

setup

```
In[3]:= options = Sequence[VertexSize -> Large, VertexLabels -> Placed[Automatic, {1/2, 1/2}], ImageSize -> Large]
```

```
Out[3]= Sequence[VertexSize -> Large, VertexLabels -> Placed[Automatic, {1/2, 1/2}], ImageSize -> Large]
```

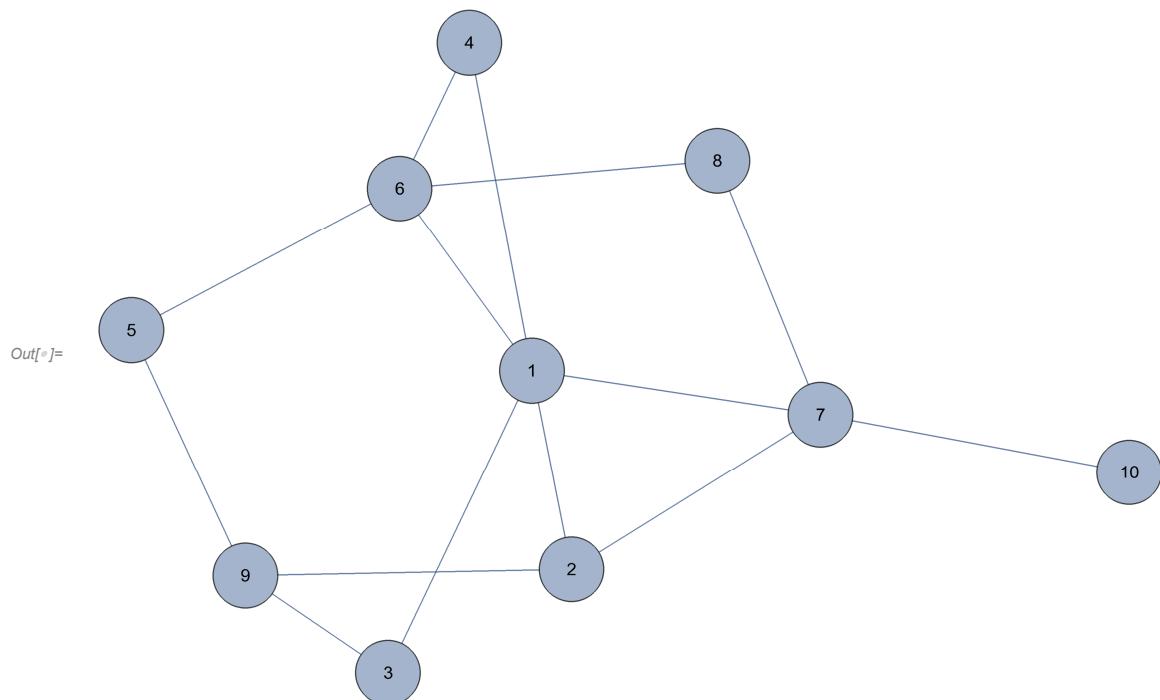
Tang Anke

depth first search (DFS)

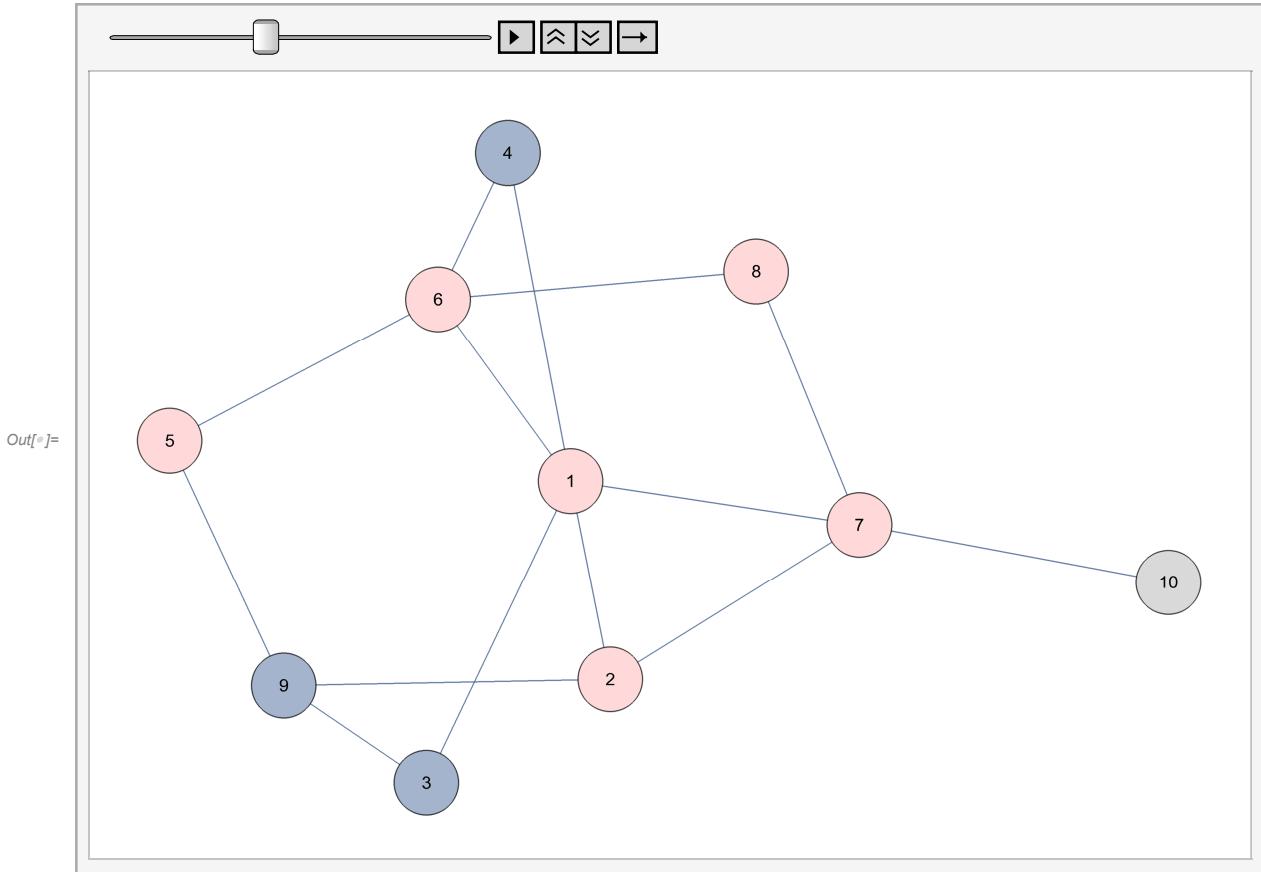
---

basic DFS algorithm

```
In[4]:= g = RandomGraph[{10, 14}, options]
```



```
In[6]:= ListAnimate[
Module[{visit = Function[# -> LightRed], visited = Function[# -> LightGray]}, 
GraphPlot[{{5, 6, 8, 7, 10}, {5, 6, 8, 7, 10}, {5, 6, 8, 7, 10}, {5, 6, 8, 7, 10}, {5, 6, 8, 7, 10}}, 
VertexStyle -> #, options] & /@ FoldList[Append, {}, Join[visit /@ {5, 6, 8, 7, 10}, 
visited /@ {10}, visit /@ {2, 1, 4}, visited /@ {4}, visit /@ {3, 9}, visited /@ {9, 3, 1, 2, 7, 8, 6, 5}]]]
]
```



```
# Global or class scope variables
n = number of nodes in the graph
g = adjacency list representing graph
visited = [false, ..., false] # size n

function dfs(at):
    if visited[at]: return
    visited[at] = true

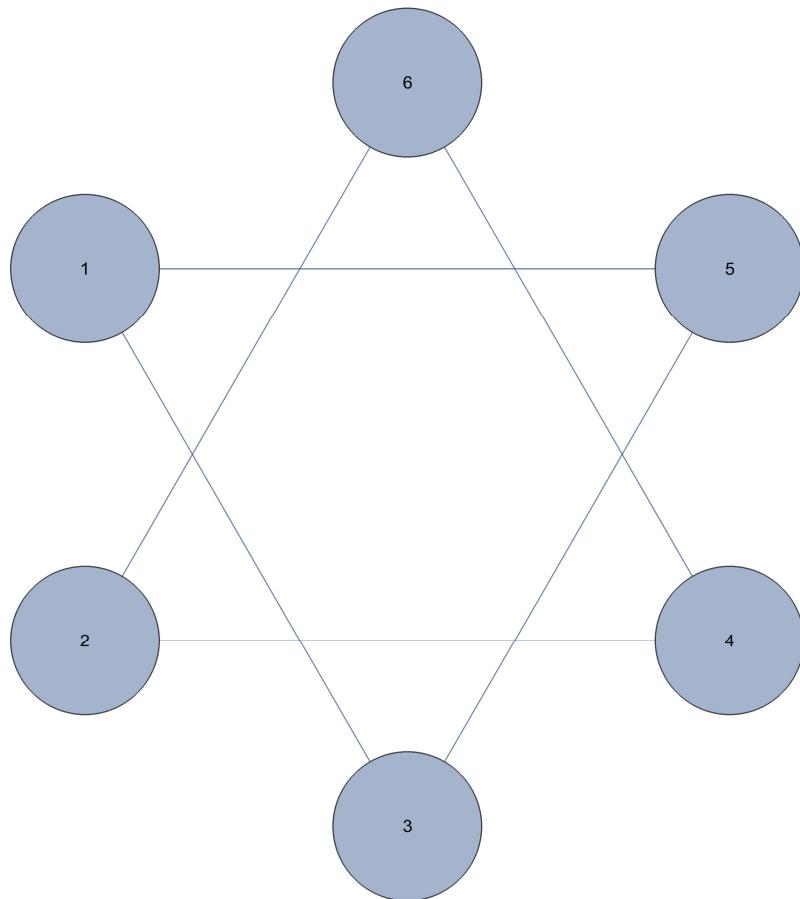
    neighbours = graph[at]
    for next in neighbours:
        dfs(next)

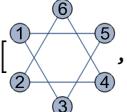
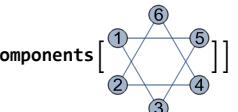
# Start DFS at node zero
start_node = 0
dfs(start_node)
```

---

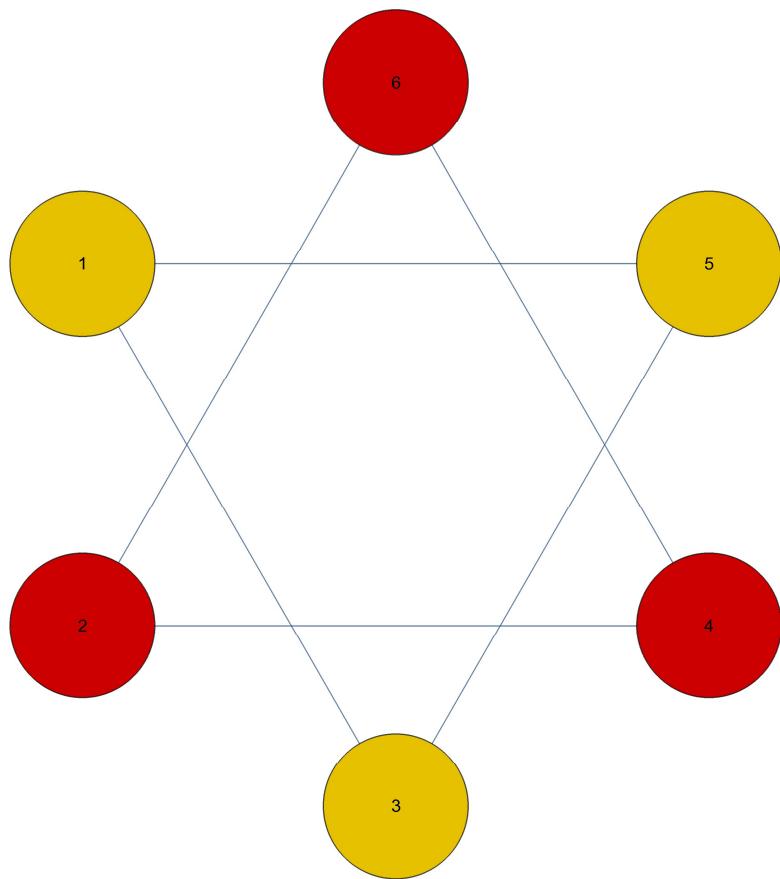
**applications****connected components**

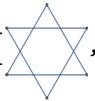
In[<sup>®</sup>]:= `Graph[, options, GraphLayout -> {"CircularEmbedding", "OptimalOrder" -> False}]`



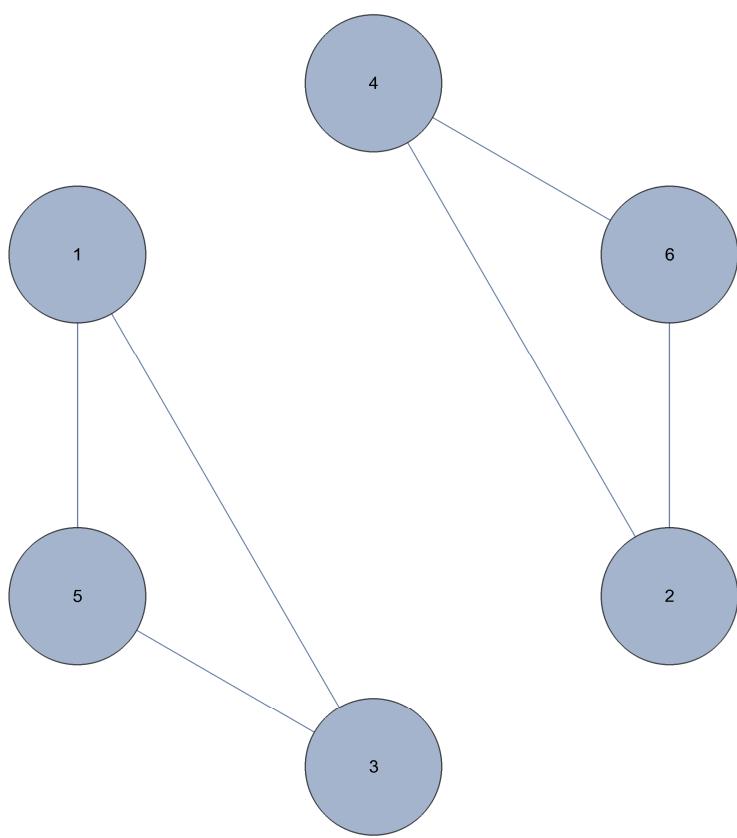
```
In[6]:= HighlightGraph[, ConnectedComponents[]]
```

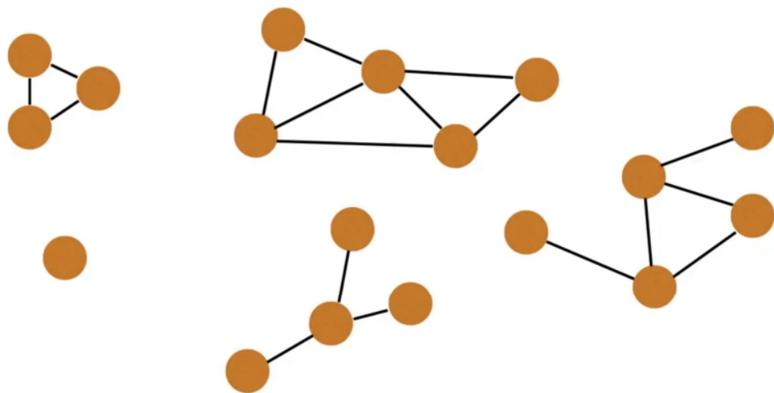
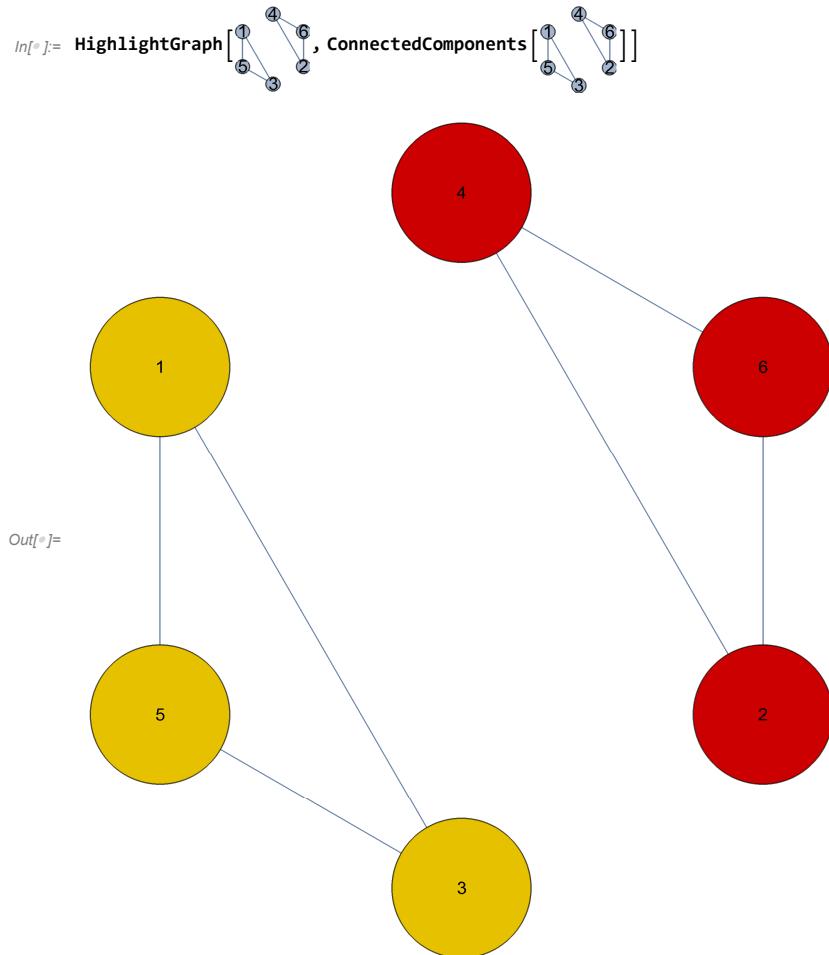
```
Out[6]=
```

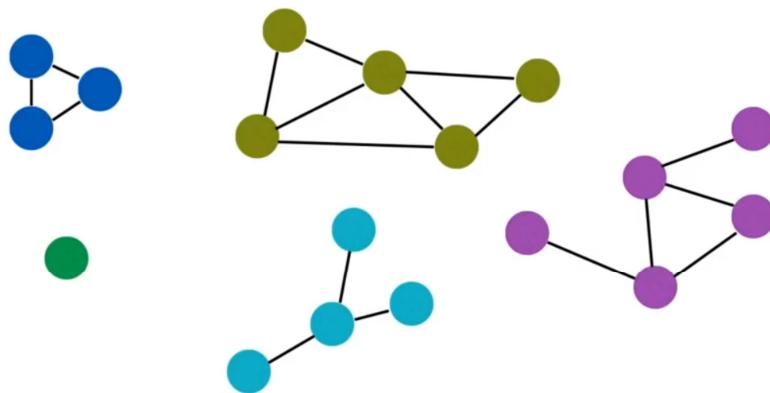


In[<sup>®</sup>]:= Graph[, options, GraphLayout -> {"CircularEmbedding", "OptimalOrder" -> True}]

Out[<sup>®</sup>]=







```
# Global or class scope variables
```

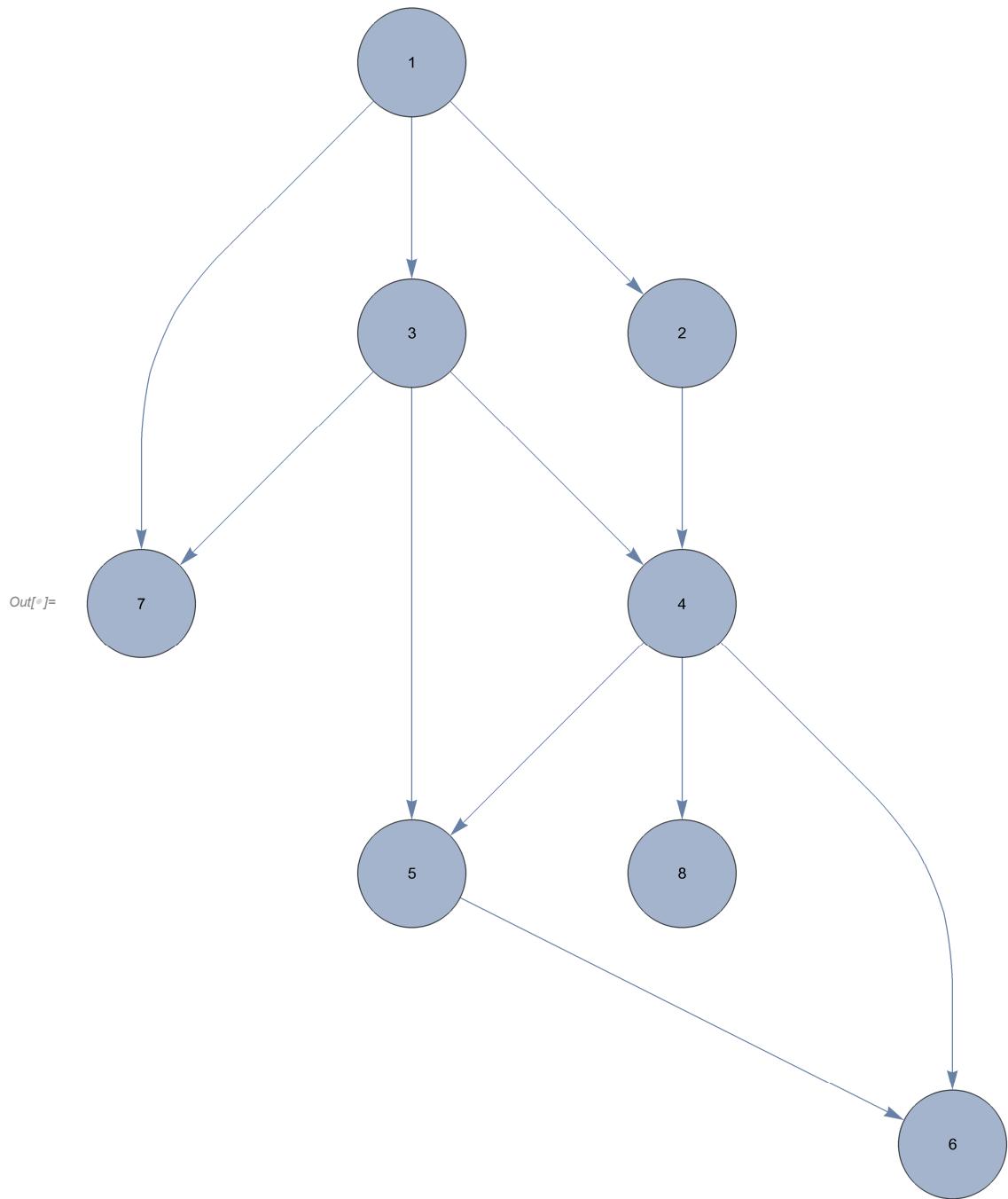
```
n = number of nodes in the graph
g = adjacency list representing graph
count = 0
components = empty integer array # size n
visited = [false, ..., false] # size n
```

```
function findComponents():
    for (i = 0; i < n; i++):
        if !visited[i]:
            count++
            dfs(i)
    return (count, components)
```

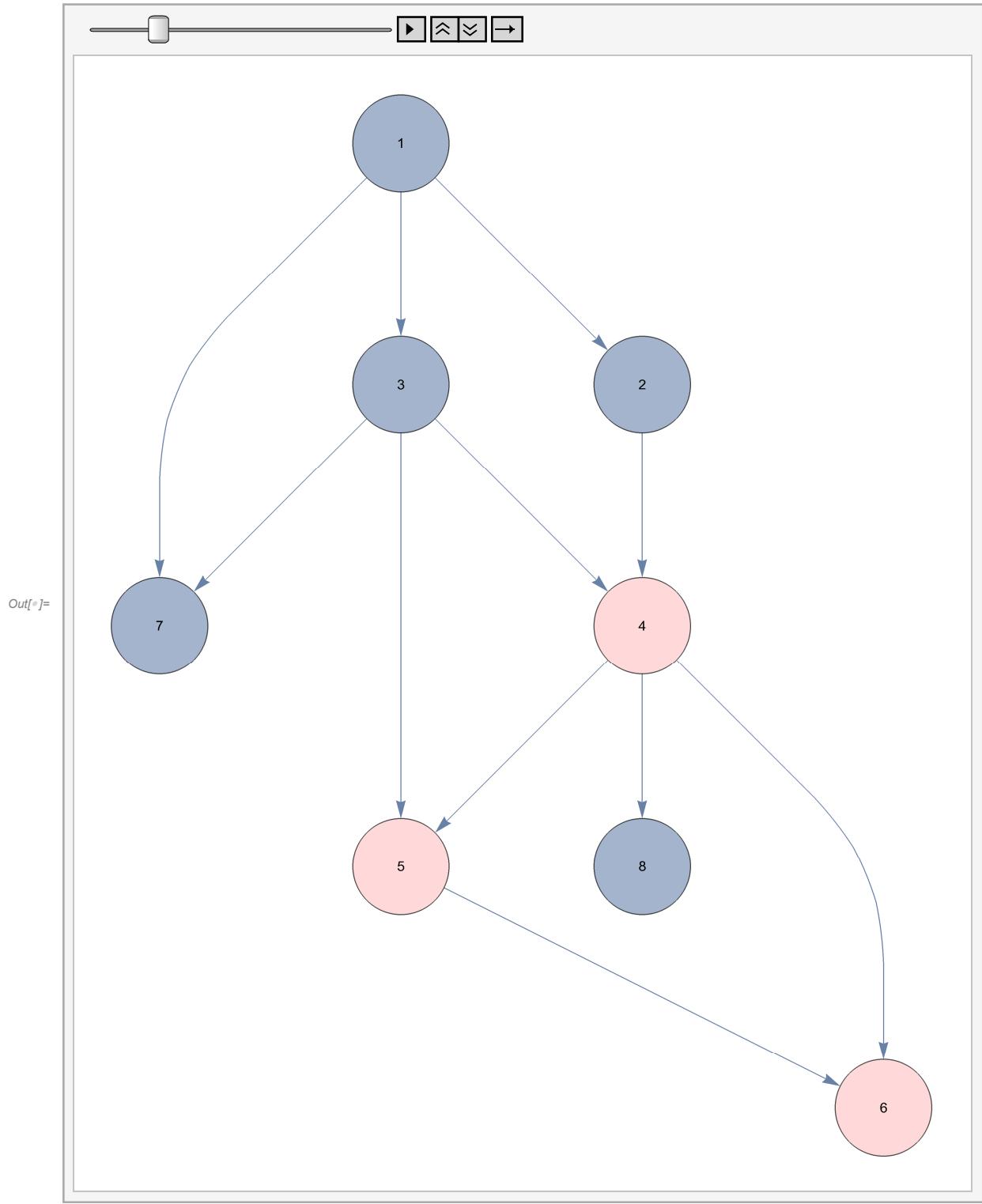
```
function dfs(at):
    visited[at] = true
    components[at] = count
    for (next : g[at]):
        if !visited[next]:
            dfs(next)
```

topological sort

```
In[8]:= Graph[Range[8], {1 → 2, 1 → 3, 2 → 4, 3 → 4, 3 → 5, 4 → 5, 1 → 7, 3 → 7, 4 → 8, 4 → 6, 5 → 6},  
options, GraphLayout → "LayeredDigraphEmbedding"]
```



```
In[7]:= ListAnimate[  
  Module[{visit = Function[# -> LightRed], visited = Function[# -> LightGray]},  
  
   GraphPlot[<img alt="A directed graph with 8 vertices labeled 1 through 8. Vertex 1 is at the top, connected to 2 and 3. Vertex 2 is connected to 4. Vertex 3 is connected to 4 and 7. Vertex 4 is connected to 5 and 8. Vertex 5 is connected to 6. Vertex 6 is at the bottom right. Vertex 7 is connected to 3 and 5. Vertex 8 is connected to 6. Arrows indicate the direction of edges: 1 to 2, 1 to 3, 2 to 4, 3 to 4, 3 to 7, 4 to 5, 4 to 8, 5 to 6, 7 to 3, 7 to 5, and 8 to 6." data-bbox="160 140 310 210}, VertexStyle -&gt; #, options] &amp; /@<br/>   FoldList[Append, {}, Join[visit /@ {4, 5, 6}, visited /@ {6, 5}, visit /@ {8},  
    visited /@ {8, 4}, visit /@ {3, 7}, visited /@ {7, 3}, visit /@ {1, 2}, visited /@ {2, 1}]]  
  ]  
]
```



{6,5,8,4,7,3,2,1}

```

# Assumption: graph is stored as adjacency list
function topsort(graph):

    N = graph.number0fNodes()
    V = [false,...,false] # Length N
    ordering = [0,...,0] # Length N
    i = N - 1 # Index for ordering array

    for(at = 0; at < N; at++):
        if V[at] == false:
            visitedNodes = []
            dfs(at, V, visitedNodes, graph)
            for nodeId in visitedNodes:
                ordering[i] = nodeId
                i = i - 1
    return ordering

# Execute Depth First Search (DFS)
function dfs(at, V, visitedNodes, graph):

    V[at] = true

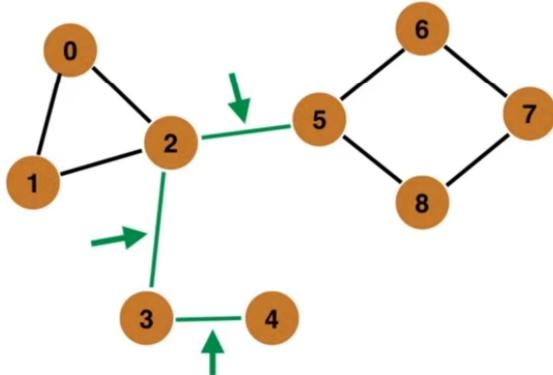
    edges = graph.getEdgesOutFromNode(at)
    for edge in edges:
        if V[edge.to] == false:
            dfs(edge.to, V, visitedNodes, graph)

    visitedNodes.add(at)

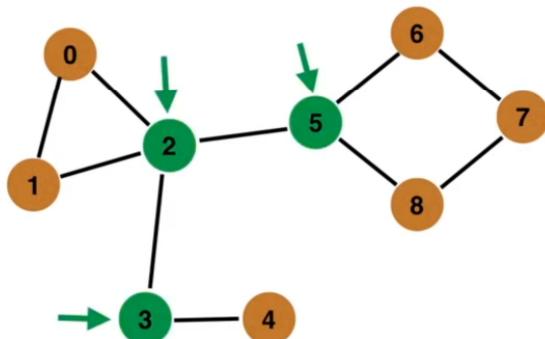
```

find bridges and articulation points

A **bridge / cut edge** is any edge in a graph whose removal increases the number of connected components.

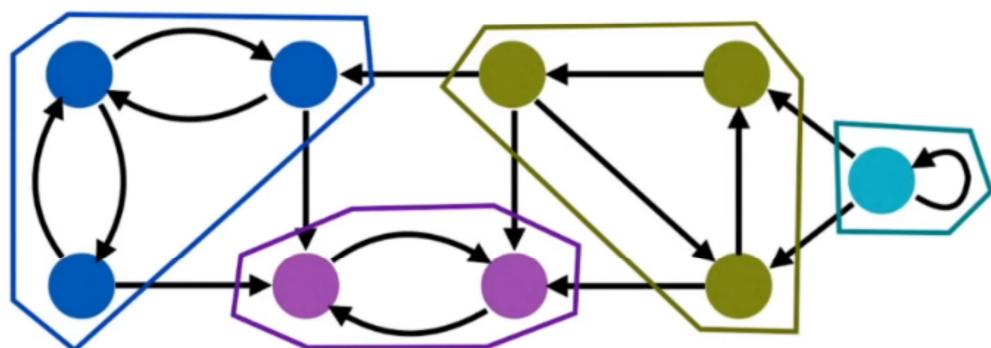


An **articulation point / cut vertex** is any node in a graph whose removal increases the number of connected components.

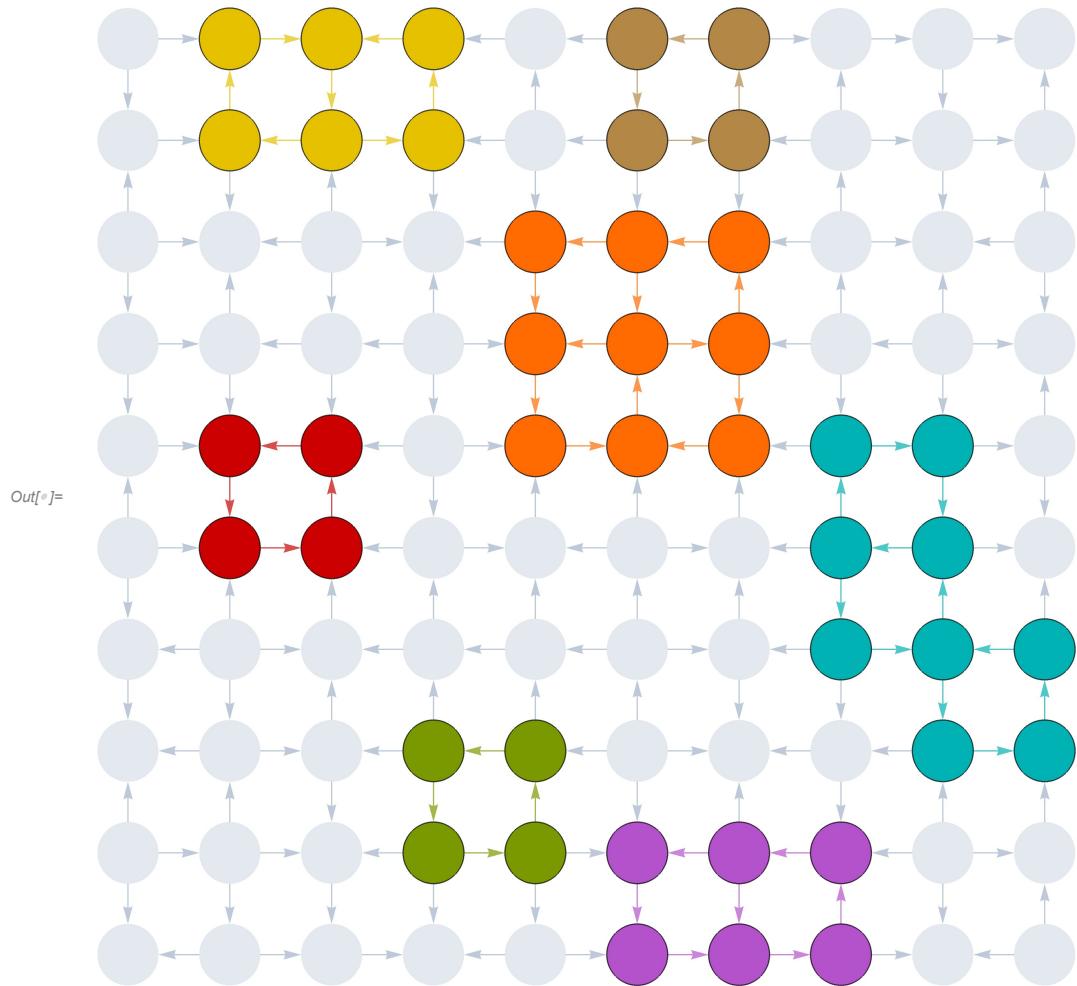


Tarjan's algorithm for finding strongly connected components

Strongly Connected Components (SCCs) can be thought of as **self-contained cycles** within a **directed graph** where every vertex in a given cycle can reach every other vertex in the same cycle.



```
In[6]:= g = DirectedGraph[GridGraph[{10, 10}], "Random", VertexSize -> 0.6, GraphHighlightStyle -> "DehighlightFade"];
HighlightGraph[g, Select[ConnectedGraphComponents[g], VertexCount[#] > 1 &]]
```



find Eulerian path (directed graph)

**FindSpanningTree**

...

# What else can DFS do?

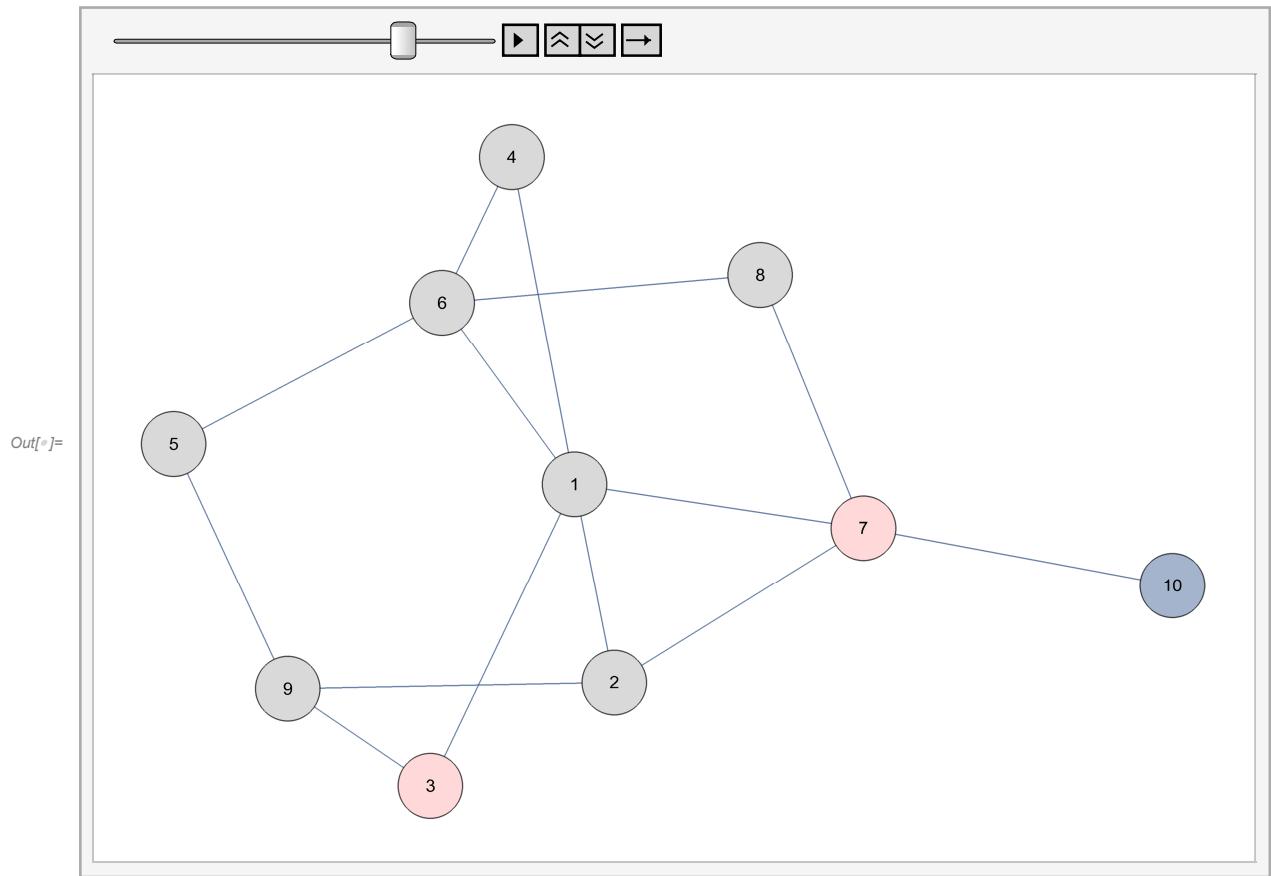
We can augment the DFS algorithm to:

- Compute a graph's minimum spanning tree.
- Detect and find cycles in a graph.
- Check if a graph is bipartite.
- Find strongly connected components.
- Topologically sort the nodes of a graph.
- Find bridges and articulation points.
- Find augmenting paths in a flow network.
- Generate mazes.

breadthfirstsearch (BFS)

algorithm

```
In[6]:= ListAnimate[
Module[{visit = Function[# \[Rule] LightRed], visited = Function[# \[Rule] LightGray]},
GraphPlot[{{1 \[UndirectedEdge] 2}, {1 \[UndirectedEdge] 3}, {1 \[UndirectedEdge] 4}, {1 \[UndirectedEdge] 5}, {2 \[UndirectedEdge] 3}, {2 \[UndirectedEdge] 6}, {3 \[UndirectedEdge] 6}, {3 \[UndirectedEdge] 7}, {4 \[UndirectedEdge] 8}, {5 \[UndirectedEdge] 6}, {5 \[UndirectedEdge] 9}, {6 \[UndirectedEdge] 7}, {7 \[UndirectedEdge] 10}, {8 \[UndirectedEdge] 9}, {9 \[UndirectedEdge] 10}}, VertexStyle \[Rule] visit, options] & /@ 
FoldList[Append, {}, Join[visit /@ {5, 6, 9}, visited /@ {5}, visit /@ {4, 8, 1}, visited /@ {6}, visit /@ {2, 3}, 
visited /@ {9, 4}, visit /@ {7}, visited /@ {8, 1, 2, 3}, visit /@ {10}, visited /@ {7, 10}]]]
]
```



```
# Global/class scope variables
n = number of nodes in the graph
g = adjacency list representing unweighted graph

# s = start node, e = end node, and 0 ≤ e,s < n
function bfs(s, e):

    # Do a BFS starting at node s
    prev = solve(s)

    # Return reconstructed path from s -> e
    return reconstructPath(s, e, prev)
```

```

function solve(s):
    q = queue data structure with enqueue and dequeue
    q.enqueue(s)

    visited = [false, ..., false] # size n
    visited[s] = true

    prev = [null, ..., null] # size n
    while !q.isEmpty():
        node = q.dequeue()
        neighbours = g.get(node)

        for next : neighbours:
            if !visited[next]:
                q.enqueue(next)
                visited[next] = true
                prev[next] = node
    return prev

function reconstructPath(s, e, prev):

    # Reconstruct path going backwards from e
    path = []
    for (at = e; at != null; at = prev[at]):
        path.add(at)

    path.reverse()

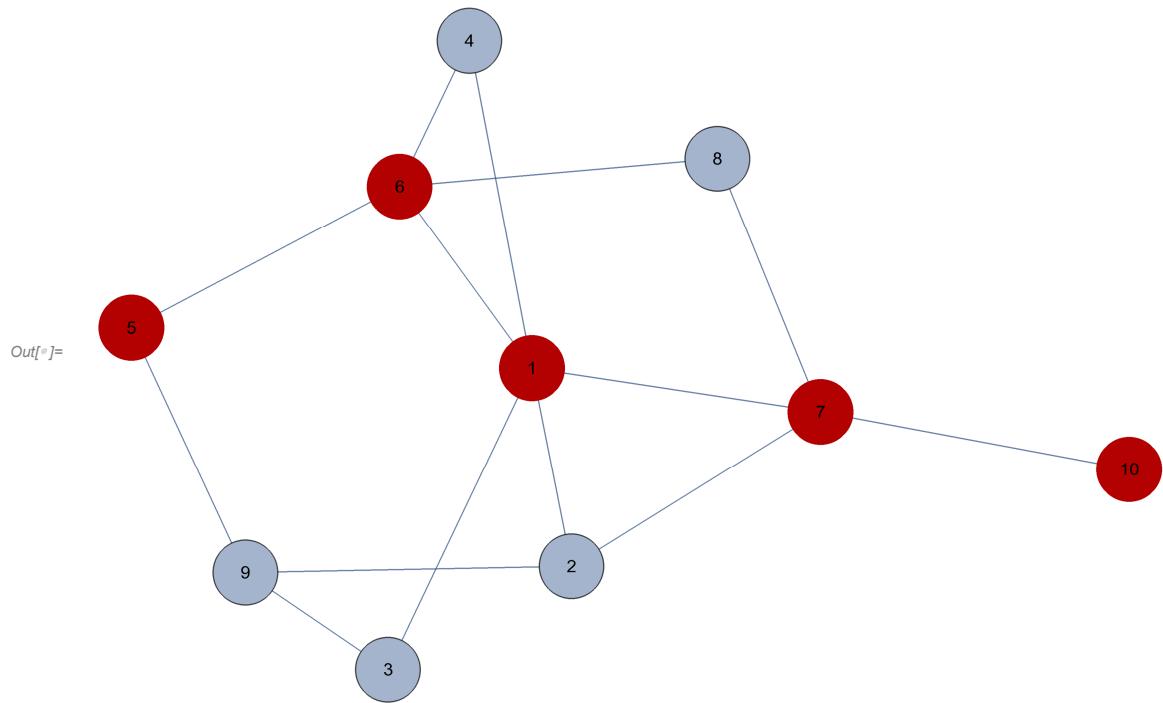
    # If s and e are connected return the path
    if path[0] == s:
        return path
    return []

```

applications

shortest path problem (unweighted graph)

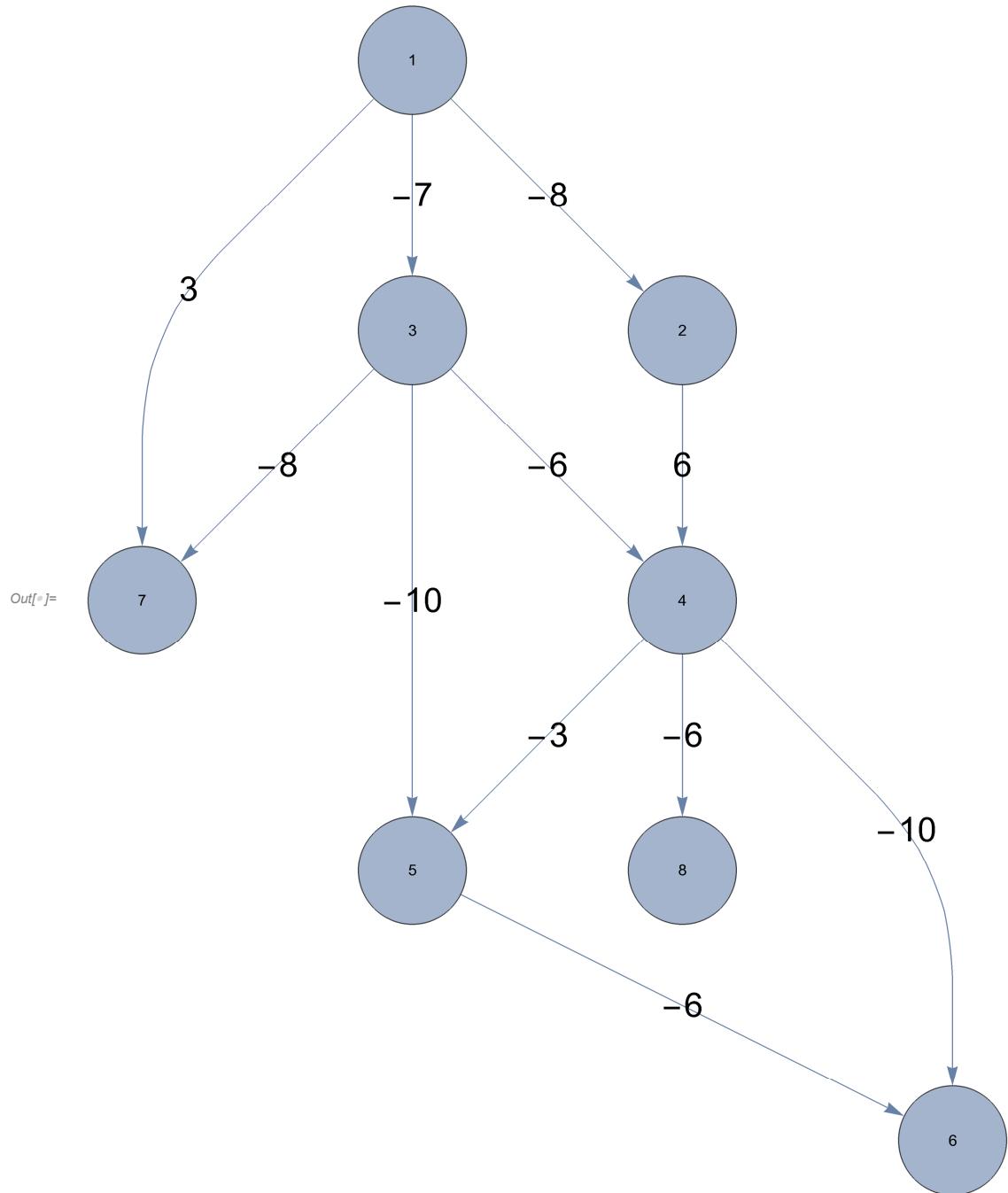
 $O(V+E)$

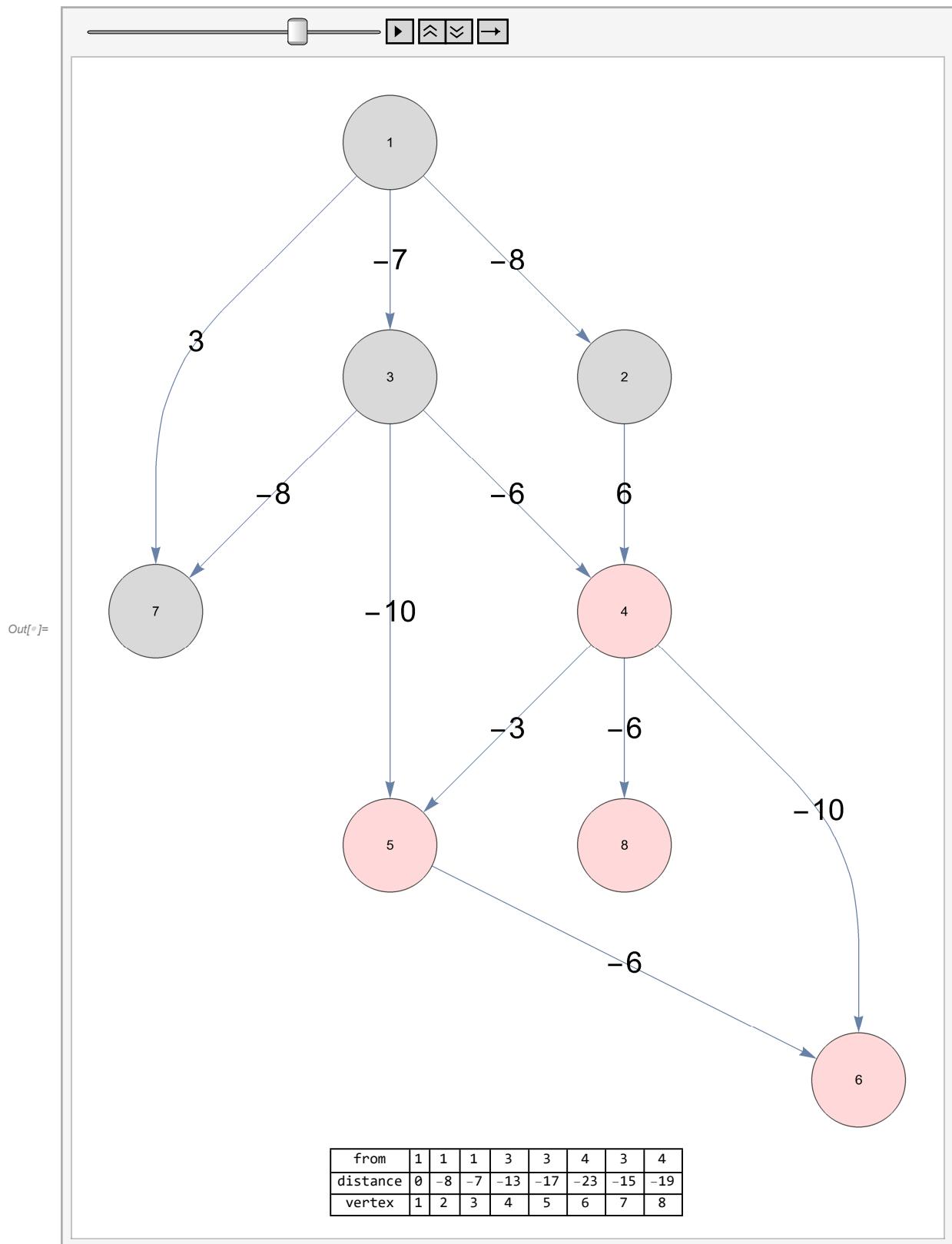


single source shortest path (SSSP) on directed acyclic graph (DAG)

```
In[8]:= Module[{weights = RandomInteger[{-10, 10}, 11],
  edges = {1 → 2, 1 → 3, 2 → 4, 3 → 4, 3 → 5, 4 → 5, 1 → 7, 3 → 7, 4 → 8, 4 → 6, 5 → 6}},
  Echo[weights];
  Graph[Range[7], edges, EdgeWeight → weights, options,
  EdgeLabels → Thread[Rule[edges, weights]], EdgeLabelStyle → Directive[20]]]
]

» {-8, -7, 6, -6, -10, -3, 3, -8, -6, -10, -6}
```





longest path on DAG

Dijkstra algorithm

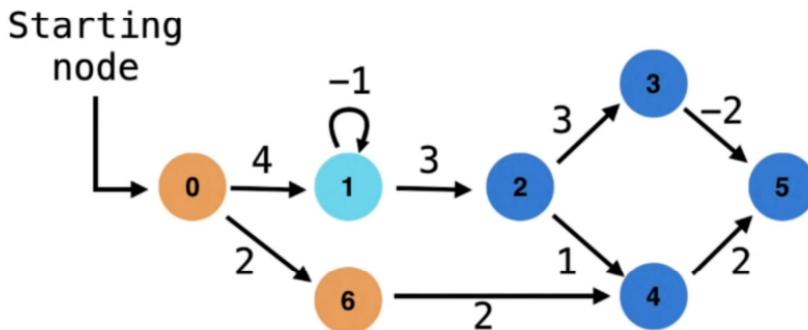
$O((V+E)\log V)$

Bellman - Ford Algorithm

 $O(EV)$ 

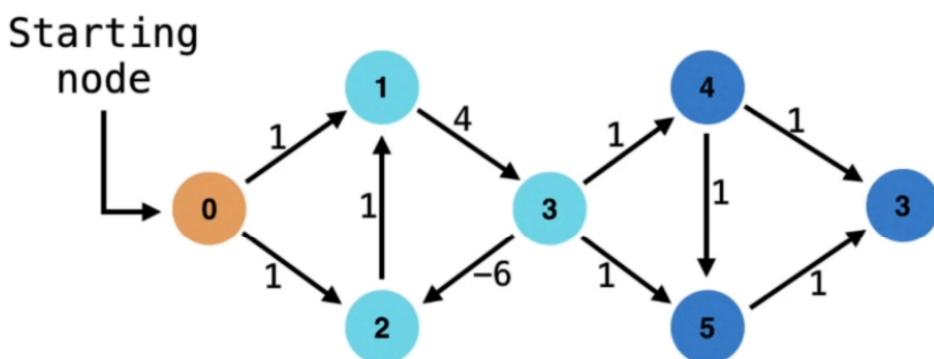
# Negative Cycles

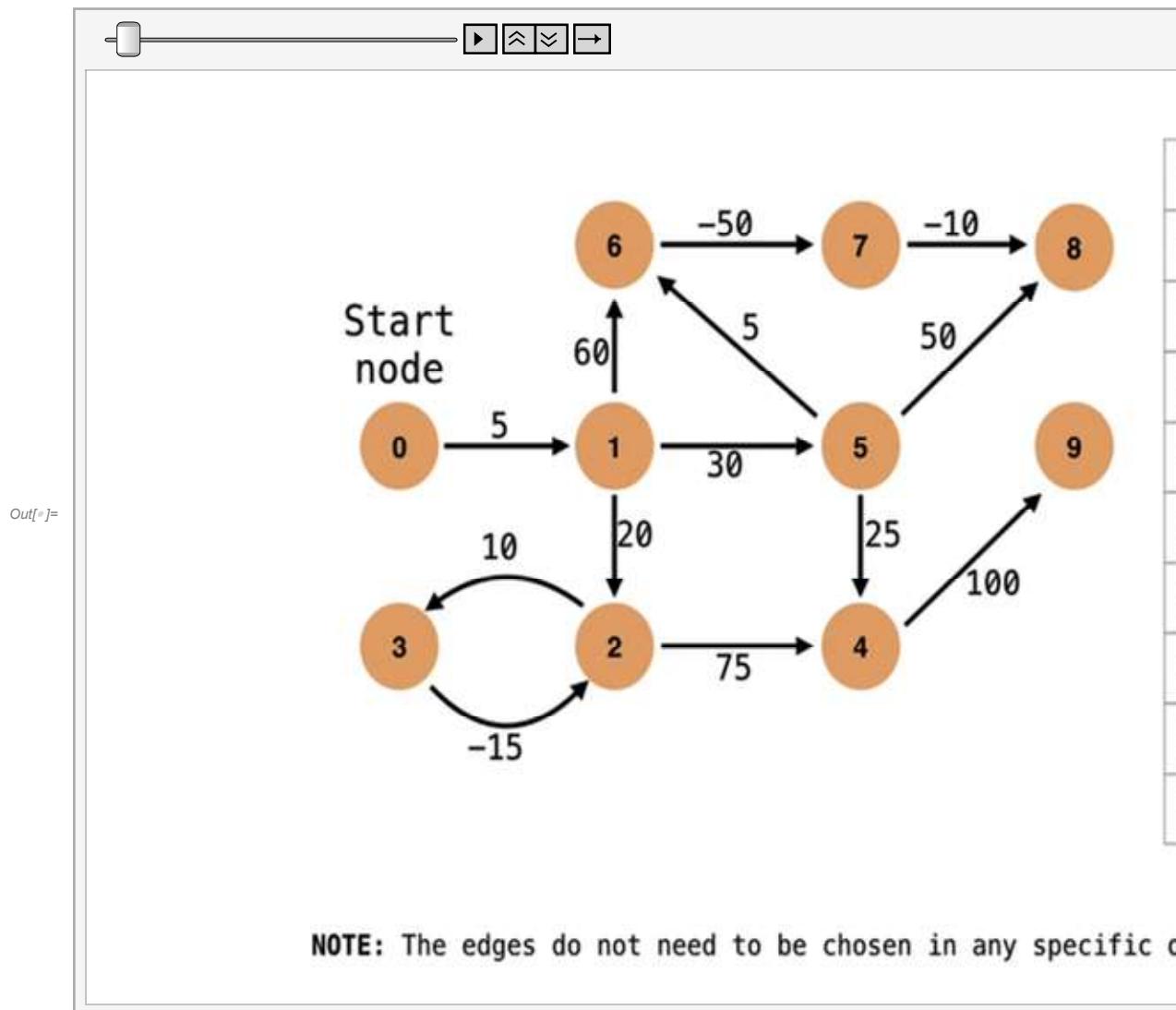
Negative cycles can manifest themselves in many ways...



# Negative Cycles

Negative cycles can manifest themselves in many ways...





Floyd-Warshall algorithm (all pairs shortest path (APSP))

$O(V^3)$

...