



자료구조

Chap 09. Graph

2018년 1학기

컴퓨터과학과
민 경 하



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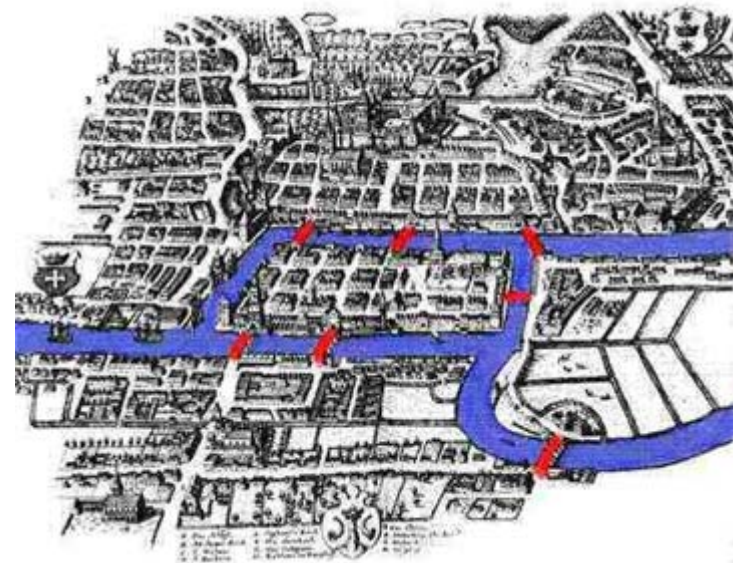
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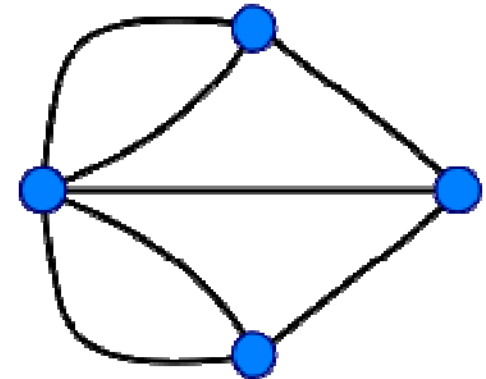
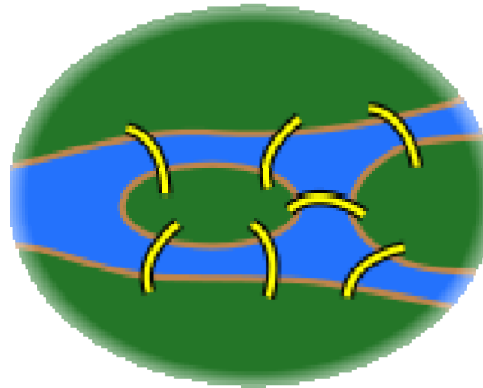
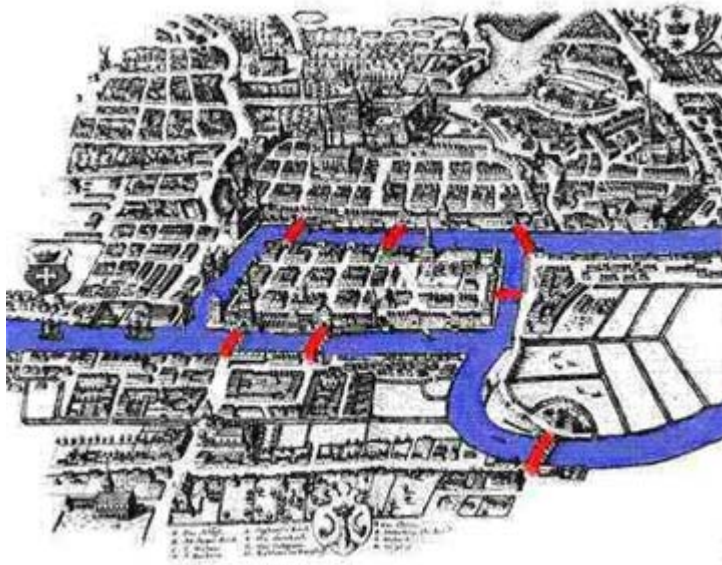
9.1 Introduction

- Königsberg bridge problem
 - To determine whether, starting at one land area, it is possible to walk across all the bridges exactly once in returning to starting land area



9.1 Introduction

- Königsberg bridge problem
 - Euler introduced “Graph”
 - Abstraction
 - Land & island → node (vertex)
 - Bridge → edge (link)



9.2 Basic concepts

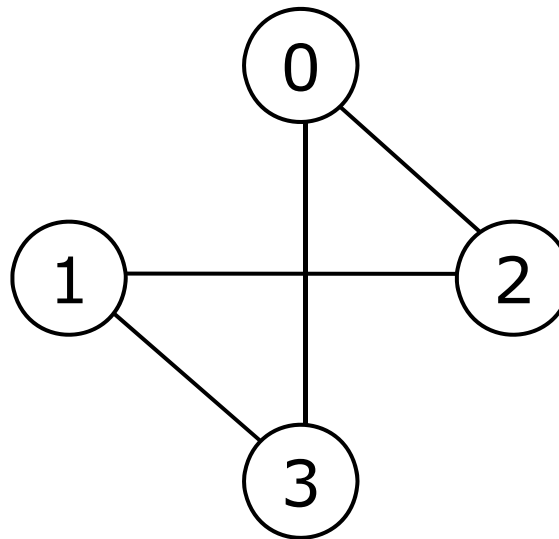
(1) Graph

- A mathematical (abstracted) model that represents the one-to-one (binary) relationship between objects visually
- $G = (V, E)$
 - V
 - Vertex represents objects
 - E
 - Edge represents relationship
 - Edge is a pair of vertices

9.2 Basic concepts

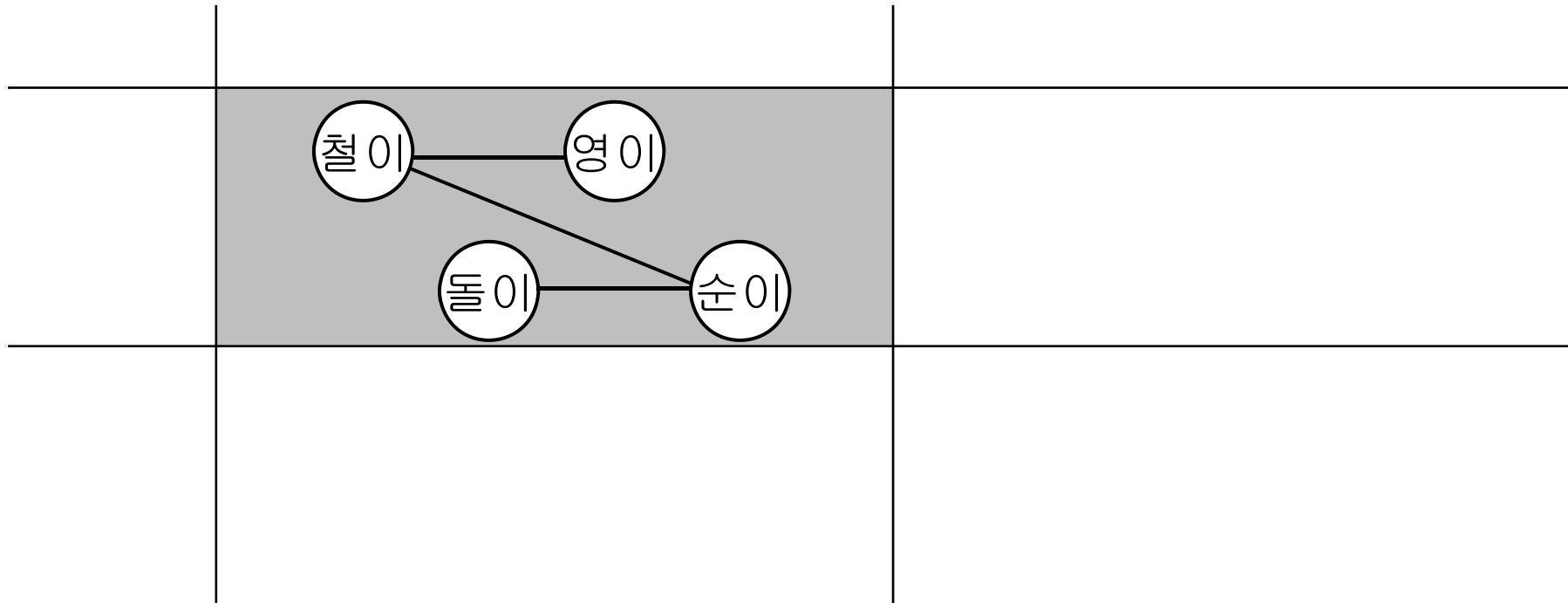
(1) Graph

- Mathematical representation
 - $V = \{0, 1, 2, 3\}$
 - $E = \{(0, 2), (0, 3), (1, 2), (1, 3)\}$
- Geometrical representation



9.2 Basic concepts

(2) Types of graph



개체: 철이, 영이, 돌이, 순이

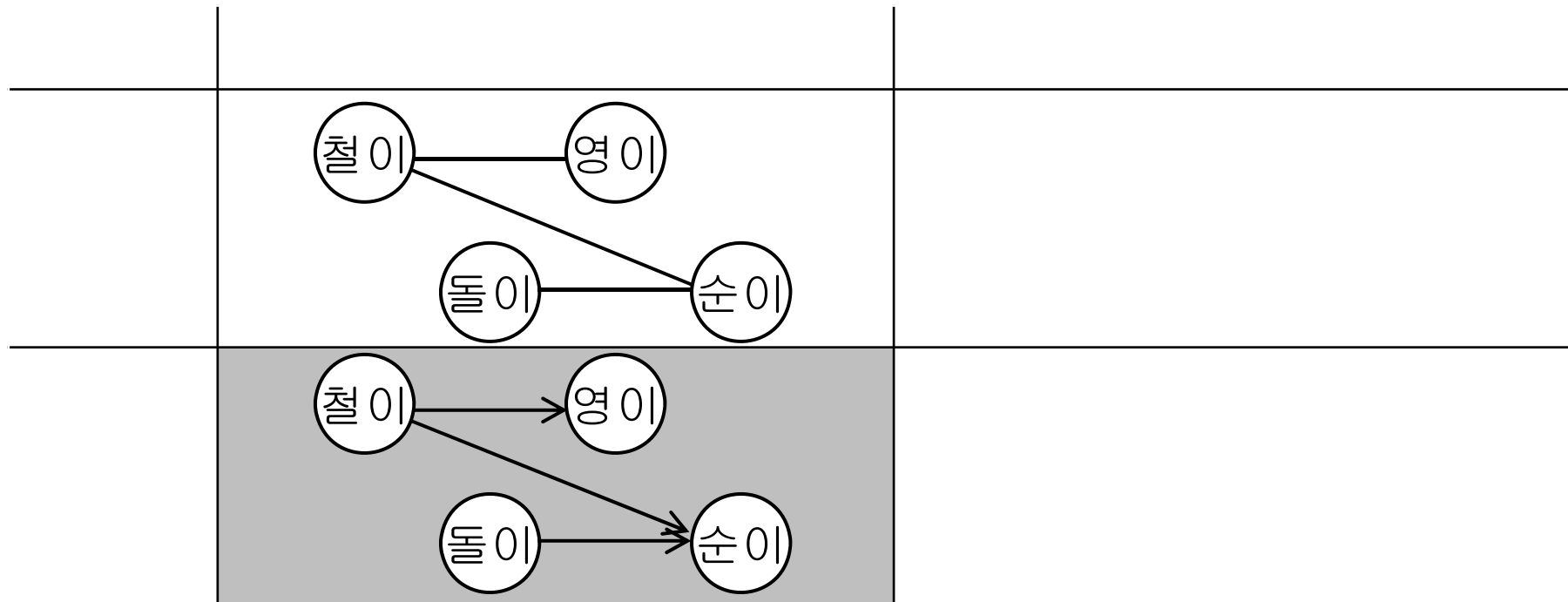
관계: 철이, 영이는 폐친임.

철이, 순이는 폐친임.

돌이, 순이는 폐친임.

9.2 Basic concepts

(2) Types of graph



개체: 철이, 영이, 돌이, 순이

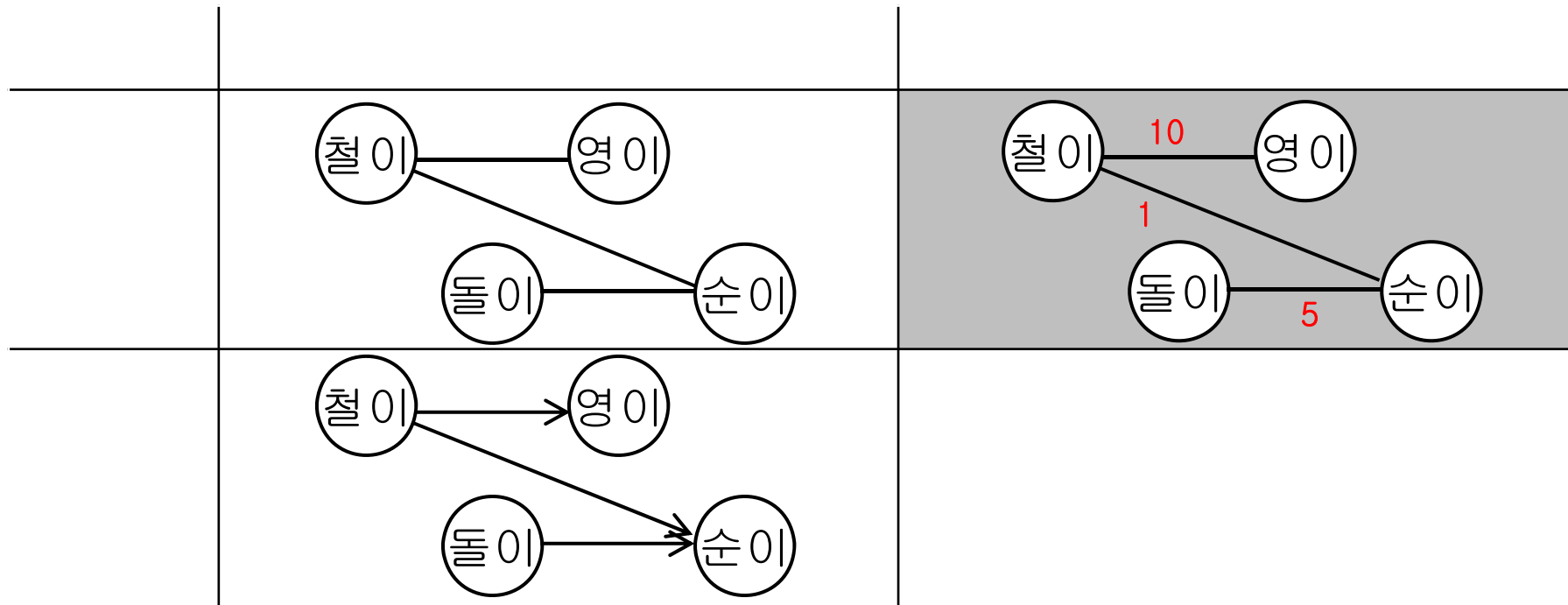
관계: 철이는 영이를 follow함.

철이는 순이를 follow함.

돌이는 순이를 follow함.

9.2 Basic concepts

(2) Types of graph



개체: 철이, 영이, 돌이, 순이

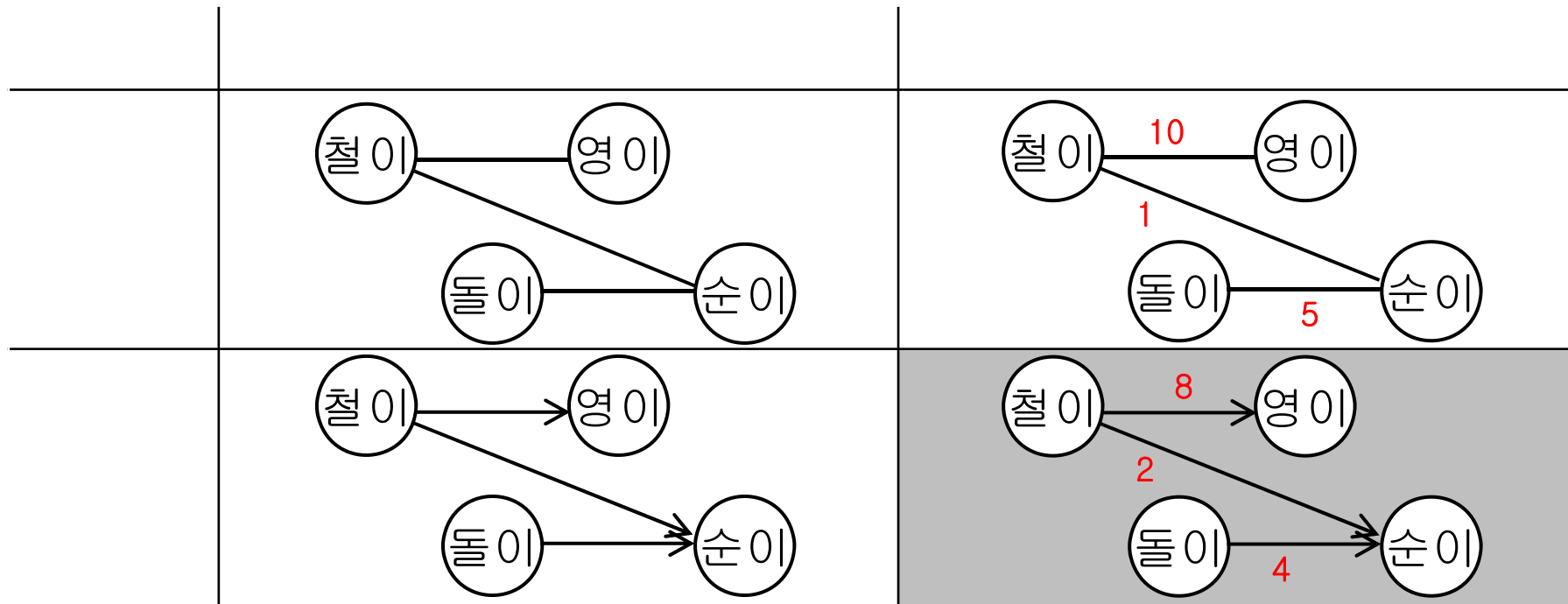
관계: 철이, 영이는 심각한 폐친임.

철이, 순이는 쓸런한 폐친임.

돌이, 순이는 평범한 폐친임.

9.2 Basic concepts

(2) Types of graph

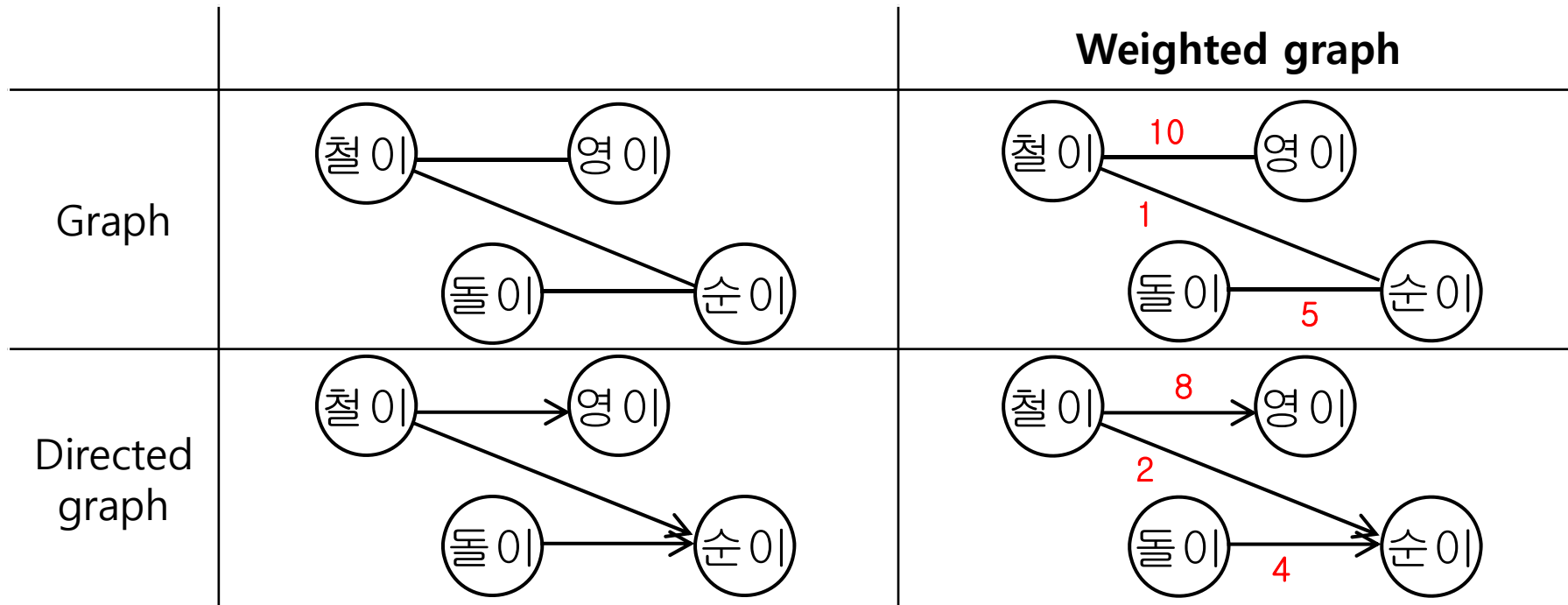


개체: 철이, 영이, 돌이, 순이

관계: 철이는 영이를 많이 follow함.
철이는 순이를 조금 follow함.
돌이는 순이를 보통 follow함

9.2 Basic concepts

(2) Types of graph

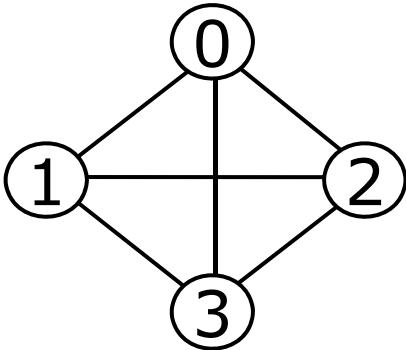
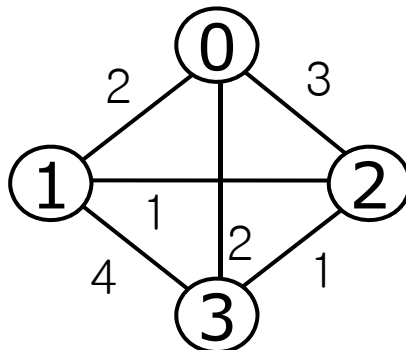
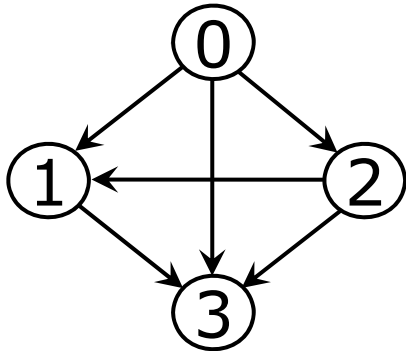
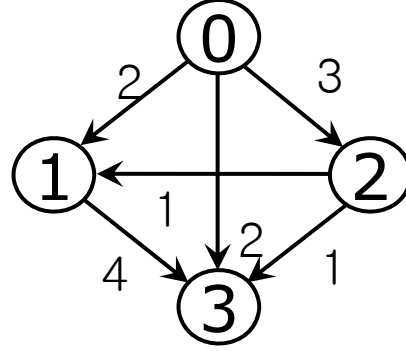


(Undirected) Graph: $(u, v) = (v, u)$

Directed graph: $(u, v) \neq (v, u)$

9.2 Basic concepts

(2) Types of graph

		Weighted or not	
		Non-weighted	Weighted
Directed or not	Undirected		
	Directed		

9.2 Basic concepts

(2) Types of graph

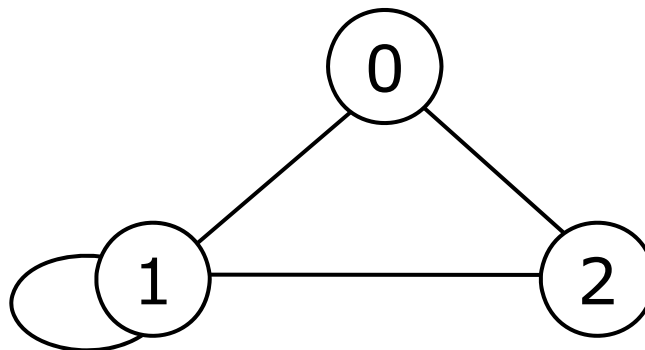
– Extraordinary case: Graph with self edge

- self edge: (u, u)

- $G = (V, E)$

– $V = \{0, 1, 2\}$

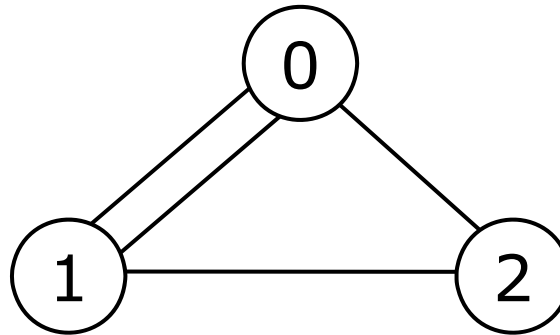
– $E = \{ (0, 1), (0, 2), (1, 2), (1, 1) \}$



9.2 Basic concepts

(2) Types of graph

- Extraordinary case: Multigraph
 - A graph with a set of multiple edges

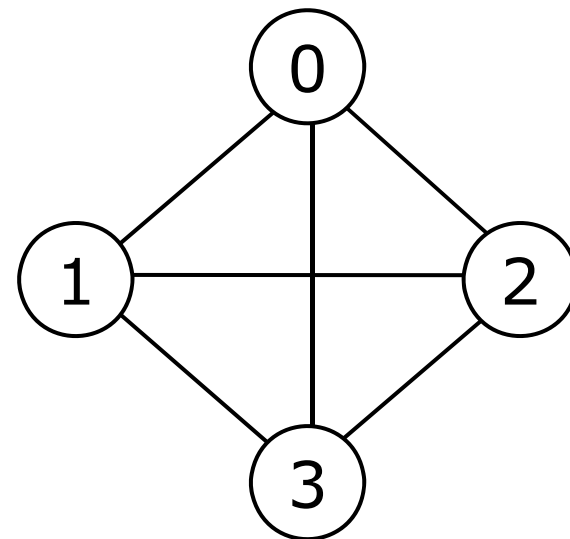


9.2 Basic concepts

(3) Complexity of graph

– Complete graph

- Maximum number of edges of a graph with n vertices $\rightarrow n(n-1)/2$
- Ex)
 - $V = \{0, 1, 2, 3\}$
 - $n(E) = 4*3/2 = 6$
- Complete graph
 - A graph whose no. of edges is $n(n-1)/2$
- Dense graph

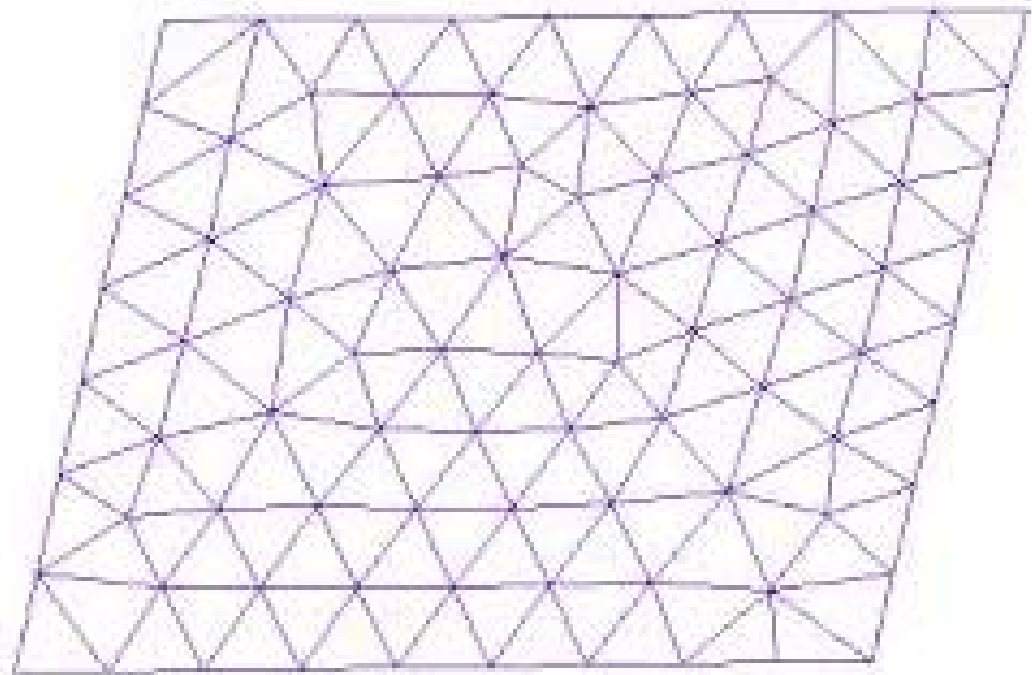
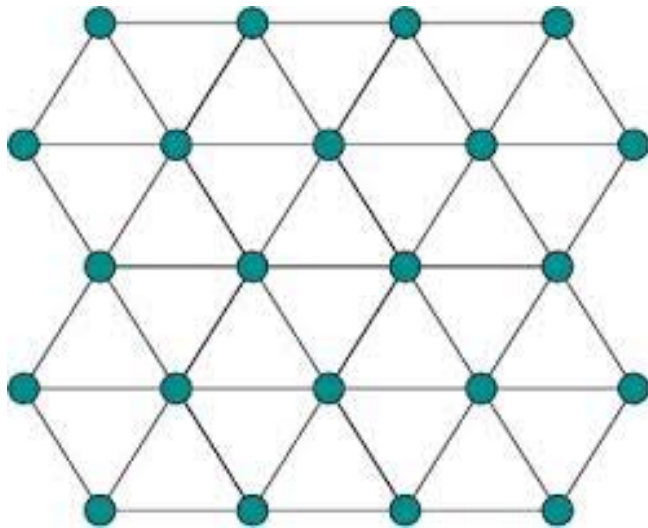


9.2 Basic concepts

(3) Complexity of graph

– Sparse graph

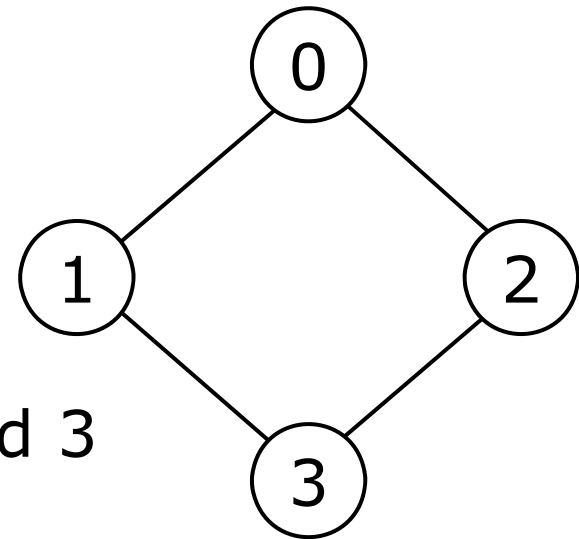
- A graph whose vertices are connected to a constant number of edges.



9.2 Basic concepts

(4) Adjacency & Incidency

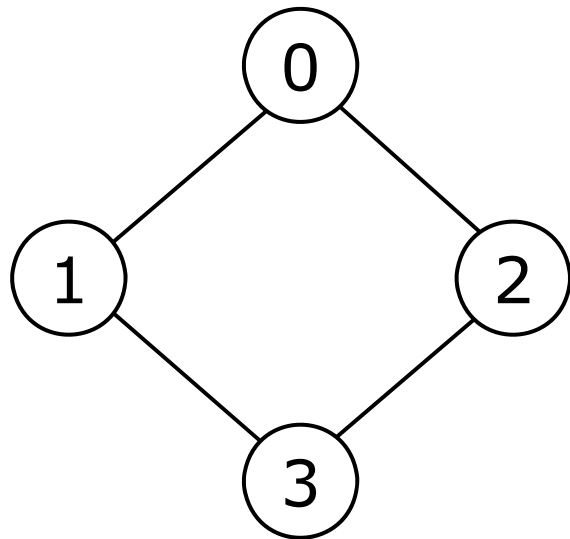
- If $(u, v) \in E$, then
 - u and v are adjacent
 - (u, v) is incident to u and v
- Ex)
 - 0 and 1 are adjacent
 - 0 and 3 are not adjacent
 - $(0, 1)$ is incident to 0 and 1
 - $(0, 1)$ is not incident to 2 and 3



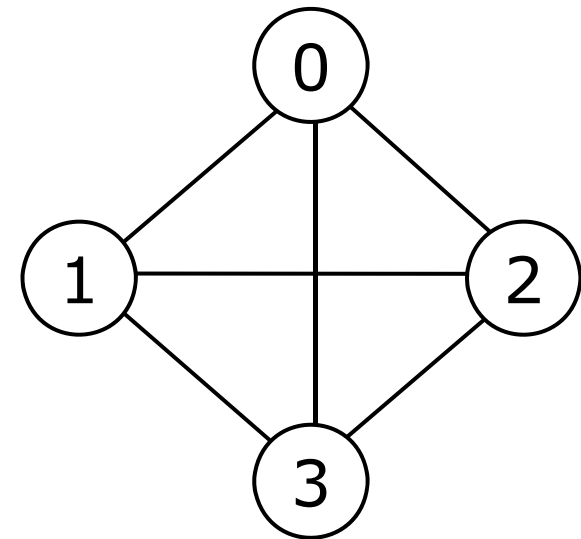
9.2 Basic concepts

(5) Subgraph

- Graph $G' = (V', E')$ is a subgraph of $G = (V, E)$, if $V' \subseteq V$ and $E' \subseteq E$



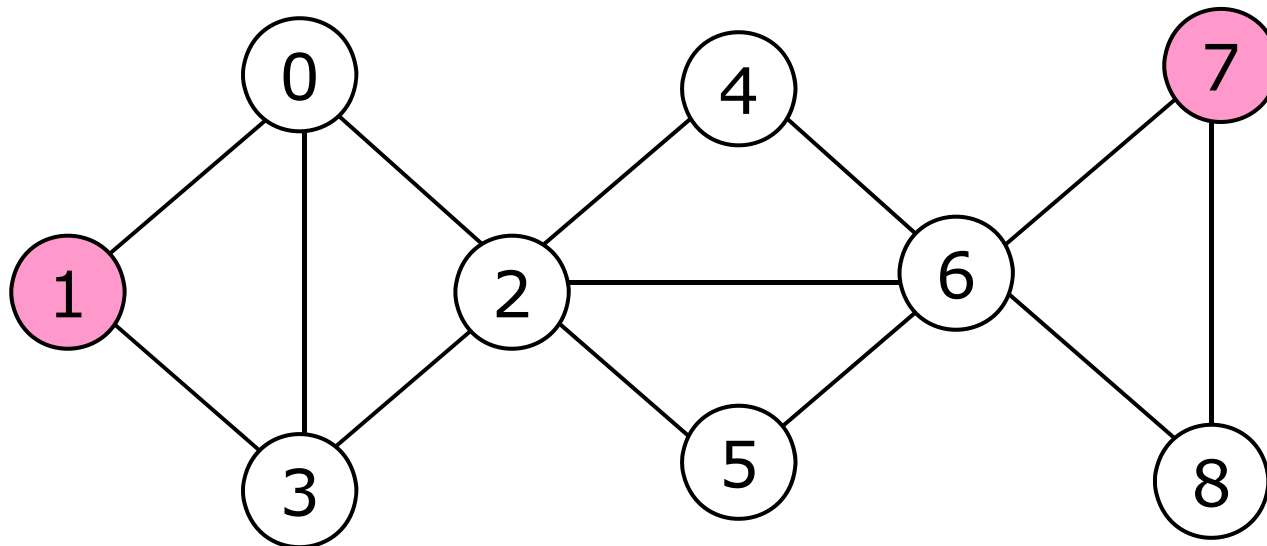
is a subgraph of



9.2 Basic concepts

(6) Path

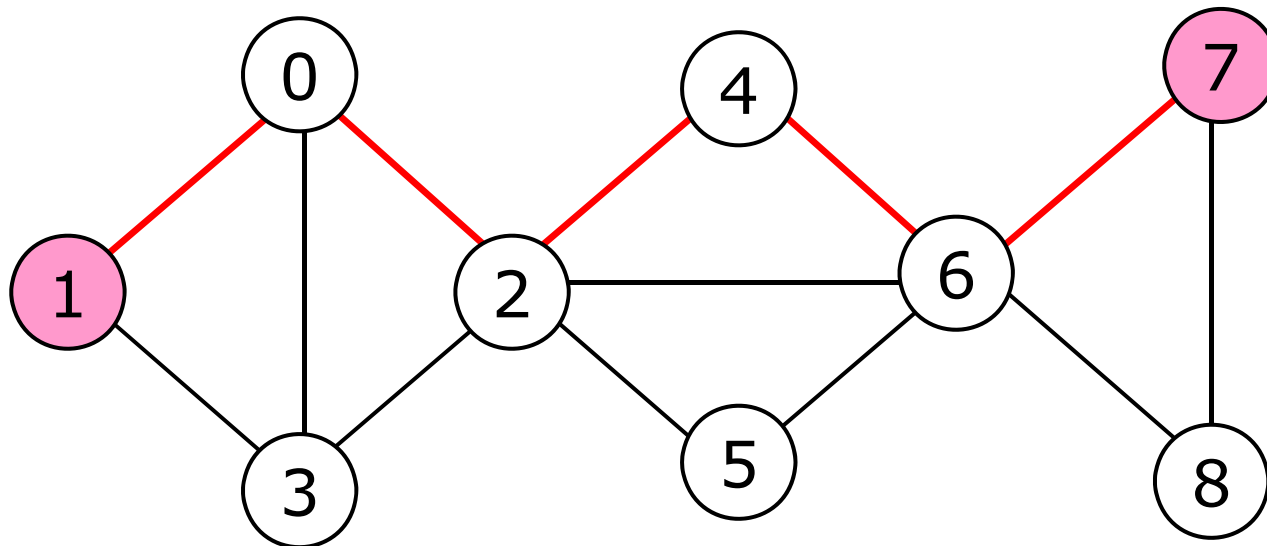
- A path from a vertex u to a vertex v is a sequence of vertices $u, i_1, i_2, \dots, i_k, v$ such that $(u, i_1), (i_1, i_2), \dots, (i_k, v) \in E$
- Path from 1 to 7: 1, 0, 2, 4, 6, 7



9.2 Basic concepts

(6) Path

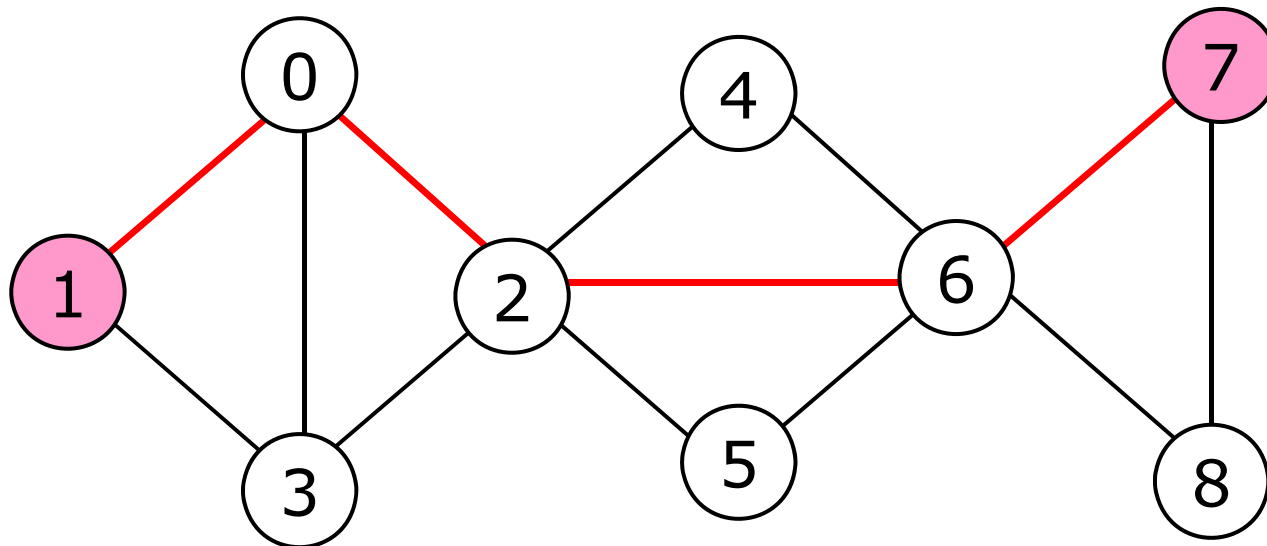
- A path from a vertex u to a vertex v is a sequence of vertices $u, i_1, i_2, \dots, i_k, v$ such that $(u, i_1), (i_1, i_2), \dots, (i_k, v) \in E$
- Path from 1 to 7: 1, 0, 2, 4, 6, 7



9.2 Basic concepts

(6) Path

- A path from a vertex u to a vertex v is a sequence of vertices $u, i_1, i_2, \dots, i_k, v$ such that $(u, i_1), (i_1, i_2), \dots, (i_k, v) \in E$
- Another Path: 1, 0, 2, 6, 7



9.2 Basic concepts

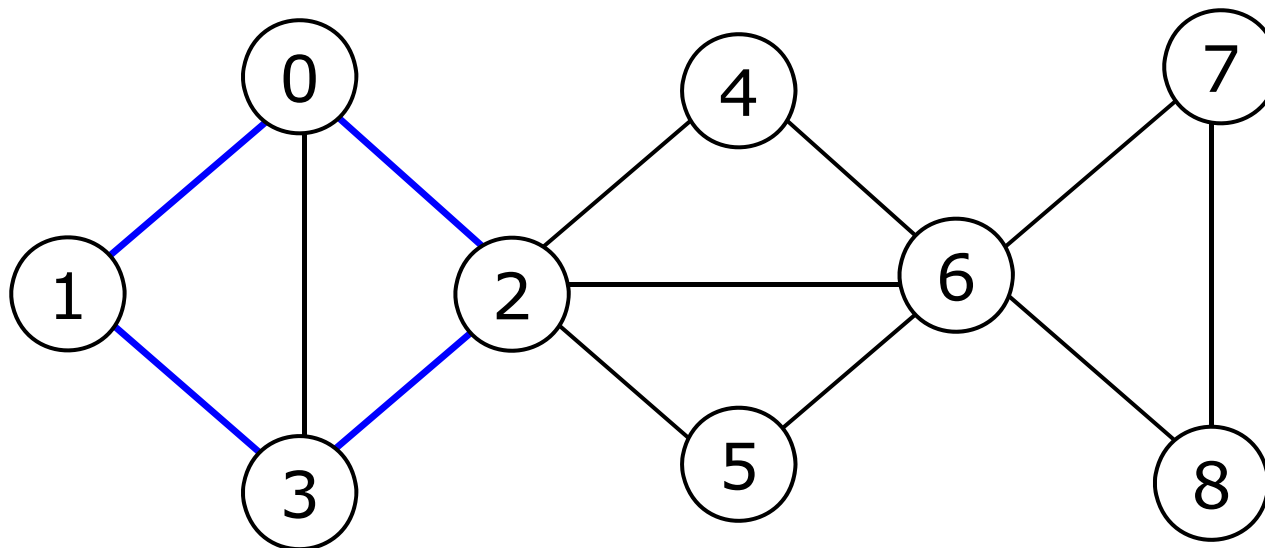
(6) Path

- A path from a vertex u to a vertex v is a sequence of vertices $u, i_1, i_2, \dots, i_k, v$ such that $(u, i_1), (i_1, i_2), \dots, (i_k, v) \in E$
- Multiple paths can exist
- The length of a path
 - The number of edges on it
 - The number of vertices on it
- Simple path
 - A path in which all vertices except possibly the first and last are distinct

9.2 Basic concepts

(7) Cycle

- A simple path in which the first and last vertices are the same
- Ex)
 - Path "0, 1, 3, 2, 0" is a cycle

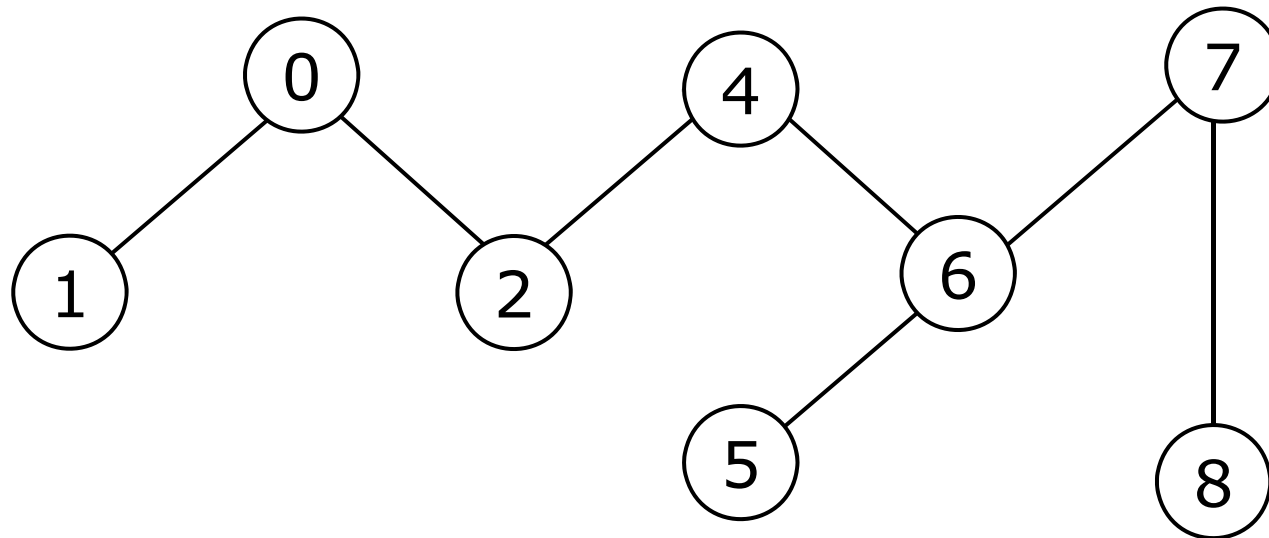


9.2 Basic concepts

(7) Cycle

– Acyclic graph

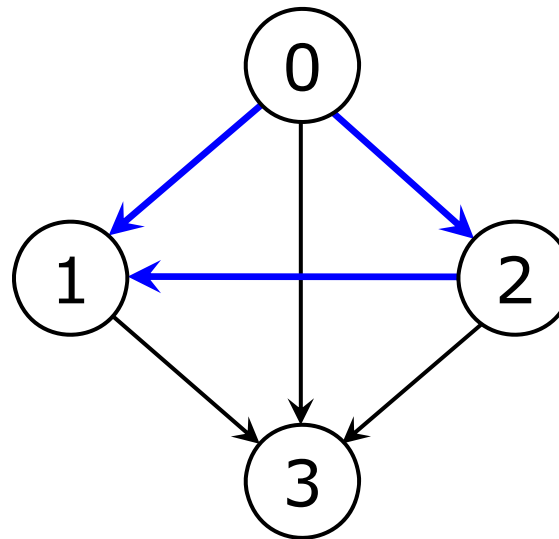
- A graph that does not contain a cycle



9.2 Basic concepts

(7) Cycle

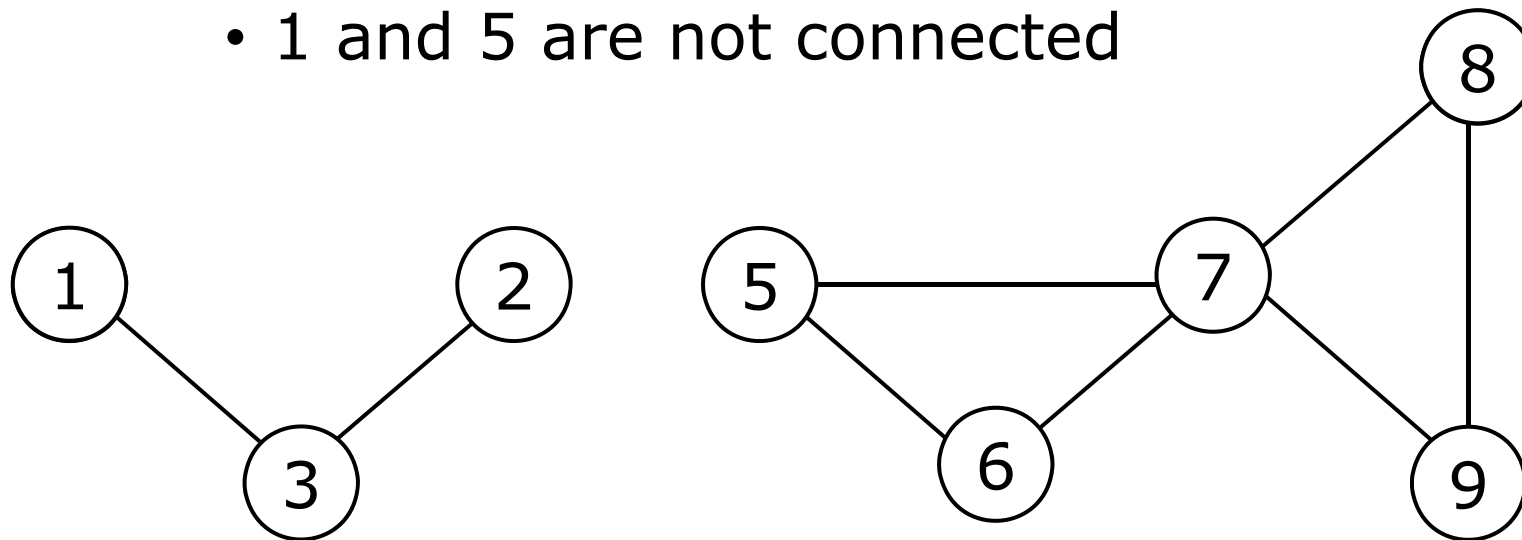
- A simple path in which the first and last vertices are the same
- Ex)
 - Path "0, 2, 1, 0" is not a cycle



9.2 Basic concepts

(8) Connected

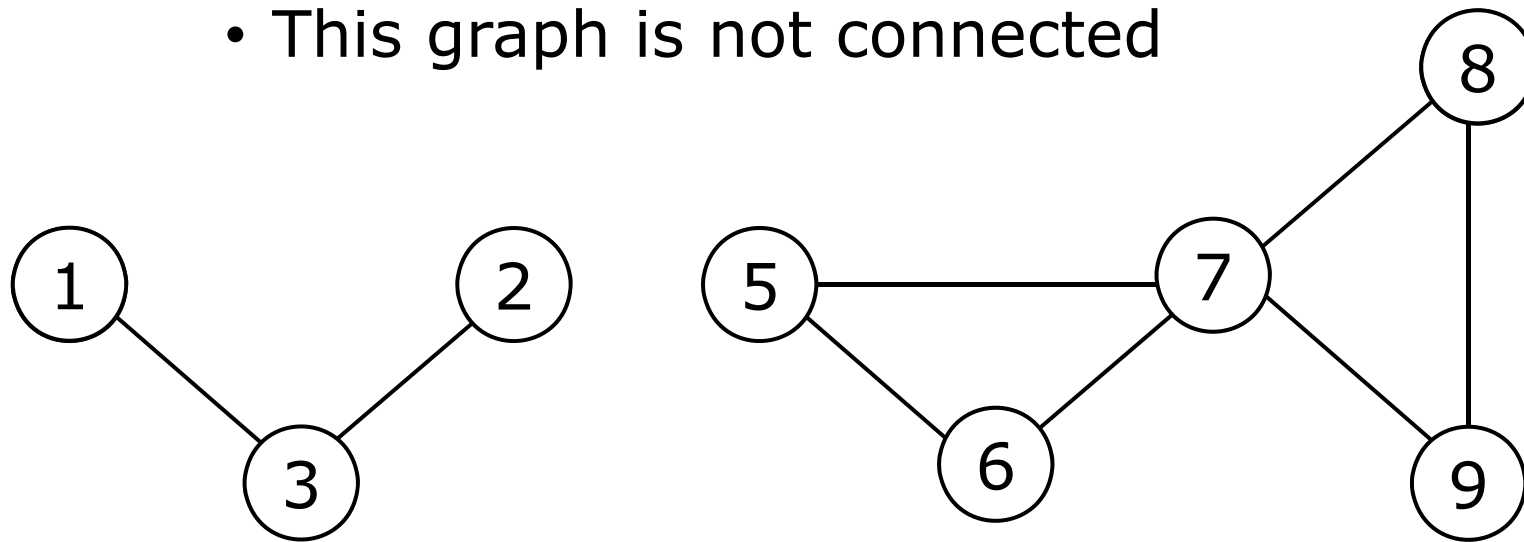
- Two vertices u and v are connected if there is a path from u to v
- Ex)
 - 5 and 8 are connected
 - 1 and 5 are not connected



9.2 Basic concepts

(8) Connected

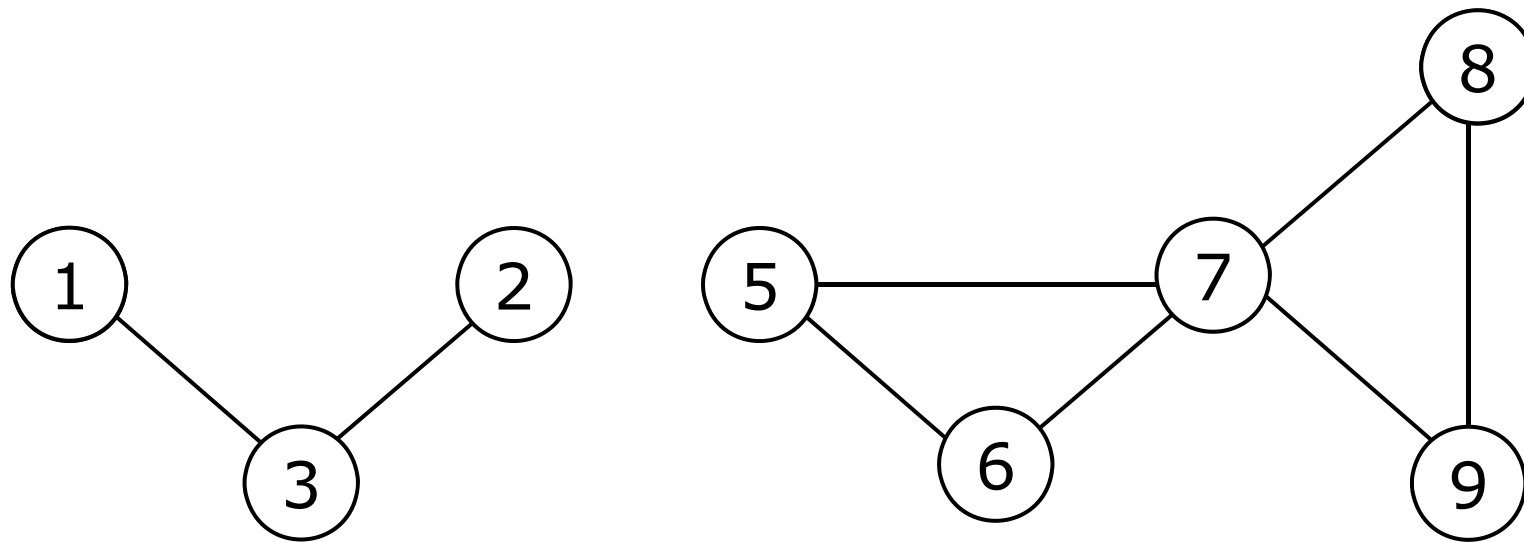
- A graph is **connected** if for every pair of distinct vertices u and v , there is a path from u to v
- Ex)
 - This graph is not connected



9.2 Basic concepts

(8) Connected

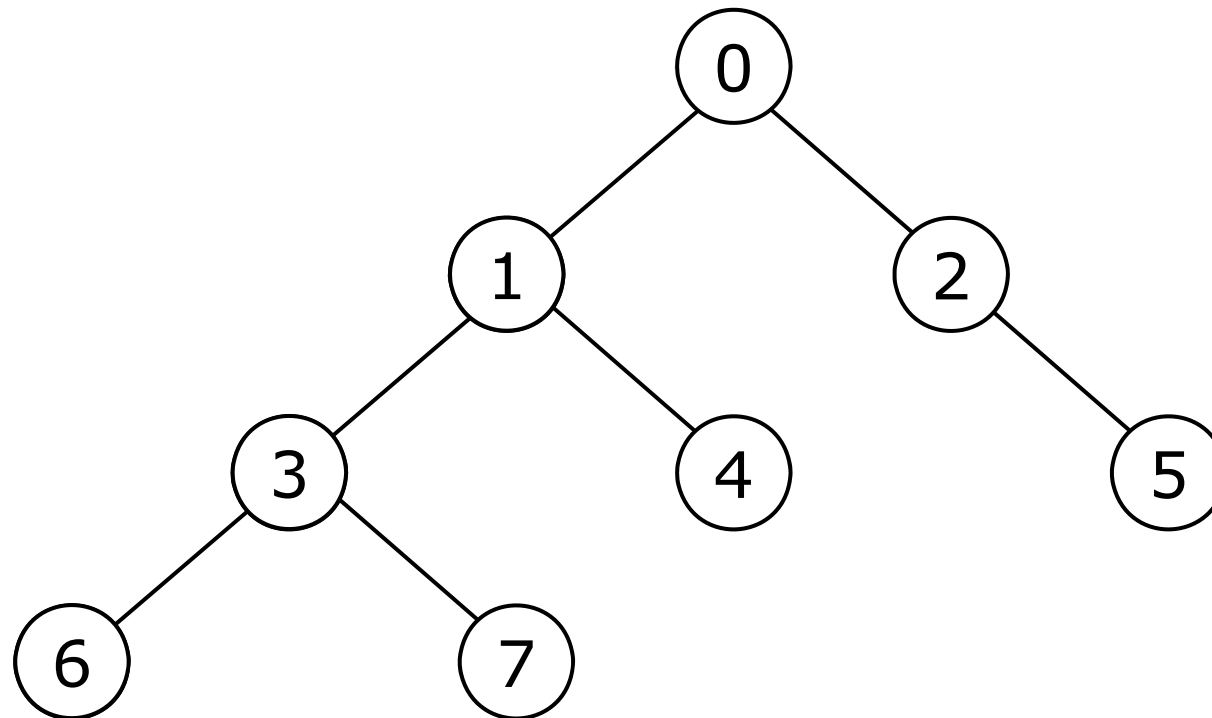
- Connected component
 - A maximal connected subgraph
- Ex)
 - Two connected subgraphs



9.2 Basic concepts

(8) Connected

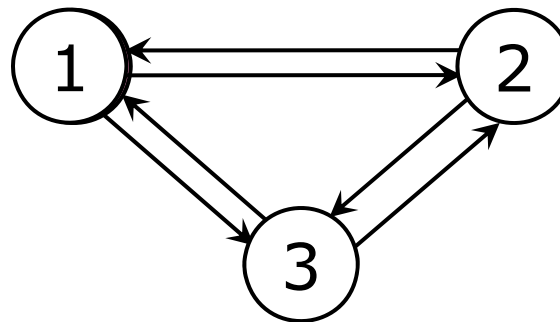
- Tree is a connected acyclic graph



9.2 Basic concepts

(8) Connected

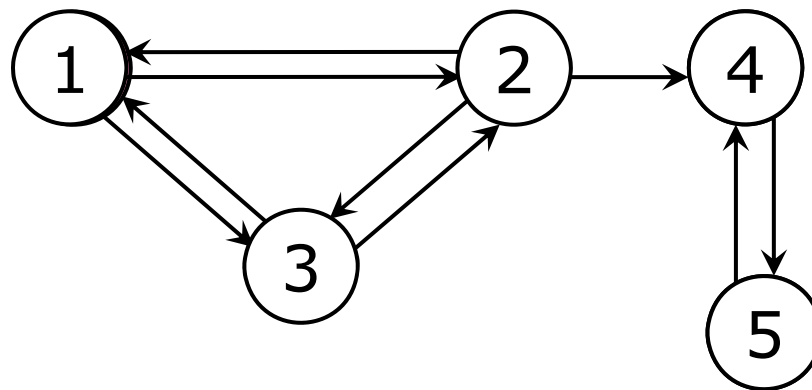
- A directed graph is **strongly connected**, if for every pair of distinct vertices u and v , there is a directed path from u to v and also from v to u



9.2 Basic concepts

(8) Connected

- A strongly connected component is a maximal subgraph that is strongly connected
- Ex)
 - $\{1, 2, 3\}$ is a strongly connected component
 - $\{4, 5\}$ is a strongly connected component



9.2 Basic concepts

(9) Degree of a vertex

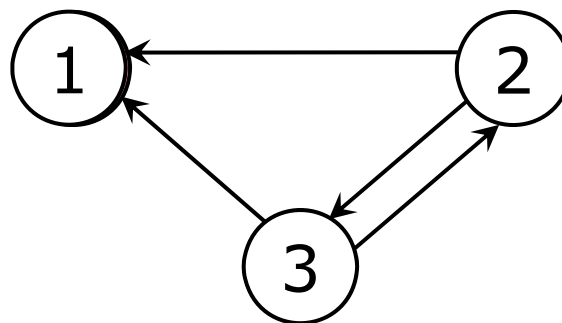
- The number of edges incident to a vertex
- In-degree of a vertex v
 - The number of edges for which v is the head
- Out-degree of a vertex v
 - The number of edges for which v is the tail

9.2 Basic concepts

(10) Degree of a vertex

– Ex)

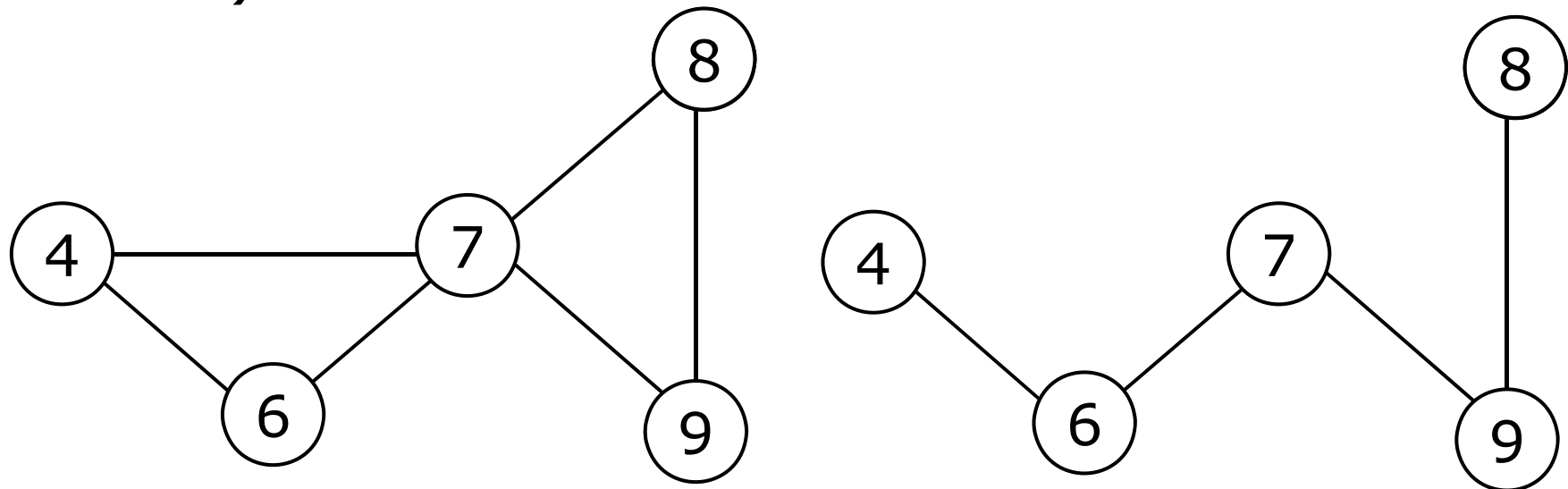
- Degree of vertex 2 = 3
- In-degree of vertex 3: 1
- Out-degree of vertex 3: 2



9.2 Basic concepts

(11) Spanning tree

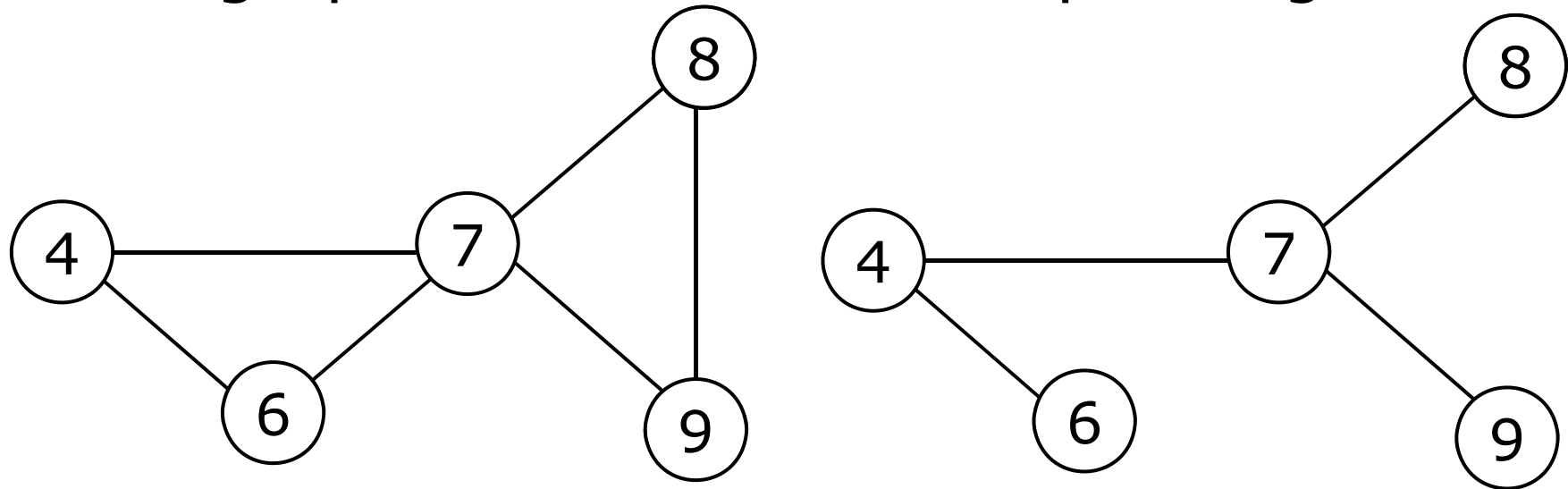
- $T = (V', E')$ is a spanning tree of a graph $G = (V, E)$, if $V' = V$ and $E' \subseteq E$ and E' does not contain a cycle
- Ex)



9.2 Basic concepts

(11) Spanning tree

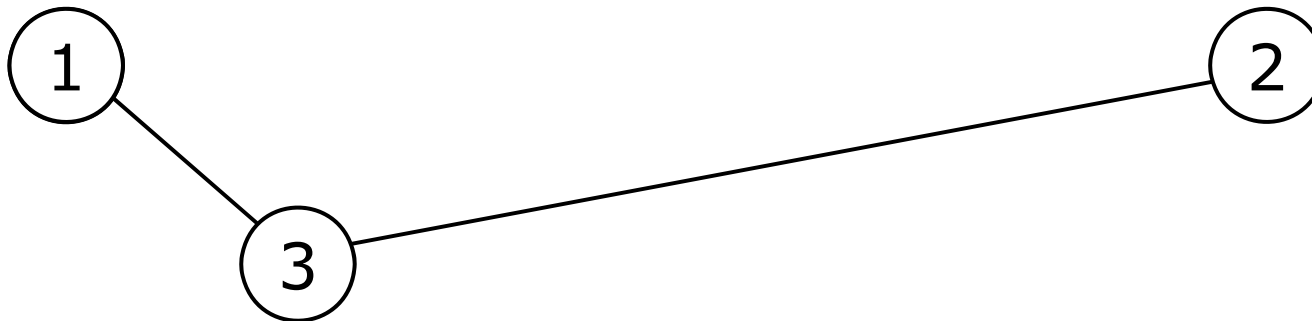
- $T = (V', E')$ is a spanning tree of a graph $G = (V, E)$, if $V' = V$ and $E' \subseteq E$ and E' does not contain a cycle
- A graph can have several spanning trees



9.2 Basic concepts

(12) Weighted graph

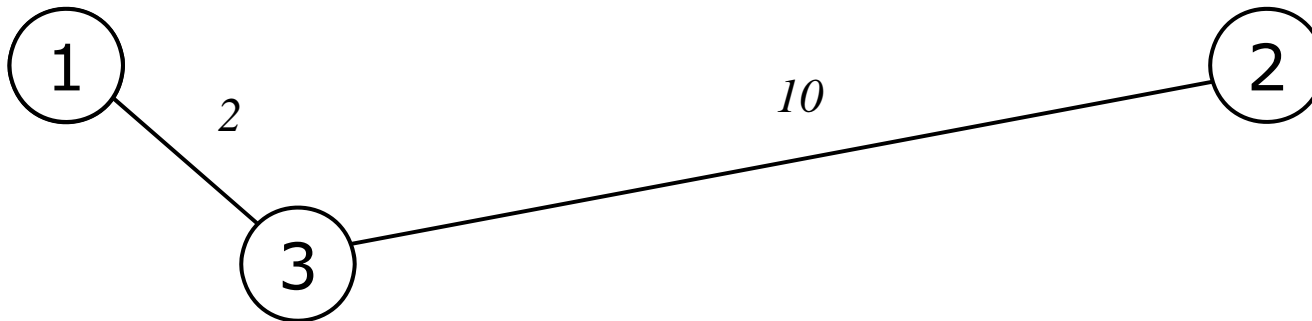
- A graph whose edges have some weights



9.2 Basic concepts

(12) Weighted graph

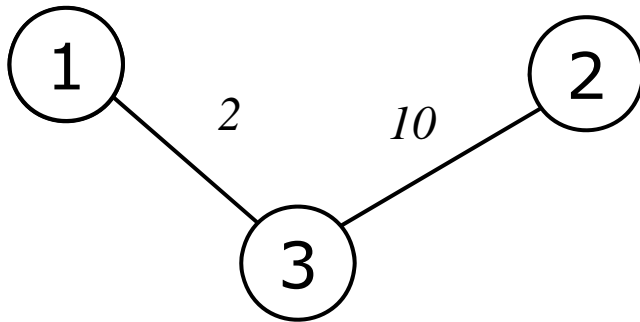
- A graph whose edges have some weights



9.2 Basic concepts

(12) Weighted graph

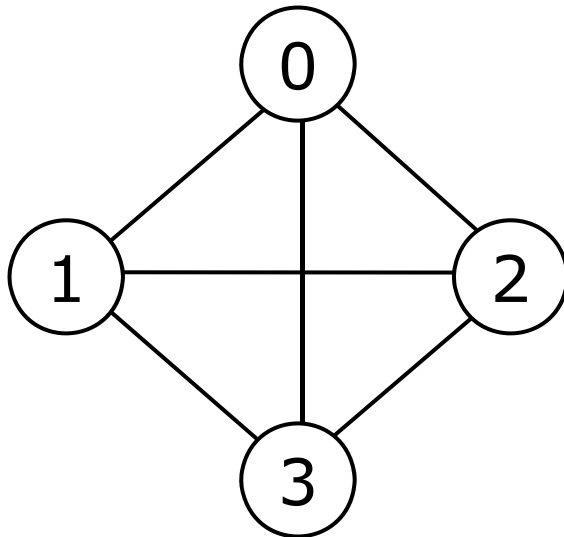
- A graph whose edges have some weights



9.3 Graph Representation

(1) Edge list

- A list of edges
- Available on many coding problems

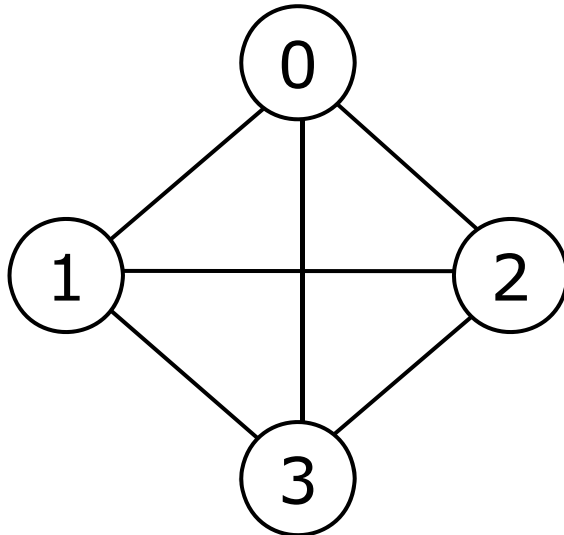


4, 6
0, 1
0, 2
0, 3
1, 2
1, 3
2, 3

9.3 Graph Representation

(2) Adjacency matrix of $G = (V, E)$

- A two-dimensional $n \times n$ array: $a[n][n]$
- $a[i][j] = 1$, if $(v_i, v_j) \in E$
- $a[i][j] = 0$, if $(v_i, v_j) \notin E$

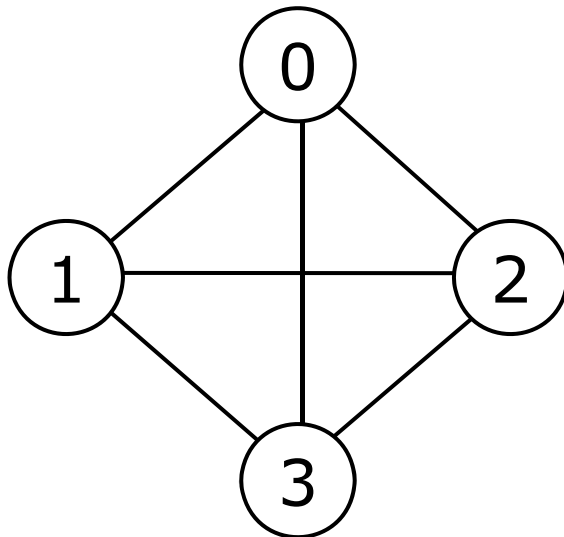


$$\begin{matrix} & 0 & 1 & 2 & 3 \\ \begin{matrix} 0 \\ 1 \\ 2 \\ 3 \end{matrix} & \begin{bmatrix} & & & \\ & & & \\ & & & \\ & & & \end{bmatrix} \end{matrix}$$

9.3 Graph Representation

(2) Adjacency matrix of $G = (V, E)$

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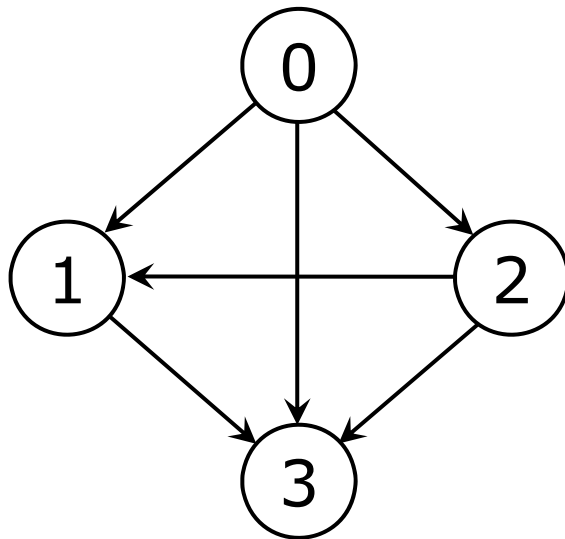


$$\begin{array}{c} \begin{array}{cccc} & 0 & 1 & 2 & 3 \end{array} \\ \begin{array}{l} 0 \\ 1 \\ 2 \\ 3 \end{array} \begin{bmatrix} 0 & 1 & 1 & 1 \\ 1 & 0 & 1 & 1 \\ 1 & 1 & 0 & 1 \\ 1 & 1 & 1 & 0 \end{bmatrix} \end{array}$$

9.3 Graph Representation

(2) Adjacency matrix of $G = (V, E)$

- A two-dimensional $n \times n$ array: $a[n][n]$
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- $a[i][j] = 0$, if $\langle v_i, v_j \rangle \notin E$

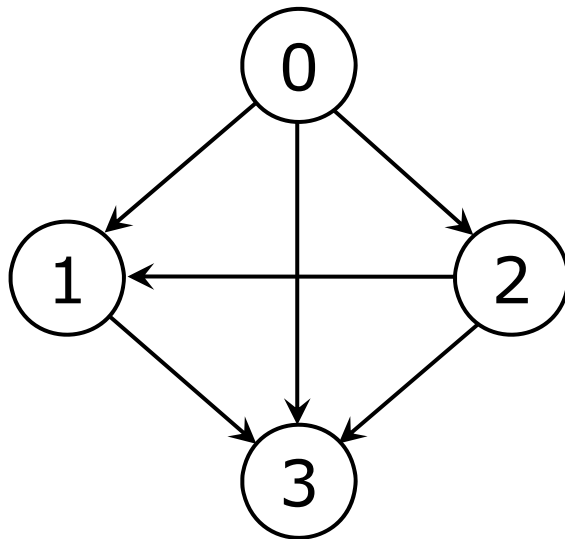


$$\begin{matrix} & 0 & 1 & 2 & 3 \\ \begin{matrix} 0 \\ 1 \\ 2 \\ 3 \end{matrix} & \left[\begin{array}{cccc} & & & \\ & & & \\ & & & \\ & & & \end{array} \right] \end{matrix}$$

9.3 Graph Representation

(2) Adjacency matrix of $G = (V, E)$

- A two-dimensional $n \times n$ array: $a[n][n]$
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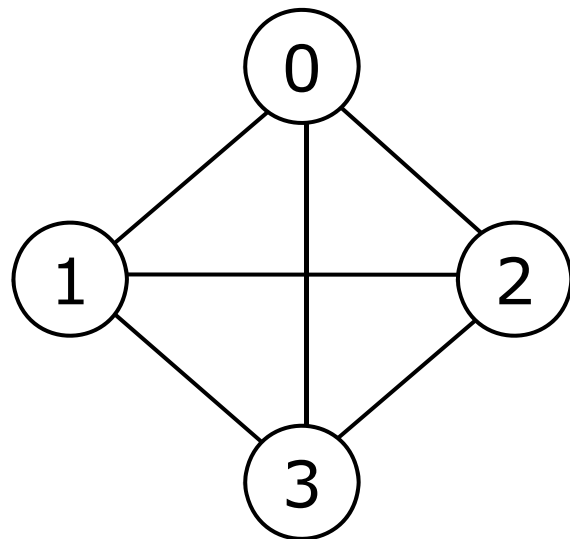


	0	1	2	3
0	0	1	1	1
1	0	0	0	1
2	0	1	0	1
3	0	0	0	0

9.3 Graph Representation

(3) Adjacency list of $G = (V, E)$

- `adjLists[n]`
- `adjLists[i]` is a pointer to the first node in the adjacency list for vertex i

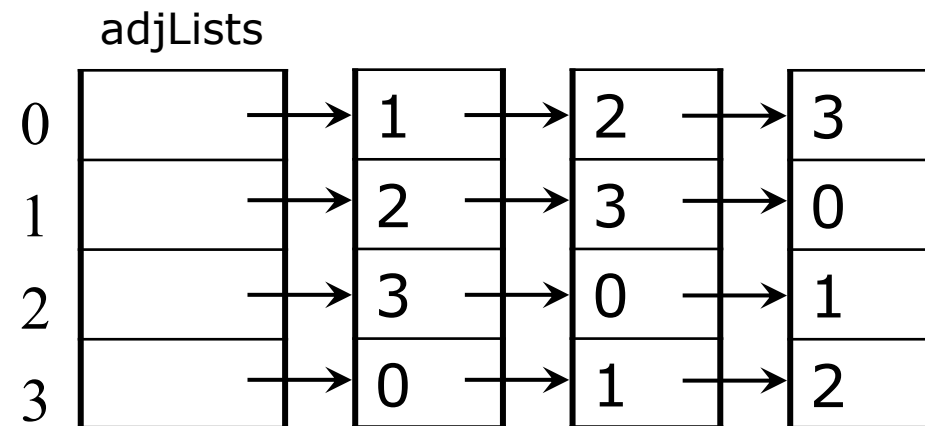
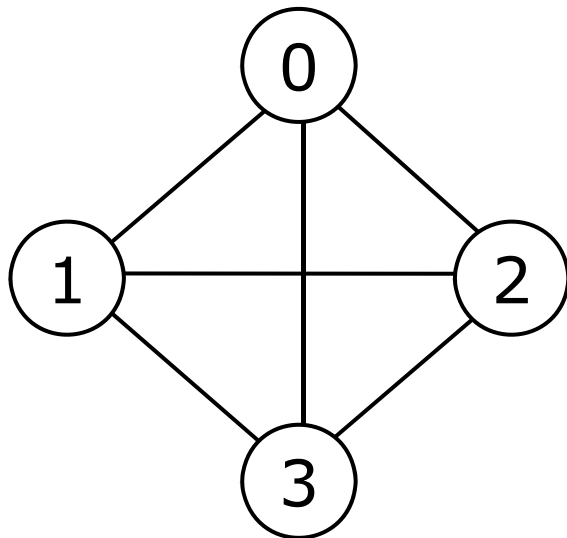


adjLists	
0	
1	
2	
3	

9.3 Graph Representation

(3) Adjacency list of $G = (V, E)$

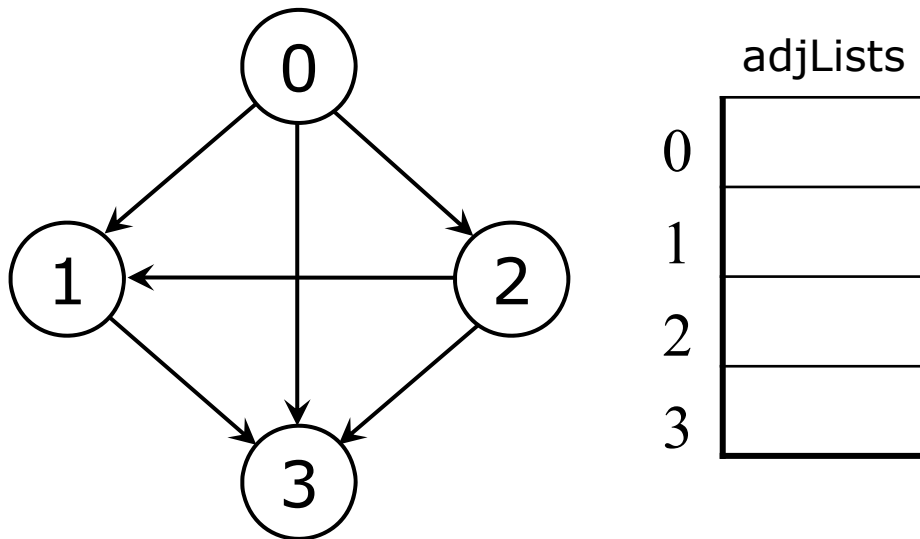
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9.3 Graph Representation

(3) Adjacency list of $G = (V, E)$

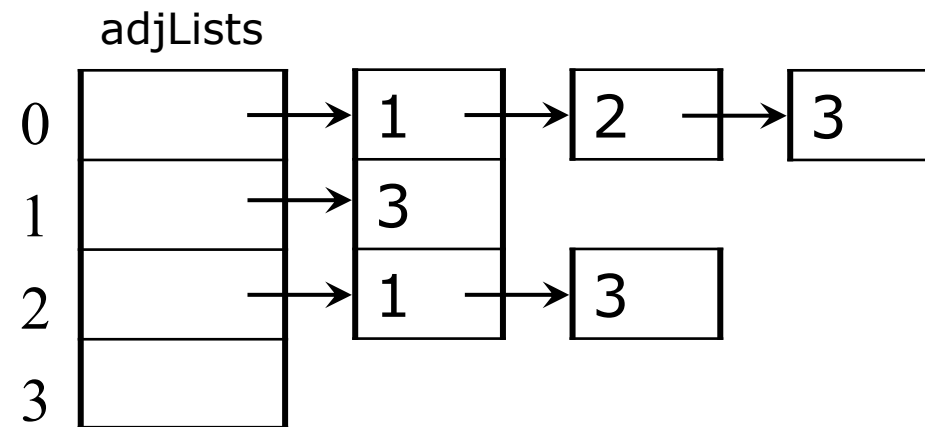
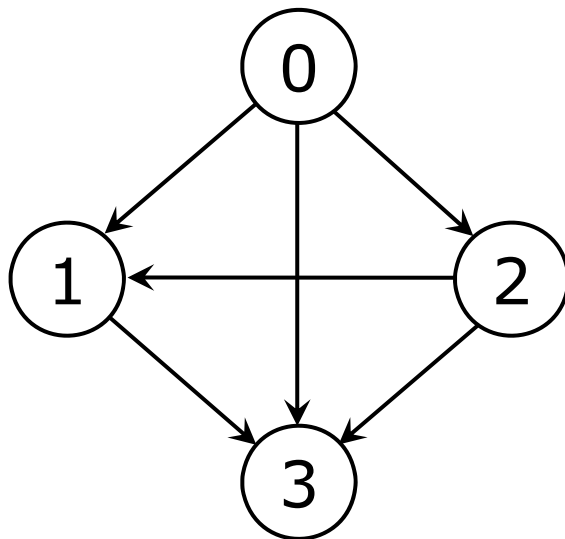
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9.3 Graph Representation

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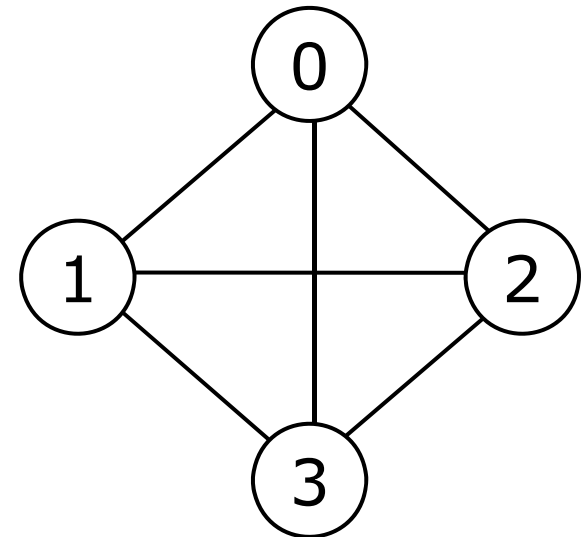
9.3 Graph Representation

- Comparison of performance
 - Ex) At all vertices, list all the incident vertices

```
for all vertices v in G
  for all vertices w adjacent to v
    report (v, w);
```

- Expected output:

- 0: 1, 2, 3
- 1: 0, 2, 3
- 2: 0, 1, 3
- 3: 0, 1, 2



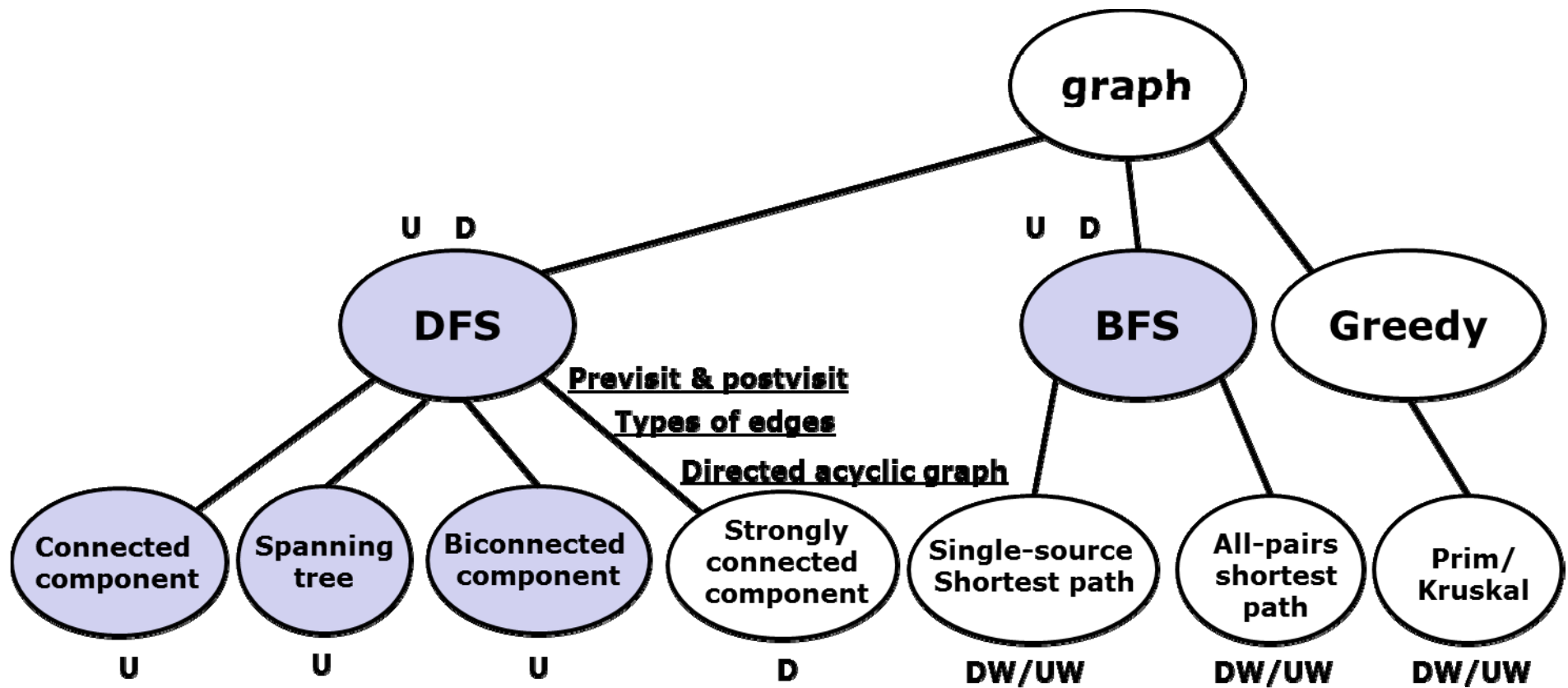
9.3 Graph Representation

- Comparison of performance
 - Ex) At all vertices, list all the incident vertices

```
for all vertices v in G
  for all vertices w adjacent to v
    report (v, w);
```

	Adjacency matrix	Adjacency list
Complete graph	$O(n^2)$	$O(n^2)$
Sparse graph	$O(n^2)$	$O(n)$

9.4 Search



9.4 Search

- Problem of search on a graph
 - Given a graph $G = (V, E)$ and a vertex $v \in V$, find all the vertices that are reachable from v .
 - Depth-first search
 - Breadth-first search

9.4.1 Depth-First Search

- Depth-first search
 - In visiting a node v ,
 - Mark node v as VISITED
 - Select an unvisited node w , which is adjacent to v
 - Push w to a stack
 - Find the next node to visit among the adjacent vertices of v
 - If cannot find, $v \leftarrow \text{pop a stack}$

9.4.1 Depth-First Search

- Required data structure
 - visit[n]
 - visit[i] == 1, if node i is visited,
== 0, if node i is unvisited
 - Stack → recursive call → function stack

9.4.1 Depth-First Search

```
void dfs ( int v )
{
    nodePointer w;
    visit[v] = TRUE;

    for ( w = graph[v]; w; w = w->link ) {
        if ( !visit[w->vertex] )
            dfs ( w->vertex );
    }
}

...
for all v in G
    if ( visit[v] == FALSE )
        dfs ( v );
...
```

Adjacency matrix $\rightarrow O(n)$

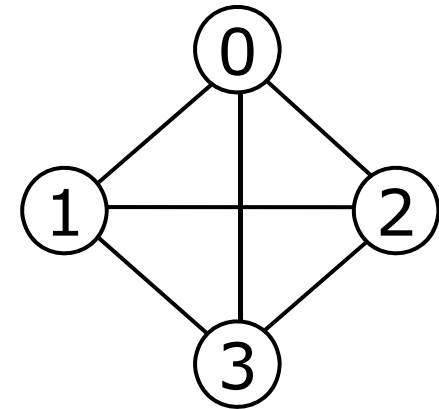
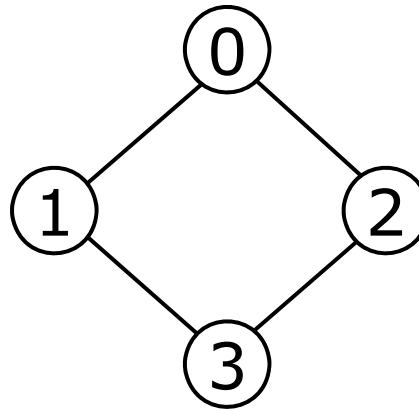
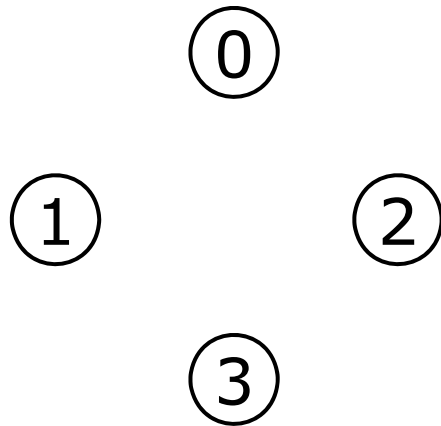
```
for ( int i = 0; i < n; i++ )
    if ( adjacency_matrix[v][i] != 0 )
        .....
```

Adjacency list $\rightarrow O(1) \sim O(n)$

```
for ( t = v; t != NULL; t = t->next )
    .....
```

9.4.1 Depth-First Search

- Time complexity?
 - $O(n + m)$
 - $O(m)$ for visiting all edges
 - $O(n)$ for visiting all vertices
 - $O(n) > O(m)$ for a disconnected graph
 - $O(n) == O(m)$ for a sparse graph
 - $O(n) < O(m)$ for a dense graph



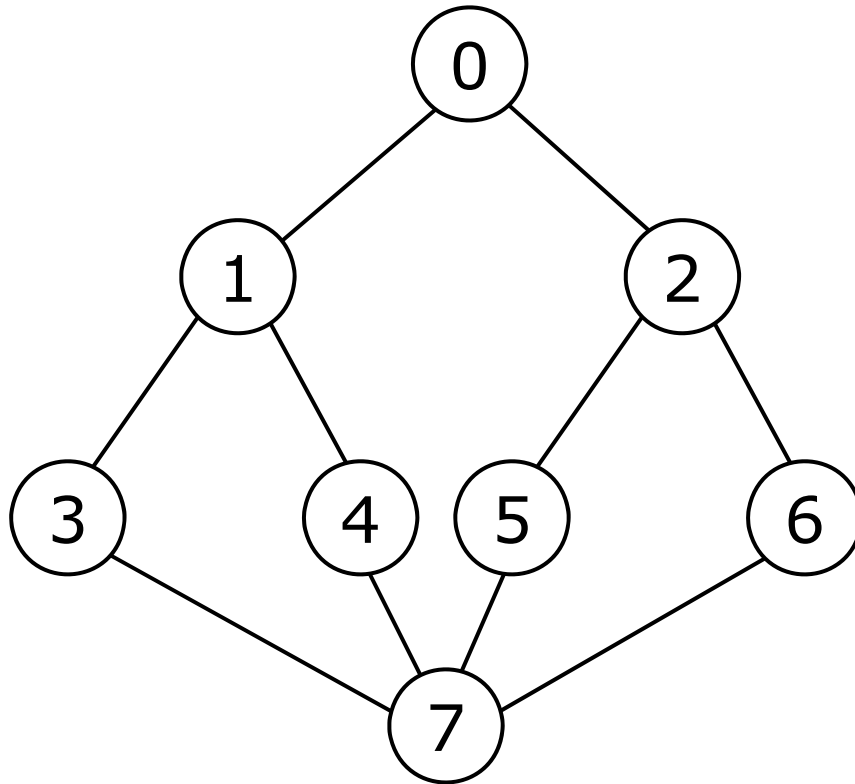
9.4.1 Depth-First Search

- Time complexity?
 - $O(n + m)$
 - It depends on the representation
 - A sparse graph on a adjacency matrix ?
 - A sparse graph on a adjacency list ?

	Adjacency matrix	Adjacency list
Disconnected	$O(n)$	$O(n)$
Sparse	$O(n^2)$	$O(n)$
Dense	$O(n^2)$	$O(n)$

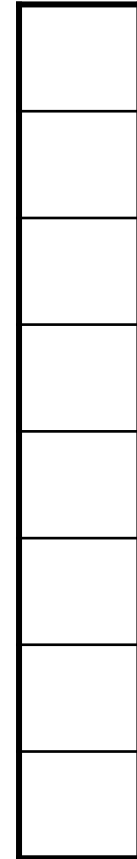
9.4.1 Depth-First Search

- Depth-first search (Initial)



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

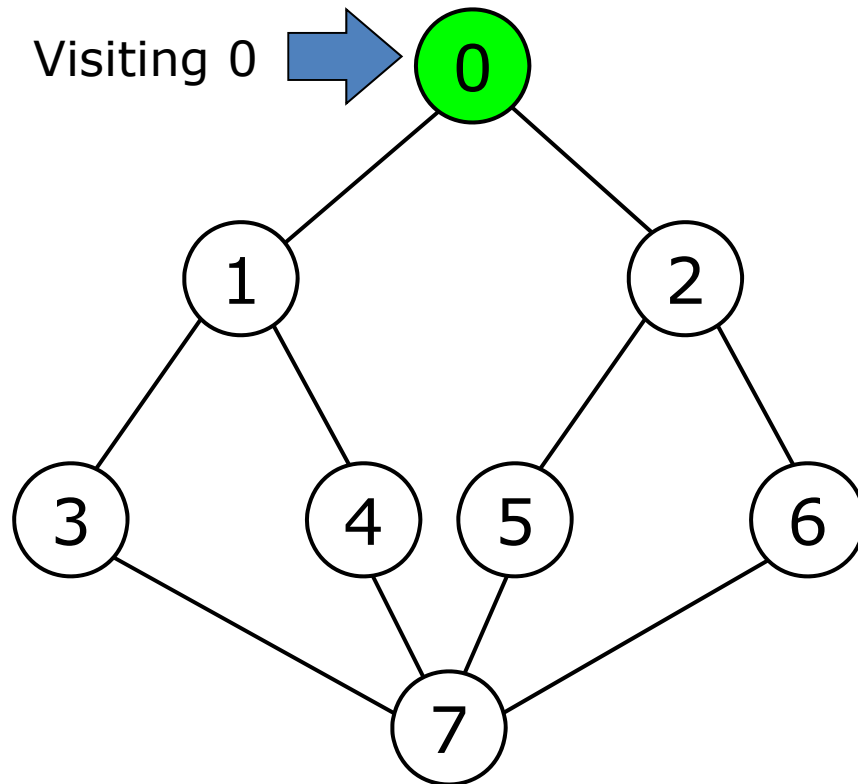
visit[n]



stack

9.4.1 Depth-First Search

- Depth-first search



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

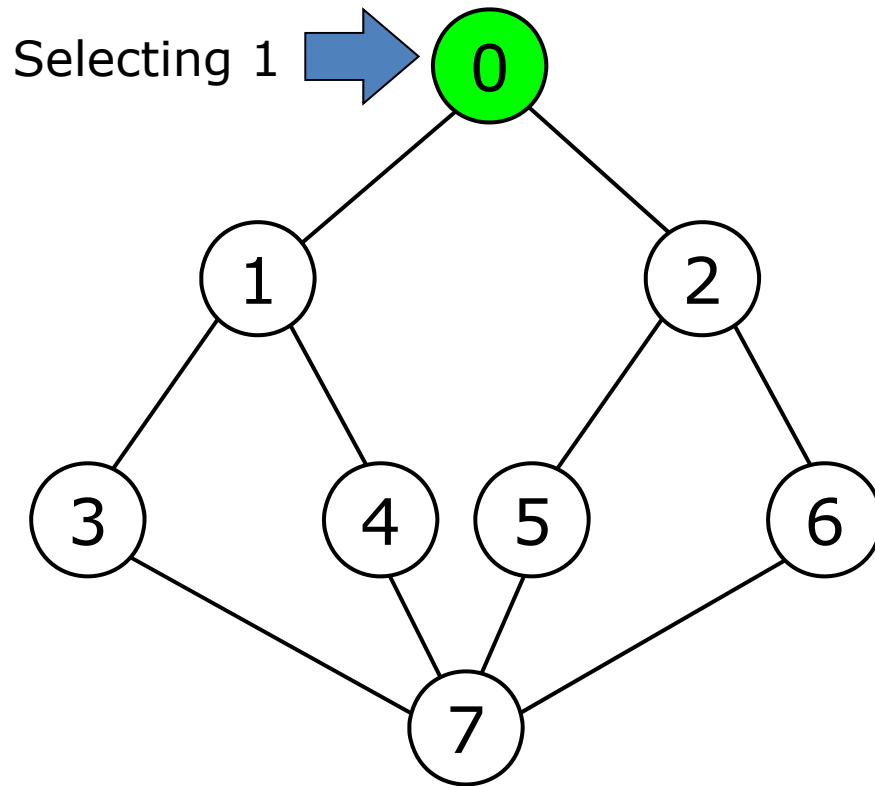
visit[n]

0

stack

9.4.1 Depth-First Search

- Depth-first search



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

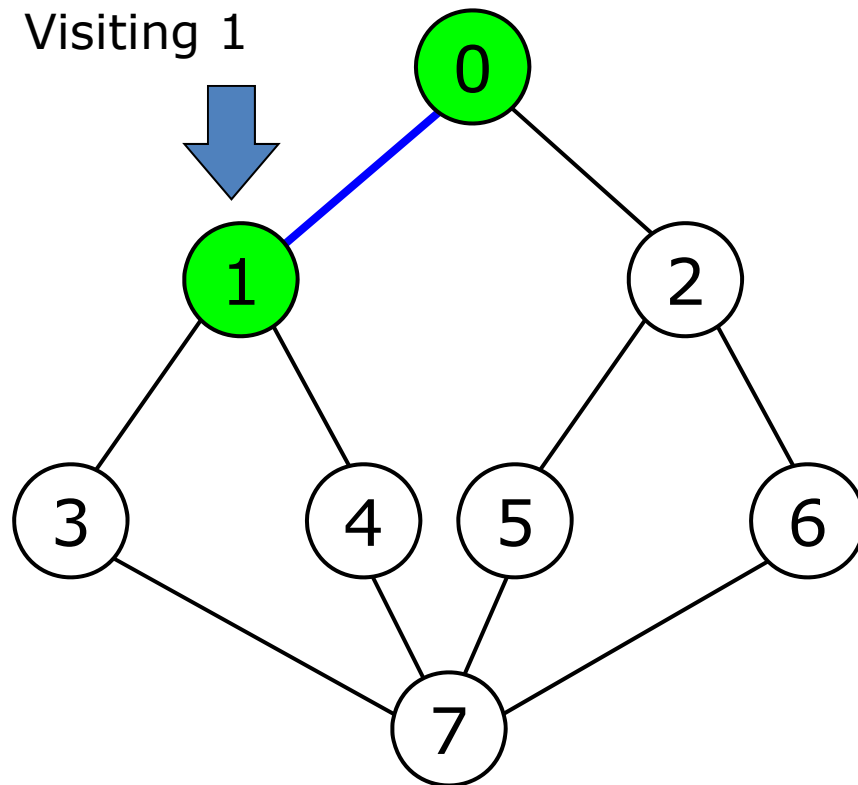
visit[n]

1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

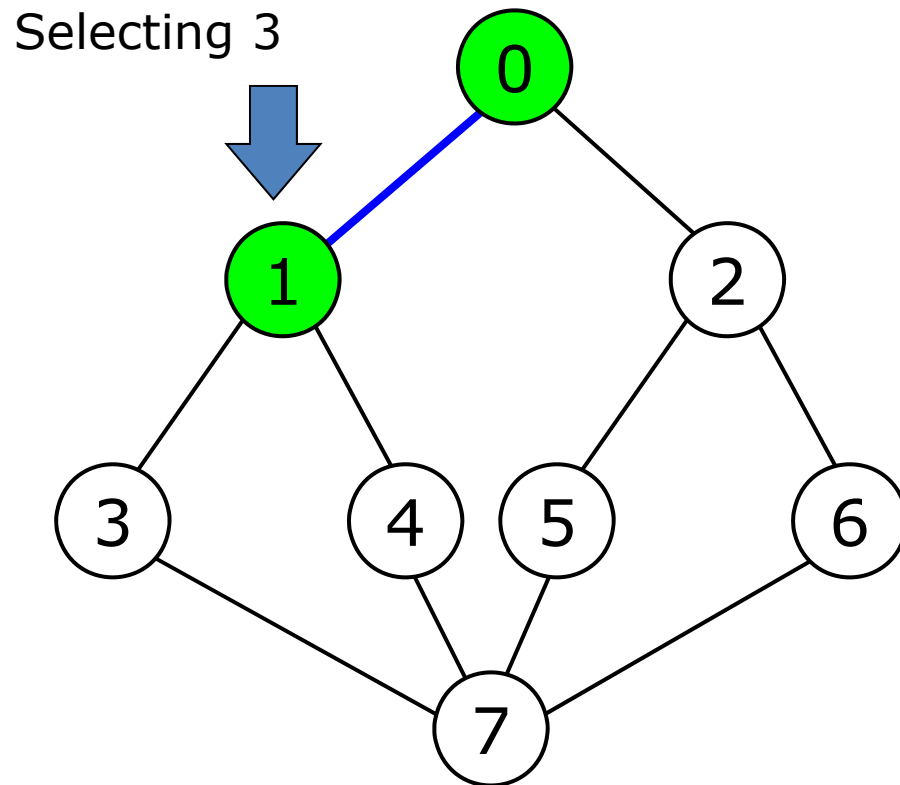
visit[n]

1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

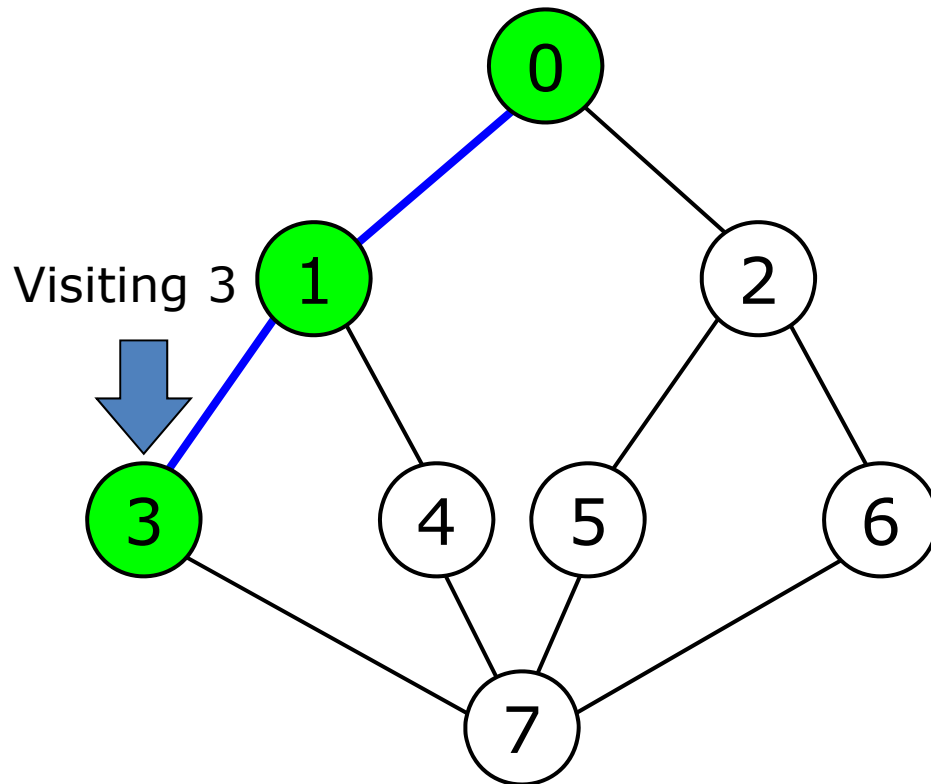
visit[n]

3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

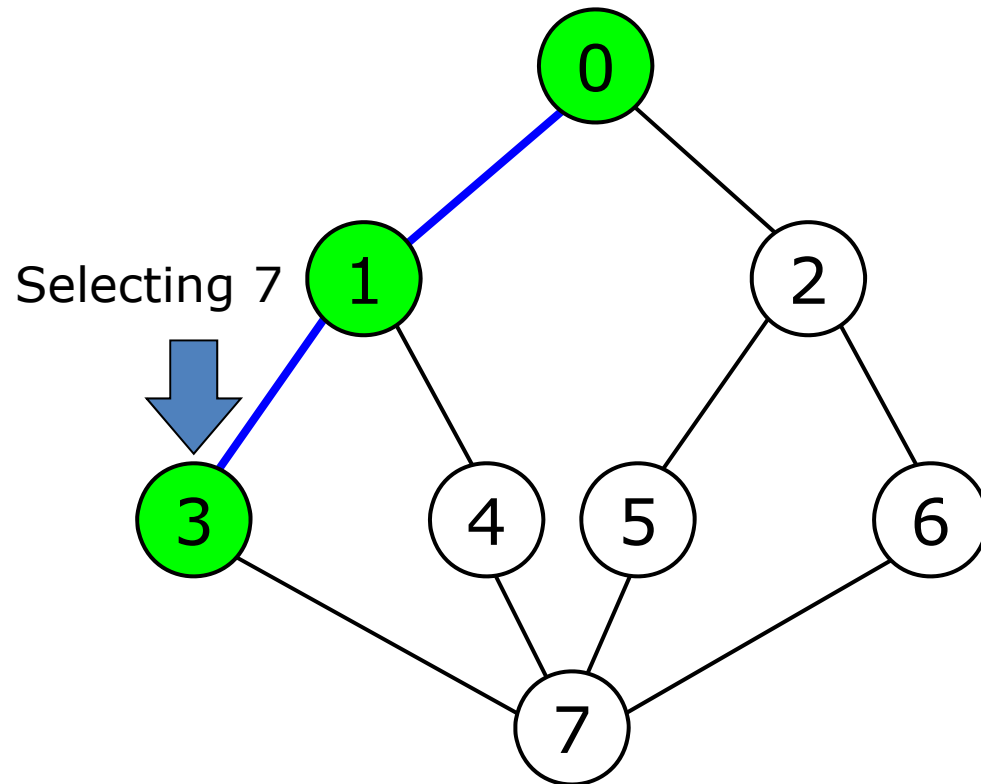
visit[n]

3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

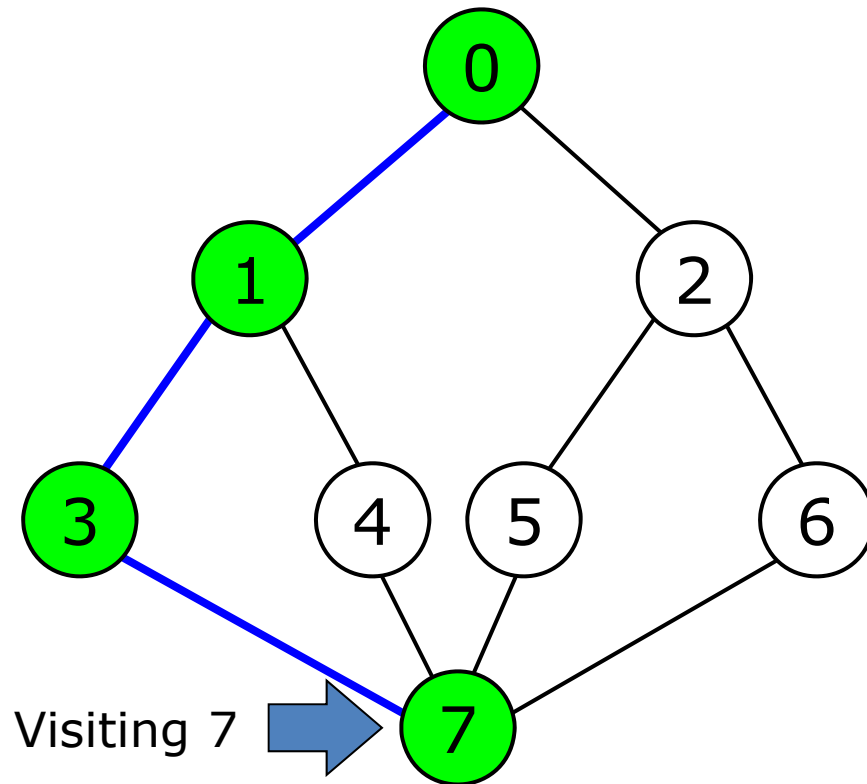
visit[n]

7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

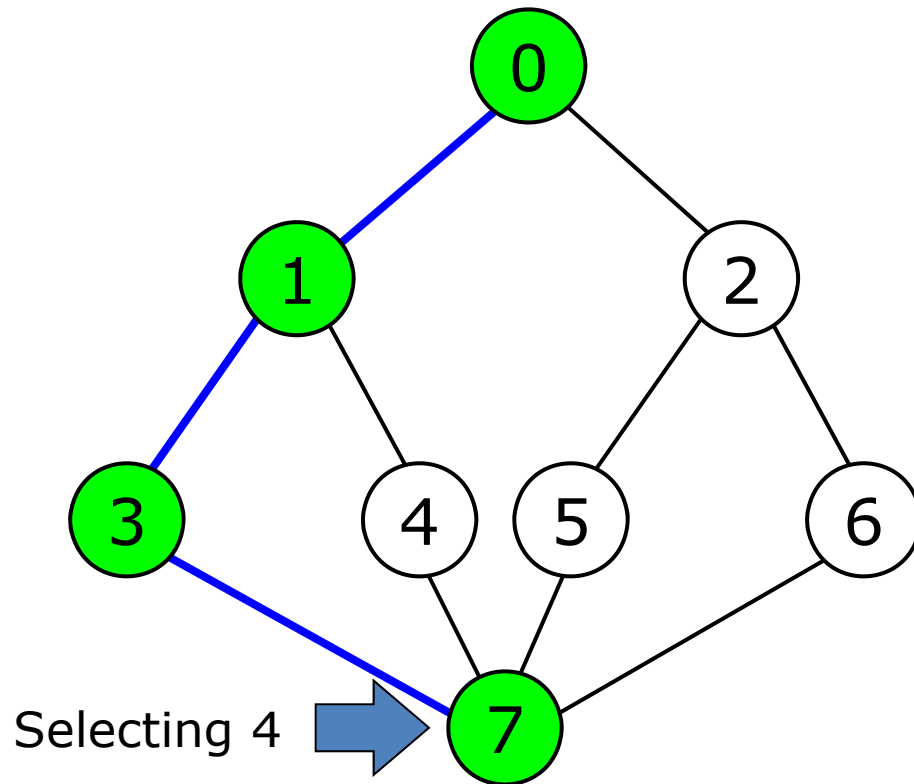
visit[n]

7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

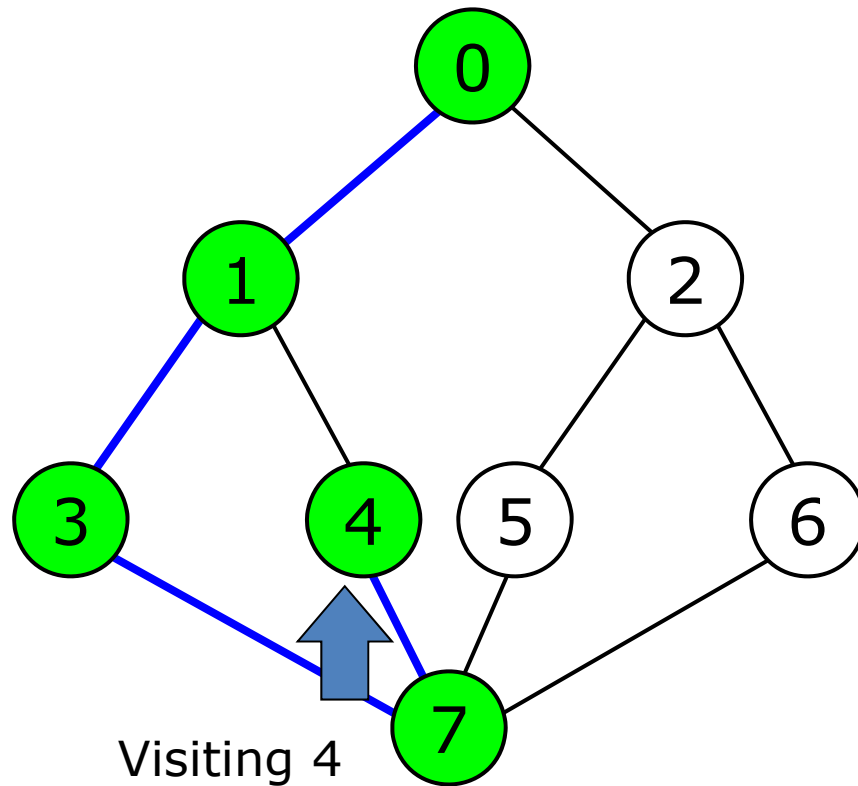
visit[n]

4
7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

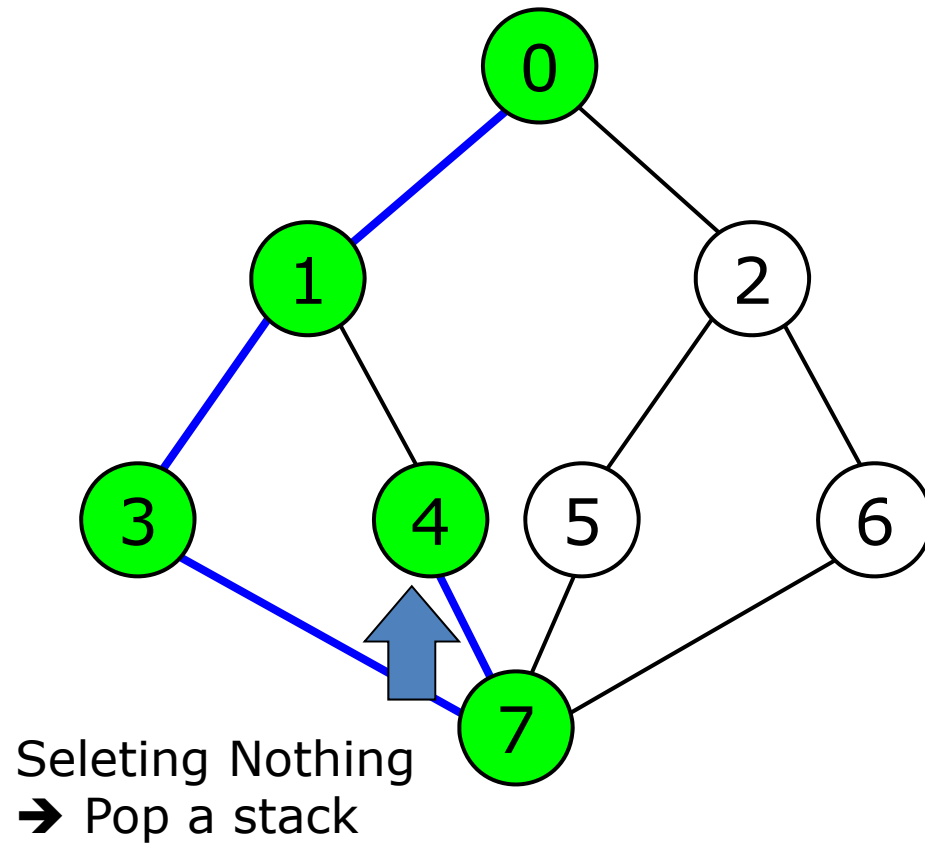
visit[n]

4
7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

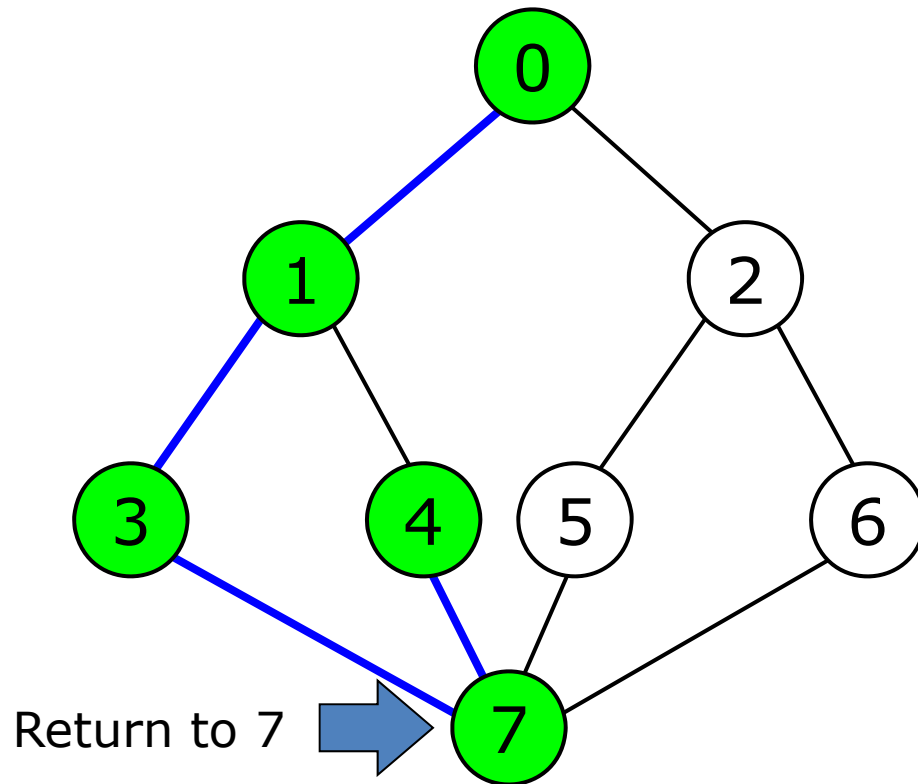
visit[n]

4
7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

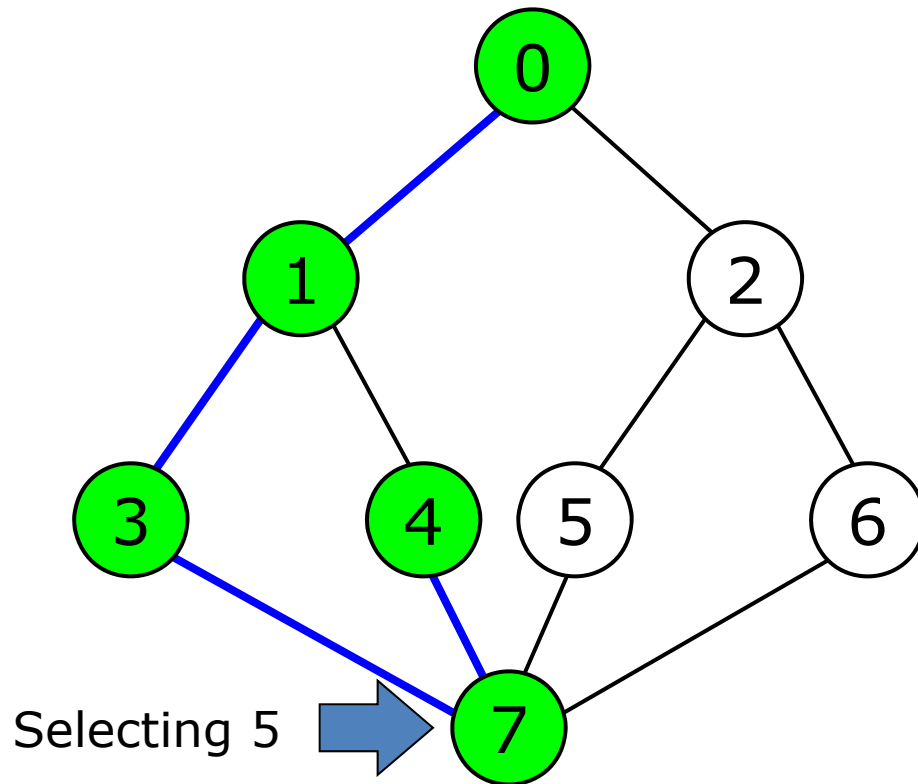
visit[n]

7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

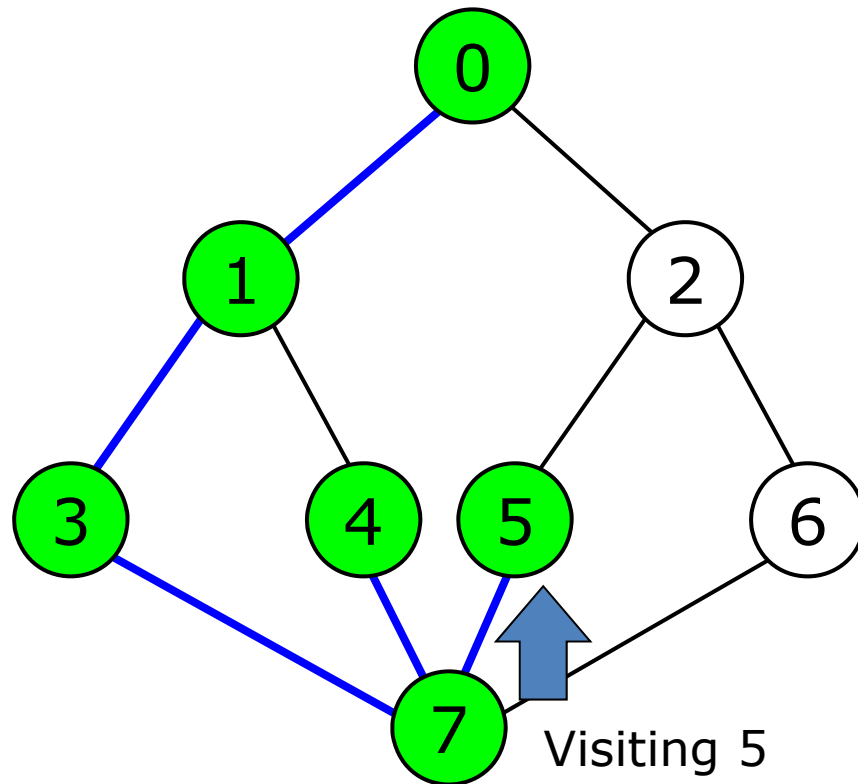
visit[n]

5
7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

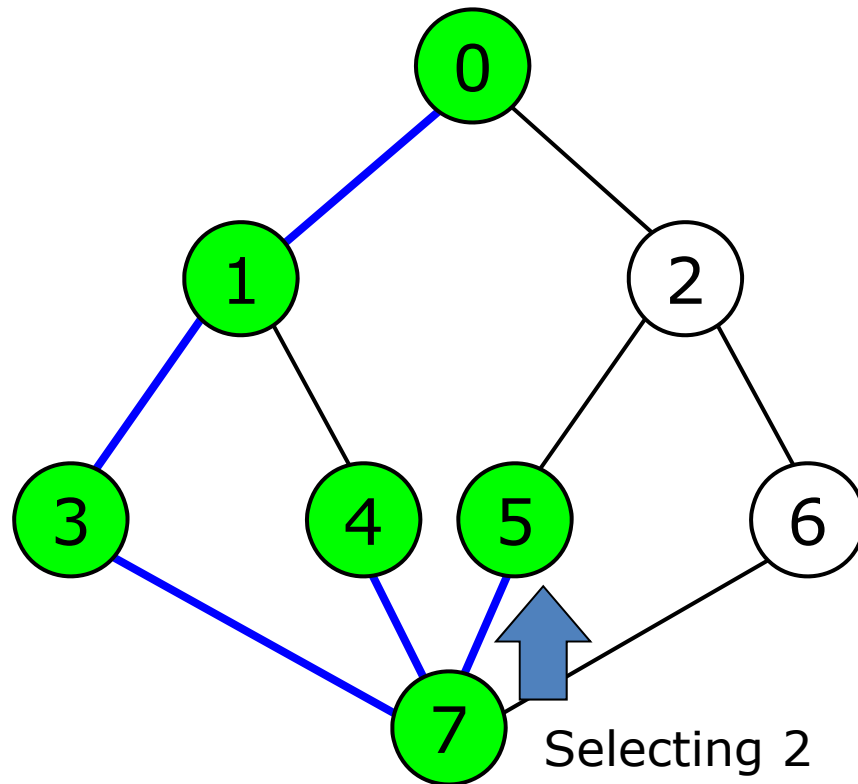
visit[n]

5
7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

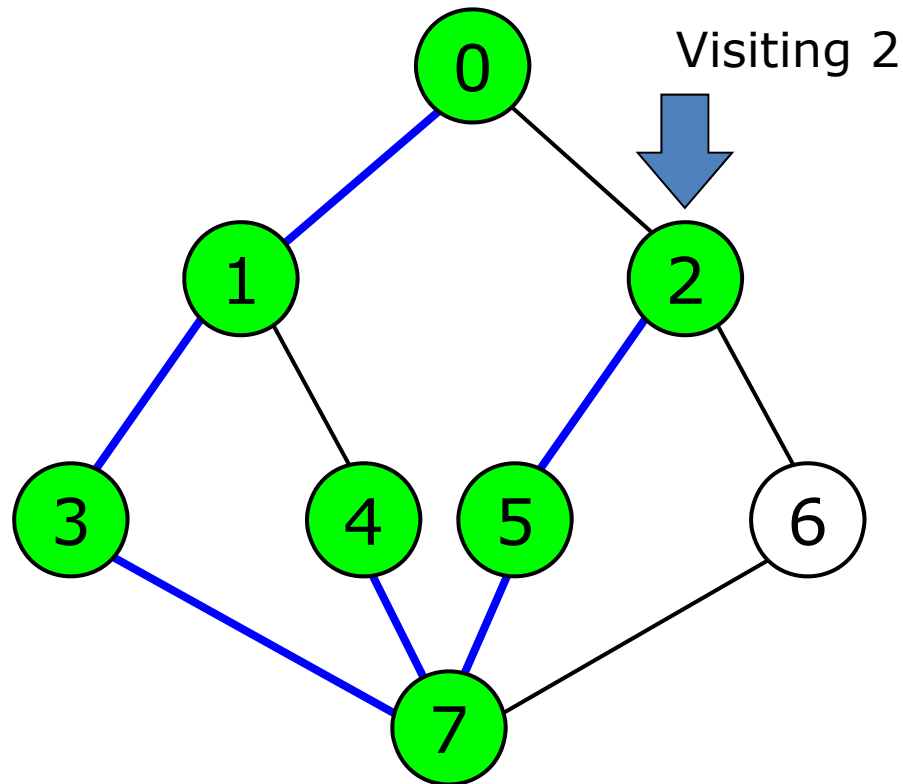
visit[n]

2
5
7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

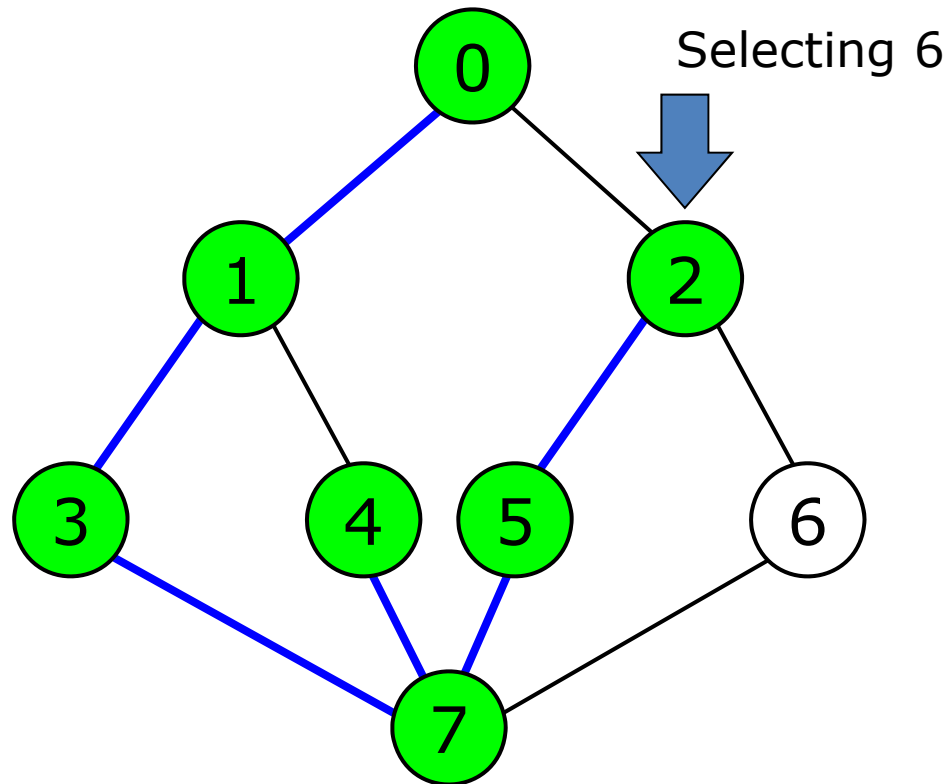
visit[n]

2
5
7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

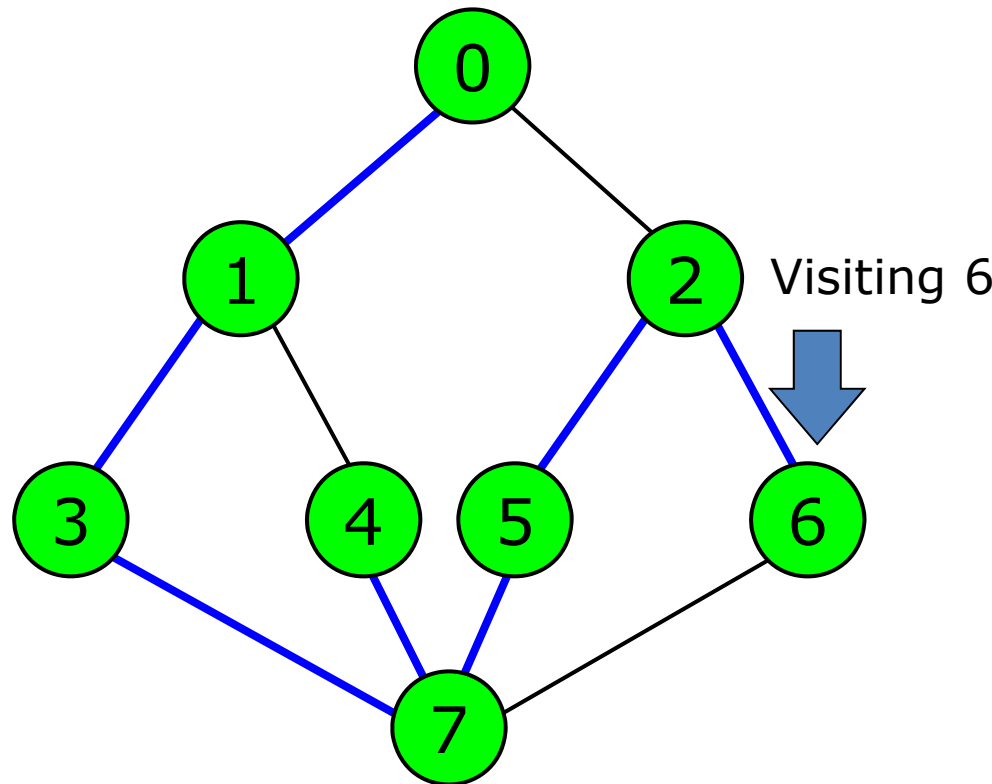
visit[n]

6
2
5
7
3
1
0

stack

9.4.1 Depth-First Search

- Depth-first search



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

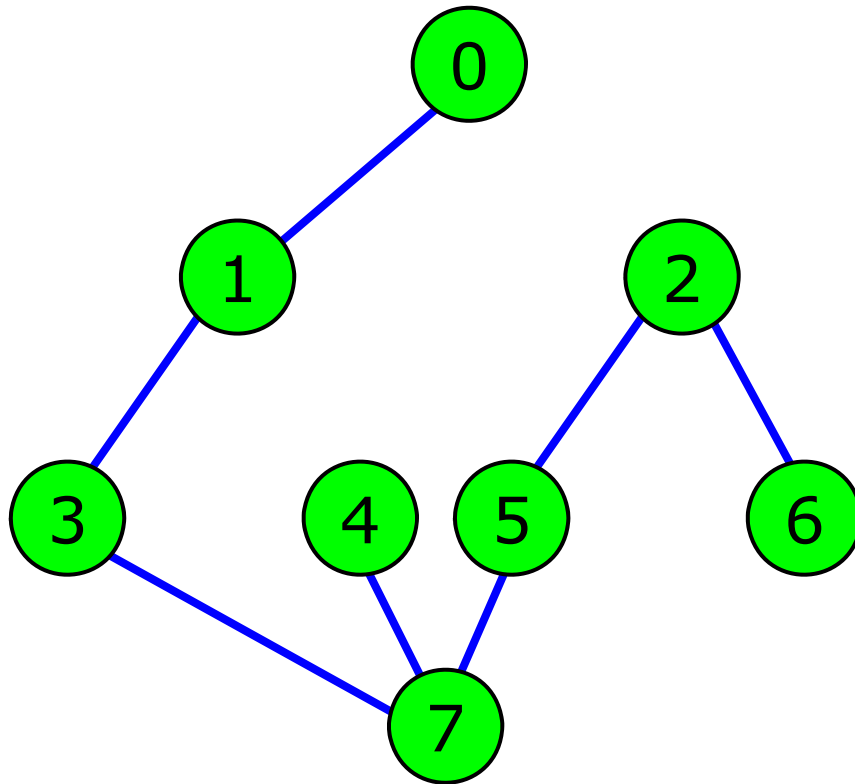
visit[n]

6
2
5
7
3
1
0

stack

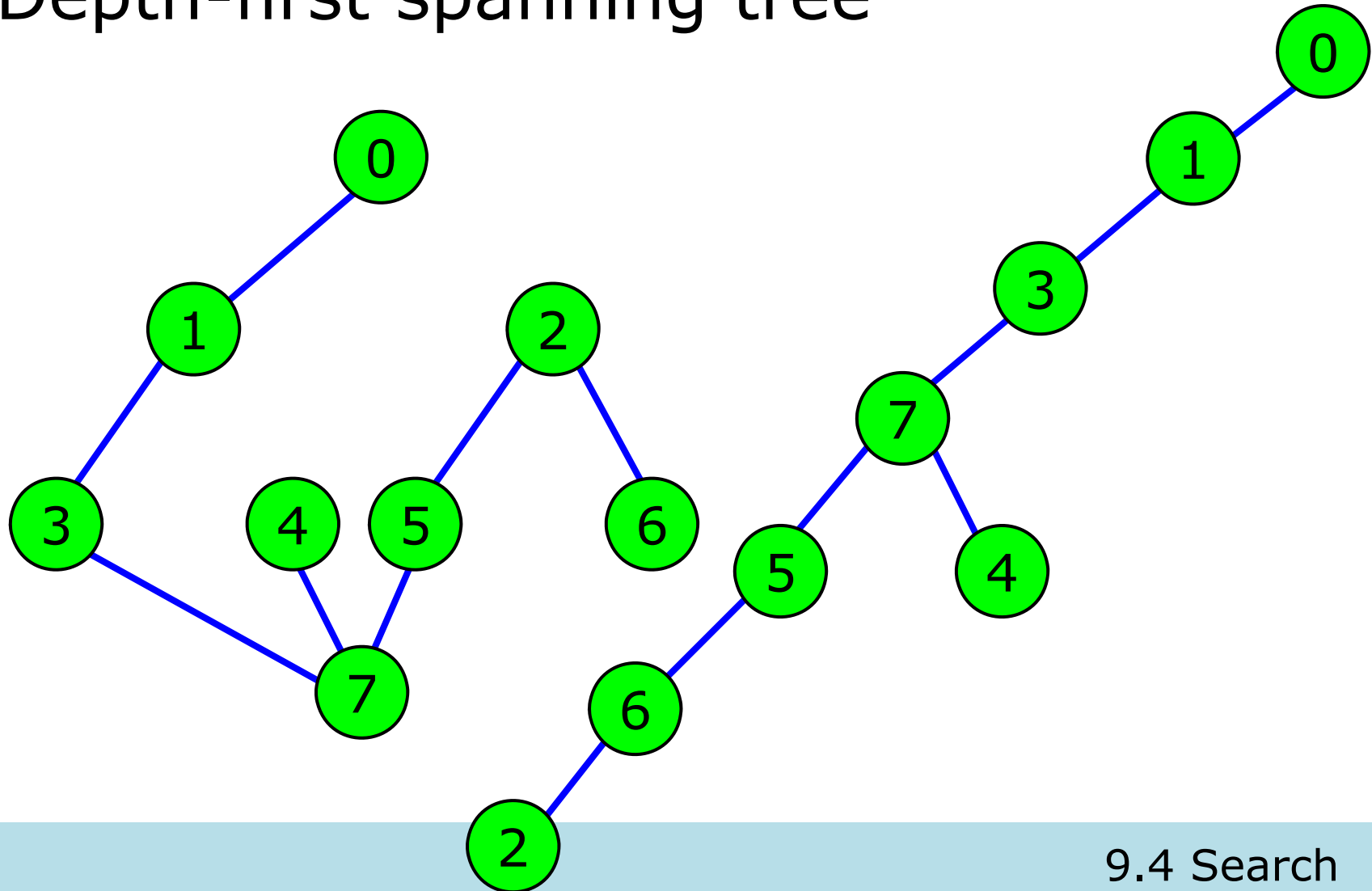
9.4.1 Depth-First Search

- Depth-first spanning tree



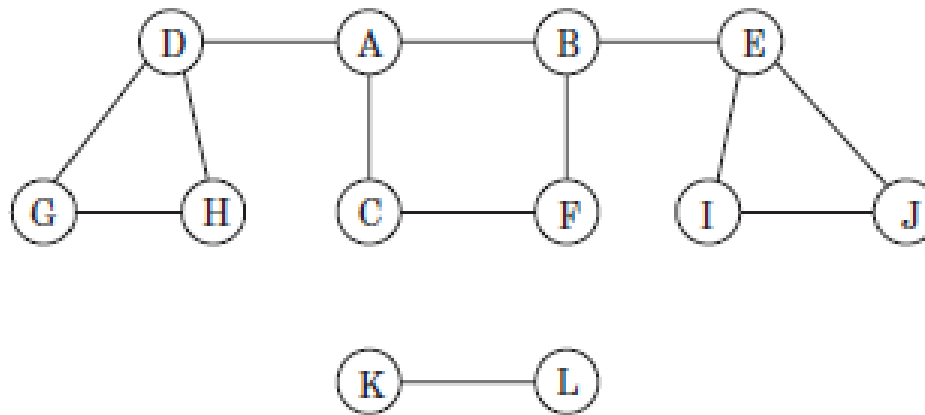
9.4.1 Depth-First Search

- Depth-first spanning tree



9.4.1 Depth-First Search

- Exercise



9.4.2 Breadth-First Search

- Breadth-first search
 - Use a queue
 - In visiting a vertex v ,
 - mark all the adjacent vertices as visited
 - add the vertices to the queue

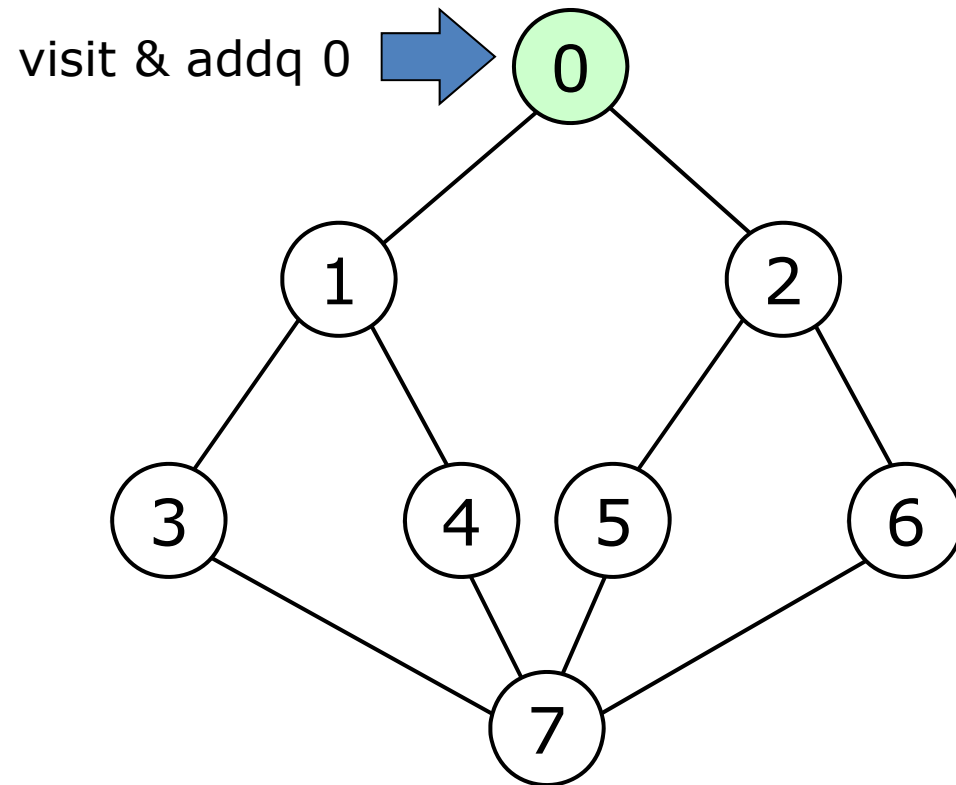
9.4.2 Breadth-First Search

```
void bfs ( int v )
{
    nodePointer w;
    front = rear = NULL;
    visit[v] = TRUE;
    addq ( v );
    while ( front ) {
        v = deleteq ( );
        for ( w = graph[v]; w; w = w->link )
            if ( !visit[w->vertex] ) {
                visit[w->vertex] = TRUE;
                addq ( w->vertex );
            }
    }
}
```

9.4.2 Depth-First Search

- Time complexity?
 - $O(n + m)$
 - $O(m)$ for visiting all edges
 - $O(n)$ for visiting all vertices
 - $O(n) > O(m)$ for a disconnected graph
 - $O(n) == O(m)$ for a sparse graph
 - $O(n) < O(m)$ for a dense graph
 - It depends on the representation
 - A sparse graph on a adjacency matrix ?
 - A sparse graph on a adjacency list ?

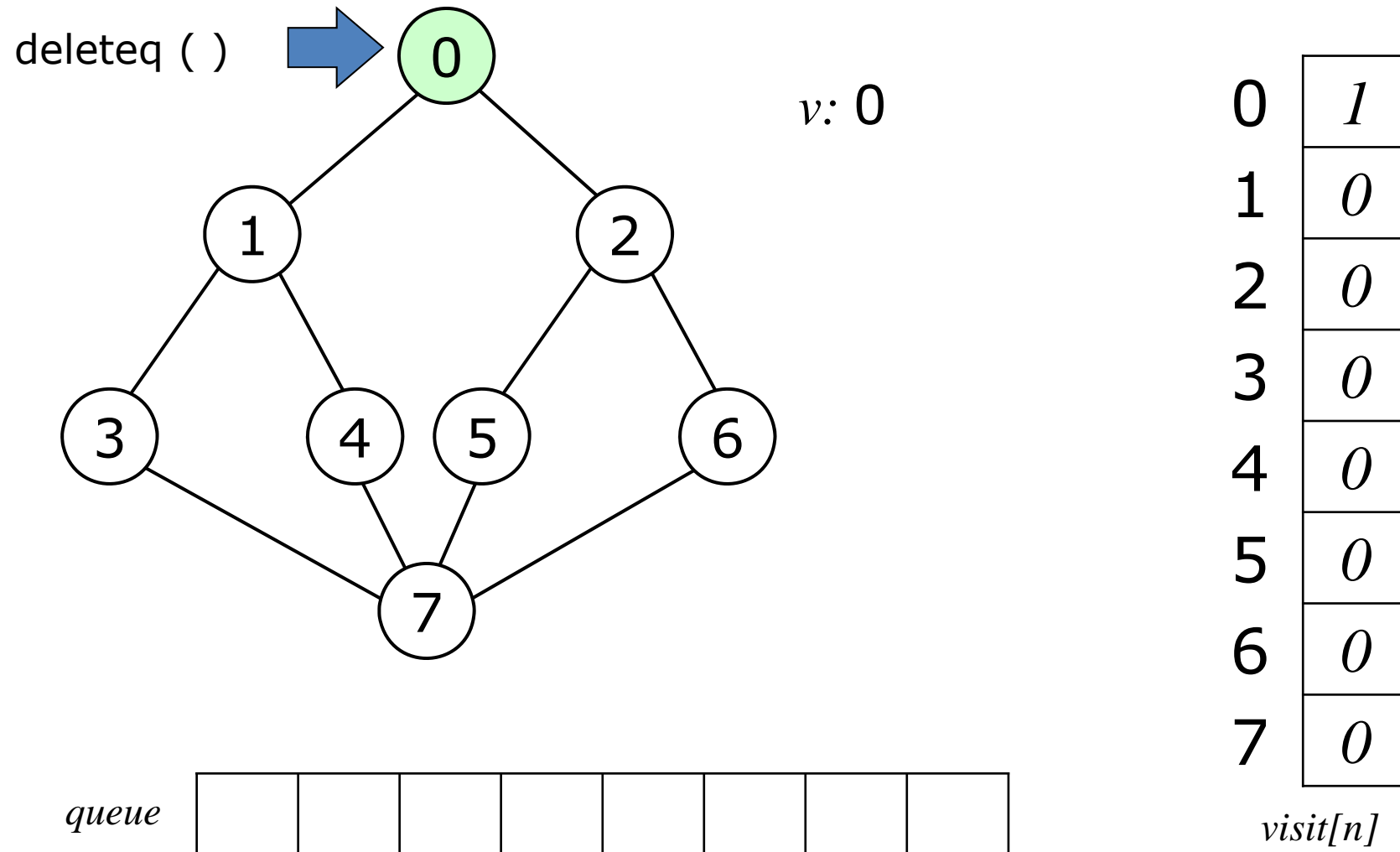
9.4.2 Breadth-First Search



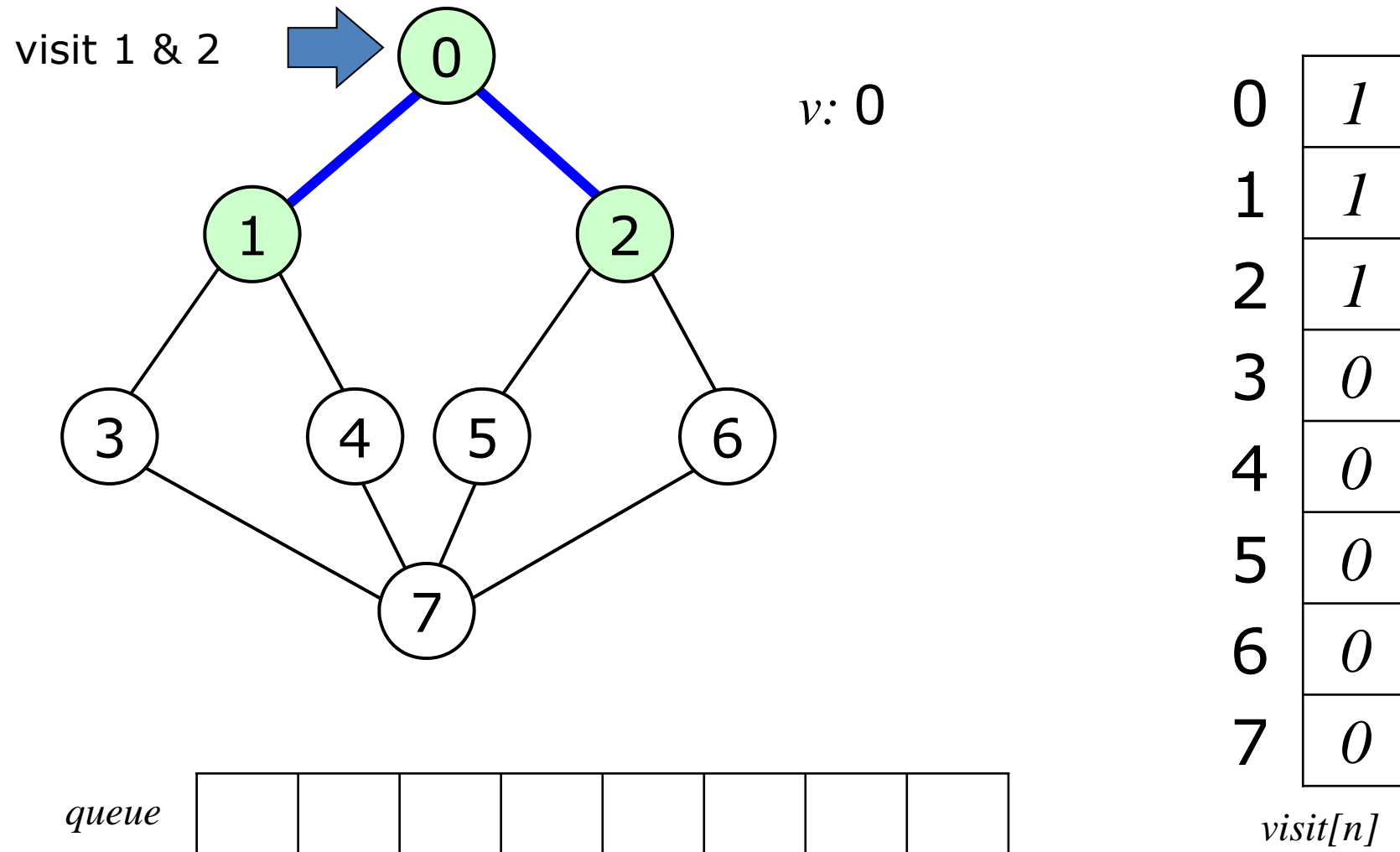
0	1
1	0
2	0
3	0
4	0
5	0
6	0
7	0

visit[n]

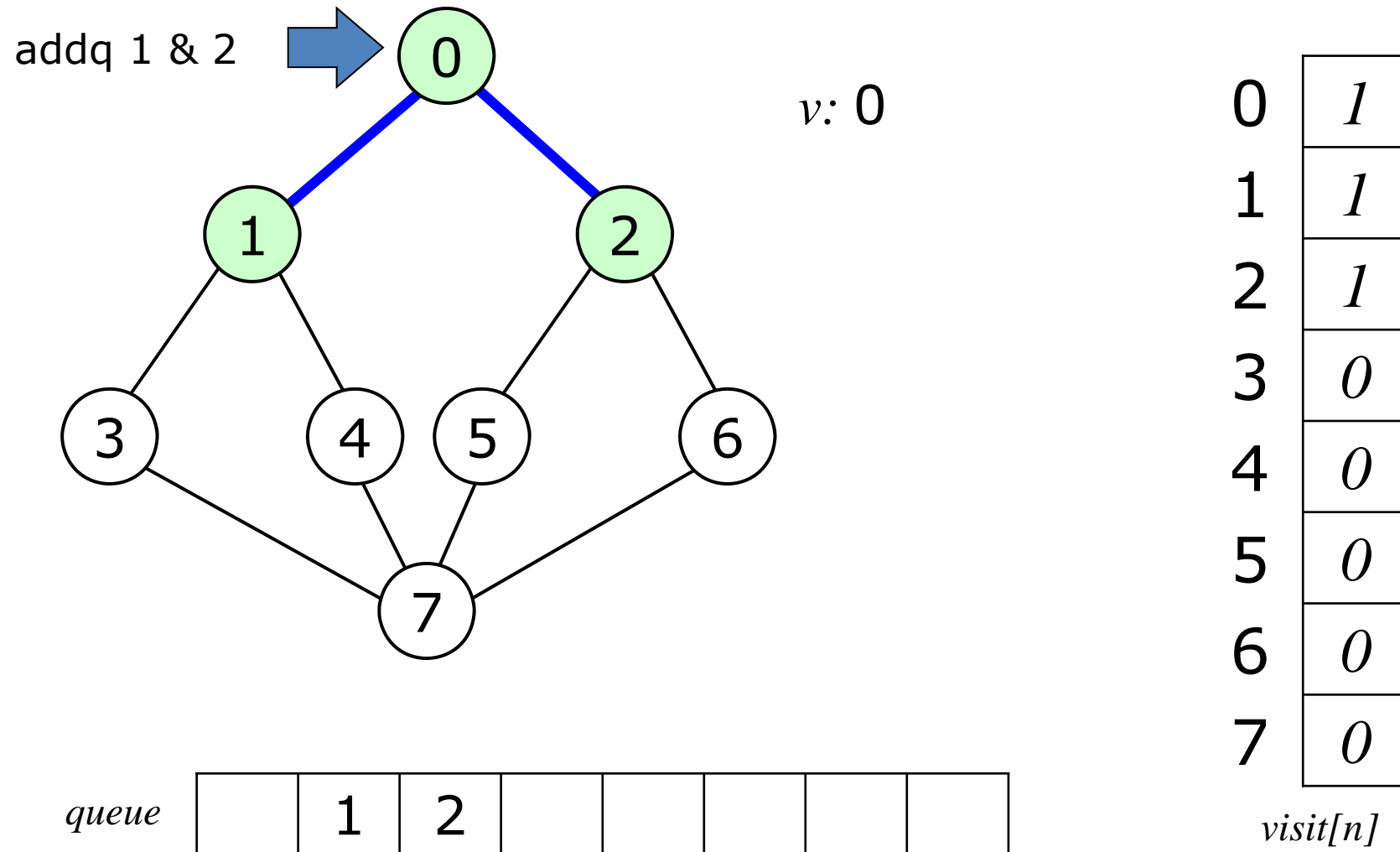
9.4.2 Breadth-First Search



9.4.2 Breadth-First Search

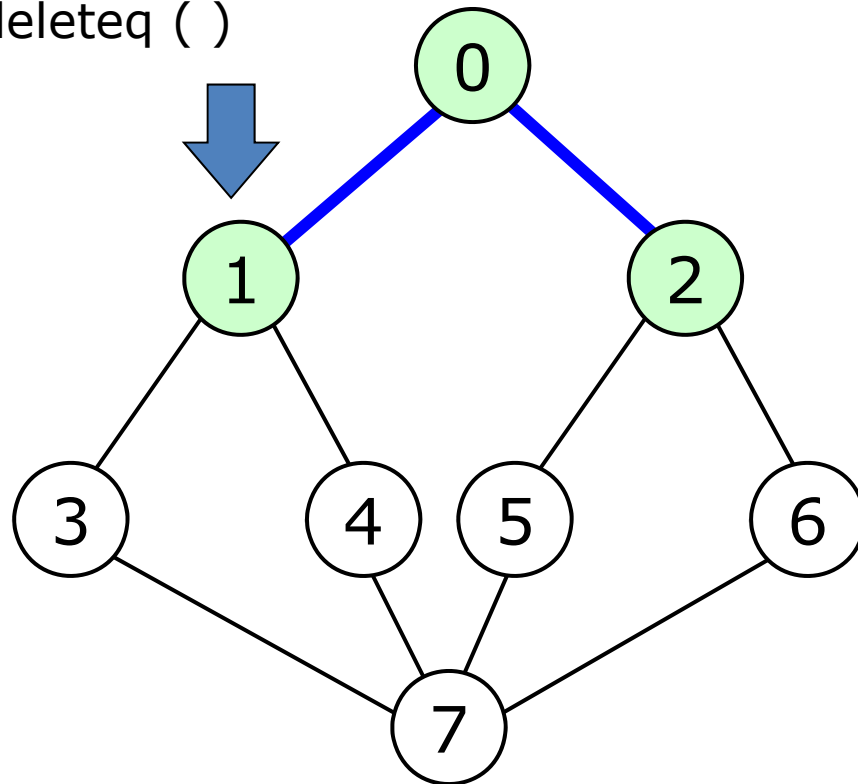


9.4.2 Breadth-First Search



9.4.2 Breadth-First Search

deleteq ()



queue

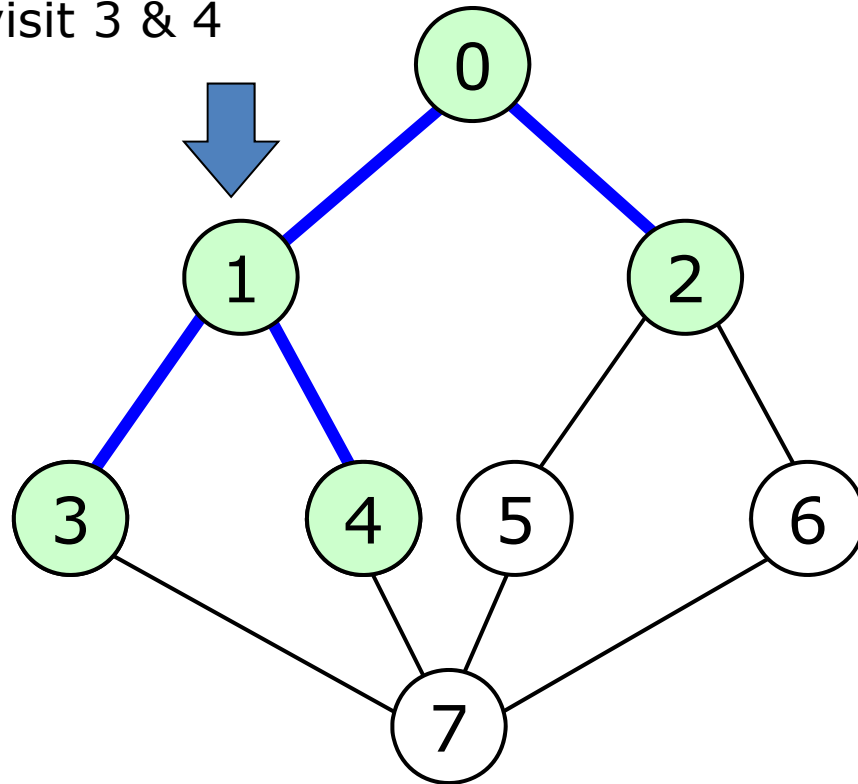
		2					
--	--	---	--	--	--	--	--

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

visit[n]

9.4.2 Breadth-First Search

visit 3 & 4



$v: 1$

queue

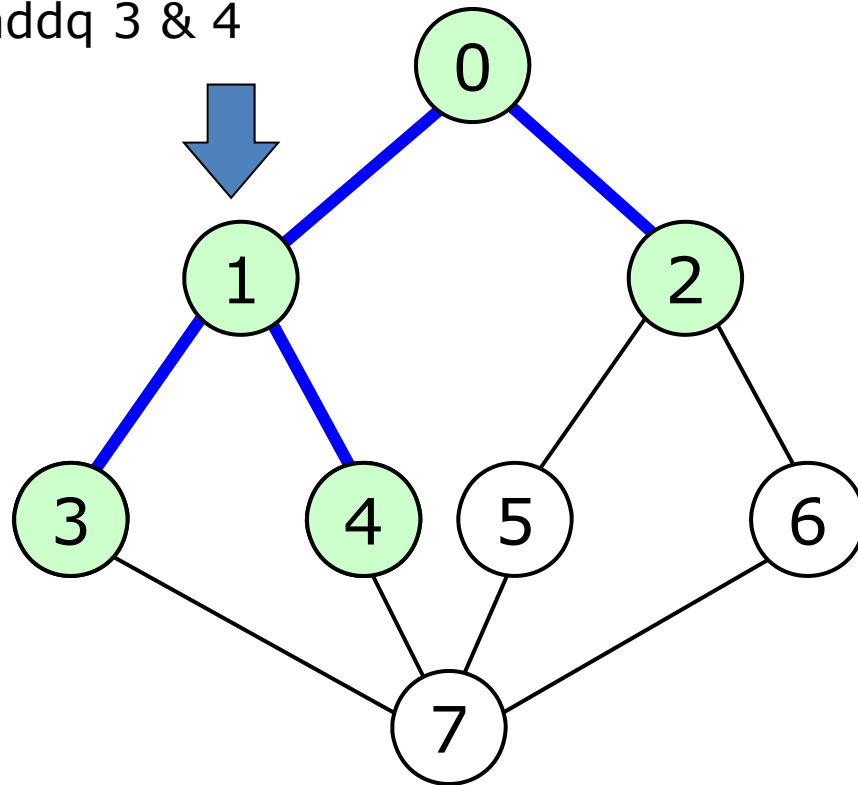


0	1
1	1
2	1
3	1
4	1
5	0
6	0
7	0

visit[n]

9.4.2 Breadth-First Search

addq 3 & 4



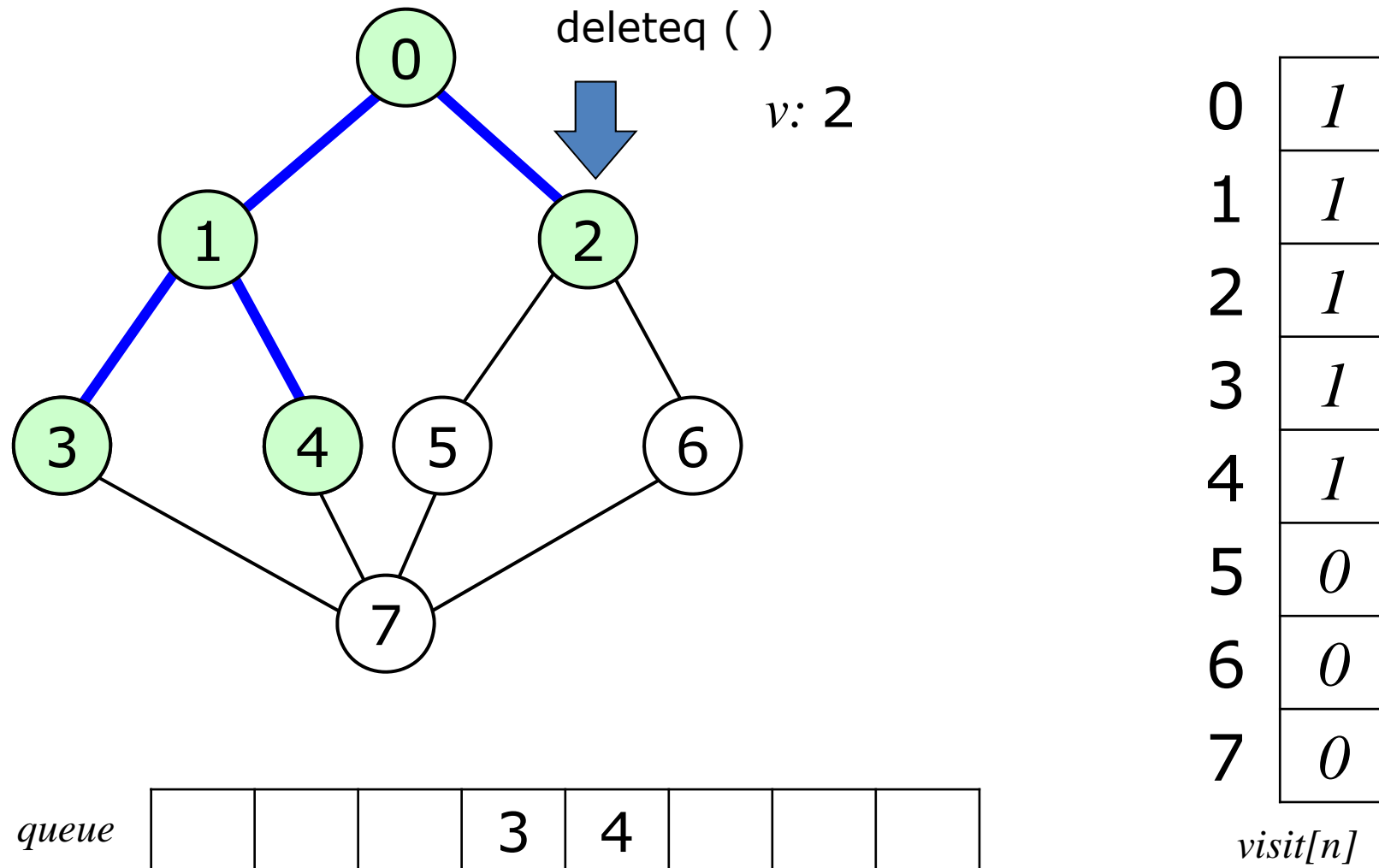
queue

		2	3	4			
--	--	---	---	---	--	--	--

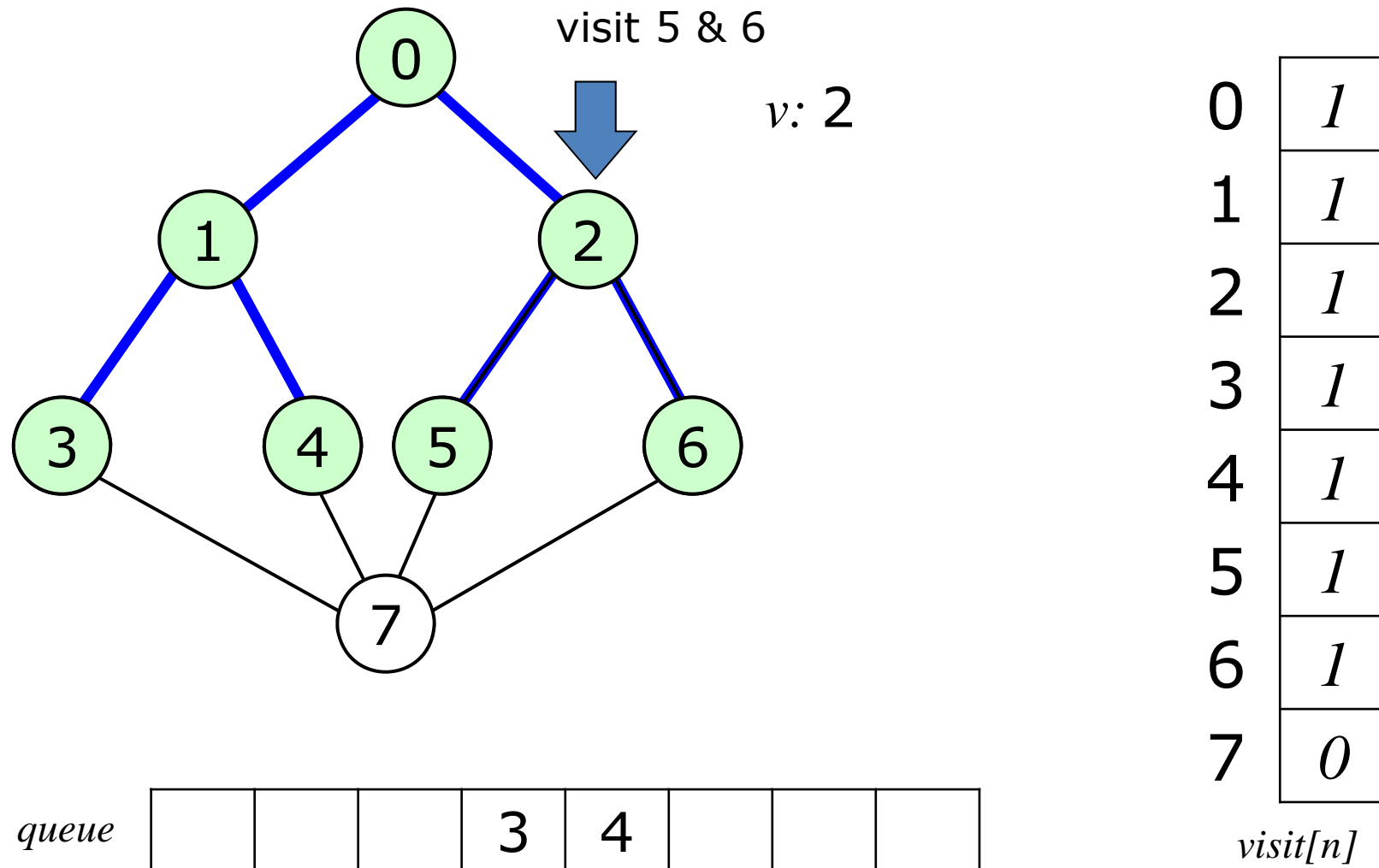
0	1
1	1
2	1
3	1
4	1
5	0
6	0
7	0

visit[n]

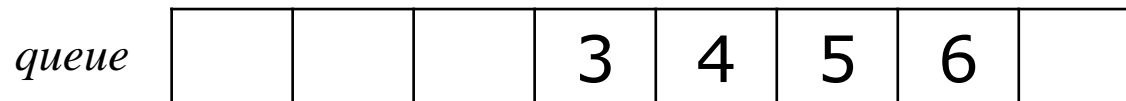
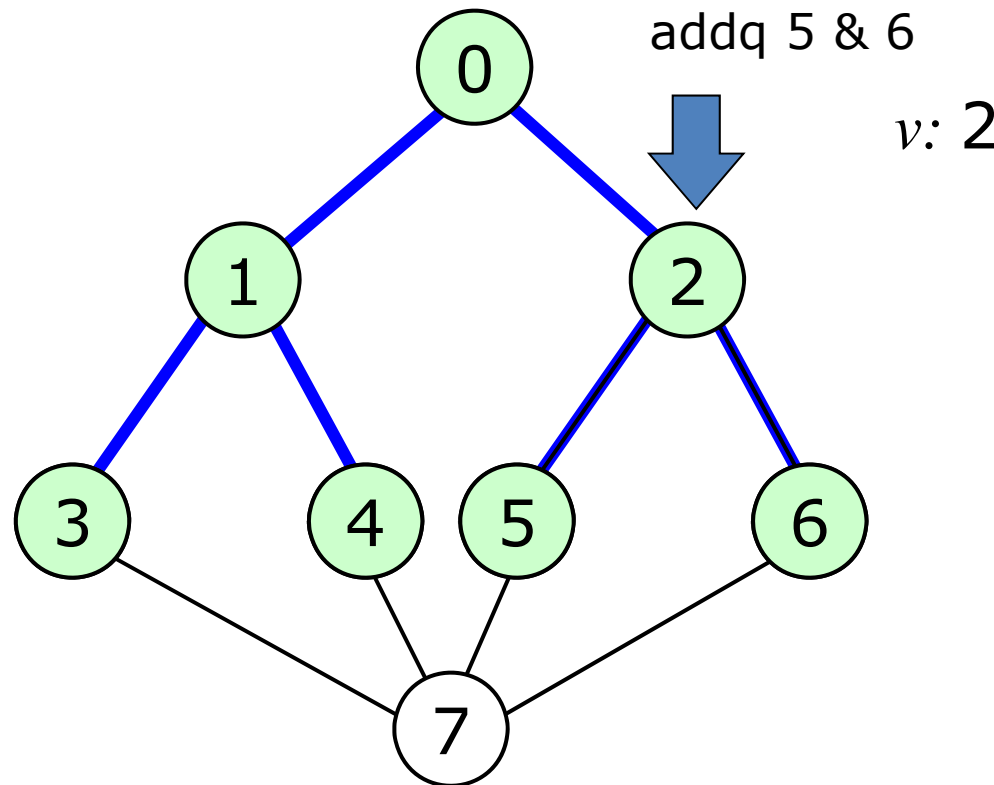
9.4.2 Breadth-First Search



9.4.2 Breadth-First Search



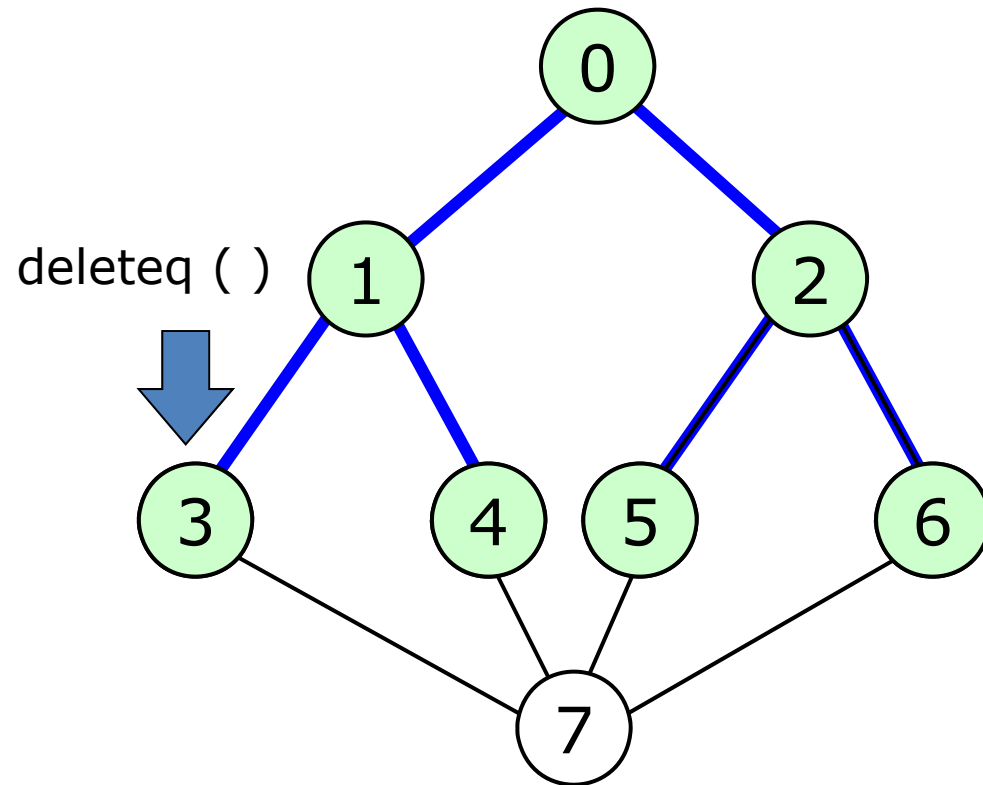
9.4.2 Breadth-First Search



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

visit[n]

9.4.2 Breadth-First Search



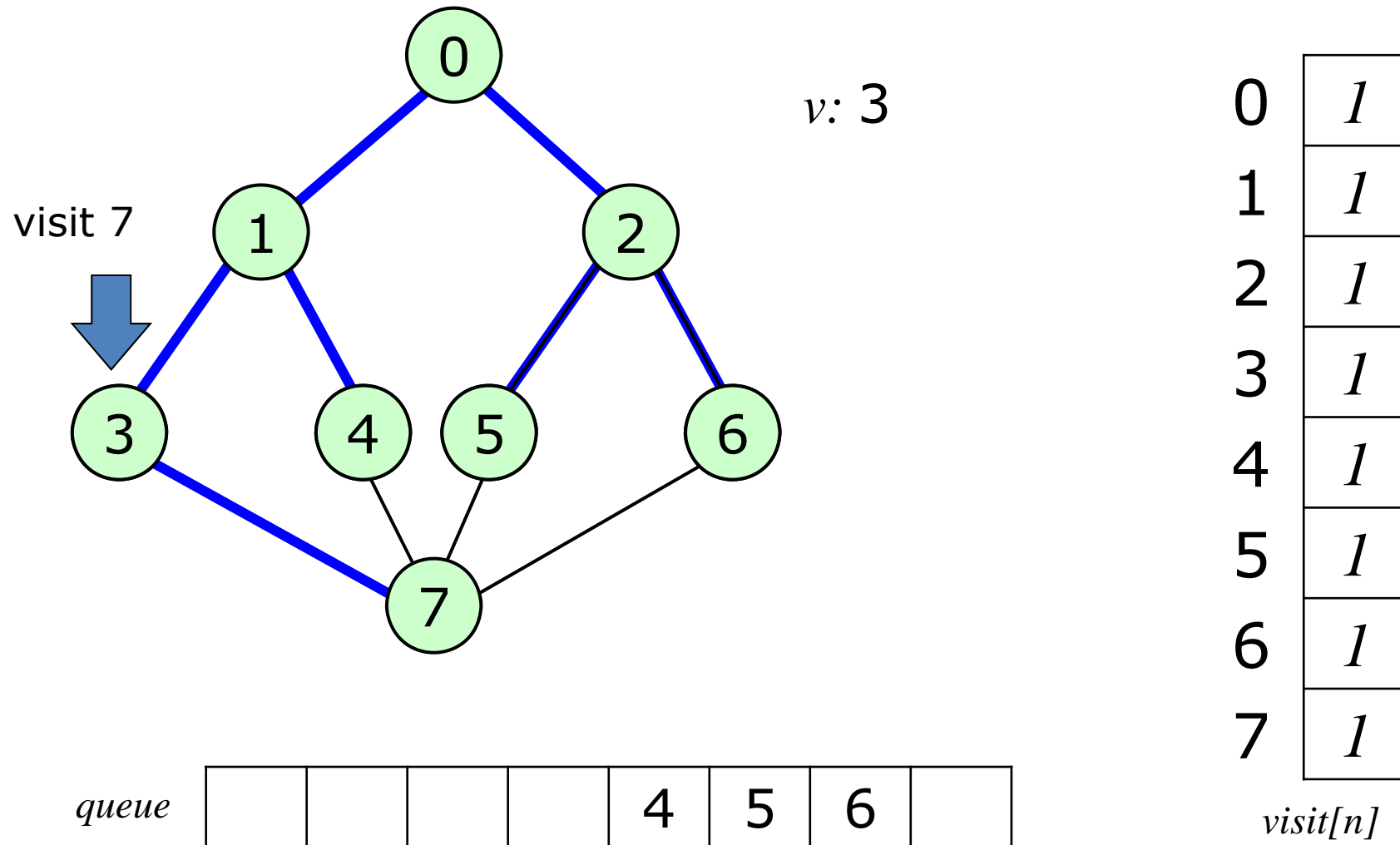
queue

				4	5	6	
--	--	--	--	---	---	---	--

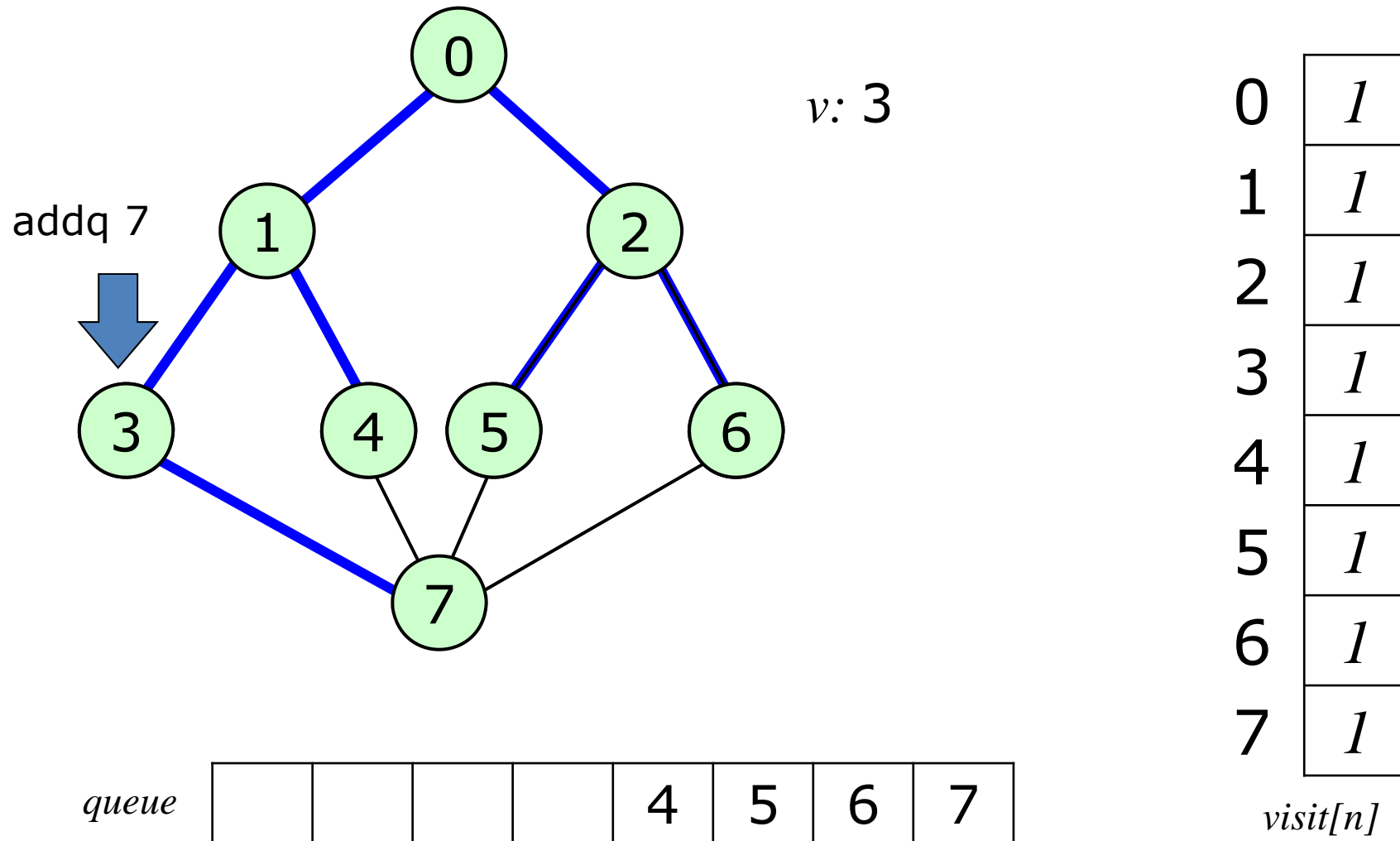
0	1
1	1
2	1
3	1
4	1
5	1
6	1
7	0

visit[n]

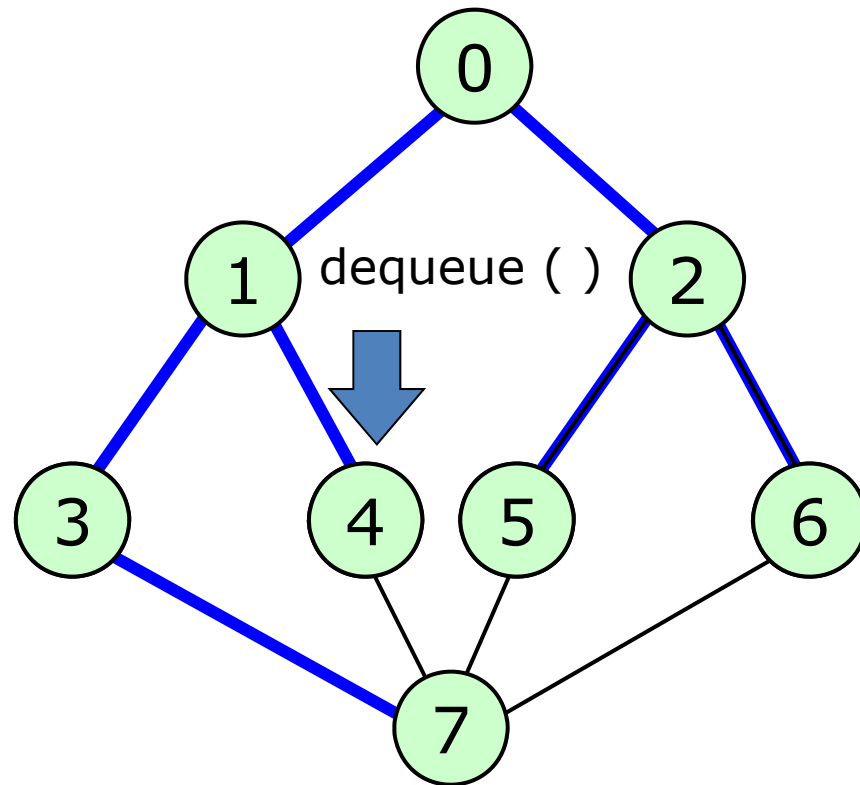
9.4.2 Breadth-First Search



9.4.2 Breadth-First Search



9.4.2 Breadth-First Search



$v: 4$

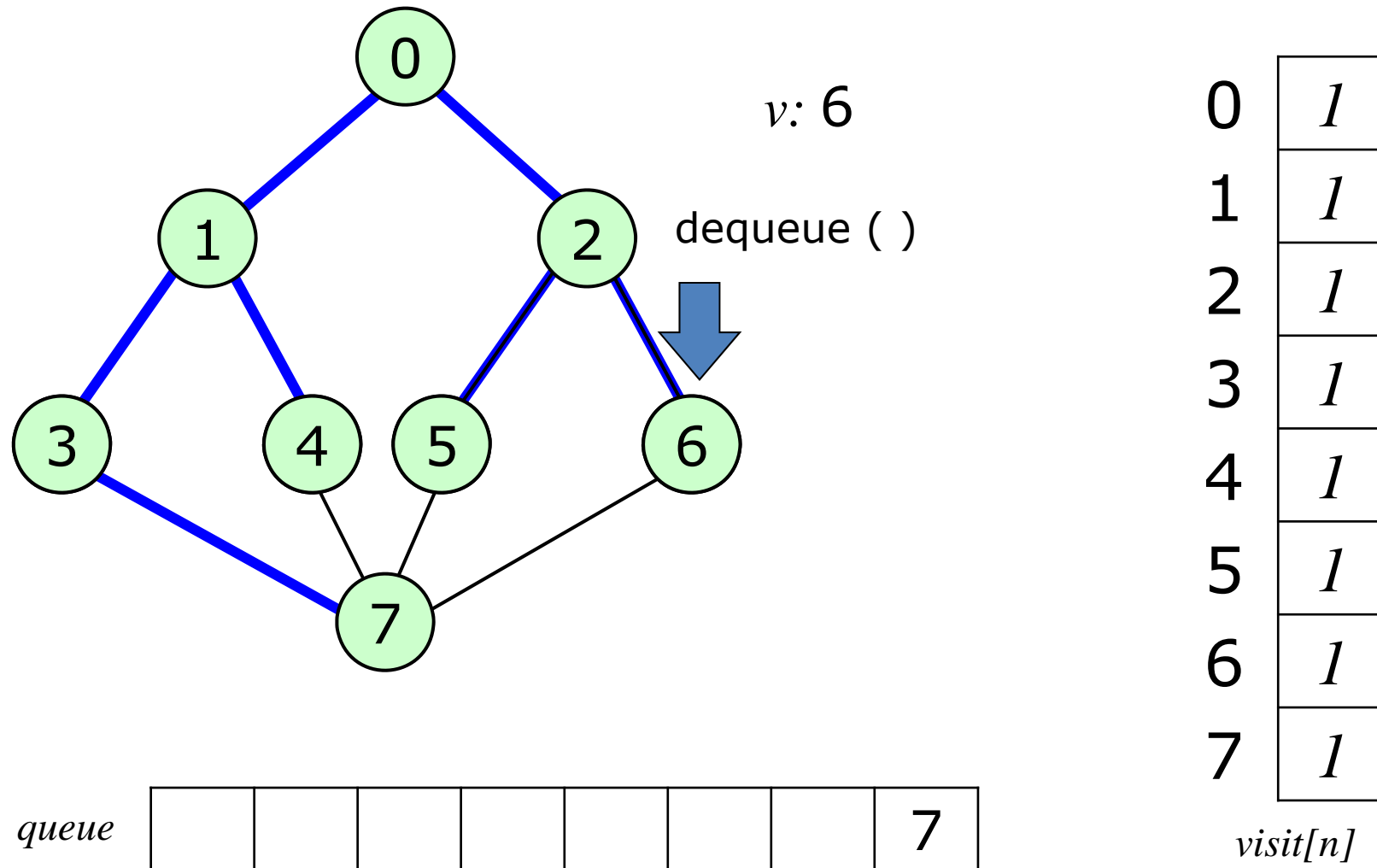
0	1
1	1
2	1
3	1
4	1
5	1
6	1
7	1

$visit[n]$

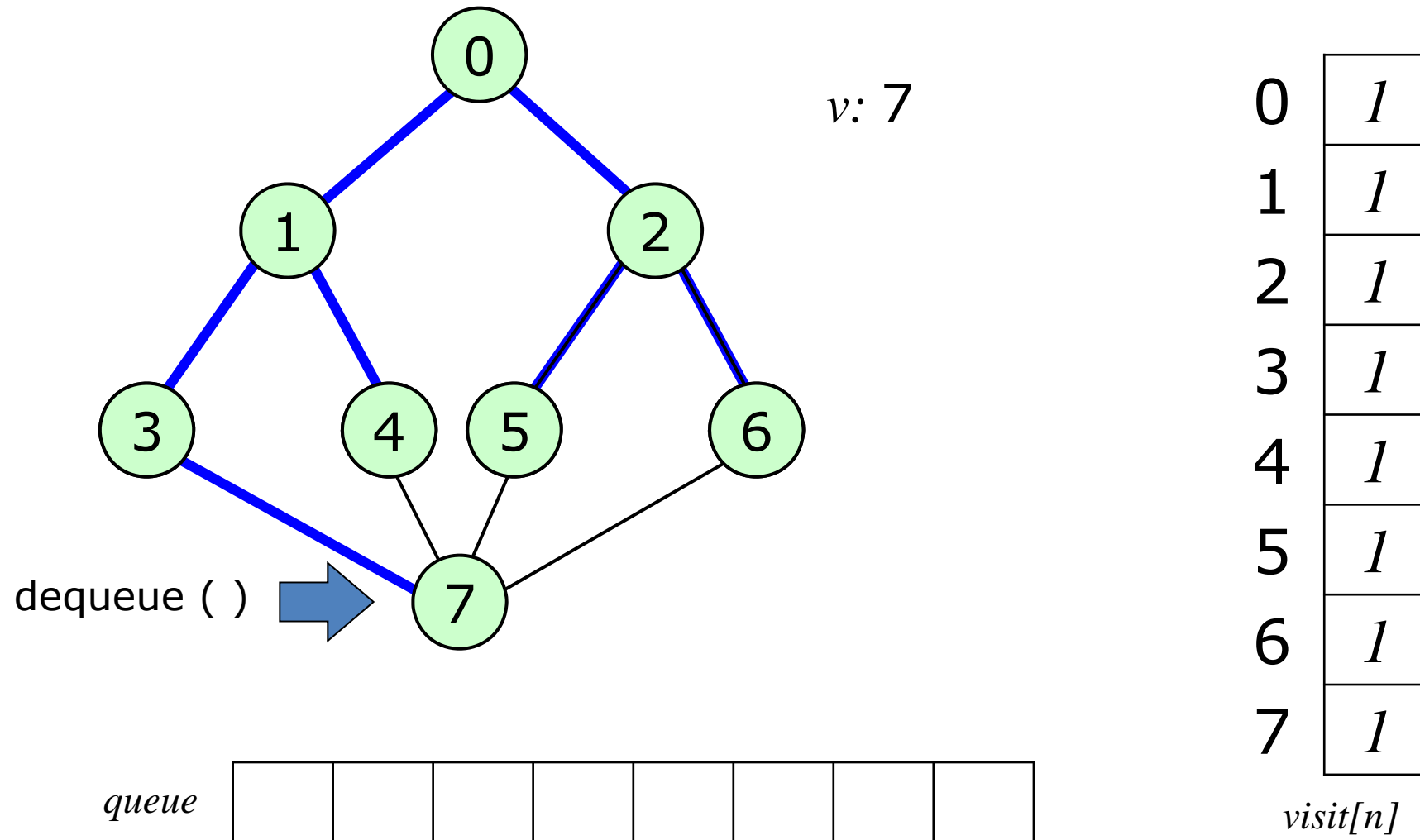
queue

					5	6	7
--	--	--	--	--	---	---	---

9.4.2 Breadth-First Search

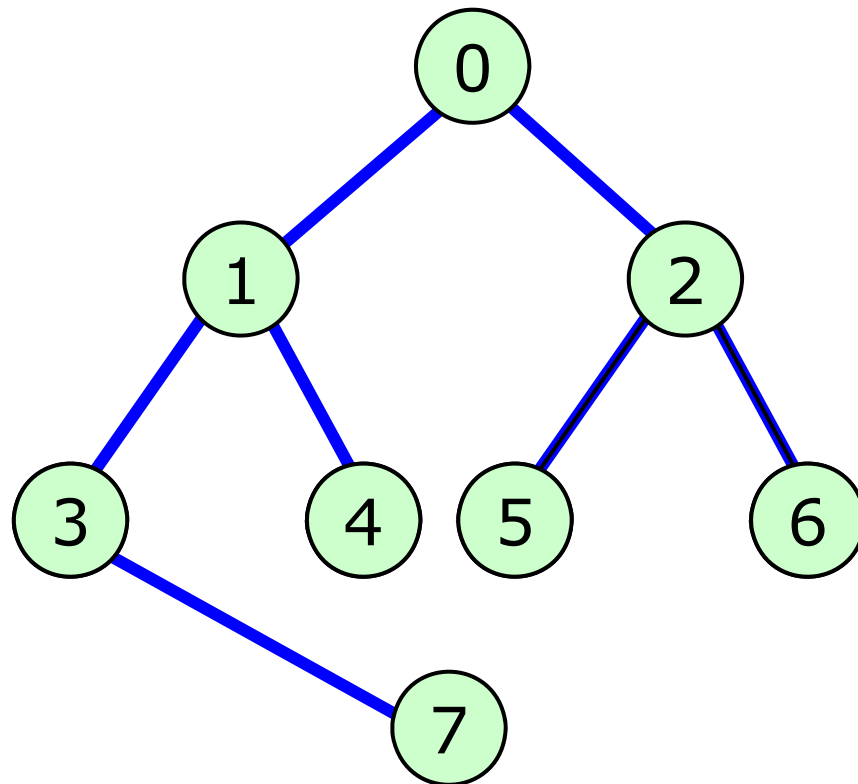


9.4.2 Breadth-First Search



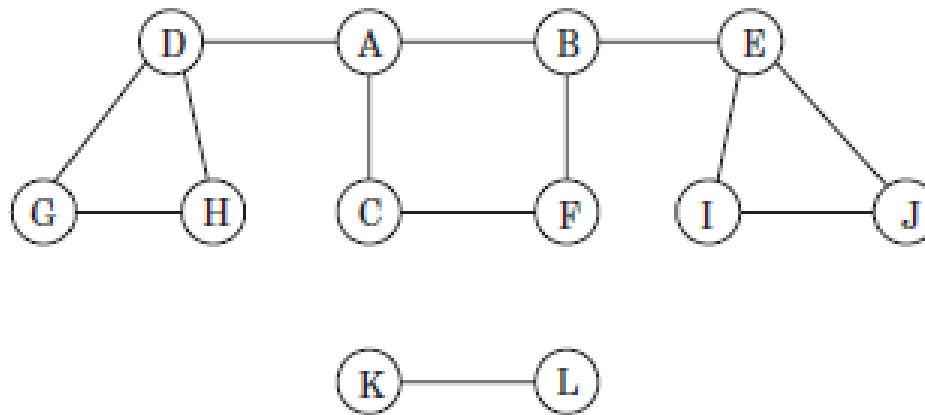
9.4.2 Breadth-First Search

- Breadth-first spanning tree



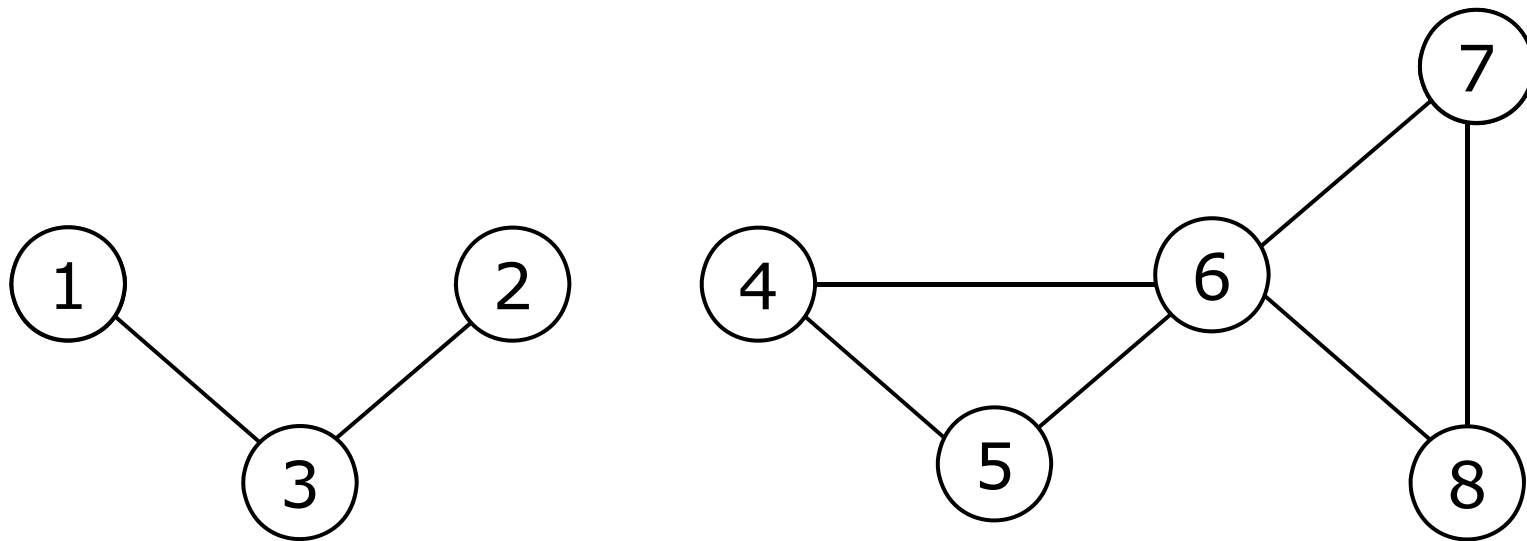
9.4.2 Breadth-First Search

- Exercise



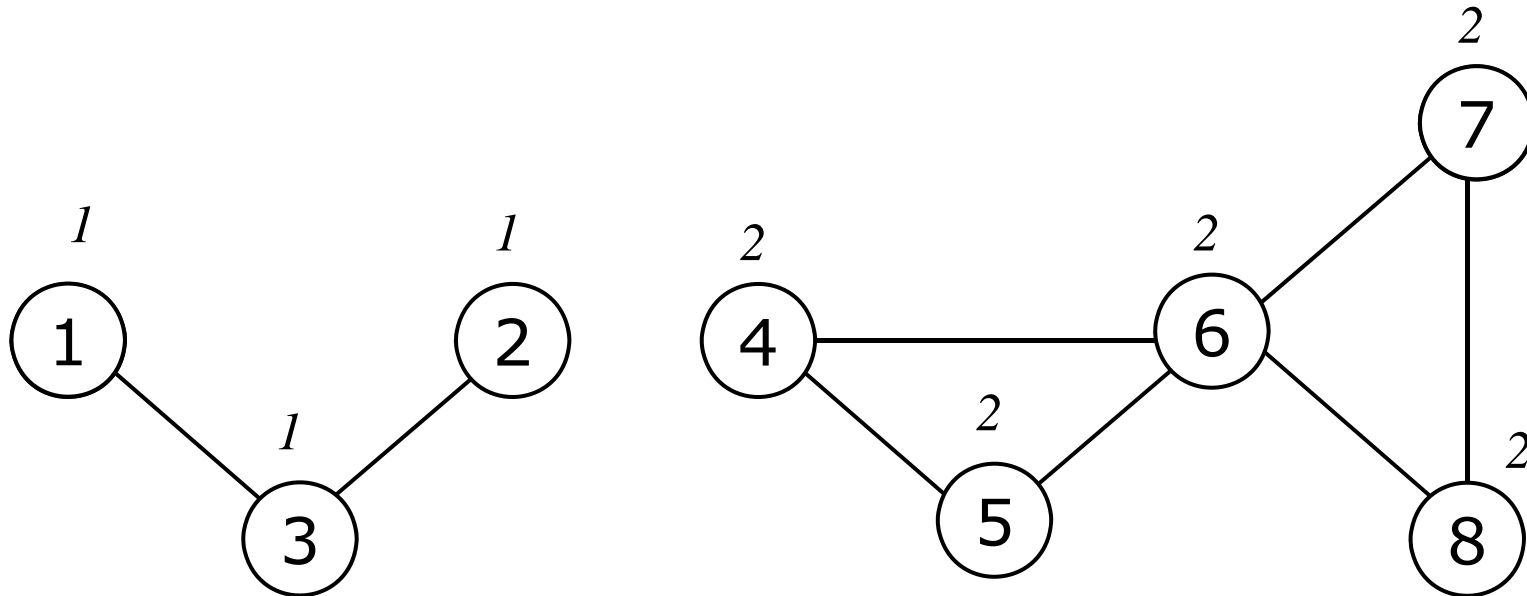
9.4.3 Connected Components

- Mark the connected components of a graph
- Ex)



9.4.3 Connected Components

- Mark the connected components of a graph
- Ex)



9.4.3 Connected Components

- Use a search algorithm to explore all the vertices in a connected component
- In calling `dfs ()` or `bfs ()`, add an index for a connected component

9.4.3 Connected Components

```
void connected ( )
{
    int i;
    int idx = 1;
    for ( i = 0; i < n; i++ ) {
        if ( !visit[i] ) {
            dfs ( i, idx );
            idx++;
        }
    }
}
```

9.4.3 Connected Components

```
void dfs ( int v, int idx )
{
    nodePointer w;
    visit[v] = TRUE;
    v->label = idx;

    for ( w = graph[v]; w; w = w->link ) {
        if ( !visit[w->vertex] )
            dfs ( w->visit, idx );
    }
}
```

9.4.4 Spanning Trees

- Spanning tree
 - No. of vertices of $G = n$
 - No. of edges of the spanning tree of $G \rightarrow (n-1)$
 - Use dfs () to create depth-first spanning tree

9.4.4 Spanning Trees

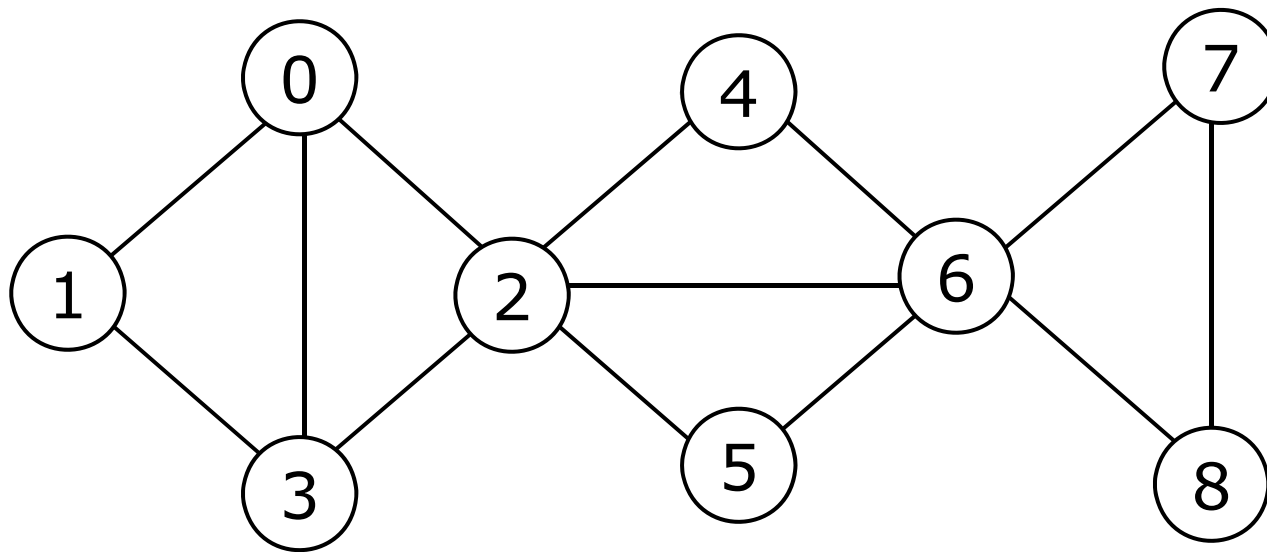
- Depth-first spanning tree

```
void dfst ( int v )
{
    nodePointer w;
    visit[v] = TRUE;

    for ( w = graph[v]; w; w = w->link ) {
        if ( !visit[w->vertex] ) {
            add (v, w) to the depth-first spanning tree;
            dfst ( w->visit );
        }
    }
}
```

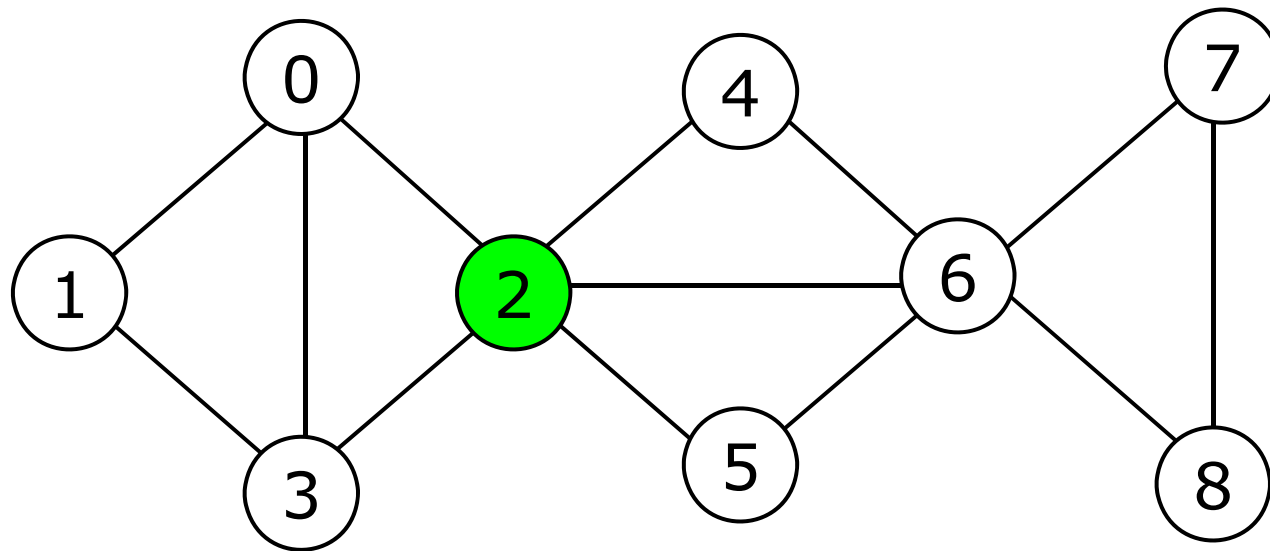
9.5 Biconnected Components

- Articulation point
 - A vertex v of G such that the deletion of v , together with all edges incident to v , produces a graph G' that has at least two connected components



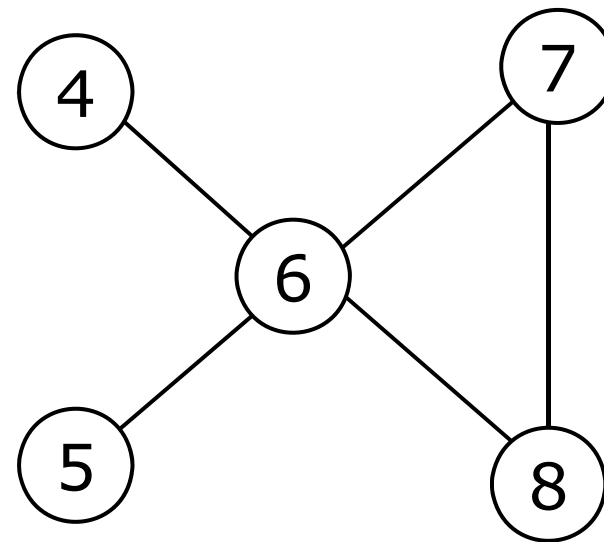
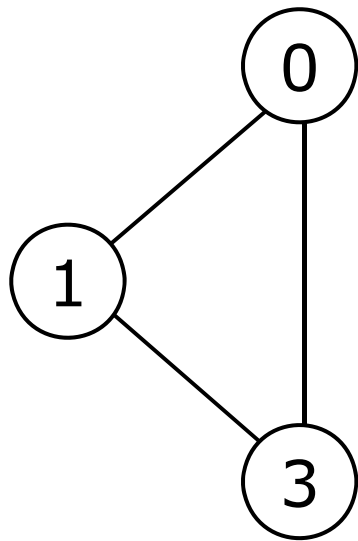
9.5 Biconnected Components

- Articulation point
 - A vertex v of G such that the deletion of v , together with all edges incident to v , produces a graph G' that has at least two connected components



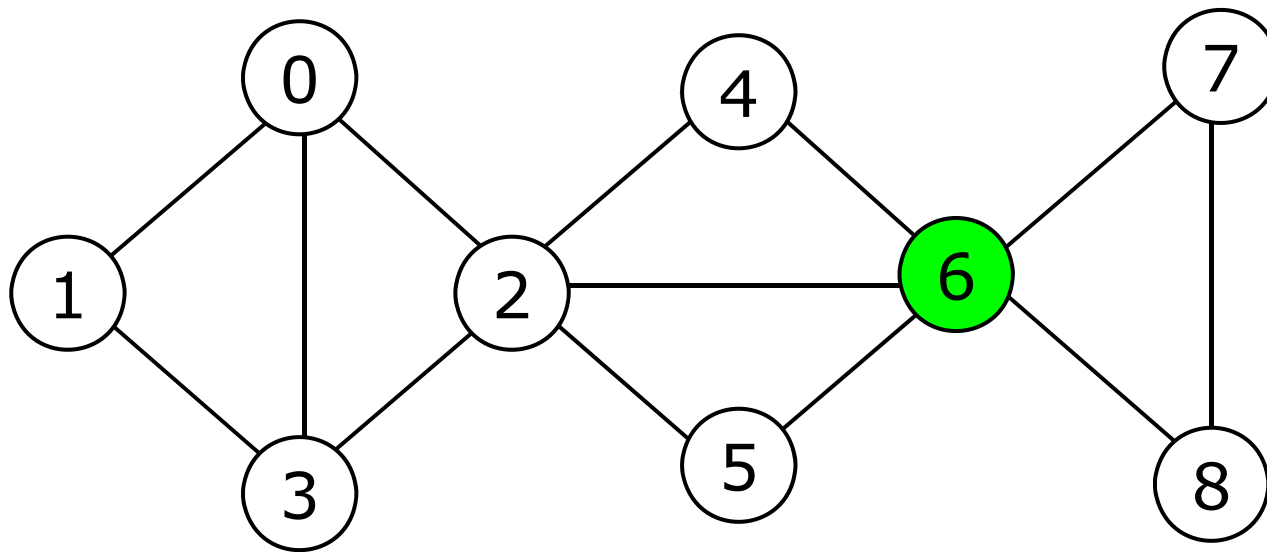
9.5 Biconnected Components

- Articulation point
 - A vertex v of G such that the deletion of v , together with all edges incident to v , produces a graph G' that has at least two connected components



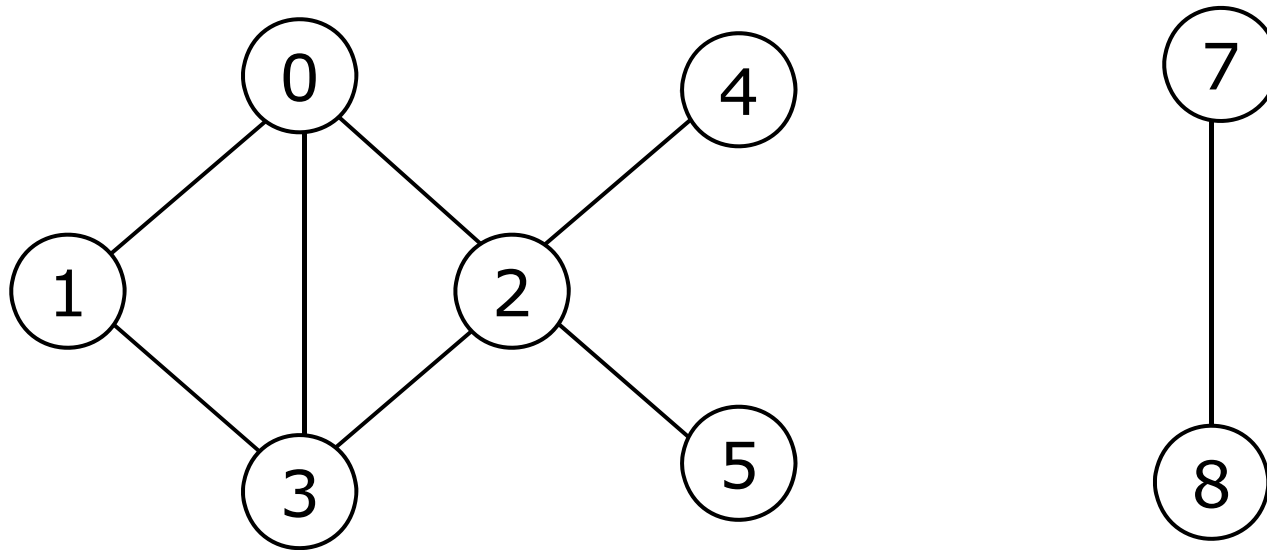
9.5 Biconnected Components

- Articulation point
 - A vertex v of G such that the deletion of v , together with all edges incident to v , produces a graph G' that has at least two connected components



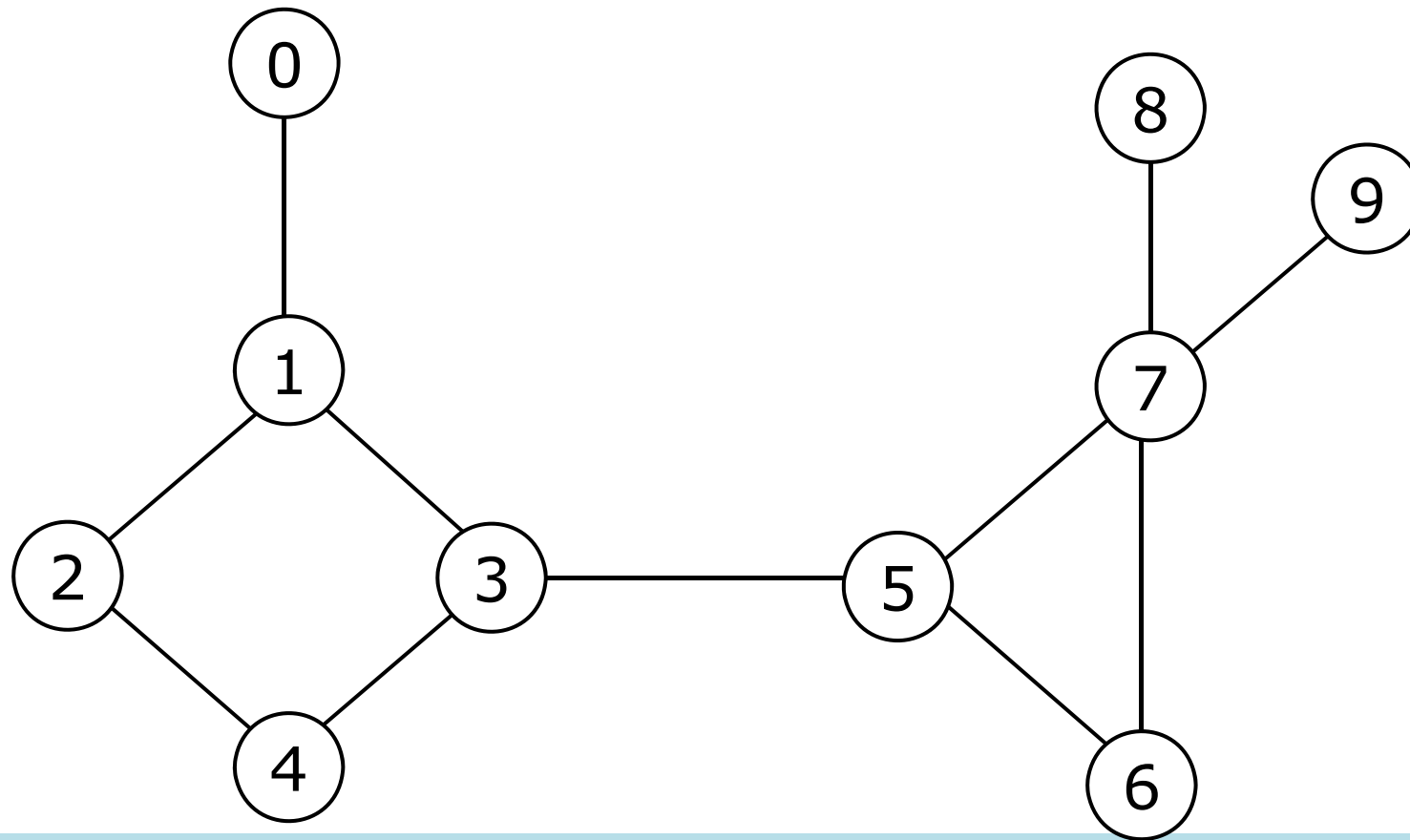
9.5 Biconnected Components

- Articulation point
 - A vertex v of G such that the deletion of v , together with all edges incident to v , produces a graph G' that has at least two connected components



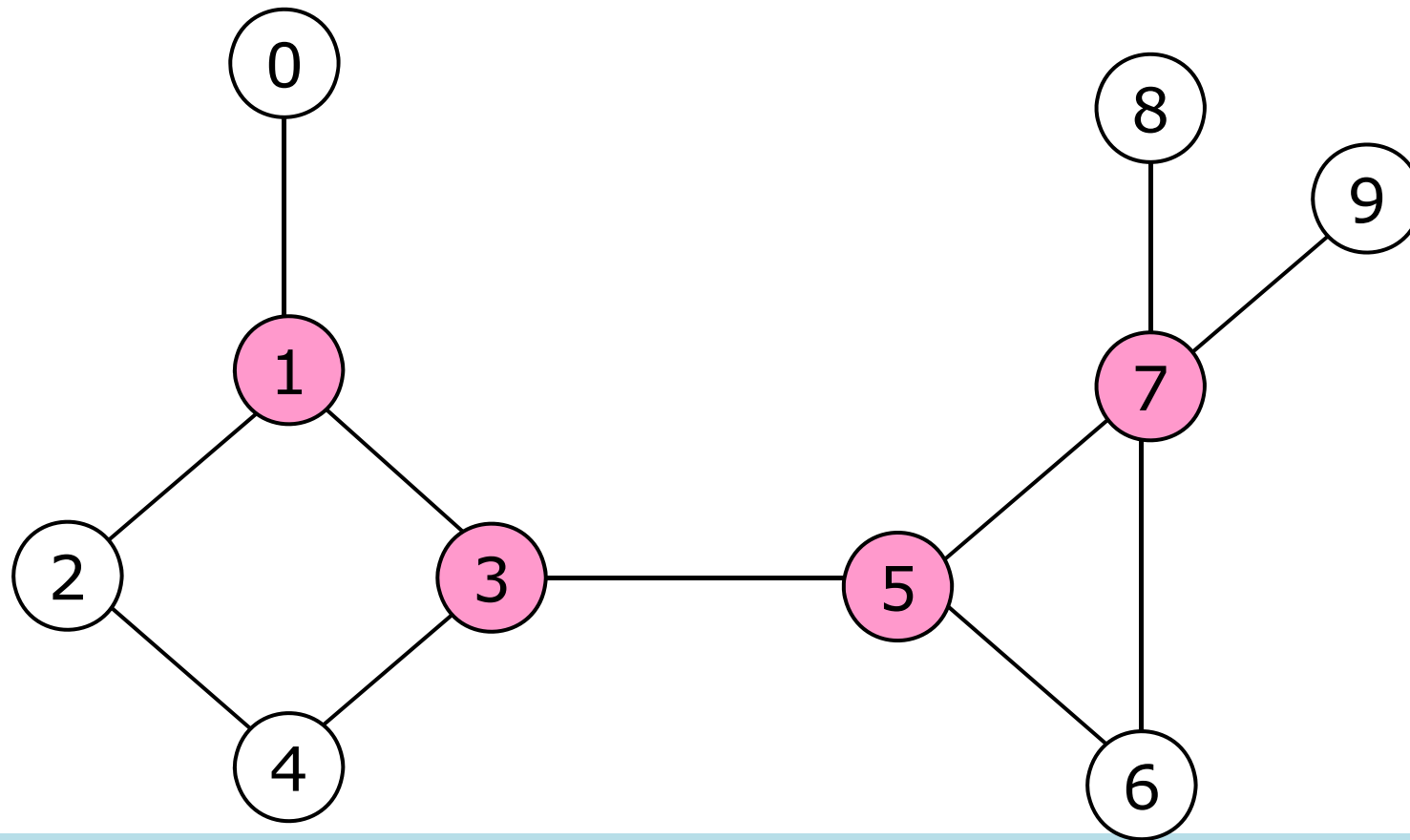
9.5 Biconnected Components

- Ex) What is the articulation point on this graph?



9.5 Biconnected Components

- Ex) What is the articulation point on this graph?

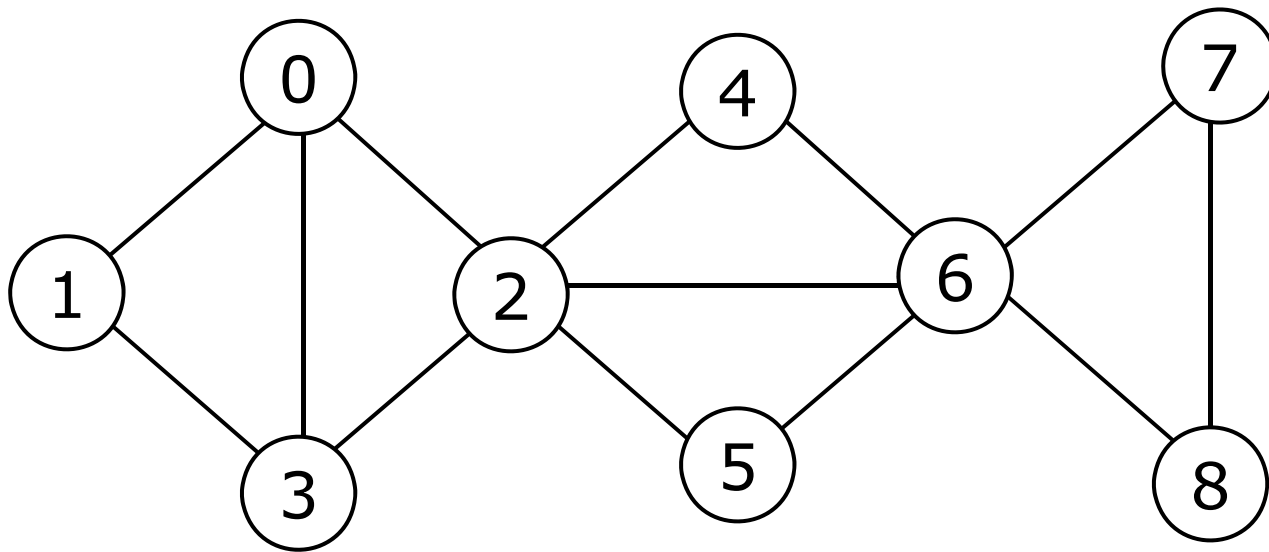


9.5 Biconnected Components

- Biconnected graph
 - A connected graph that has no articulation points

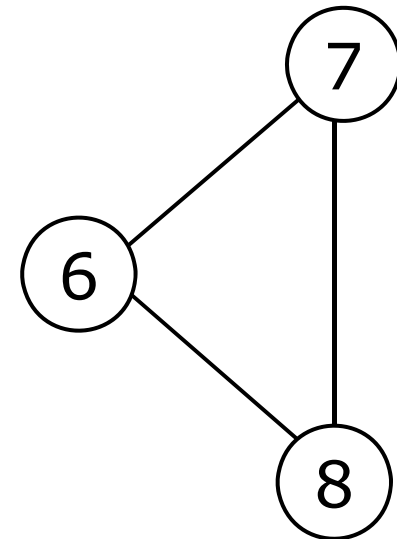
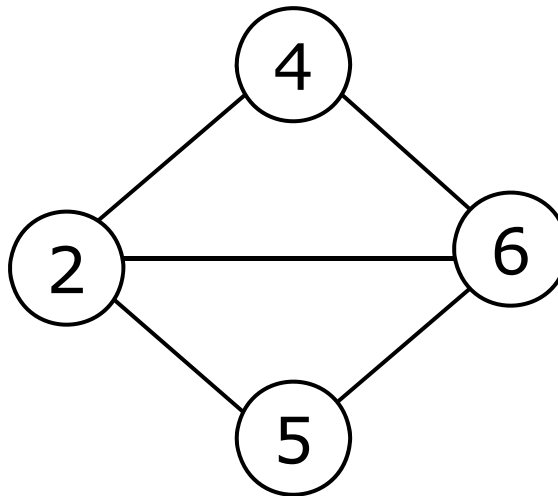
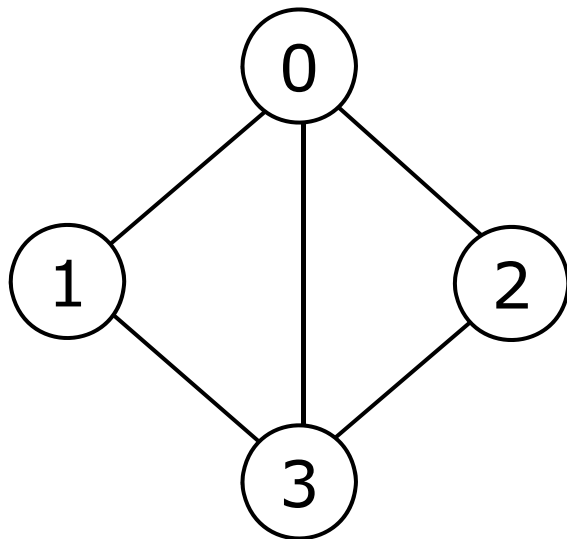
9.5 Biconnected Components

- Biconnected component
 - A maximal biconnected subgraph



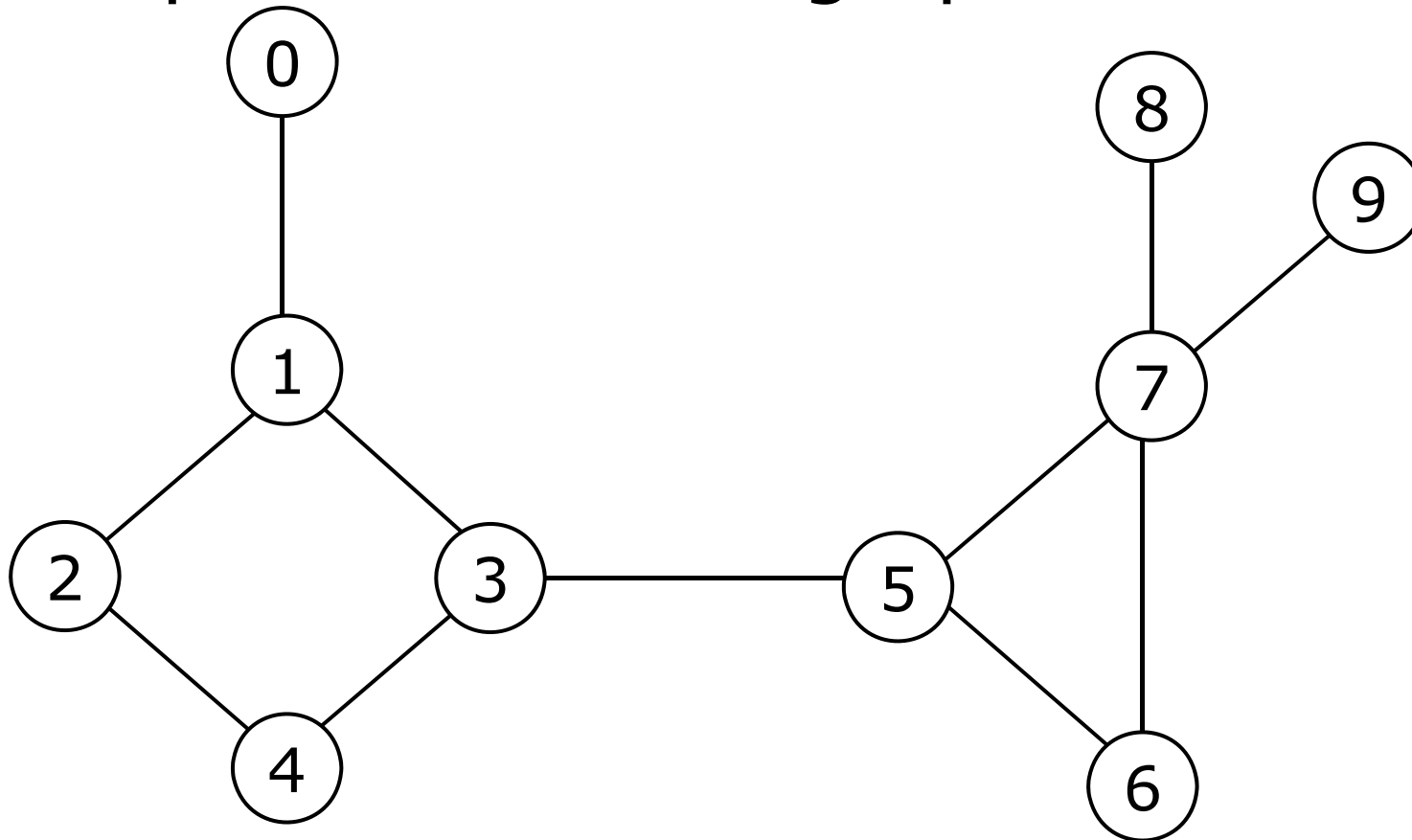
9.5 Biconnected Components

- Biconnected component
 - A maximal biconnected subgraph



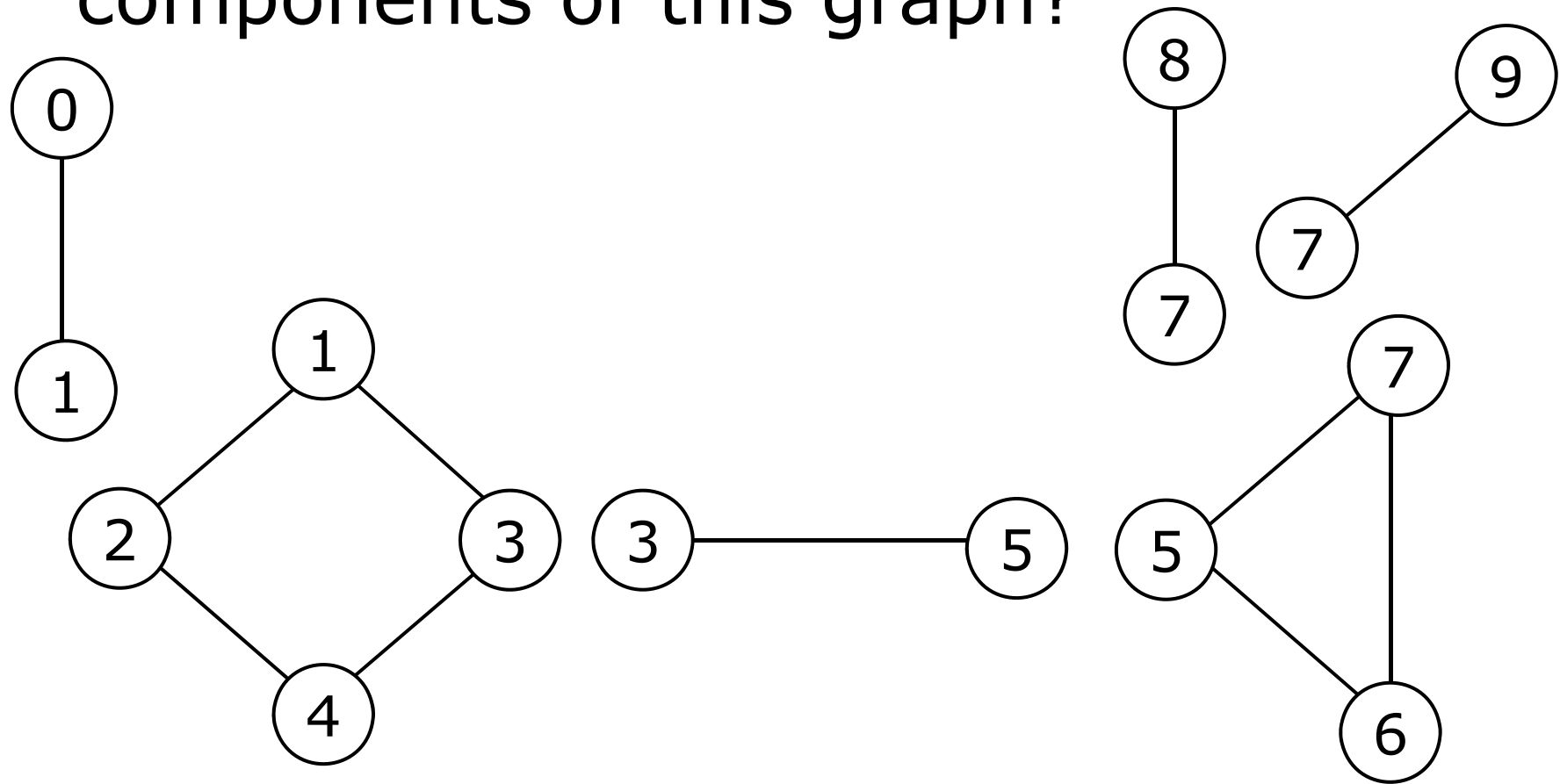
9.5 Biconnected Components

- Ex) What are the biconnected components of this graph?



9.5 Biconnected Components

- Ex) What are the biconnected components of this graph?



9.5 Biconnected Components

- Steps to compute biconnected components
 - (1) Computing articulation points
 - ① computing dfn
 - ② finding back edge
 - ③ definition of articulation point
 - ④ computing articulation points
 - (2) Decomposition of a graph into biconnected components using articulation points

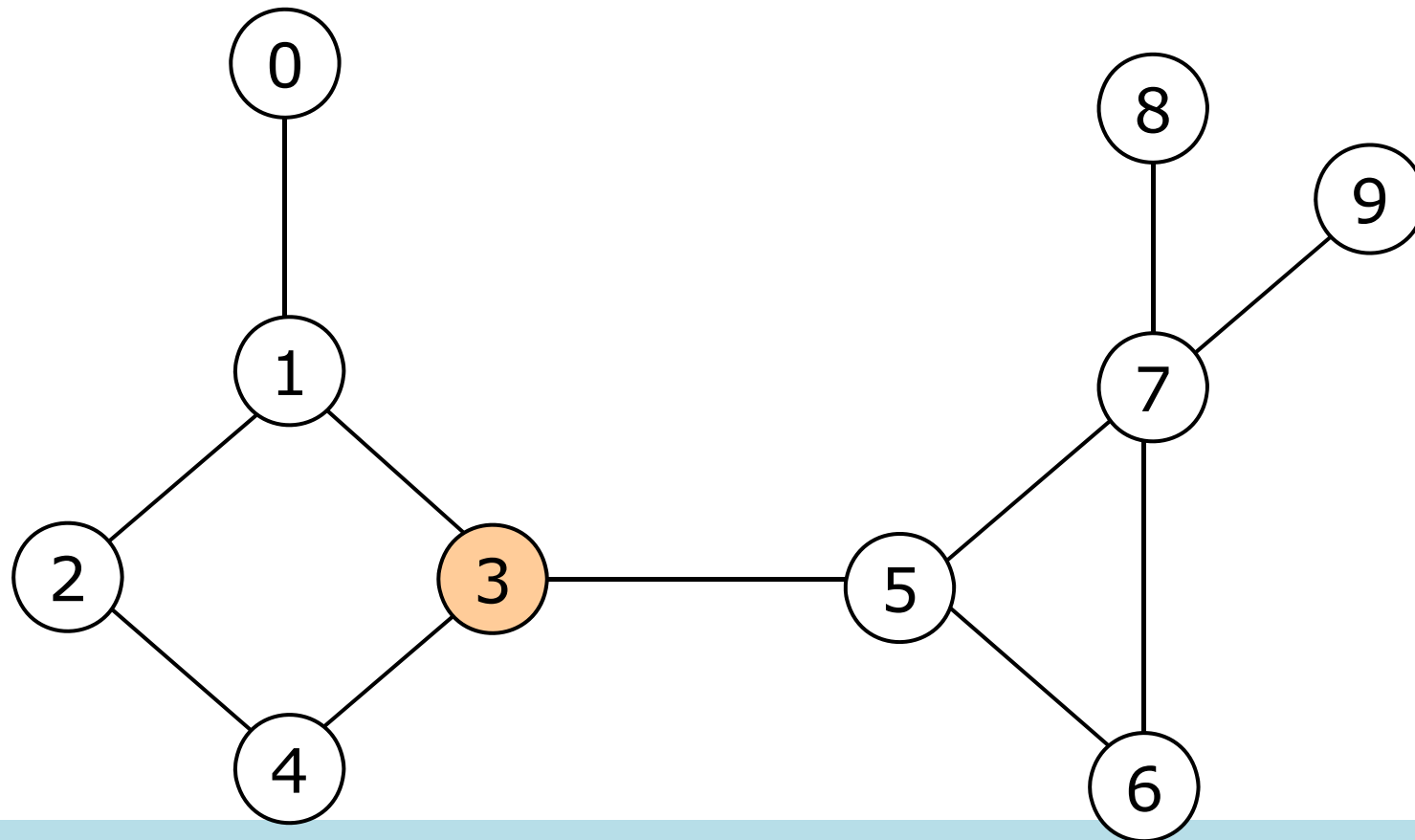
9.5 Biconnected Components

① computing dfn

- dfn: depth-first number
- computed by depth-first search
- dfn of a vertex
 - The sequence in which the vertices are visited during depth-first search

9.5 Biconnected Components

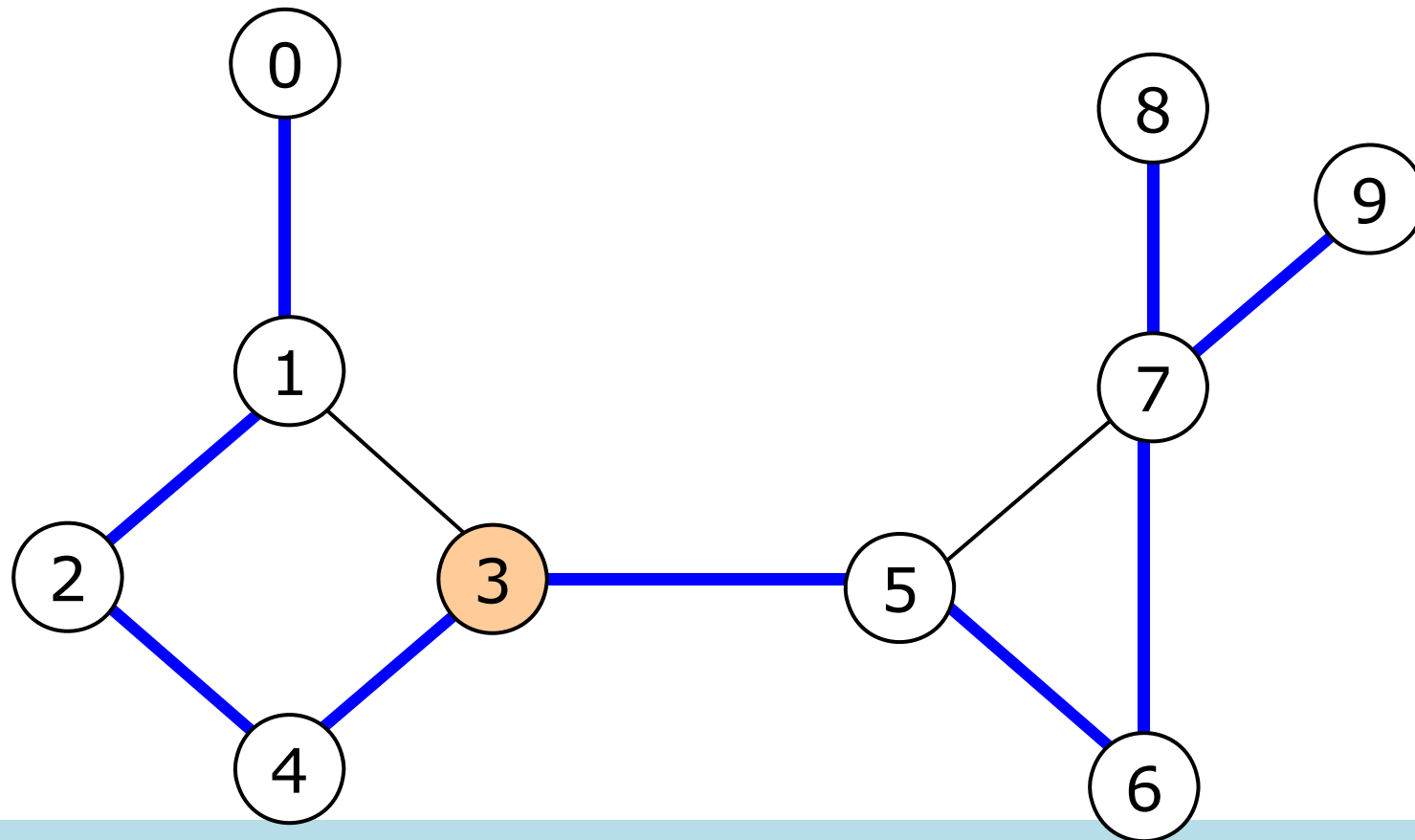
- Ex) What is dfn, if 3 is a root of depth-first spanning tree?



① computing dfn

9.5 Biconnected Components

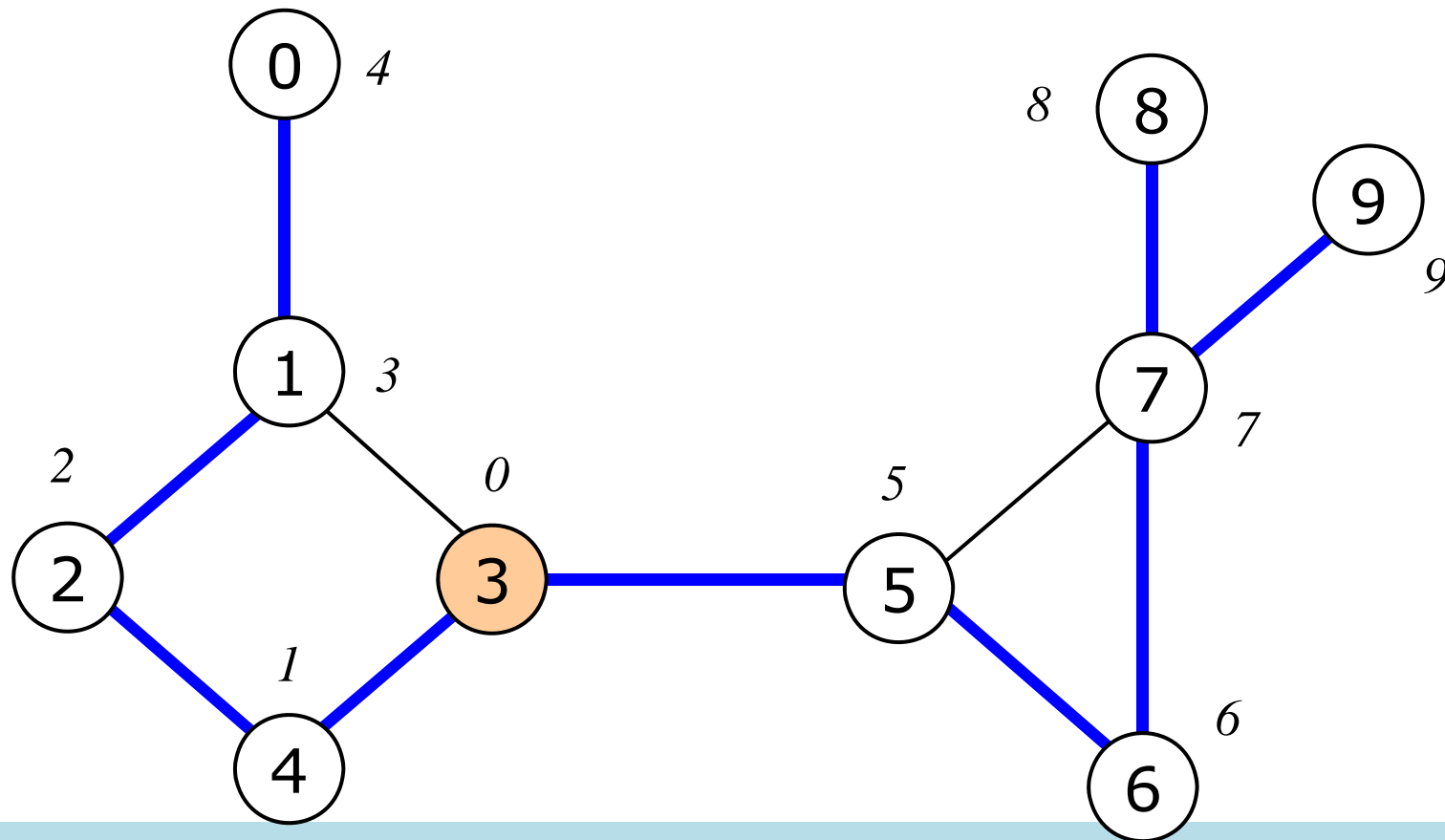
- Ex) What is dfn, if 3 is a root of depth-first spanning tree?



① computing dfn

9.5 Biconnected Components

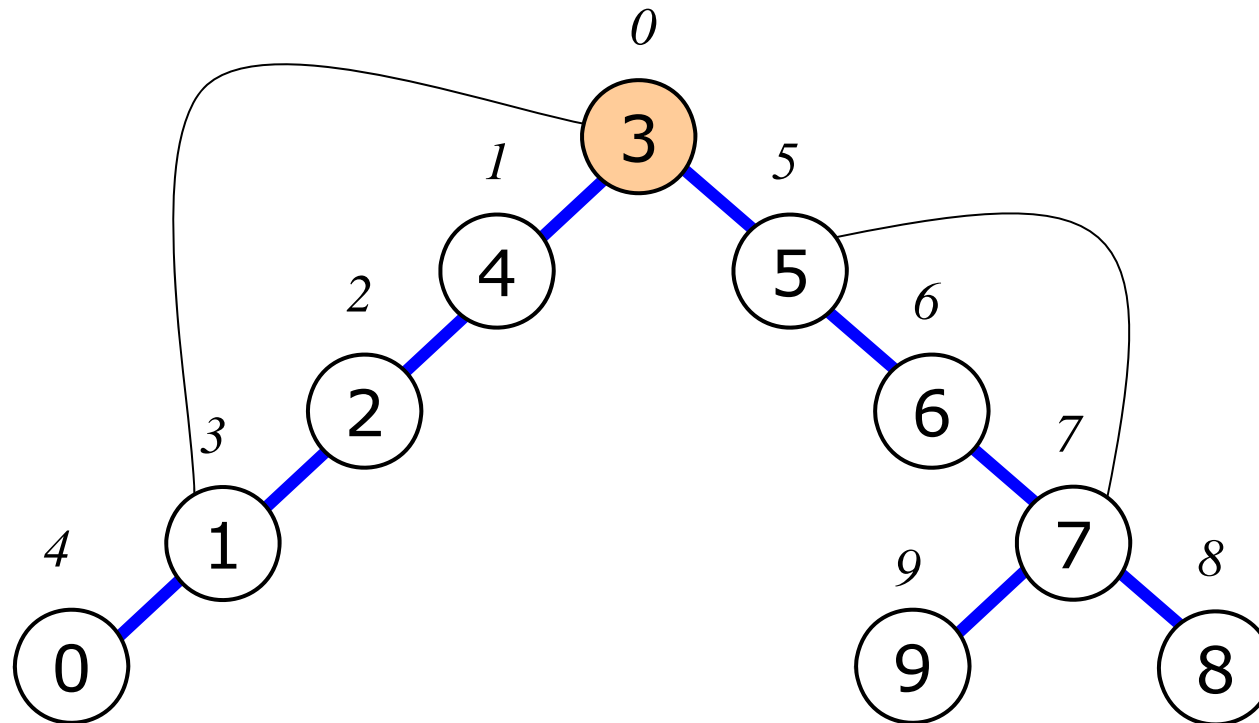
- Ex) What is dfn, if 3 is a root of depth-first spanning tree?



① computing dfn

9.5 Biconnected Components

- Ex) What is dfn, if 3 is a root of depth-first spanning tree?



9.5 Biconnected Components

- Property of dfn
 - u is an ancestor of v in the depth-first spanning tree $\rightarrow \text{dfn}(u) < \text{dfn}(v)$
 - Ex) Vertex 4 is the ancestor of vertex 1
 $\rightarrow \text{dfn}(4) = 1 < \text{dfn}(1) = 3$

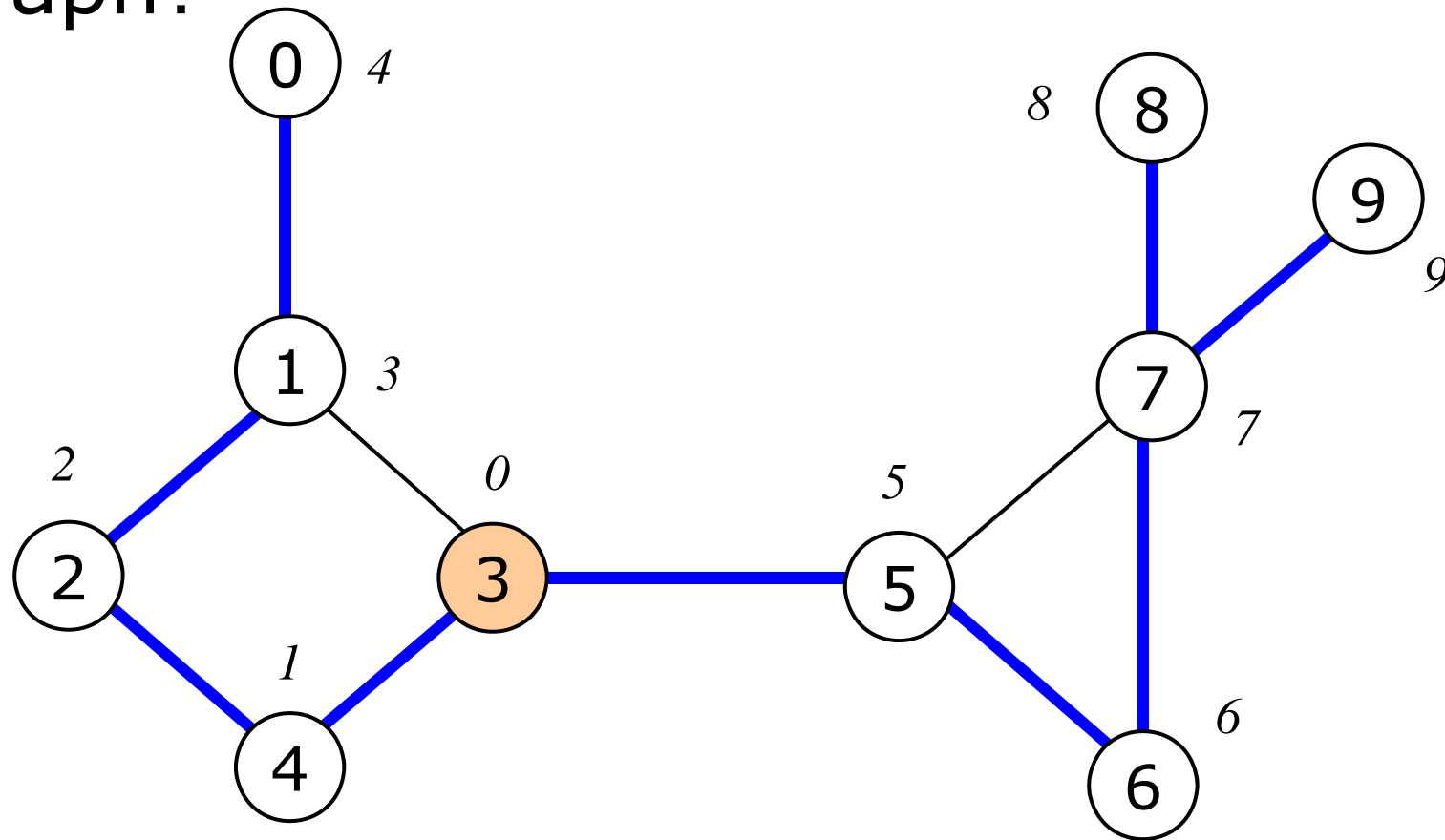
9.5 Biconnected Components

② Back edge

- Edges in G = edges in the spanning tree + nontree edges
- Back edge:
 - A nontree edge (u, v) , if u is an ancestor of v or vice versa
- In depth-first spanning tree, all the nontree edges are back edges

9.5 Biconnected Components

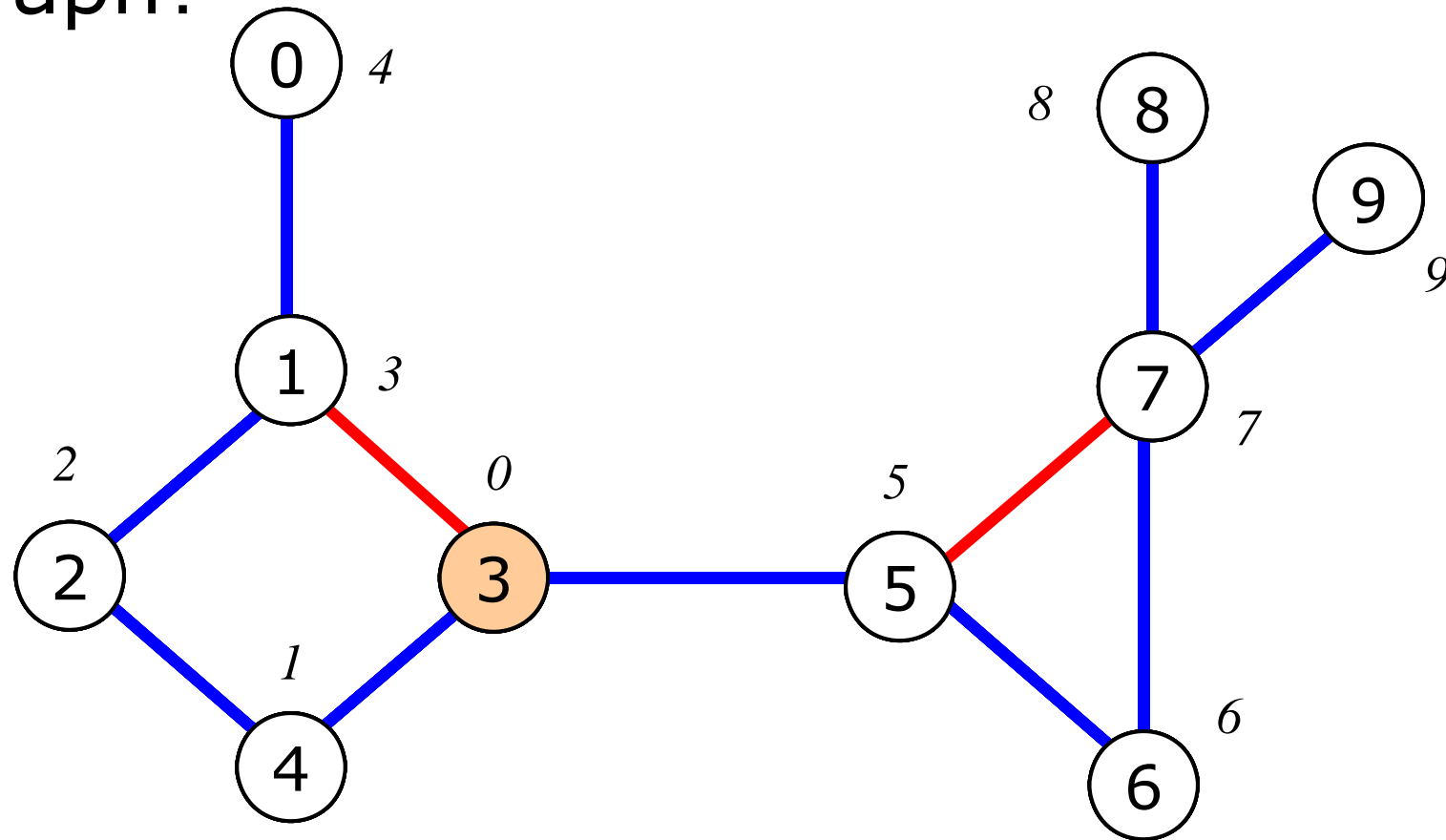
- Ex) What are the back edges of this graph?



② back edge

9.5 Biconnected Components

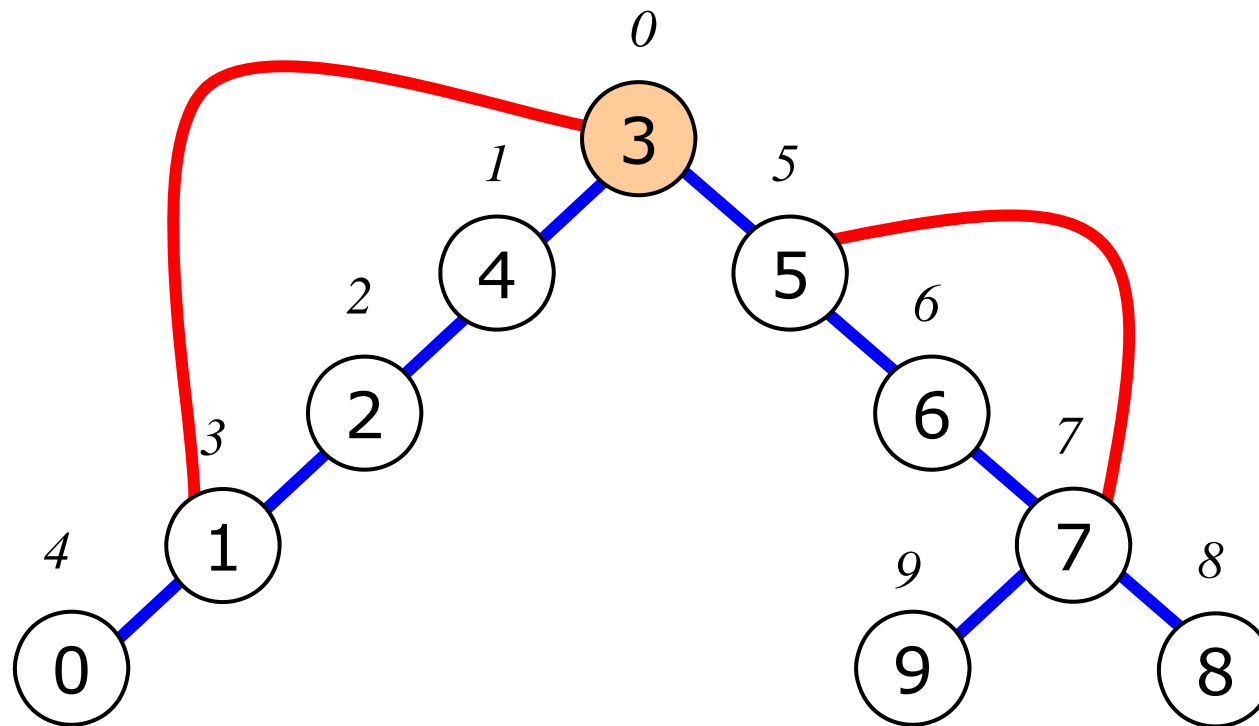
- Ex) What are the back edges of this graph?



② back edge

9.5 Biconnected Components

- Ex) What are the back edges of this graph?



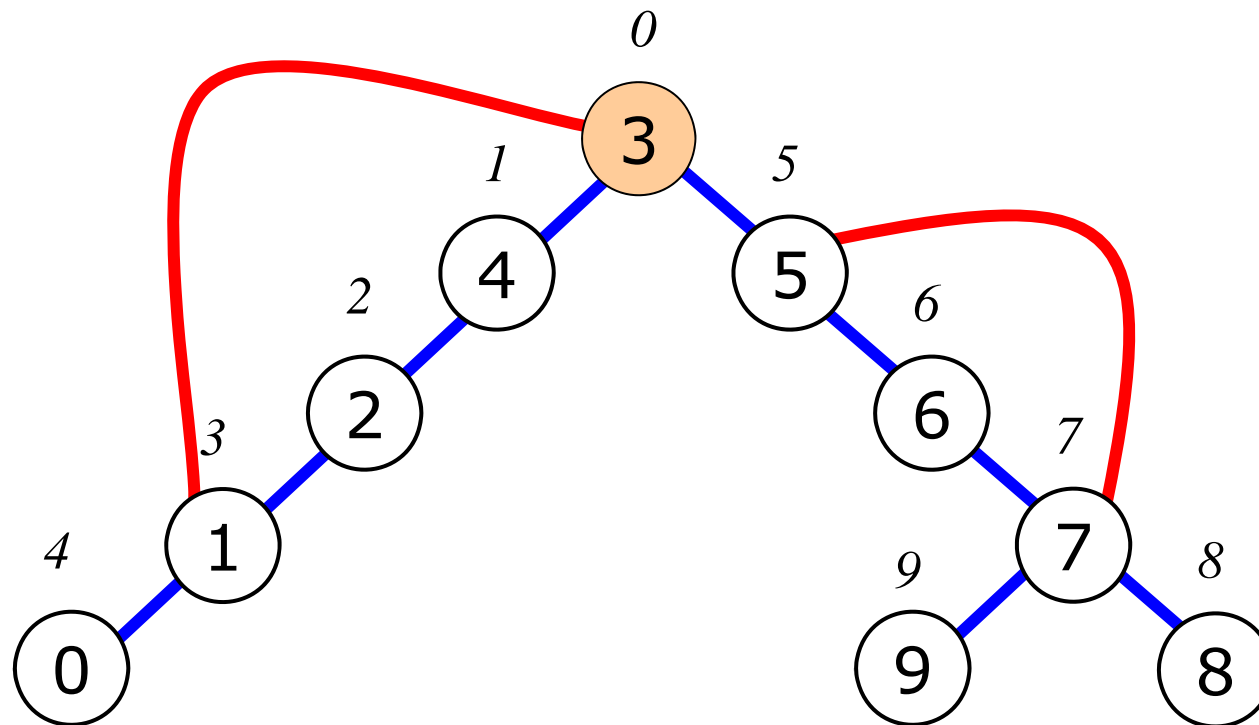
② back edge

9.5 Biconnected Components

- ③ Definition of articulation point (1)
 - A root of a depth-first spanning tree is an articulation point, if it has at least two childs

9.5 Biconnected Components

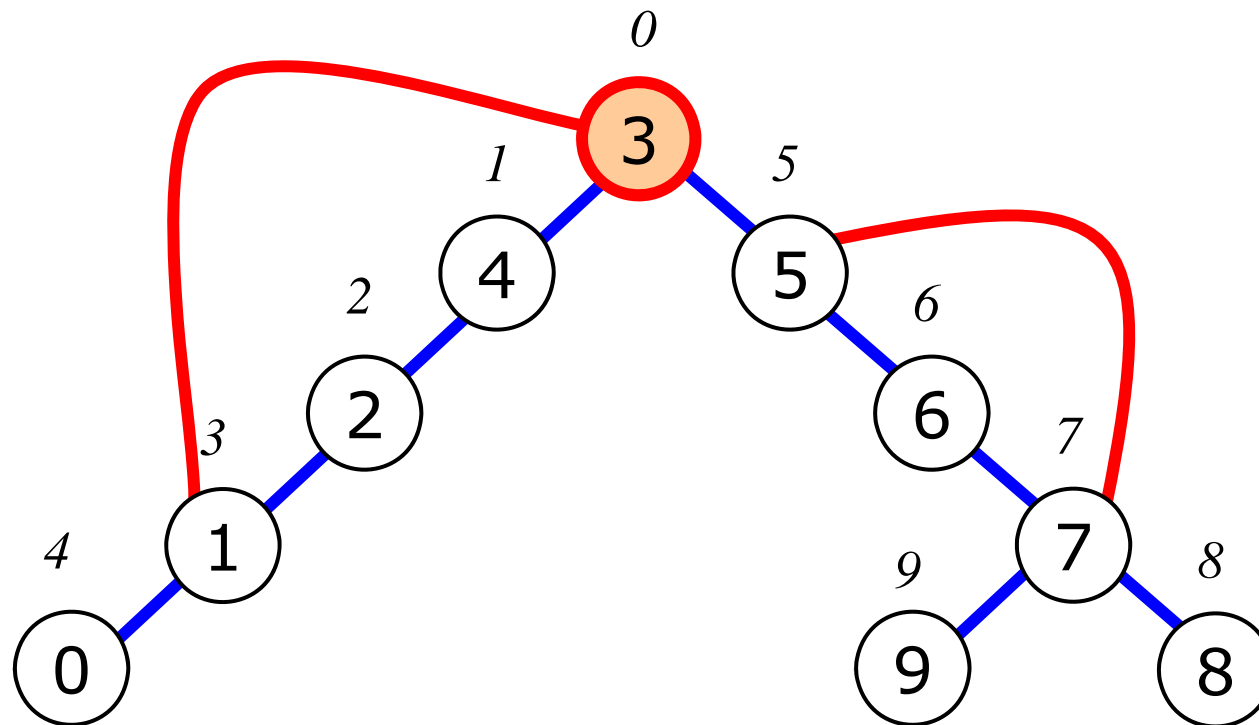
- Articulation points
 - Ex) What are the articulation points?



③ Definition of articulation point

9.5 Biconnected Components

- Articulation points
 - Ex)



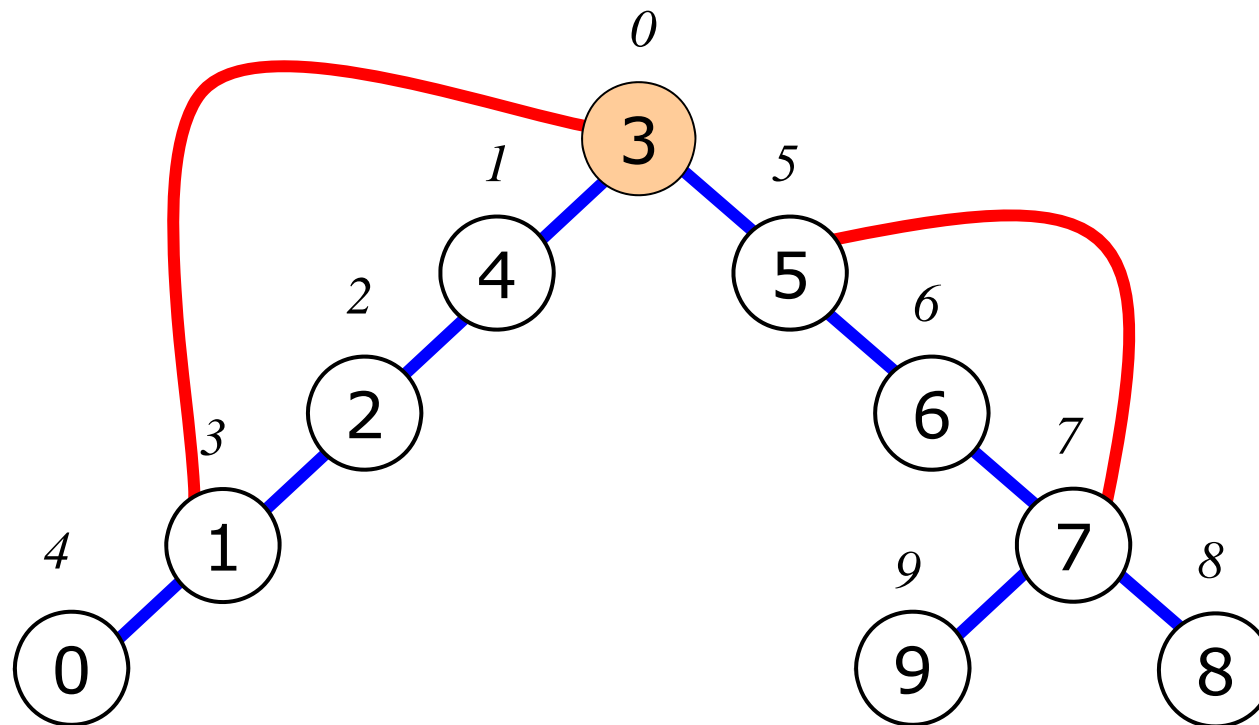
③ Definition of articulation point

9.5 Biconnected Components

- ③ Definition of articulation point (2)
 - A vertex u , if it has at least one child w such that a path (w , descendants of w , and a single back edge, ancestor of u) does not exist

9.5 Biconnected Components

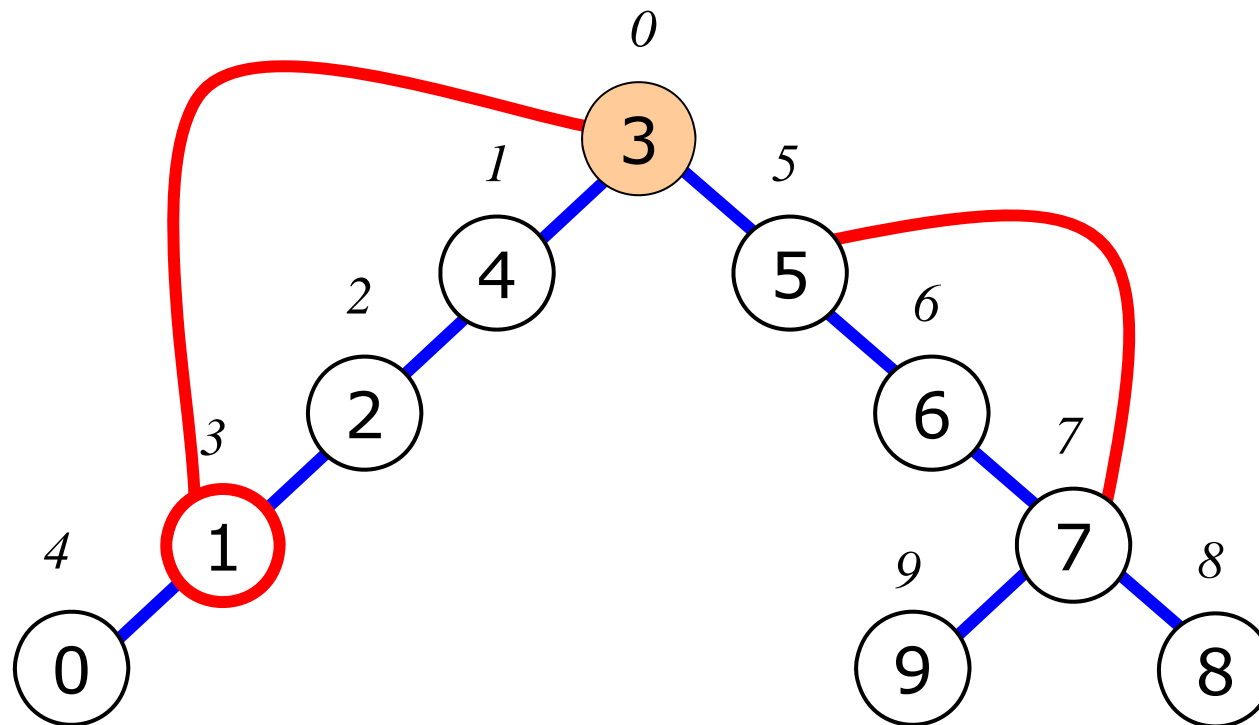
- Ex) Is vertex 4 an articulation point?



③ Definition of articulation point

9.5 Biconnected Components

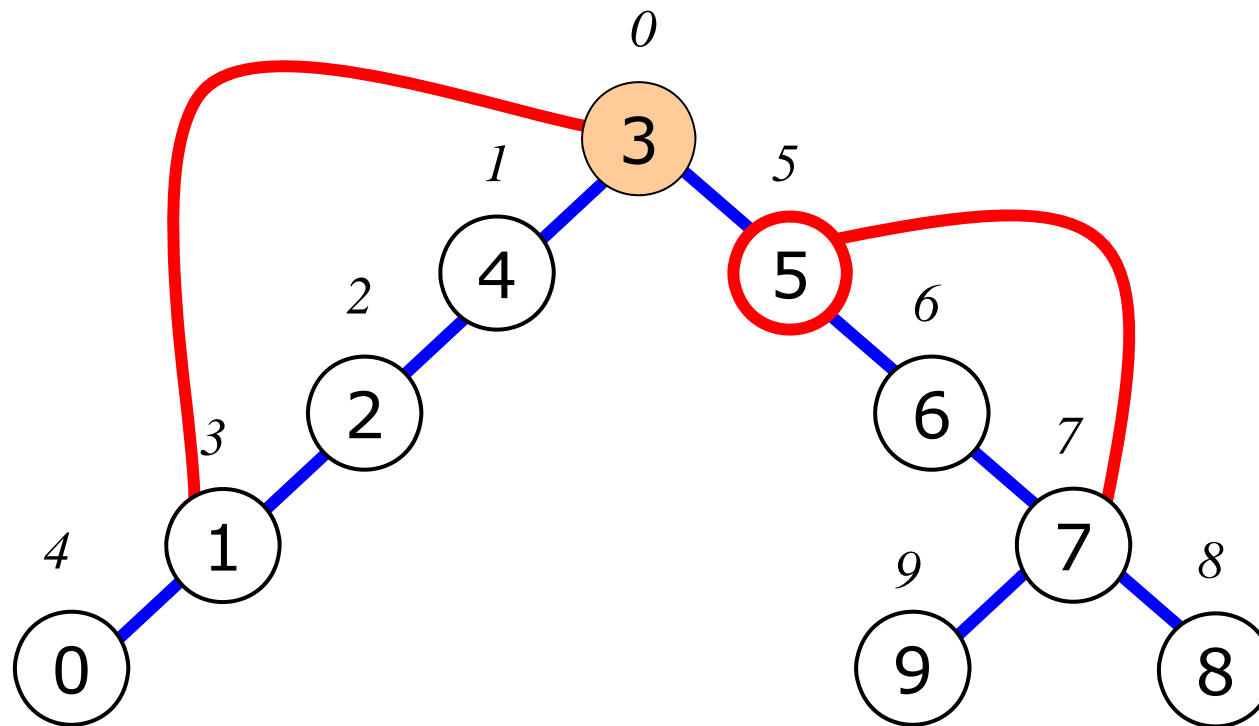
- Ex) Is vertex 1 an articulation point?



③ Definition of articulation point

9.5 Biconnected Components

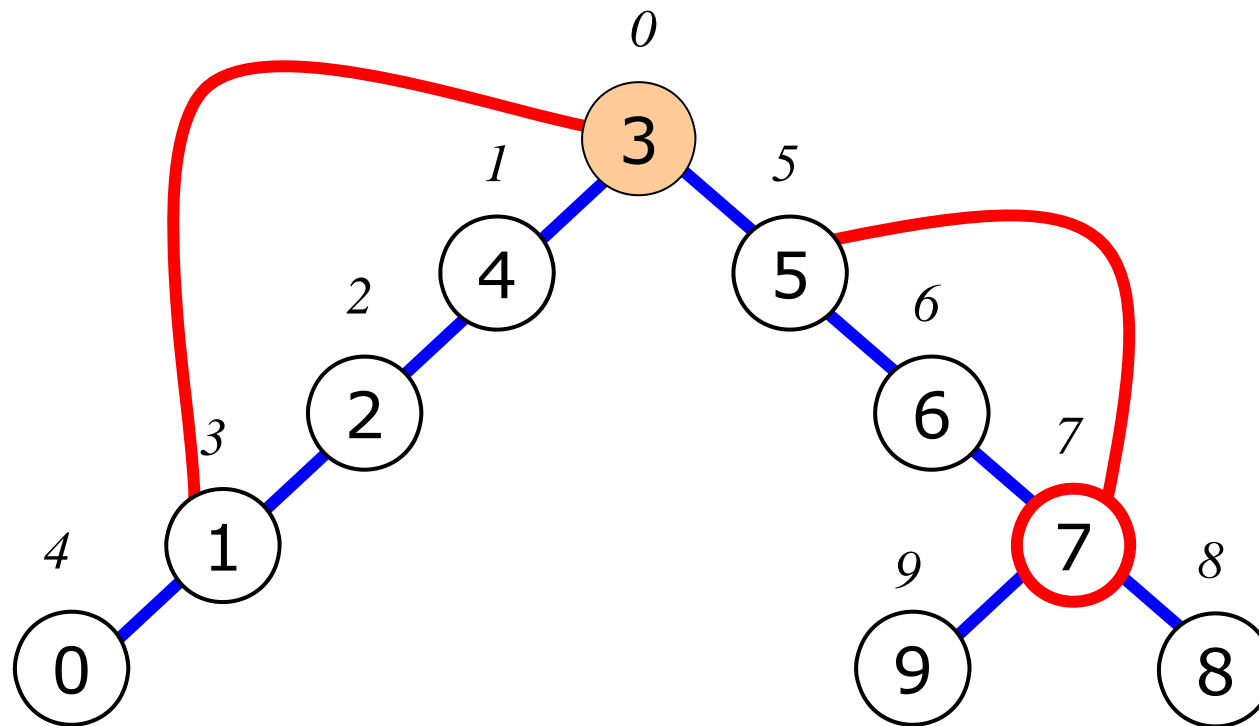
- Ex) Is vertex 5 an articulation point?



③ Definition of articulation point

9.5 Biconnected Components

- Ex) Is vertex 7 an articulation point?



③ Definition of articulation point

9.5 Biconnected Components

④ computing articulation points

- Define a new value low for each vertex u , such as $\text{low}(u)$

- $\text{low}(u)$

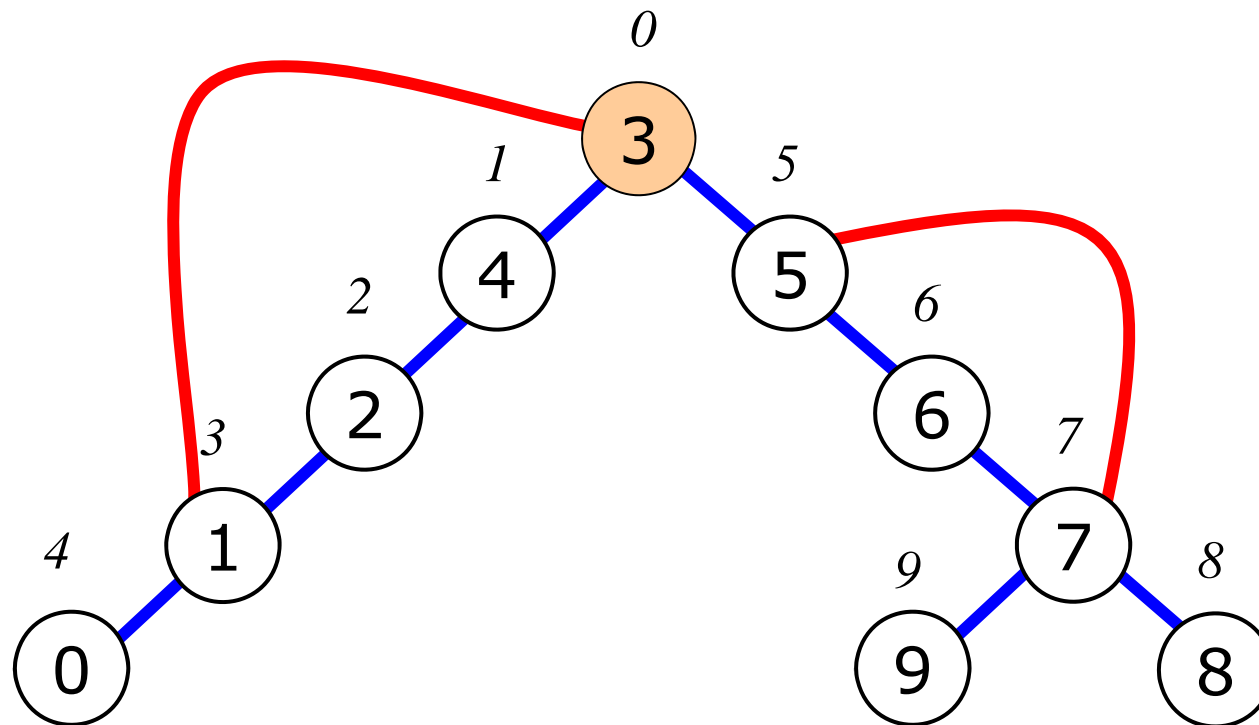
- The lowest depth first number that we can reach from u using a path of descendants followed by at most one back edge

$$\begin{aligned} \text{low}(u) = \min \{ & \text{dfn}(u), \\ & \min \{ \text{low}(w) \mid w \text{ is a child of } u \}, \\ & \min \{ \text{dfn}(v) \mid (u, v) \text{ is a back edge} \} \} \end{aligned}$$

④ computing articulation points

9.5 Biconnected Components

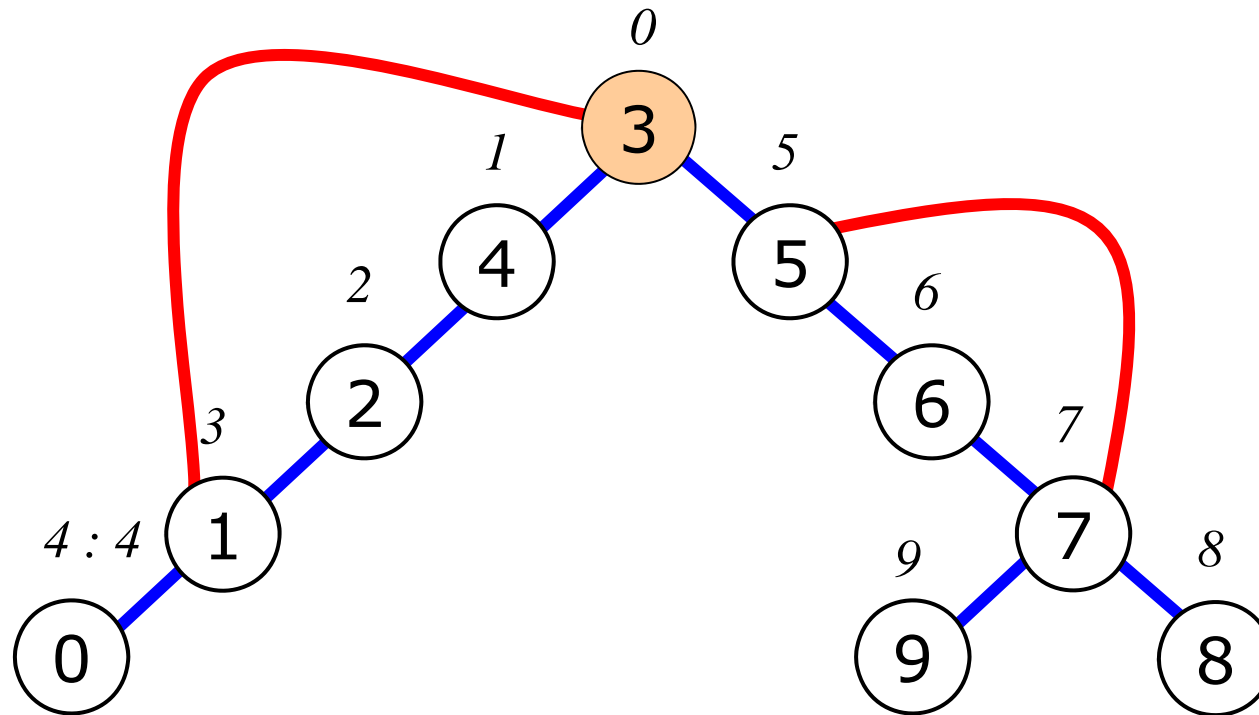
- $\text{low}(u)$
 - Ex) What are $\text{low}(u)$?



④ computing articulation points

9.5 Biconnected Components

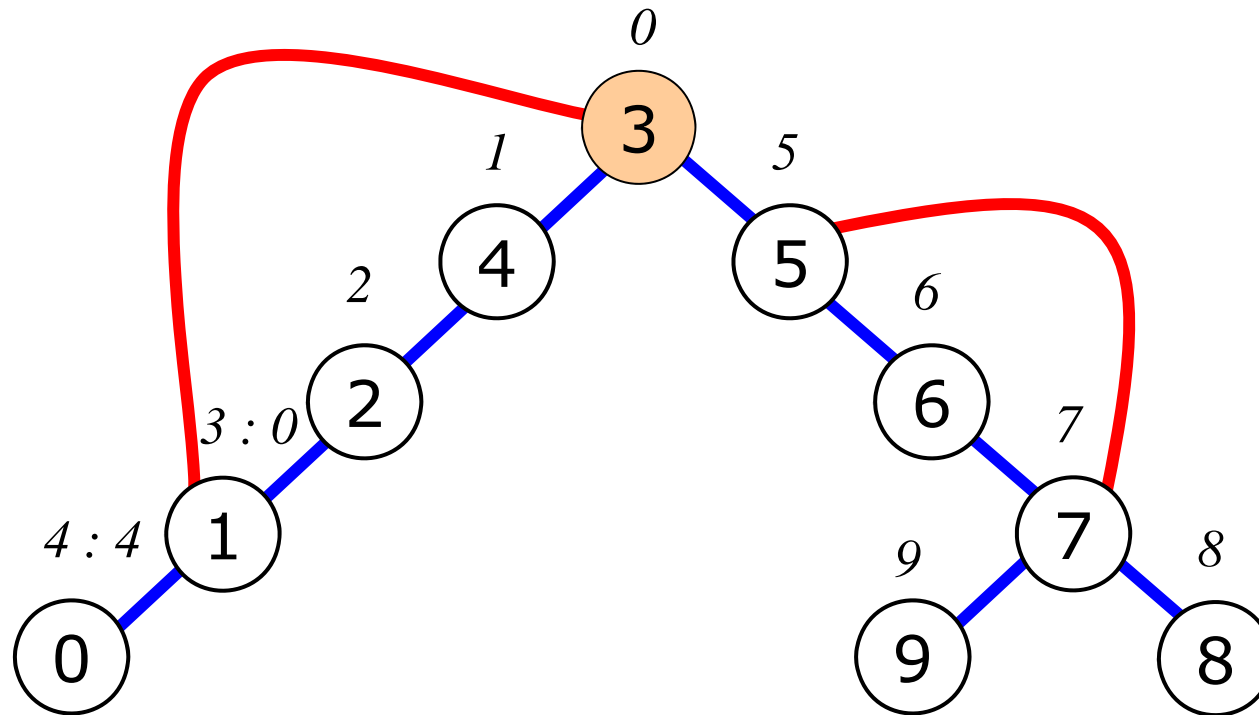
- $\text{low}(u)$
 - Ex) What are $\text{low}(0)$?



④ computing articulation points

9.5 Biconnected Components

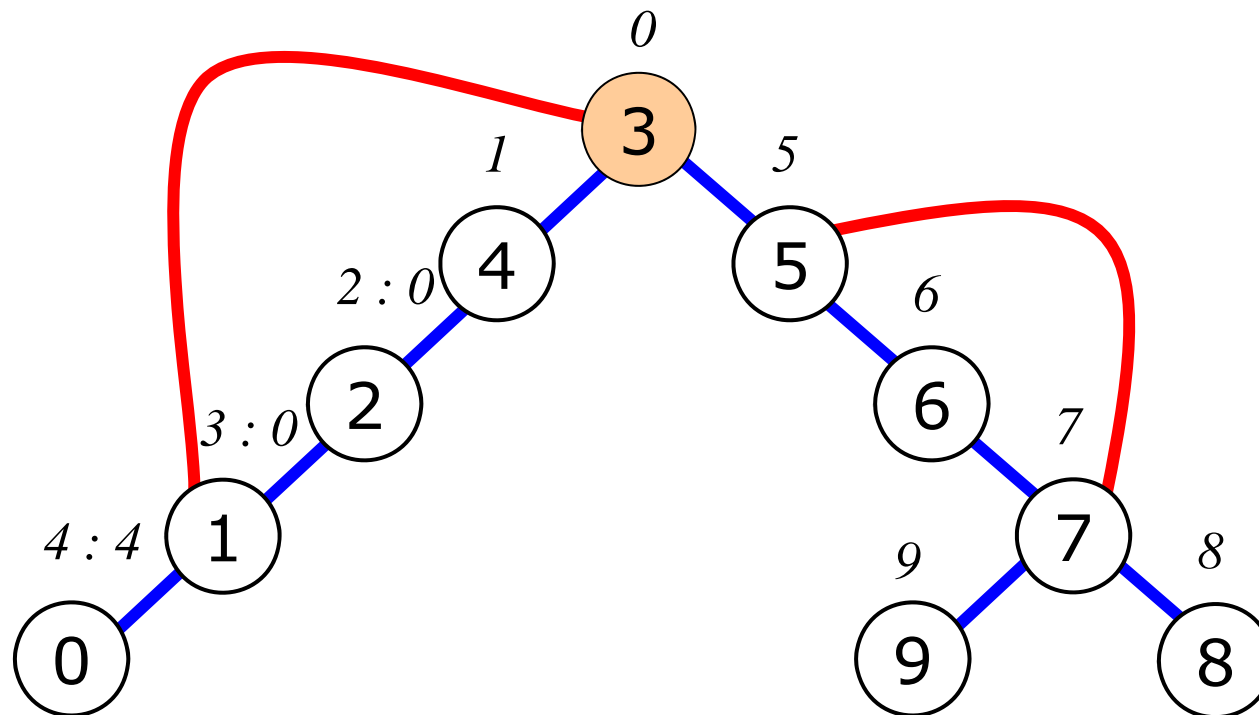
- $\text{low}(u)$
 - Ex) What are $\text{low}(1)$?



④ computing articulation points

9.5 Biconnected Components

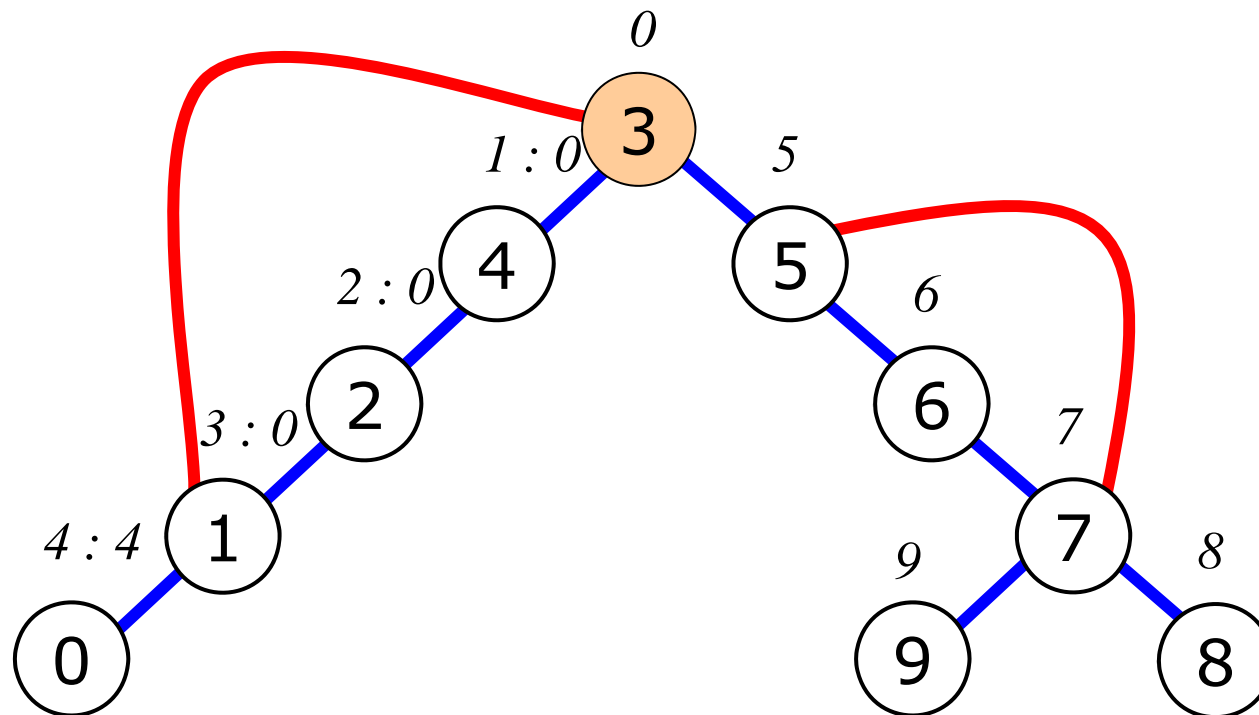
- $\text{low}(u)$
 - Ex) What are $\text{low}(2)$?



④ computing articulation points

9.5 Biconnected Components

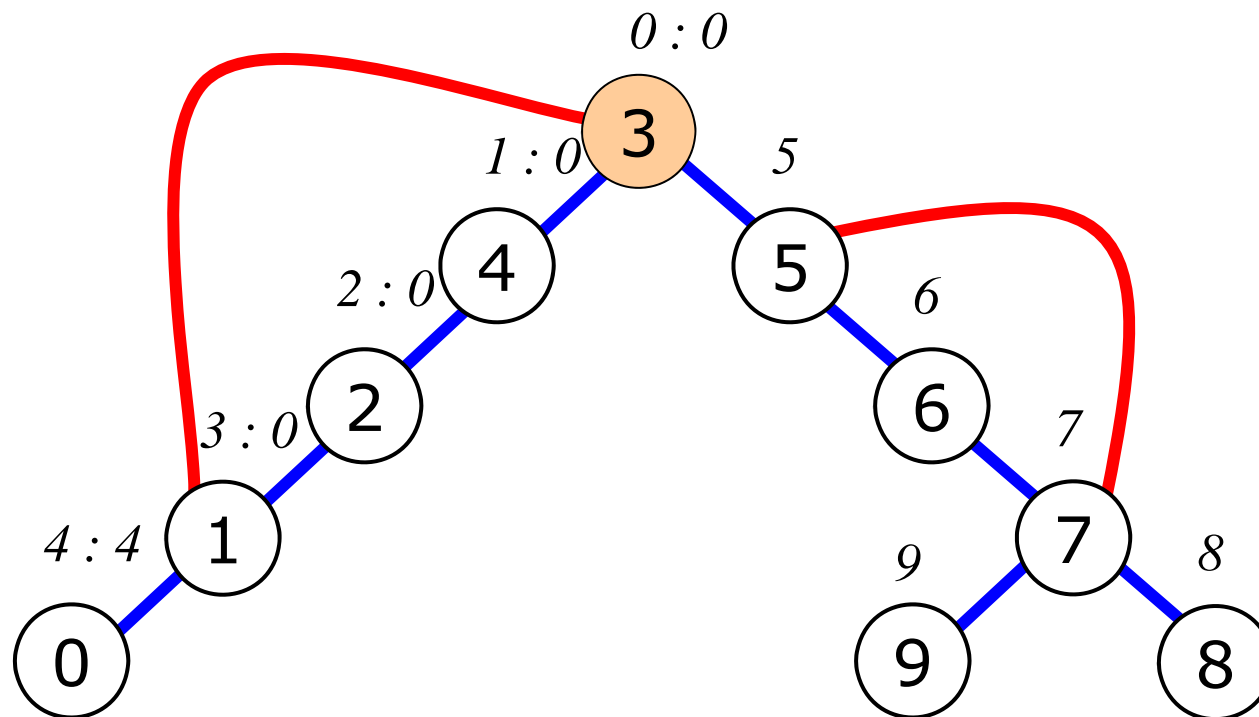
- $\text{low}(u)$
 - Ex) What are $\text{low}(4)$?



④ computing articulation points

9.5 Biconnected Components

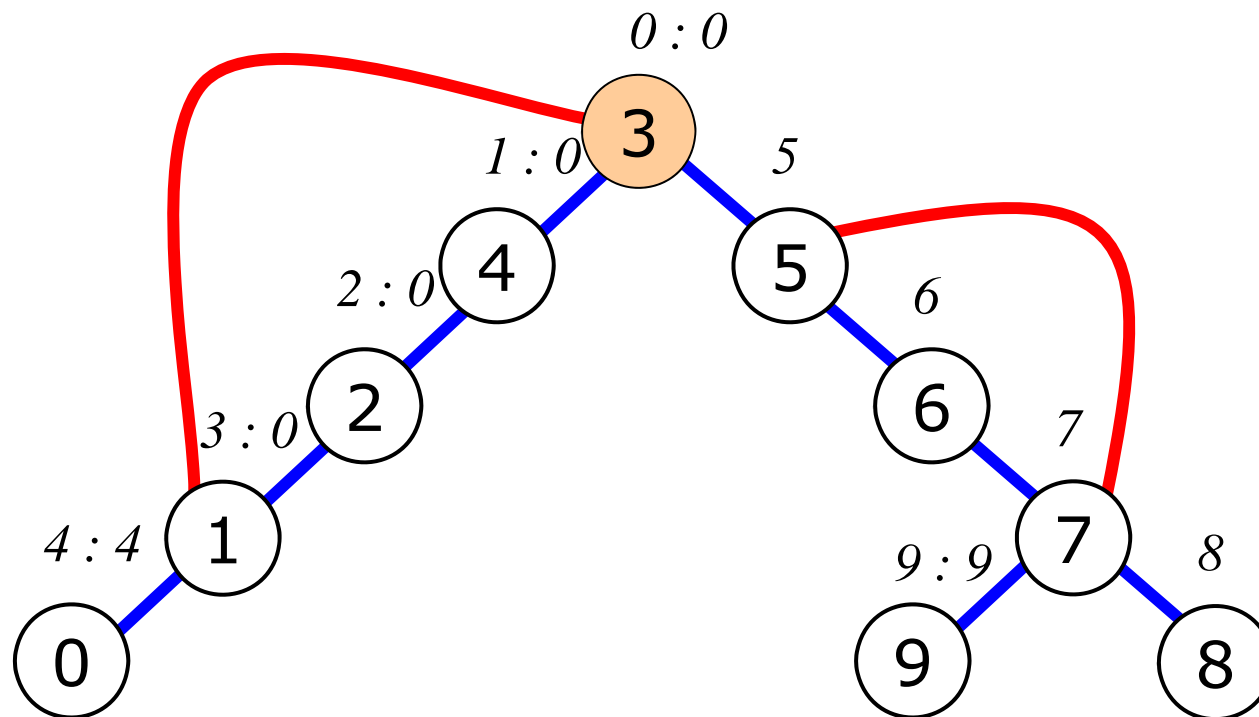
- $\text{low}(u)$
 - Ex) What are $\text{low}(3)$?



④ computing articulation points

9.5 Biconnected Components

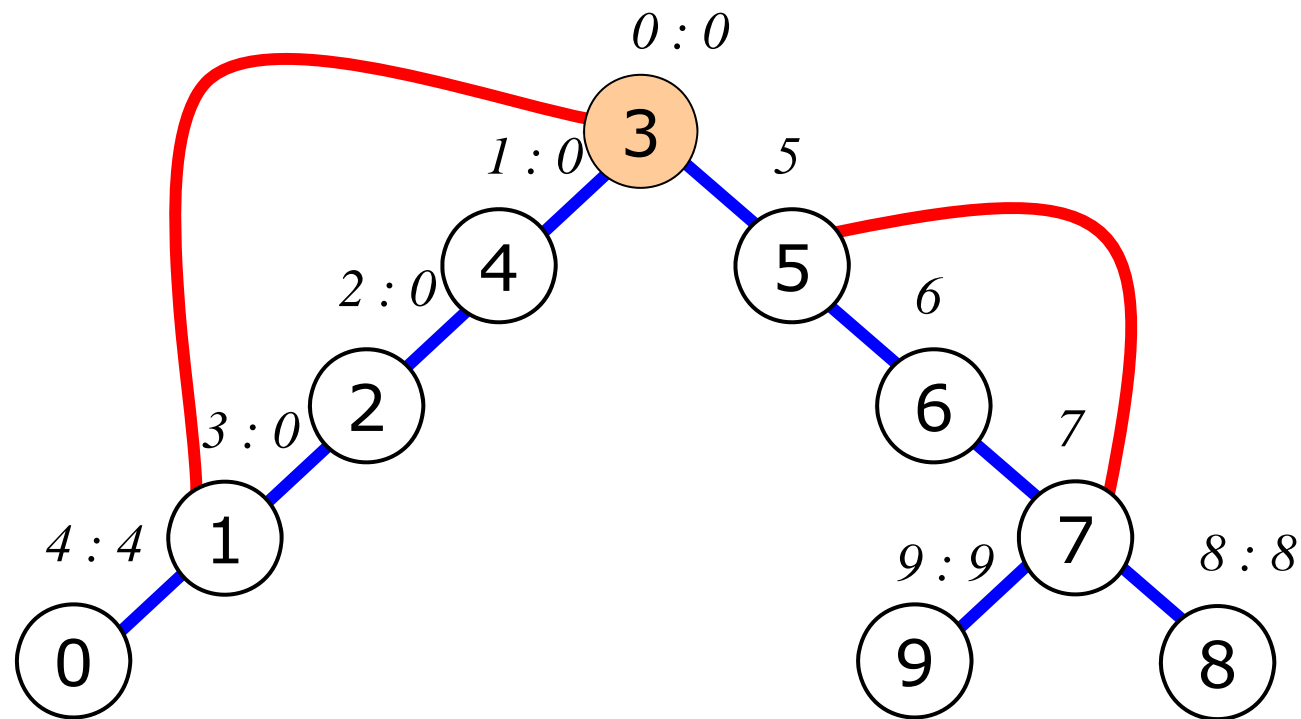
- $\text{low}(u)$
 - Ex) What are $\text{low}(9)$?



④ computing articulation points

9.5 Biconnected Components

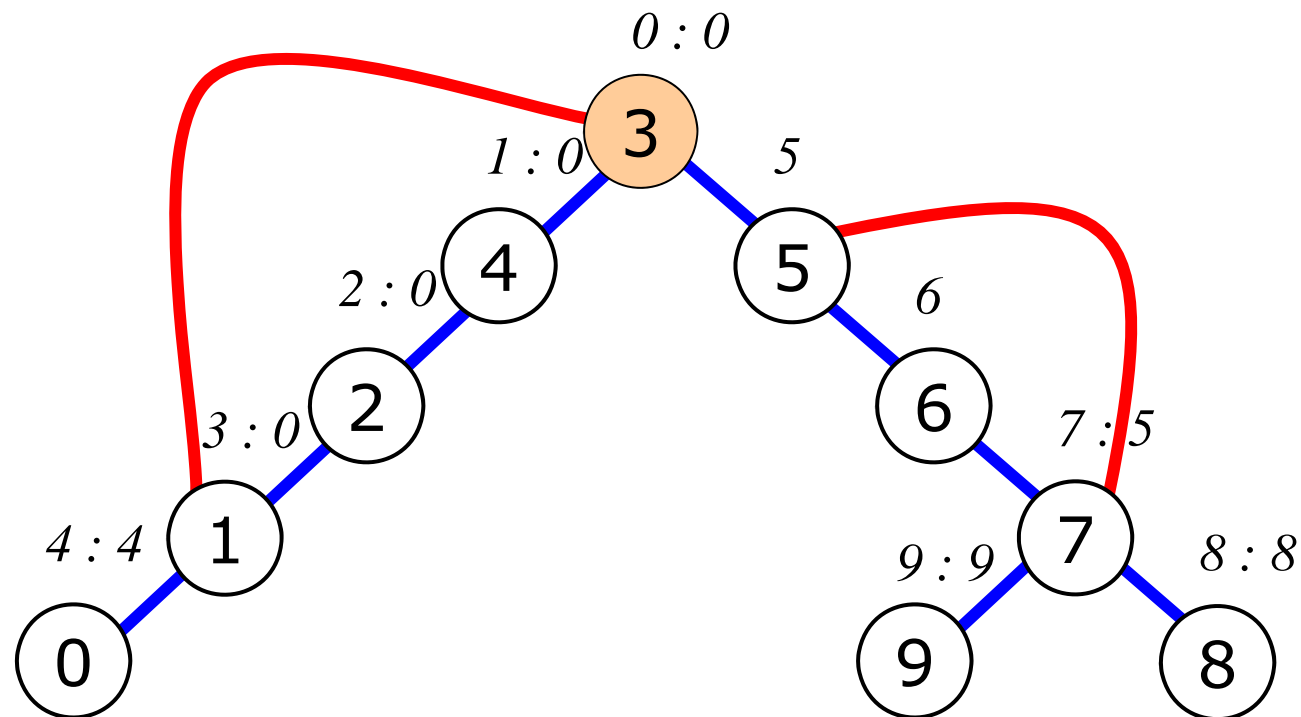
- $\text{low}(u)$
 - Ex) What are $\text{low}(8)$?



④ computing articulation points

9.5 Biconnected Components

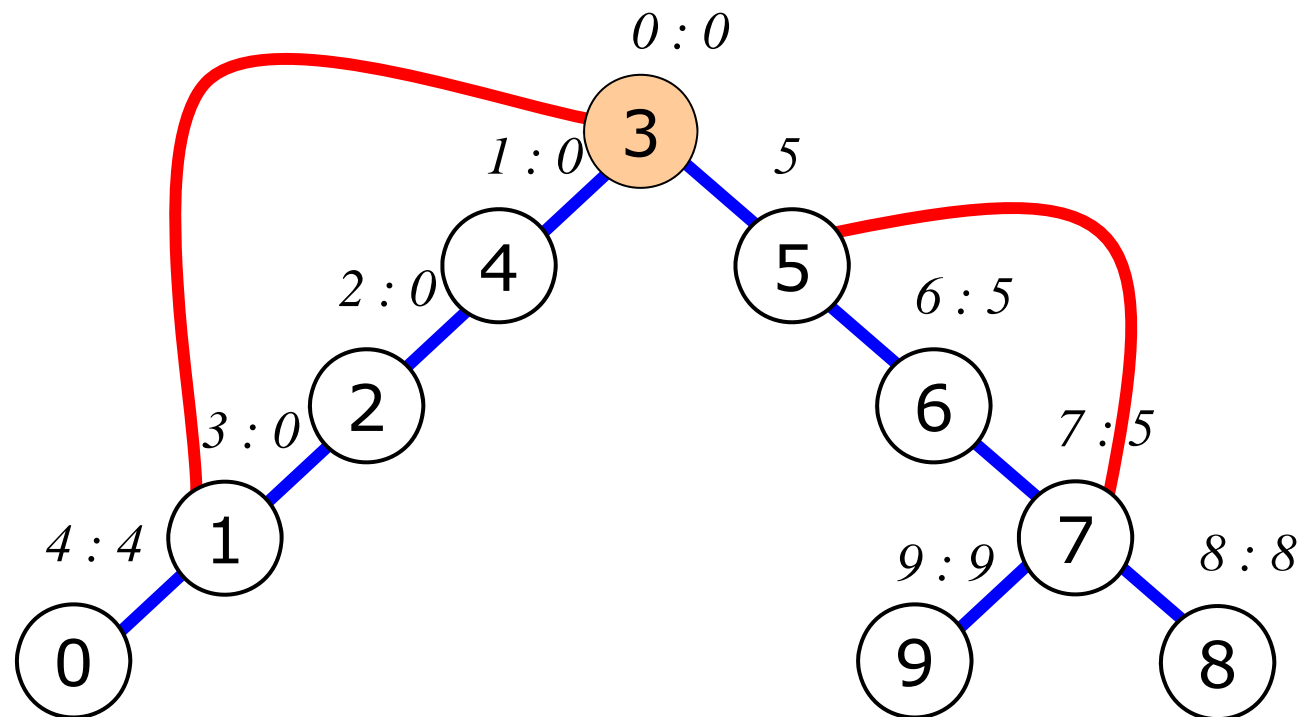
- $\text{low}(u)$
 - Ex) What are $\text{low}(7)$?



④ computing articulation points

9.5 Biconnected Components

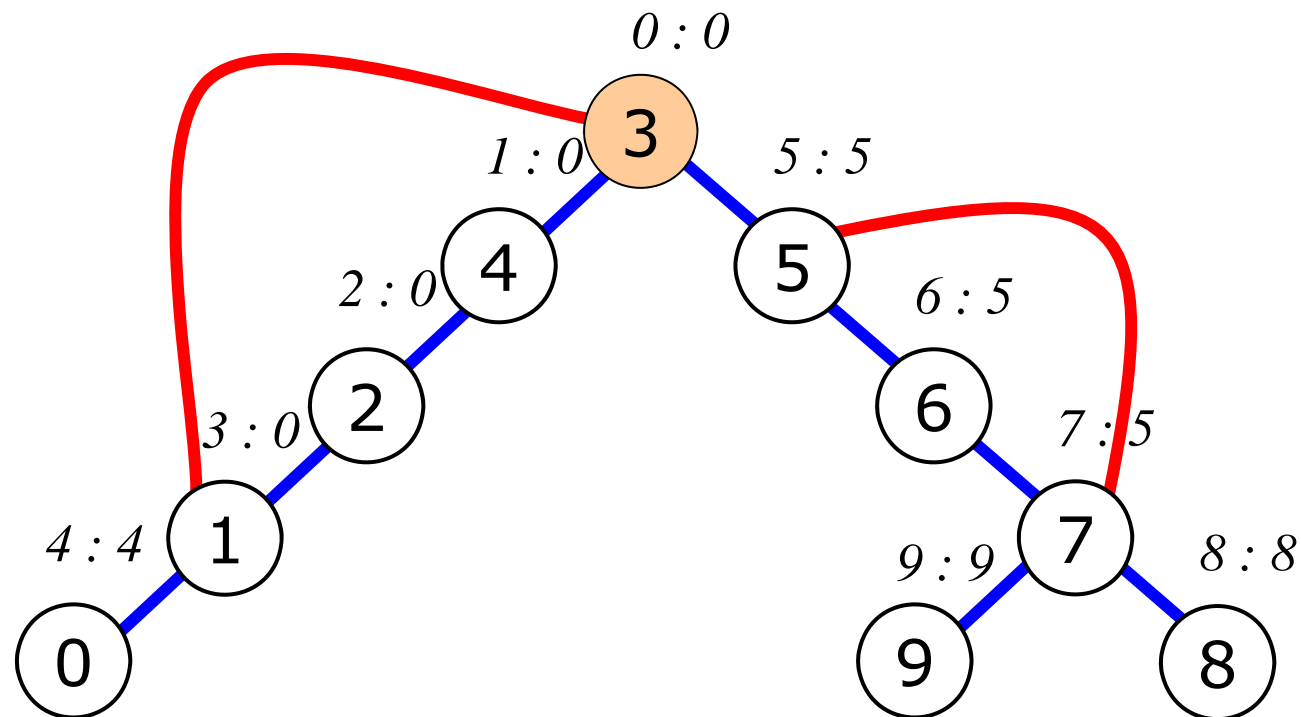
- $\text{low}(u)$
 - Ex) What are $\text{low}(6)$?



④ computing articulation points

9.5 Biconnected Components

- $\text{low}(u)$
 - Ex) What are $\text{low}(5)$?



④ computing articulation points

9.5 Biconnected Components

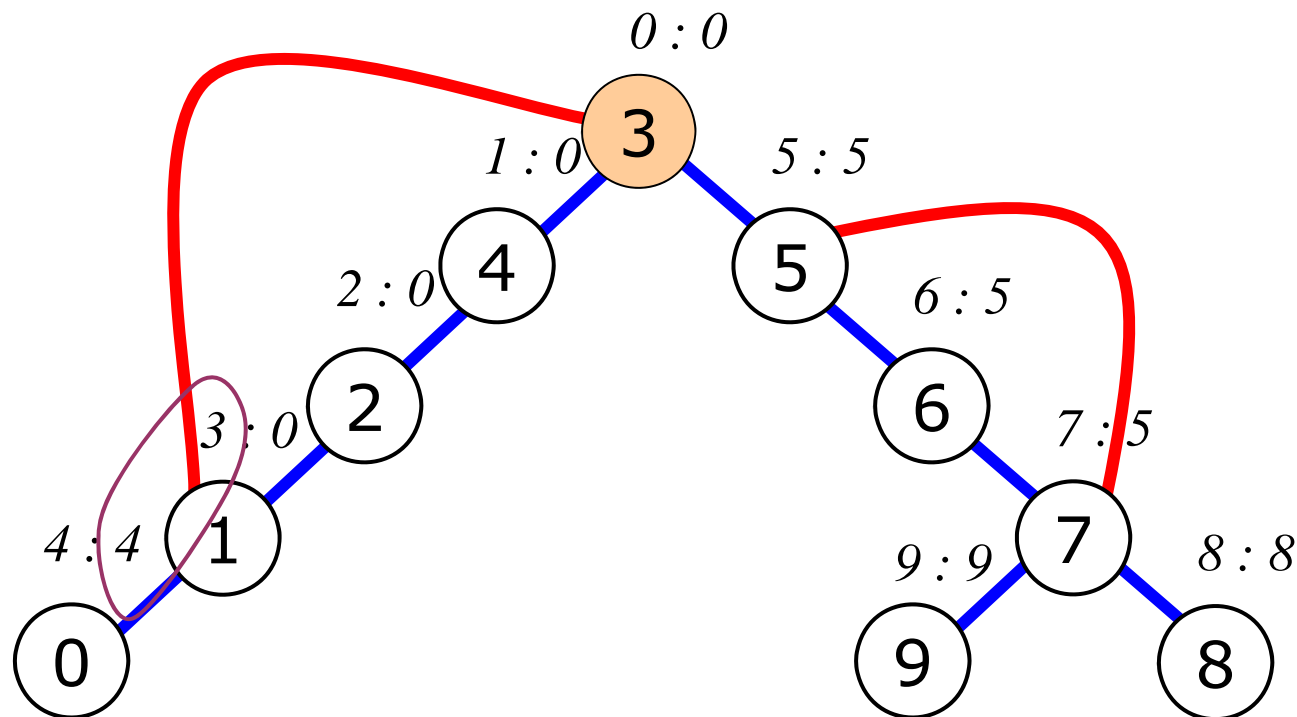
- Articulation points
 - u is an articulation point,
 - if u is either the root of the spanning tree with two or more childs,
 - or u is not a root and has a child w such that $\text{low}(w) \geq \text{dfn}(u)$

	0	1	2	3	4	5	6	7	8	9
<i>dfn</i>	4	3	2	0	1	5	6	7	8	9
<i>low</i>	4	0	0	0	0	5	5	5	8	9

④ computing articulation points

9.5 Biconnected Components

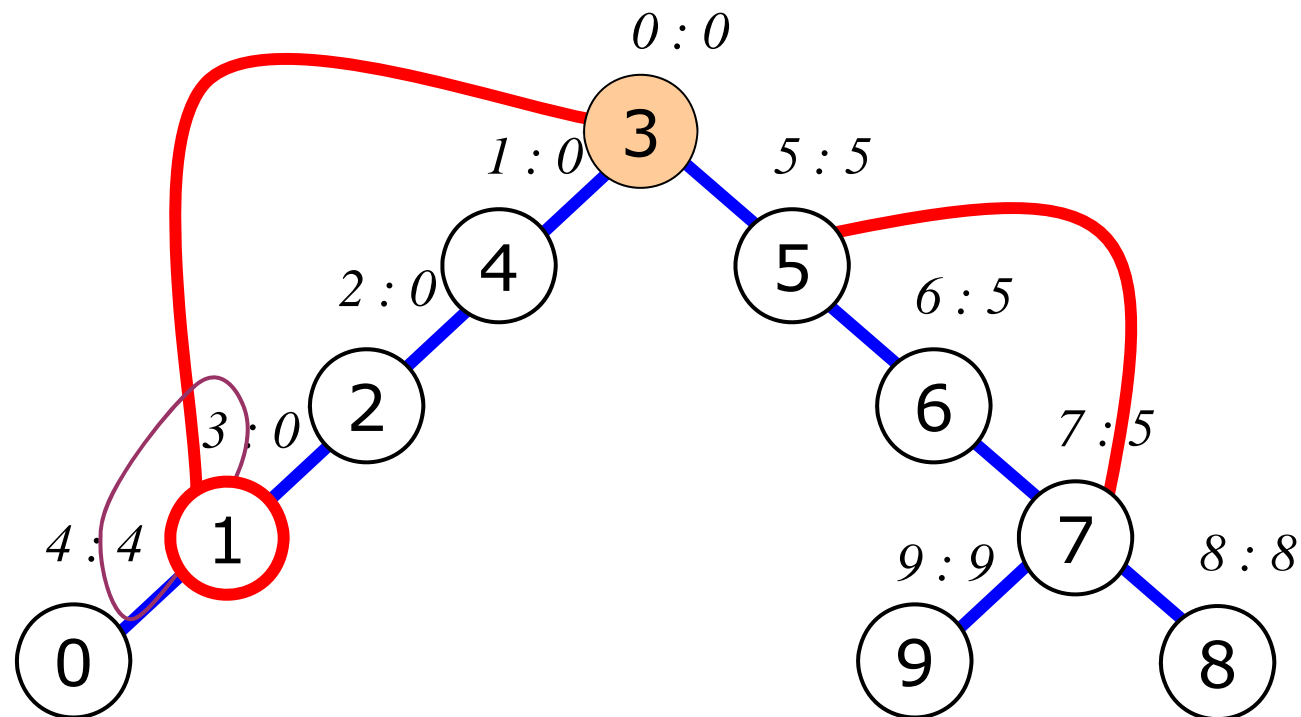
- Determine articulation points
 - At 1, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

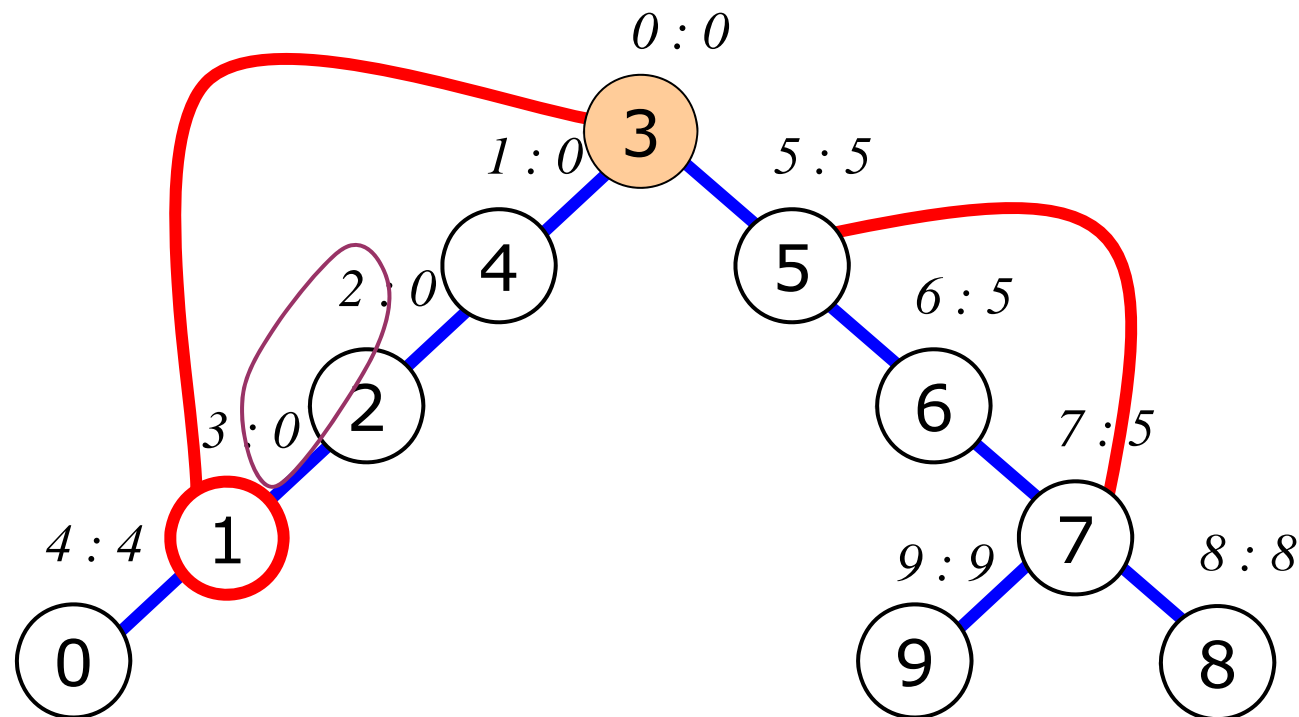
- Determine articulation points
 - At 1, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

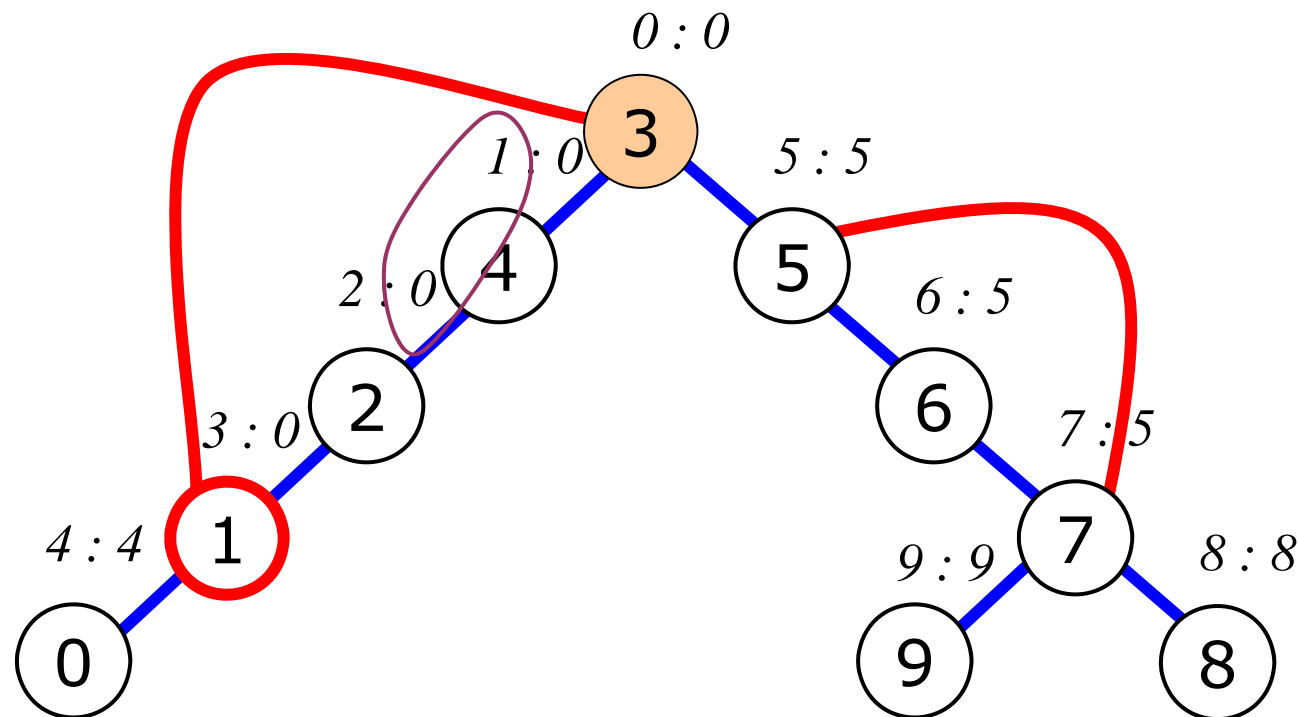
- Determine articulation points
 - At 2, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

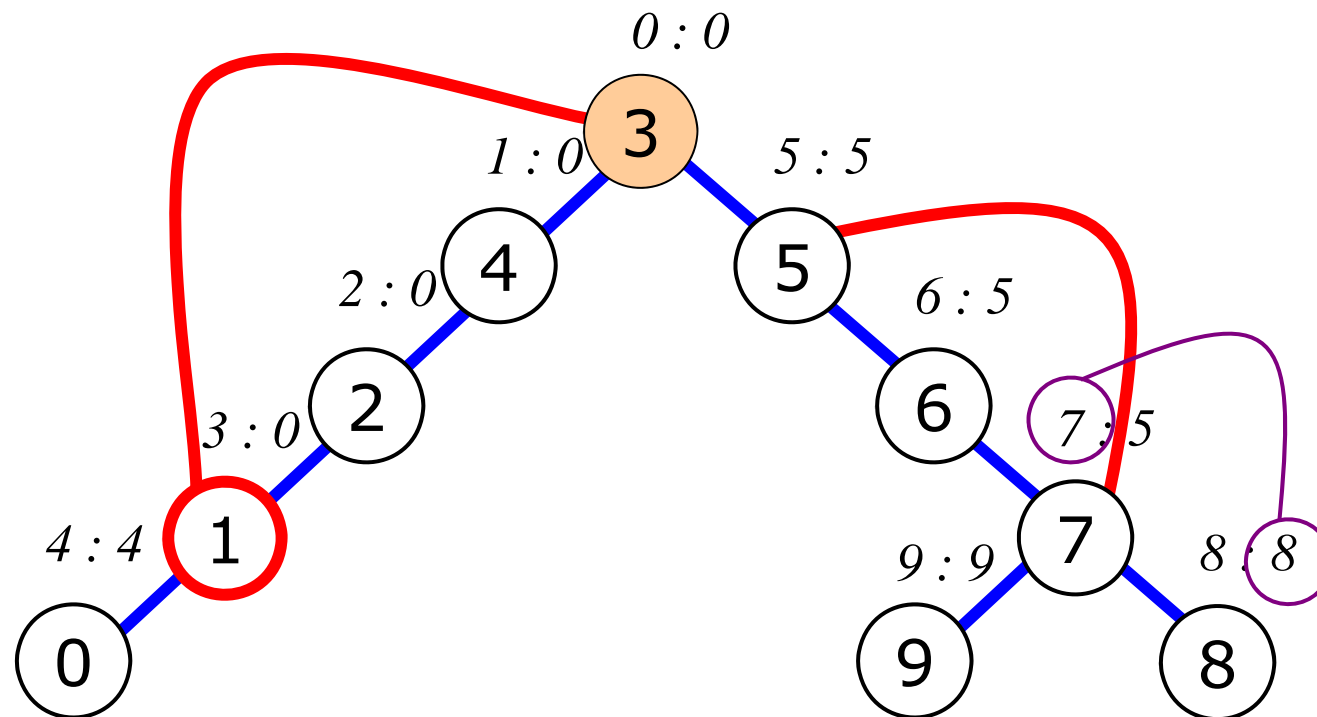
- Determine articulation points
 - At 4, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

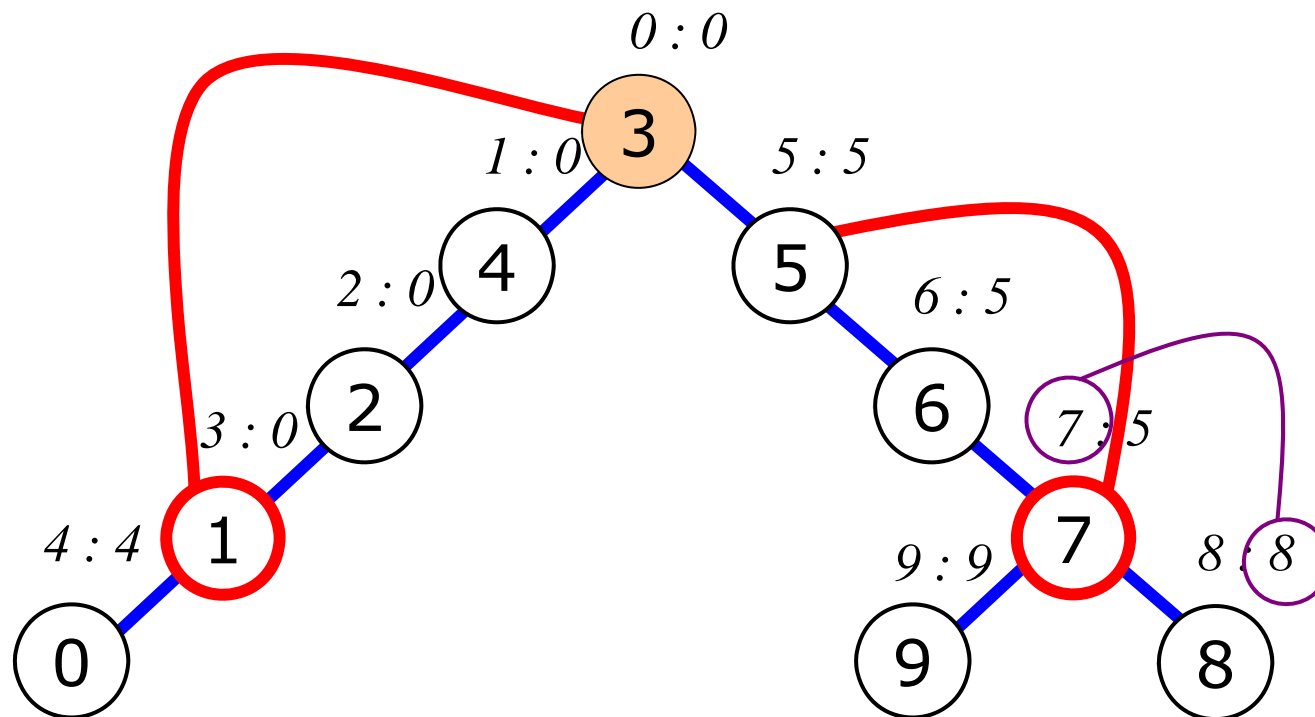
- Determine articulation points
 - At 7, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

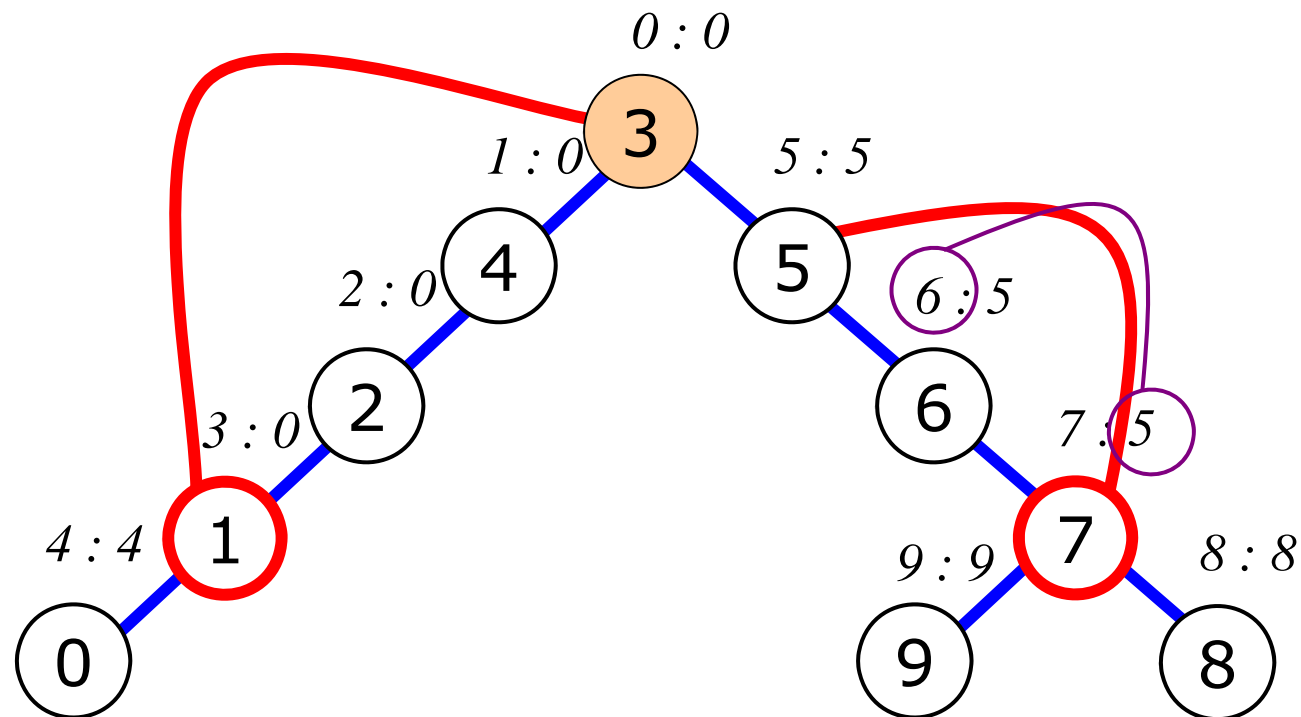
- Determine articulation points
 - At 7, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

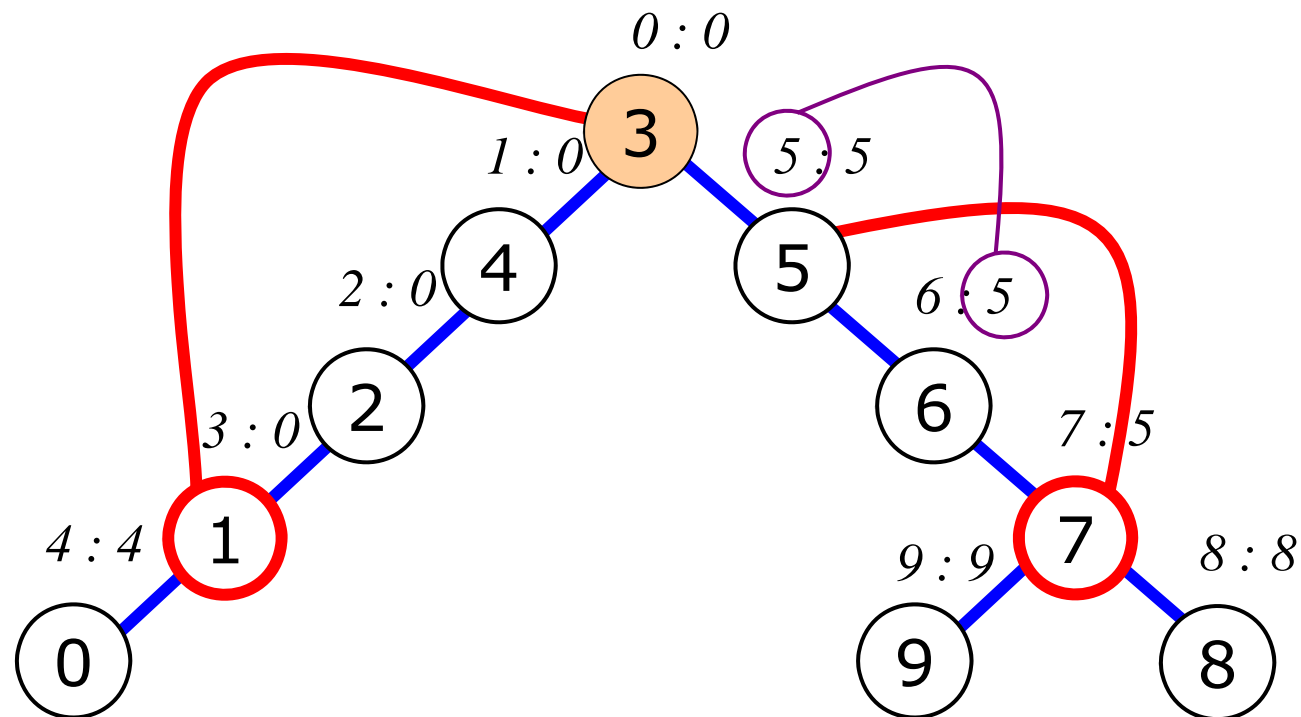
- Determine articulation points
 - At 6, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

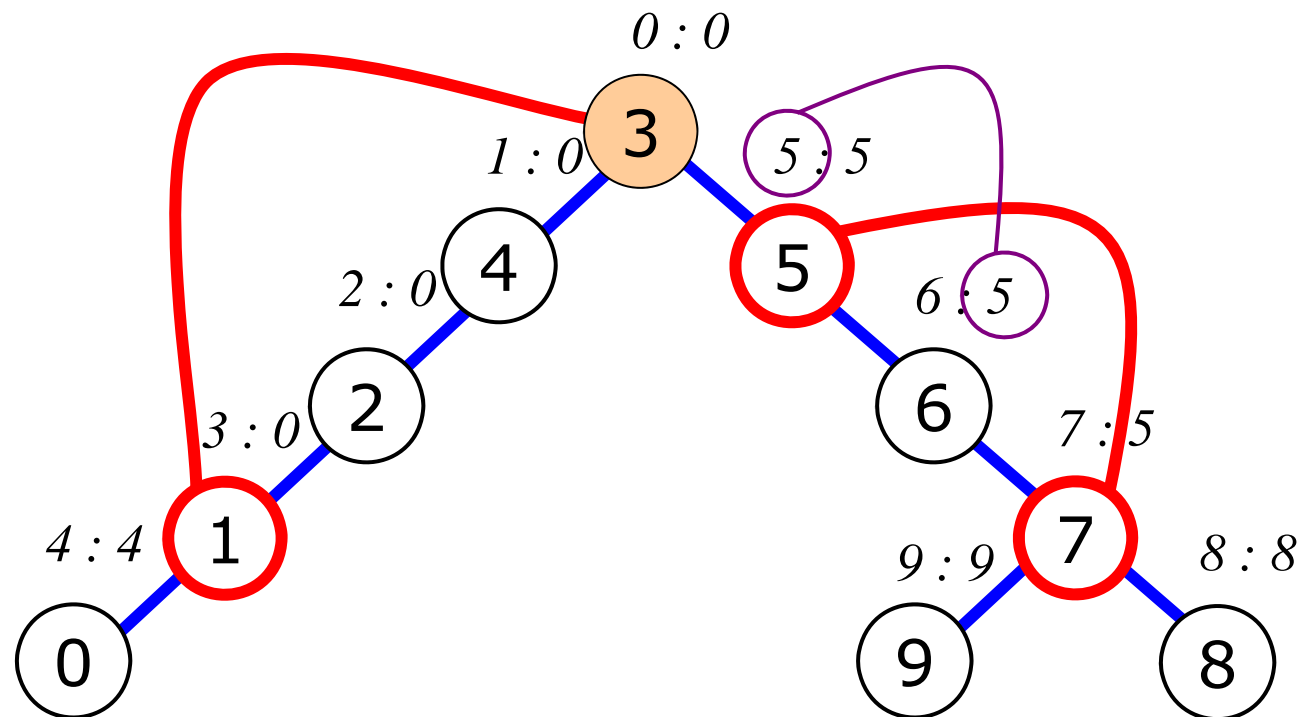
- Determine articulation points
 - At 5, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

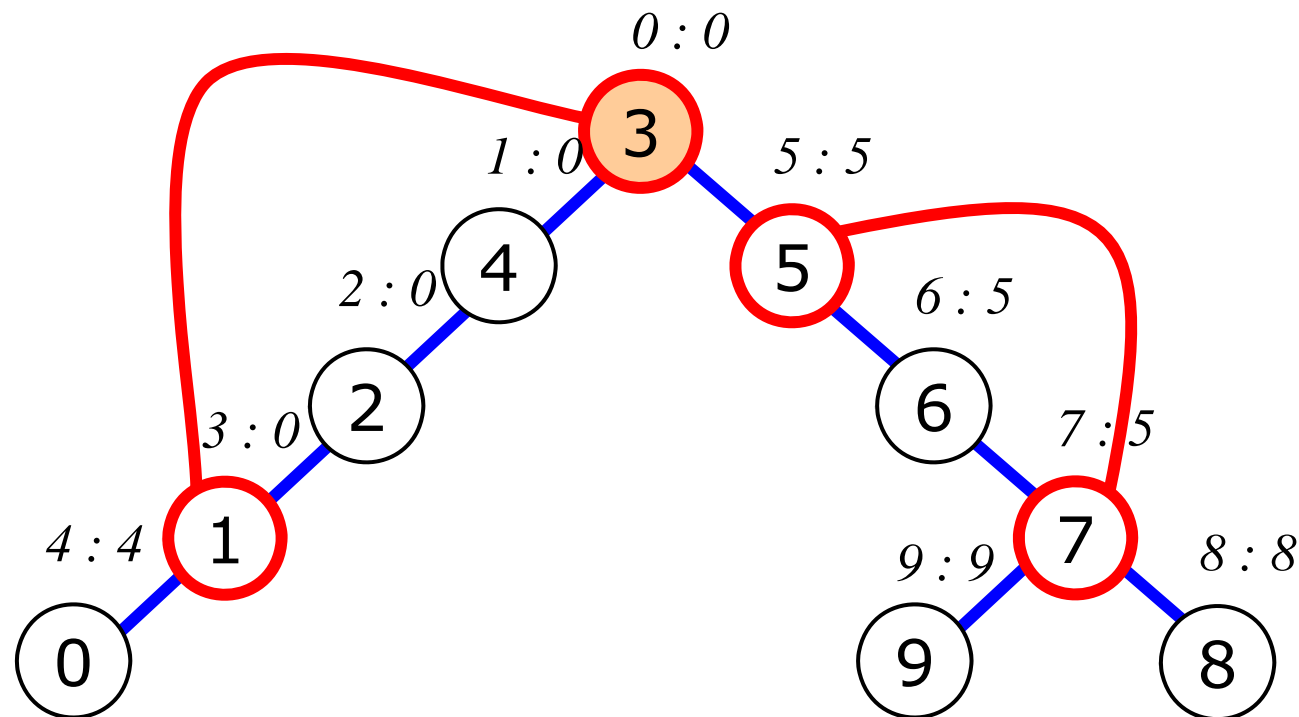
- Determine articulation points
 - At 5, $\text{low}(w) \geq \text{dfn}(u)$?



④ computing articulation points

9.5 Biconnected Components

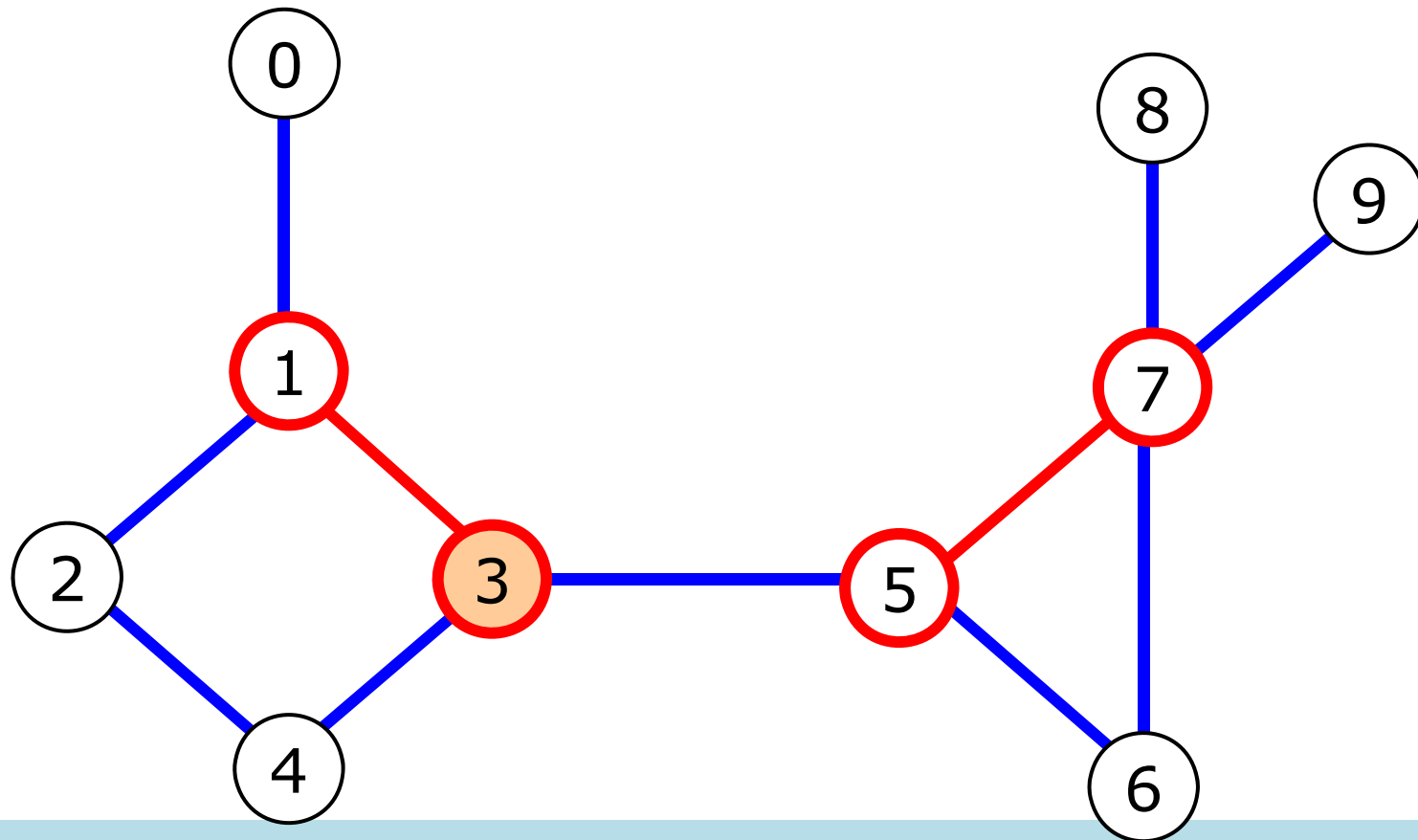
- Total articulation points
 - $\{u \mid \text{low}(w) \geq \text{dfn}(u)\} + \text{root}$



④ computing articulation points

9.5 Biconnected Components

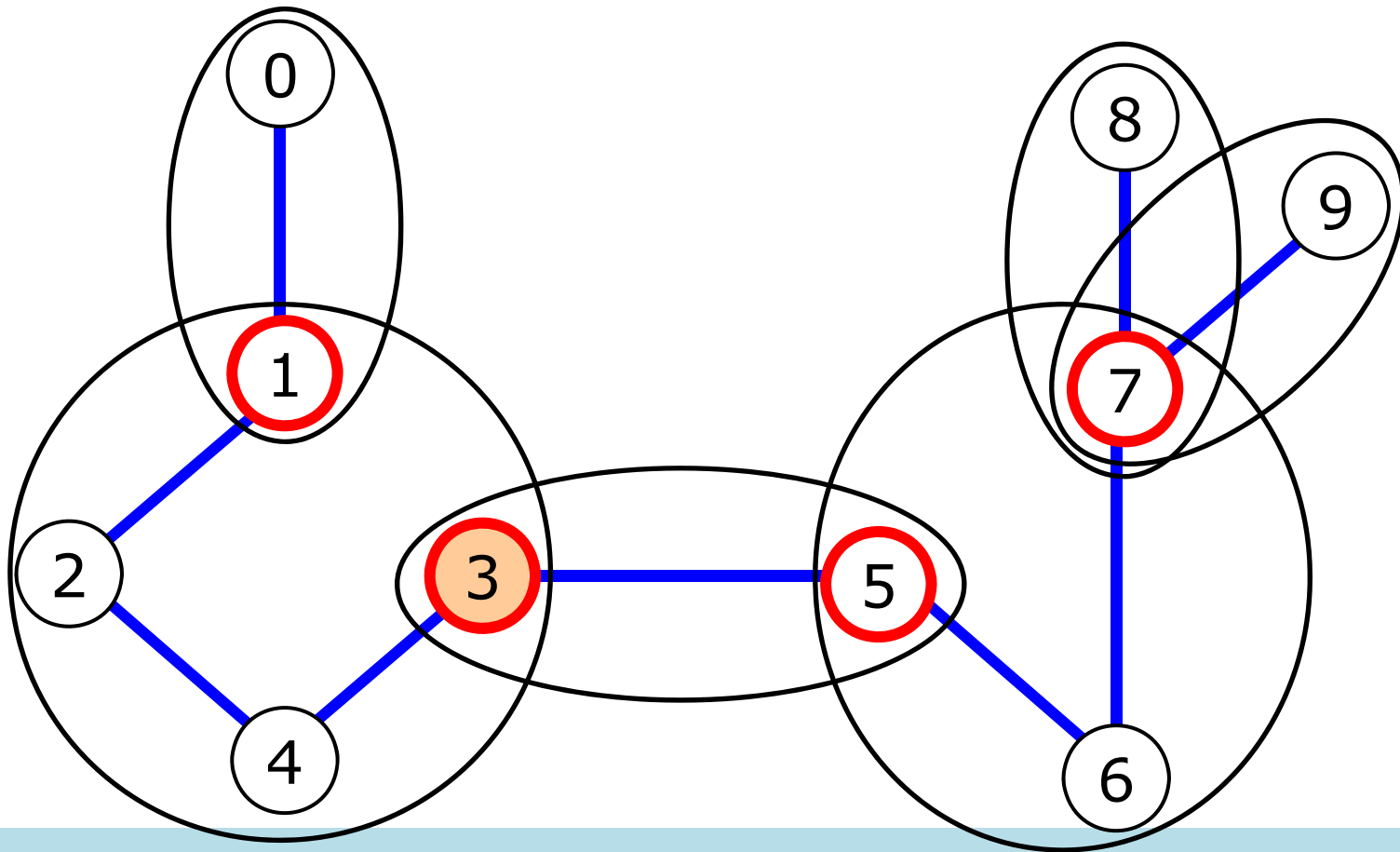
- Total articulation points
– $\{u \mid \text{low}(w) \geq \text{dfn}(u)\} + \text{root}$



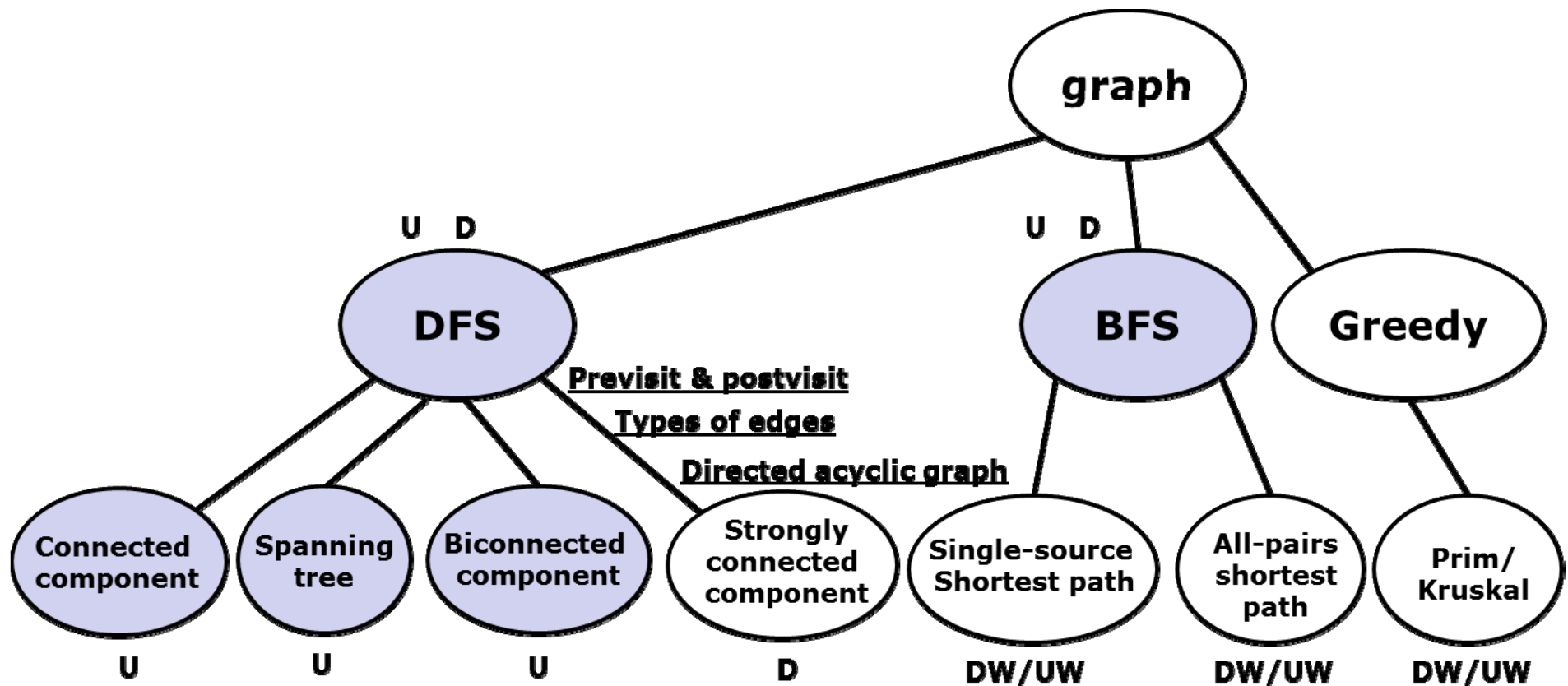
④ computing articulation points

9.5 Biconnected Components

(2) Decomposition of a graph into biconnected components using articulation points



9.5 Biconnected Components



Contents

9.1 Introduction

9.2 Basic concepts

9.3 Representation of graph

9.4 Search

9.5 Biconnected component