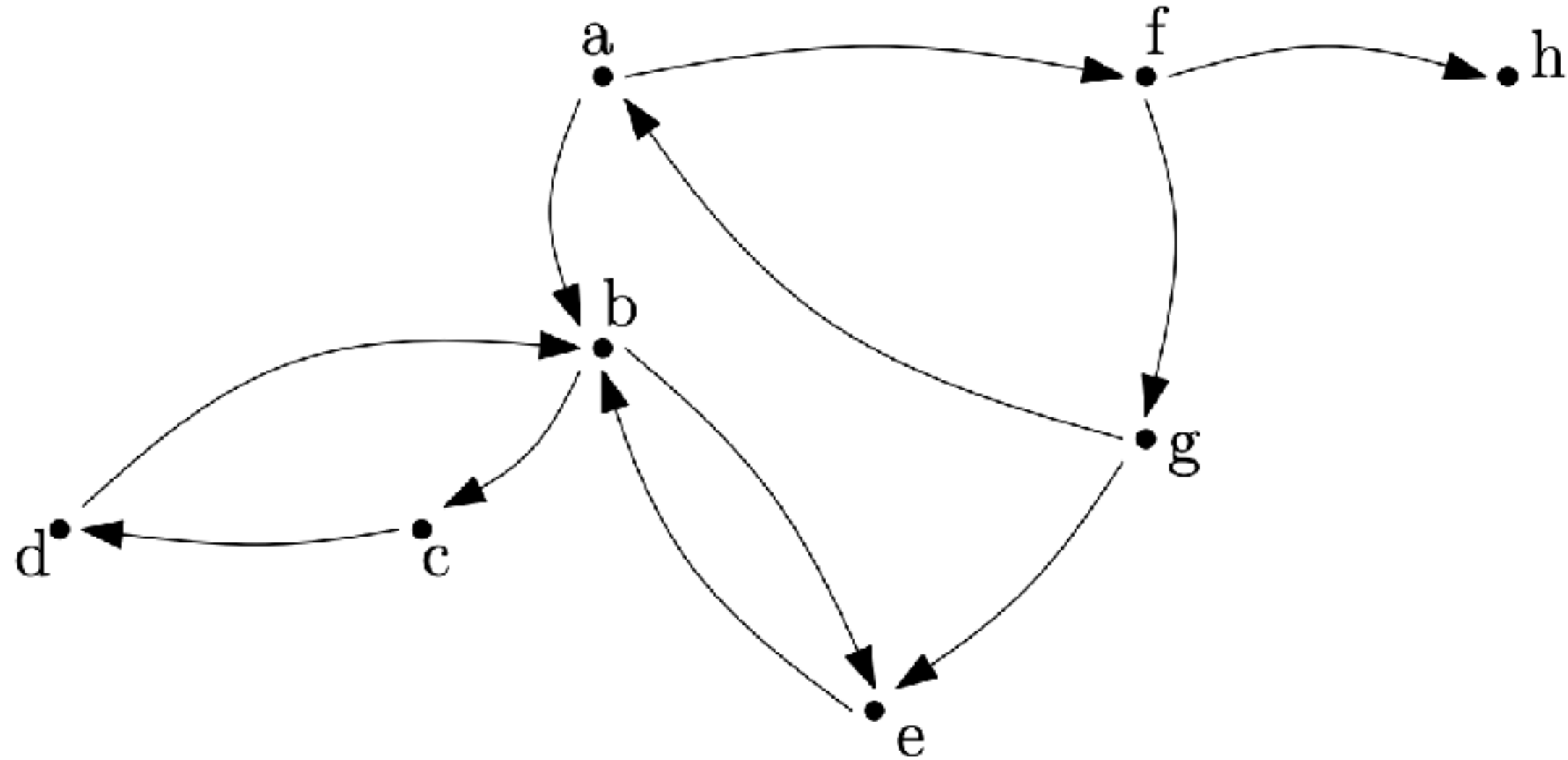
            seen[edge.toVertex] = True
            DFS(v, edge.toVertex, graph)

    // backtrack
    minReachable[u] = min(minReachable[u], minReachable[v])
    // check if we found an articulation point
    if (u == rootVertex and len(graph[u]) > 1):
        print("Articulation Point (root): " + str(u))
    if (minReachable[v] >= dfsNumber[u] and u != rootVertex):
        print("Articulation Point (not root): " + str(u))
```

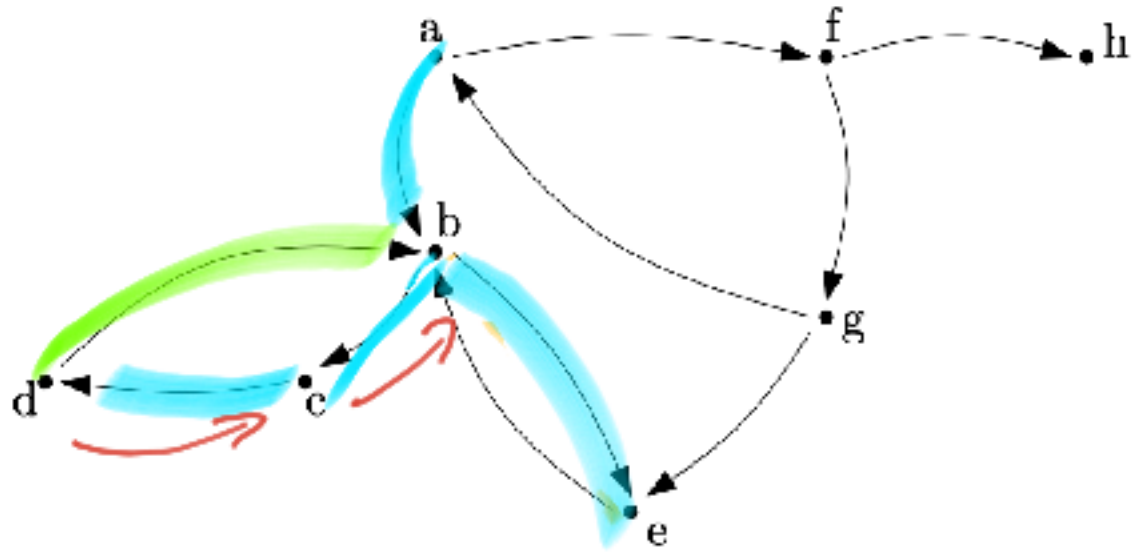


**Problem 4** (4 points)

Given is the following graph  $G = (V, E)$ :



Execute the algorithm to compute SCCs from the lecture on the graph.  
After each step give the state of `oReps`, `oNodes` and `component`.



Schritt 1:  $\text{root}(a)$

oReps	a
oNodes	a

Schritt 2: `traverseTreeEdge(a,b)`

oReps	b a
oNodes	b a

Schritt 3: `traverseTreeEdge(b, c)`

oReps	c b a
oNodes	c b a

Schritt 4: `traverseTreeEdge(c,d)`

oReps	d c b a
oNodes	d c b a

Schritt 5: `traverseNonTreeEdge(d, b)`

oReps	b a
oNodes	d c b a

Schritt 6, 7: backtrack(c,d), backtrack(b,c)

oReps	b a
oNodes	d c b a

Schritt 8: `traverseTreeEdge(b,e)`

oReps	e b a
oNodes	e d c b a

w	a	b	c	d	e	f	g	h
component [w]	-	-	-	-	-	-	-	-

w	a	b	c	d	e	f	g	h
component [w]	-	-	-	-	-	-	-	-

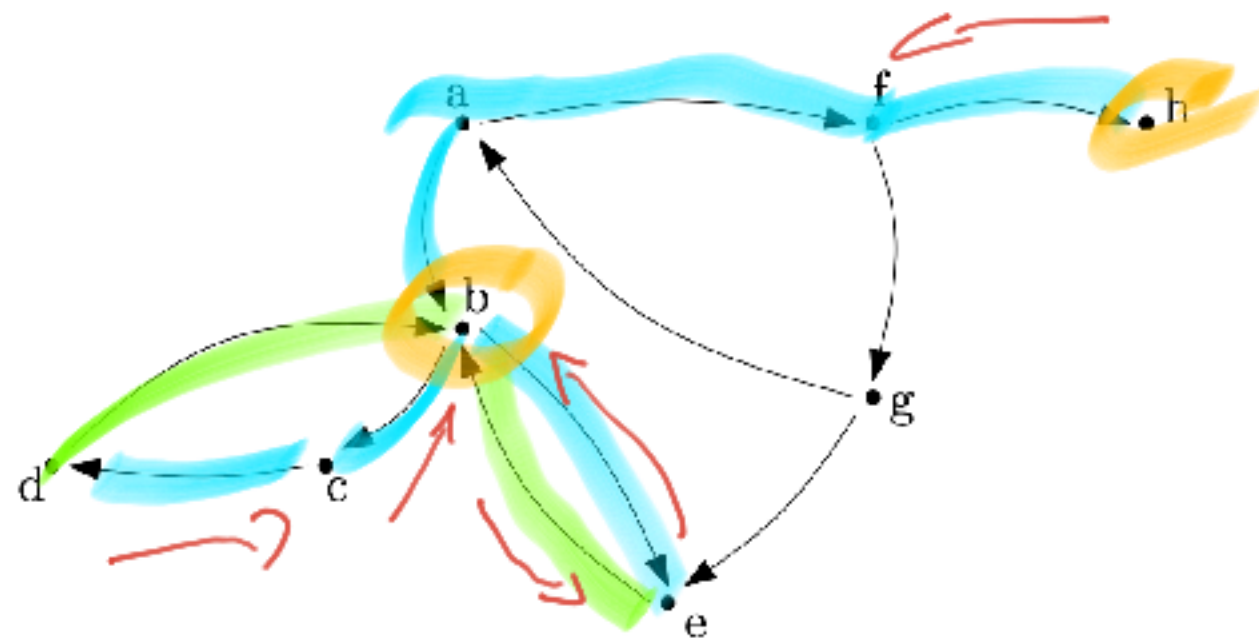
w	a	b	c	d	e	f	g	h
component [w]	-	-	-	-	-	-	-	-

w	a	b	c	d	e	f	g	h
component [w]	-	-	-	-	-	-	-	-

w	a	b	c	d	e	f	g	h
component [w]	-	-	-	-	-	-	-	-

w	a	b	c	d	e	f	g	h
component [w]	-	-	-	-	-	-	-	-

w	a	b	c	d	e	f	g	h
component [w]	-	-	-	-	-	-	-	-



Schritt 9: traverseNonTreeEdge(e, b)

oReps	b a
oNodes	e d c b a

Schritt 10: backTrack(b, e)

oReps	b a
oNodes	e d c b a

Schritt 11: backTrack(a, b)

oReps	a
oNodes	a

*b is finished*

Schritt 12: traverseTreeEdge(a, f)

oReps	f a
oNodes	f a

Schritt 13: traverseTreeEdge(f, h)

oReps	h f a
oNodes	h f a

Schritt 14: backtrack(f, h)

oReps	f a
oNodes	f a

w	a	b	c	d	e	f	g	h
component[w]	-	-	-	-	-	-	-	-

w	a	b	c	d	e	f	g	h
component[w]	-	-	-	-	-	-	-	-

w	a	b	c	d	e	f	g	h
component[w]	-	b	b	b	b	-	-	-

w	a	b	c	d	e	f	g	h
component[w]	-	b	b	b	b	-	-	-

w	a	b	c	d	e	f	g	h
component[w]	-	b	b	b	b	-	-	-

w	a	b	c	d	e	f	g	h
component[w]	-	b	b	b	b	-	-	b

Schritt 15: `traverseTreeEdge(f,g)`

oReps	g f a
oNodes	g f a

w	a	b	c	d	e	f	g	h
component[w]	-	b	b	b	b	-	-	h

Schritt 16: `traverseNonTreeEdge(g,e)`

oReps	g f a
oNodes	g f a

w	a	b	c	d	e	f	g	h
component[w]	-	b	b	b	b	-	-	h

Schritt 17: `traverseNonTreeEdge(g,a)`

oReps	a
oNodes	g f a

w	a	b	c	d	e	f	g	h
component[w]	-	b	b	b	b	-	-	h

Schritt 18: `backtrack(f,g), backtrack(a,f)`

oReps	a
oNodes	g f a

w	a	b	c	d	e	f	g	h
component[w]	-	b	b	b	b	-	-	h

Schritt 19: `backtrack(a,a)`

oReps	
oNodes	

w	a	b	c	d	e	f	g	h
component[w]	a	b	b	b	b	a	a	h

