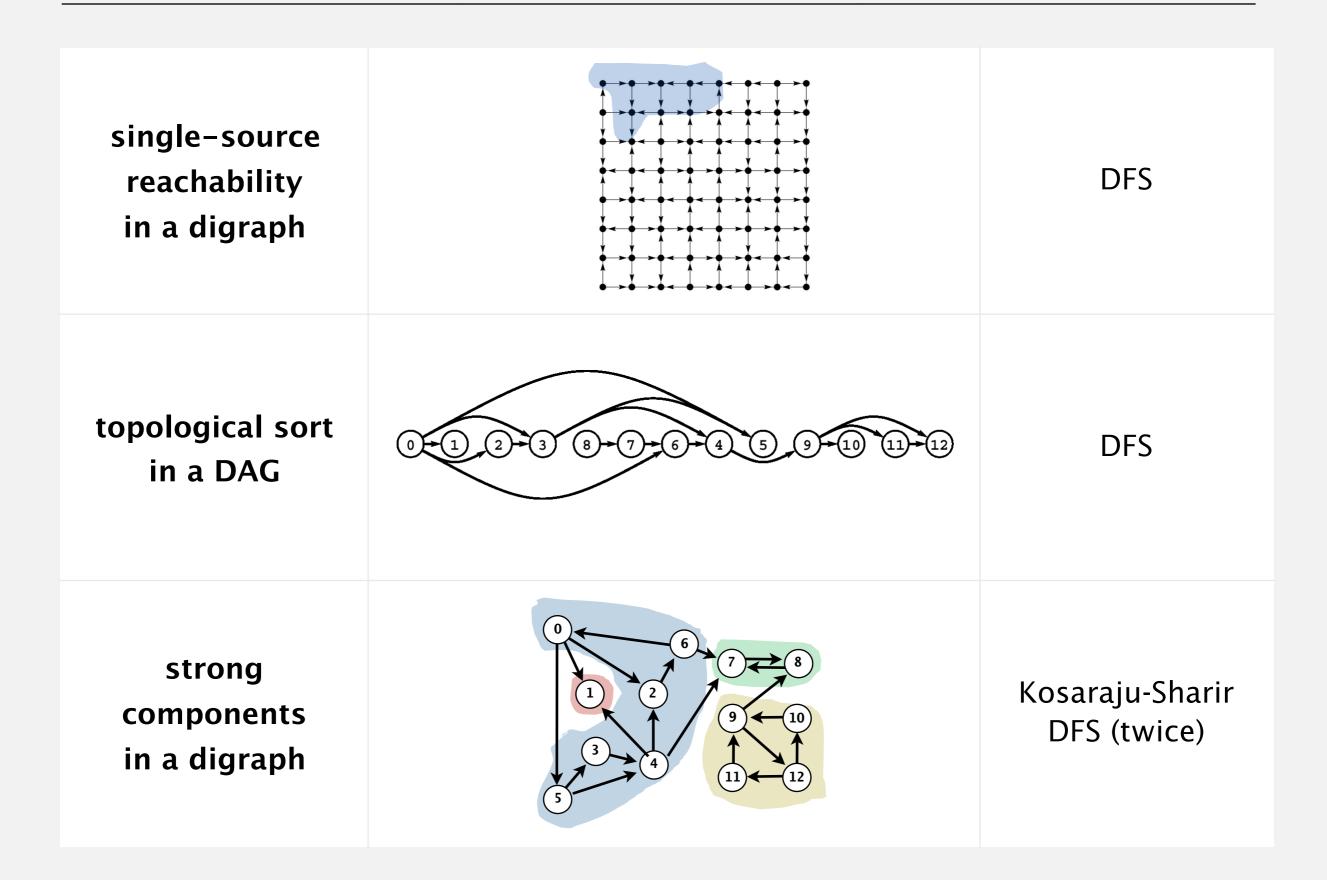
## Digraph-processing summary: algorithms of the day



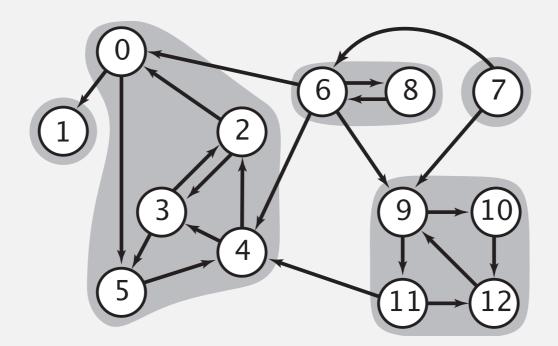
## Strongly-connected components

Def. Vertices v and w are strongly connected if there is both a directed path from v to w and a directed path from w to v.

Key property. Strong connectivity is an equivalence relation:

- v is strongly connected to v.
- If v is strongly connected to w, then w is strongly connected to v.
- If *v* is strongly connected to *w* and *w* to *x*, then *v* is strongly connected to *x*.

Def. A strong component is a maximal subset of strongly-connected vertices.



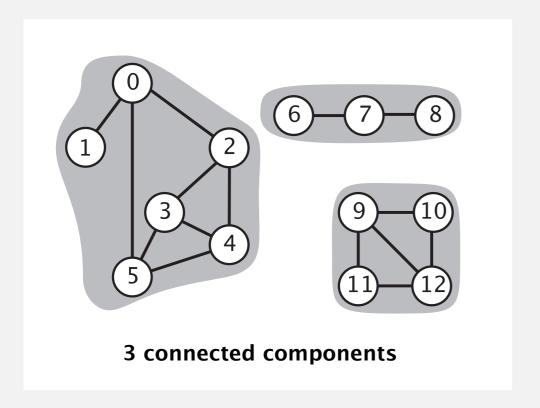
5 strongly-connected components

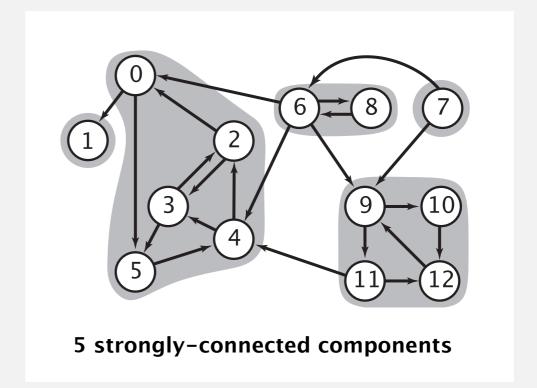
# HOW IS THIS DIFFERENT FROM UNION FIND?

### Connected components vs. strongly-connected components

v and w are connected if there is a path between v and w

v and w are strongly connected if there is both a directed path from v to w and a directed path from w to v





connected component id (easy to compute with DFS)

id[] 
$$\frac{0}{0}$$
  $\frac{1}{0}$   $\frac{2}{0}$   $\frac{3}{0}$   $\frac{4}{0}$   $\frac{5}{0}$   $\frac{6}{0}$   $\frac{7}{0}$   $\frac{8}{0}$   $\frac{9}{10}$   $\frac{11}{12}$   $\frac{12}{2}$ 

strongly-connected component id (how to compute?)

```
public boolean connected(int v, int w)
{ return id[v] == id[w]; }
```

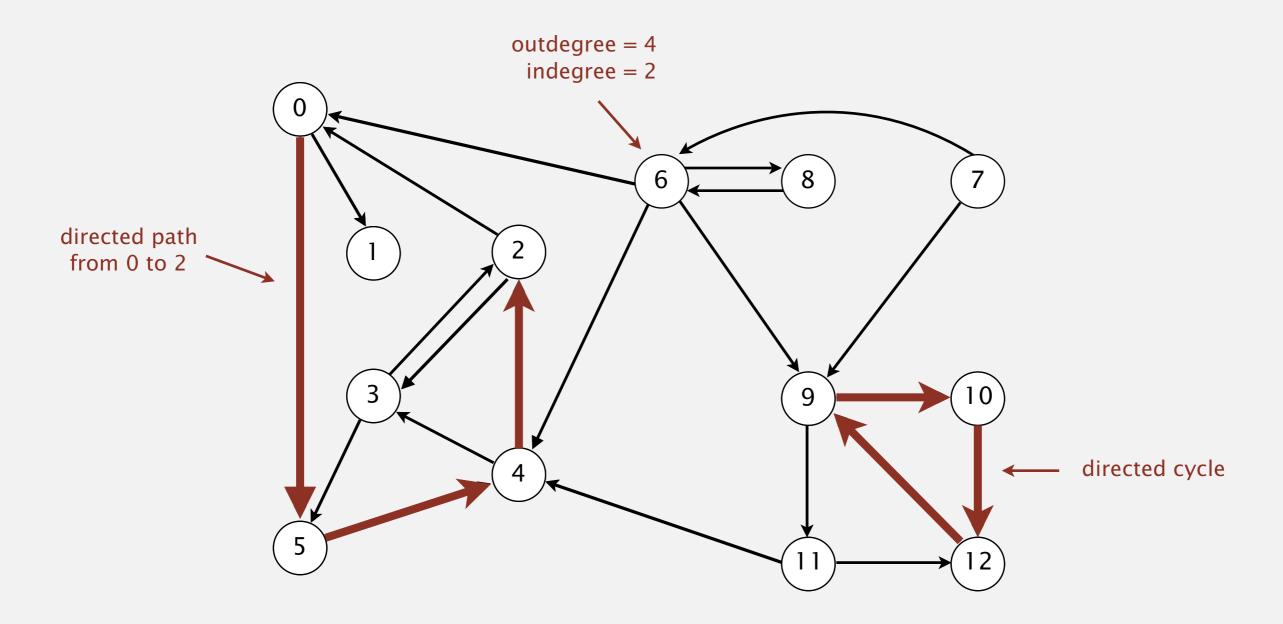
constant-time client connectivity query

```
public boolean stronglyConnected(int v, int w)
{ return id[v] == id[w]; }
```

constant-time client strong-connectivity query

## Directed graphs

Digraph. Set of vertices connected pairwise by directed edges.



## Some graph-processing problems

Path. Is there a path between s and t? Shortest path. What is the shortest path between s and t?

Cycle. Is there a cycle in the graph?

Euler cycle. Is there a cycle that uses each edge exactly once?

Hamilton cycle. Is there a cycle that uses each vertex exactly once.

Connectivity. Is there a way to connect all of the vertices? (Min Spanning Tree). What is the best way to connect all of the vertices? Biconnectivity. Is there a vertex whose removal disconnects the graph?

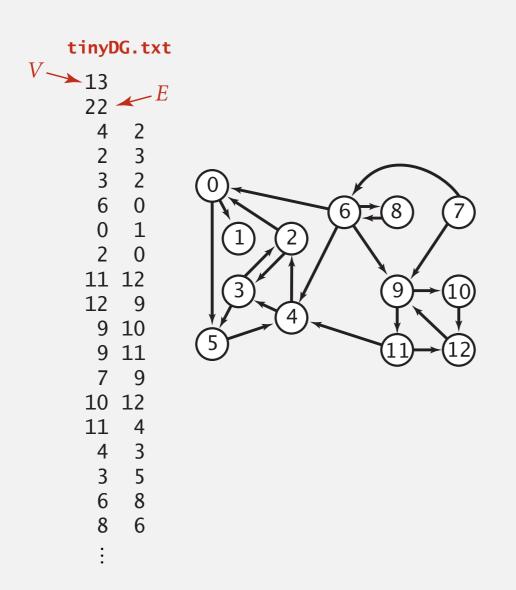
Planarity. Can you draw the graph in the plane with no crossing edges Graph isomorphism. Do two adjacency lists represent the same graph?

## DIRECTED GRAPH API

## Digraph API

public class	Digraph	
	Digraph(int V)	create an empty digraph with V vertices
	Digraph(In in)	create a digraph from input stream
void	addEdge(int v, int w)	add a directed edge v→w
Iterable <integer></integer>	adj(int v)	vertices pointing from v
int	V()	number of vertices
int	E()	number of edges
Digraph	reverse()	reverse of this digraph
String	toString()	string representation

## Digraph API



```
% java Digraph tinyDG.txt
0->5
0->1
2->0
2->3
3->5
3->2
4->3
4->2
5->4
:
11->4
11->12
12->9
```

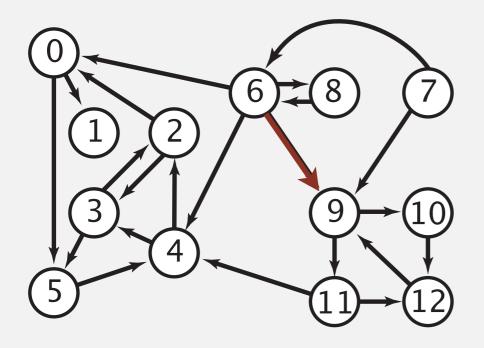
```
In in = new In(args[0]);
Digraph G = new Digraph(in);

for (int v = 0; v < G.V(); v++)
  for (int w : G.adj(v))
    StdOut.println(v + "->" + w);
read digraph from input stream

print out each edge (once)
```

## Digraph representation: set of edges

Store a list of the edges (linked list or array).

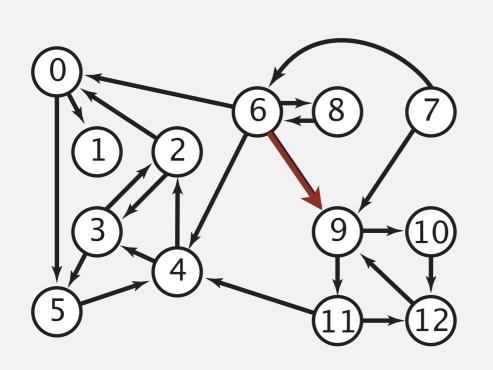


^	4
0	1
0	5
2	5 0
2	3
0 2 2 3	2
3	5
<b>J</b>	)
4	2
4	3
4 4 5 6 6	2 5 2 3 4 0 4
6	0
6	4
6	8
6	9
7	6
7	9
8	6
9 9	10
9	11
10	12
11	4
11	12
12	9

## Digraph representation: adjacency matrix

Maintain a two-dimensional V-by-V boolean array; for each edge  $v \rightarrow w$  in the digraph: adj[v][w] = true.

to



		0	1	2	3	4	5	6	7	8	9	10	11	12
from	0	0	1	0	0	0	1	0	0	0	0	0	0	0
	1	0	0	0	0	0	0	0	0	0	0	0	0	0
	2	1	0	0	1	0	0	0	0	0	0	0	0	0
	3	0	0	1	0	0	1	0	0	0	0	0	0	0
	4	0	0	1	1	0	0	0	0	0	0	0	0	0
	5	0	0	0	0	1	0	0	0	0	0	0	0	0
	6	0	0	0	0	1	0	0	0	1	1	0	0	0
	7	0	0	0	0	0	0	1	0	0	1	0	0	0
	8	0	0	0	0	0	0	1	0	0	0	0	0	0
	9	0	0	0	0	0	0	0	0	0	0	1	1	0
	10	0	0	0	0	0	0	0	0	0	0	0	0	1
	11	0	0	0	0	1	0	0	0	0	0	0	0	1
	12	0	0	0	0	0	0	0	0	0	1	0	0	0

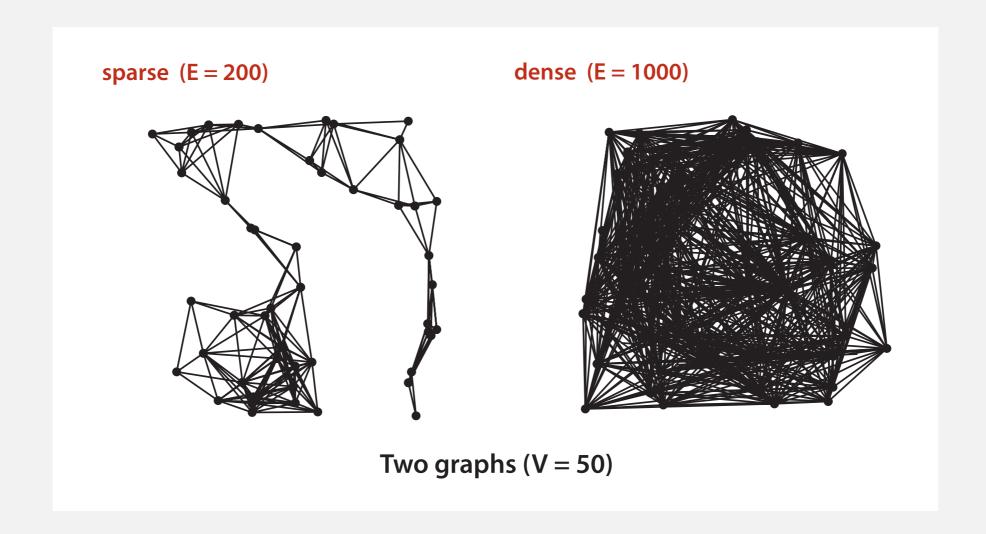
A-lot of empty space

## Graph representations

In practice. Use adjacency-lists representation.

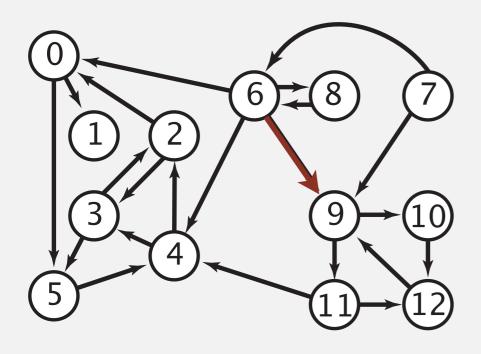
• Real-world graphs tend to be sparse.

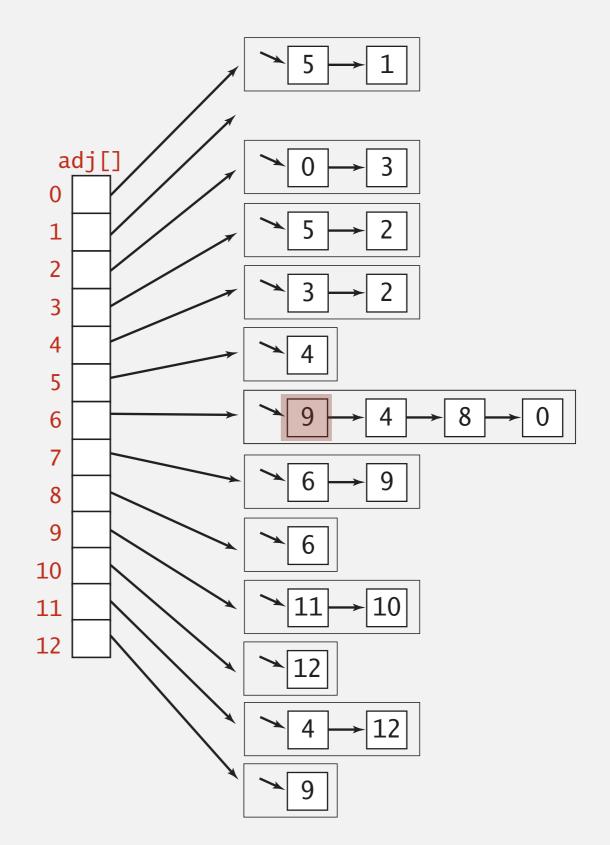
huge number of vertices, small average vertex degree



## Digraph representation: adjacency lists

Maintain vertex-indexed array of lists.

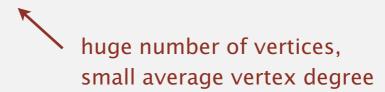




## Digraph representations

In practice. Use adjacency-lists representation.

- Algorithms based on iterating over vertices pointing from v.
- Real-world digraphs tend to be sparse.



representation	space	insert edge from v to w	edge from v to w?	iterate over vertices pointing from v?
list of edges	E	1	E	E
adjacency matrix	$V^2$	1	1	V
adjacency lists	E + V	1	outdegree(v)	outdegree(v)

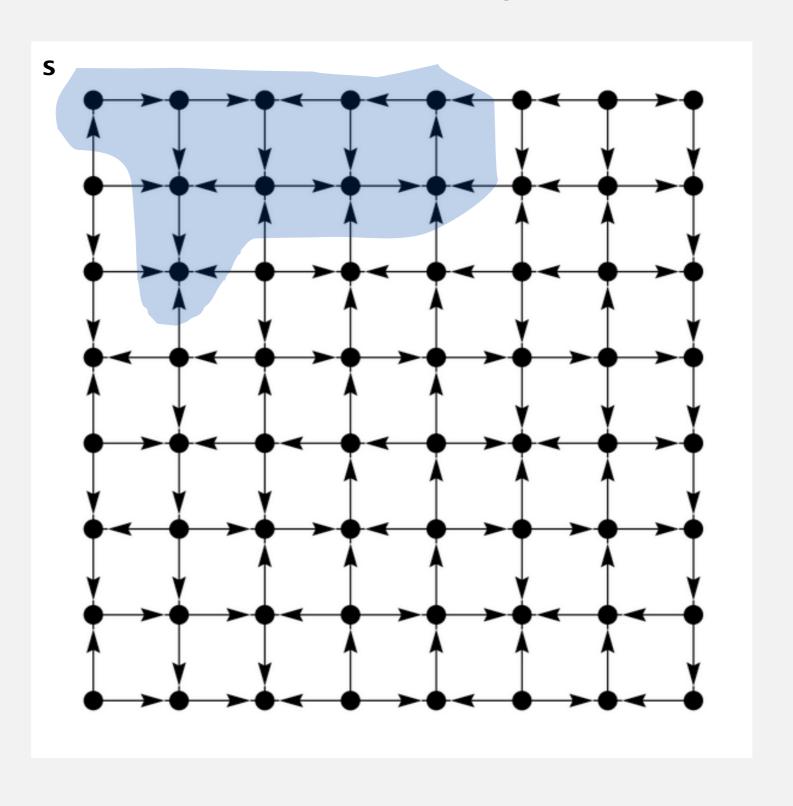
## Adjacency-lists graph representation (review): Java implementation

```
public class Digraph
   private final int V;
                                                              adjacency lists
   private final int[] adj;
   public Digraph(int V)
                                                              create empty graph
                                                              with V vertices
      this.V = V;
      adj = new int[V];
      for (int v = 0; v < V; v++)
          adj[v] = new ArrayList<Integer>();
   public void addEdge(int v, int w)
      adj[v].add(w);
                                                              add edge v-w
   public Iterable<Integer> adj(int v)
                                                              iterator for vertices
   { return adj[v]; }
                                                              adjacent to v
```

## SEARCHING A DIRECTED GRAPH

## Reachability

Problem. Find all vertices reachable from *s* along a directed path.



## Depth-first search in digraphs (review 2150)

#### Same method as for undirected graphs.

- Every undirected graph is a digraph (with edges in both directions).
- DFS is a digraph algorithm.

**DFS** (to visit a vertex v)

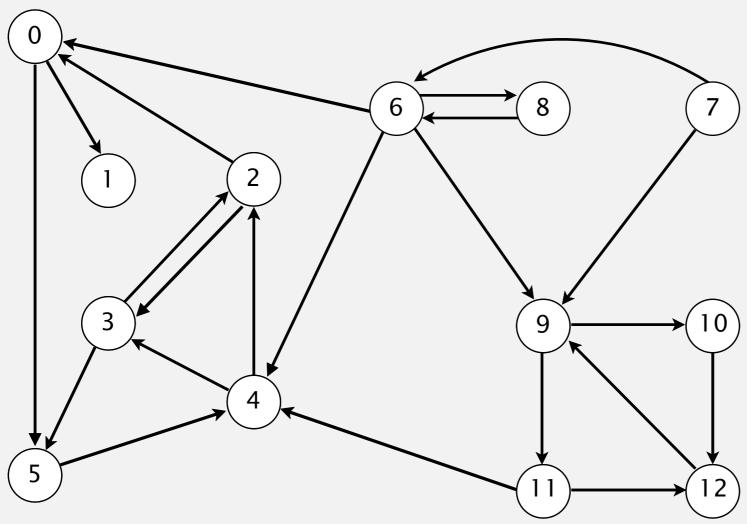
Mark v as visited.

Recursively visit all unmarked vertices w pointing from v.

## Depth-first search demo

#### To visit a vertex *v*:

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



a directed graph

4→2

2→3

3→2

6→0

0→1

2→0

11→12

12→9

9→10

9→11

8→9

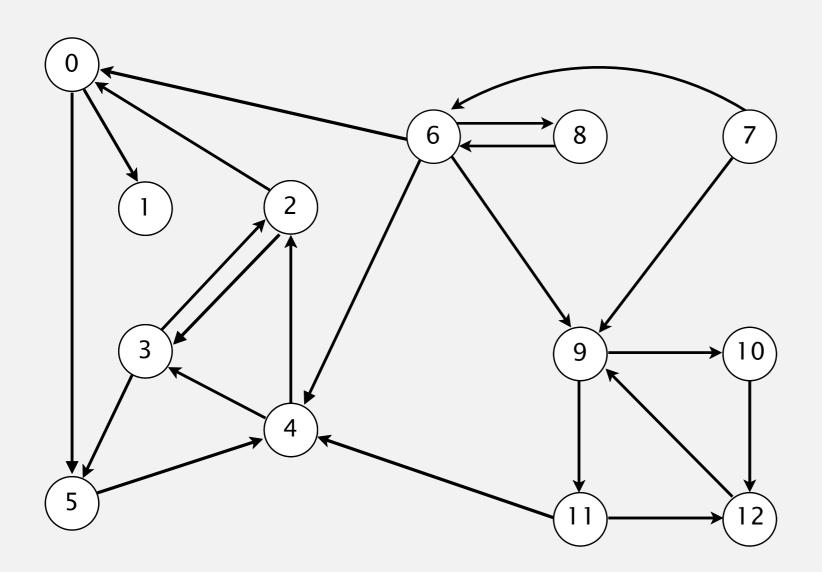
10→12

11→4

7→6

#### To visit a vertex *v*:

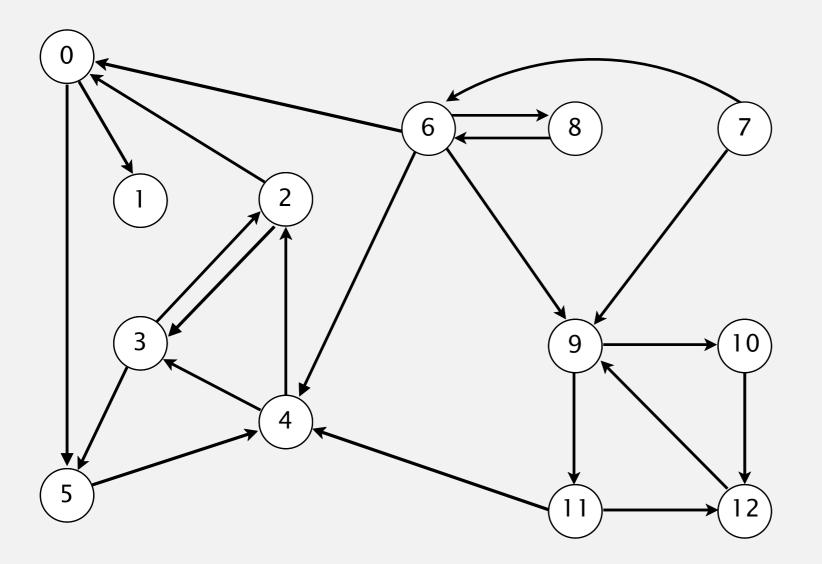
- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



2→3 3→2 6→0 0→1 2→0 11→12 12→9 9→10 9→11 7→9 10→12 11→4 4→3 3→5 6→8 8→6 5→4 0→5 6→4 6→9 7→6

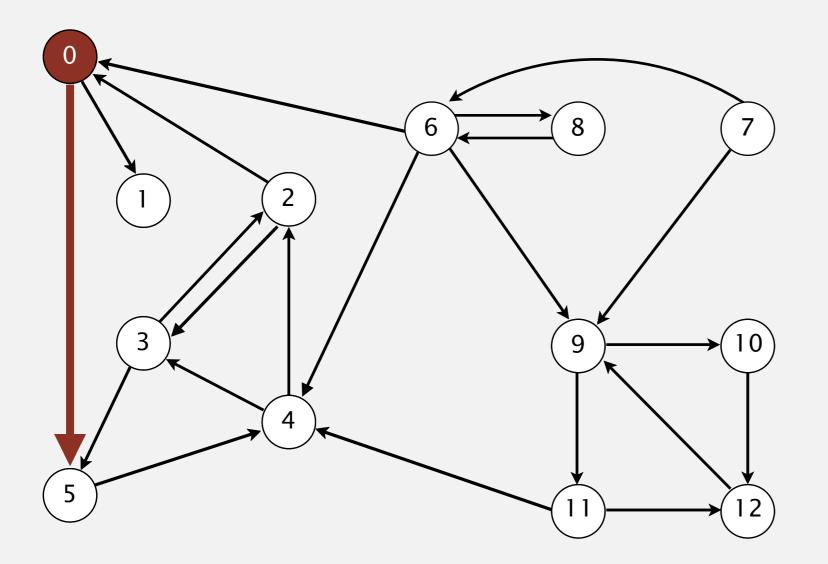
4→2

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



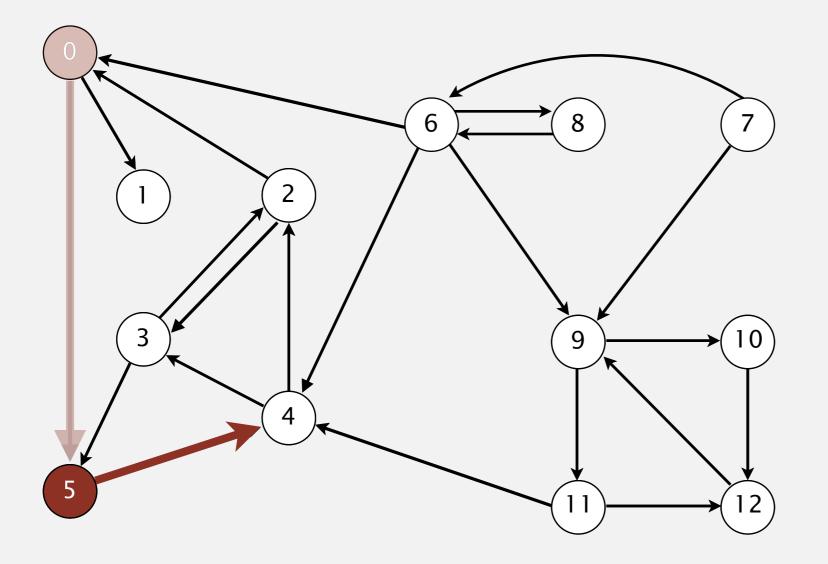
V	marked[]	edgeTo[]
0	F	_
1	F	_
2	F	_
3	F	_
4	F	_
5	F	_
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



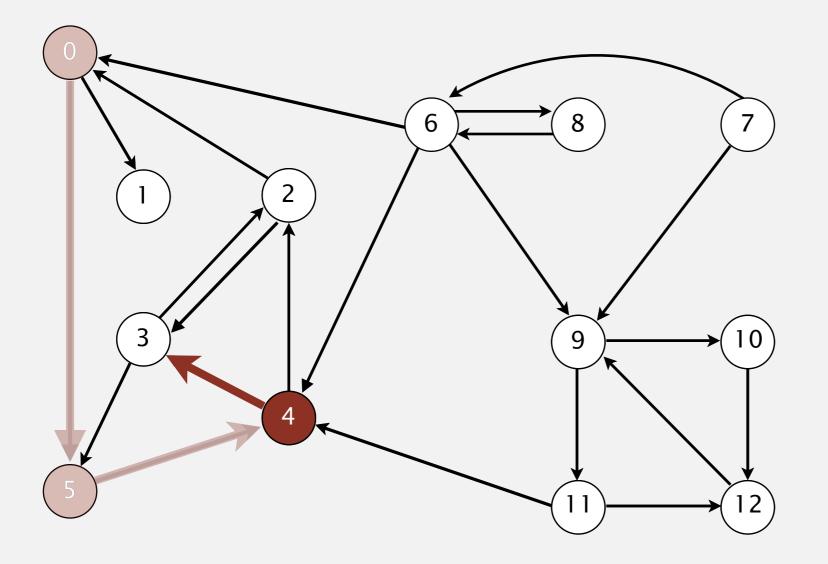
V	marked[]	edgeTo[]
0	(T)	_
1	F	_
2	F	_
3 4	F	_
	F	_
5	F	_
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



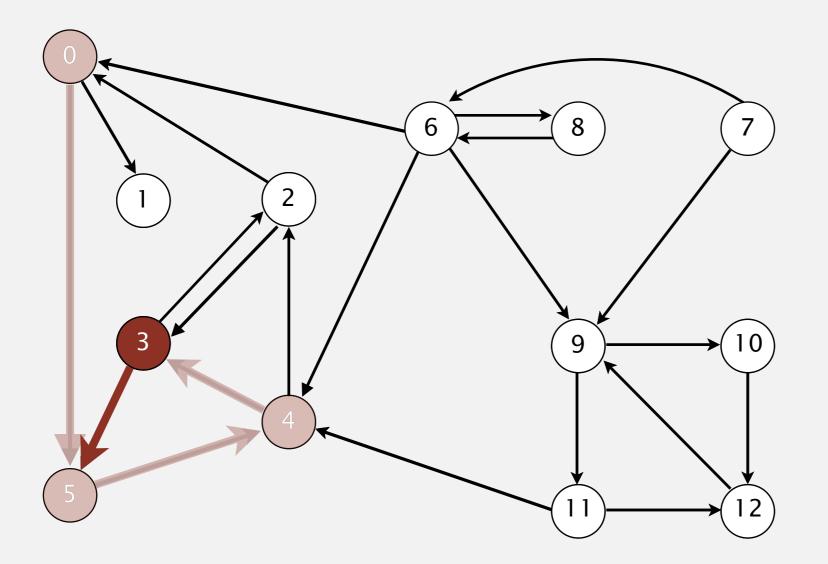
V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	F	_
3	F	_
4	F	_
5	$\overline{T}$	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



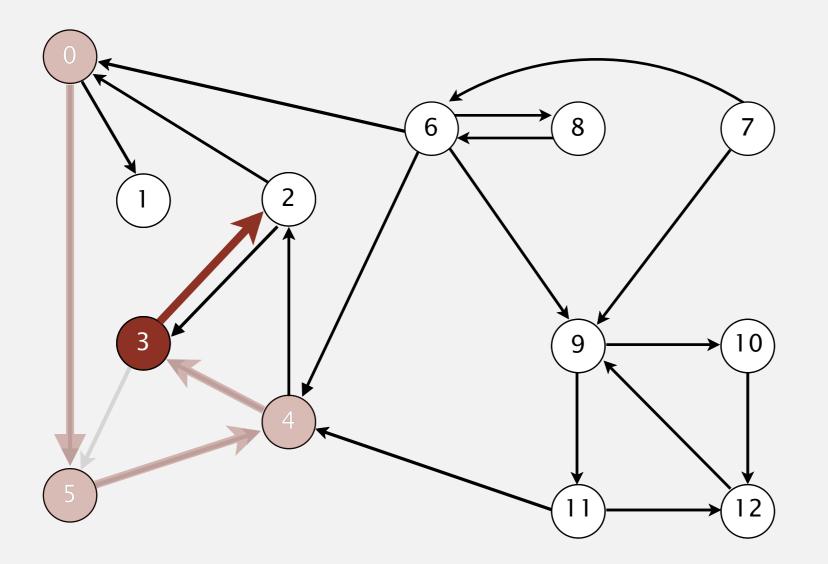
V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	F	_
3 4	F	_
	(T)	5
5	Ť	0
6 7	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	F	_
3 4	$\overline{T}$	4
4	T	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

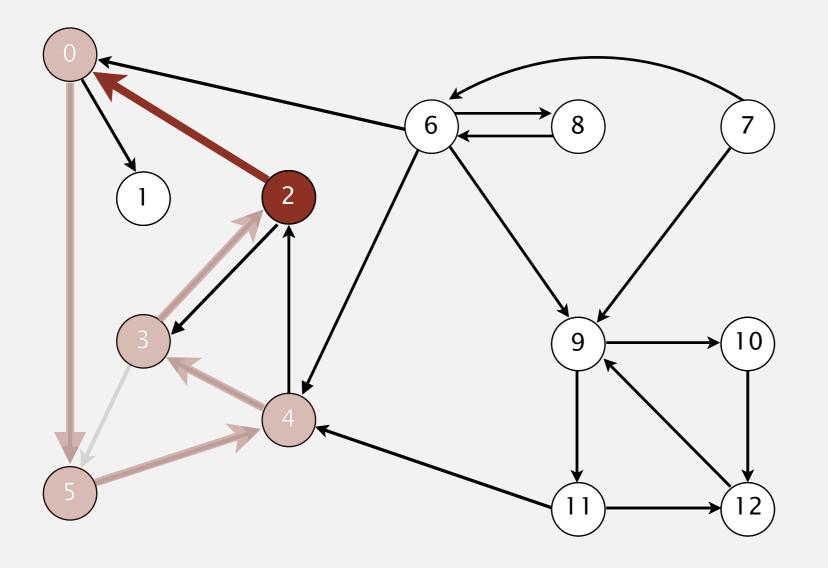
- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	F	_
3	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

visit 3: check 5 and check 2

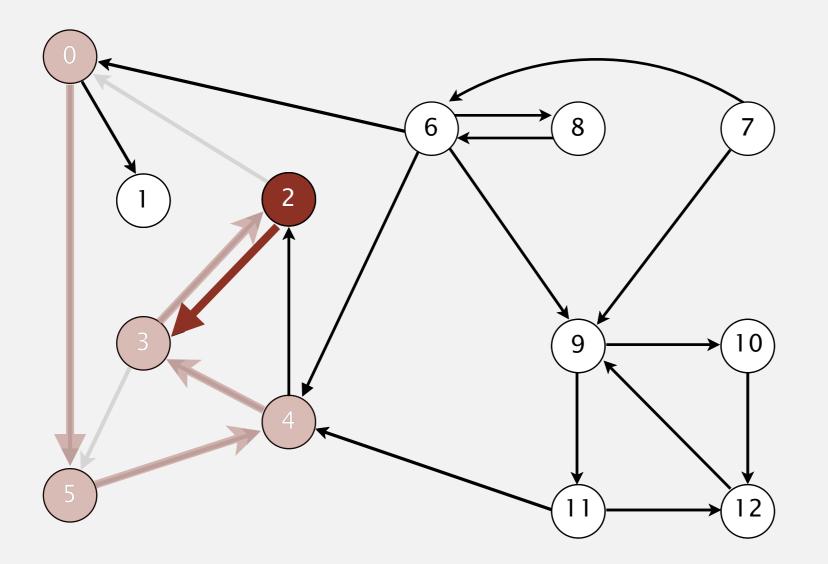
- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	$\overline{T}$	3
3	T	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

visit 2: check 0 and check 3

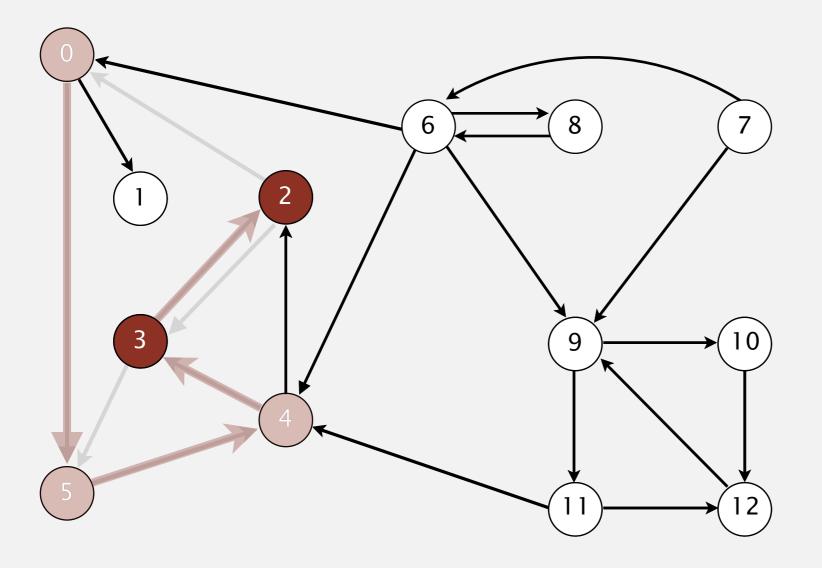
- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	Т	3
3	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

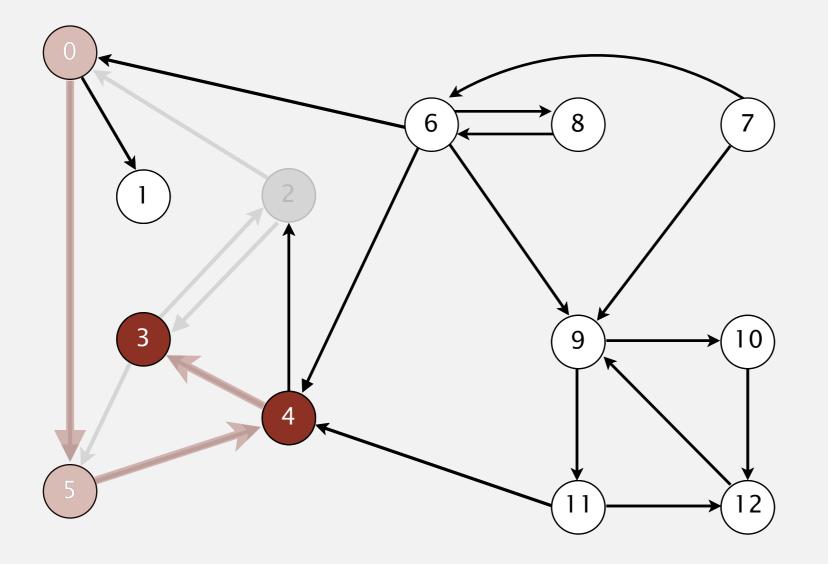
visit 2: check 0 and check 3

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



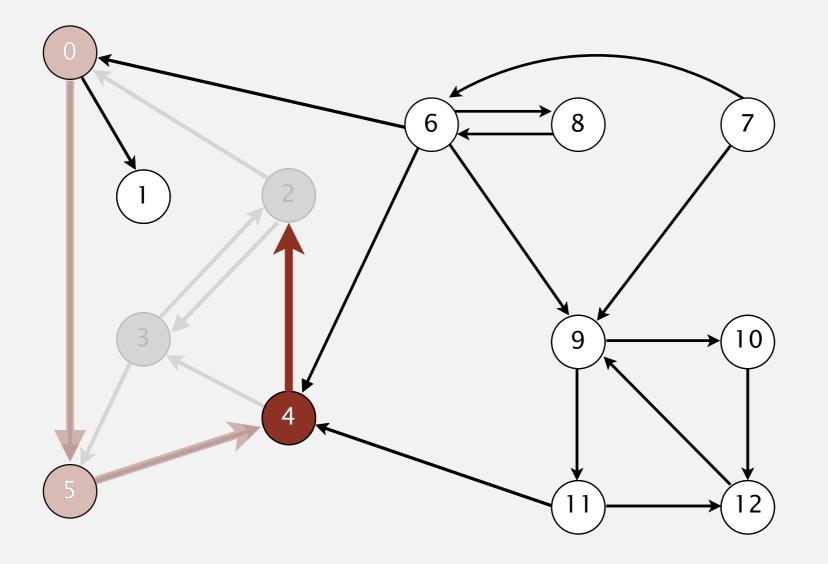
V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	Т	3
3	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	Т	3
3	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

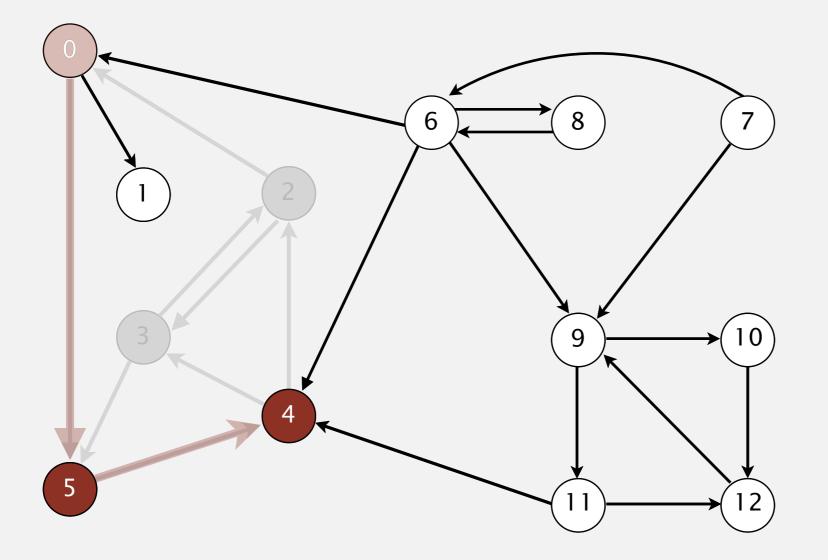
- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	Т	3
3 4	Т	4
	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

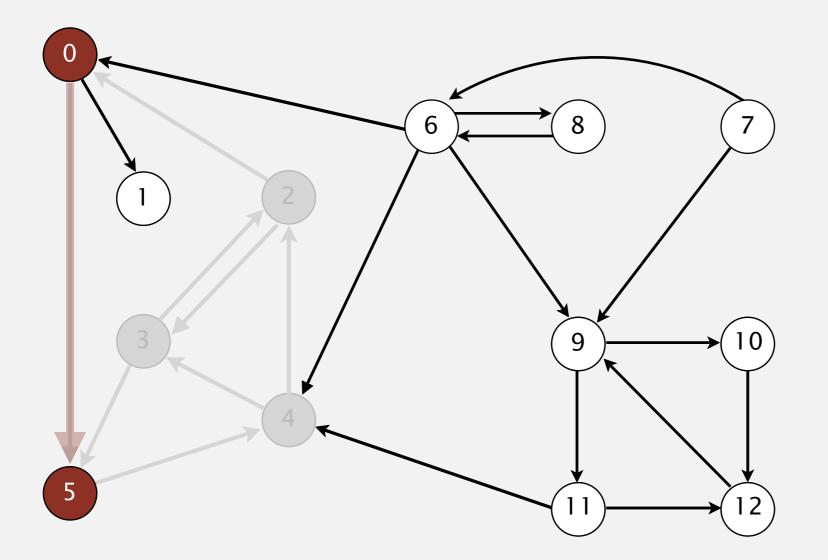
visit 4: check 3 and check 2

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



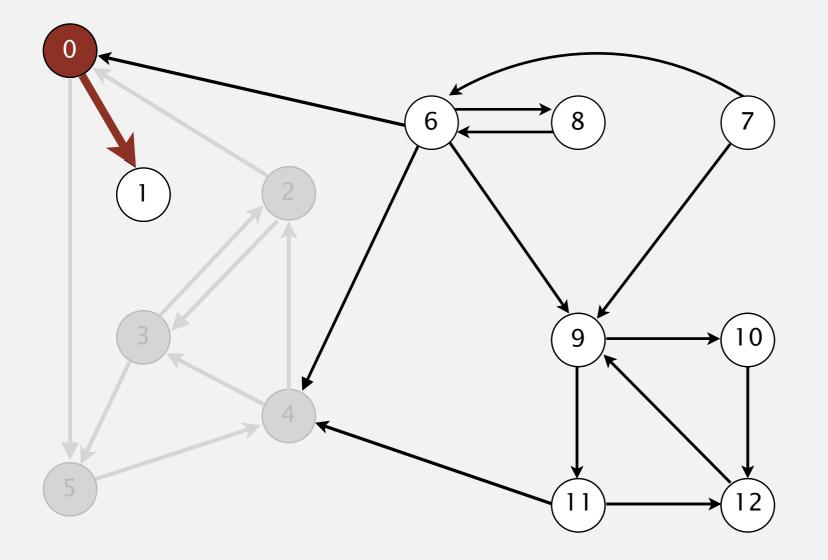
V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	Т	3
3	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	Т	3
3 4	Т	4
	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

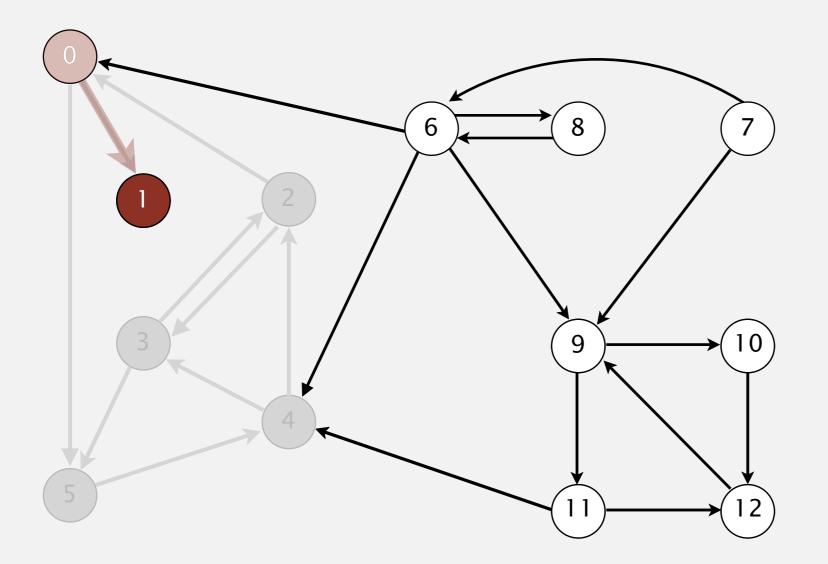
- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	F	_
2	Т	3
3	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

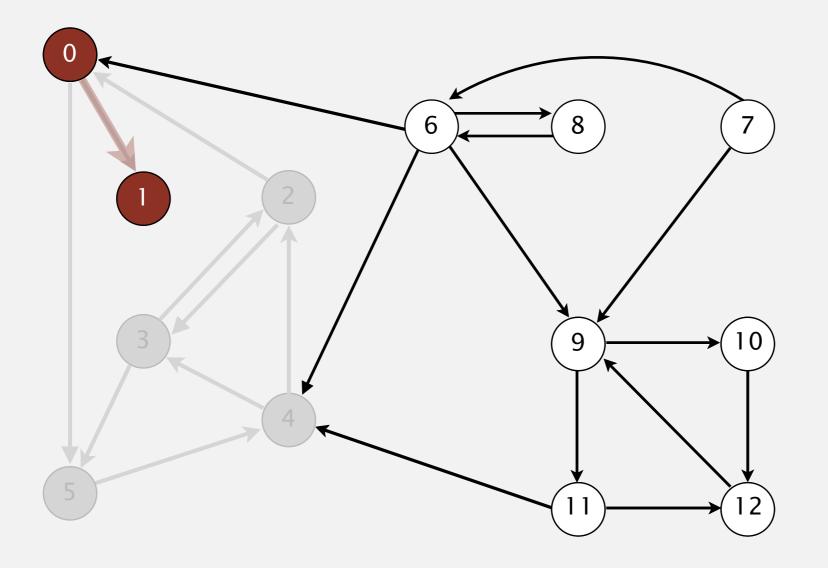
visit 0: check 5 and check 1

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



V	marked[]	edgeTo[]
0	Т	_
1	(T)	0
2	T	3
3 4	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.

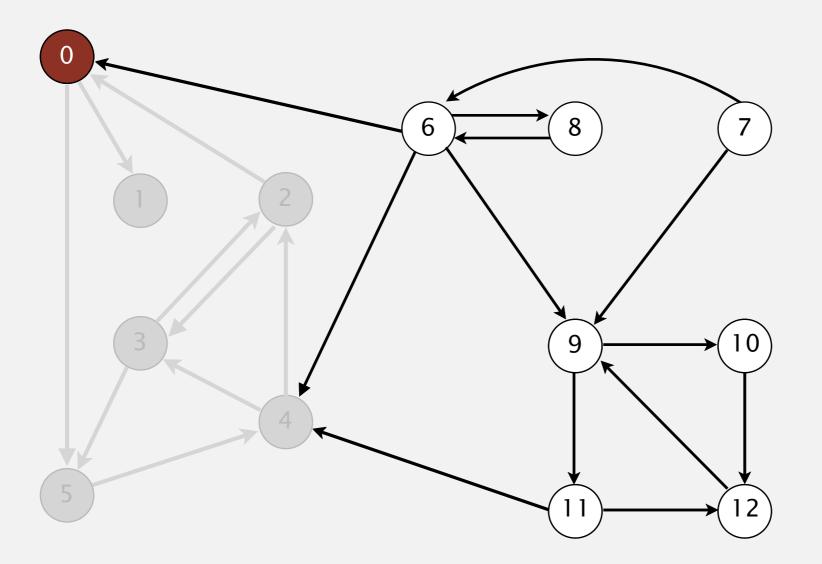


V	marked[]	edgeTo[]
0	Т	_
1	Т	0
2	Т	3
3 4	Т	4
	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

# Directed depth-first search demo

#### To visit a vertex v:

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.

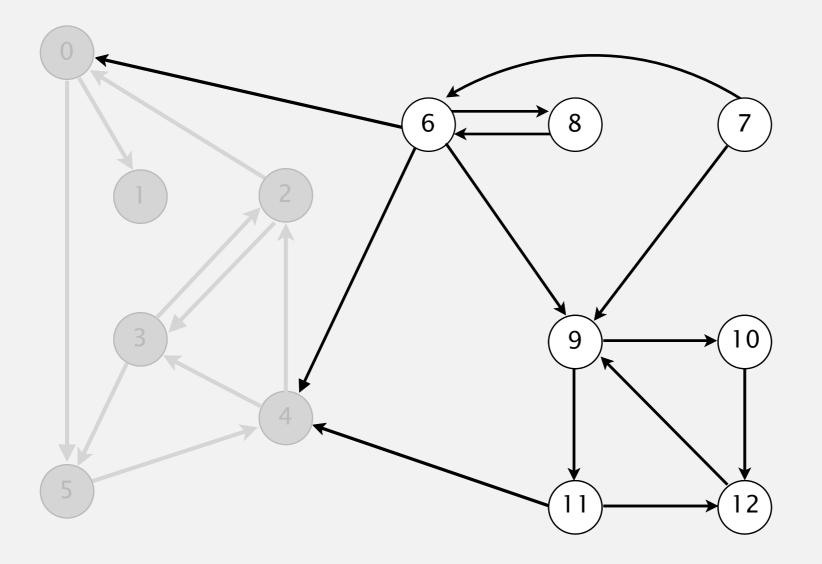


V	marked[]	edgeTo[]
0	Т	_
1	Т	0
2	Т	3
3	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

# Directed depth-first search demo

#### To visit a vertex v:

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.

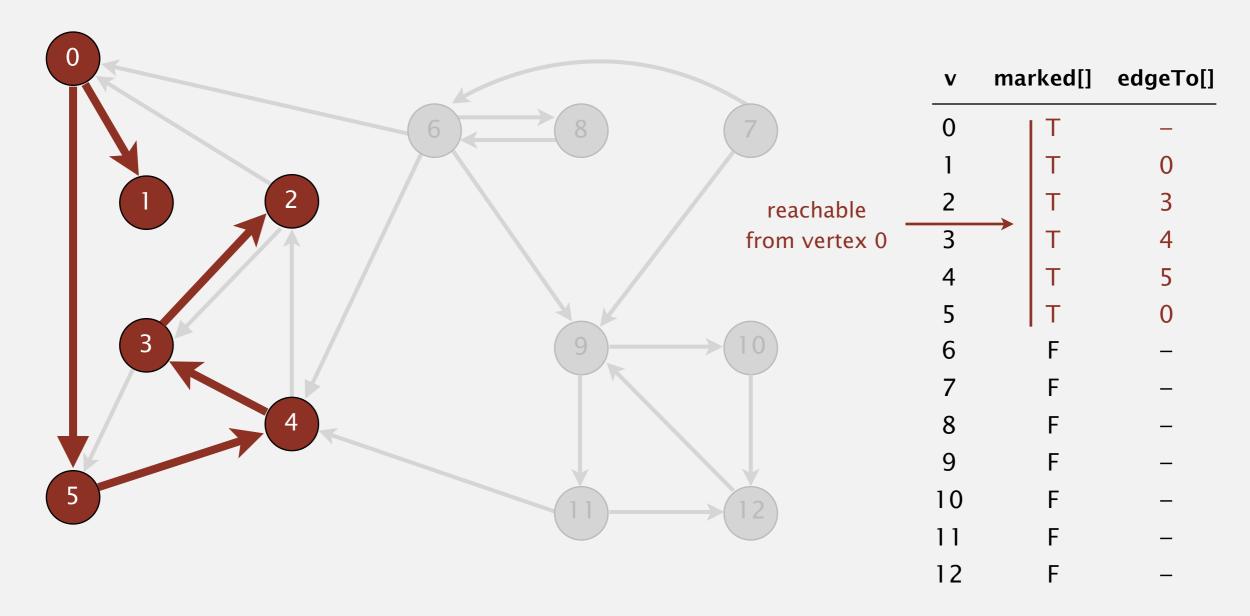


V	marked[]	edgeTo[]
0	Т	_
1	Т	0
2	Т	3
3	Т	4
4	Т	5
5	Т	0
6	F	_
7	F	_
8	F	_
9	F	_
10	F	_
11	F	_
12	F	_

# Directed depth-first search demo

#### To visit a vertex v:

- Mark vertex v as visited.
- Recursively visit all unmarked vertices pointing from v.



# Depth-first search (in directed graphs)

Code for directed graphs identical to undirected one.

Good practice to separate your graph processing from graph

```
public class DirectedDFS
   private boolean[] marked;
                                                          true if path from s
   public DirectedDFS(Digraph G, int s)
                                                           constructor marks
      marked = new boolean[G.V()];
                                                          vertices reachable from s
      dfs(G, s);
   private void dfs(Digraph G, int v)
                                                          recursive DFS does the work
      marked[v] = true;
      for (int w : G.adj(v))
          if (!marked[w]) dfs(G, w);
                                                          client can ask whether any
   public boolean visited(int v)
                                                          vertex is reachable from s
   { return marked[v]; }
```

# BREATH FIRST SEARCH

# Breadth-first search in digraphs

#### Same method as for undirected graphs.

- Every undirected graph is a digraph (with edges in both directions).
- BFS is a digraph algorithm.

#### **BFS** (from source vertex s)

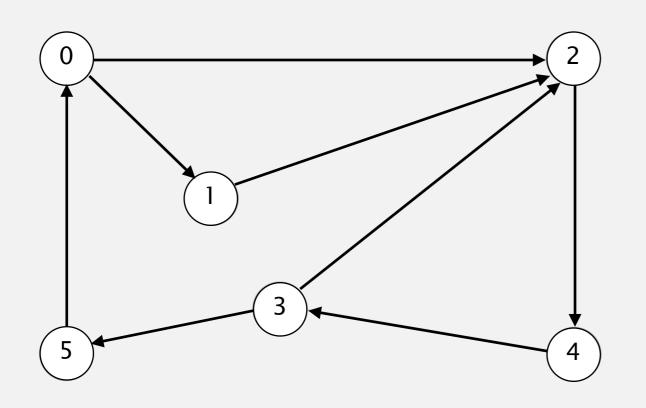
Put s onto a FIFO queue, and mark s as visited. Repeat until the queue is empty:

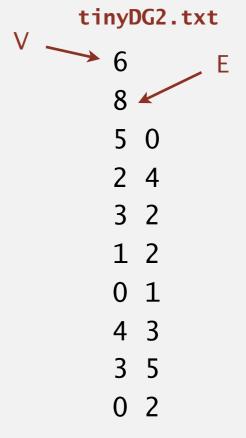
- remove the least recently added vertex v
- for each unmarked vertex pointing from v: add to queue and mark as visited.

Proposition. BFS computes shortest paths (fewest number of edges) from s to all other vertices in a digraph in time proportional to E + V.

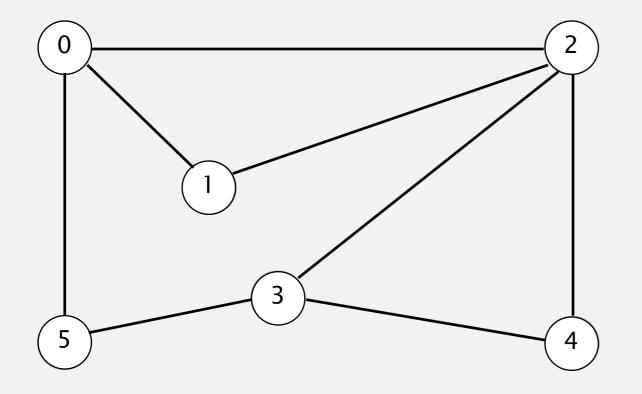
# Directed breadth-first search demo

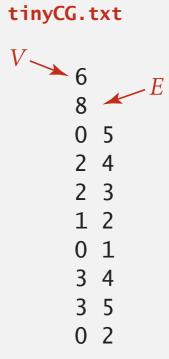
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices pointing from v and mark them.



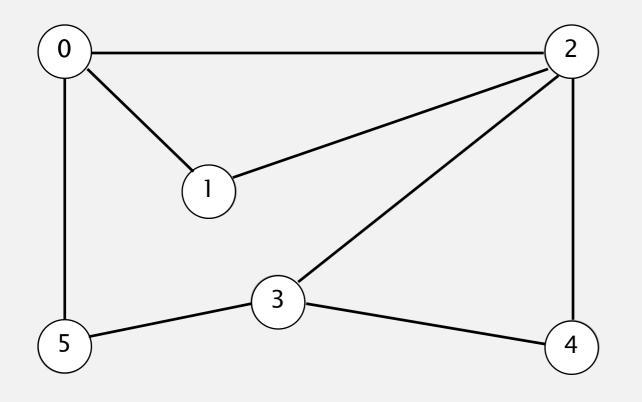


- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



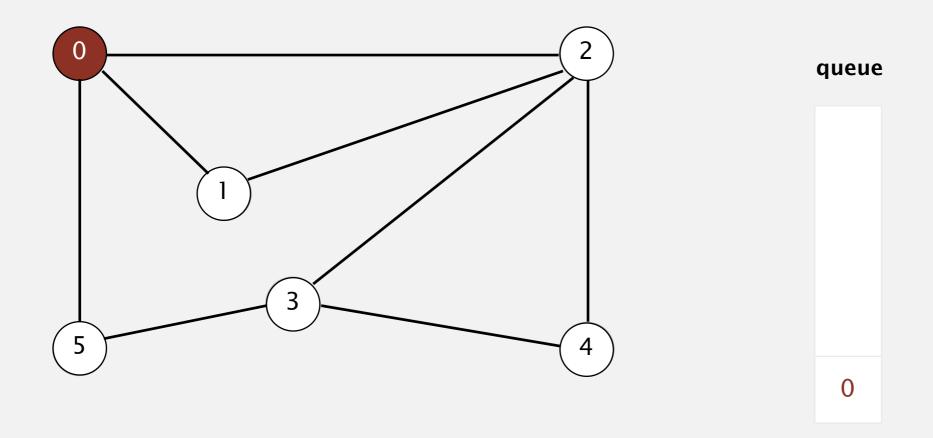


- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.

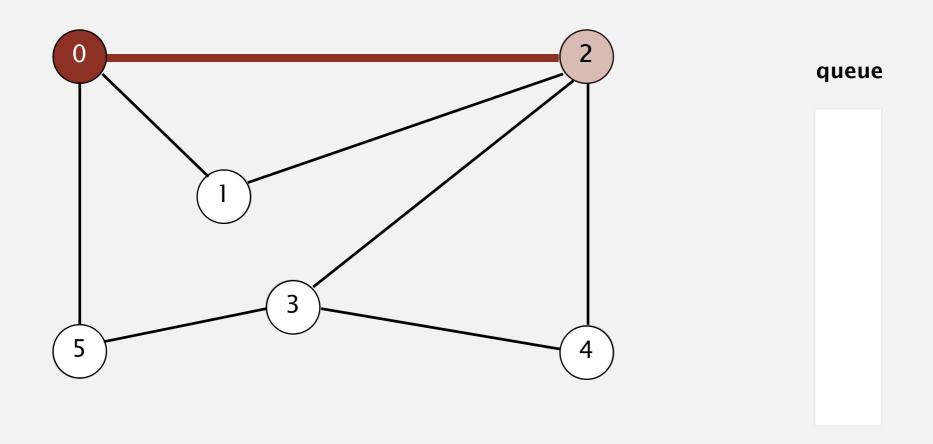




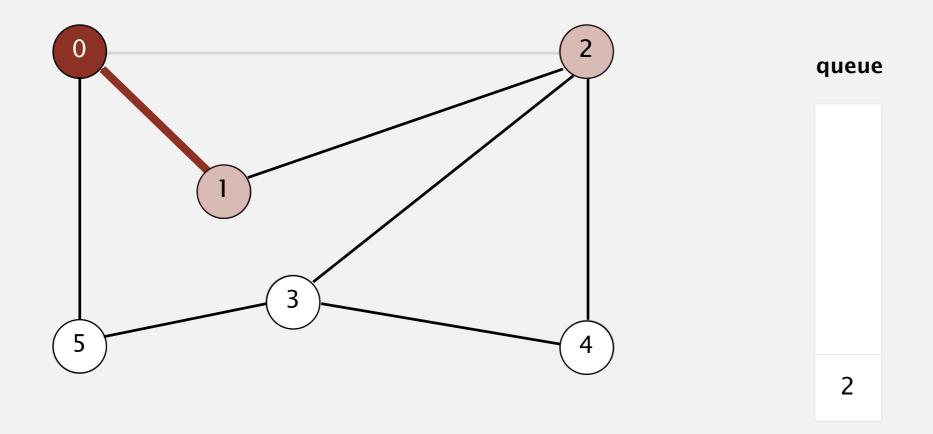
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



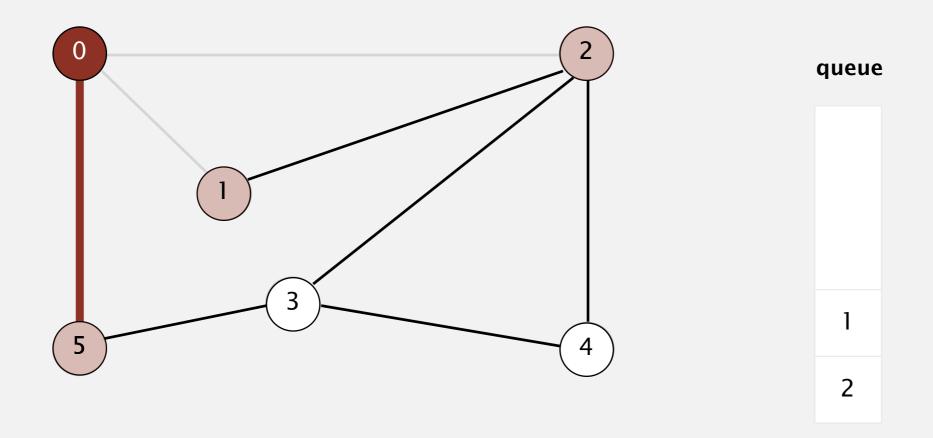
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



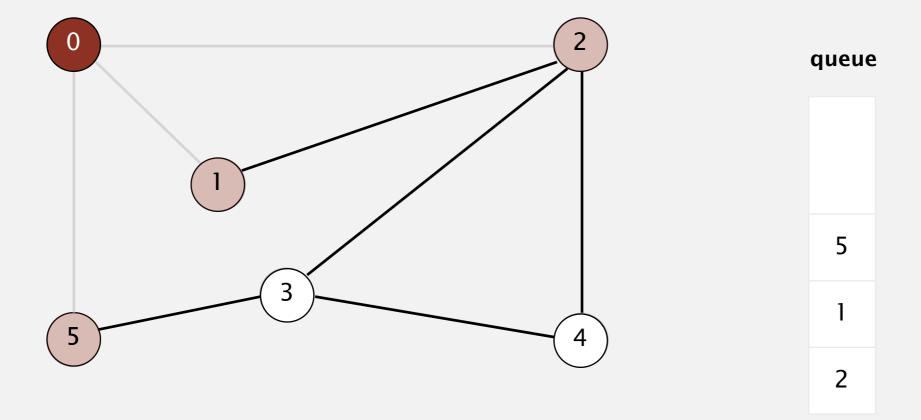
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



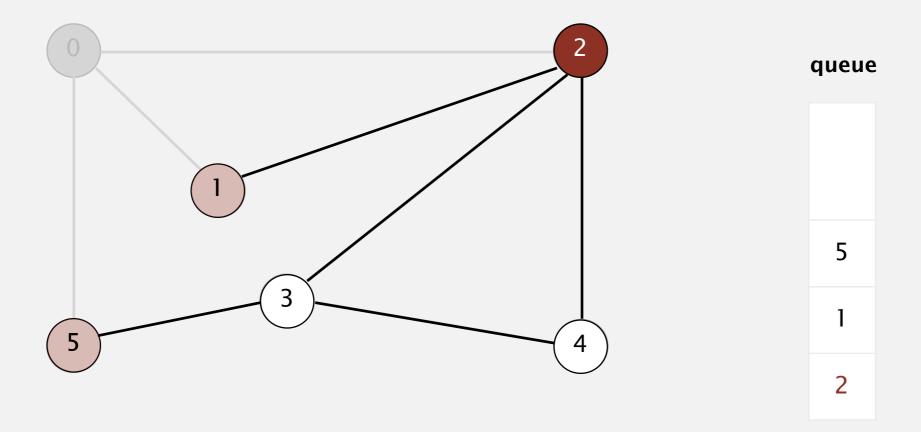
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



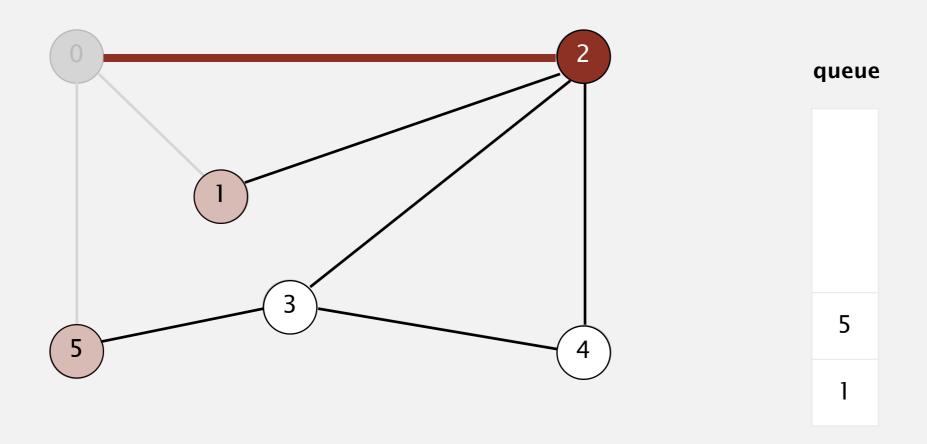
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



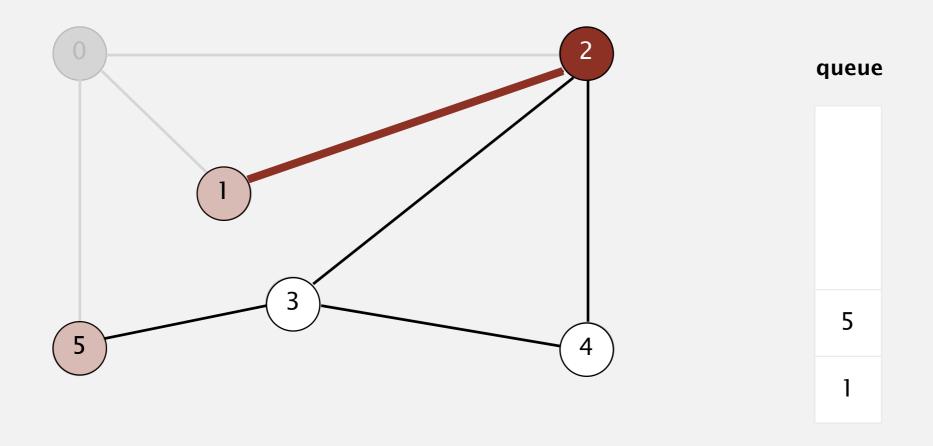
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



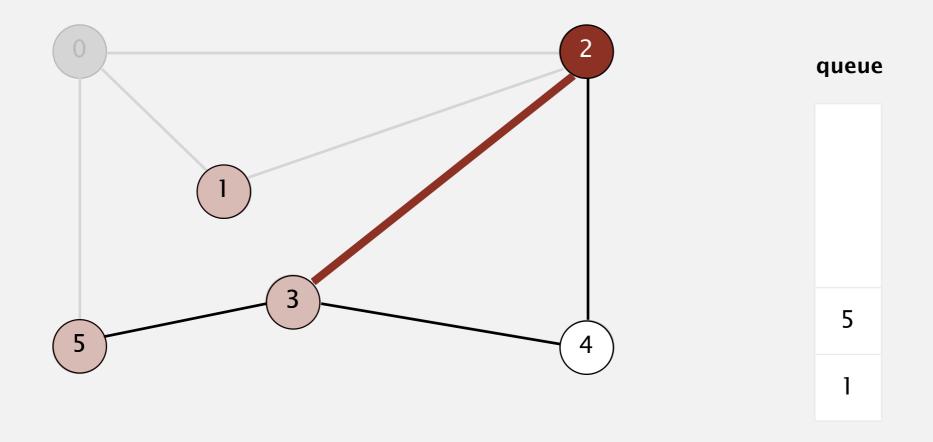
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



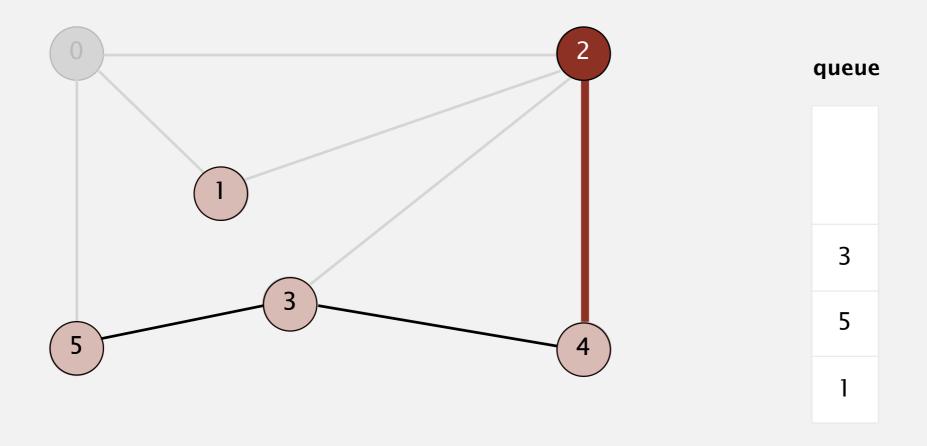
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



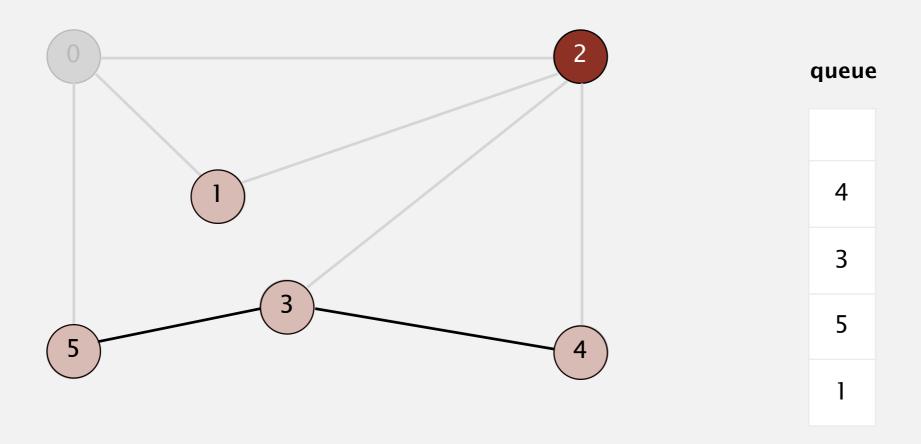
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



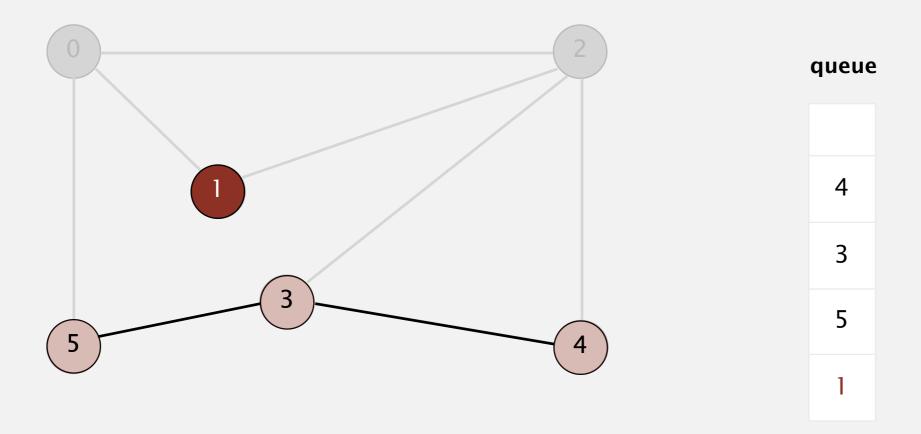
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



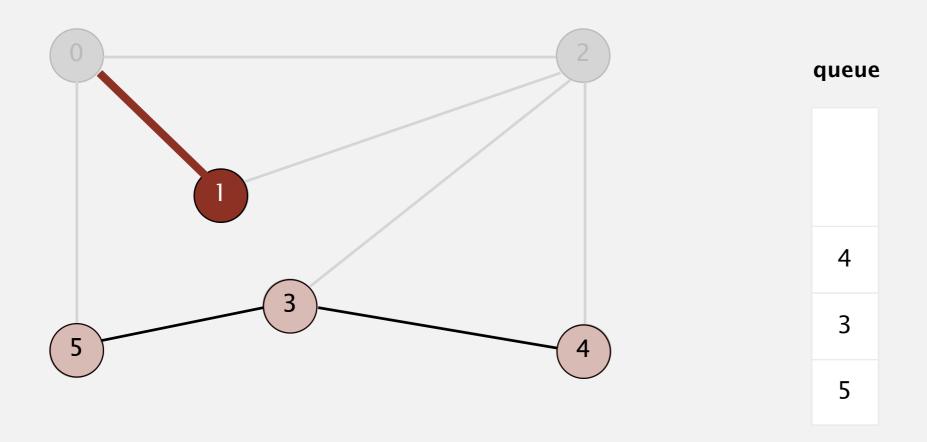
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



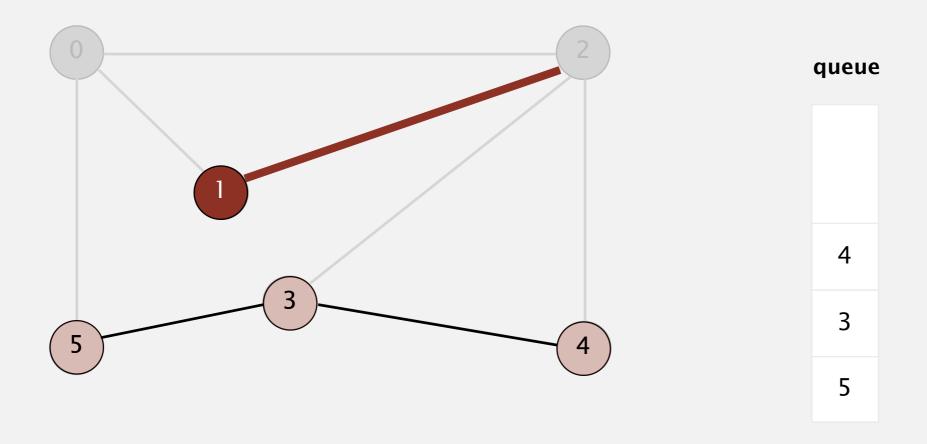
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



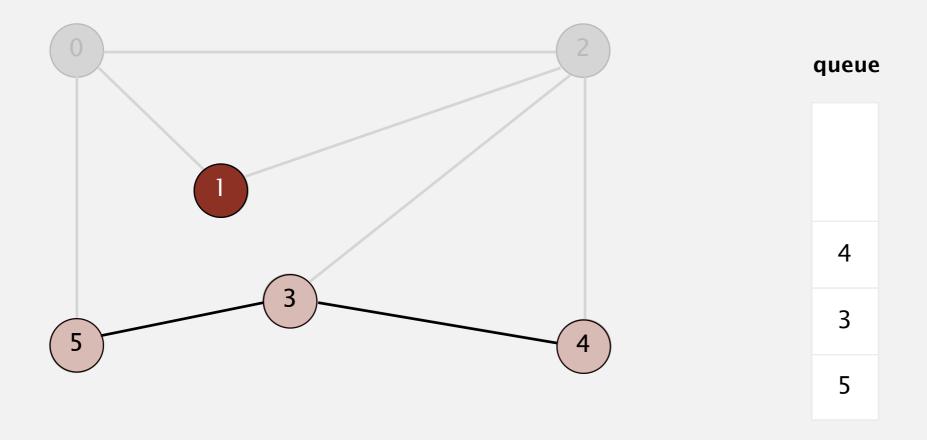
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



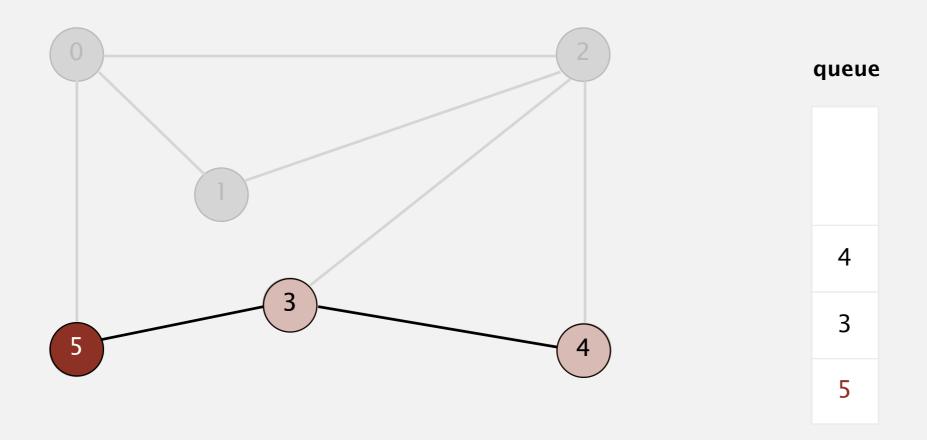
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



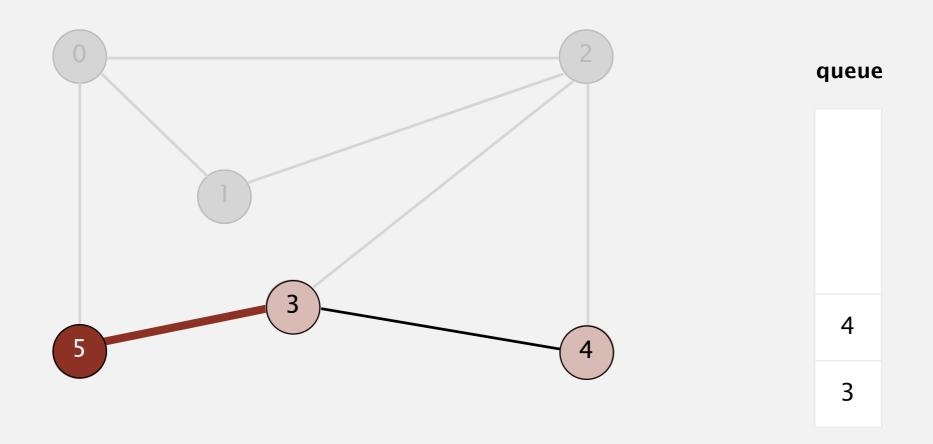
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



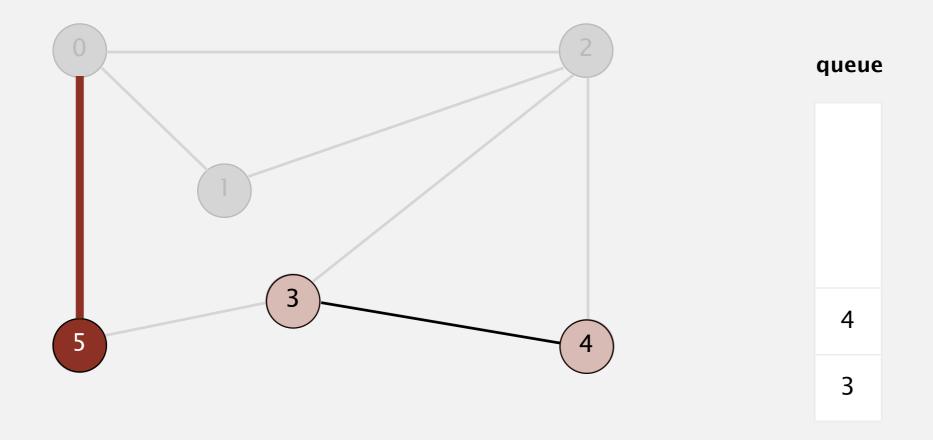
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



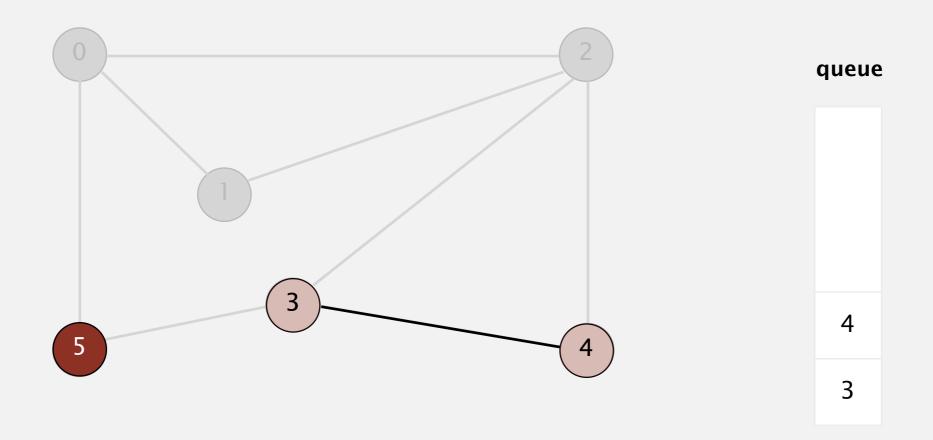
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



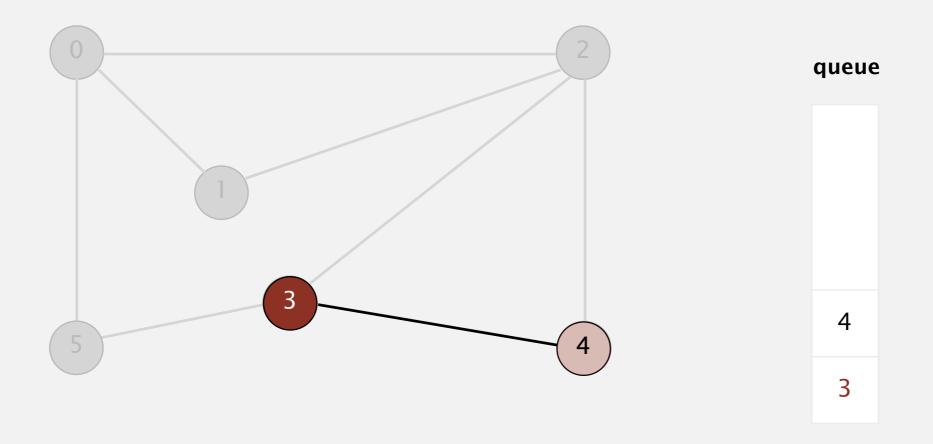
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



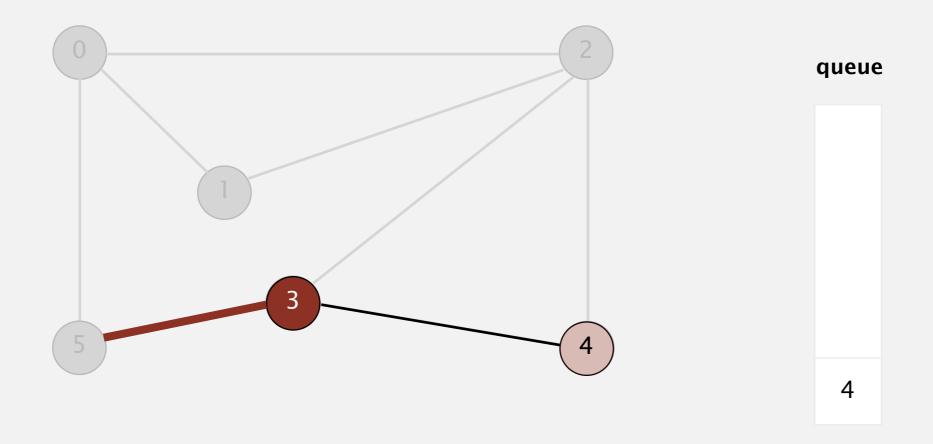
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



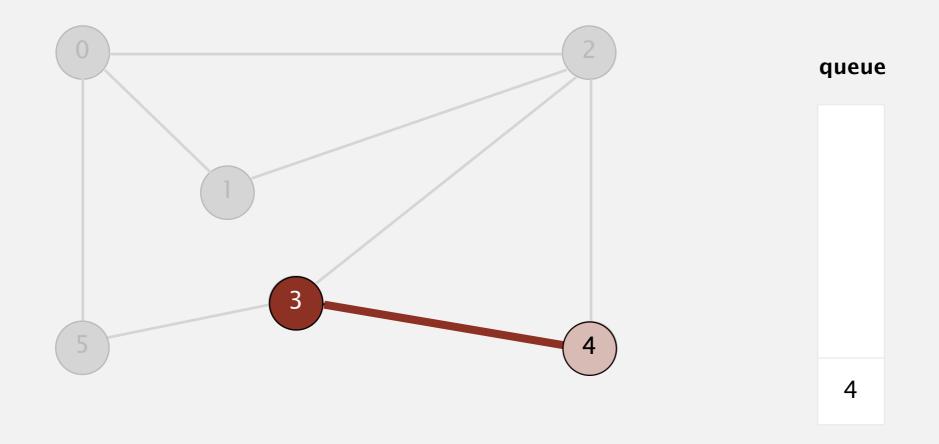
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



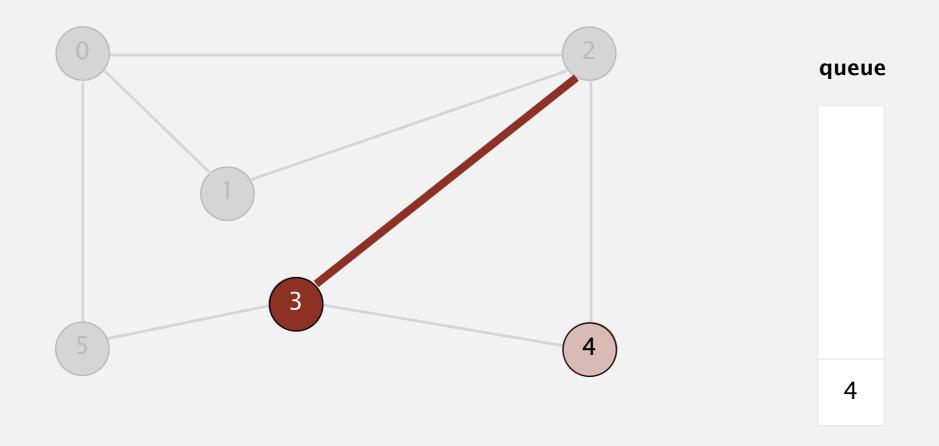
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



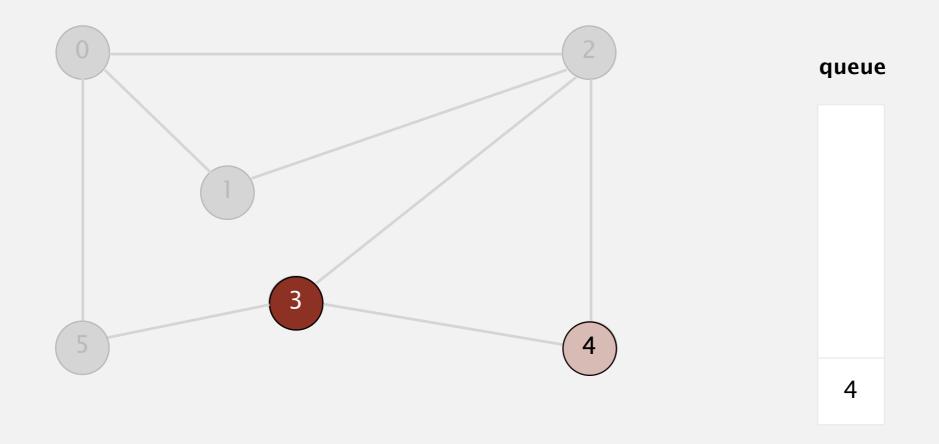
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



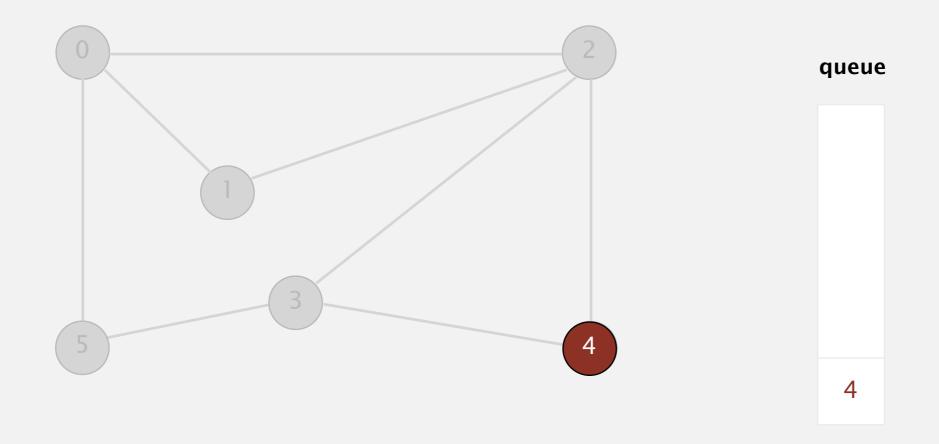
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



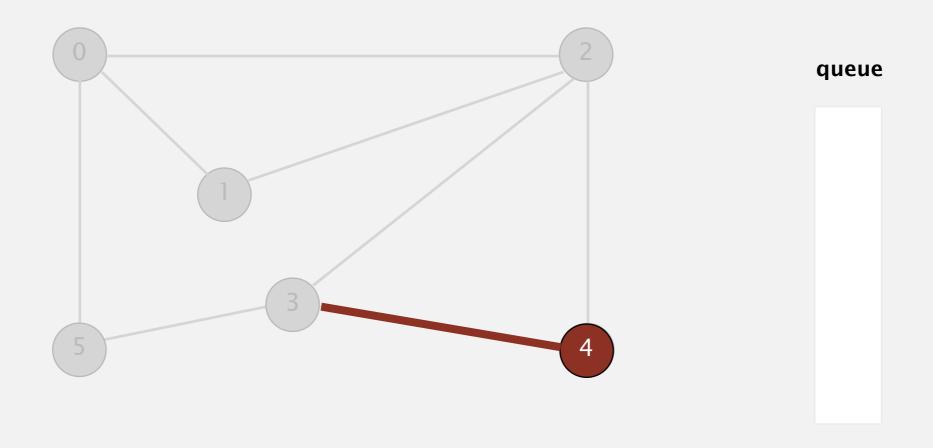
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



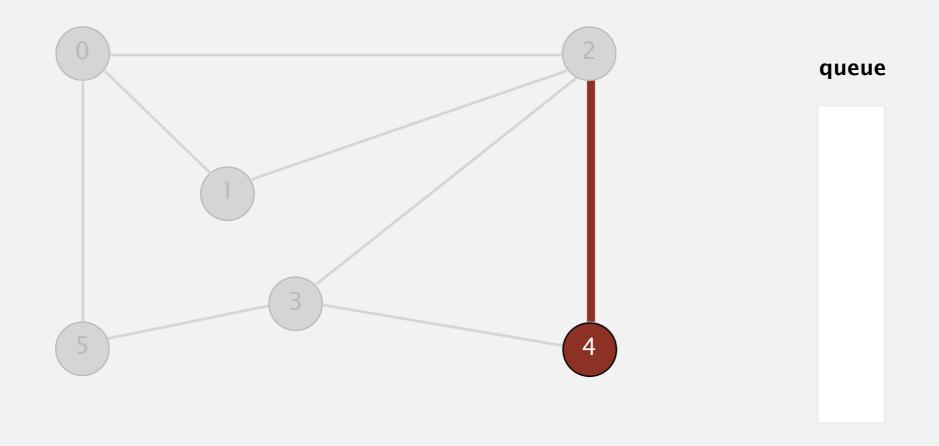
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



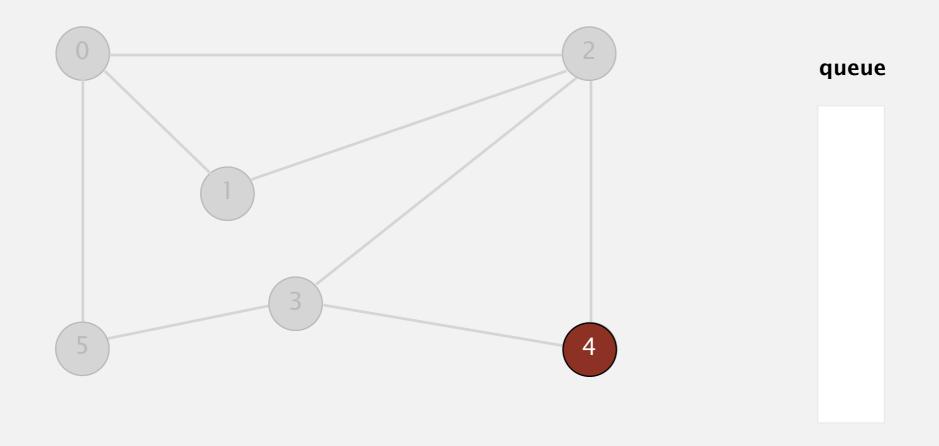
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



### Breadth-first search demo

Repeat until queue is empty:

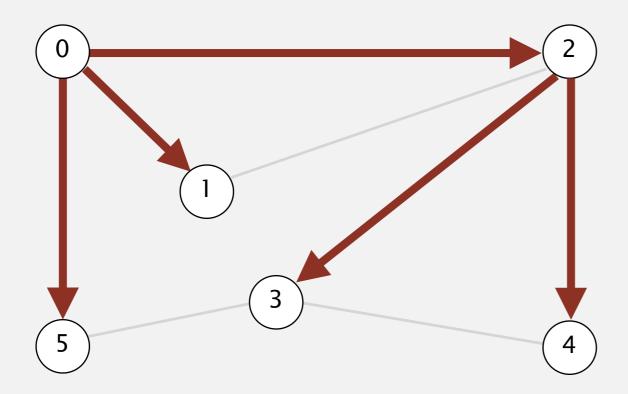
- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



### Breadth-first search demo

Repeat until queue is empty:

- Remove vertex *v* from queue.
- Add to queue all unmarked vertices adjacent to v and mark them.



### Breadth-first search: Java implementation

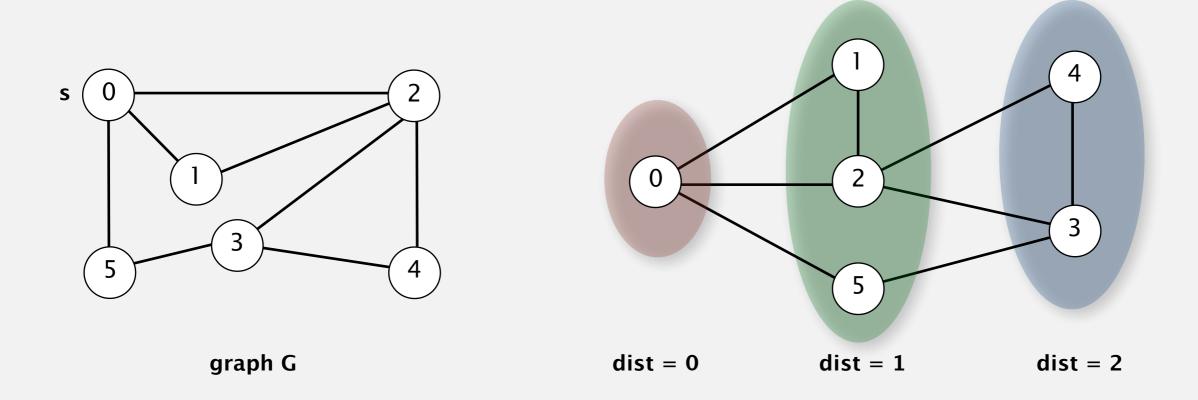
```
public class BreadthFirstPaths
   private boolean[] marked;
   private int[] edgeTo;
   private int[] distTo;
   private void bfs(Graph G, int s) {
      Queue<Integer> q = new Queue<Integer>();
                                                            initialize FIFO queue of
      q.enqueue(s);
                                                            vertices to explore
      marked[s] = true;
      distTo[s] = 0;
      while (!q.isEmpty()) {
         int v = q.dequeue();
         for (int w : G.adj(v)) {
            if (!marked[w]) {
                q.enqueue(w);
                                                            found new vertex w
                marked[w] = true;
                                                            via edge v-w
                edgeTo[w] = v;
                distTo[w] = distTo[v] + 1;
```

### Breadth-first search properties

- Q. In which order does BFS examine vertices?
- A. Increasing distance (number of edges) from s.

queue always consists of  $\geq 0$  vertices of distance k from s, followed by  $\geq 0$  vertices of distance k+1

Proposition. In any connected graph G, BFS computes shortest paths from s to all other vertices in time proportional to E + V.

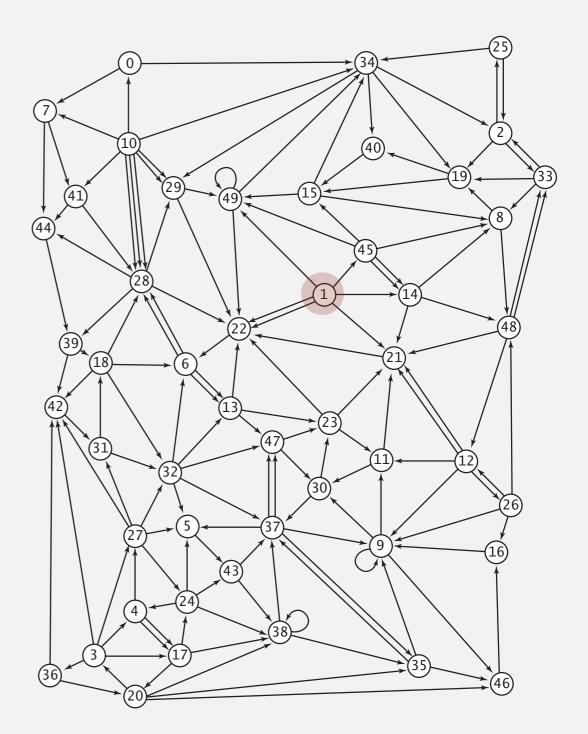


### Breadth-first search in digraphs application: web crawler

Goal. Crawl web, starting from some root web page, say www.viginia.edu.

### Solution. [BFS with implicit digraph]

- Choose root web page as source s.
- Maintain a Queue of websites to explore.
- Maintain a SET of discovered websites.
- Dequeue the next website and enqueue websites to which it links (provided you haven't done so before).



Q. Why not use DFS?

### Bare-bones web crawler: Java implementation

```
Queue<String> queue = new Queue<String>();
                                                              queue of websites to crawl
SET<String> marked = new SET<String>();
                                                              set of marked websites
String root = "http://www.virginia.edu";
queue.enqueue(root);
                                                              start crawling from root website
marked.add(root);
while (!queue.isEmpty())
   String v = queue.dequeue();
                                                               read in raw html from next
   StdOut.println(v);
                                                               website in queue
   In in = new In(v);
   String input = in.readAll();
   String regexp = \frac{http:}{(\w+\.)+(\w+)};
   Pattern pattern = Pattern.compile(regexp);
                                                              use regular expression to find all URLs
   Matcher matcher = pattern.matcher(input);
                                                              in website of form http://xxx.yyy.zzz
   while (matcher.find())
                                                              [crude pattern misses relative URLs]
      String w = matcher.group();
      if (!marked.contains(w))
          marked.add(w);
                                                              if unmarked, mark it and put
          queue.enqueue(w);
                                                              on the queue
   }
```

# TOPOLOGICAL SORT

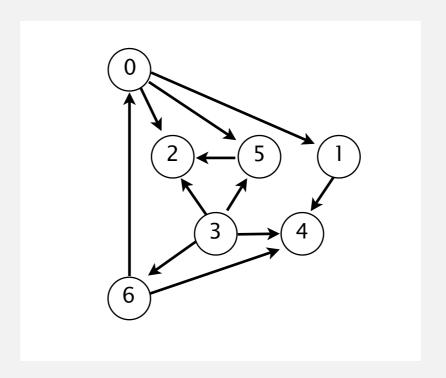
### Precedence scheduling

Goal. Given a set of tasks to be completed with precedence constraints, in which order should we schedule the tasks?

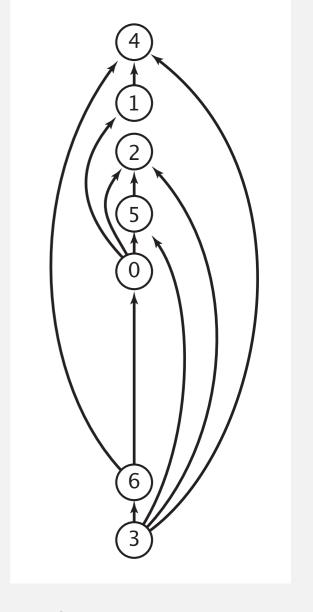
Digraph model. vertex = task; edge = precedence constraint.

- 0. Algorithms
- 1. Complexity Theory
- 2. Artificial Intelligence
- 3. Intro to CS
- 4. Cryptography
- 5. Scientific Computing
- 6. Advanced Programming

tasks



precedence constraint graph

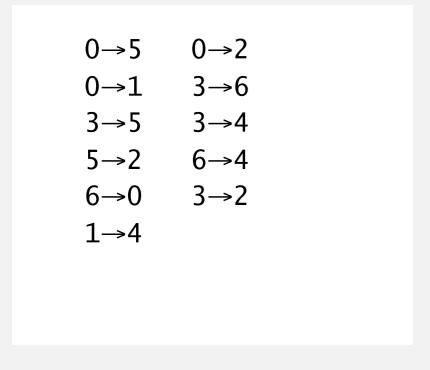


feasible schedule

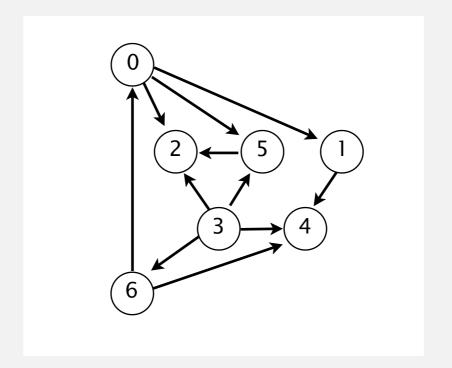
### Topological sort

DAG. Directed acyclic graph.

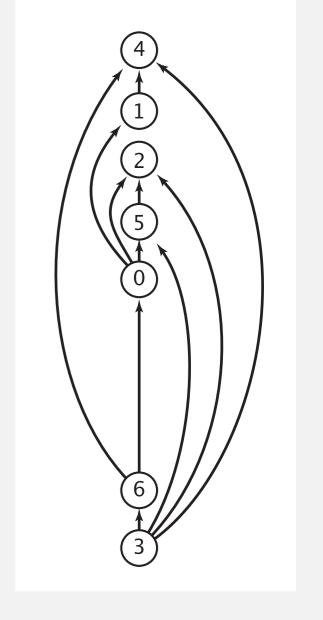
Topological sort. Redraw DAG so all edges point upwards.



directed edges

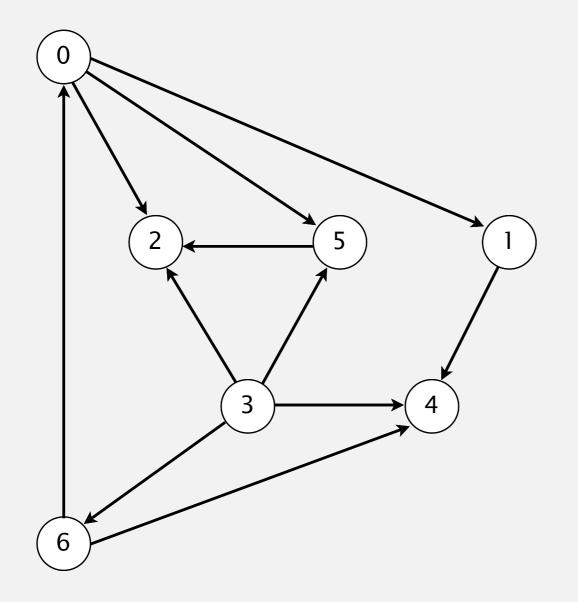


DAG



Solution. DFS. What else?

- Run depth-first search.
- Return vertices in reverse postorder.



#### tinyDAG7.txt

7	
11	
0	5
0	2
0	1
3	6
3	5
3	4
5	2
6	4
6	0
3	2

### Depth-first search orders

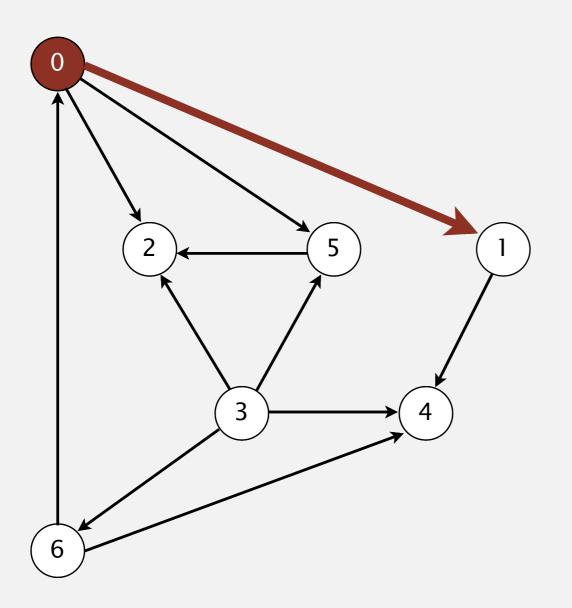
Observation. DFS visits each vertex exactly once. The order in which it does so can be important.

### Orderings.

- Preorder: order in which dfs() is called.
- Postorder: order in which dfs() returns.
- Reverse postorder: reverse order in which dfs() returns.

```
private void dfs(Graph G, int v)
{
    marked[v] = true;
    preorder.enqueue(v);
    for (int w : G.adj(v))
        if (!marked[w]) dfs(G, w);
    postorder.enqueue(v);
    reversePostorder.push(v);
}
```

- Run depth-first search.
- Return vertices in reverse postorder.

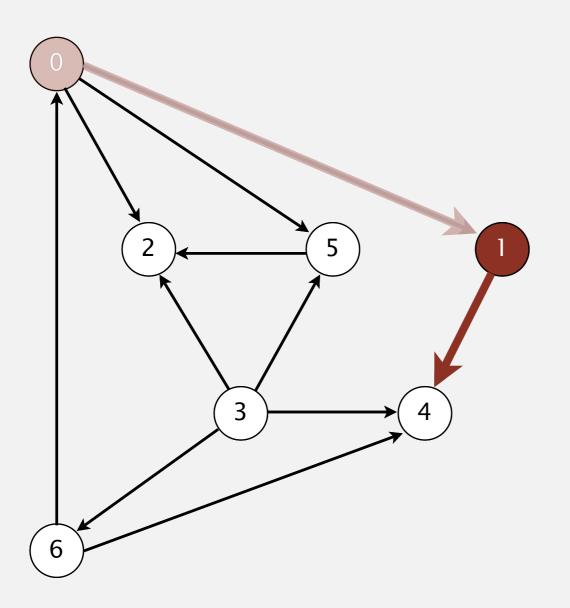


### postorder

V	marked[]
0	Т
1	F
2	F
3	F
4	F
5	F
6	F

visit 0: check 1, check 2, and check 5

- Run depth-first search.
- Return vertices in reverse postorder.

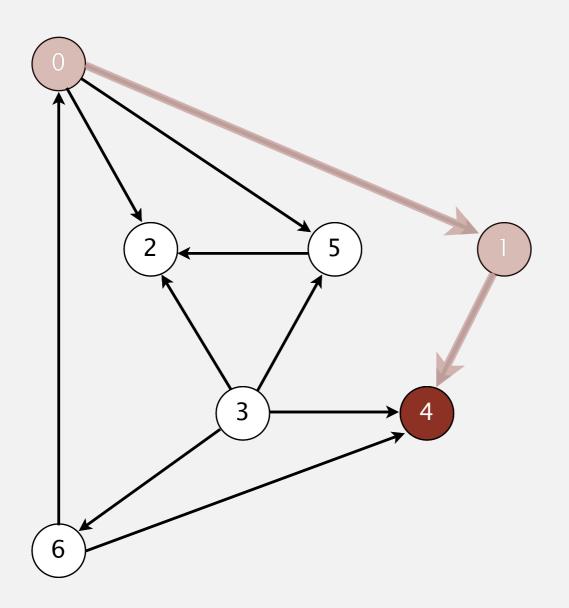


#### postorder

V	marked[]
0	Т
1	Т
2	F
3	F
4	F
5	F
6	F

visit 1: check 4

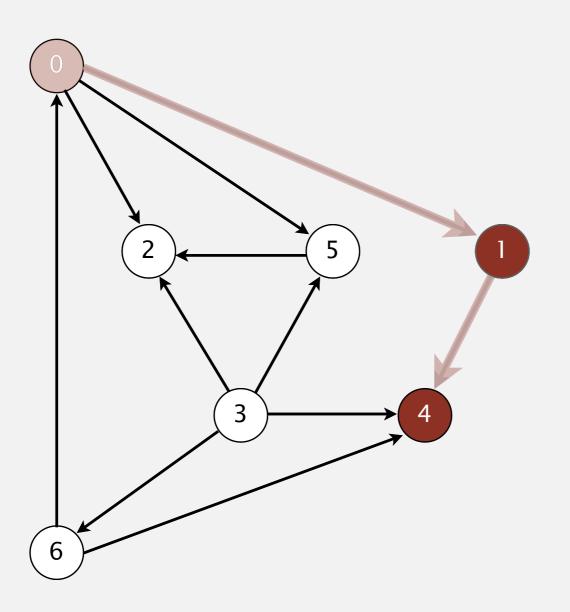
- Run depth-first search.
- Return vertices in reverse postorder.



#### postorder

V	marked[]
0	Т
1	Т
2	F
3	F
4	Т
5	F
6	F

- Run depth-first search.
- Return vertices in reverse postorder.

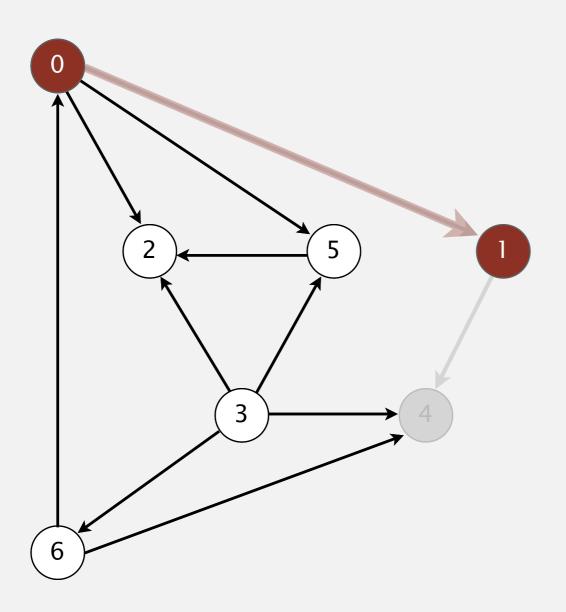


#### postorder

4

V	marked[]
0	Т
1	Т
2	F
3	F
4	Т
5	F
6	F

- Run depth-first search.
- Return vertices in reverse postorder.



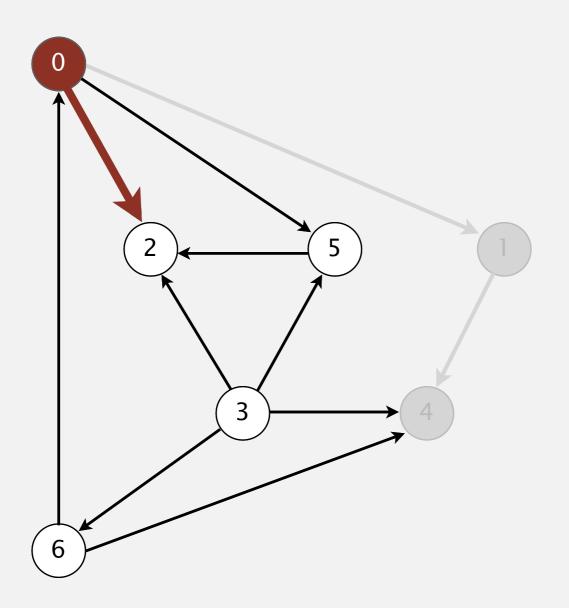
#### postorder

4 1

V	marked[]
0	Т
1	T
2	F
3	F
4	Т
5	F
6	F

#### 1 done

- Run depth-first search.
- Return vertices in reverse postorder.



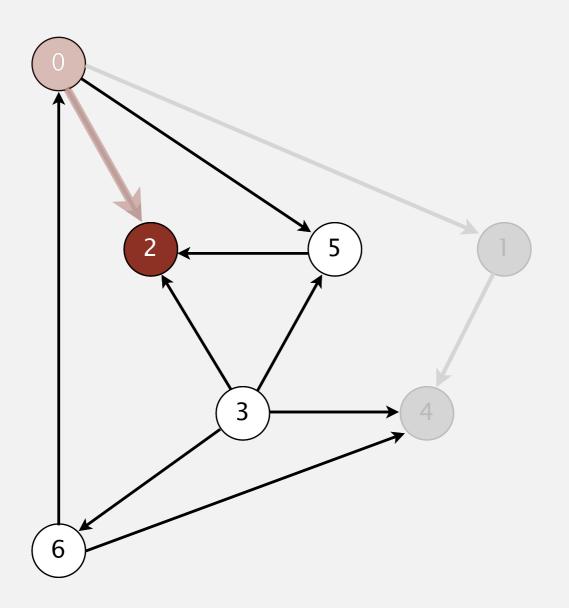
#### postorder

4 1

V	marked[]
0	Т
1	Т
2	F
3	F
4	Т
5	F
6	F

visit 0: check 1, check 2, and check 5

- Run depth-first search.
- Return vertices in reverse postorder.

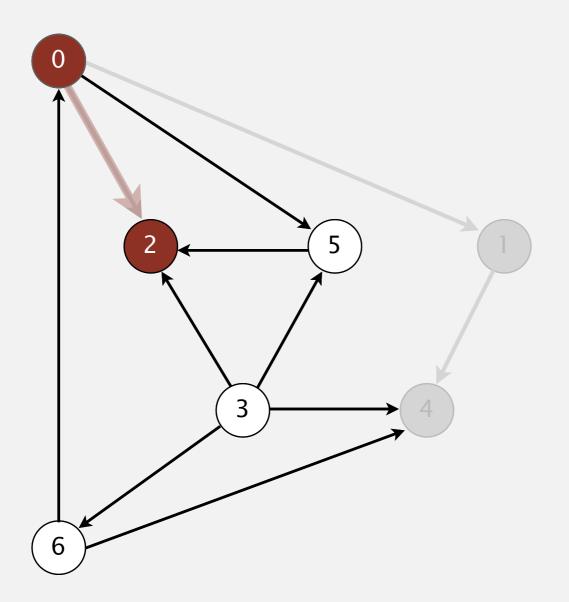


#### postorder

4 1

V	marked[]
0	Т
1	Т
2	Т
3	F
4	Т
5	F
6	F

- Run depth-first search.
- Return vertices in reverse postorder.

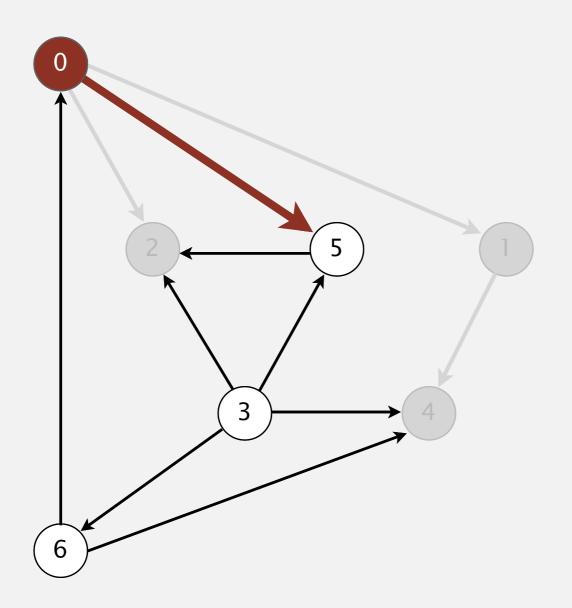


#### postorder

412

V	marked[]
0	Т
1	Т
2	Т
3	F
4	Т
5	F
6	F

- Run depth-first search.
- Return vertices in reverse postorder.



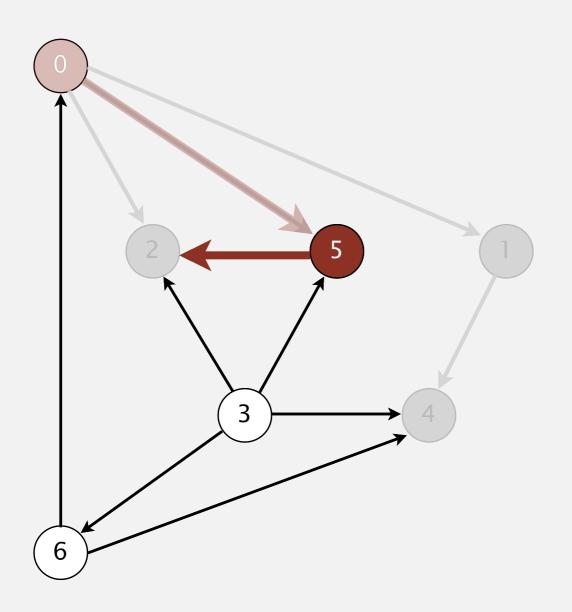
#### postorder

4 1 2

V	marked[]
0	Т
1	Т
2	T
3	F
4	T
5	F
6	F

visit 0: check 1, check 2, and check 5

- Run depth-first search.
- Return vertices in reverse postorder.



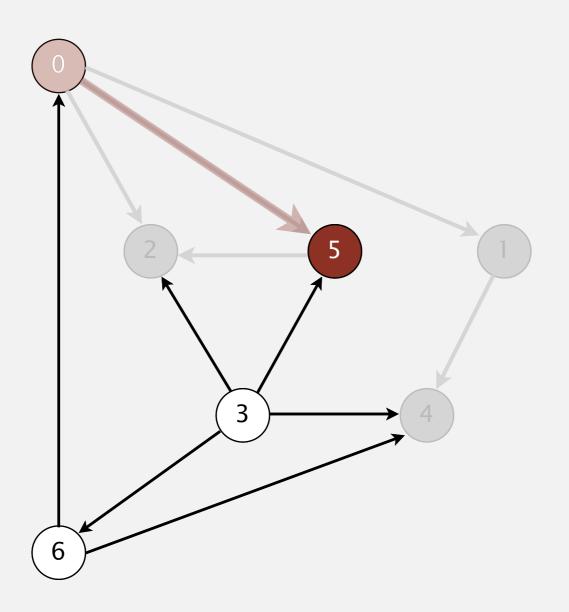
#### postorder

4 1 2

V	marked[]
0	Т
1	Т
2	T
3	F
4	Т
5	Т
6	F

visit 5: check 2

- Run depth-first search.
- Return vertices in reverse postorder.

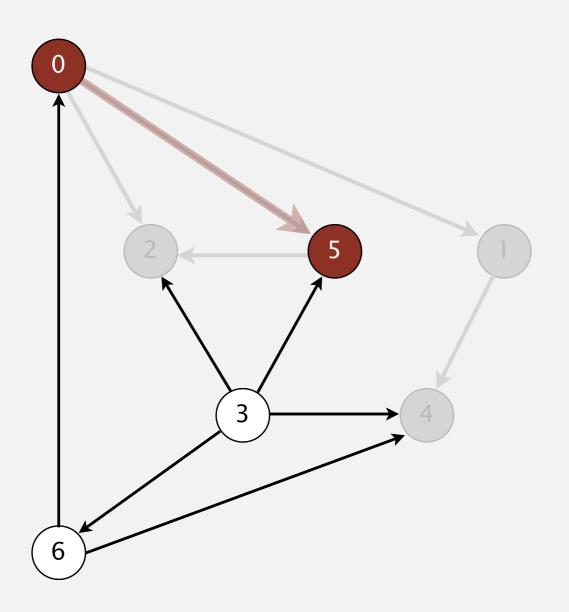


#### postorder

4 1 2

V	marked[]
0	Т
1	Т
2	T
3	F
4	Т
5	Т
6	F

- Run depth-first search.
- Return vertices in reverse postorder.

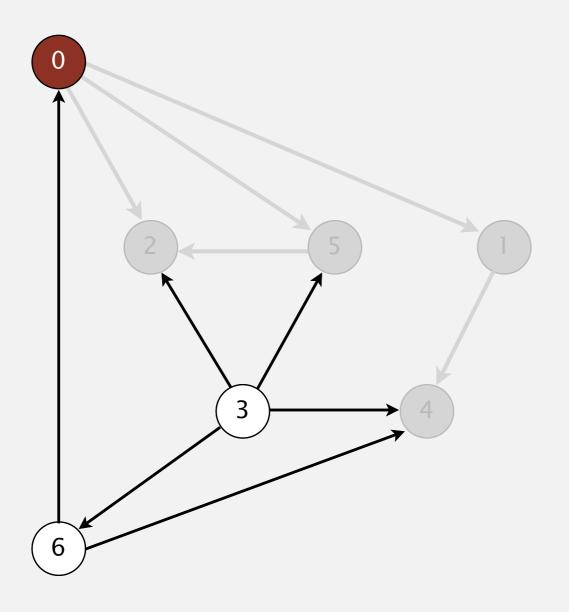


#### postorder

4 1 2 5

V	marked[]
0	Т
1	Т
2	Т
3	F
4	Т
5	Т
6	F

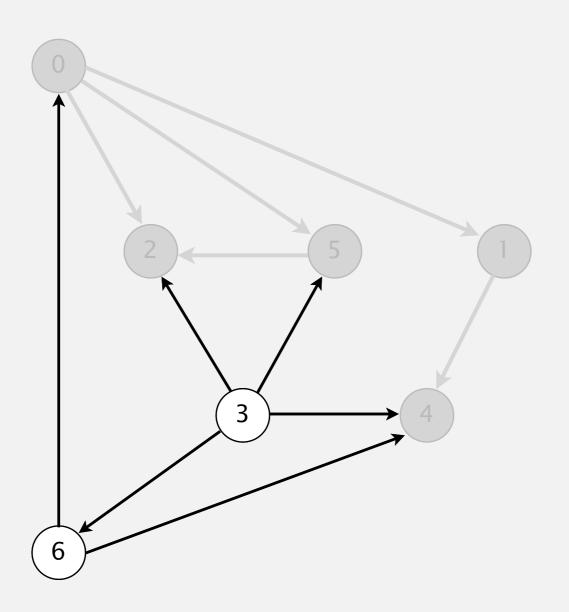
- Run depth-first search.
- Return vertices in reverse postorder.



#### postorder

V	marked[]
0	Т
1	Т
2	Т
3	F
4	Т
5	Т
6	F

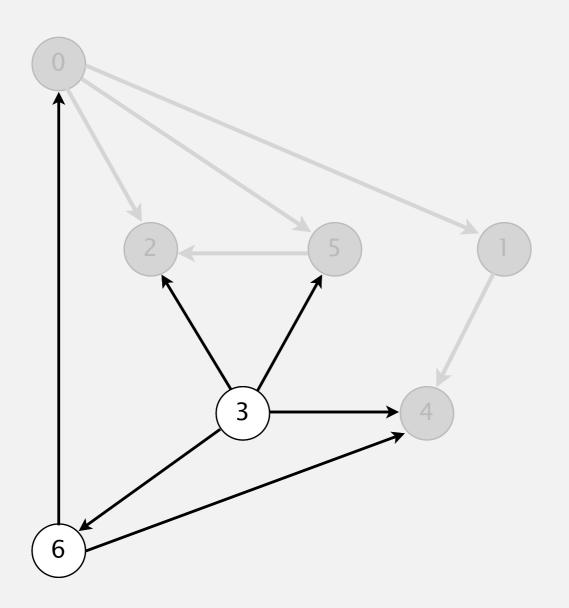
- Run depth-first search.
- Return vertices in reverse postorder.



#### postorder

V	marked[]
0	Т
1	Т
2	Т
3	F
4	Т
5	Т
6	F

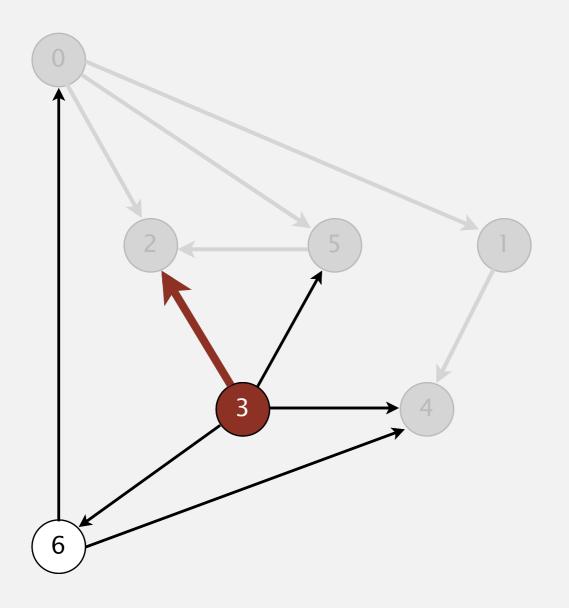
- Run depth-first search.
- Return vertices in reverse postorder.



#### postorder

V	marked[]
0	Т
1	Т
2	Т
3	F
4	Т
5	Т
6	F

- Run depth-first search.
- Return vertices in reverse postorder.

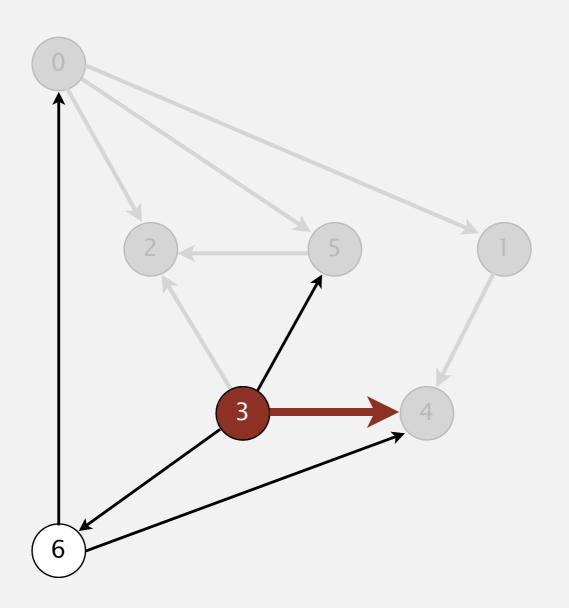


#### postorder

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	F

visit 3: check 2, check 4, check 5, and check 6

- Run depth-first search.
- Return vertices in reverse postorder.

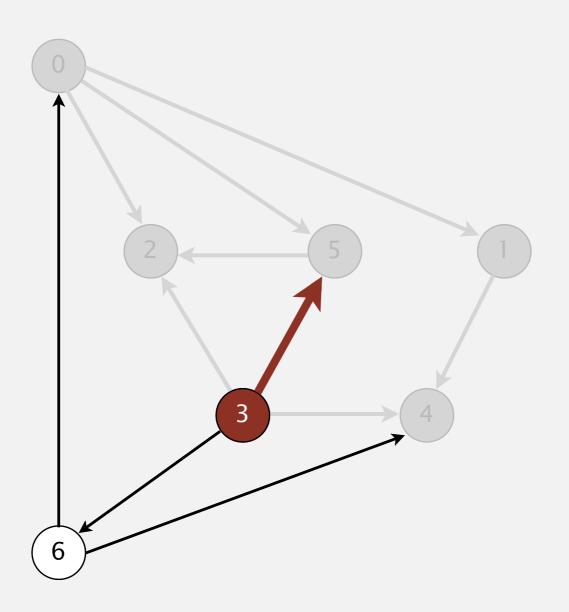


#### postorder

V	marked[]
0	T
1	Т
2	Т
3	Т
4	Т
5	Т
6	F

visit 3: check 2, check 4, check 5, and check 6

- Run depth-first search.
- Return vertices in reverse postorder.

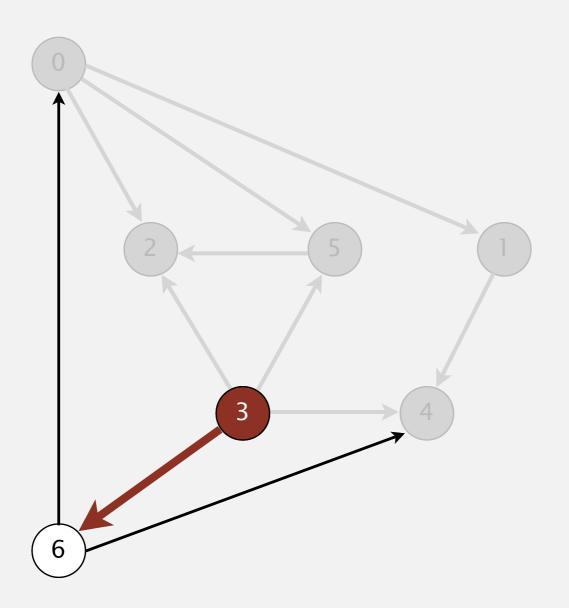


#### postorder

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	F

visit 3: check 2, check 4, check 5, and check 6

- Run depth-first search.
- Return vertices in reverse postorder.

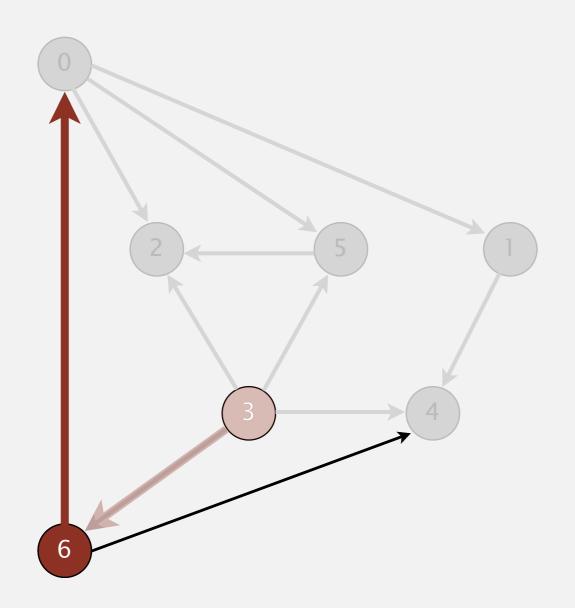


#### postorder

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	F

visit 3: check 2, check 4, check 5, and check 6

- Run depth-first search.
- Return vertices in reverse postorder.

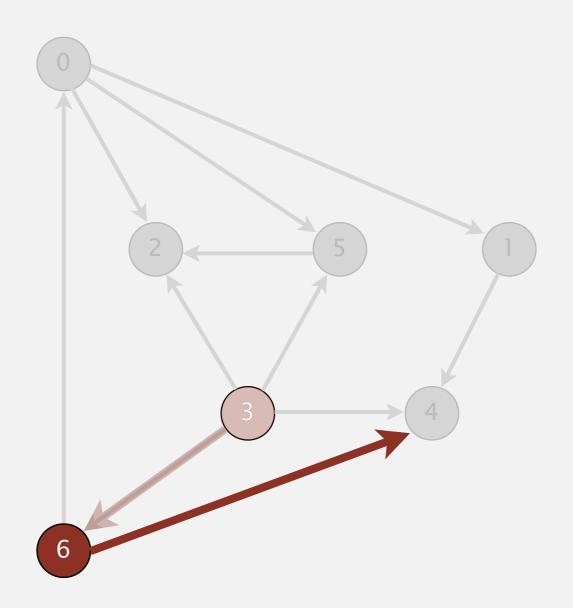


#### postorder

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	Т

visit 6: check 0 and check 4

- Run depth-first search.
- Return vertices in reverse postorder.

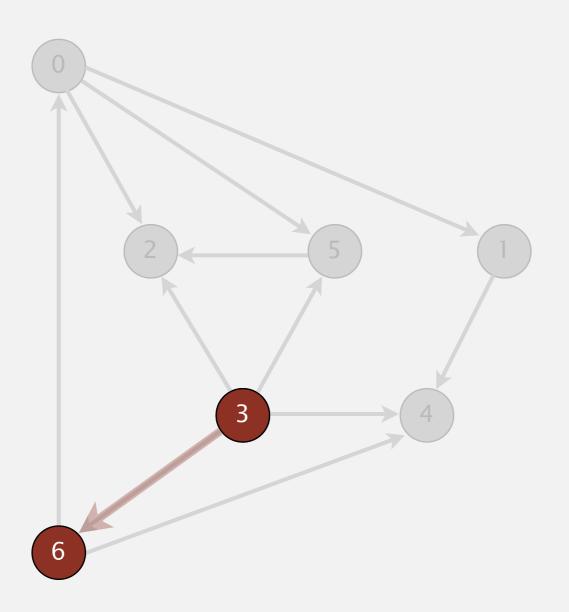


#### postorder

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	Т

visit 6: check 0 and check 4

- Run depth-first search.
- Return vertices in reverse postorder.

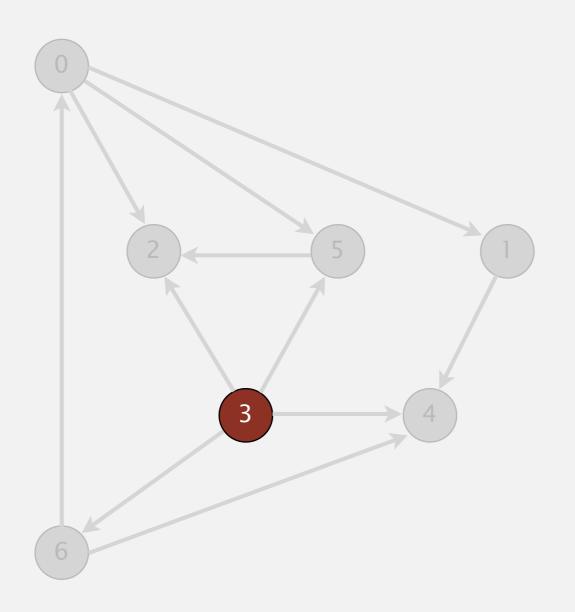


#### postorder

4 1 2 5 0 6

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	Т

- Run depth-first search.
- Return vertices in reverse postorder.

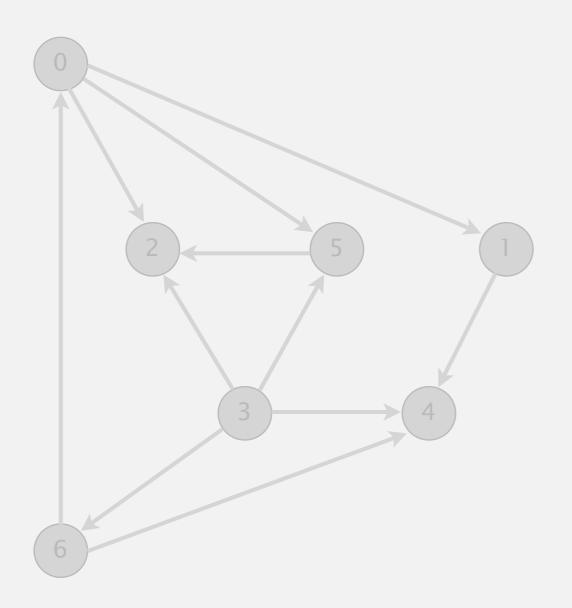


#### postorder

4 1 2 5 0 6 3

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	Т

- Run depth-first search.
- Return vertices in reverse postorder.

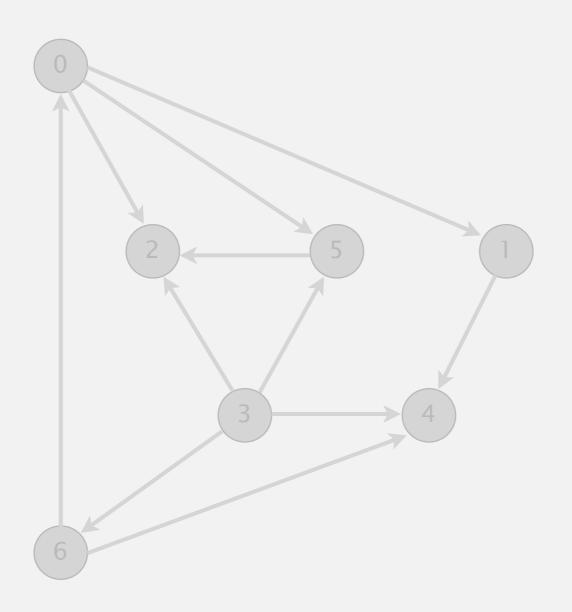


#### postorder

4 1 2 5 0 6 3

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	Т

- Run depth-first search.
- Return vertices in reverse postorder.



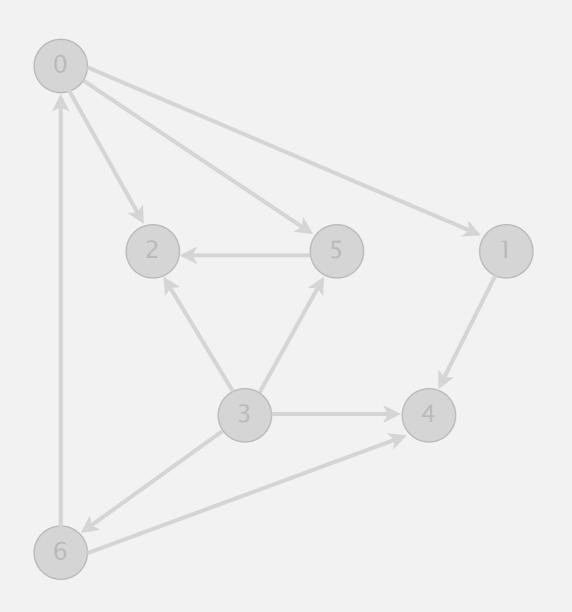
#### postorder

4 1 2 5 0 6 3

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	T

## Topological sort demo

- Run depth-first search.
- Return vertices in reverse postorder.



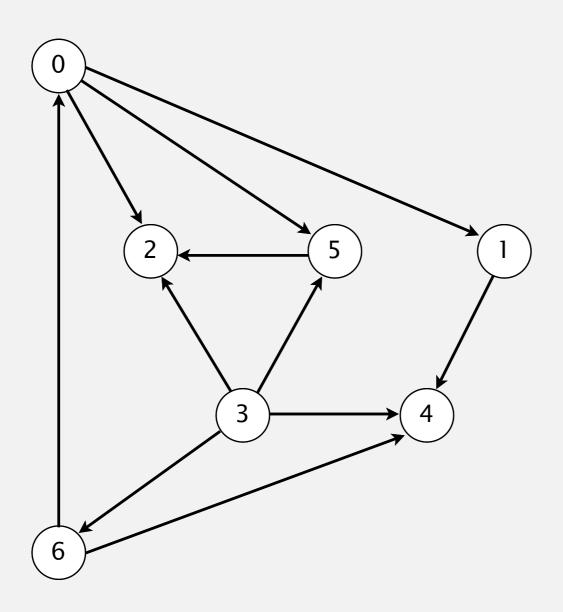
#### postorder

4 1 2 5 0 6 3

V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	Т

#### Topological sort demo

- Run depth-first search.
- Return vertices in reverse postorder.



#### postorder

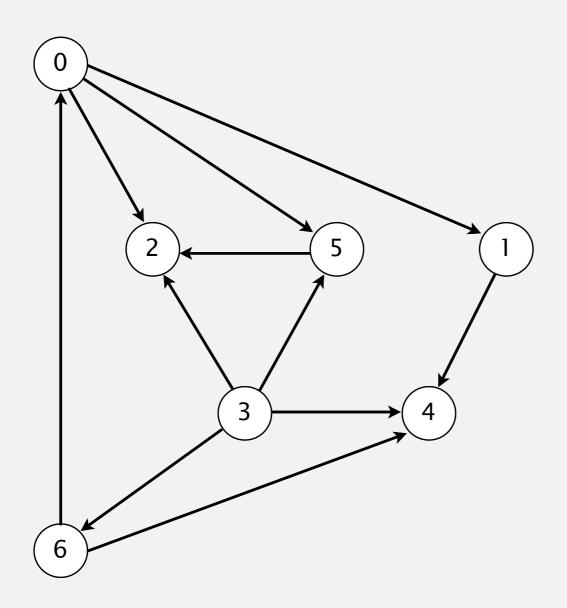
4 1 2 5 0 6 3

#### topological order

3 6 0 5 2 1 4

#### Topological sort demo

- Run depth-first search.
- Return vertices in reverse postorder.



#### postorder

4 1 2 5 0 6 3

#### topological order

3 6 0 5 2 1 4

#### Depth-first search order

```
public class DepthFirstOrder
   private boolean[] marked;
   private Stack<Integer> reversePostorder;
   public DepthFirstOrder(Digraph G)
      reversePostorder = new Stack<Integer>();
      marked = new boolean[G.V()];
      for (int v = 0; v < G.V(); v++)
         if (!marked[v]) dfs(G, v);
   private void dfs(Digraph G, int v)
      marked[v] = true;
      for (int w : G.adj(v))
        if (!marked[w]) dfs(G, w);
      reversePostorder.push(v);
   public Iterable<Integer> reversePostorder() 
   { return reversePostorder; }
```

returns all vertices in "reverse DFS postorder"

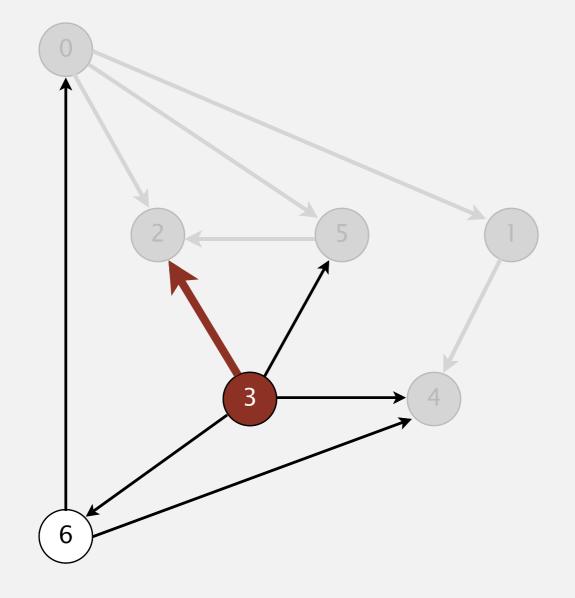
#### Topological sort in a DAG: correctness proof

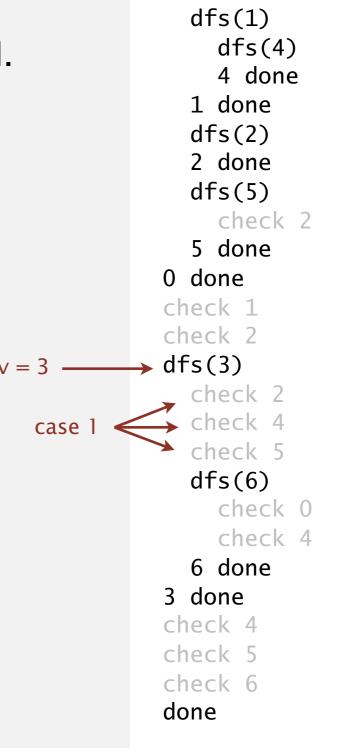
Proposition. Reverse DFS postorder of a DAG is a topological order.

Pf. Consider any edge  $v \rightarrow w$ . When dfs(v) is called:

Need to show the W gets returned before  $\boldsymbol{\nu}$ 

• Case 1: dfs(w) has already been called and returned. Thus, w was done before v.





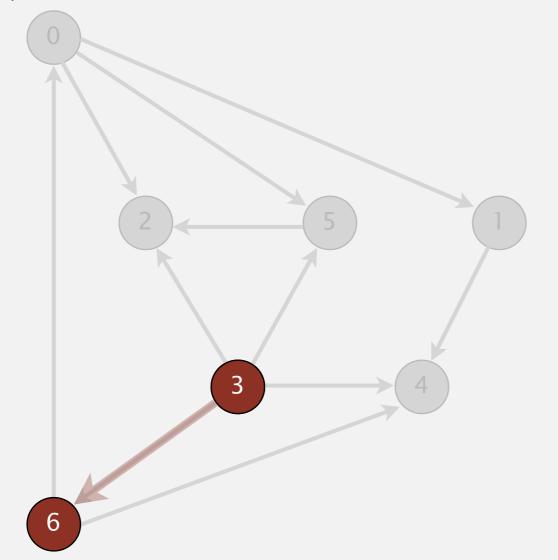
dfs(0)

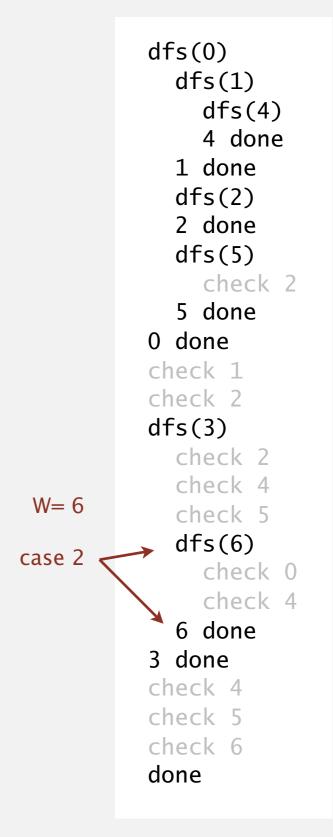
#### Topological sort in a DAG: correctness proof

Proposition. Reverse DFS postorder of a DAG is a topological order.

Pf. Consider any edge  $v \rightarrow w$ . When dfs(v) is called:

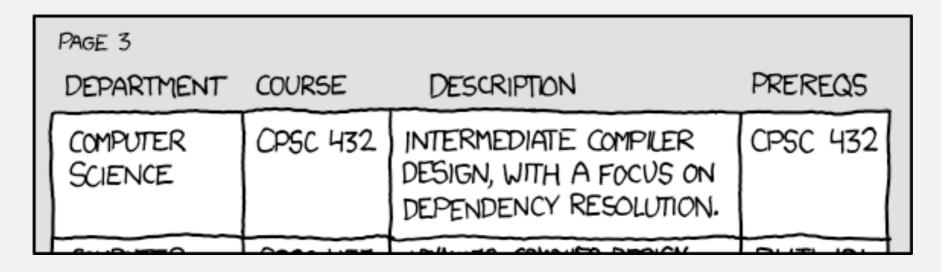
Case 2: dfs(w) has not yet been called.
 dfs(w) will get called directly or indirectly
 by dfs(v) and will finish before dfs(v).
 Thus, w will be done before v.





#### Directed cycle detection application: precedence scheduling

Scheduling. Given a set of tasks to be completed with precedence constraints, in what order should we schedule the tasks?



http://xkcd.com/754

Remark. A directed cycle implies scheduling problem is infeasible.

# STRONGLY CONNECTED COMPONENTS

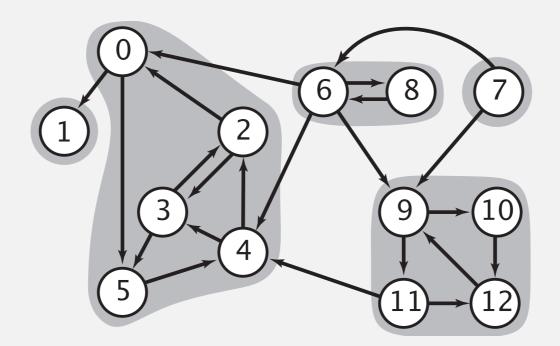
#### Strongly-connected components

Def. Vertices v and w are strongly connected if there is both a directed path from v to w and a directed path from w to v.

Key property. Strong connectivity is an equivalence relation:

- v is strongly connected to v.
- If v is strongly connected to w, then w is strongly connected to v.
- If *v* is strongly connected to *w* and *w* to *x*, then *v* is strongly connected to *x*.

Def. A strong component is a maximal subset of strongly-connected vertices.

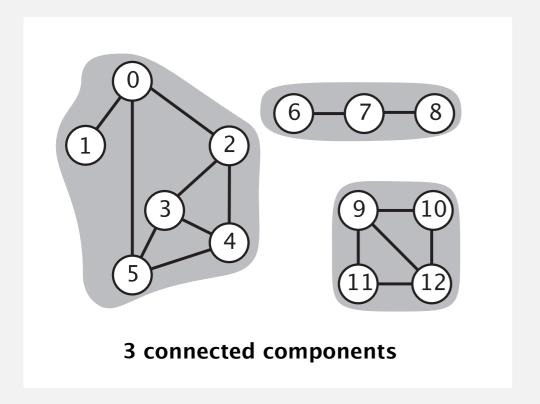


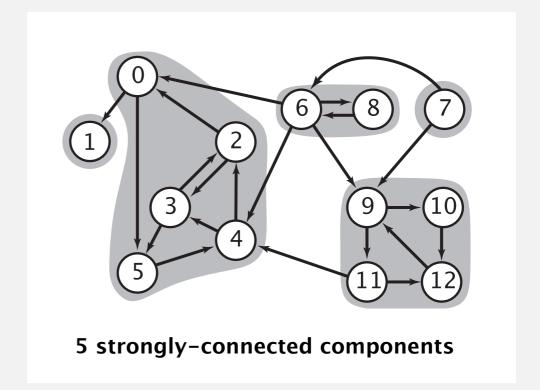
5 strongly-connected components

#### Connected components vs. strongly-connected components

v and w are connected if there is a path between v and w

v and w are strongly connected if there is both a directed path from v to w and a directed path from w to v





connected component id (easy to compute with DFS)

id[] 
$$\frac{0}{0}$$
  $\frac{1}{0}$   $\frac{2}{0}$   $\frac{3}{0}$   $\frac{4}{0}$   $\frac{5}{0}$   $\frac{6}{0}$   $\frac{7}{0}$   $\frac{8}{0}$   $\frac{9}{10}$   $\frac{11}{12}$   $\frac{12}{2}$ 

public boolean connected(int v, int w)
{ return id[v] == id[w]; }

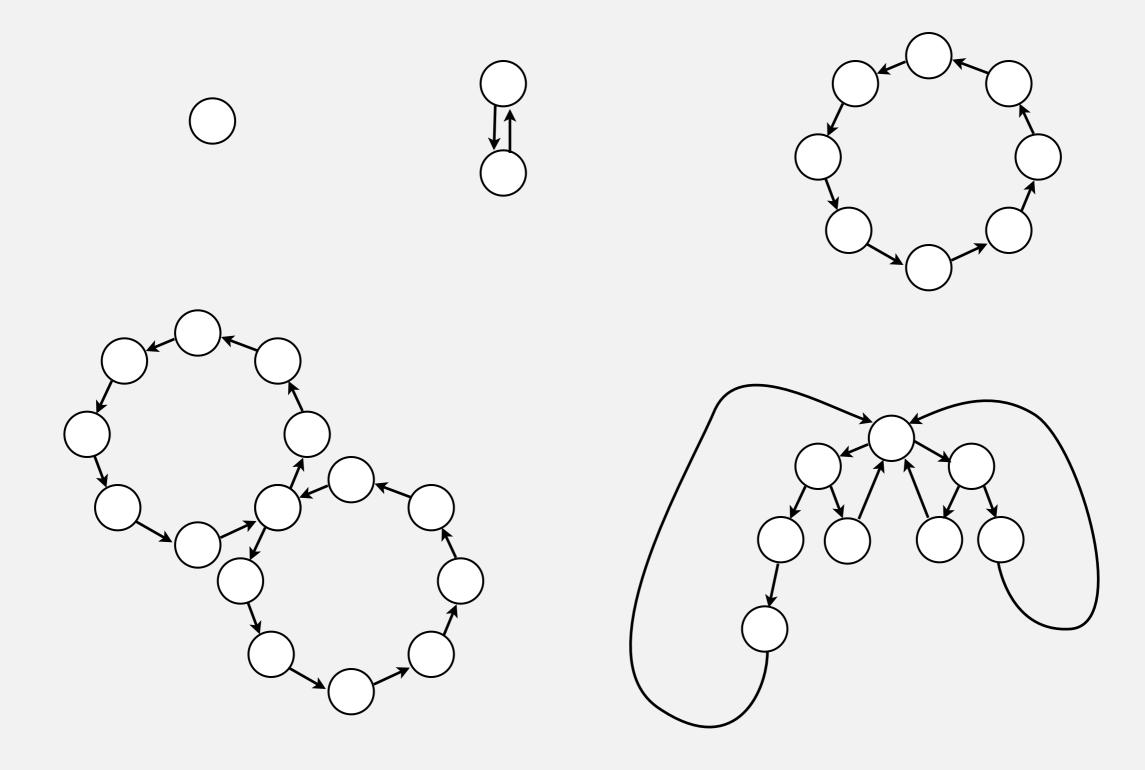
constant-time client connectivity query

strongly-connected component id (how to compute?)

```
public boolean stronglyConnected(int v, int w)
{ return id[v] == id[w]; }
```

constant-time client strong-connectivity query

# Examples of strongly-connected digraphs



#### Strong components algorithms: brief history

#### 1972: linear-time DFS algorithm (Tarjan).

- Classic algorithm.
- Demonstrated broad applicability and importance of DFS.

#### 1980s: easy two-pass linear-time algorithm (Kosaraju-Sharir).

- Forgot notes for lecture; developed algorithm in order to teach it!
- Later found in Russian scientific literature (1972).

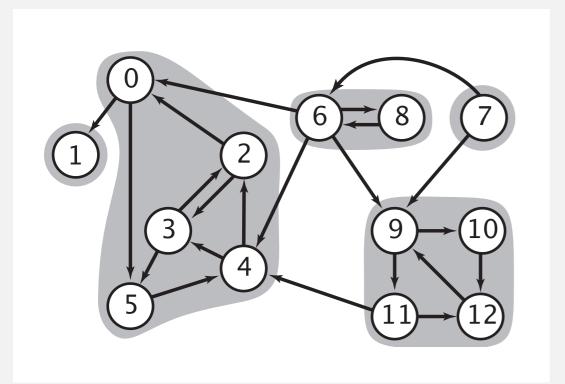
#### Kosaraju-Sharir algorithm: intuition

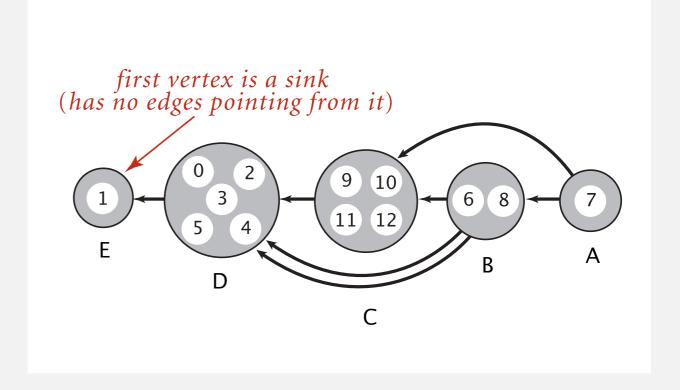
Reverse graph. Strong components in G are same as in  $G^R$ .

Kernel DAG. Contract each strong component into a single vertex.

#### Idea.

- Compute topological order (reverse postorder) in kernel DAG.
- Run DFS, considering vertices in reverse topological order.
- All Vertex that we in the DFS will be in same strong component

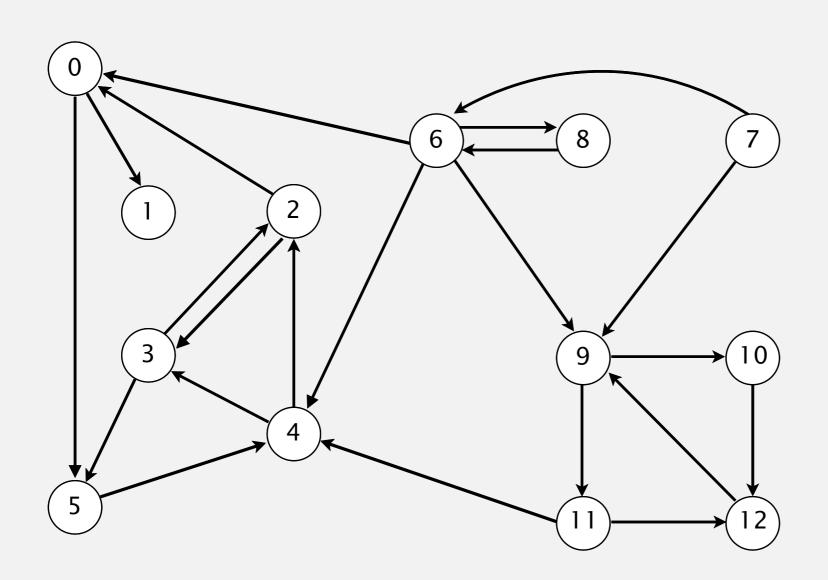




digraph G and its strong components

Phase 1. Compute reverse postorder in  $G^R$ .

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

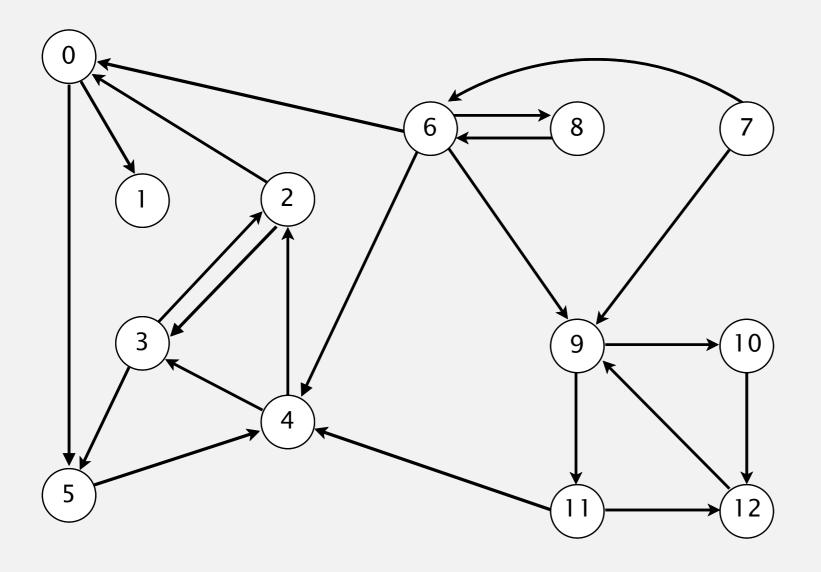


2→3
3→2
6→0
0→1
2→0
11→12
12→9
9→10
9→11
7→9
10→12
11→4
4→3
3→5
6→8
8→6
5→4
0→5
6→4
6→9
7→6

4→2

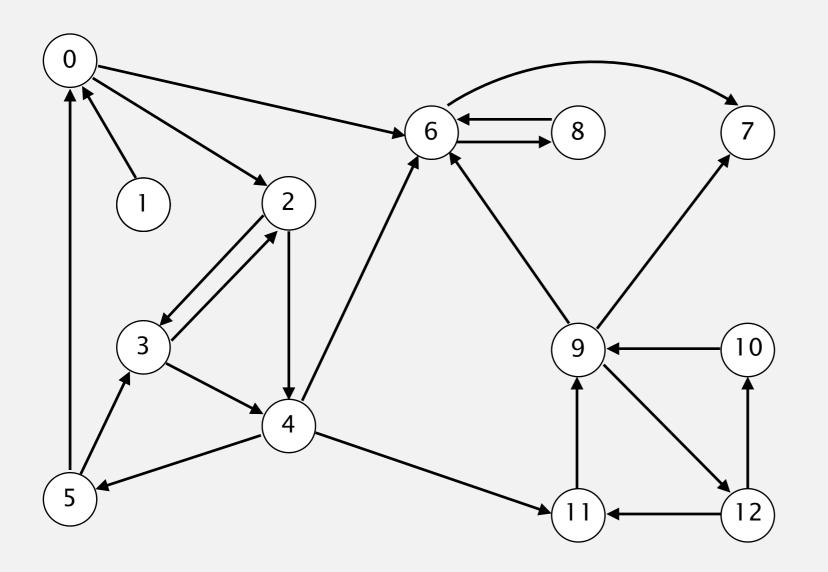
# DFS IN THE REVERSE GRAPH

Phase 1. Compute reverse postorder in  $G^R$ .



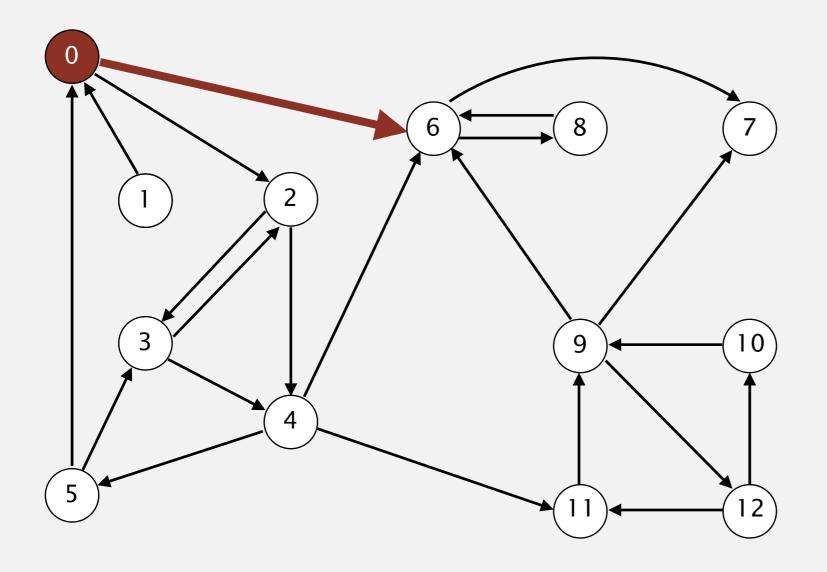
digraph G

Phase 1. Compute reverse postorder in  $G^R$ .



V	marked[]
0	-
1	_
2	_
3	_
4	_
5	_
6	_
7	_
8	_
9	_
10	_
11	_
12	_

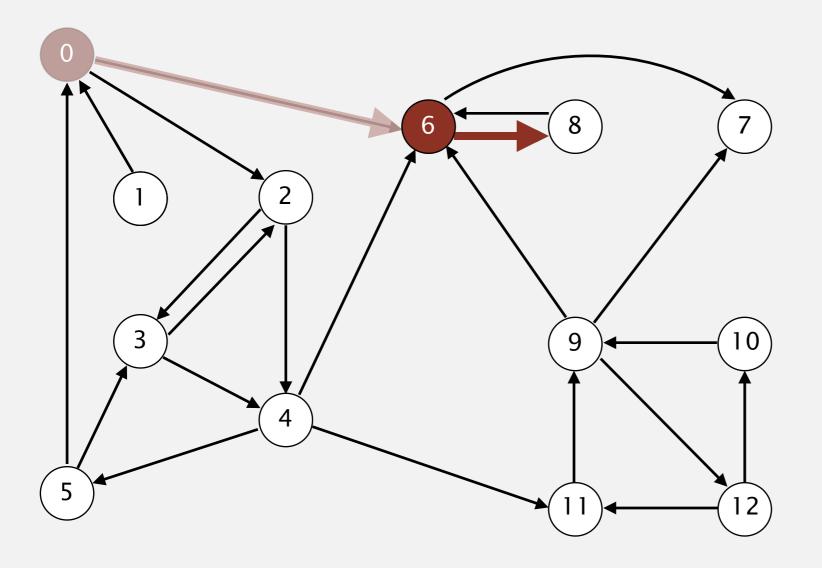
Phase 1. Compute reverse postorder in  $G^R$ .



V	marked[]
0	Т
1	F
2	F
3	F
4	F
5	F
6	F
7	F
8	F
9	F
10	F
11	F
12	F

visit 0: check 6 and check 2

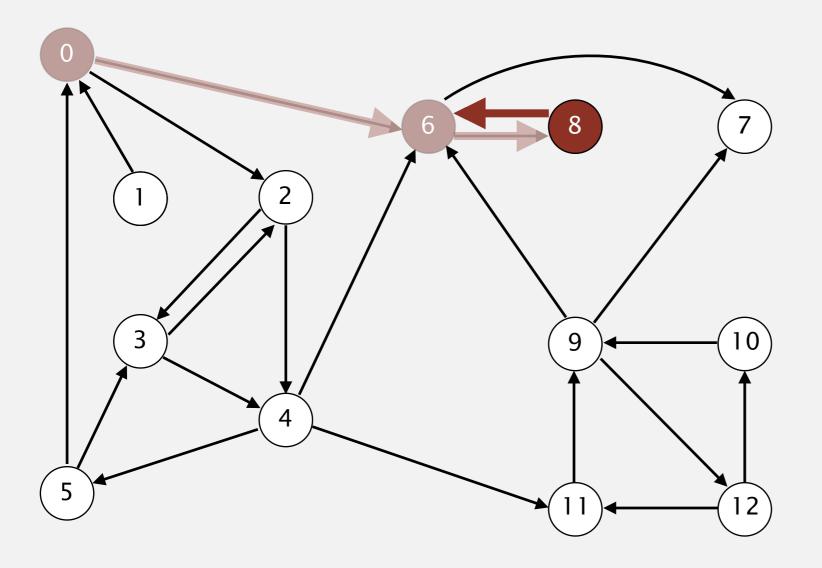
Phase 1. Compute reverse postorder in  $G^R$ .



V	marked[]
0	Т
1	F
2	F
3	F
4	F
5	F
6	Т
7	F
8	F
9	F
10	F
11	F
12	F

visit 6: check 8 and check 7

Phase 1. Compute reverse postorder in  $G^R$ .

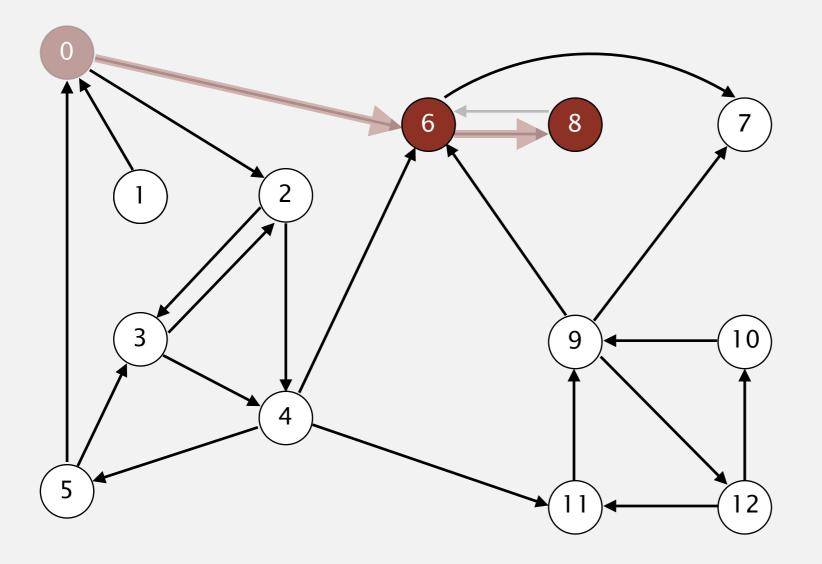


V	marked[]
0	Т
1	F
2	F
3	F
4	F
5	F
6	Т
7	F
8	Т
9	F
10	F
11	F
12	F

visit 8: check 6

Phase 1. Compute reverse postorder in  $G^R$ .



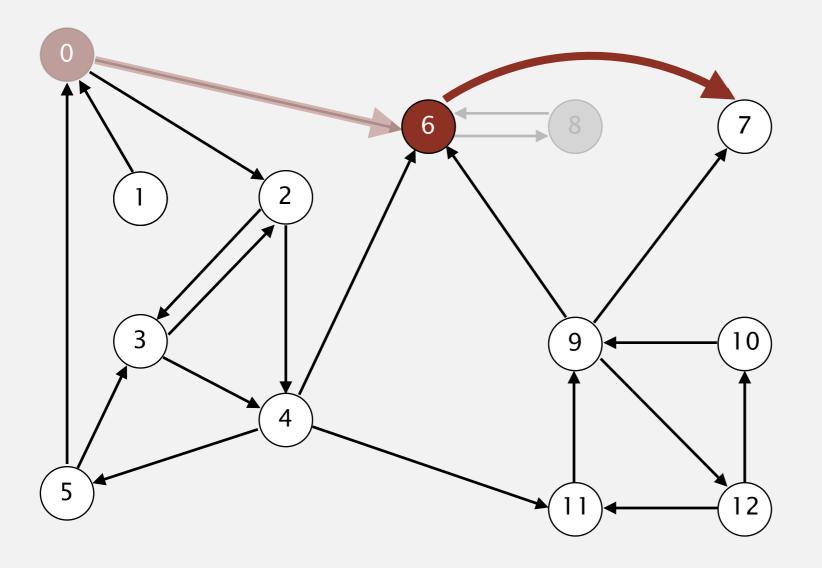


V	marked[]
0	T
1	F
2	F
3	F
4	F
5	F
6	Т
7	F
8	Т
9	F
10	F
11	F
12	F

8 done

Phase 1. Compute reverse postorder in  $G^R$ .

8

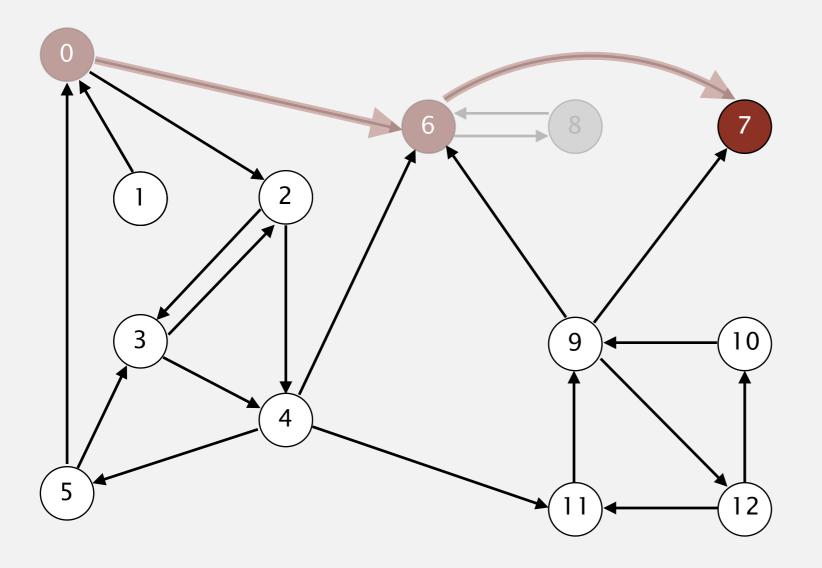


V	marked[]
0	T
1	F
2	F
3	F
4	F
5	F
6	Т
7	F
8	Т
9	F
10	F
11	F
12	F

visit 6: check 8 and check 7

Phase 1. Compute reverse postorder in  $G^R$ .

8

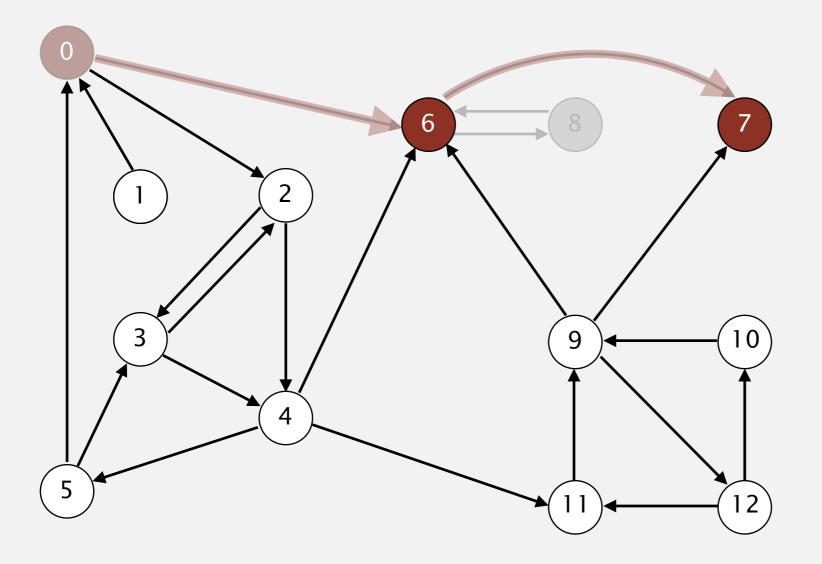


V	marked[]
0	Т
1	F
2	F
3	F
4	F
5	F
6	Т
7	Т
8	Т
9	F
10	F
11	F
12	F

visit 7

Phase 1. Compute reverse postorder in  $G^R$ .



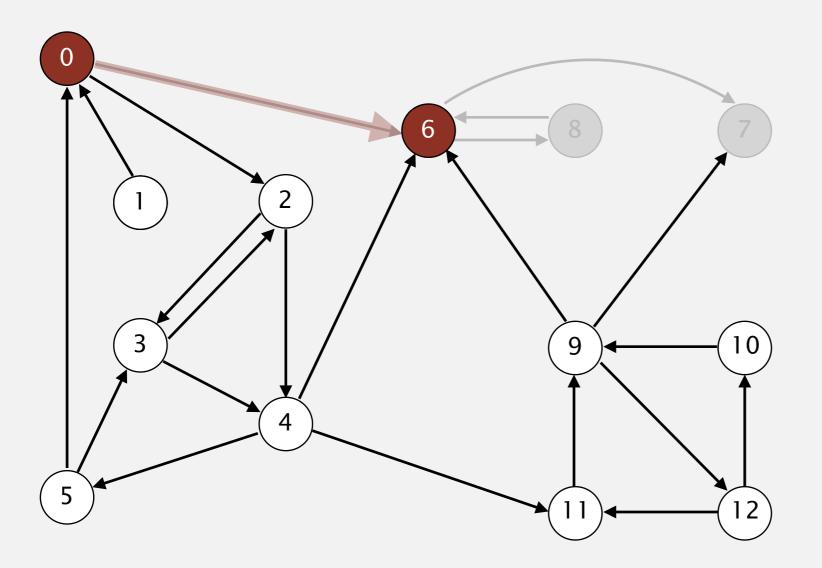


V	marked[]
0	T
1	F
2	F
3	F
4	F
5	F
6	Т
7	Т
8	Т
9	F
10	F
11	F
12	F

7 done

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8

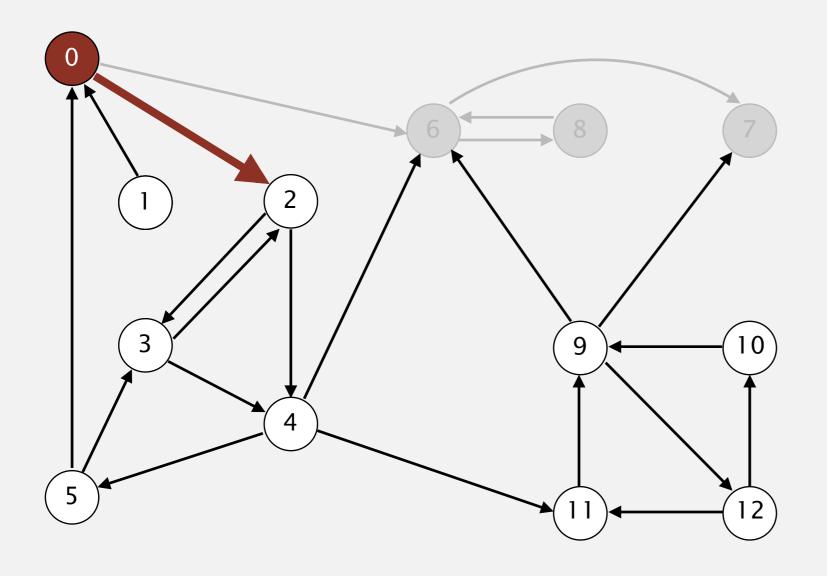


V	marked[]
0	Т
1	F
2	F
3	F
4	F
5	F
6	Т
7	Т
8	Т
9	F
10	F
11	F
12	F

6 done

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8

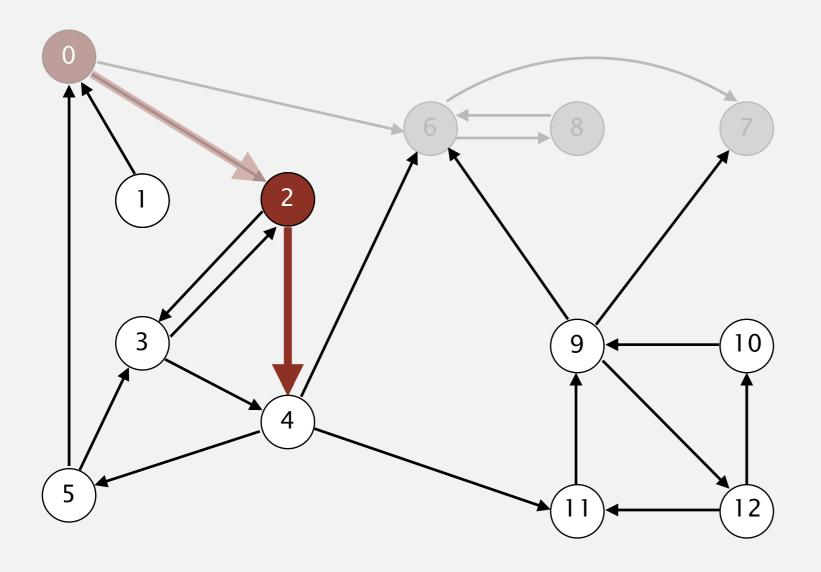


V	marked[]
0	T
1	F
2	F
3	F
4	F
5	F
6	Т
7	Т
8	Т
9	F
10	F
11	F
12	F

visit 0: check 6 and check 2

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8



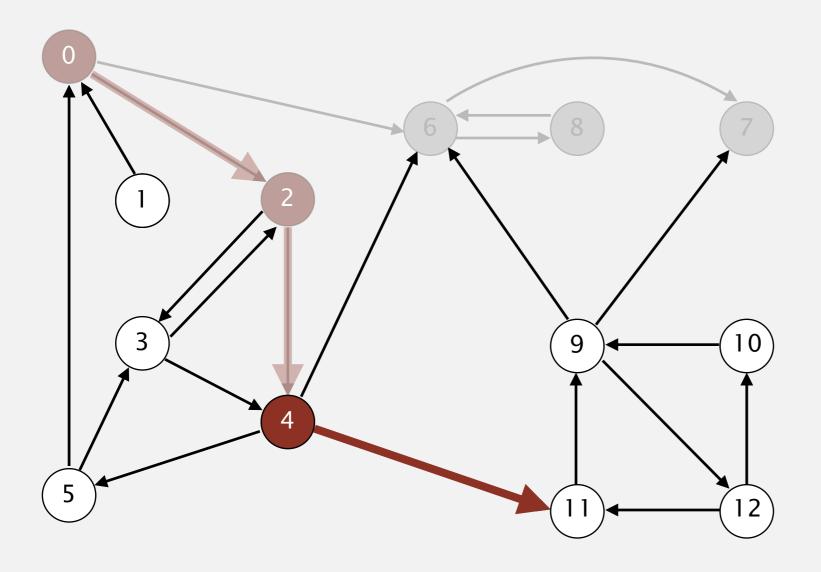
V	marked[]
0	Т
1	F
2	Т
3	F
4	F
5	F
6	Т
7	Т
8	Т
9	F
10	F
11	F
12	F

Markadll

visit 2: check 4 and check 3

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8



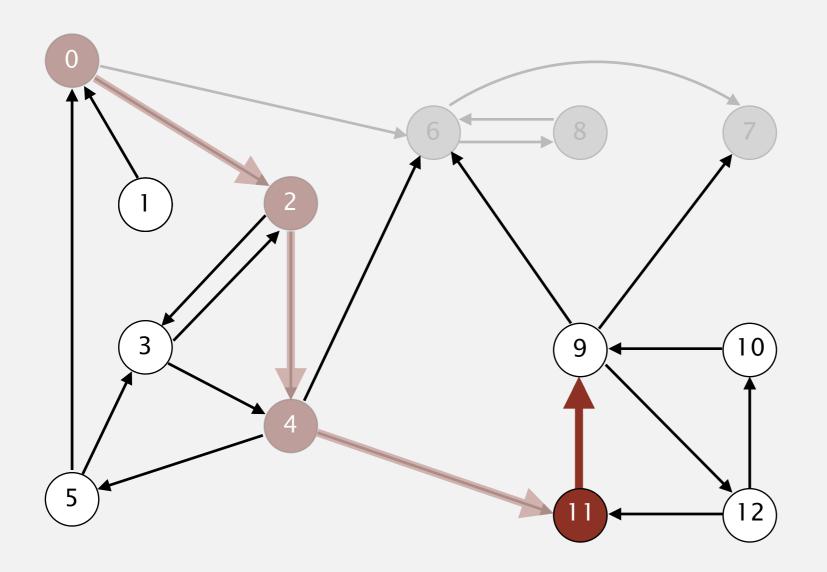
V	marked[]
0	T
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	F
10	F
11	F
12	F

markad[]

visit 4: check 11, check 6, and check 5

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8



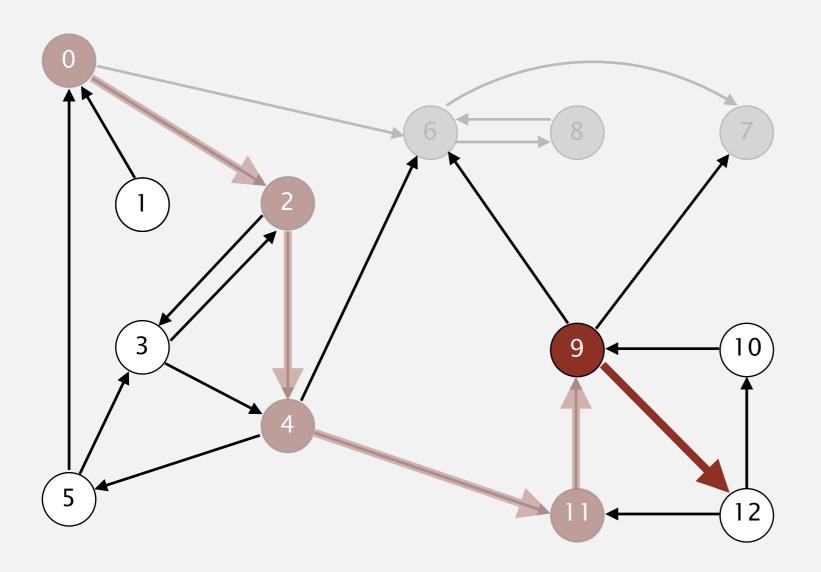
V	marked[]
0	T
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	F
10	F
11	Т
12	F

markad[]

visit 11: check 9

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8

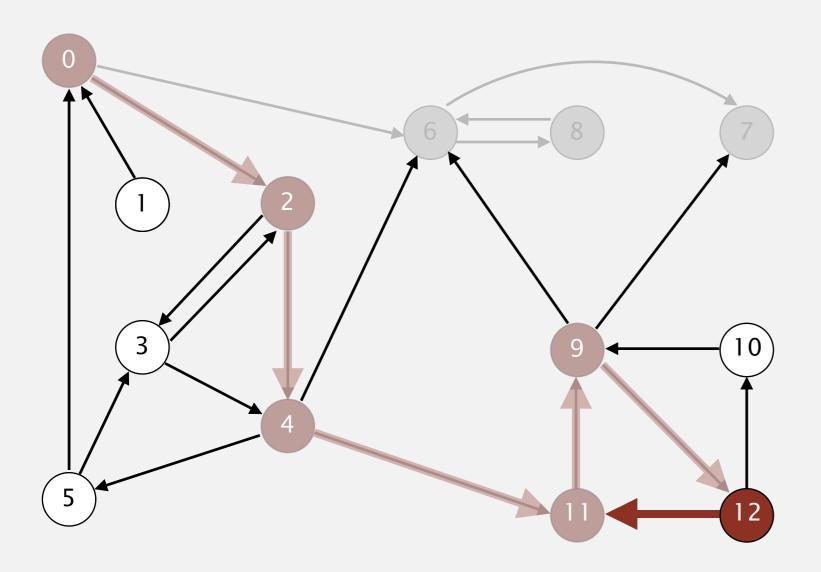


V	marked[]
0	T
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	F
11	T
12	F

visit 9: check 12, check 7, and check 6

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8



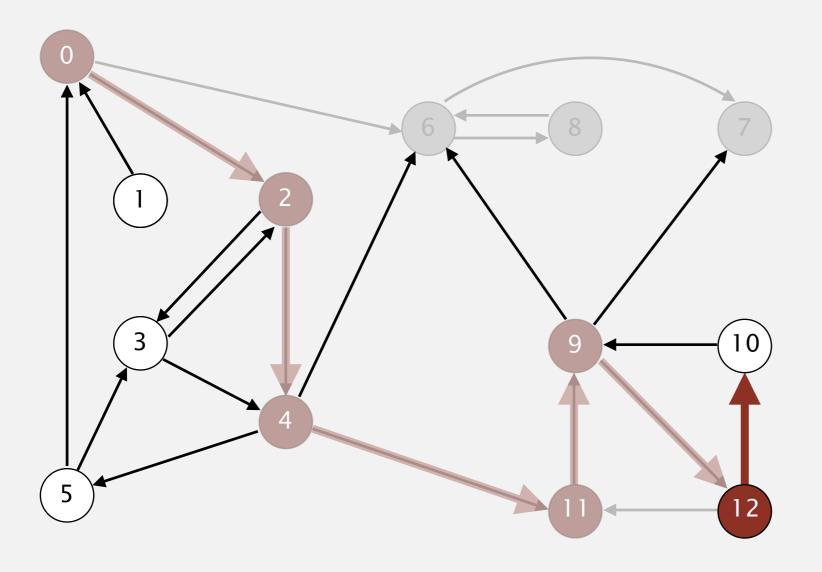
V	markeu
0	Т
1	F
2	Т
3	F
4	T
5	F
6	Т
7	Т
8	Т
9	Т
10	F
11	T
12	Т

marked[]

visit 12: check 11 and check 10

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8

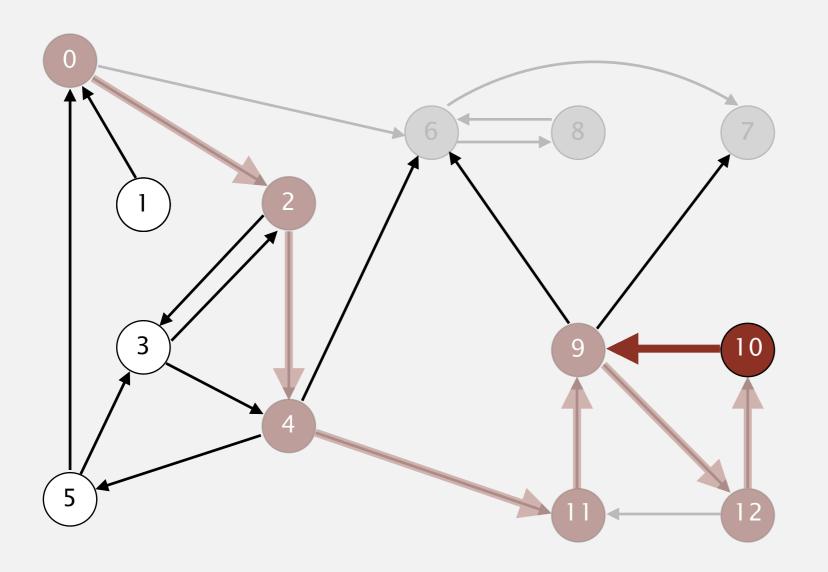


V	marked[]
0	T
1	F
2	Т
3	F
4	T
5	F
6	Т
7	Т
8	Т
9	Т
10	F
11	T
12	Т

visit 12: check 11 and check 10

Phase 1. Compute reverse postorder in  $G^R$ .

6 7 8

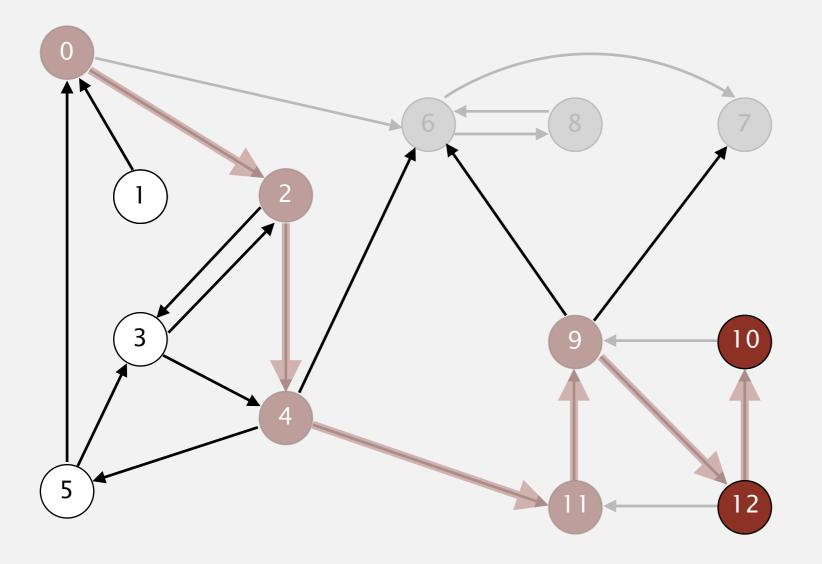


V	marked[]
0	T
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	T
12	T

visit 10: check 9

Phase 1. Compute reverse postorder in  $G^R$ .

**10** 6 7 8

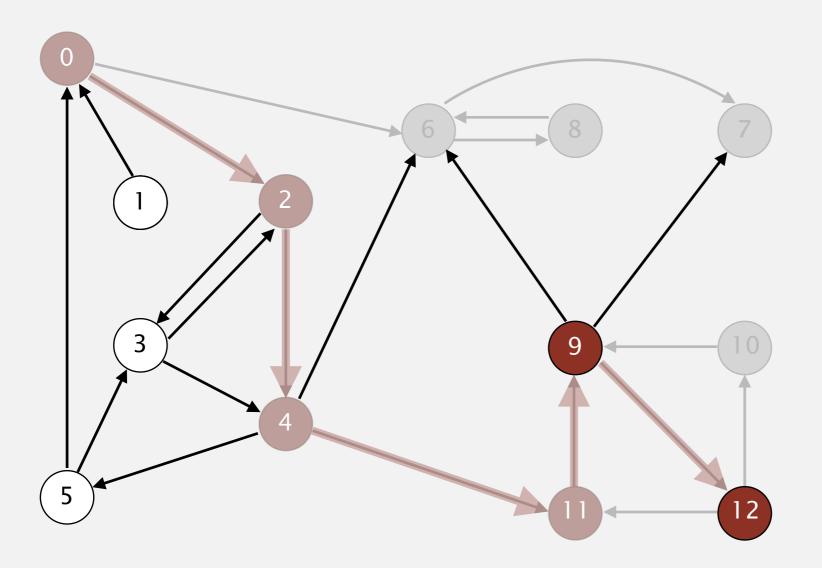


V	marked[]
0	T
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

10 done

Phase 1. Compute reverse postorder in  $G^R$ .

12 10 6 7 8

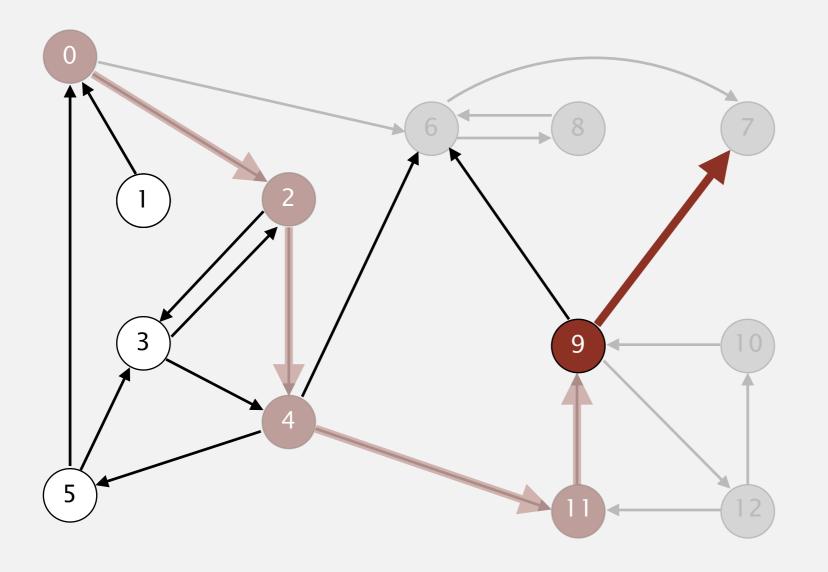


V	marked[]
0	Т
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

12 done

Phase 1. Compute reverse postorder in  $G^R$ .

12 10 6 7 8



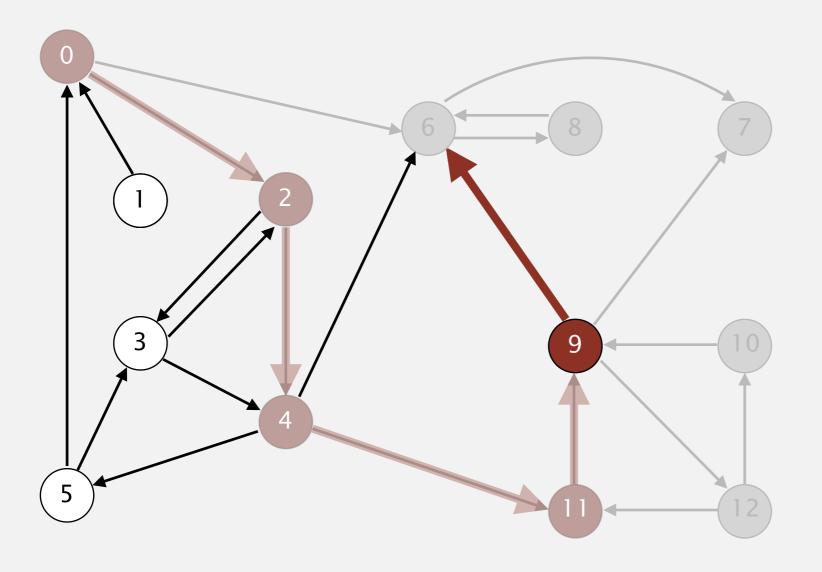
V	markeu[]
0	Т
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

marked[]

visit 9: check 12, check 7 and check 6

Phase 1. Compute reverse postorder in  $G^R$ .

12 10 6 7 8



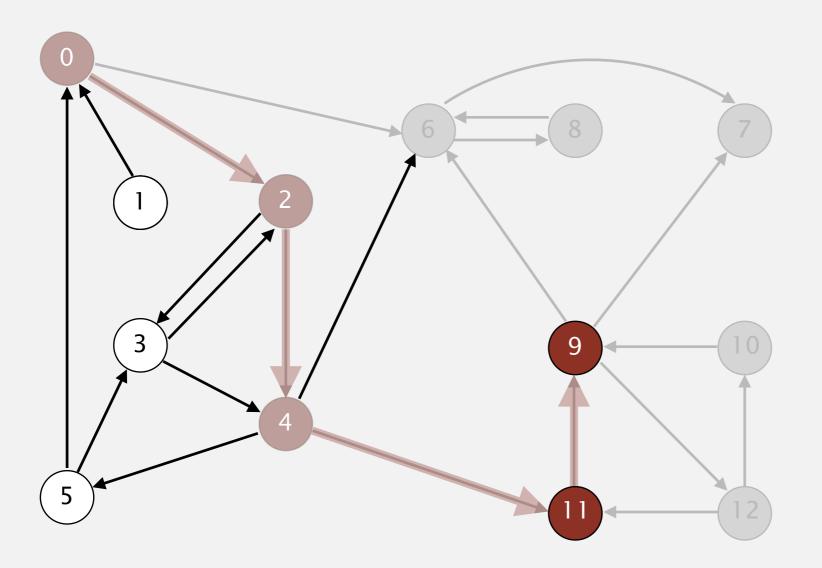
V	marked[]
0	Т
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

Markadll

visit 9: check 12, check 7, and check 6

Phase 1. Compute reverse postorder in  $G^R$ .

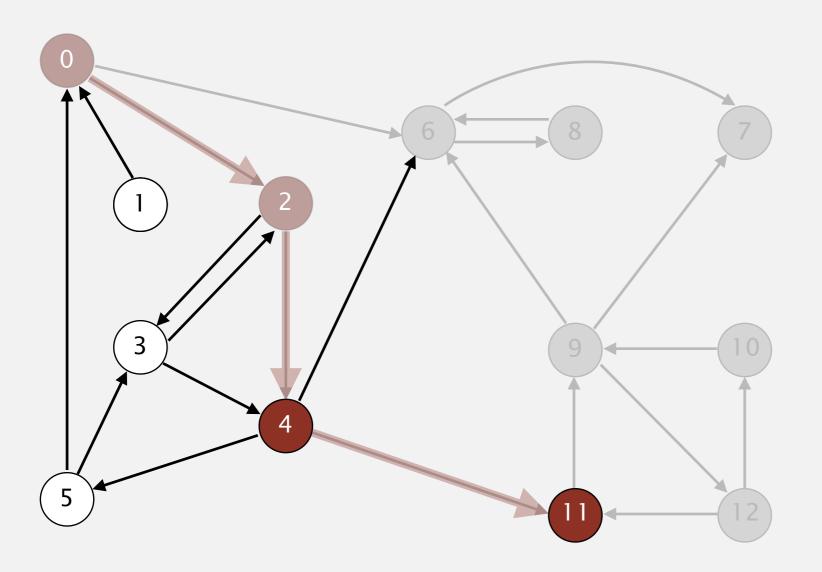
9 12 10 6 7 8



V	marked[]
0	Т
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

Phase 1. Compute reverse postorder in  $G^R$ .

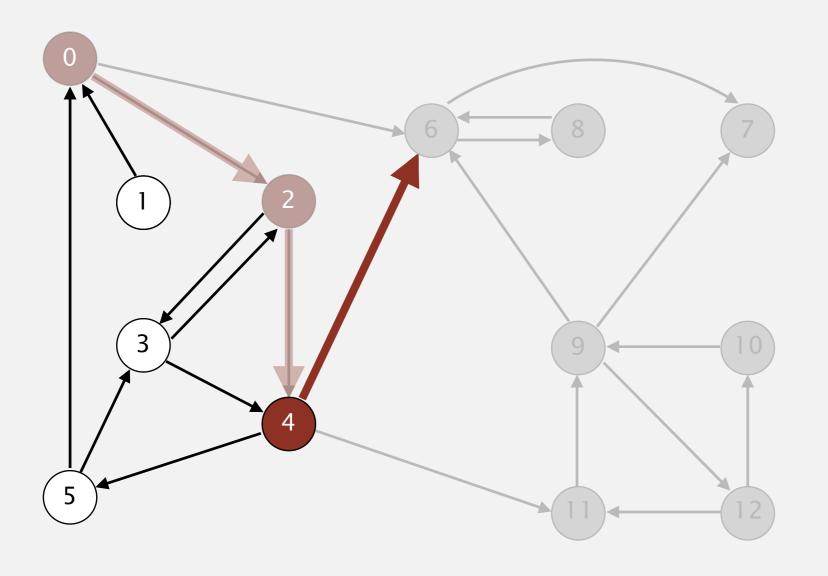
11 9 12 10 6 7 8



V	marked[]
0	Т
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	T
12	Т

Phase 1. Compute reverse postorder in  $G^R$ .

11 9 12 10 6 7 8



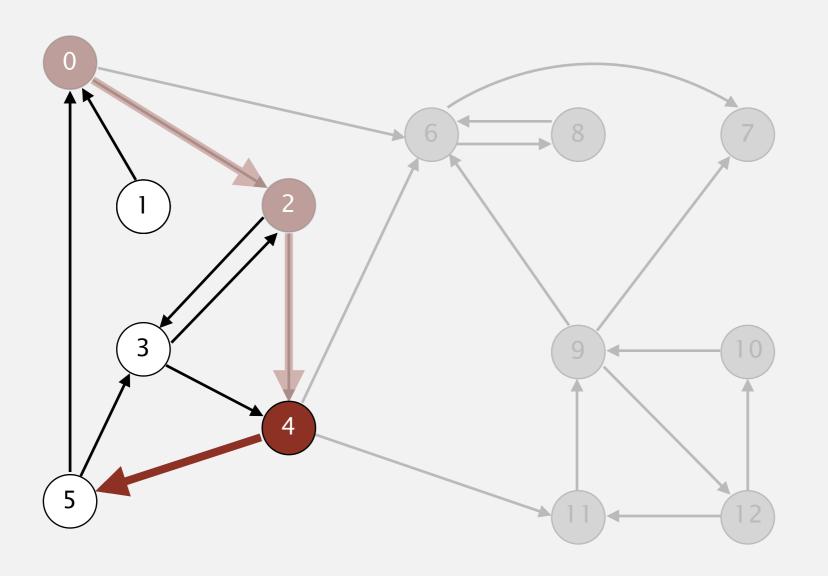
V	markeu[]
0	Т
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

marked[]

visit 4: check 11, check 6, and check 5

Phase 1. Compute reverse postorder in  $G^R$ .

11 9 12 10 6 7 8



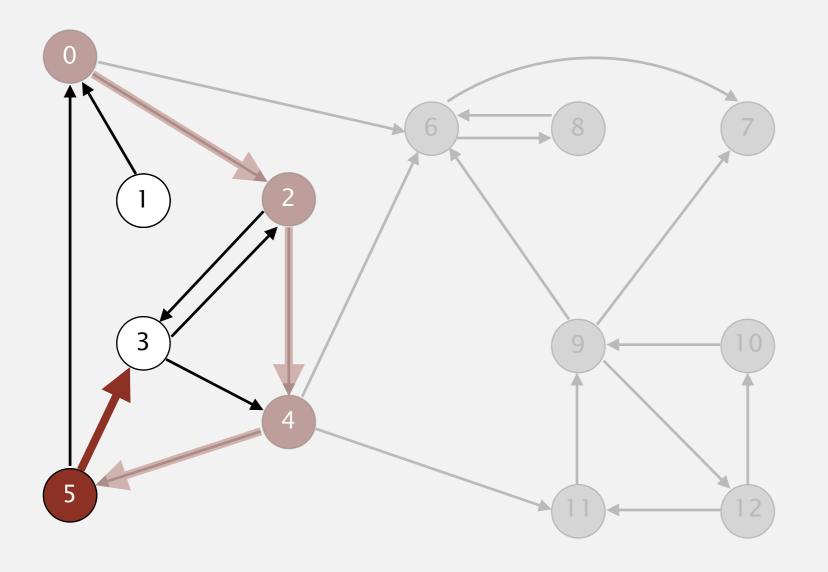
V	marked[]
0	Т
1	F
2	Т
3	F
4	Т
5	F
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

Markadll

visit 4: check 11, check 6, and check 5

Phase 1. Compute reverse postorder in  $G^R$ .

11 9 12 10 6 7 8

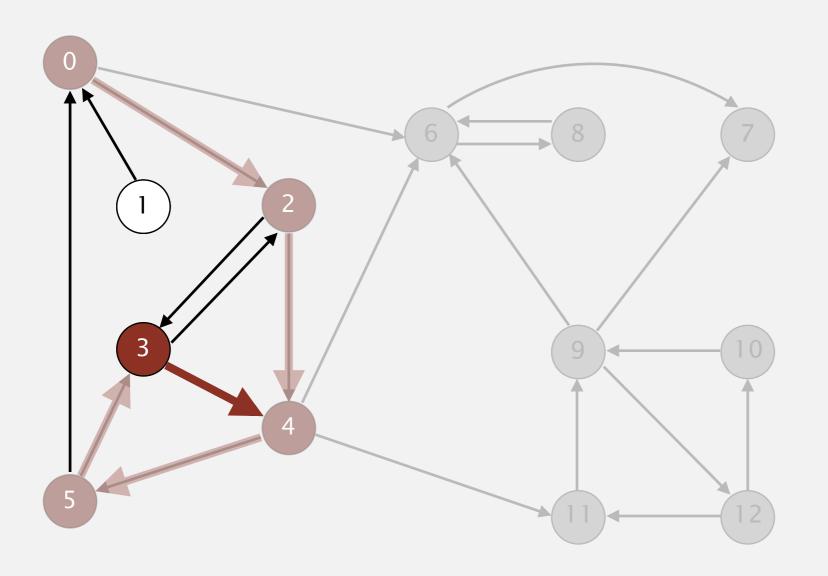


V	marked[]
0	Т
1	F
2	Т
3	F
4	Т
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	T
12	Т

visit 5: check 3 and check 0

Phase 1. Compute reverse postorder in  $G^R$ .

11 9 12 10 6 7 8



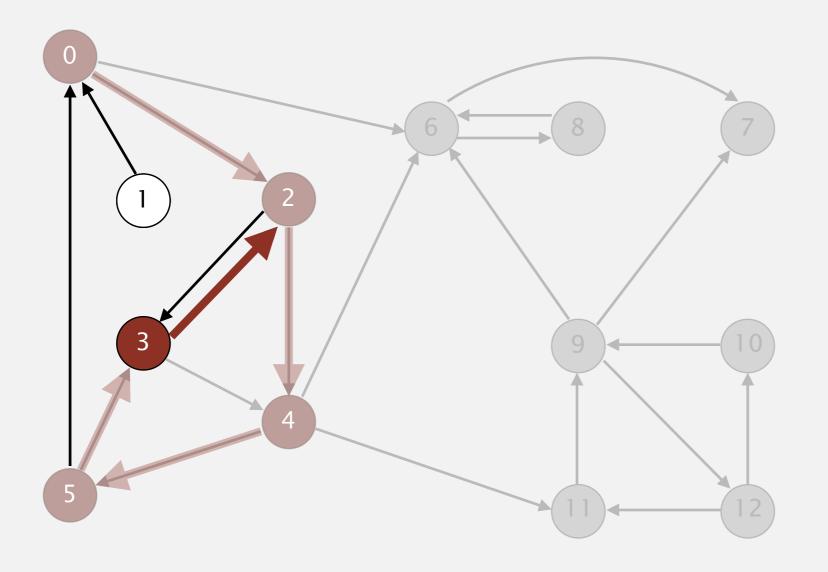
V	marked[]
0	Т
1	F
2	Т
3	Т
4	Т
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

Markadll

visit 3: check 4 and check 2

Phase 1. Compute reverse postorder in  $G^R$ .

11 9 12 10 6 7 8

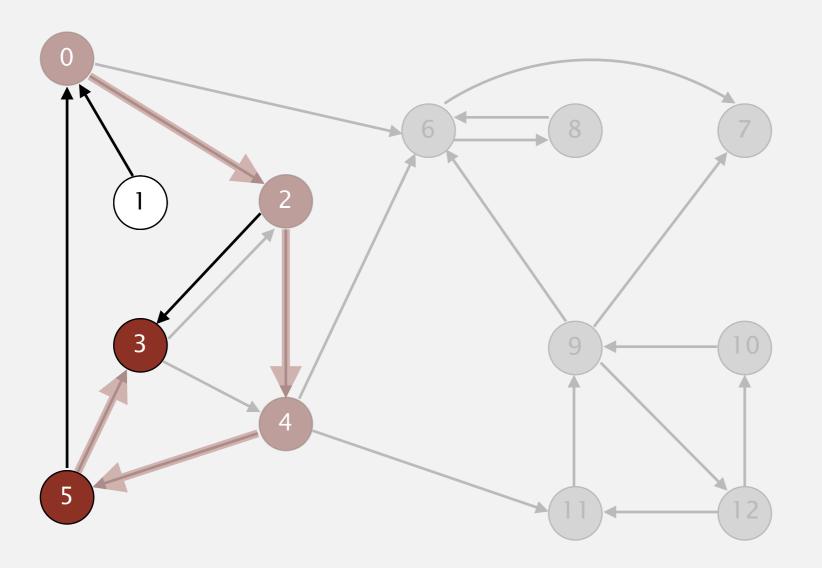


V	marked[]
0	Т
1	F
2	Т
3	Т
4	Т
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

visit 3: check 4 and check 2

Phase 1. Compute reverse postorder in  $G^R$ .

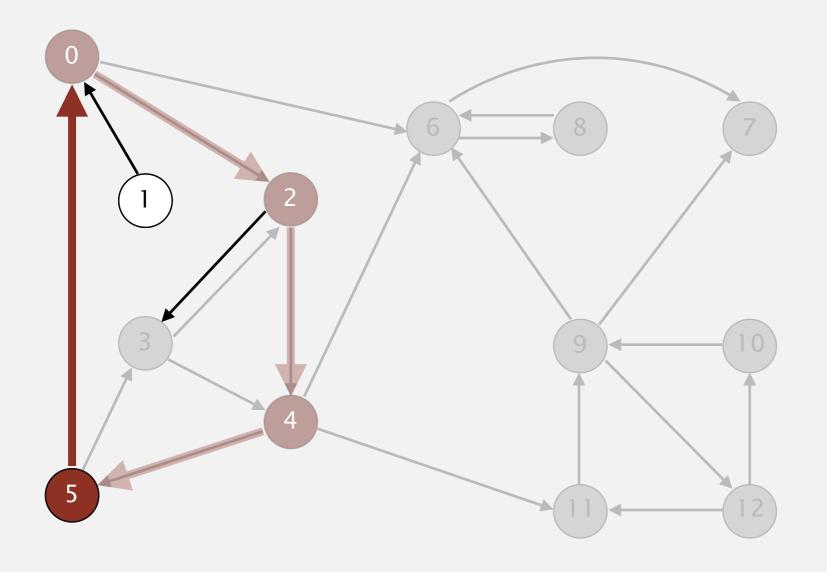
3 11 9 12 10 6 7 8



V	marked[]
0	T
1	F
2	Т
3	Т
4	Т
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

Phase 1. Compute reverse postorder in  $G^R$ .

3 11 9 12 10 6 7 8



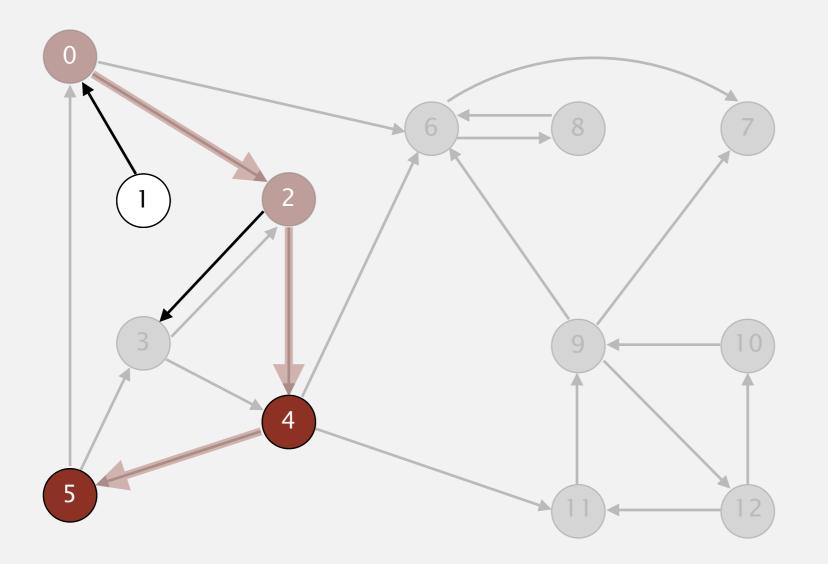
V	markeu
0	Т
1	F
2	Т
3	T
4	Т
5	T
6	Т
7	Т
8	Т
9	Т
10	Т
11	T
12	Т

marked[]

visit 5: check 3 and check 0

Phase 1. Compute reverse postorder in  $G^R$ .

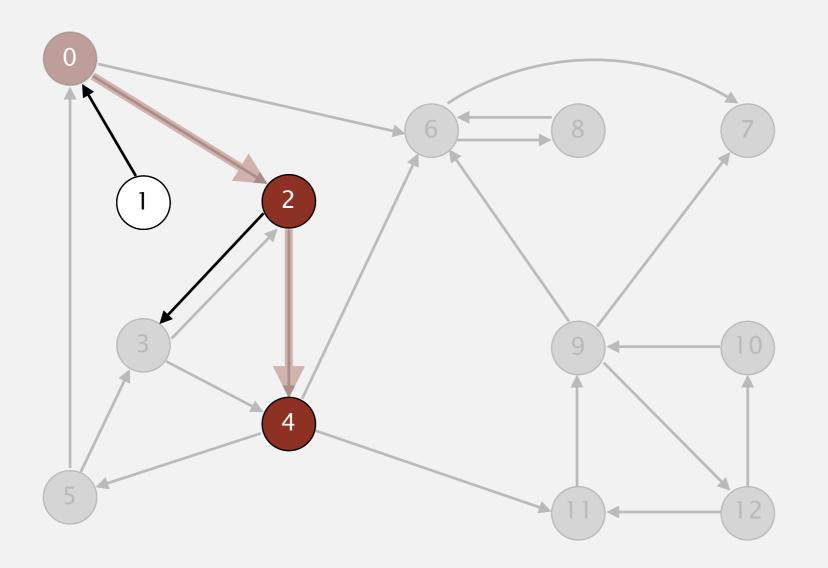
5 3 11 9 12 10 6 7 8



V	marked[]
0	Т
1	F
2	Т
3	Т
4	Т
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	T

Phase 1. Compute reverse postorder in  $G^R$ .

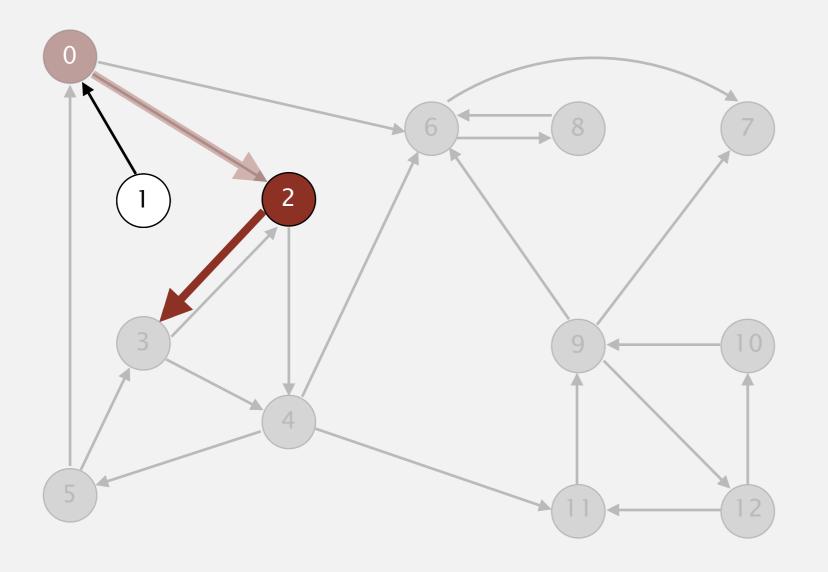
 4
 5
 3
 11
 9
 12
 10
 6
 7
 8



V	marked[]
0	Т
1	F
2	Т
3	T
4	T
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	Т

Phase 1. Compute reverse postorder in  $G^R$ .

4 5 3 11 9 12 10 6 7 8

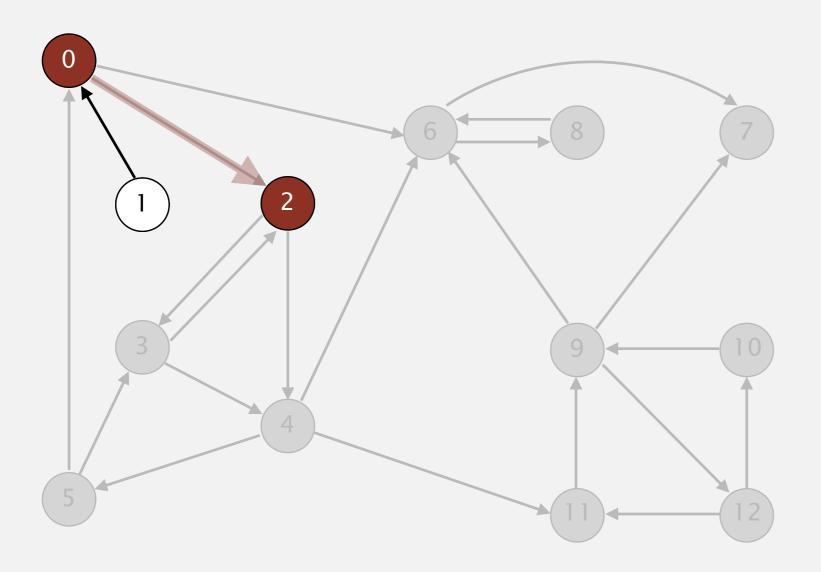


V	marked[]
0	Т
1	F
2	Т
3	Т
4	Т
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	T

visit 2: check 4 and check 3

Phase 1. Compute reverse postorder in  $G^R$ .

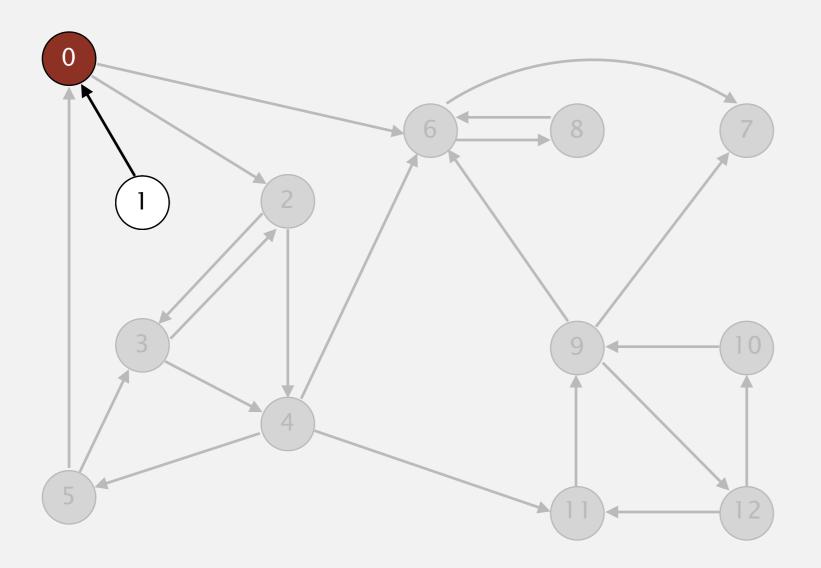
2 4 5 3 11 9 12 10 6 7 8



V	marked[]
0	Т
1	F
2	Т
3	Т
4	T
5	T
6	Т
7	Т
8	T
9	T
10	Т
11	Т
12	T

Phase 1. Compute reverse postorder in  $G^R$ .

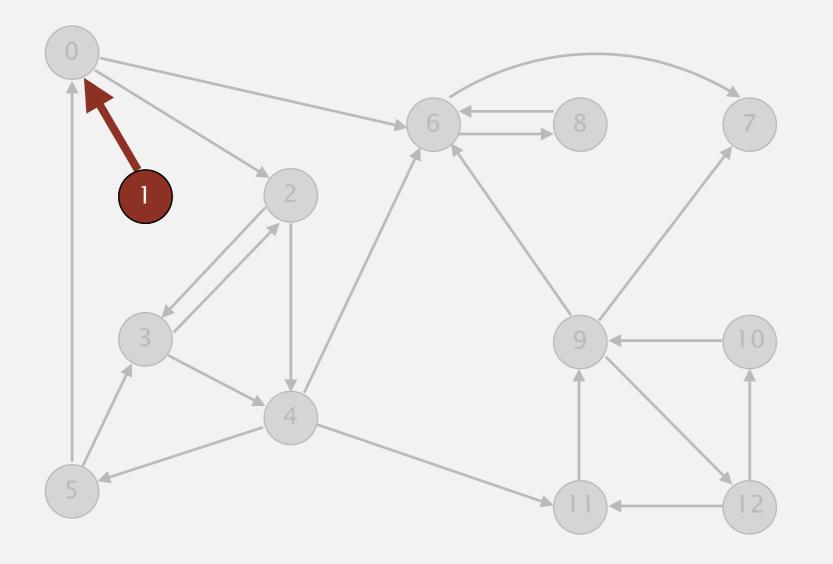
0 2 4 5 3 11 9 12 10 6 7 8



V	marked[]
0	Т
1	F
2	Т
3	T
4	T
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	Т
12	T

Phase 1. Compute reverse postorder in  $G^R$ .

0 2 4 5 3 11 9 12 10 6 7 8

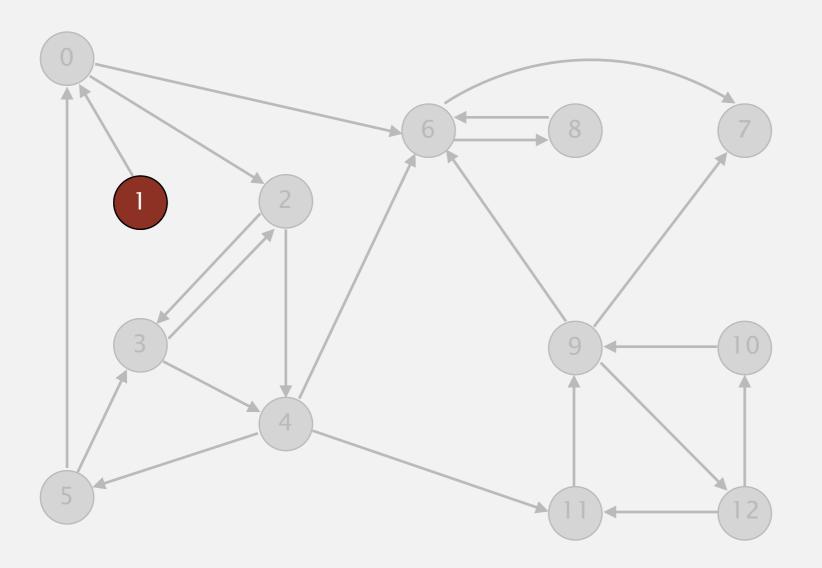


V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	T
12	Т

visit 1: check 0

Phase 1. Compute reverse postorder in  $G^R$ .

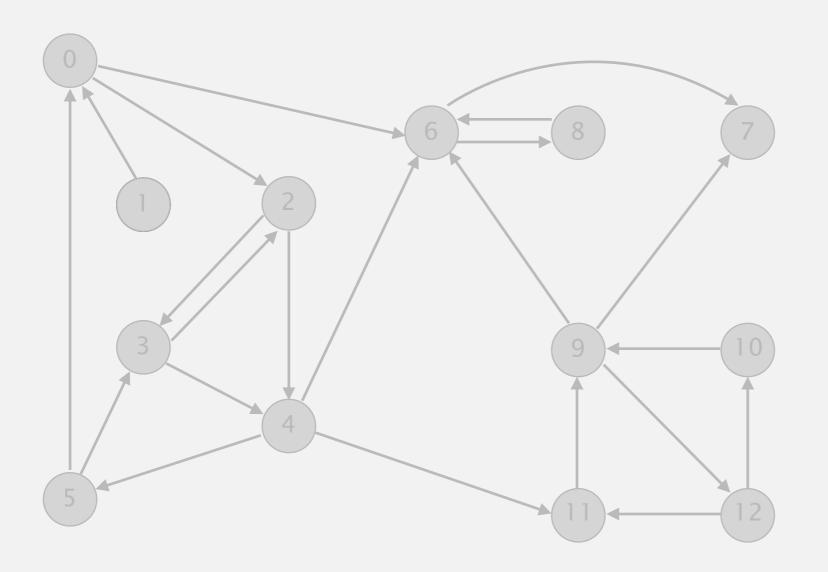
1 0 2 4 5 3 11 9 12 10 6 7 8



V	marked[]
0	Т
1	Т
2	T
3	T
4	T
5	Т
6	Т
7	Т
8	T
9	Т
10	T
11	T
12	T

Phase 1. Compute reverse postorder in  $G^R$ .

1 0 2 4 5 3 11 9 12 10 6 7 8



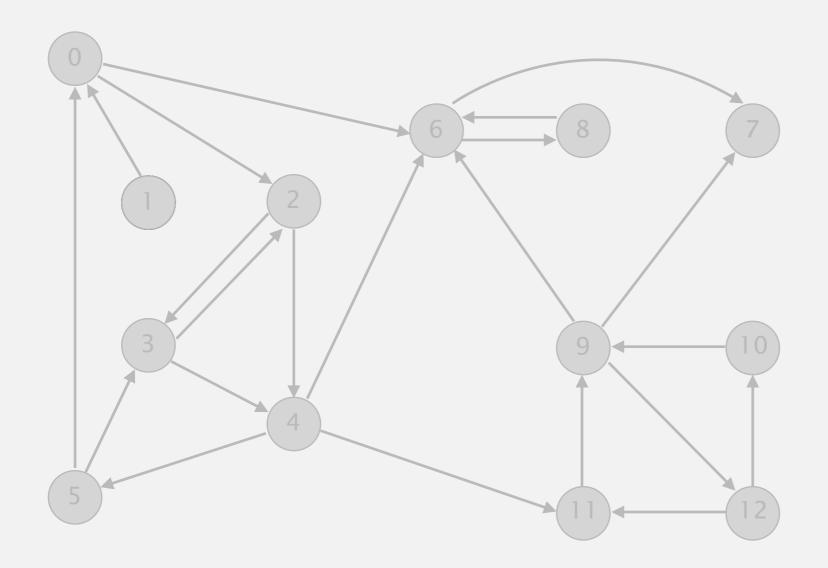
V	marked[]
0	Т
1	Т
2	Т
3	Т
4	Т
5	Т
6	Т
7	Т
8	Т
9	Т
10	Т
11	T
12	Т

Markadll

check 2 3 4 5 6 7 8 9 10 11 12

Phase 1. Compute reverse postorder in  $G^R$ .

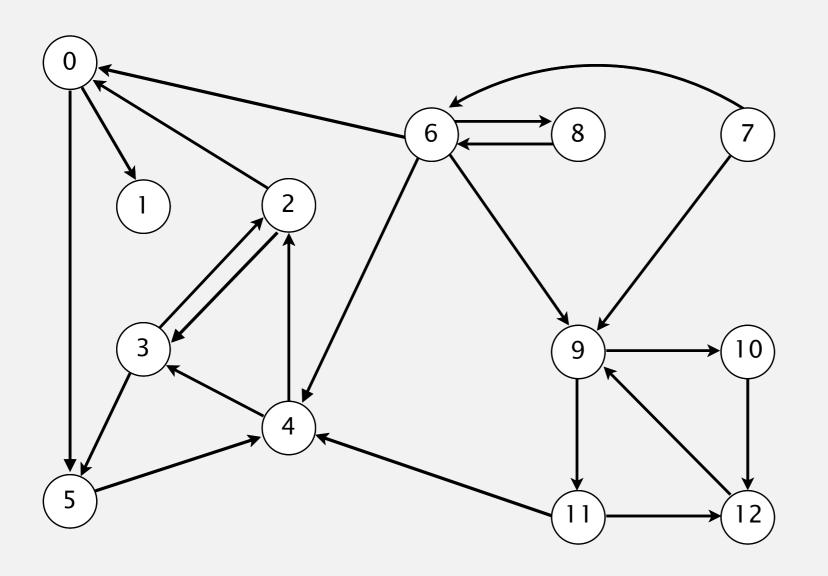
1 0 2 4 5 3 11 9 12 10 6 7 8



# DFS IN THE ORGINAL GRAPH

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

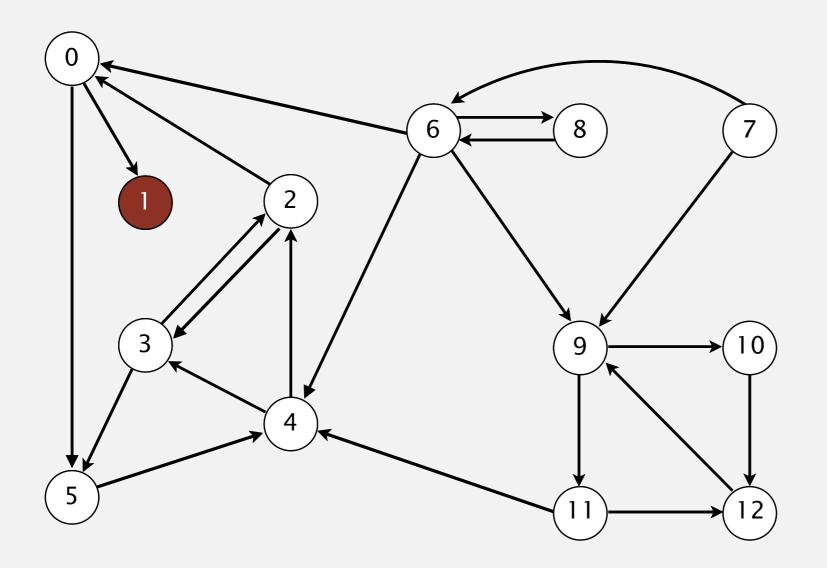
1 0 2 4 5 3 11 9 12 10 6 7 8



V	id[]
0	_
1	_
2	_
3	_
4	_
5	_
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

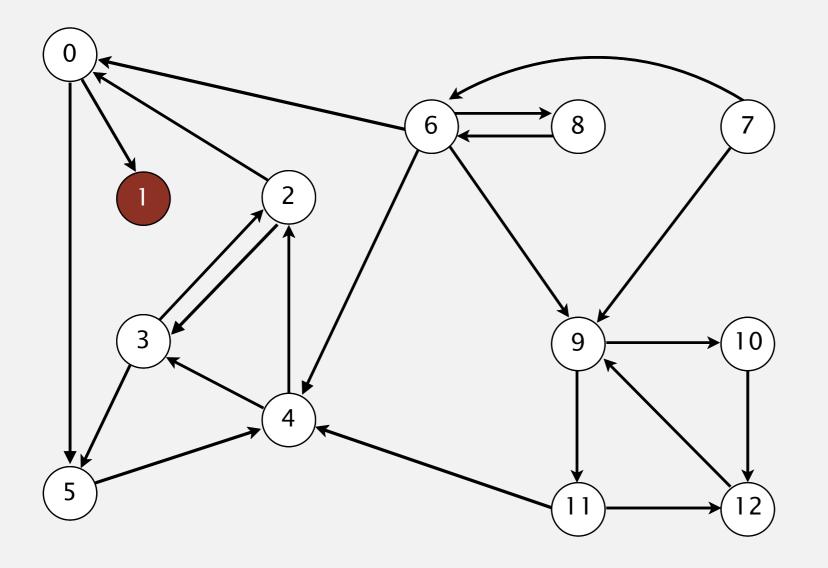




V	id[]
0	_
1	0
2	_
3	_
4	_
5	_
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

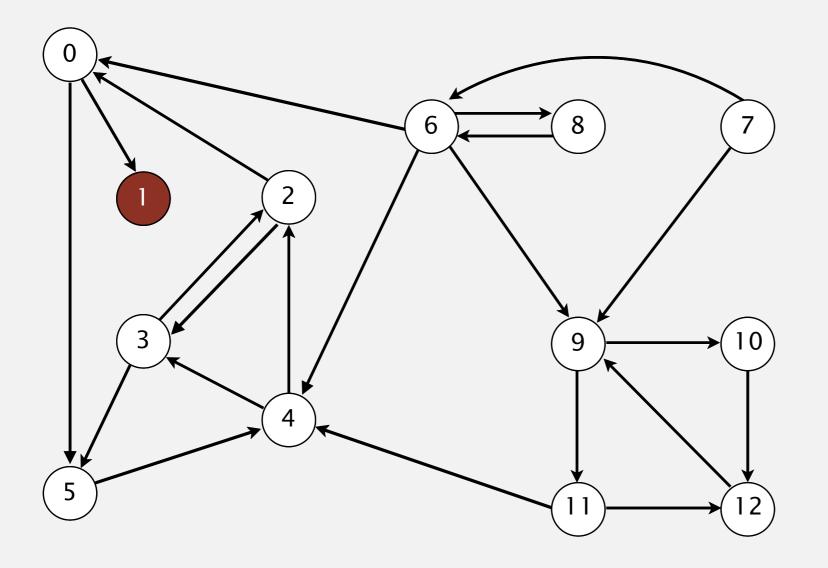




V	id[]
0	_
1	0
2	_
3	_
4	_
5	_
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

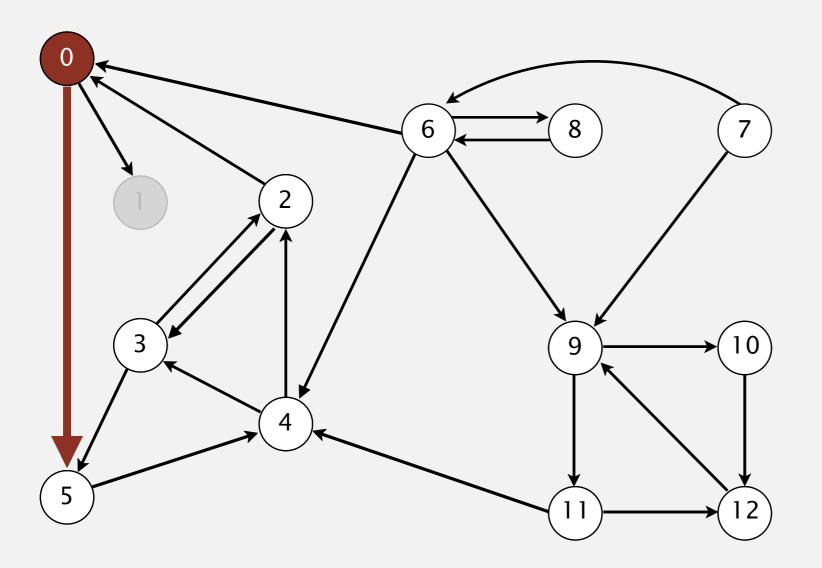




V	id[]
0	_
1	0
2	_
3	_
4	_
5	_
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

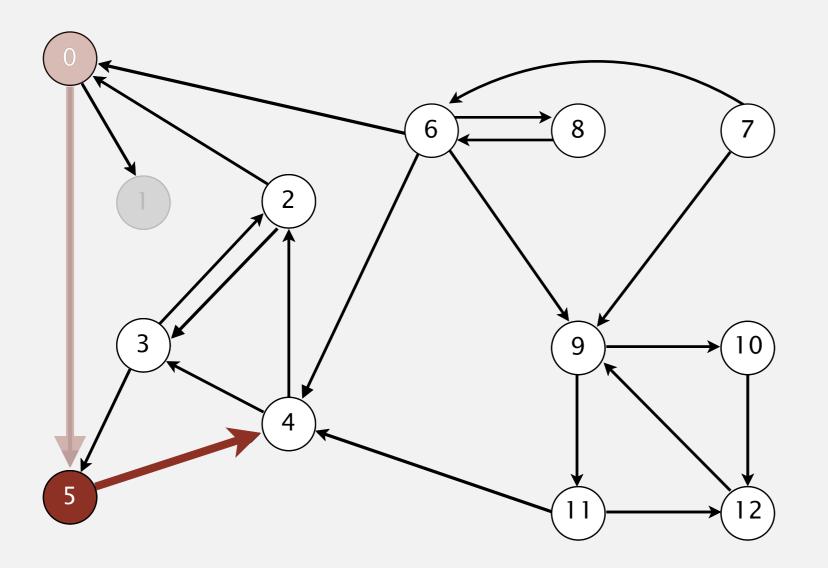




V	id[]
0	(1)
1	0
2	_
3	_
4	_
5	_
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

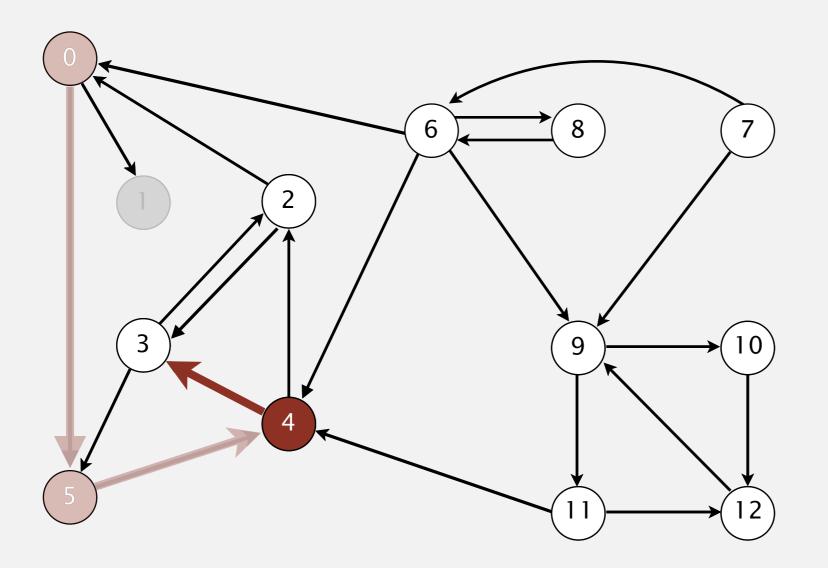




V	id[]
0	1
1	0
2	_
3	_
4	_
5	(1)
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



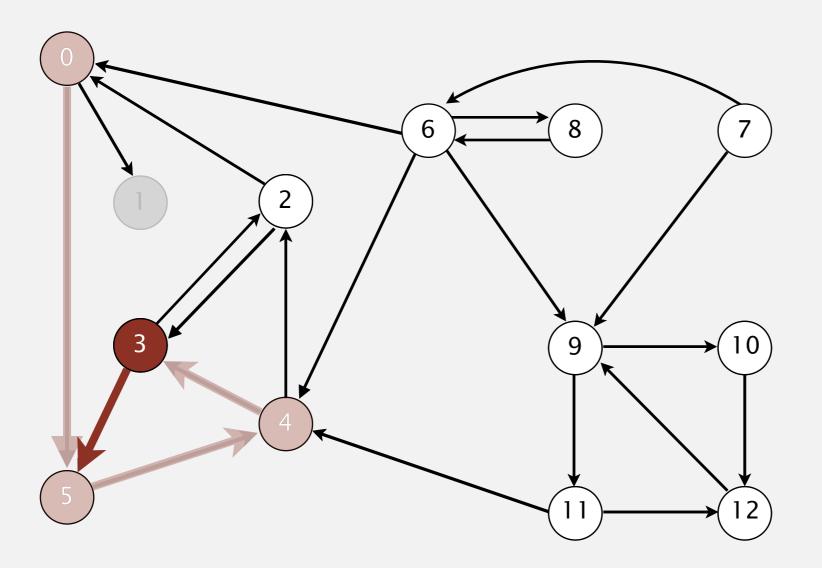


V	id[]
0	1
1	0
2	_
3	_
4	(1)
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

visit 4: check 3 and check 2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



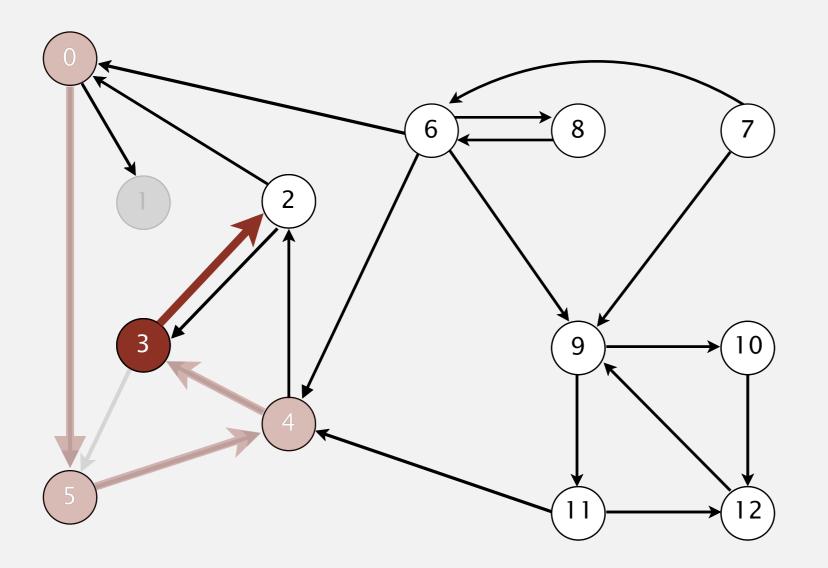


V	id[]
0	1
1	0
2	_
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

visit 3: check 5 and check 2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



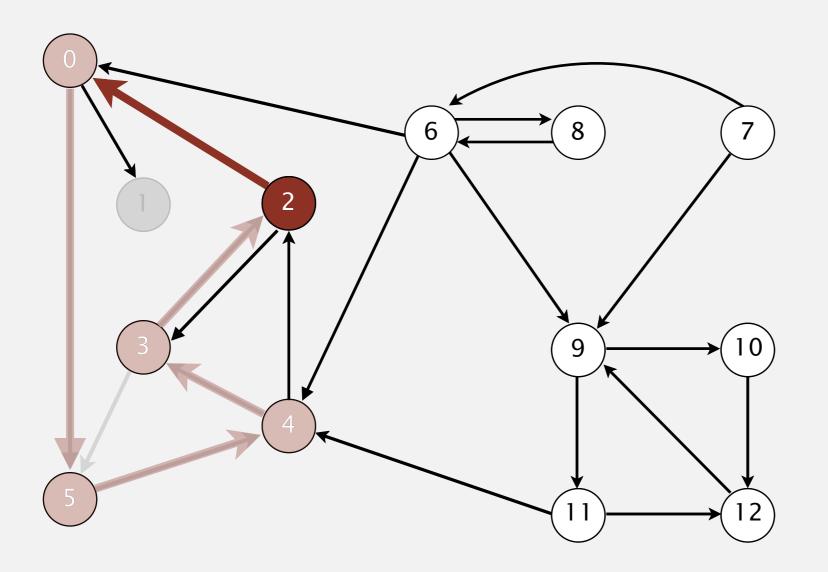


V	id[]
0	1
1	0
2	_
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

visit 3: check 5 and check 2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



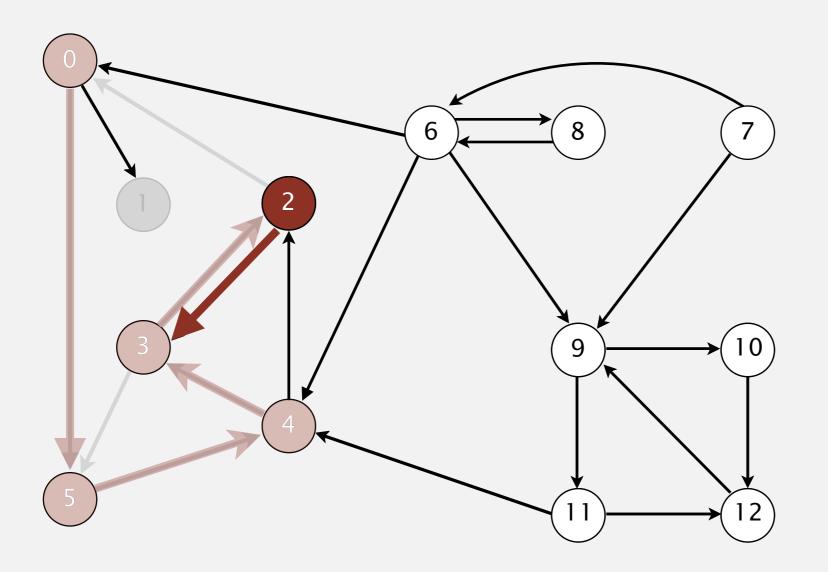


V	id[]
0	1
1	0
2	(1)
3	1
4	1
5 6 7	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

visit 2: check 0 and check 3

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



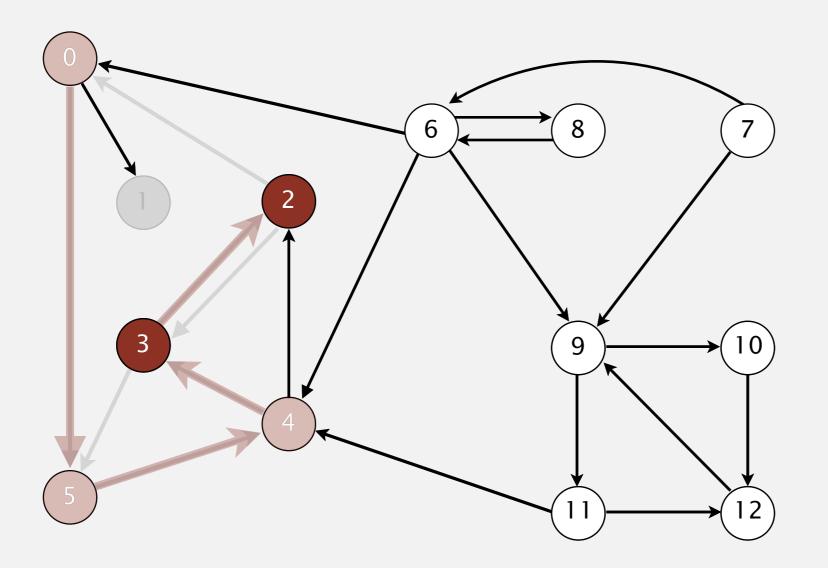


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

visit 2: check 0 and check 3

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

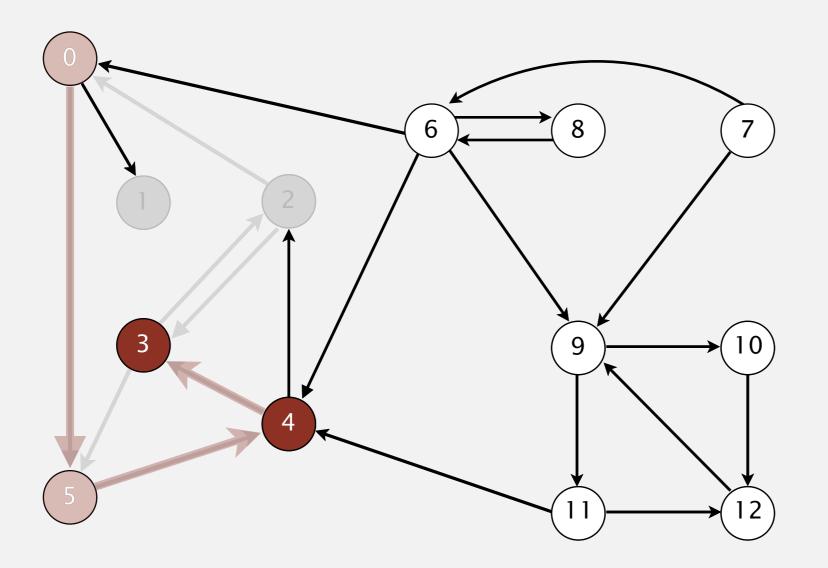




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

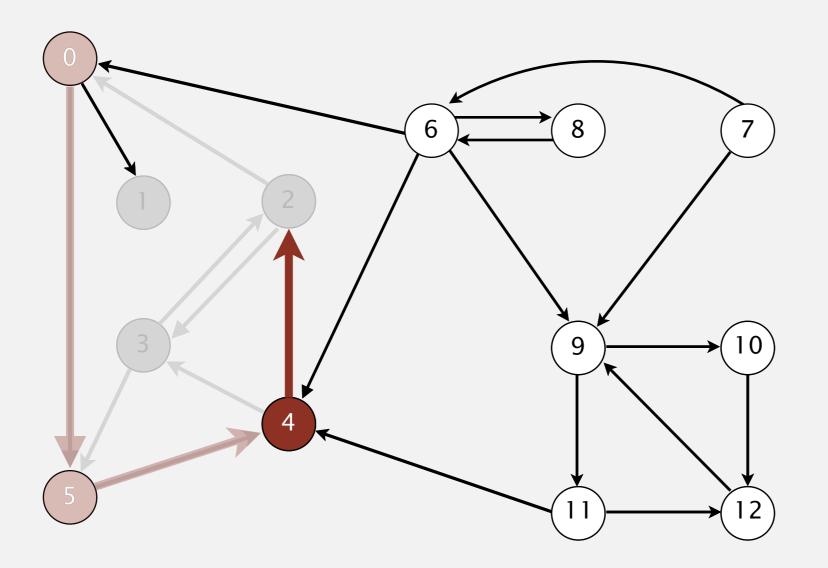




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



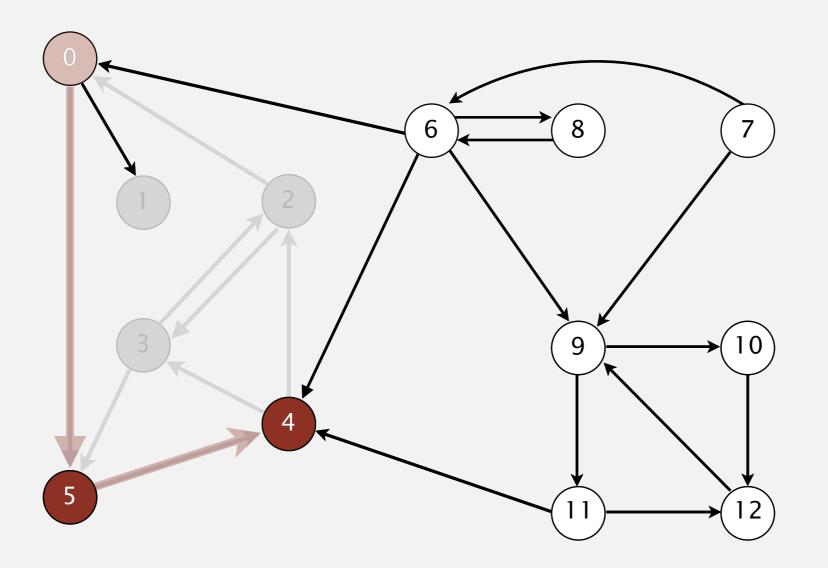


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

visit 4: check 3 and check 2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

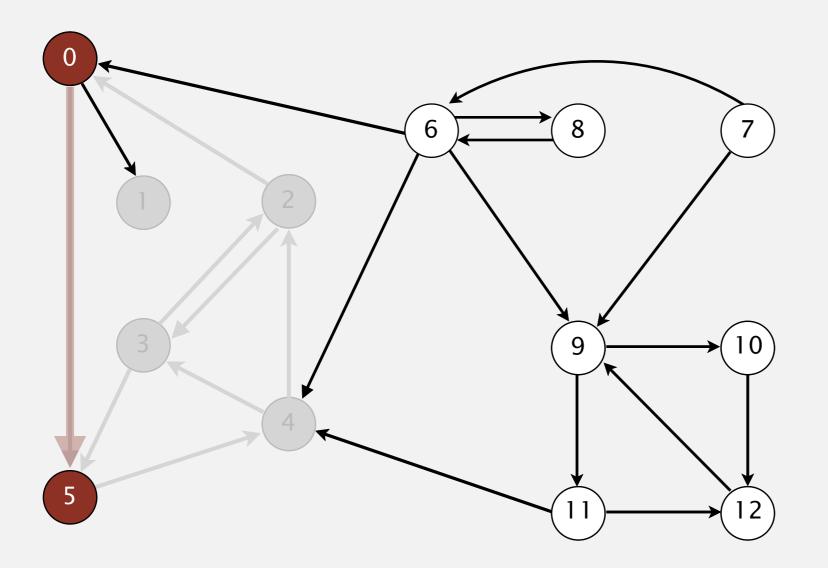




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

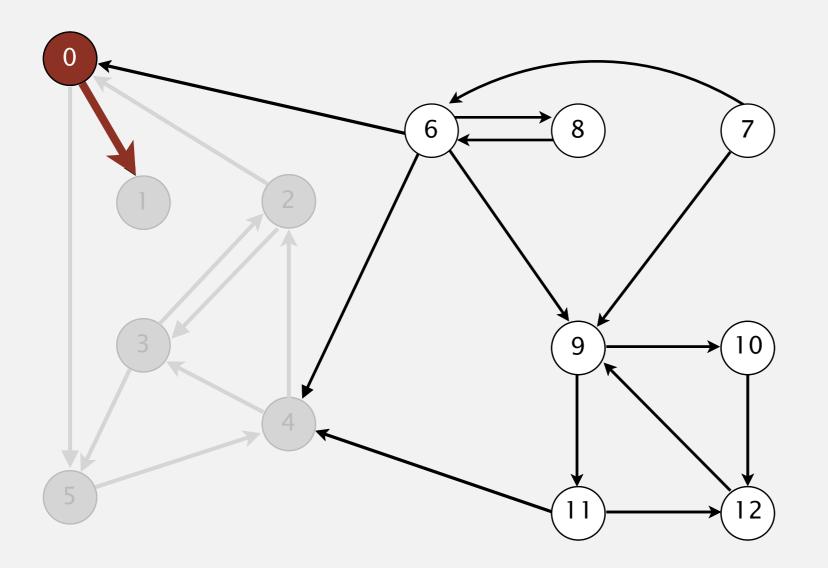




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



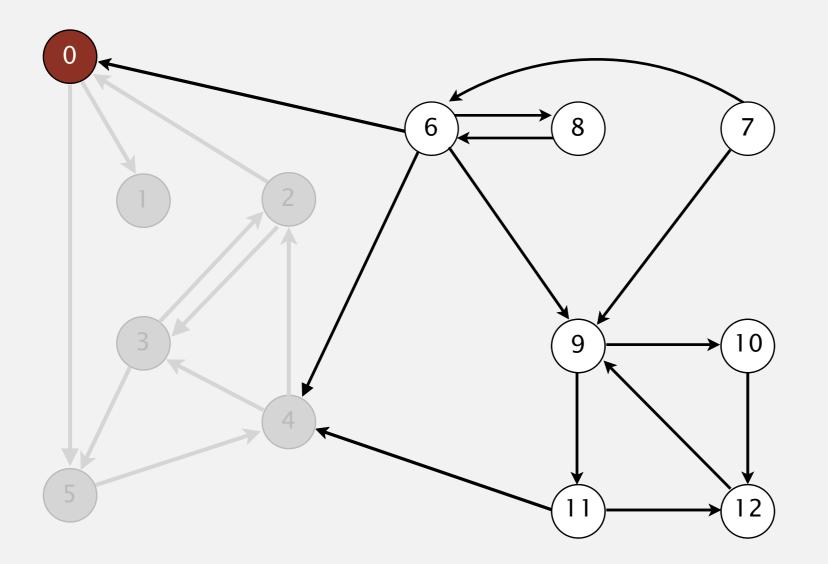


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

visit 0: check 5 and check 1

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

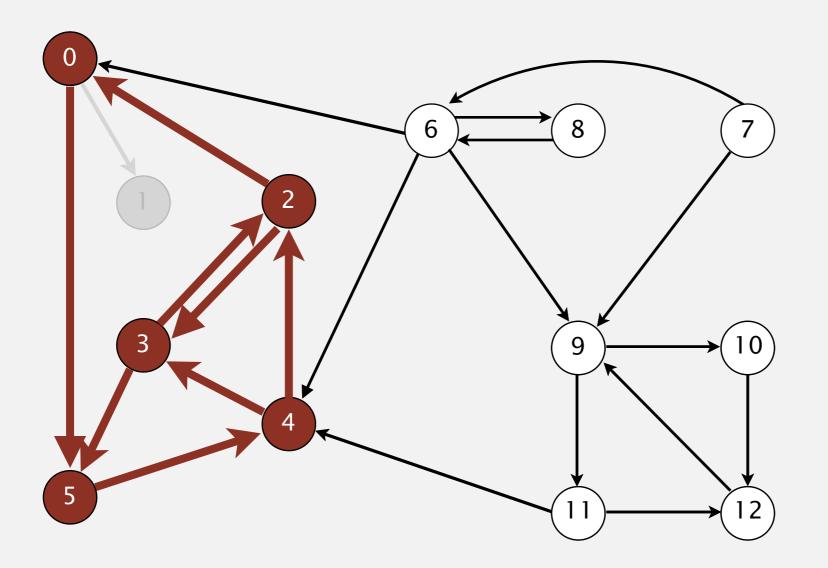




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

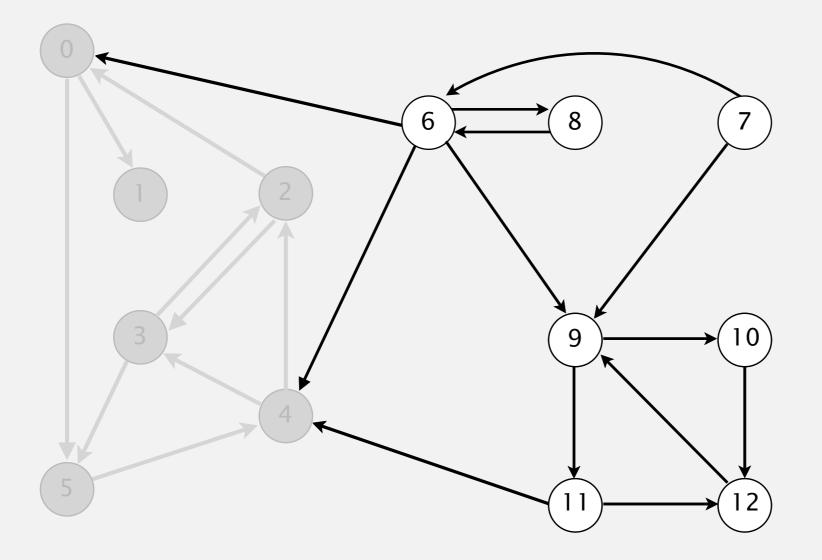




V	id[]
0	(1)
1	0
2	(1)
3	(1)
4	(1)
3 4 5 6 7 8 9	(1)
6	_
7	_
8	_
9	_
10	_
11	_
12	_

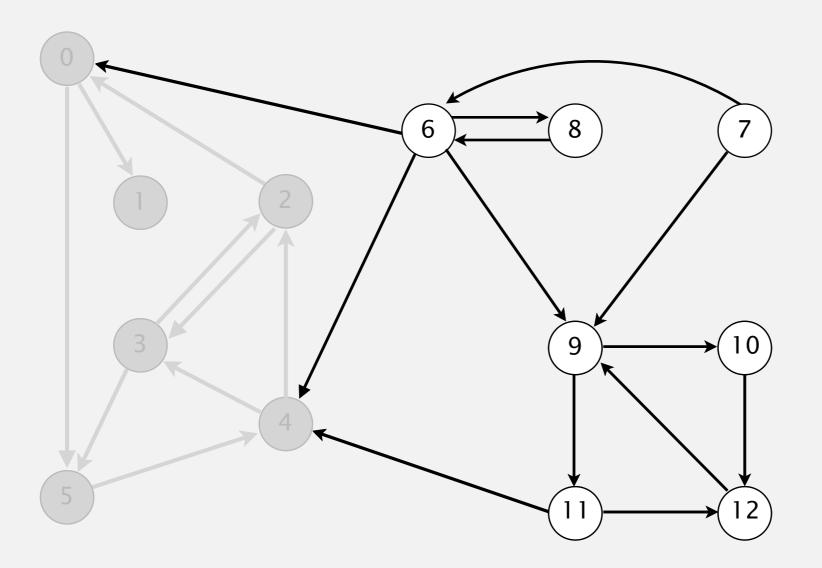
Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .





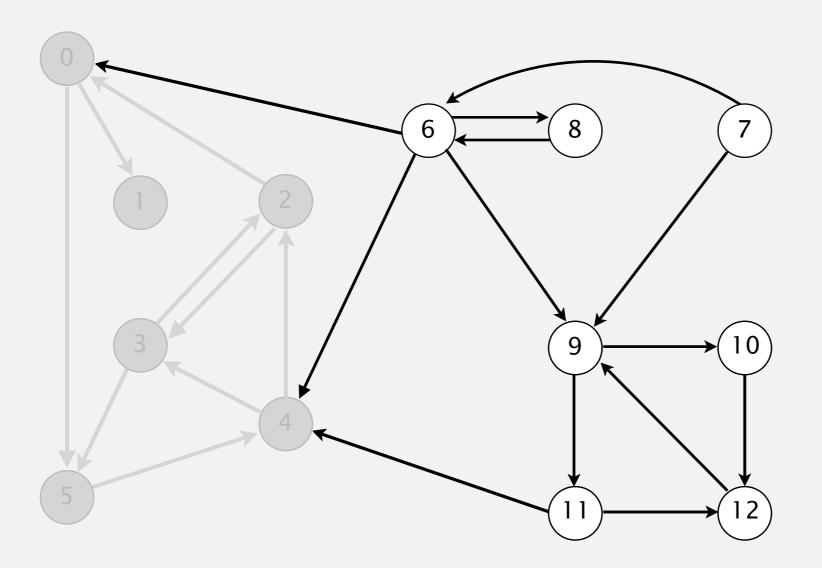
V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



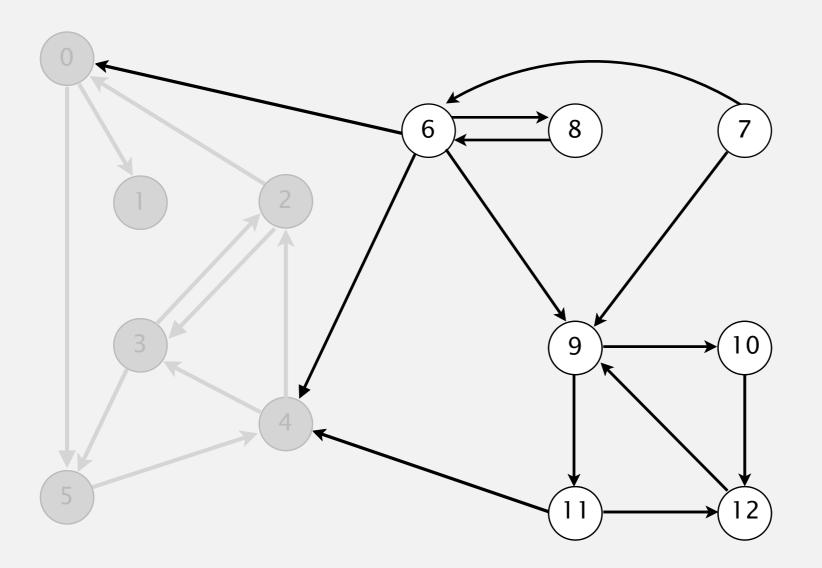
V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

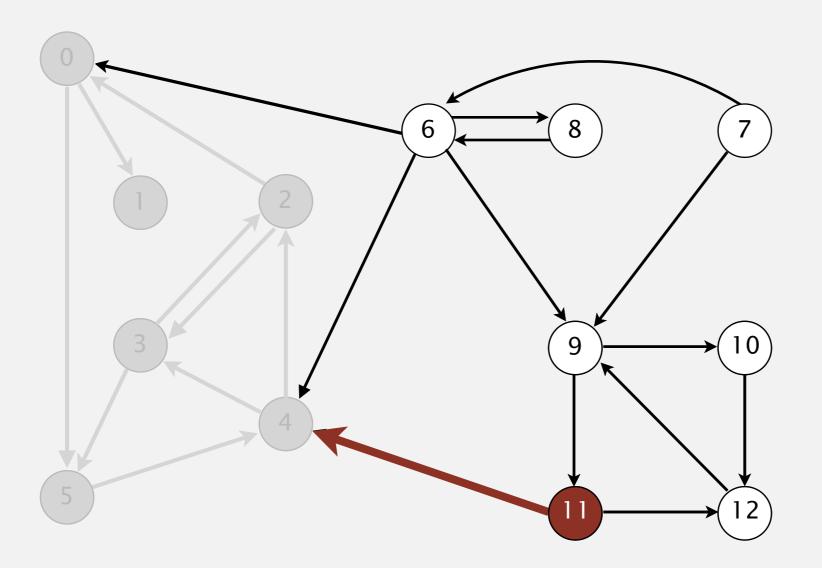
Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	_
12	_

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

1 0 2 4 5 3 (11) 9 12 10 6 7 8

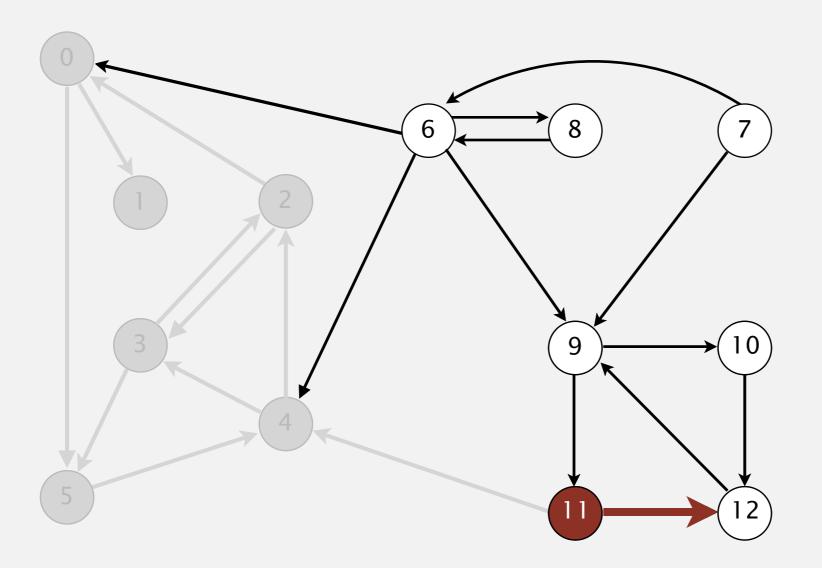


V	ıa[]
0	1
1	0
2	1
3	1
4	1
5	1
6 7	_
7	_
8	_
9	_
10	_
11	(2)
12	_

Пhі

visit 11: check 4 and check 12

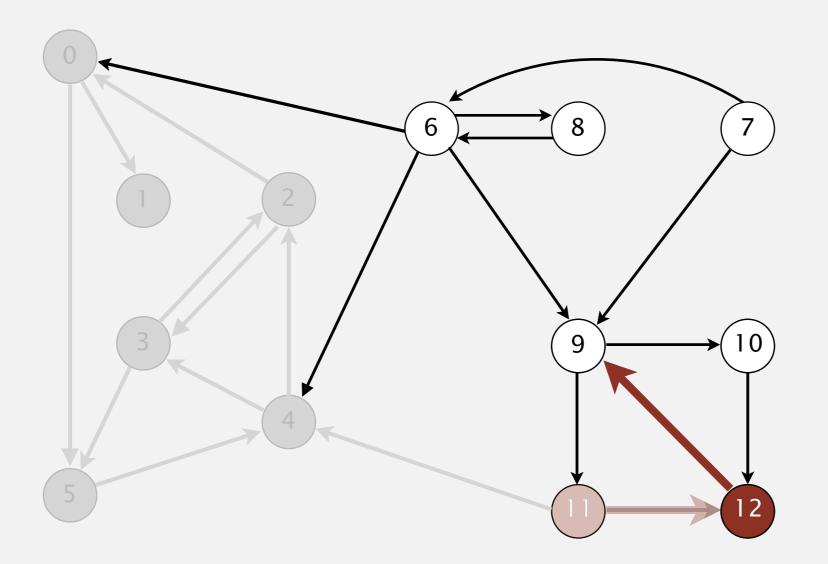
Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	2
12	_

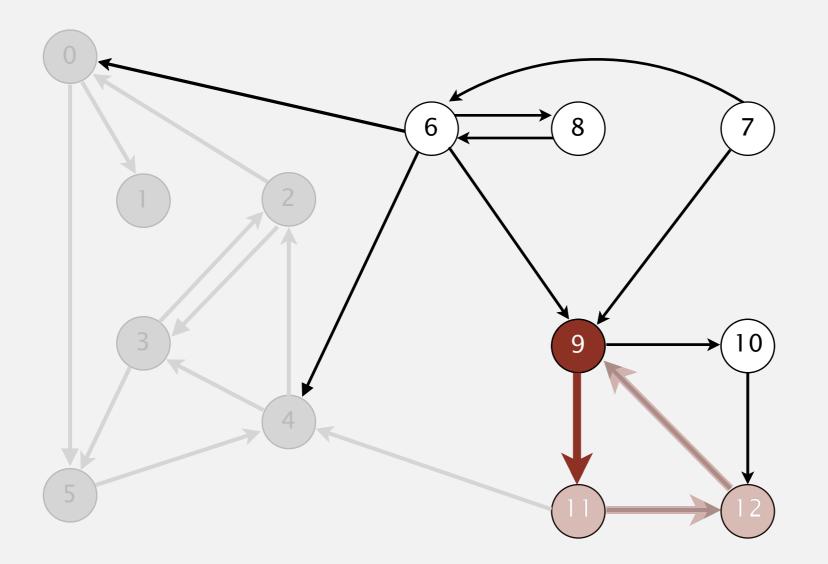
visit 11: check 4 and check 12

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	_
10	_
11	2
12	2

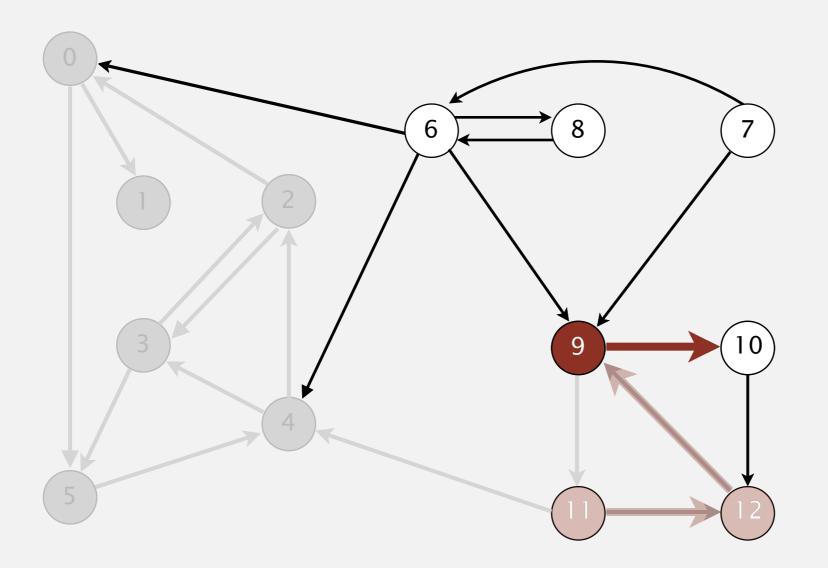
Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



V	ıd[]
0	1
1	0
2	1
2	1
4	1
5	1
6 7	_
7	_
8 9	_
9	(2)
10	_
11	2
12	2 2

visit 9: check 11 and check 10

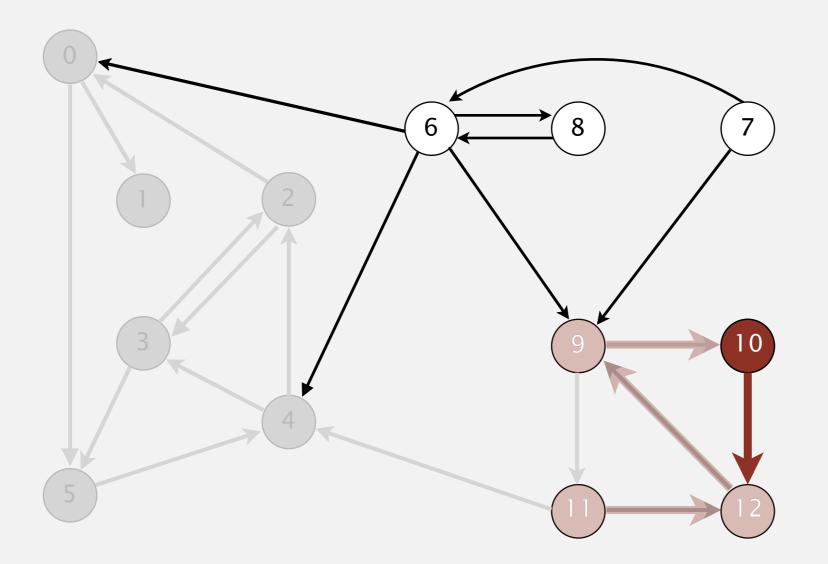
Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	_
11	2
12	2 2

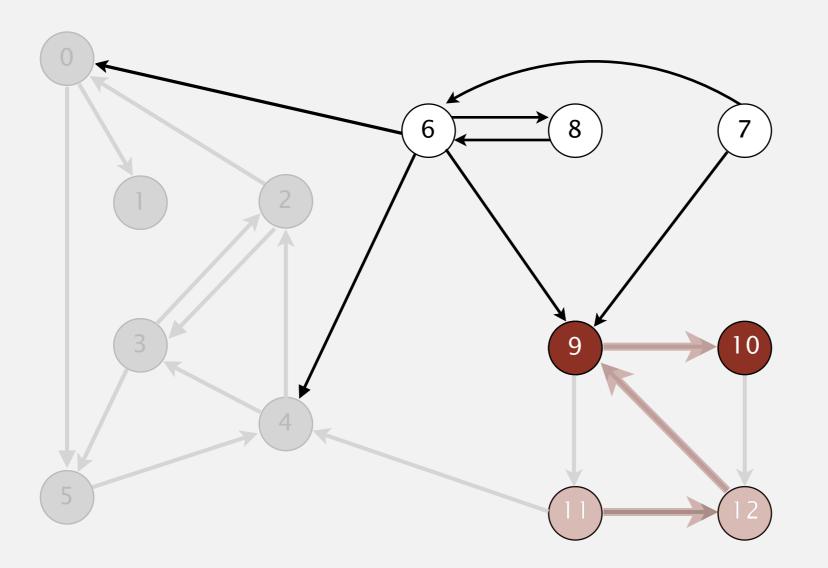
visit 9: check 11 and check 10

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



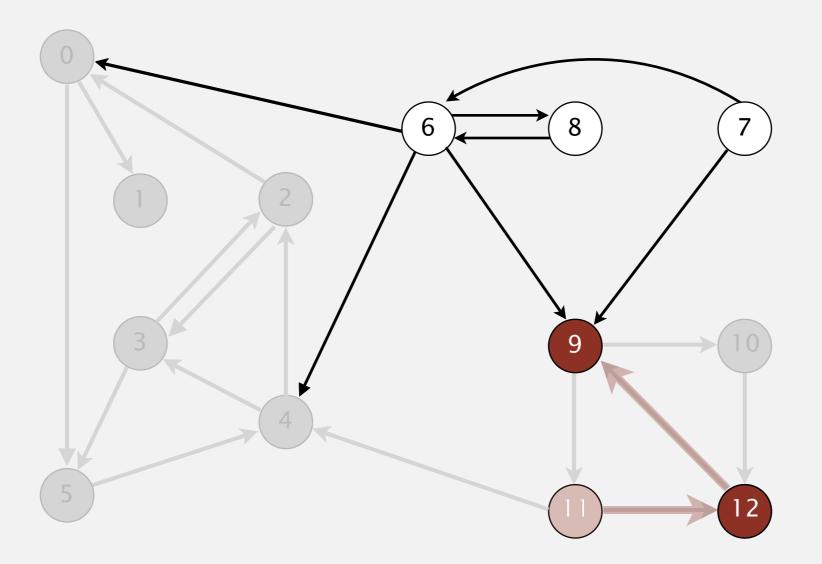
V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	(2)
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



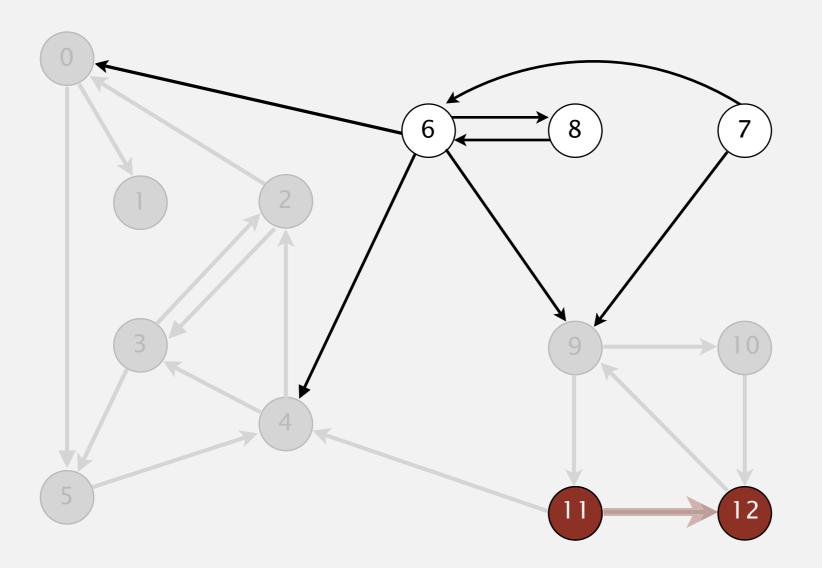
V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



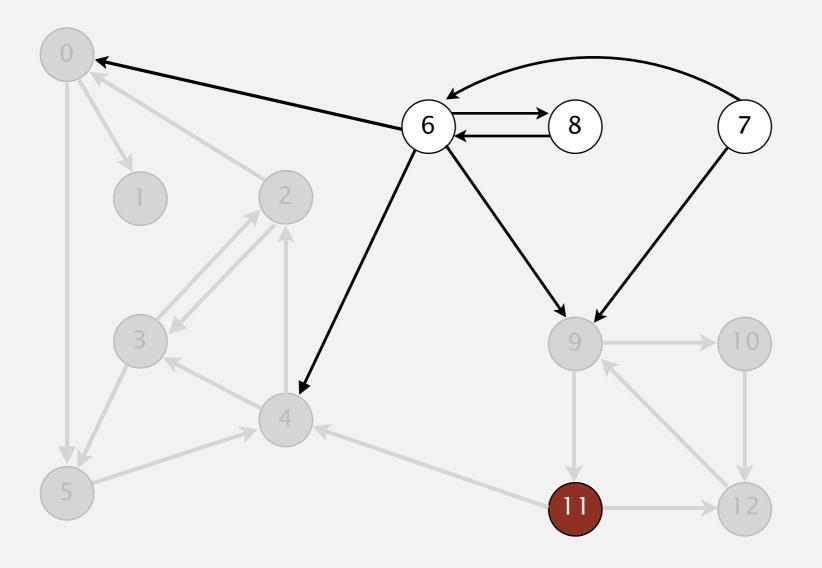
V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	2
11	2
12	2

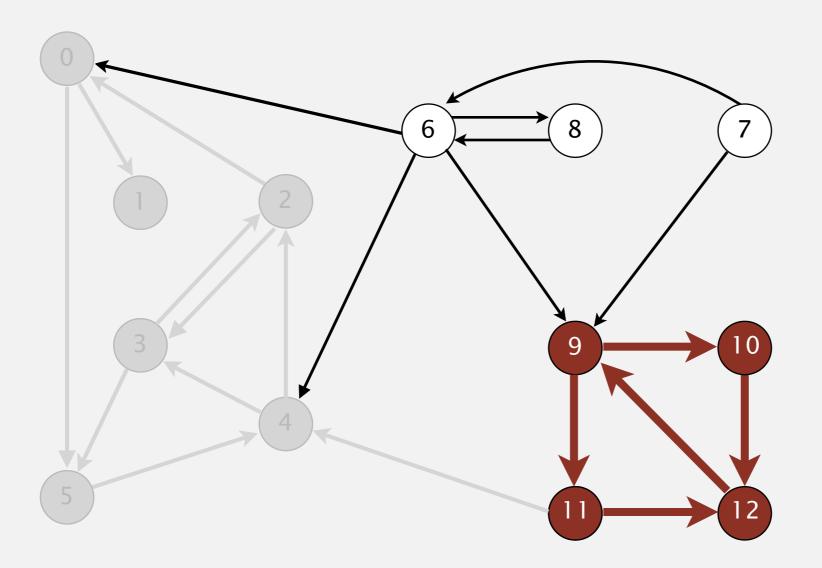
Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

1 0 2 4 5 3 (11) 9 12 10 6 7 8

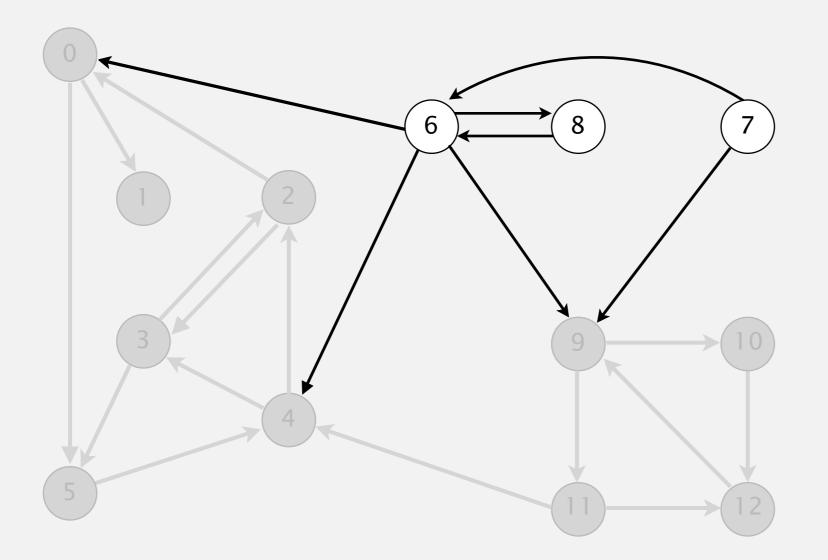


id[]
1
0
1
1
1
1
_
_
_
(2)
2
2
2

strong component: 9 10 11 12

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

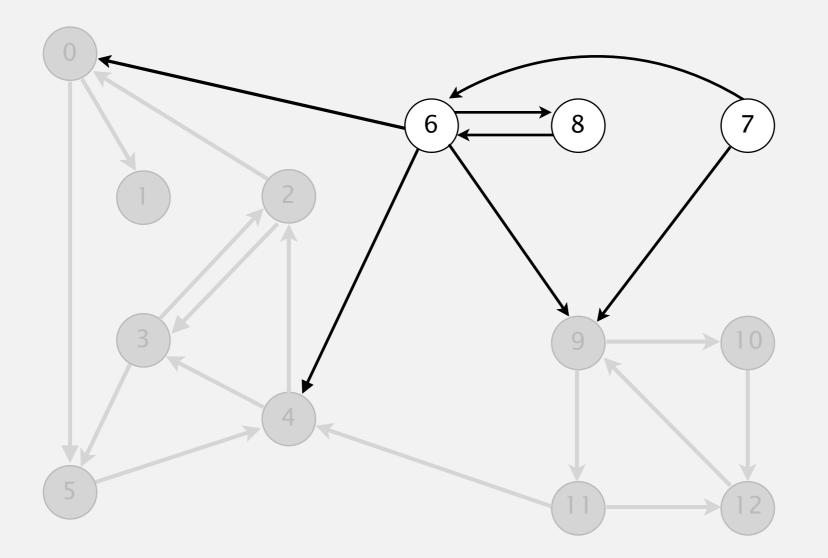




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

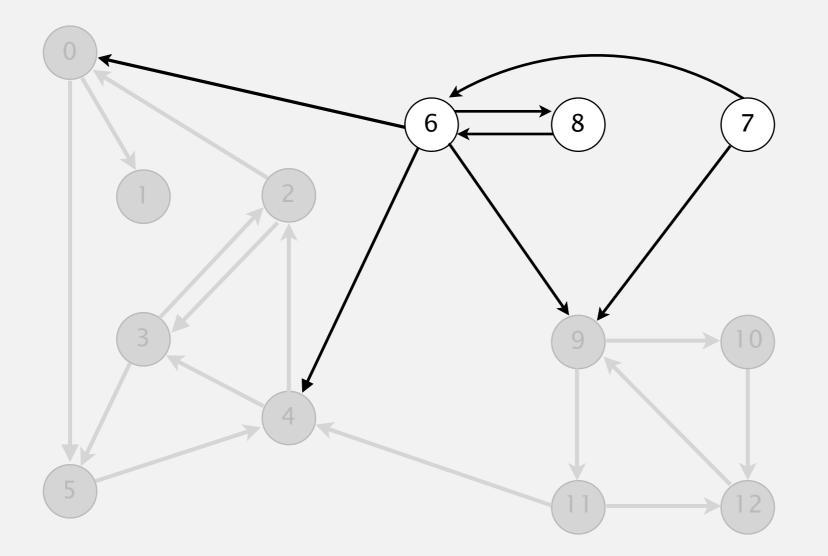




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

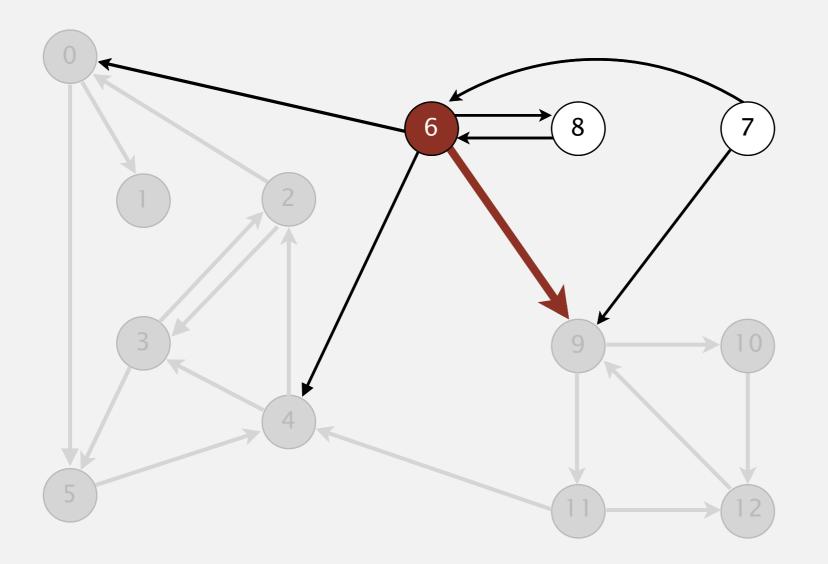




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	_
7	_
8	_
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



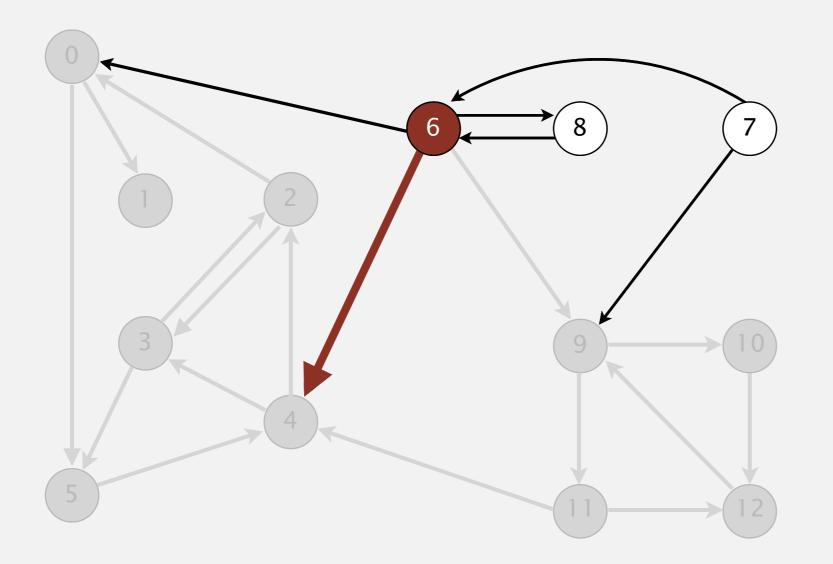


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	(3)
7	_
8	_
9	2
10	2
11	2
12	2

visit 6: check 9, check 4, check 8, and check 0

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



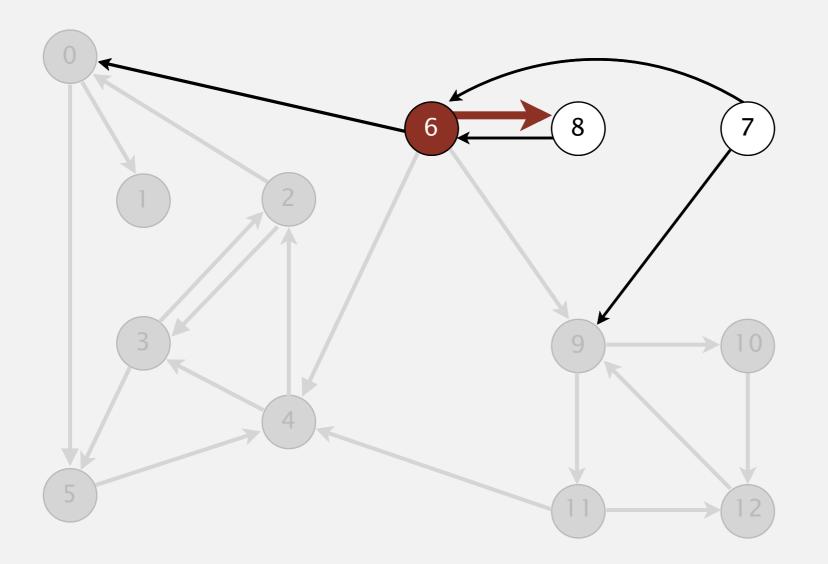


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	_
8	_
9	2
10	2
11	2
12	2

visit 6: check 9, check 4, check 8, and check 0

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



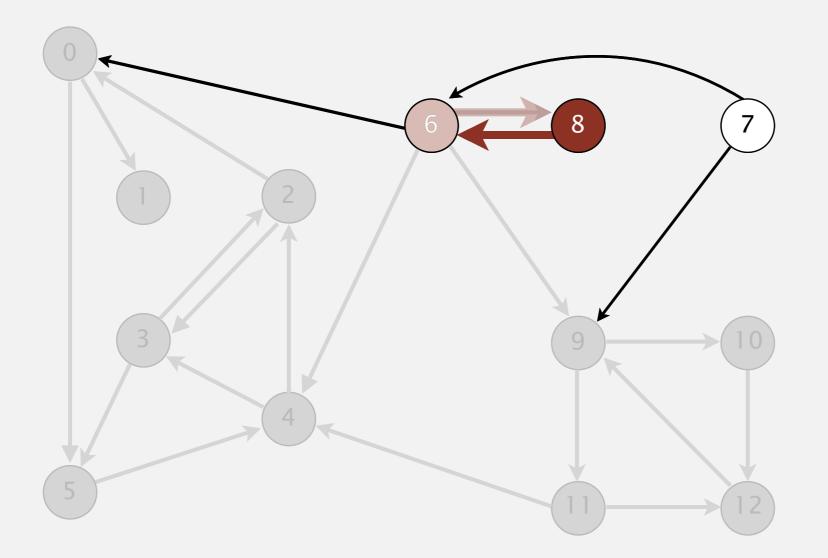


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	_
8	_
9	2
10	2
11	2
12	2

visit 6: check 9, check 4, check 8, and check 0

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



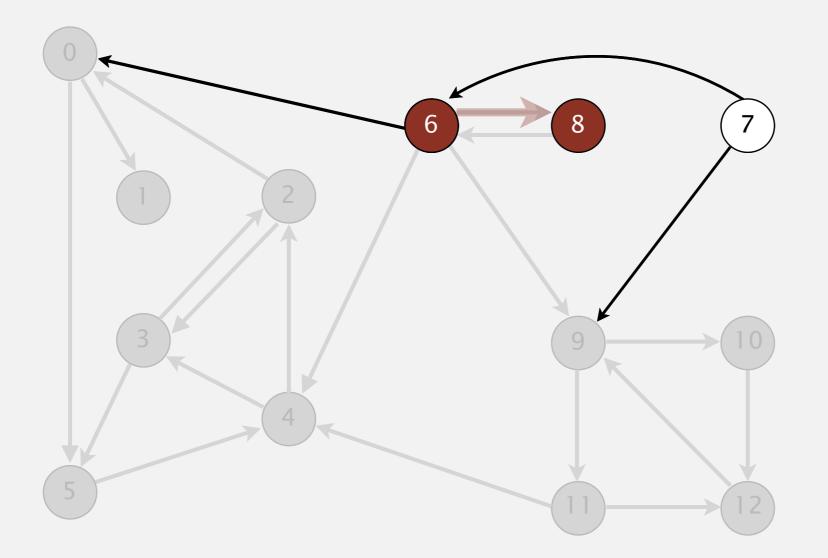


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	_
8	(3)
9	2
10	2
11	2 2
12	2

visit 8: check 6

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

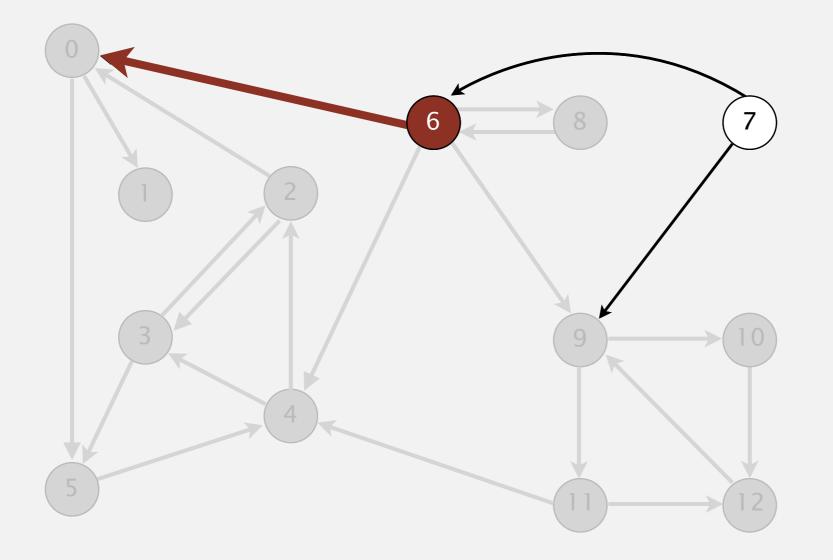




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	_
8	3
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



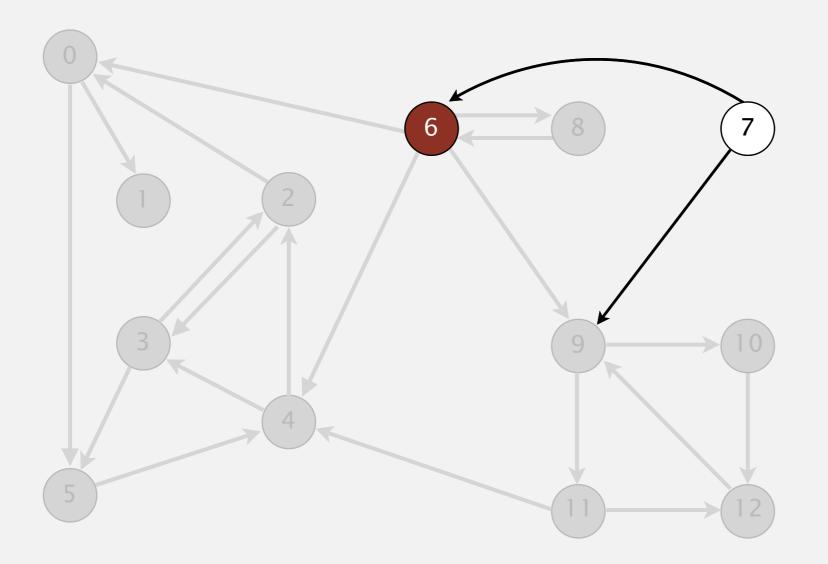


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	_
8	3
9	2
10	2
11	2
12	2

visit 6: check 9, check 4, check 8, and check 0

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



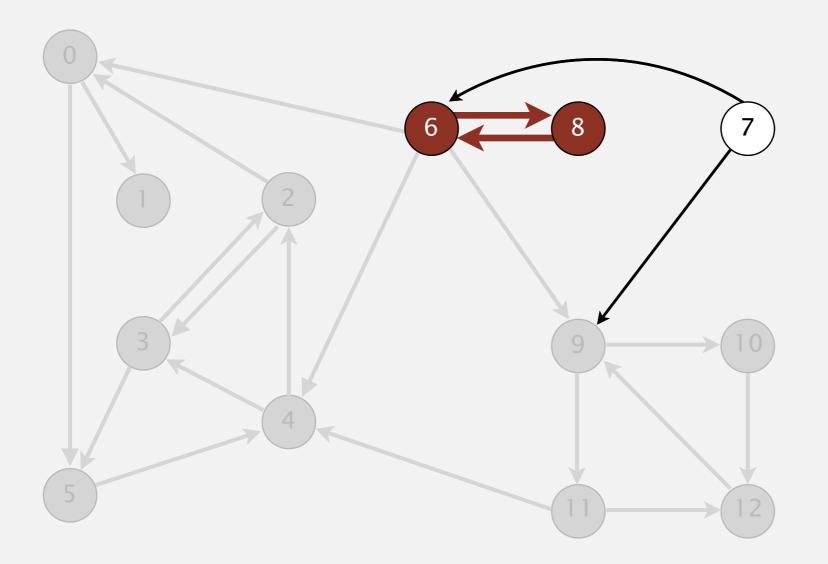


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	_
8	3
9	2
10	2
11	2
12	2

6 done

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

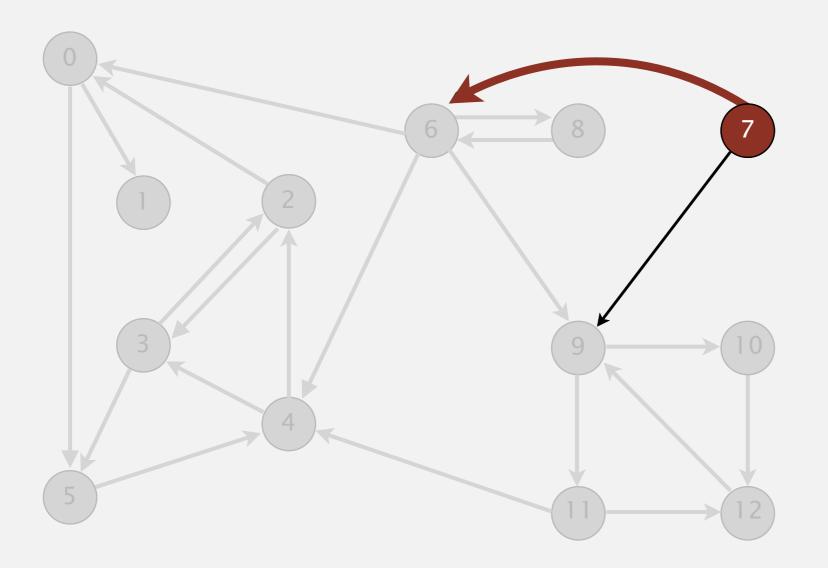




V	id[]
0	1
1	0
2	1
2	1
4	1
5	1
4 5 6 7	(3)
7	_
8 9	(3)
9	2
10	2
11	2 2 2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



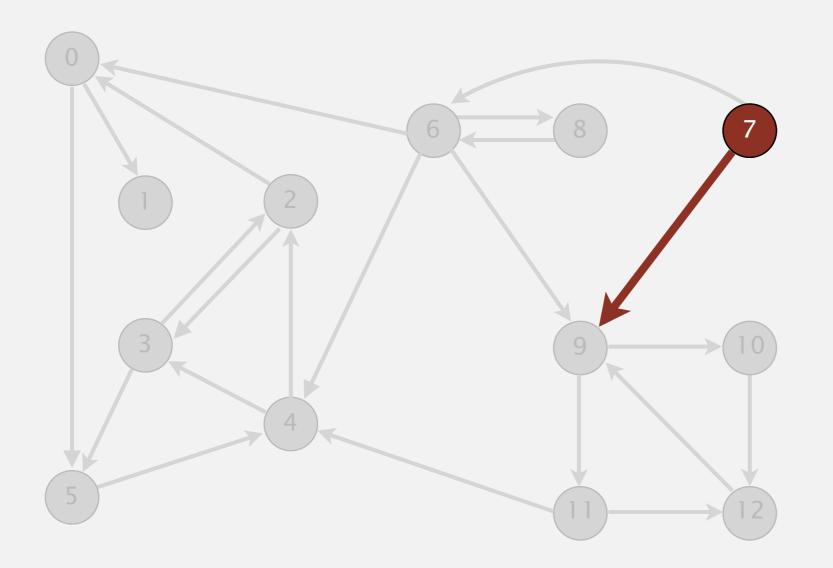


V	ıd[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	4
8 9	3
9	2
10	2
11	2 2
12	2

visit 7: check 6 and check 9

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .



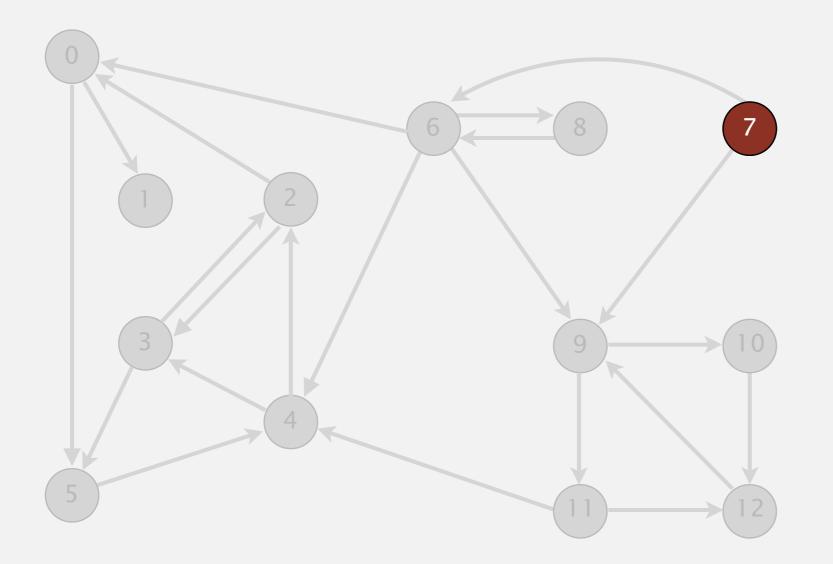


V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	4
8	3
9	2
10	2
11	2
12	2

visit 7: check 6 and check 9

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

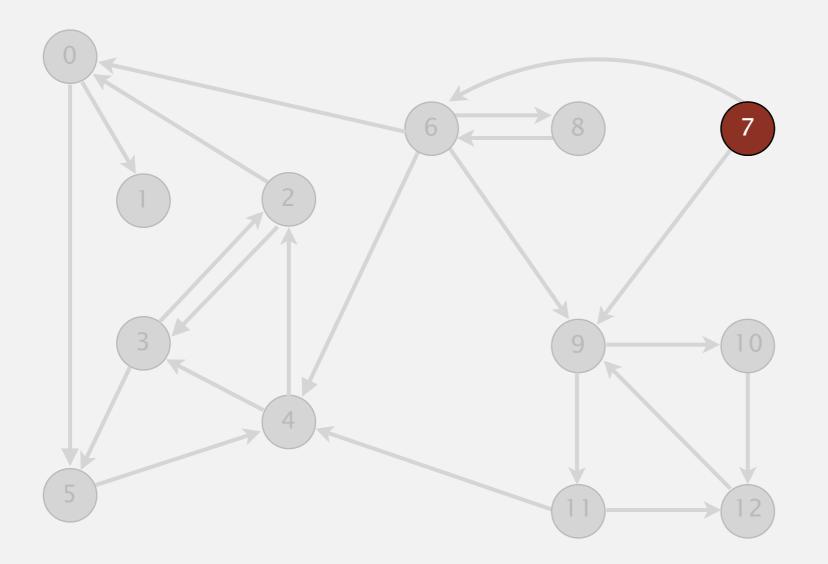




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	4
8	3
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

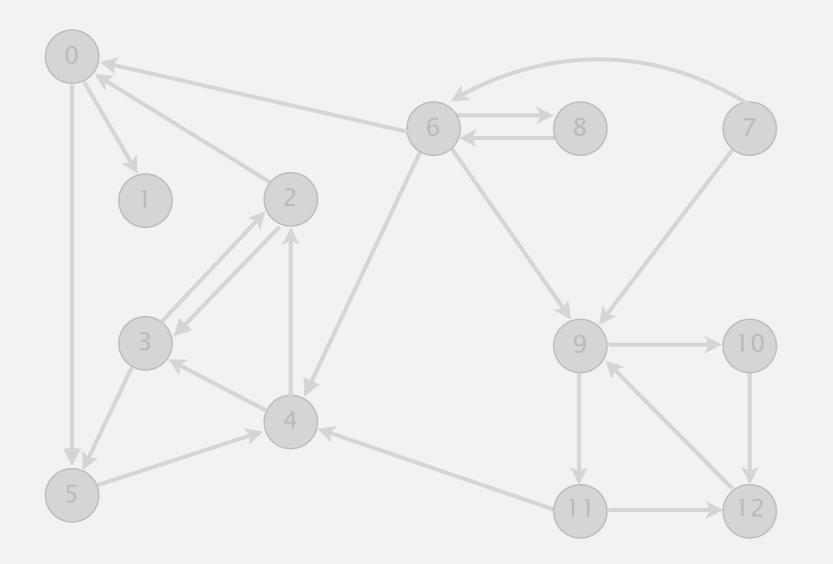




V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	4
8	3
9	2
10	2
11	2 2 2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

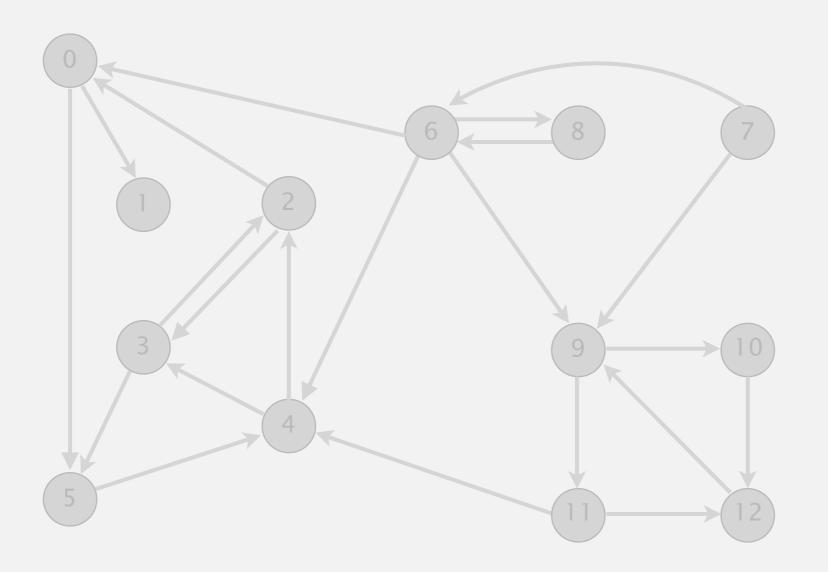




V	ıd[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	4
8	3
9	2
10	2
11	2
12	2

Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

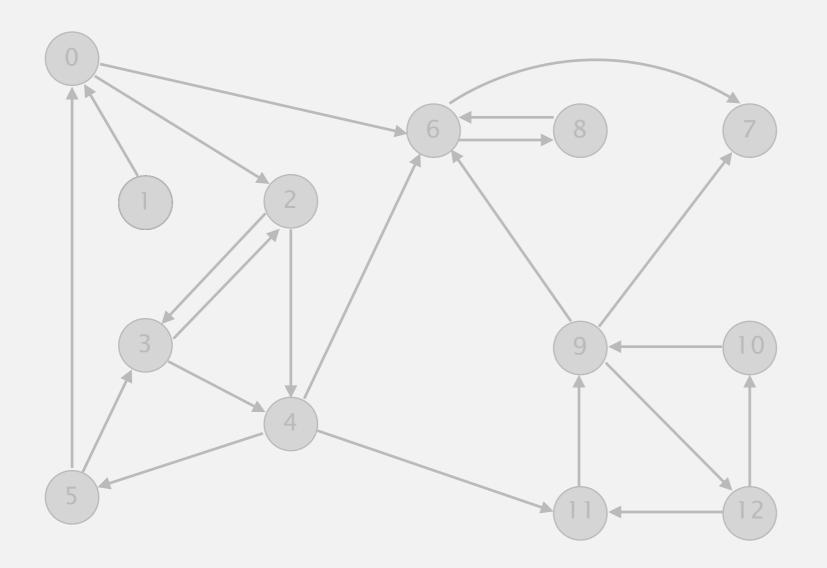
1 0 2 4 5 3 11 9 12 10 6 7 8



V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	4
8	3
9	2
10	2
11	2
12	2

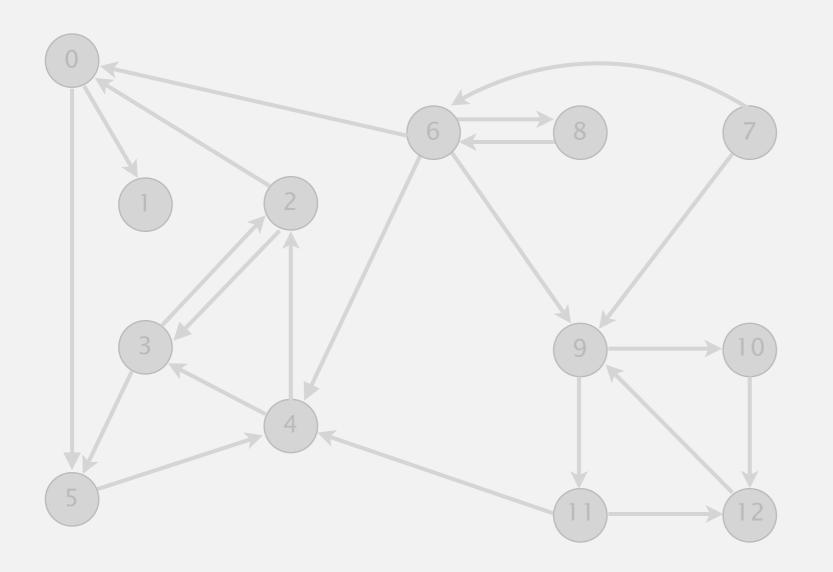
done

Phase 1. Compute reverse postorder in  $G^R$ .



Phase 2. Run DFS in G, visiting unmarked vertices in reverse postorder of  $G^R$ .

1 0 2 4 5 3 11 9 12 10 6 7 8



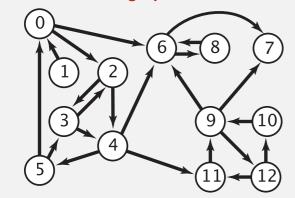
V	id[]
0	1
1	0
2	1
3	1
4	1
5	1
6	3
7	4
8	3
9	2
10	2
11	2
12	2

done

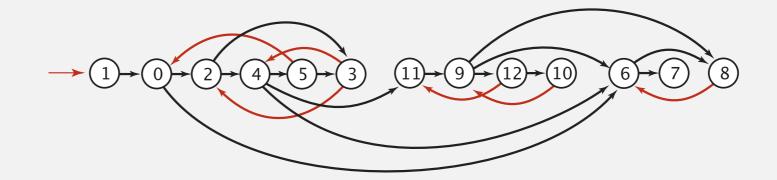
#### Simple (but mysterious) algorithm for computing strong components.

- Phase 1: run DFS on  $G^R$  to compute reverse postorder.
- Phase 2: run DFS on *G*, considering vertices in order given by first DFS.

#### DFS in reverse digraph GR



*check unmarked vertices in the order* 0 1 2 3 4 5 6 7 8 9 10 11 12

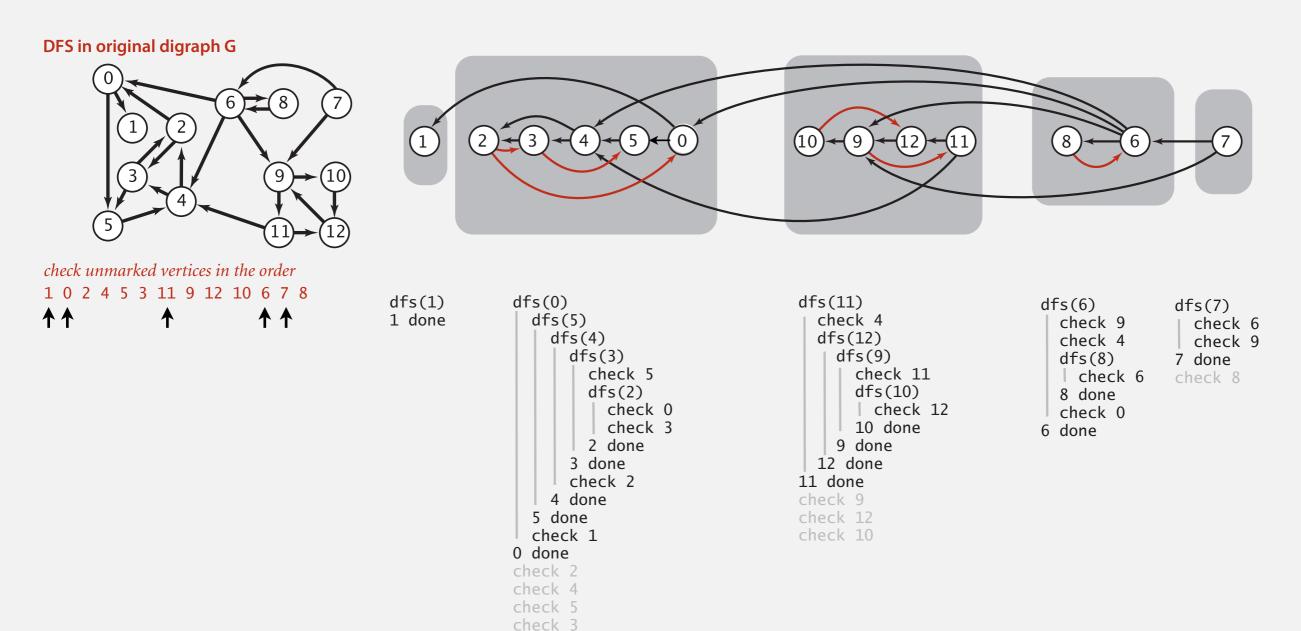


reverse postorder for use in second dfs()
1 0 2 4 5 3 11 9 12 10 6 7 8

```
dfs(0)
  dfs(6)
    dfs(8)
      check 6
    8 done
    dfs(7)
    7 done
  6 done
  dfs(2)
    dfs(4)
      dfs(11)
        dfs(9)
          dfs(12)
            check 11
            dfs(10)
             check 9
            10 done
          12 done
          check 7
          check 6
```

#### Simple (but mysterious) algorithm for computing strong components.

- Phase 1: run DFS on  $G^R$  to compute reverse postorder.
- Phase 2: run DFS on G, considering vertices in order given by first DFS.

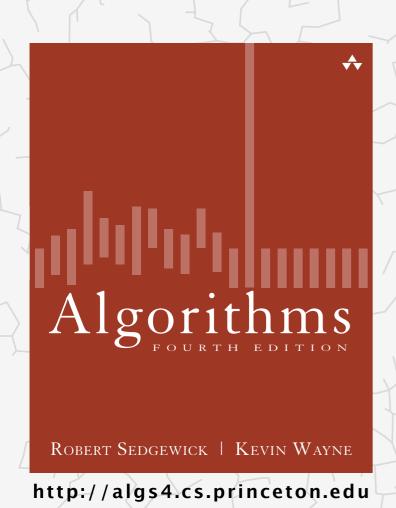


Proposition. Kosaraju-Sharir algorithm computes the strong components of a digraph in time proportional to E + V.

#### Pf.

- Running time: bottleneck is running DFS twice (and computing  $G^R$ ).
- Correctness: tricky, see textbook (2<sup>nd</sup> printing).
- Implementation: easy!

# Algorithms



## 4.2 DIRECTED GRAPHS

- introduction
- digraph API
- digraph search
- topological sort
- strong components