

Algorithm and Data Structure Analysis (ADSA)

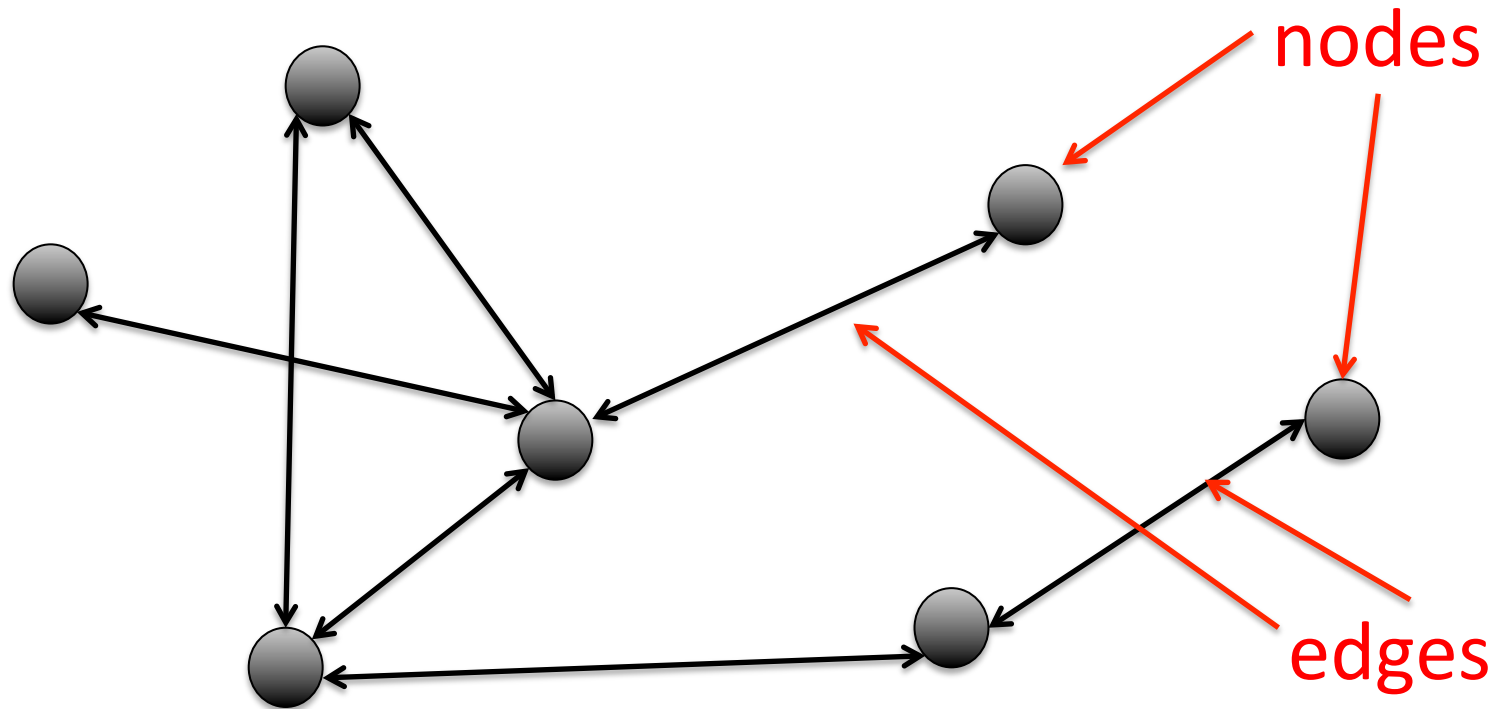
Graphs
(Book Chapter 2)

Overview

- Graphs
- Basic Algorithms on Graphs

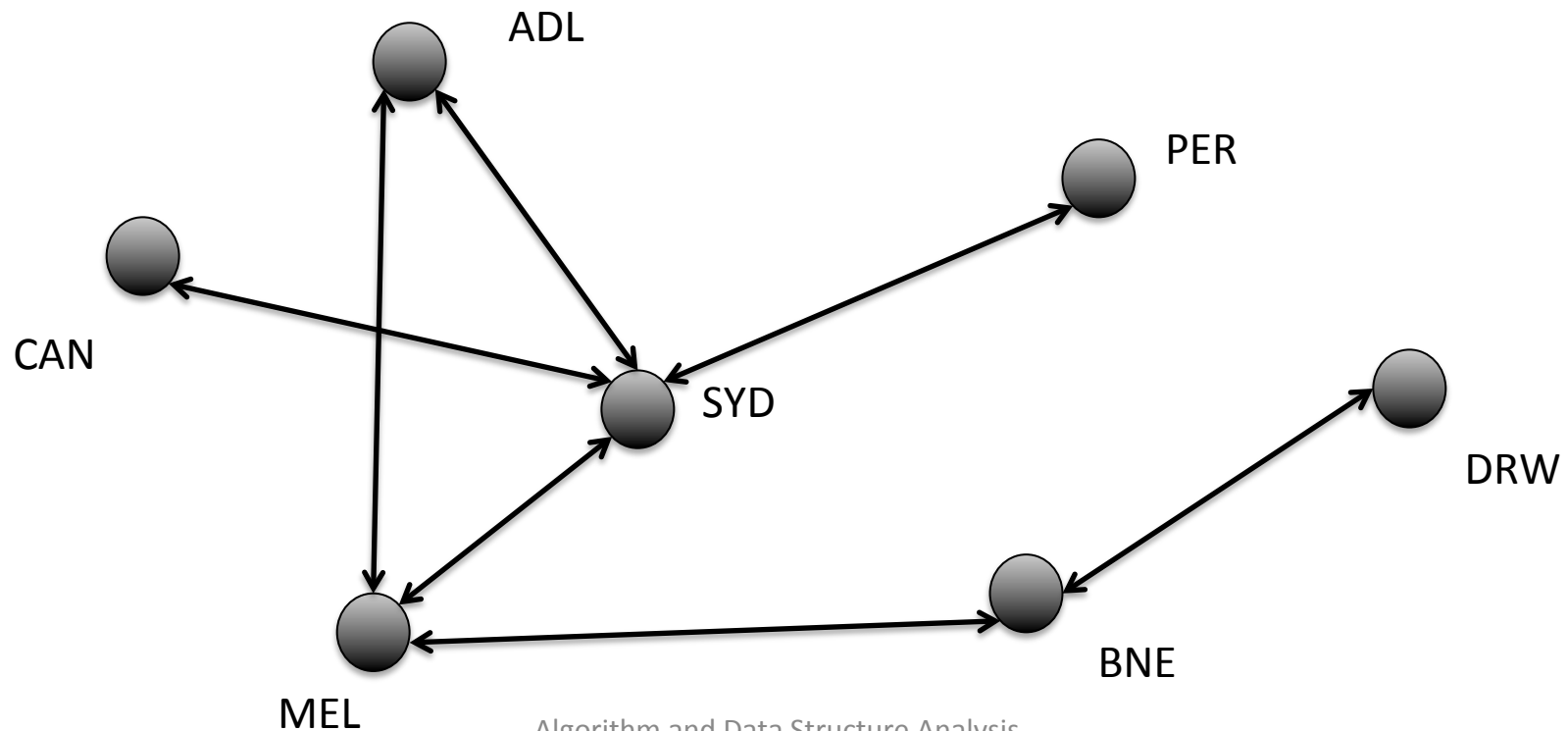
Graphs

- Extremely useful concept in computer science
- Can model many situations



Example

- Nodes are cities
- Edges are flight connections between them.



Mathematical Notation

A directed graph (digraph) $G=(V,E)$ is a pair consisting of a node set (vertex set) V and an edge set (arc set) $E \subseteq V \times V$.

We denote by $n = |V|$ the number of vertices and by $m = |E|$ the number of edges.

Often there are edge weights/costs

$$c : E \rightarrow R$$

Terminology

- An edge $e=(u,v)$ represents a connection from u to v .
- We call u the source and v the target.
- Edge e is incident to u and v .
- Nodes u and v are adjacent.
- Edge (v,v) is called a self-loop.

Terminology

- The number of outgoing edges of a vertex v is called the **outdegree** of v :

$$\text{outdegree}(v) = |\{(v, u) \in E\}|$$

- The number of incoming edges of a vertex v is called the **indegree** of v :

$$\text{indegree}(v) = |\{(u, v) \in E\}|$$

Bidirected graphs

- A **bidirected graph** $G=(V,E)$ is a digraph where
$$(u, v) \in E \implies (v, u) \in E$$
- An **undirected graph** can be viewed as streamlined representation of a bidirected graph.

We write

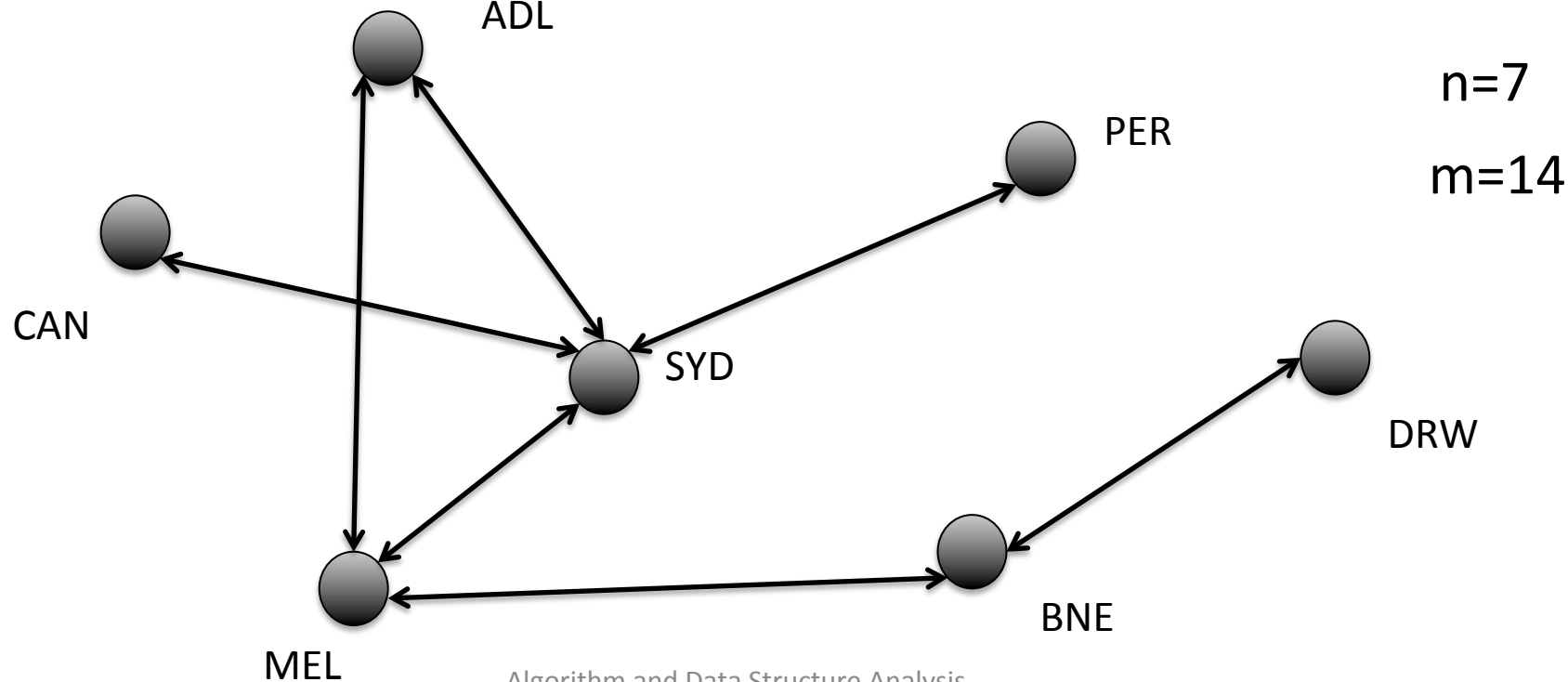
(u, v) and (v, u)
as a two-element set $\{u, v\}$

Example: Bidirected graph

$$G_f = (V_f, E_f)$$

$$V_f = \{ADL, BNE, CAN, DRW, MEL, PER, SYD\}$$

$$E_f = \{(ADL, SYD), (SYD, ADL), (ADL, MEL), (MEL, ADL), (SYD, CAN), (CAN, SYD), (MEL, SYD), (SYD, MEL), (MEL, BNE), (BNE, MEL), (SYD, PER), (PER, SYD), (BNE, DRW), (DRW, BNE)\}$$

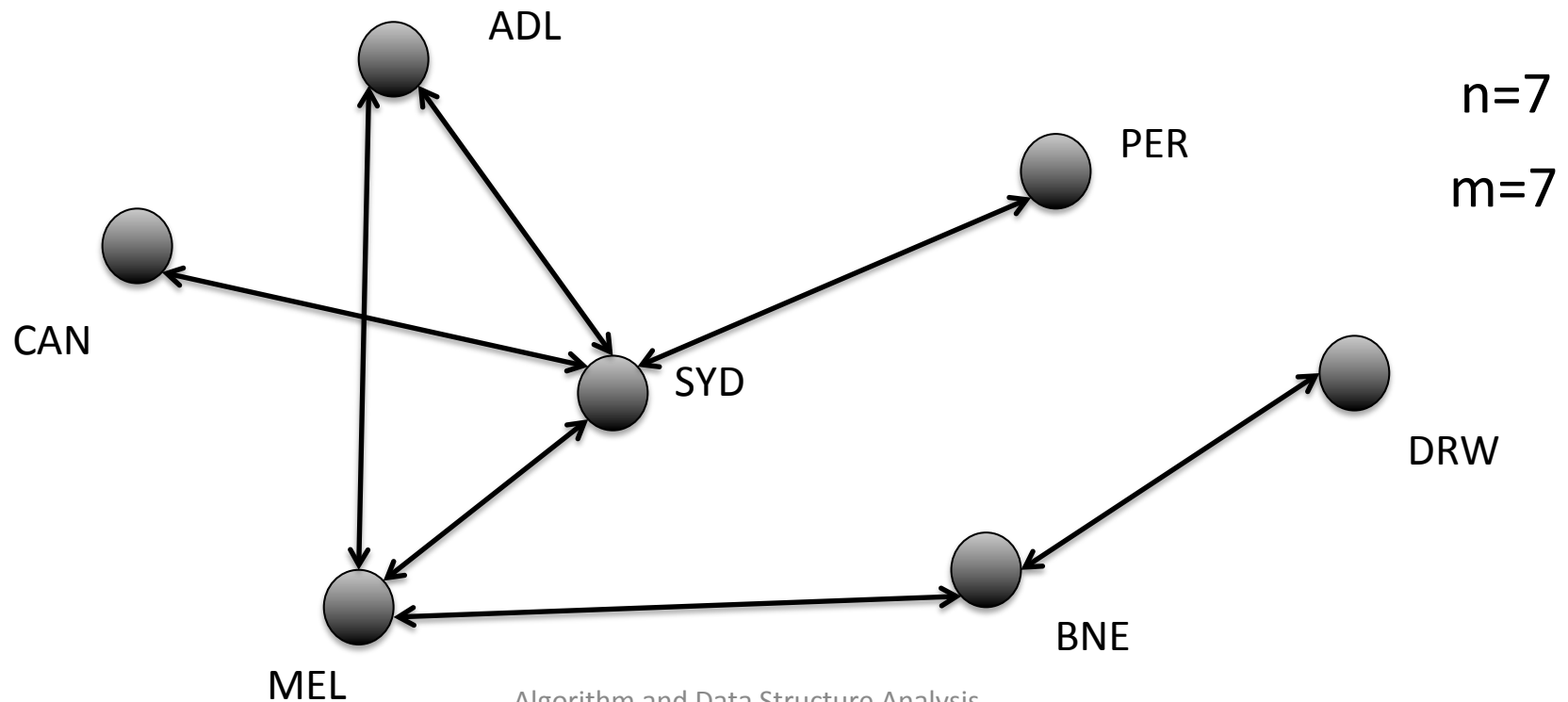


Example: Undirected graph

$$G_f = (V_f, E_f)$$

$$V_f = \{ADL, BNE, CAN, DRW, MEL, PER, SYD\}$$

$$E_f = \{\{ADL, SYD\}, \{ADL, MEL\}, \{SYD, CAN\}, \{MEL, SYD\}, \{MEL, BNE\}, \{SYD, PER\}, \{BNE, DRW\}\}$$



Subgraphs

- A graph $G'=(V',E')$ is a subgraph of $G=(V,E)$ if

$$V' \subseteq V \text{ and } E' \subseteq E.$$

- Given a graph $G=(V,E)$ and a subset $V' \subseteq V$ the subgraph induced by V' is defined as

$$G' = (V', E \cap (V' \times V'))$$

Paths

- A path $p = (v_0, \dots, v_k)$ is a sequence of nodes in which consecutive nodes are connected by an edge of E , i. e.
$$(v_i, v_{i+1}) \in E, 0 \leq i \leq k.$$
- Cycles are paths with a common first and last node, i. e. $v_0 = v_k$

Simple Graph Algorithm

- Given a directed graph $G=(V,E)$.
- Is G acyclic?

Observation:

Node with outdegree zero can not appear in a cycle.

Idea for an algorithm:

- If there is a node v with outdegree zero, delete v (and the incoming edges) to obtain a graph G'
- G is acyclic if and only if G' is acyclic

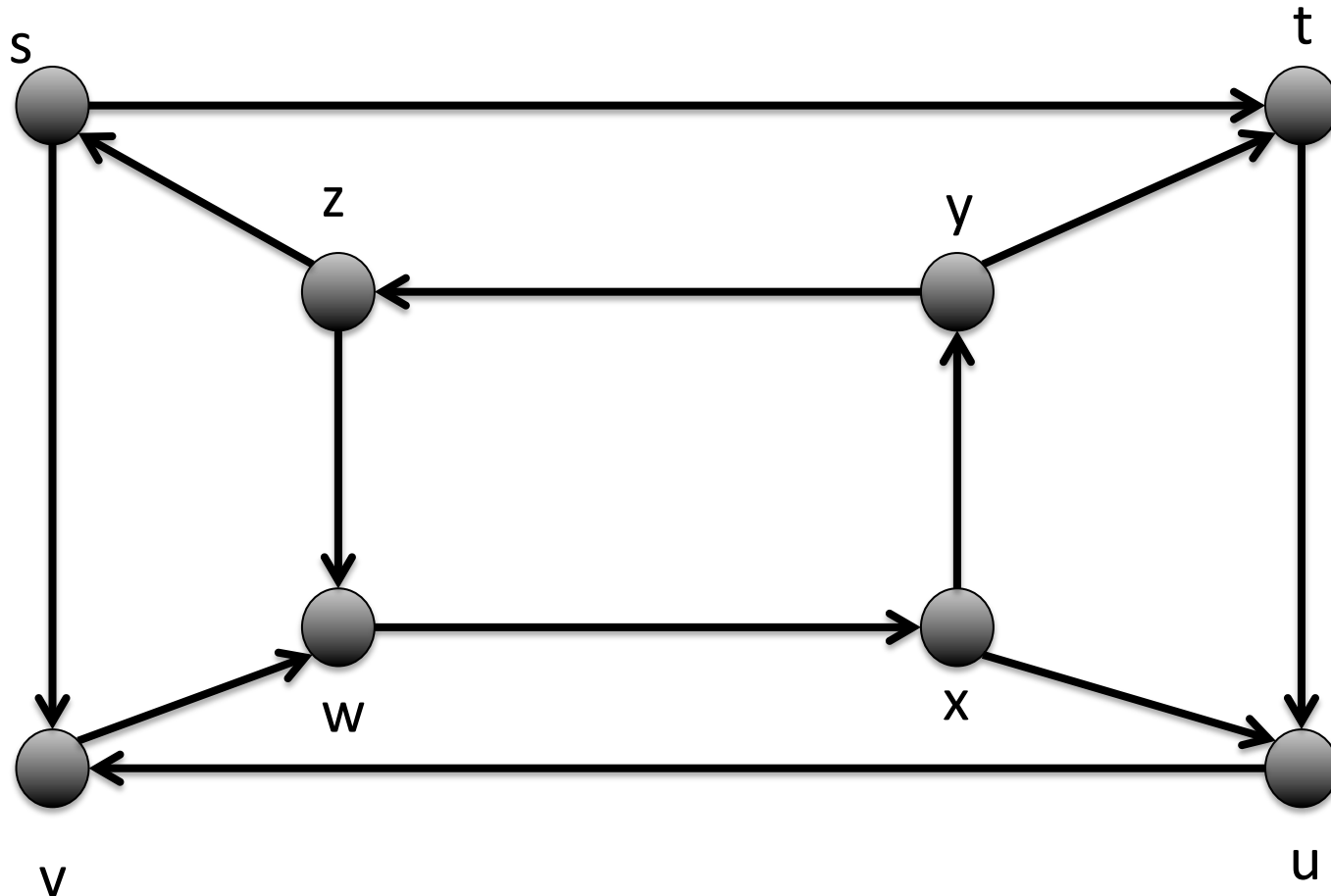
Algorithm

- If there is a node v of outdegree zero delete v and its incoming edges to obtain a graph G' .
- Iterate the transformation.

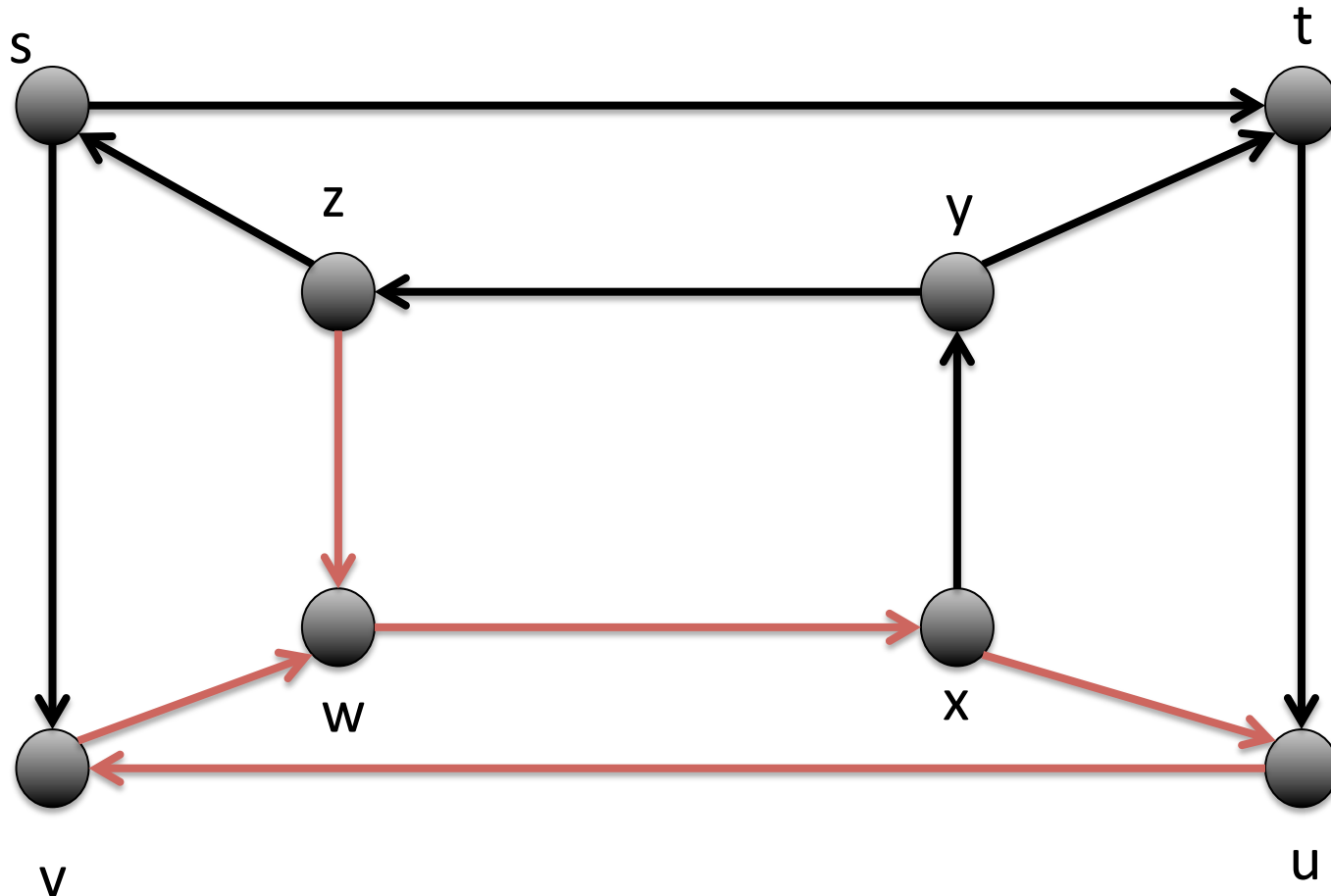
Arrive at a graph G^*

- If G^* is the empty graph then G is acyclic
- If G^* is not the empty graph, we can find a cycle in G^* that is also present in G .

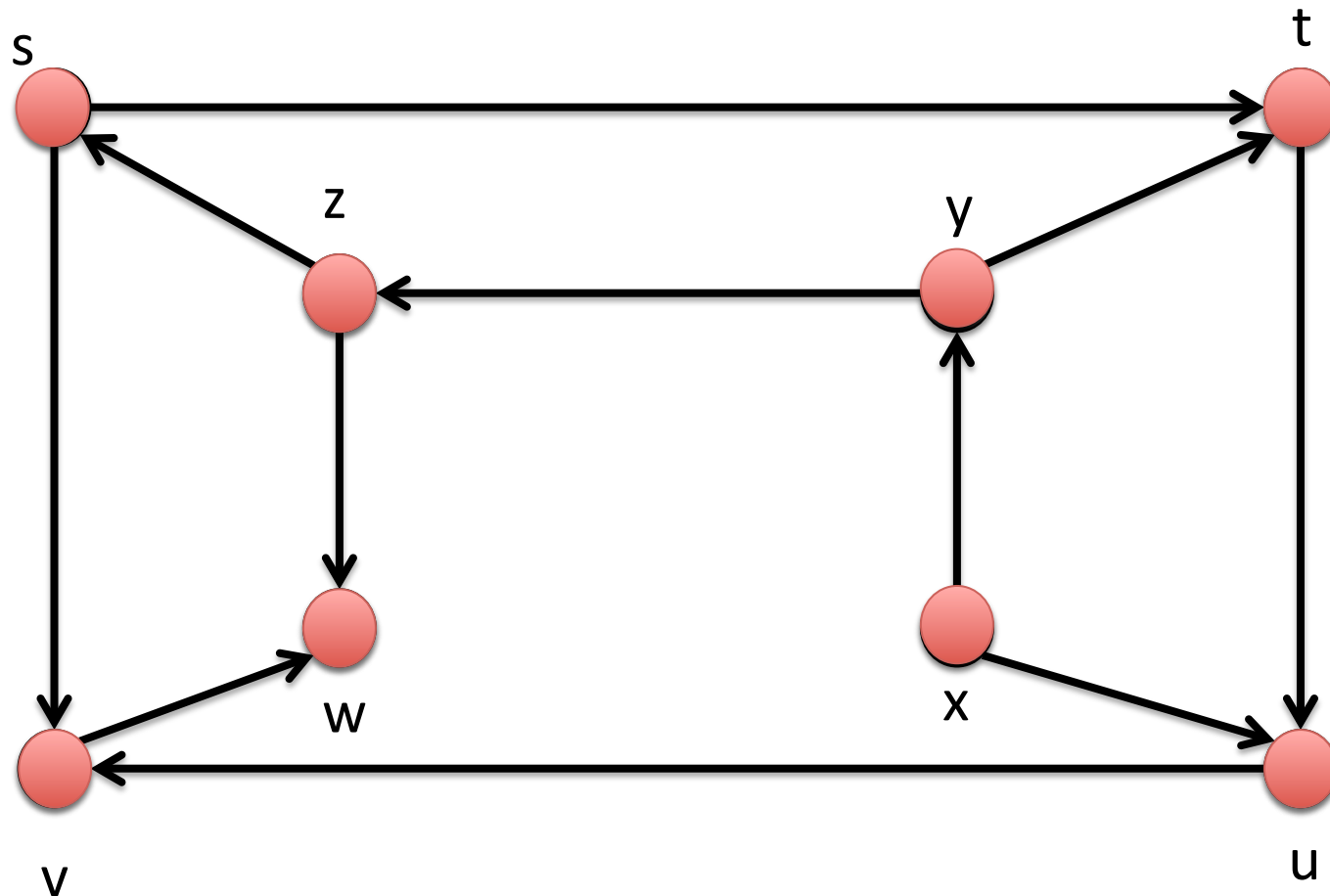
Graph containing a cycle



Graph containing a cycle

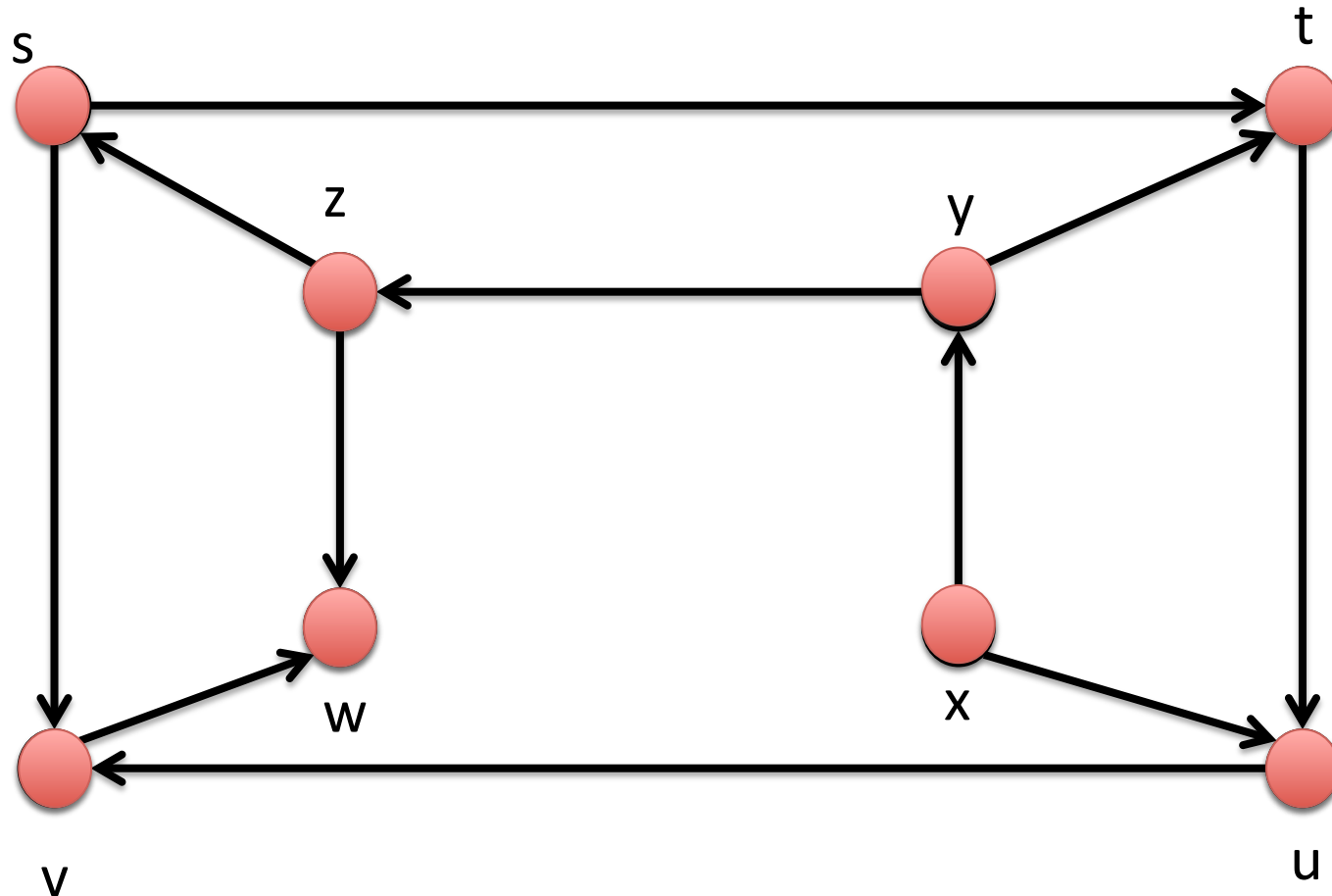


Acyclic Graph



Acyclic Graph

Empty Graph G^* implies that G is acyclic



Trees and Forests

- An undirected graph is called a **tree** if there is **exactly one path between any pair of nodes**.
- An undirected graph is called **a forest** if there is **at most one path between any pair of nodes**.

Note: Each component of a forest is a tree.

Properties of Trees

The following properties of an undirected graph G are equivalent:

1. G is a tree.
2. G is connected and has exactly $n-1$ edges.
3. G is connected and contains no cycles.

Operations

We want efficiently support the following operations for graphs:

- **Accessing associated information** (get the information stored at nodes and edges)
- **Navigation** (access the edges incident to a node)
- **Edge queries** (ask whether an edge is in the graph, query its reverse edge)
- **Construction, conversion and output** (translate one graph representation into another)
- **Update** (Add and remove nodes and edges)

Unordered Edge Sequences

Simplest choice:

Unordered sequence of edges (e.g. linked list of edges).

Good if you just want to output the edges of the graph.

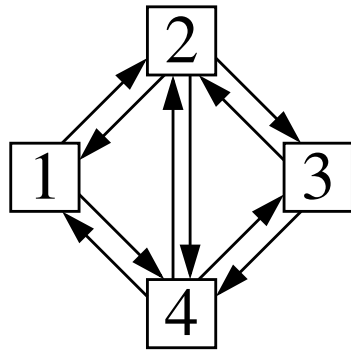
Problem:

Most interesting operations take time $\Theta(m)$.

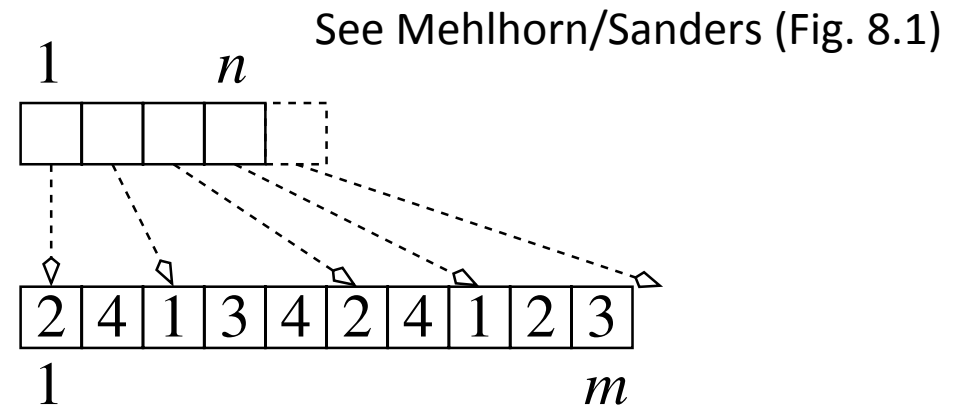
Adjacency Arrays (static graphs)

- Assume that the graph is static (i. e. it does not change).
- Then we can store the graph in an array.
- Store the outgoing neighbors of each node in a subarray and concatenate these subarrays into a single edge array E .
- Use an additional array V to store the starting positions of the subarrays.
- Memory consumption: $n+m+\Theta(1)$.

Adjacency Arrays



(Bi)-directed Graph



Adjacency Array

- For any node v , $V[v]$ is the index of the first outgoing edge of v .
- Add dummy entry $V[n+1]=m+1$
- Outgoing edges of node v are accessible at $E[V[v]], \dots, E[V[v+1]-1]$

Question

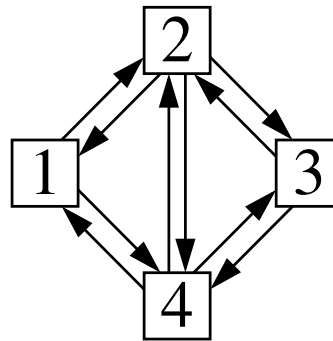
Are there better representations that allow to add or remove edges in constant time?

Two popular choices:

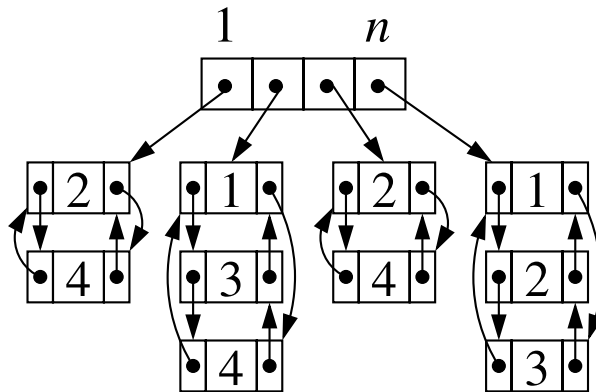
Adjacency Lists

Adjacency Matrices

Adjacency Lists



(Bi)-directed Graph



Adjacency List

$$\begin{pmatrix} 0 & 1 & 0 & 1 \\ 1 & 0 & 1 & 1 \\ 0 & 1 & 0 & 1 \\ 1 & 1 & 1 & 0 \end{pmatrix}$$

Adjacency Matrix

Adjacency Lists

Idea: Use for each node v a double-linked list that stores its outgoing neighbors (alternatively we can also use the incoming neighbors or lists for both).

Advantage:

- Insertion of edges goes in constant time.
- Well suited for sparse graphs (occur often in practice)

Adjacency Matrices

Idea: Represent a graph consisting of n nodes by an $n \times n$ matrix A . Set

$$A_{ij} = 1 \text{ if } (i, j) \in E$$

$$A_{ij} = 0 \text{ otherwise}$$

Insertion, removal, edge queries work in constant time.

$O(n)$ to obtain an edge entering or leaving a node.

Disadvantage: Storage requirement n^2 even for sparse graphs.

Graph Traversal

We want to have algorithms that visit every node of a given graph in linear time.

Idea for breadth-first-search: Start at a node s and visit in iteration i all nodes of distance i to s .

Breadth-first-search (BFS)

Three types of nodes



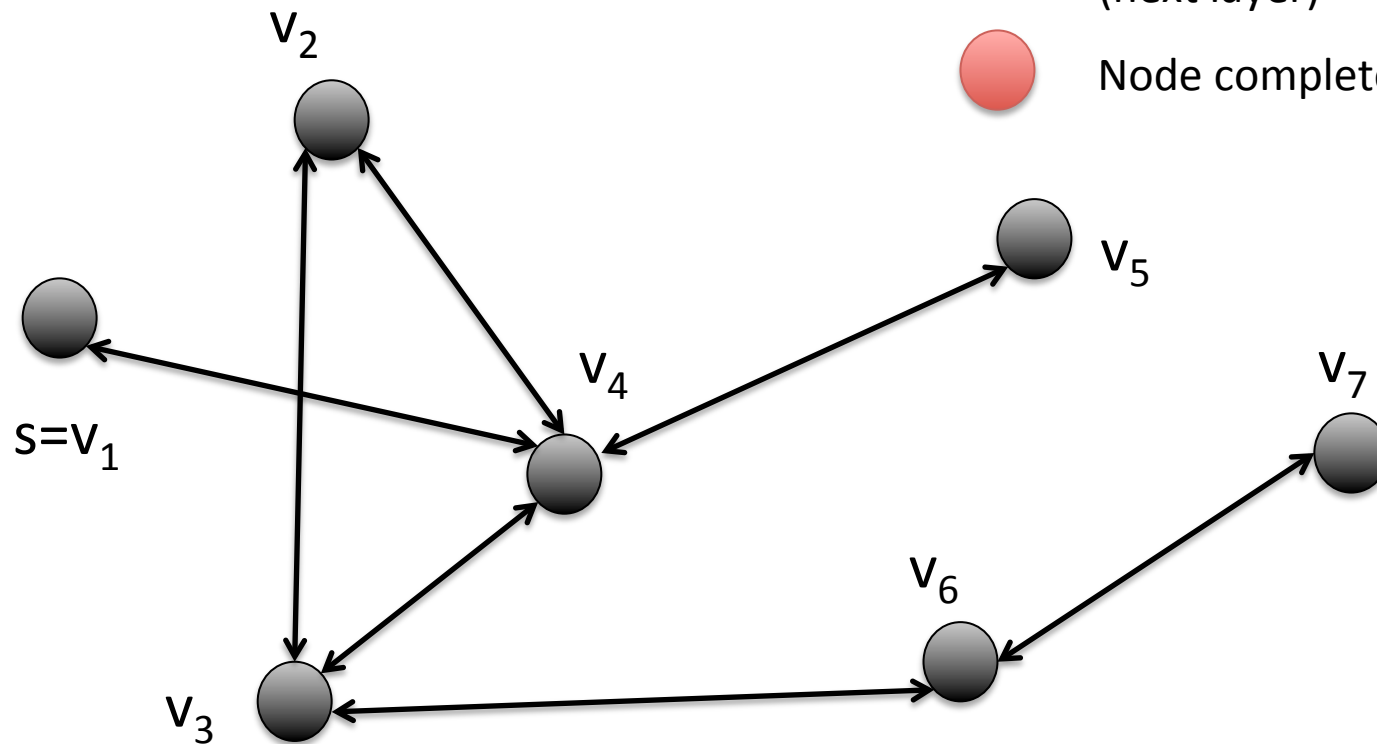
Active node (current layer)



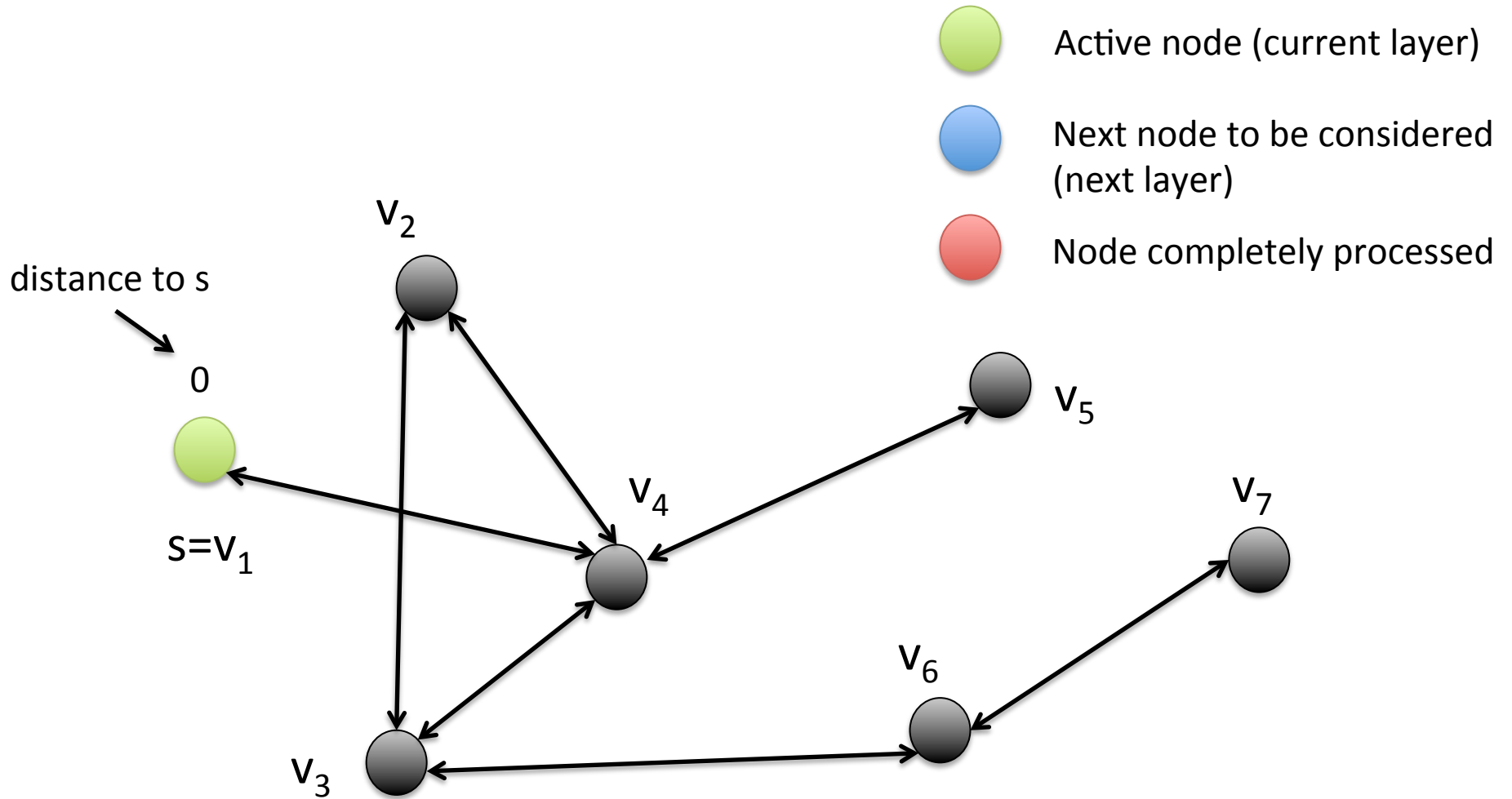
Next node to be considered
(next layer)



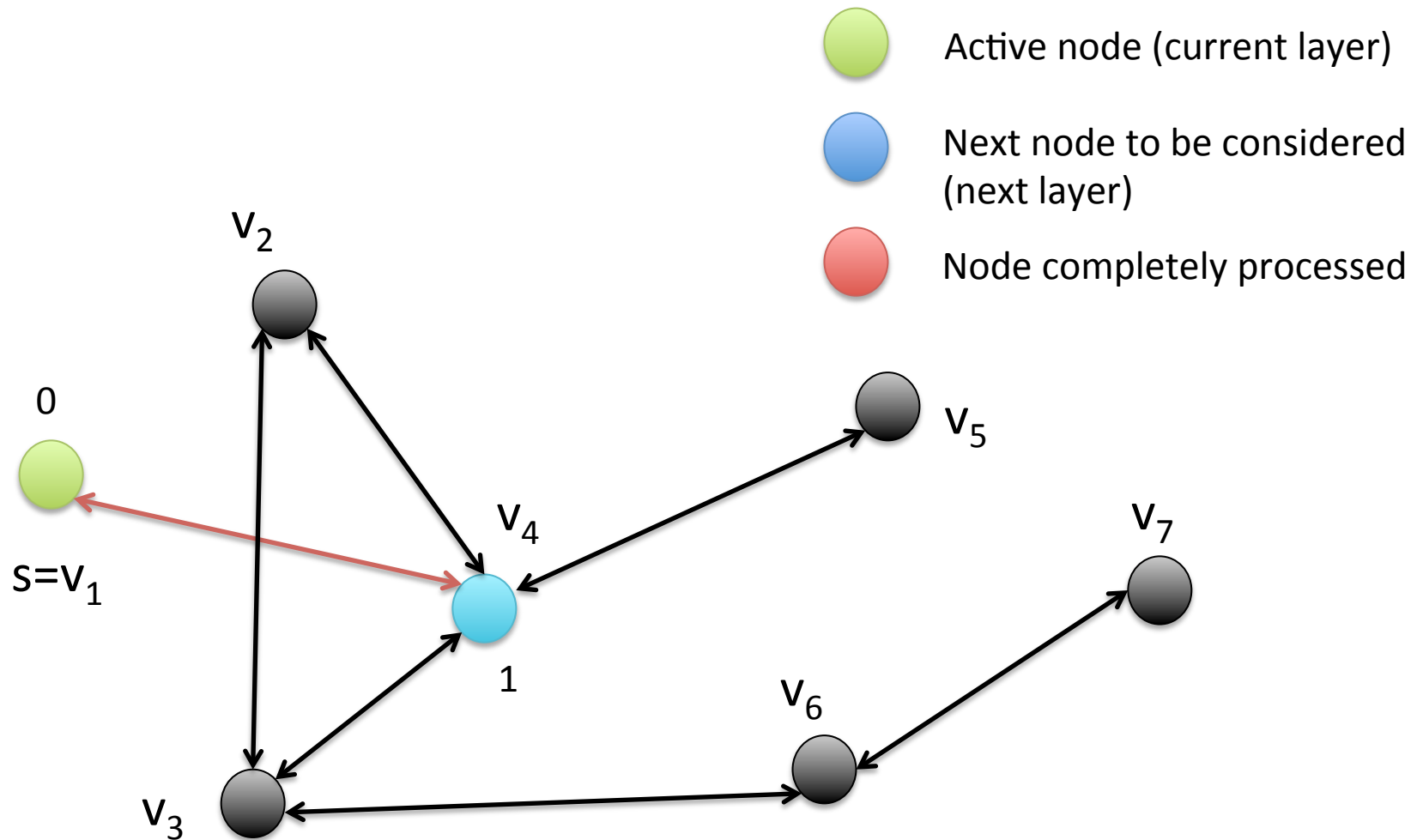
Node completely processed



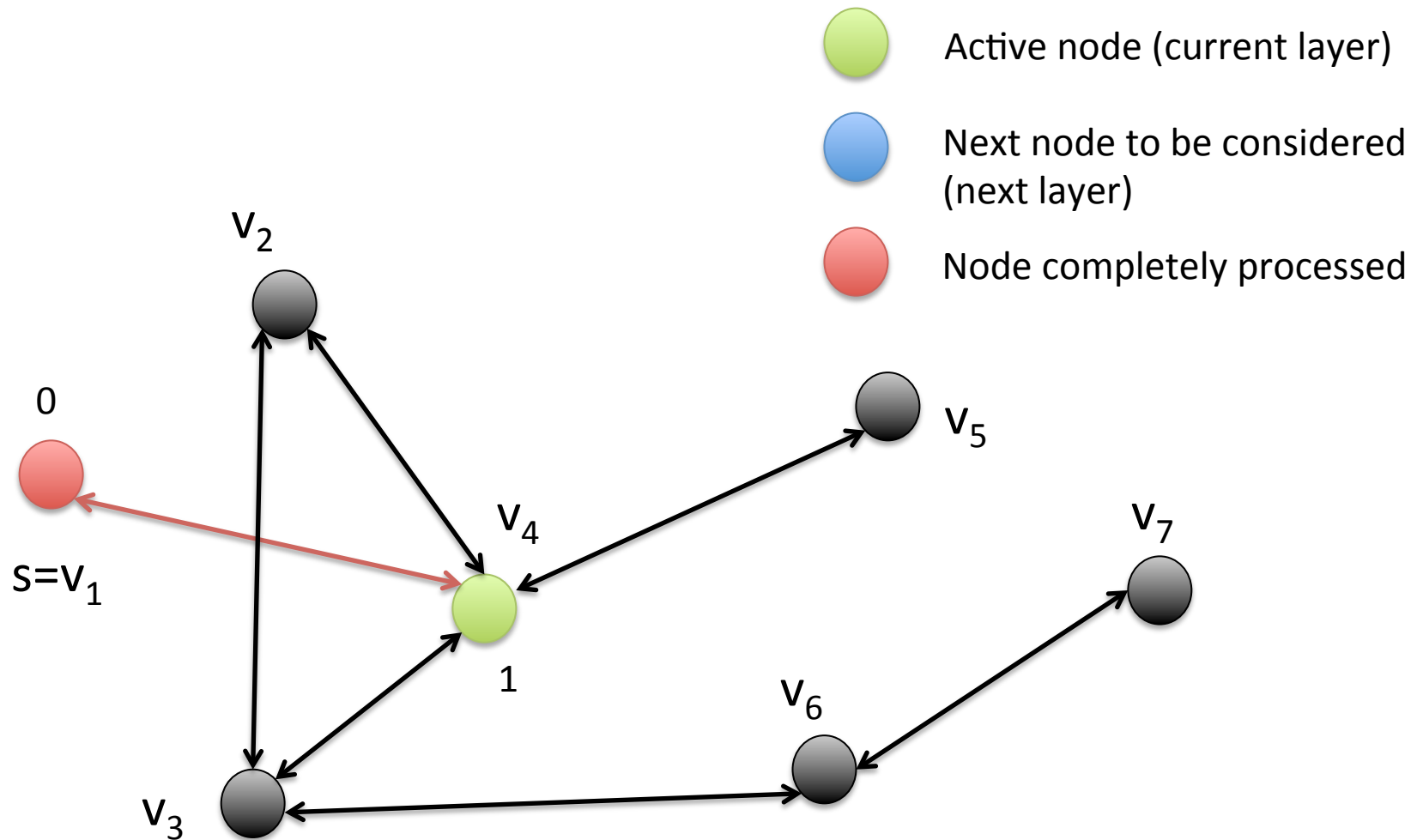
Breadth-first-search (BFS)



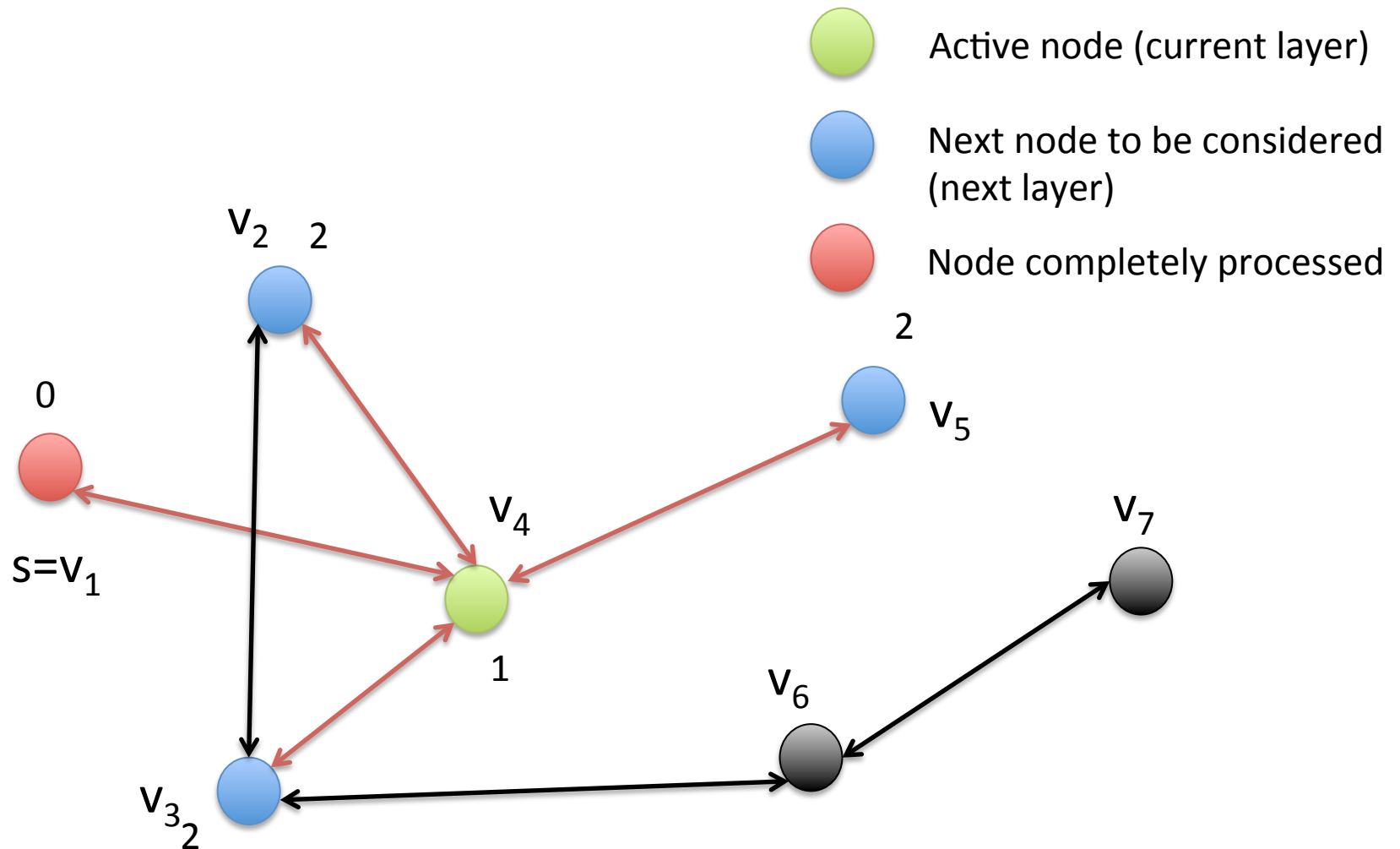
Breadth-first-search (BFS)



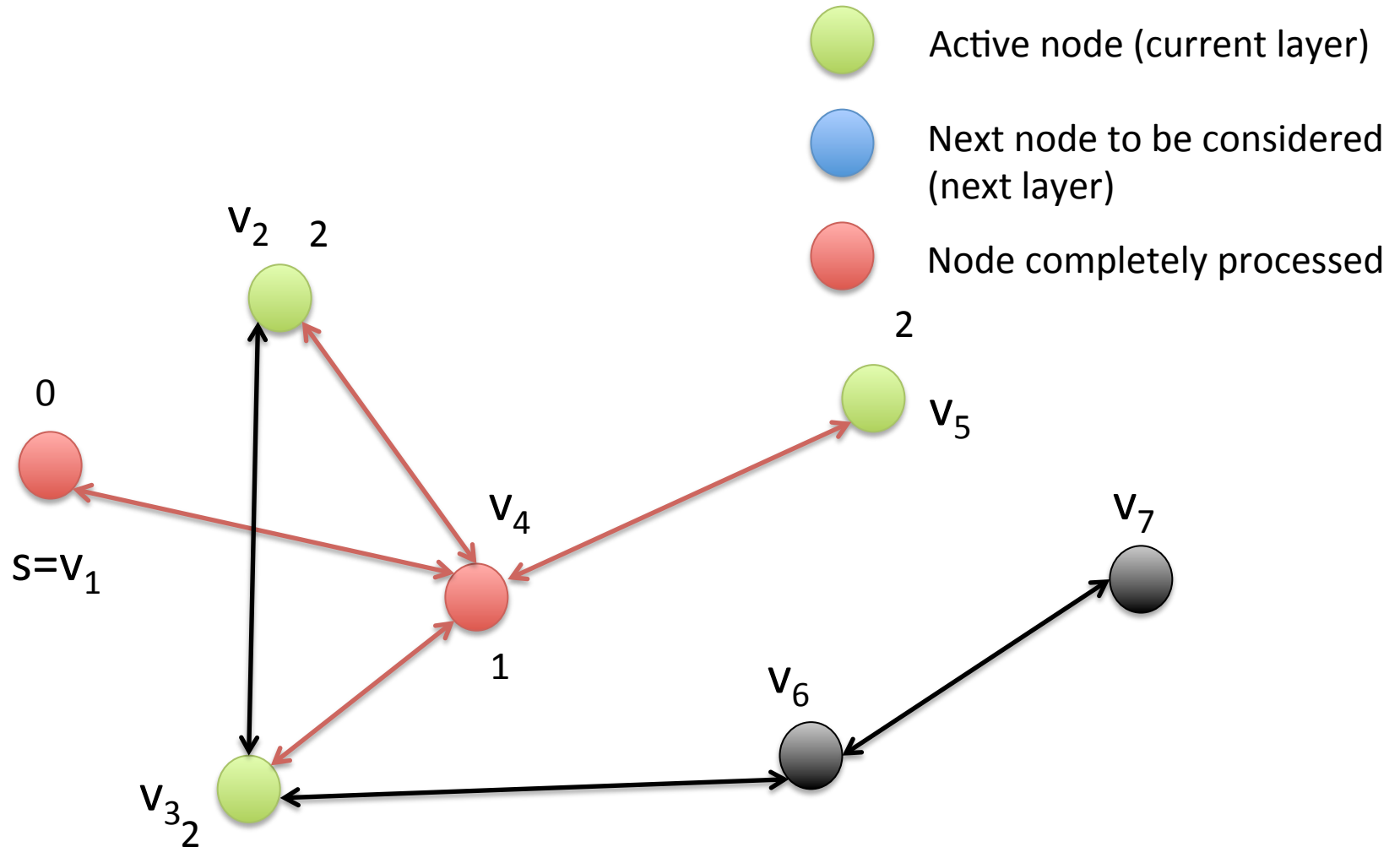
Breadth-first-search (BFS)



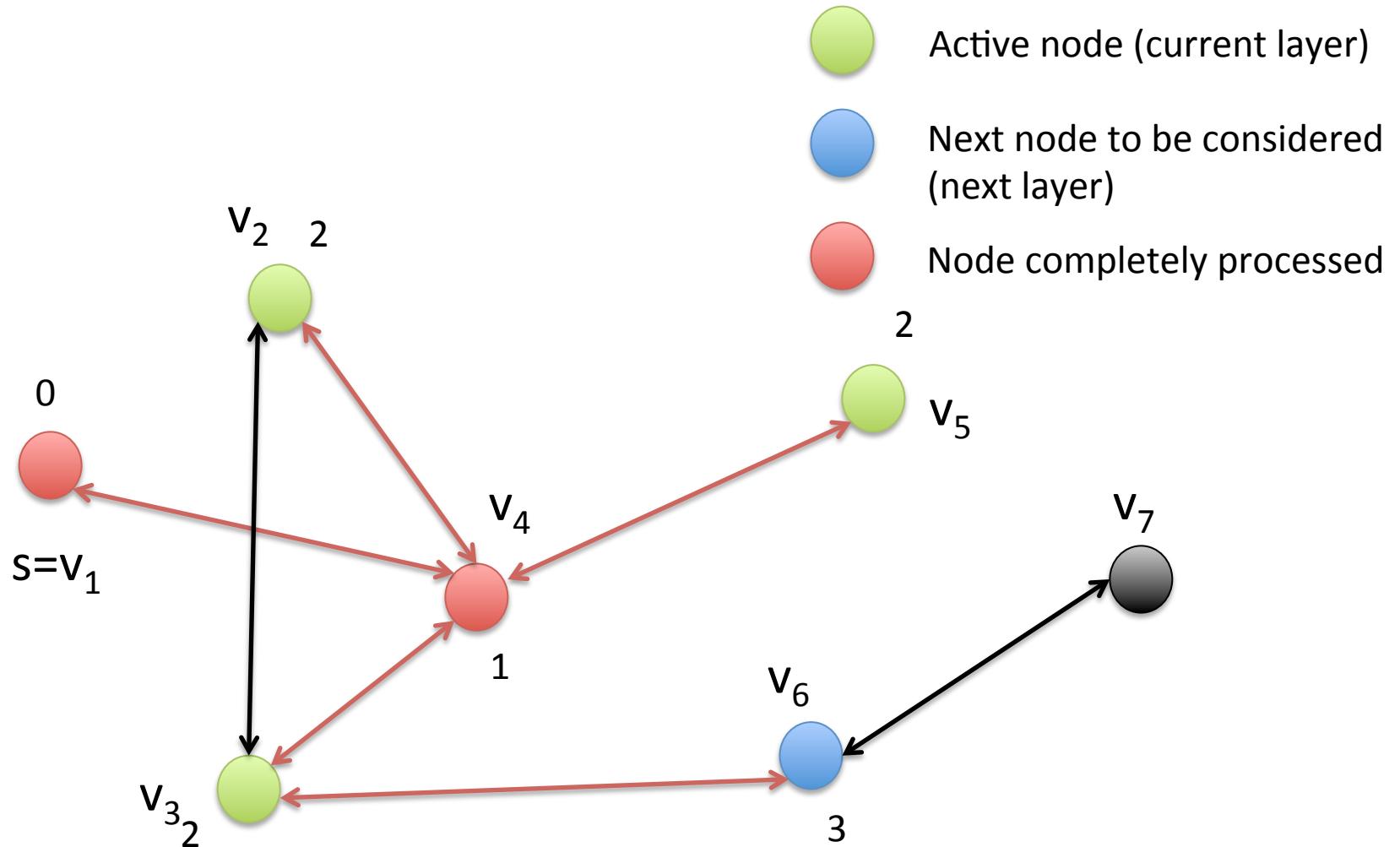
Breadth-first-search (BFS)



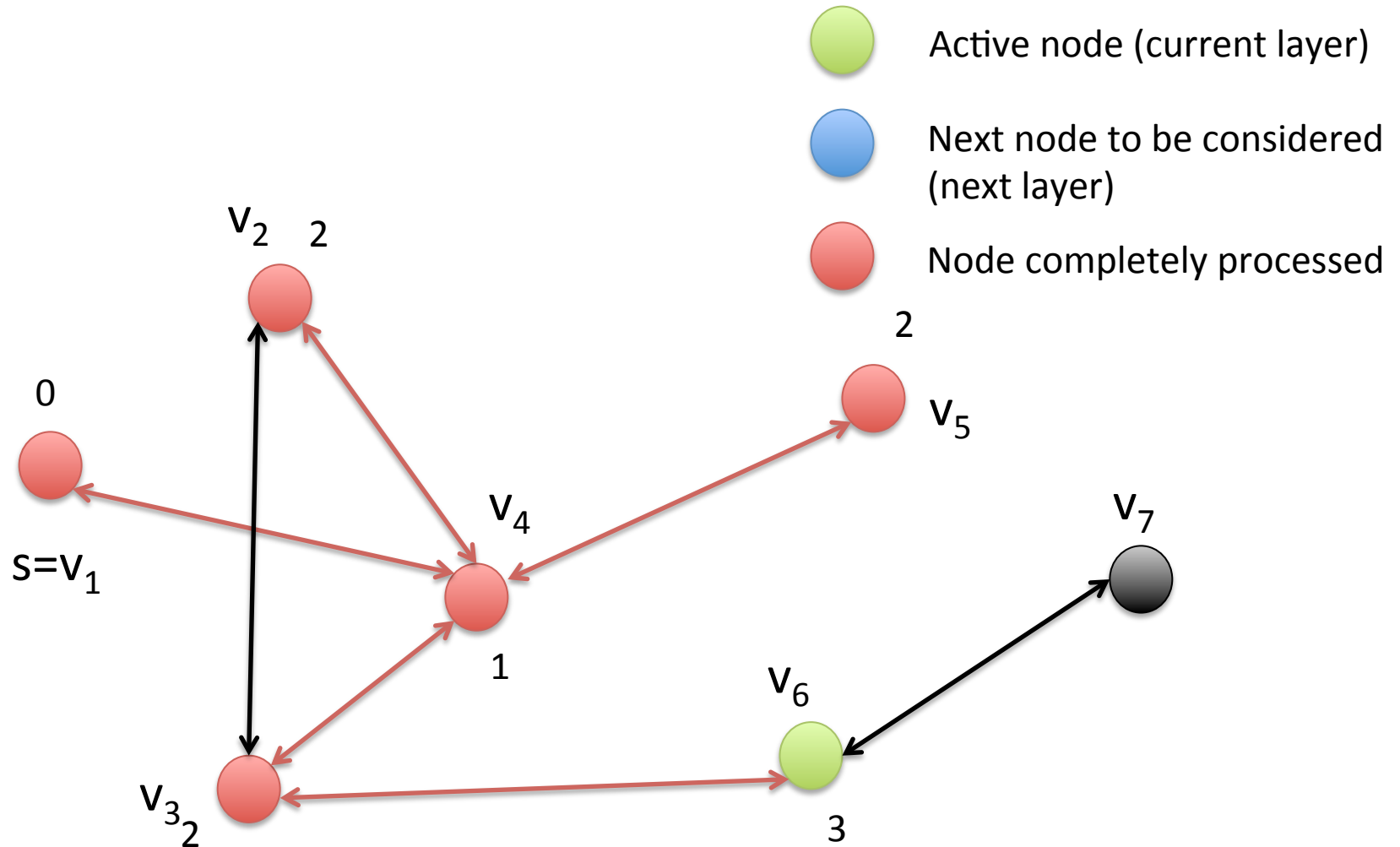
Breadth-first-search (BFS)



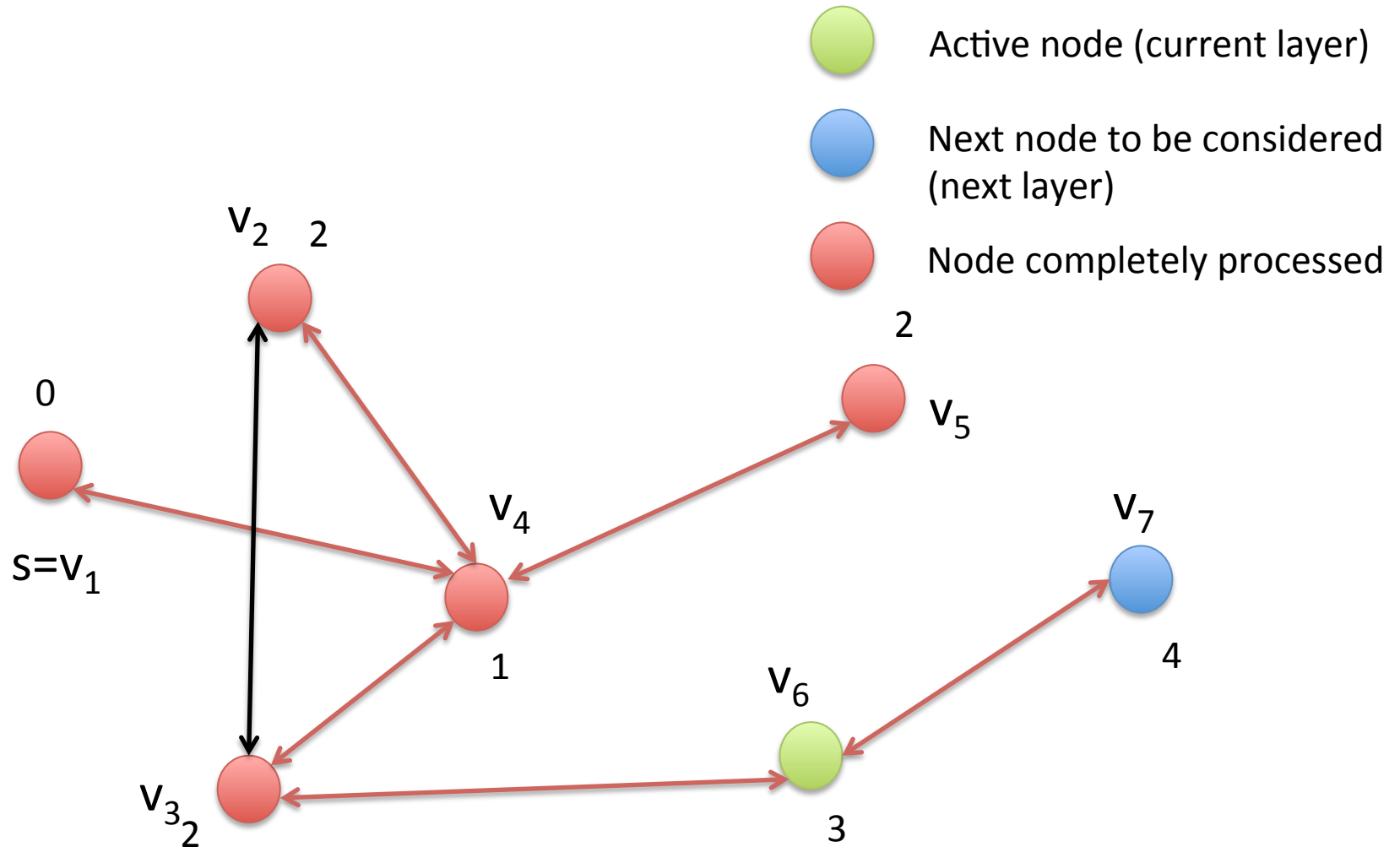
Breadth-first-search (BFS)



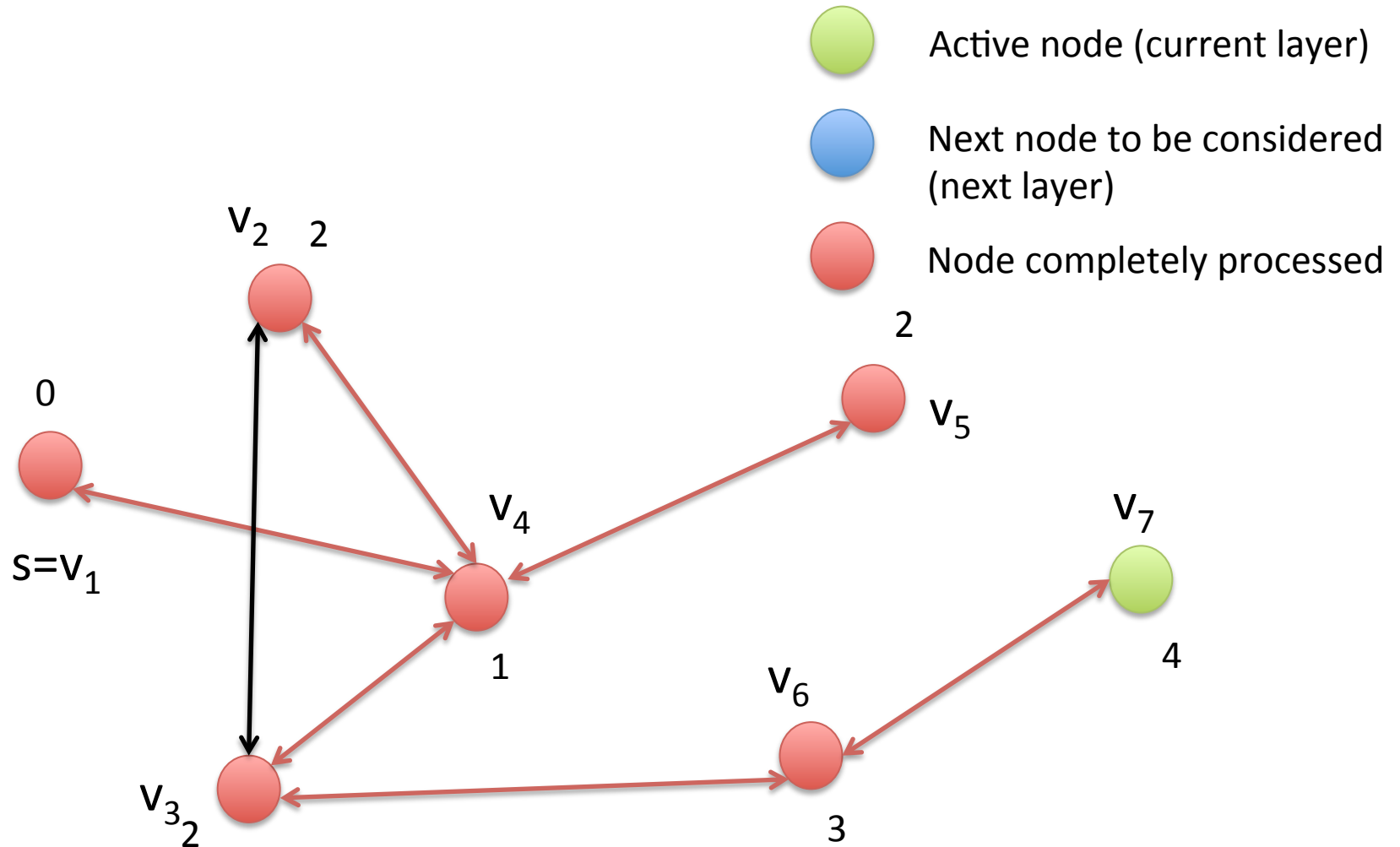
Breadth-first-search (BFS)



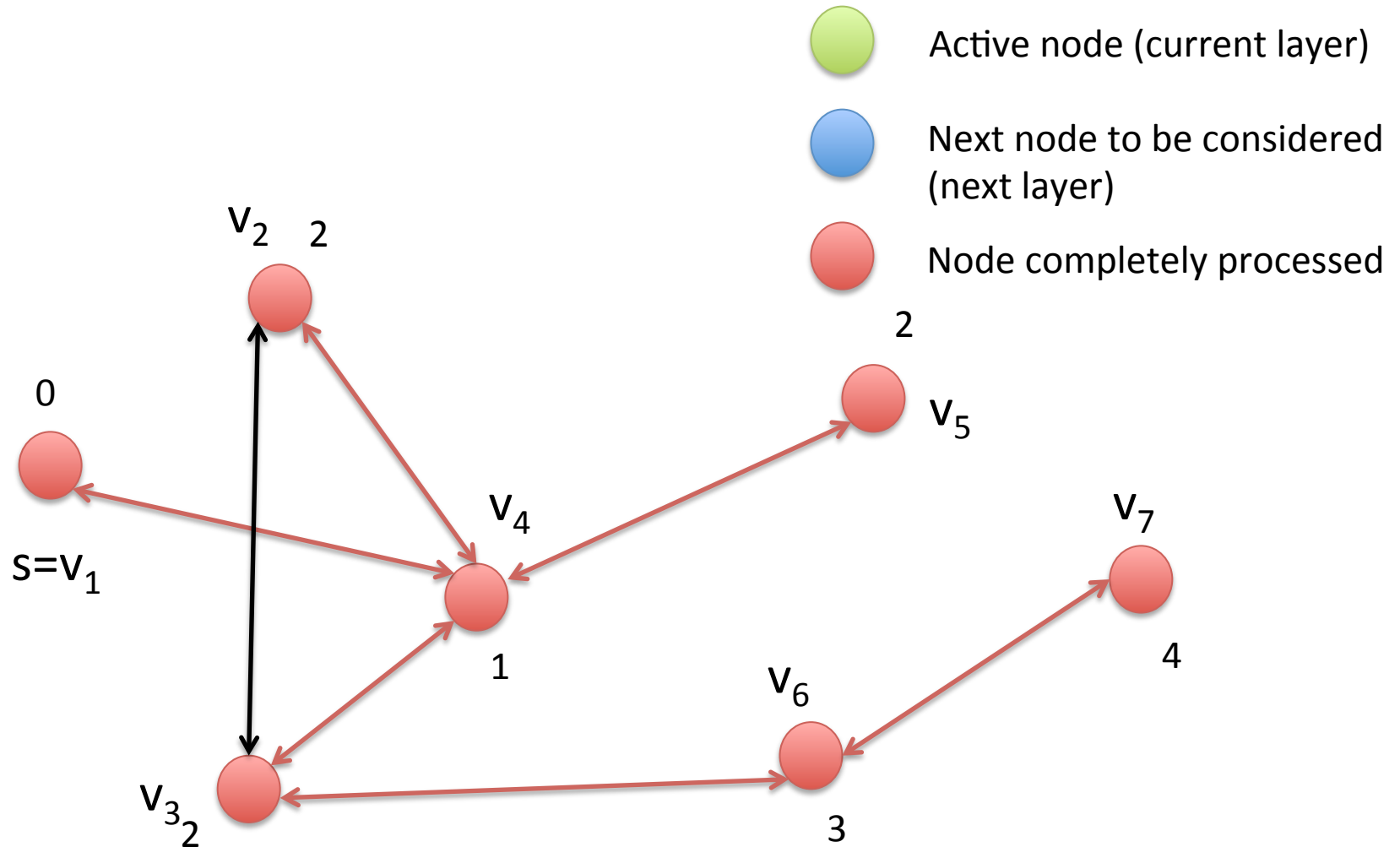
Breadth-first-search (BFS)



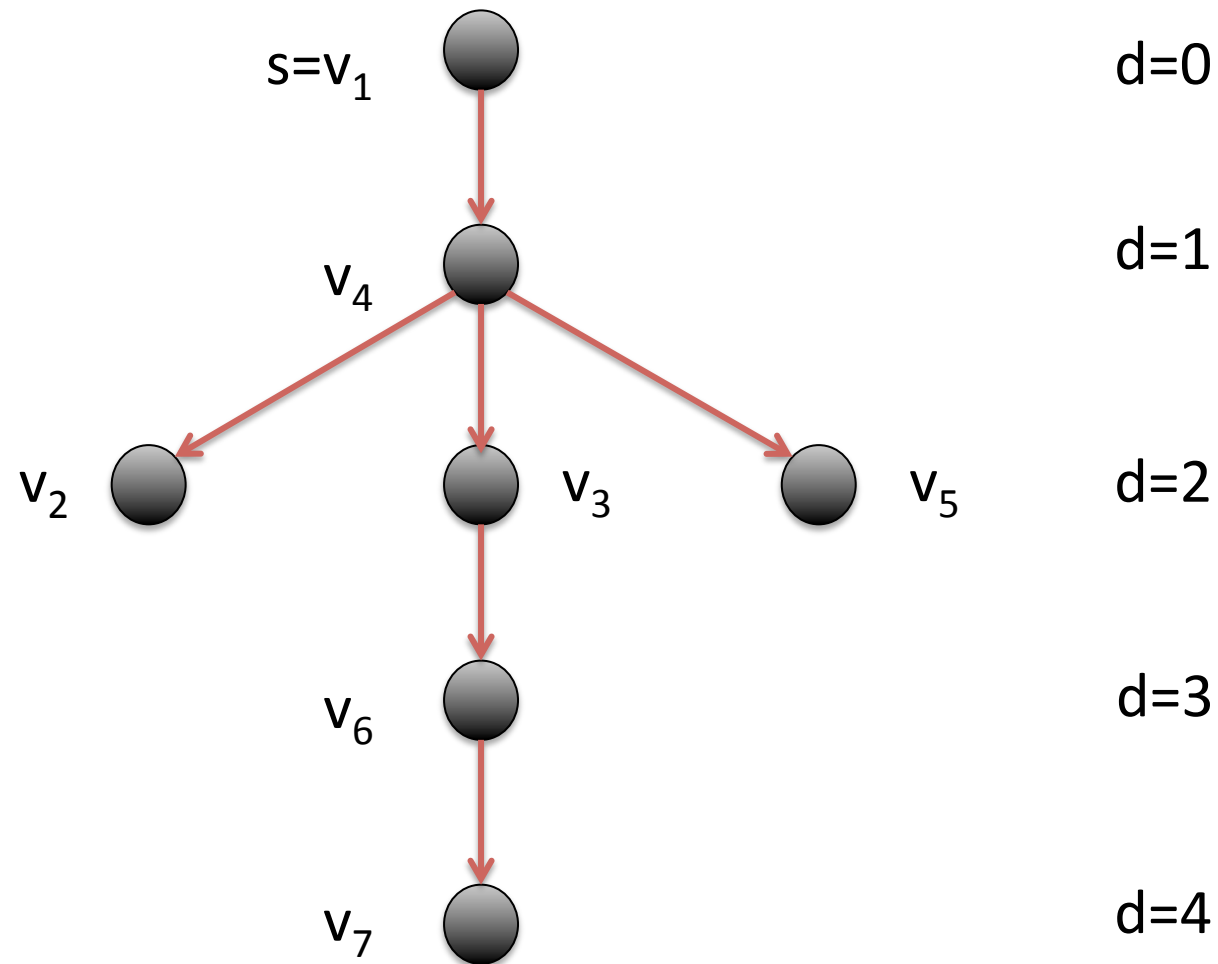
Breadth-first-search (BFS)



Breadth-first-search (BFS)



Breadth-First-Search Tree



Pseudo-code Breadth-First-Search

Function $bfs(s : NodeId) : (NodeArray \text{ of } NodeId) \times (NodeArray \text{ of } 0..n)$
 $d = \langle \infty, \dots, \infty \rangle : NodeArray \text{ of } NodeId$ // distance from root
 $parent = \langle \perp, \dots, \perp \rangle : NodeArray \text{ of } NodeId$
 Green nodes $d[s] := 0$
 $parent[s] := s$ // self-loop signals root
 $Q = \langle s \rangle : Set \text{ of } NodeId$ // current layer of BFS tree
 $Q' = \langle \rangle : Set \text{ of } NodeId$ // next layer of BFS tree
 Blue nodes **for** $\ell := 0$ **to** ∞ **while** $Q \neq \langle \rangle$ **do** // explore layer by layer
 invariant Q contains all nodes with distance ℓ from s
 foreach $u \in Q$ **do**
 foreach $(u, v) \in E$ **do** // scan edges out of u
 if $parent(v) = \perp$ **then** // found an unexplored node
 $Q' := Q' \cup \{v\}$ // remember for next layer
 $d[v] := \ell + 1$
 $parent(v) := u$ // update BFS tree
 $(Q, Q') := (Q', \langle \rangle)$ // switch to next layer
 Green nodes become red, blue nodes become green **return** $(d, parent)$ // the BFS tree is now $\{(v, w) : w \in V, v = parent(w)\}$

Implementation

- Use **Adjacency Array** and **Priority Queues Q**.
- We introduce each node into the Priority Queue only once. (Time $O(n)$)
- We only consider a node in the Priority Queues together with its edges once. ($O(n+m)$)
- Updating the distance vector and the parent vector is done once for every node. (Time $O(n)$)
- **Total Runtime:** $O(n+m)$.