

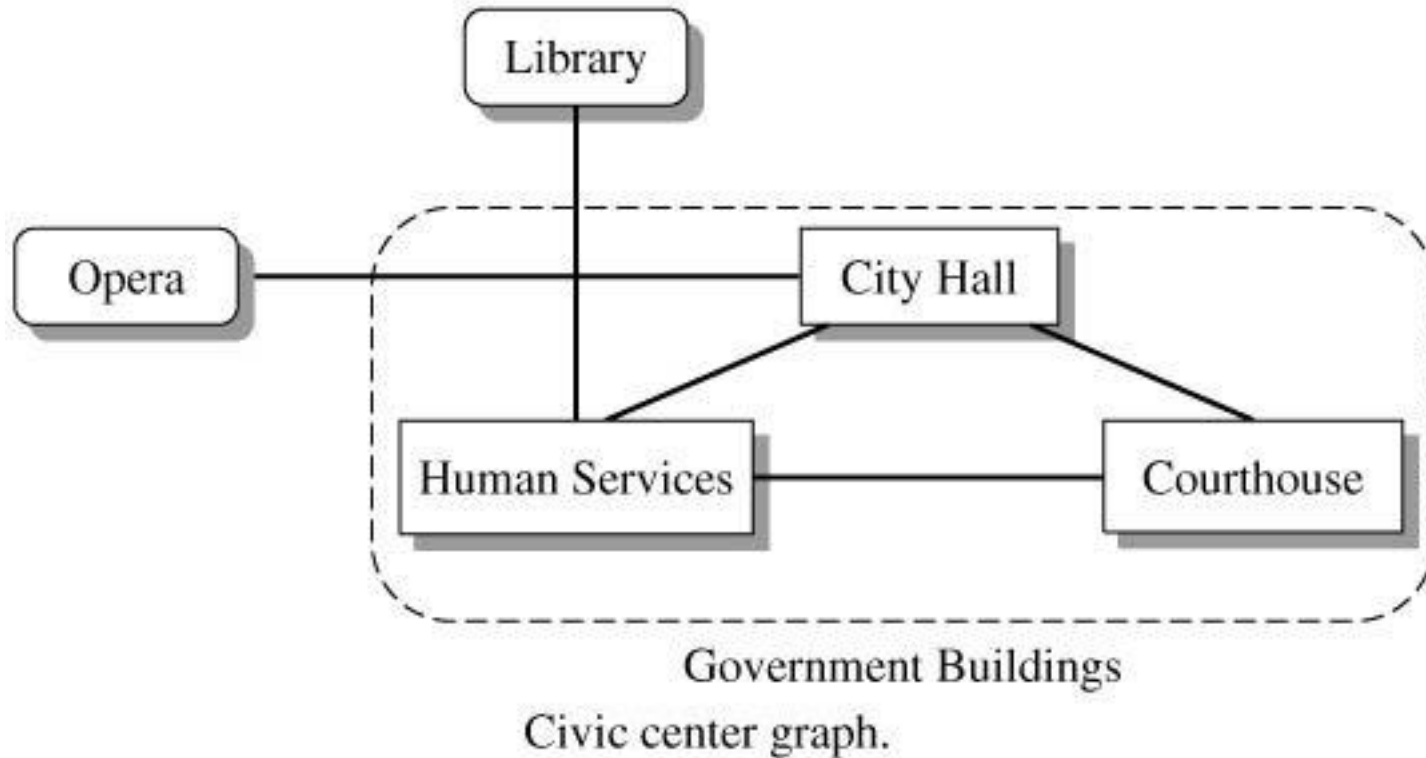
Graphs

Graph Terminology

- A graph consists of a set of *vertices* V , along with a set of *edges* E that connect pairs of vertices.
 - An edge $e = (v_i, v_j)$ connects vertices v_i and v_j .
 - A *self-loop* is an edge that connects a vertex to itself. We assume that none of our graphs have self-loops.

$$\begin{aligned} \text{Vertices} &= \{v_1, v_2, v_3, \dots, v_m\} \\ \text{Edges} &= \{e_1, e_2, e_3, \dots, e_n\} \end{aligned}$$

Graph Terminology (continued)



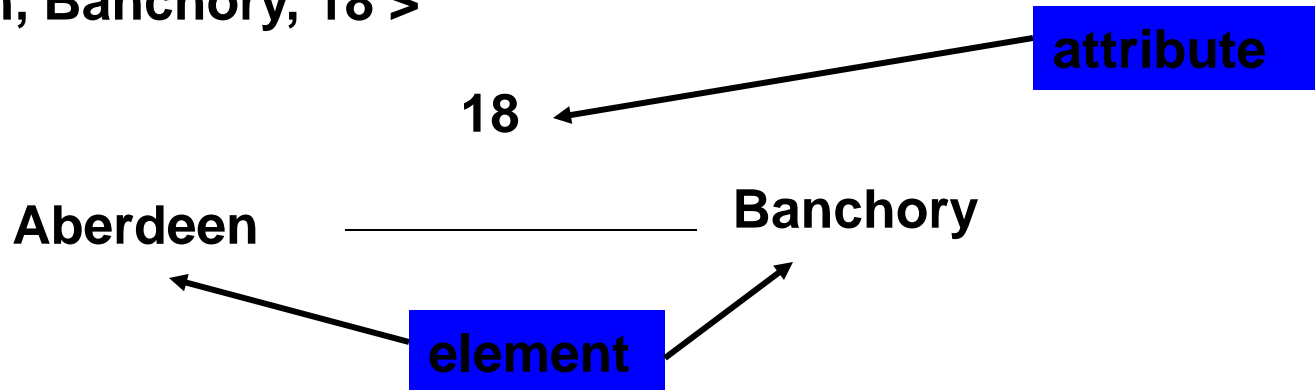
Data in Graphs

Both vertices and edges may have data values associated with them:

- *element* : the data value at a node
- *attribute* : the data value associated with an edge

Where there is a data value associated with an edge this is called a **weighted edge**.

< Aberdeen, Banchory, 18 >



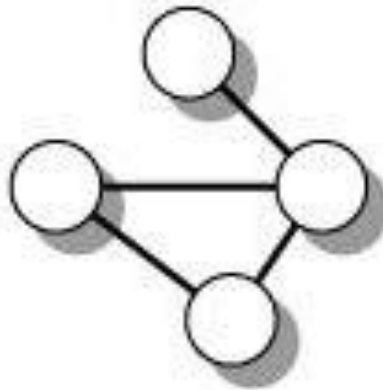
Graph Terminology (continued)

- The *degree* of a vertex is the number of edges originating at the vertex.
- Two vertices in a graph are *adjacent* (*neighbors*) if there is an edge connecting the vertices.
- A path between vertices v and w is a series of edges leading from v to w . The path length is the number of edges in the path.

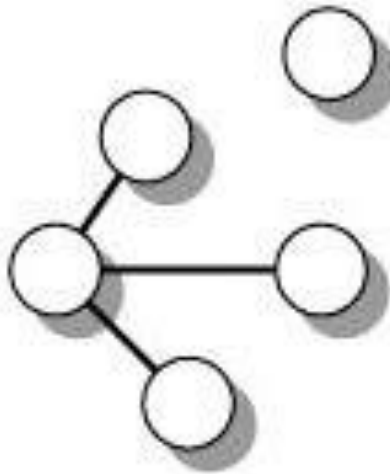
Graph Terminology (continued)

- A *path* is simple if all its edges are distinct. A cycle is a simple path that starts and ends on the same vertex.
- A graph is *connected* if there is a path between any pair of distinct vertices.
- A *complete graph* is a connected graph in which each pair of vertices is linked by an edge.

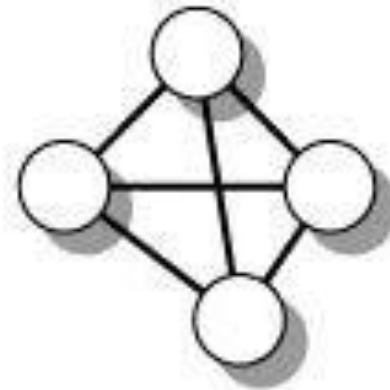
Graph Terminology (continued)



(a) Connected



(b) Disconnected

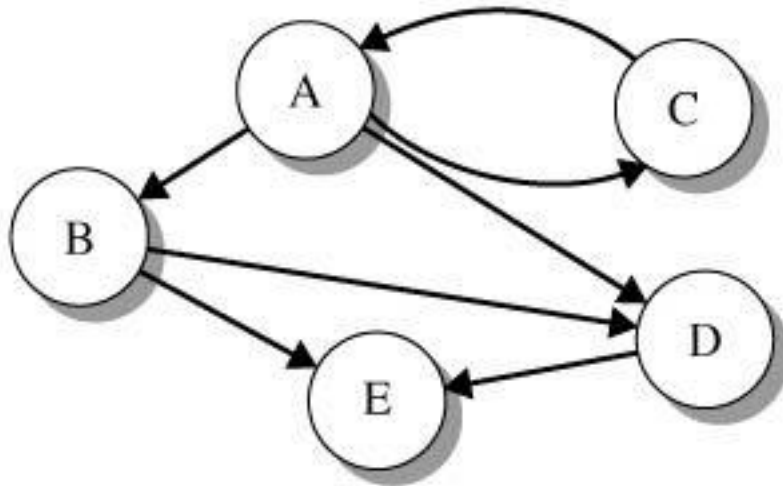


(c) Complete

Graph Terminology (continued)

- A graph described until now is termed an *undirected graph*. Movement between vertices can occur in either direction.
- In a *digraph*, edges have a direction. There might be an edge from v to w but no edge from w to v .

Graph Terminology (continued)



Vertices $V = \{A, B, C, D, E\}$

Edges $E = \{(A, B), (A, C), (A, D), (B, D), (B, E), (C, A), (D, E)\}$

Sample digraph with five vertices and seven edges.

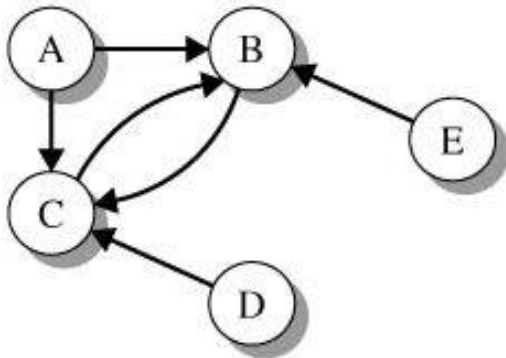
Graph Terminology (continued)

- In a digraph, a *directed path* (path) connecting vertices v_s and v_e is a sequence of directed edges that begin at v_s and end at v_e .
- The number of the edges that emanate from a vertex v is called the *out-degree* of the vertex.
- The number of the edges that terminate in vertex v is the *in-degree* of the vertex.

Graph Terminology (continued)

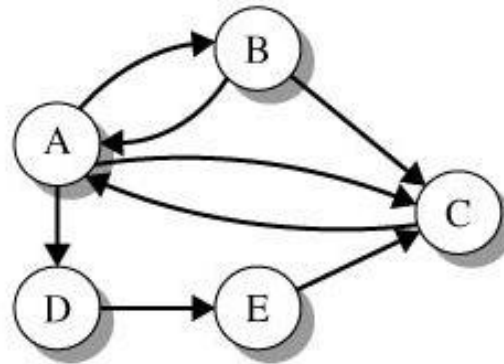
- A digraph is *strongly connected* if there is a path from any vertex to any other vertex.
- The digraph is *weakly connected* if, for each pair of vertices v_i and v_j , there is either a path $P(v_i, v_j)$ or a path $P(v_j, v_i)$.

Graph Terminology (continued)



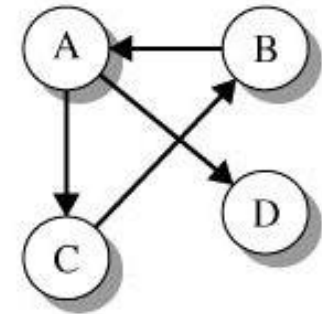
Not Strongly or Weakly Connected
(No path from E to D or from D to E)

(a)



Strongly Connected

(b)

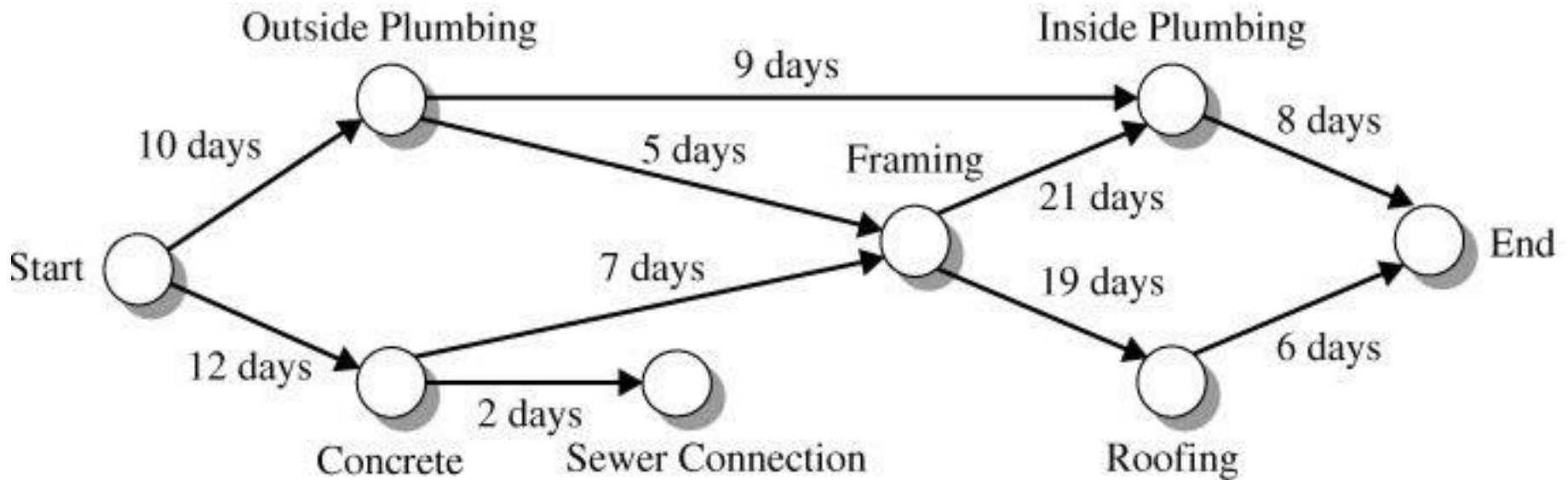


Weakly Connected
(No path from D to any other vertex)

(c)

Graph Terminology (concluded)

- An *acyclic* graph has no cycles.
- Each edge in a *weighted digraph*, has a cost associated with traversing the edge.



Creating and Using Graphs

- The Graph interface specifies all basic graph operations including inserting and erasing vertices and edges.

Creating and Using Graphs (continued)

interface GRAPH<T>		ds.util.Graph
		Methods
boolean	addEdge (T v1, T v2, int w) If the edge (v1, v2) is not in the graph, adds the edge with weight w and returns true. Returns false if the edge is already in the graph. If v1 or v2 is not a vertex in the graph, throws IllegalArgumentException.	
boolean	addVertex (T v) If v is not in the graph, adds it to the graph and returns true; otherwise, returns false.	
void	clear () Removes all of the vertices and edges from the graph.	

Creating and Using Graphs (continued)

interface GRAPH<T>		ds.util.Graph
	Methods (continued)	
boolean	containsEdge (T v1, T v2) Returns true if there is an edge from v1 to v2 and returns false otherwise. If v1 or v2 is not a vertex in the graph, throws <code>IllegalArgumentException</code> .	
boolean	containsVertex (Object v) Returns true if v is a vertex in the graph and false otherwise.	
Set<T>	getNeighbors (T v) Returns the vertices that are adjacent to vertex v in a Set object. If v is not a graph vertex, throws <code>IllegalArgumentException</code> .	

Creating and Using Graphs (continued)

interface GRAPH<T>		ds.util.Graph
	Methods (continued)	
int	getWeight(T v1, T v2) Returns the weight of the edge connecting vertex v1 to v2. If the edge (v1,v2) does not exist, return -1. If v1 or v2 is not a vertex in the graph, throws IllegalArgumentException.	
boolean	isEmpty() Returns true if the graph has no vertices or edges and false otherwise.	
int	numberOfEdges() Returns the number of edges in the graph.	

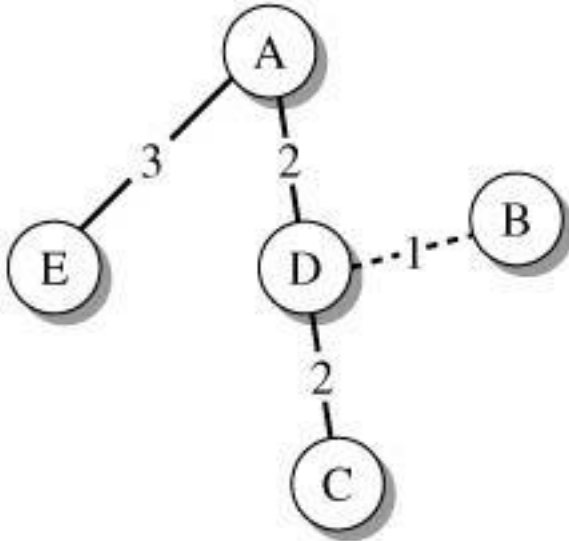
Creating and Using Graphs (continued)

interface GRAPH<T>		ds.util.Graph
	Methods (continued)	
int	numberOfVertices() Returns the number of vertices in the graph.	
boolean	removeEdge(T v1, T v2) If (v1,v2) is an edge, removes the edge and returns true; otherwise, returns false. If v1 or v2 is not a vertex in the graph, throws <code>IllegalArgumentException</code> .	
boolean	removeVertex(Object v) If v is a vertex in the graph, removes it from the graph and returns true; otherwise, returns false.	

Creating and Using Graphs (continued)

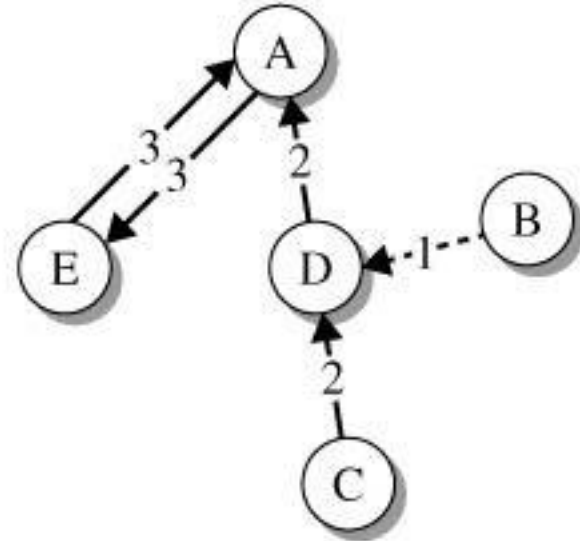
interface GRAPH<T>	ds.util.Graph
	Methods (continued)
int	setWeight (T v1, T v2, int w) If edge (v1, v2) is in the graph, update the weight of the edge and return the previous weight; otherwise, return -1. If v1 or v2 is not a vertex in the graph, throws IllegalArgumentException.
Set<T>	vertexSet () Returns a set-view of the vertices in the graph.

Creating and Using Graphs (continued)



`addEdge("B", "D", 1)`
D is a neighbor of B,
and B is a neighbor of D.

(a)



`addEdge("B", "D", 1)`
D is a neighbor of B.
B is not a neighbor of D.

(b)

Differences in implementation between a
digraph and an undirected graph.

The DiGraph Class

- The DiGraph class implements the Graph interface and adds other methods that are useful in applications.
 - A constructor creates an empty graph.
 - The methods `inDegree()` and `outDegree()` are special methods that access a properties that are unique to a digraph.
 - The static method `readGraph()` builds a graph whose vertices are strings.

The DiGraph Class (continued)

- DiGraph method readGraph() inputs the vertex values and the edges from a textfile.
 - File format:

```
(Number of Edges n)
Source1      Destination1      Weight1
Source2      Destination2      Weight2
. . .
Sourcen      Destinationn      Weightn
```

The DiGraph Class (continued)

- The method `toString()` provides a representation of a graph. For each vertex, the string gives the list of adjacent vertices along with the weight for the corresponding edge. The information for each vertex also includes its in-degree and out-degree.

The DiGraph Class (continued)

File samplegraph.dat

```
5          // data for the vertices
```

```
A B C D E
```

```
6          // data for the edges
```

```
A B 3
```

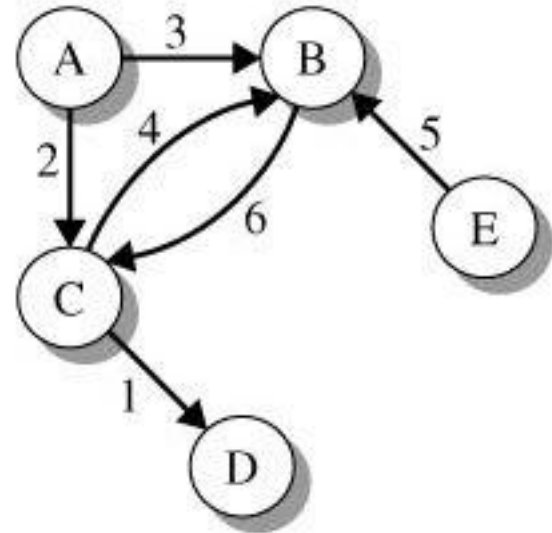
```
A C 2
```

```
B C 6
```

```
C B 4
```

```
C D 1
```

```
E B 5
```



```
// input vertices, edges, and weights from samplegraph.dat
```

```
DiGraph g = DiGraph.readGraph("samplegraph.dat");
```

```
// display the graph
```

```
System.out.println(g)
```


The DiGraph Class (continued)

Output:

```
A:  in-degree 0   out-degree 2
    Edges: B(3)   C(2)
B:  in-degree 3   out-degree 1
    Edges: C(6)
C:  in-degree 2   out-degree 2
    Edges: B(4)   D(1)
D:  in-degree 1   out-degree 0
    Edges:
E:  in-degree 0   out-degree 1
    Edges: B(5)
```

Program 24.1 (continued)

```
import java.io.FileNotFoundException;

import ds.util.Set;
import ds.util.Iterator;
import ds.util.DiGraph;

public class Program24_1
{
    public static void main(String[] args)
        throws FileNotFoundException
    {
        // construct graph with vertices of type
        // String by reading from the file "graphIO.dat"
        DiGraph<String> g =
            DiGraph.readGraph("graphIO.dat");
        String vtxName;
        // sets for vertexSet() and adjacent
        // vertices (neighbors)
        Set<String> vtxSet, neighborSet;
```

Program 24.1 (continued)

```
// output number of vertices and edges
System.out.println("Number of vertices: " +
    g.numberOfVertices());
System.out.println("Number of edges: " +
    g.numberOfEdges());

// properties relative to vertex A
System.out.println("inDegree for A: " +
    g.inDegree("A"));
System.out.println("outDegree for A: " +
    g.outDegree("A"));
System.out.println("Weight e(A,B): " +
    g.getWeight("A", "B"));

// delete edge with weight 2
g.removeEdge("B", "A");

// delete vertex "E" and edges (E,C),
// (C,E) and (D,E)
g.removeVertex("E");
```

Program 24.1 (continued)

```
/* add and update attributes of the graph */
// increase weight from 4 to 8
g.setWeight("A","B",8);
// add vertex F
g.addVertex("F");
// add edge (F,D) with weight 3
g.addEdge("F","D",3);

// after all updates, output the graph
// and its properties
System.out.println("After all the graph updates");
System.out.println(g);

// get the vertices as a Set and
// create set iterator
vtxSet = g.vertexSet();
Iterator vtxIter = vtxSet.iterator();
```

Program 24.1 (concluded)

```
// scan the vertices and display
// the set of neighbors
while(vtxIter.hasNext())
{
    vtxName = (String)vtxIter.next();
    neighborSet = g.getNeighbors(vtxName);
    System.out.println("    Neighbor set for " +
        "vertex " + vtxName + " is "
        + neighborSet);
}
}
```

Program 24.1 (Run)

```
Number of vertices: 5
Number of edges: 8
inDegree for A: 1
outDegree for A: 3
Weight e(A,B): 4
After all the graph updates
A:  in-degree 0   out-degree 3
   Edges: B(8)   C(7)   D(6)
B:  in-degree 2   out-degree 0
   Edges:
C:  in-degree 1   out-degree 1
   Edges: B(3)
D:  in-degree 2   out-degree 0
   Edges:
F:  in-degree 0   out-degree 1
   Edges: D(3)
```

Program 24.1

(Run, concluded)

```
Neighbor set for vertex D is []  
Neighbor set for vertex F is [D]  
Neighbor set for vertex A is [D, B, C]  
Neighbor set for vertex B is []  
Neighbor set for vertex C is [B]
```

Graph Traversal Algorithms

- In general, graphs do not have a vertex, like a root, that initiates unique paths to each of the vertices. From any starting vertex in a graph, it might not be possible to search all of the vertices. In addition, a graph could have a cycle that results in multiple visits to a vertex.

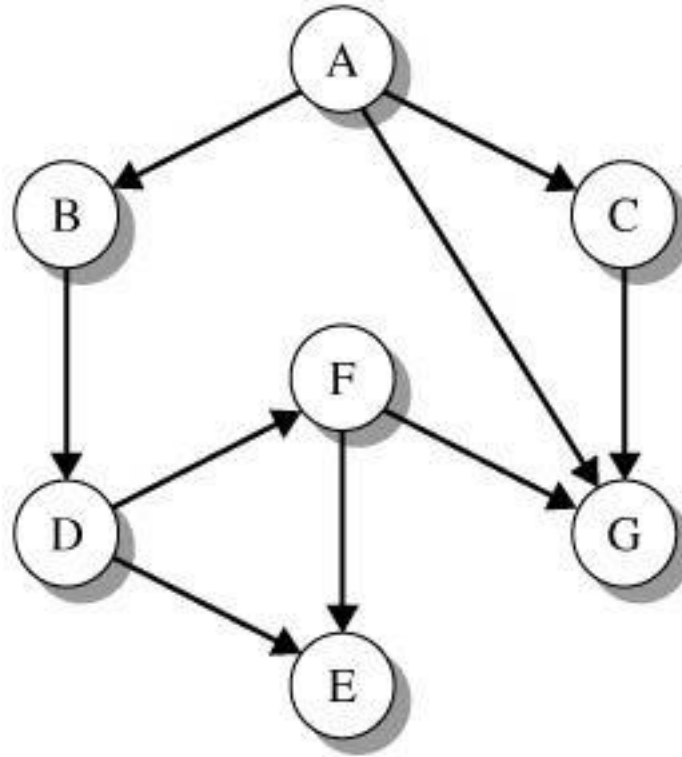
Graph Traversal Algorithms (continued)

- The breadth-first search visits vertices in the order of their path length from a starting vertex. It may not visit every vertex of the graph
- The depth-first search traverses all the vertices of a graph by making a series of recursive calls that follow paths through the graph.

Graph Traversal Algorithms (continued)

- Graph algorithms discern the state of a vertex during the algorithm by using the colors WHITE, GRAY, and BLACK.

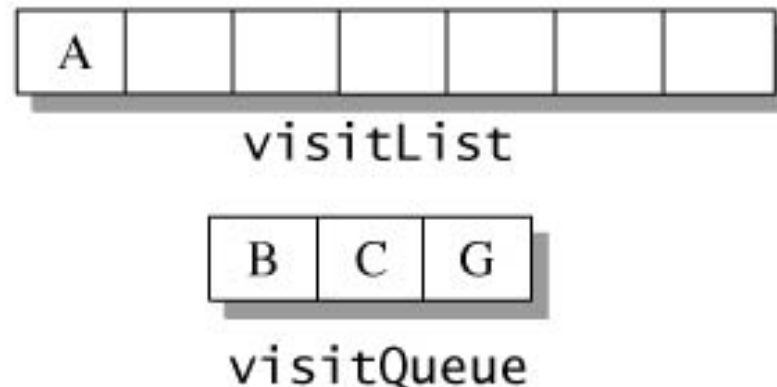
Breadth-First Search Algorithm



Demonstration graph
for the breadth-first search.

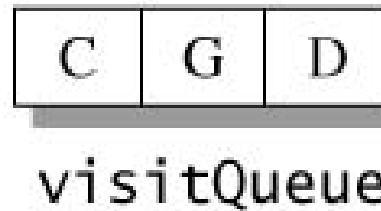
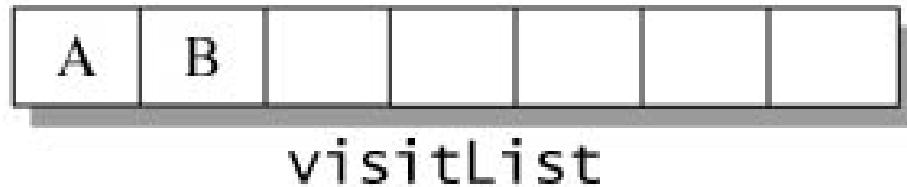
Breadth-First Search Algorithm (continued)

- Color all vertices of the sample graph WHITE and push the starting vertex (A) onto the queue visitQueue.
- Pop A from the queue, color it BLACK, and insert it into visitList, which is the list of visited vertices. Push all WHITE neighbors onto the queue.



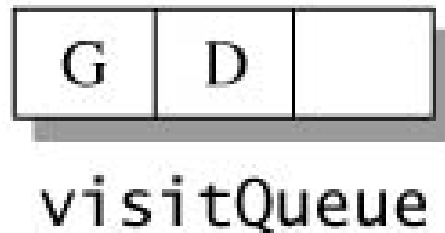
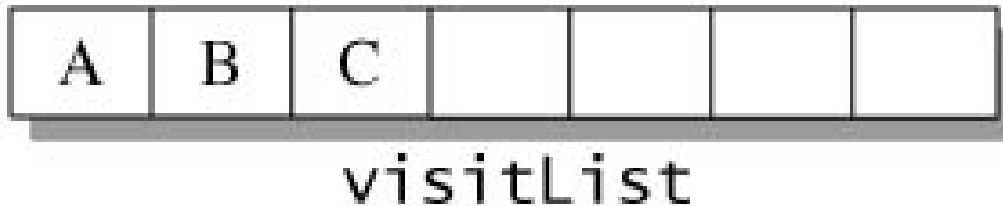
Breadth-First Search Algorithm (continued)

- Pop B from the queue and place it in visitList with color BLACK. The only adjacent vertex for B is D, which is still colored WHITE. Color D GRAY and add it to the queue



Breadth-First Search Algorithm (continued)

- Pop C and place it in visitList. The adjacent vertex G is GRAY. No new vertices enter the queue.



Breadth-First Search Algorithm (continued)

- Pop vertex G from the queue and place it in visitList. G has no adjacent vertices, so pop D from the queue. The neighbors, E and F, enter the queue.



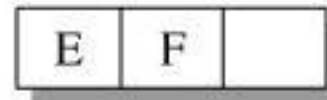
visitList



visitQueue



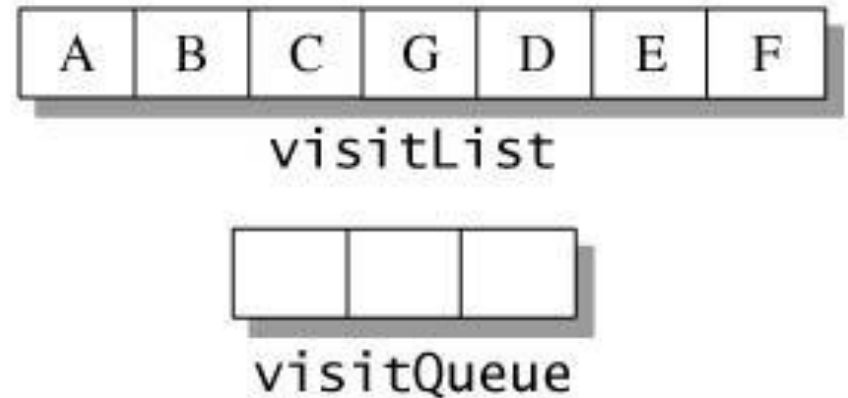
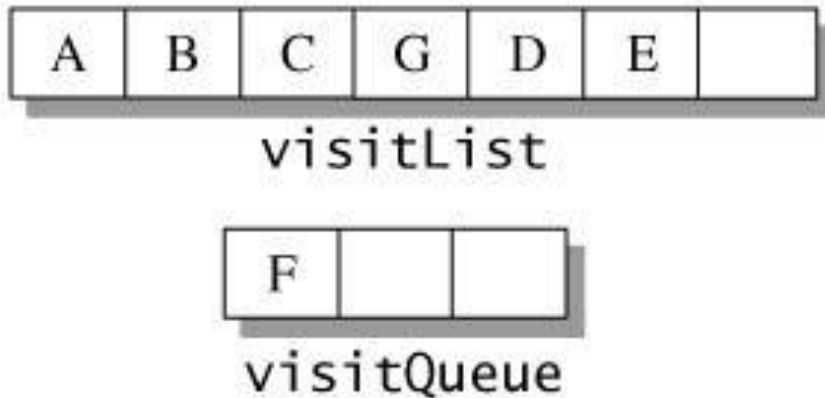
visitList



visitQueue

Breadth-First Search Algorithm (continued)

- Continue in this fashion until the queue is empty.



Implementing Breadth-First Search

- Define

```
public enum VertexColor
{
    WHITE, GRAY, BLACK
}
```

Implementing Breadth-First Search (continued)

- The DiGraph class declares three methods that access and update the color attribute of a vertex.

class DiGraph<T> (color methods)		ds.util
void	colorWhite() Set the color in each vertex to WHITE.	
VertexColor	getColor(T v) Returns the color of vertex v. If v is not a graph vertex, throws IllegalArgumentException.	
VertexColor	setColor(T v, VertexColor c) Sets the color of vertex v and returns the previous color. If v is not a graph vertex, throws IllegalArgumentException.	

Implementing Breadth-First Search (continued)

- The method `bfs()` returns a list of vertices visited during the breadth-first search from a starting vertex.

bfs()

```
// perform the breadth-first traversal
// from sVertex and return the list
// of visited vertices
public static <T> LinkedList<T> bfs(
DiGraph<T> g, T sVertex)
{
    // queue stores adjacent vertices; list
    // stores visited vertices
    LinkedList<T> visitQueue = new LinkedList<T>();
    LinkedList<T> visitList = new LinkedList<T>();

    // set and iterator retrieve and scan
    // neighbors of a vertex
    Set<T> edgeSet;
    Iterator<T> edgeIter;

    T currVertex = null, neighborVertex = null;
```

bfs() (continued)

```
// check that starting vertex is valid
if (!g.containsVertex(sVertex))
    throw new IllegalArgumentException(
        "bfs(): starting vertex not in the graph");

// color all vertices WHITE
g.colorWhite();

// initialize queue with starting vertex
visitQueue.push(sVertex);

while (!visitQueue.isEmpty())
{
    // remove a vertex from the queue, color
    // it black, and add to the list of
    // visited vertices
    currVertex = visitQueue.pop();
    g.setColor(currVertex, VertexColor.BLACK);
    visitList.add(currVertex);
}
```

bfs() (continued)

```
// obtain the set of neighbors for current vertex
edgeSet = g.getNeighbors(currVertex);
// sequence through the neighbors and look
// for vertices that have not been visited
edgeIter = edgeSet.iterator();
while (edgeIter.hasNext())
{
    neighborVertex = edgeIter.next();
}
```

bfs() (concluded)

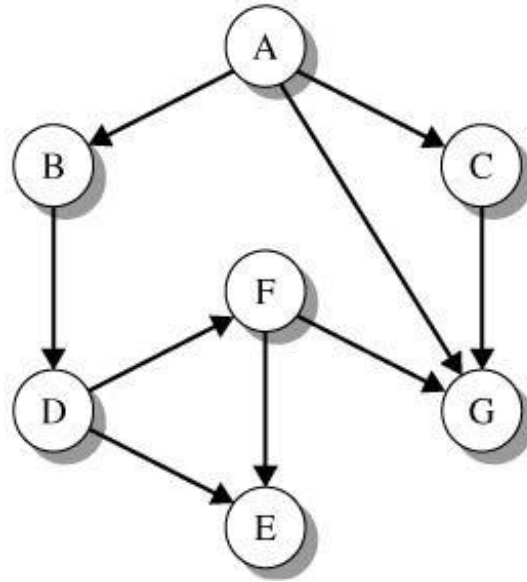
```
    if (g.getColor(neighborVertex) ==
        VertexColor.WHITE)
    {
        // color unvisited vertex GRAY and
        // push it onto queue
        g.setColor(neighborVertex, VertexColor.GRAY);
        visitQueue.push(neighborVertex);
    }
}

return visitList;
}
```

Running Time of Breadth-First Search

- The running time for the breadth-first search is $O(V + E)$, where V is the number of vertices and E is the number of edges.

Breadth-First Search Example



```
// create a graph g and declare startVertex and visitList
DiGraph<String> g = DiGraph.readGraph("bfsgraph.dat");
String startVertex;
List<String> visitList;
...
// call bfs() with arguments g and startVertex
visitList = DiGraphs.bfs(g, startVertex);
// output the visitList
System.out.println("BFS visitList from " + startVertex +
                   ": " + visitList);
```

Breadth-First Search Example (concluded)

Output:

Run 1: (startVertex = "A")

BFS visitList from A: [A, G, B, C, D, E, F]

Run 2: (startVertex = "D")

BFS visitList from D: [D, E, F, G]

Run 3: (startVertex = "E")

BFS visitList from E: [E]

Depth-First Visit

- The depth-first visit algorithm is modeled after the recursive postorder scan of a binary tree. In the tree, a node is visited only after visits are made to all of the nodes in its subtree. In the graph, a node is visited only after visiting all of the nodes in paths that emanate from the node.

Depth-First Visit (continued)

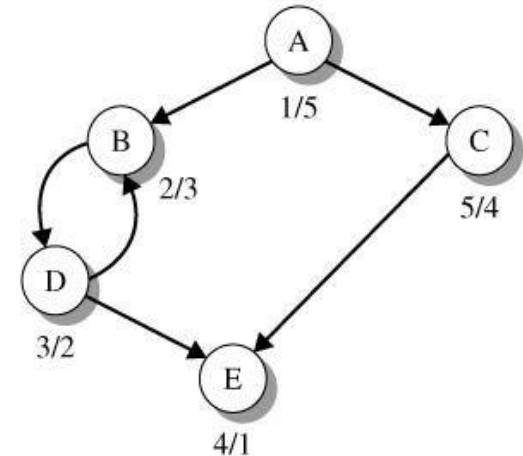
- Color all vertices WHITE. A vertex is colored GRAY when it is first contacted in a recursive descent. Only when the vertex is actually visited does it become BLACK.
- Begin at a starting vertex and search down paths of neighbors until reaching a vertex that has no neighbors or only neighbors that are BLACK. At this point, a visit occurs at the "terminal" vertex and it becomes BLACK.

Depth-First Visit (continued)

- Backtrack to the previous recursive step and look for another adjacent vertex and launch a scan down its paths. There is no ordering among vertices in an adjacency list, so the paths and hence the order of visits to vertices can vary.

Depth-First Visit (continued)

- Discover A (color GRAY)
- Discover B (color GRAY)
- Discover D (color GRAY)
- Discover E (color GRAY, then BLACK)
- Backtrack D (color BLACK)
- Backtrack B (color BLACK)
- Backtrack A (A remains GRAY)
- Discover C (color BLACK)
- Backtrack A (color BLACK). Visit com



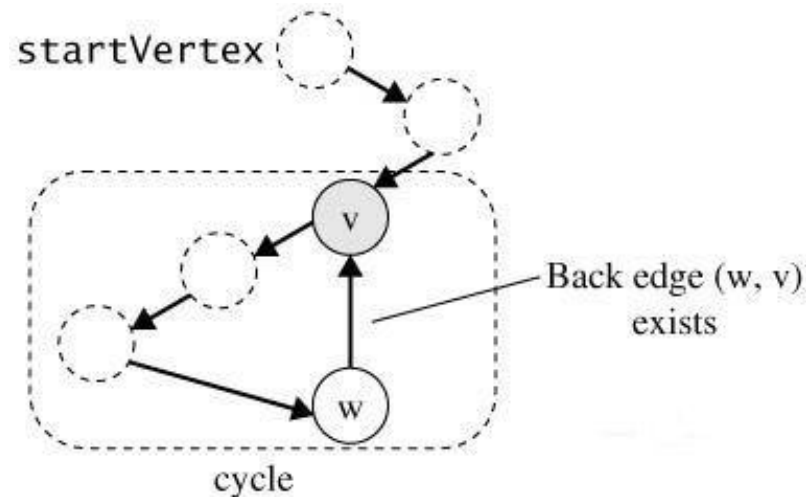
Graph illustrating depth-first visit.

Depth-First Visit (continued)

- The depth-first visit is a recursive algorithm that distinguishes the discovery and finishing time (when a vertex becomes BLACK) of a vertex.
- The depth-first visit returns a list of the vertices found in the reverse order of their finishing times.

Depth-First Visit (continued)

- An edge that connects a vertex to a neighbor that has color GRAY is called a *back edge*.
 - A depth-first visit has a cycle if and only if it has a back edge.



Discovering a cycle assuming v is a GRAY neighbor of w (Edge (w, v) is a back edge).

dfsVisit()

```
// depth-first visit assuming a WHITE starting
// vertex; dfsList contains the visited vertices in
// reverse order of finishing time; when checkForCycle
// is true, throws IllegalPathStateException if it
// detects a cycle
public static <T> void dfsVisit(DiGraph<T> g, T sVertex,
LinkedList<T> dfsList, boolean checkForCycle)
{
    T neighborVertex;
    Set<T> edgeSet;
    // iterator to scan the adjacency set of a vertex
    Iterator<T> edgeIter;
    VertexColor color;

    if (!g.containsVertex(sVertex))
        throw new IllegalArgumentException(
            "dfsVisit(): vertex not in the graph");
```

dfsVisit() (continued)

```
// color vertex GRAY to note its discovery
g.setColor(sVertex, VertexColor.GRAY);

edgeSet = g.getNeighbors(sVertex);

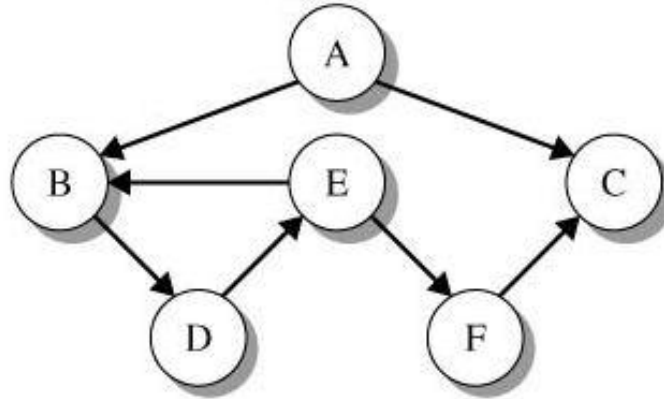
// sequence through the adjacency set and look
// for vertices that are not yet discovered
// (colored WHITE); recursively call dfsVisit()
// for each such vertex; if a vertex in the adjacency
// list is GRAY, the vertex was discovered during a
// previous call and there is a cycle that begins and
// ends at the vertex; if checkForCycle is true,
// throw an exception
edgeIter = edgeSet.iterator();
```

dfsVisit() (concluded)

```
while (edgeIter.hasNext())
{
    neighborVertex = edgeIter.next();
    color = g.getColor(neighborVertex);
    if (color == VertexColor.WHITE)
        dfsVisit(g, neighborVertex, dfsList,
                checkForCycle);
    else if (color == VertexColor.GRAY && checkForCycle)
        throw new IllegalPathStateException(
            "dfsVisit(): graph has a cycle");
}

// finished with vertex sVertex; make it BLACK
// and add it to the front of dfsList
g.setColor(sVertex, VertexColor.BLACK);
dfsList.addFirst(sVertex);
}
```

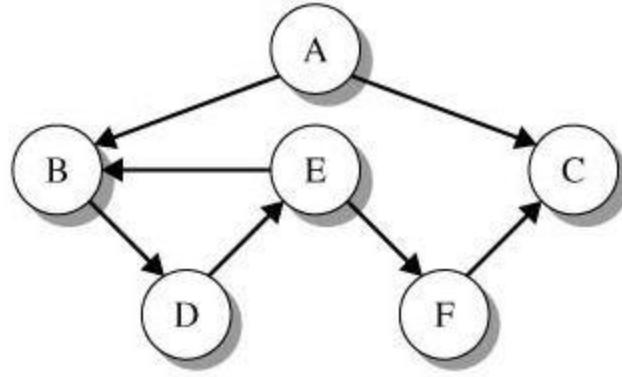
Depth-First Visit Example



```
LinkedList<String> finishOrder = new LinkedList<String>();  
g.colorWhite();  
DiGraphs.dfsVisit(g, "B", finishOrder, false);
```

Output: finishOrder: [B, D, E, F, C]

Depth-First Visit Example (concluded)

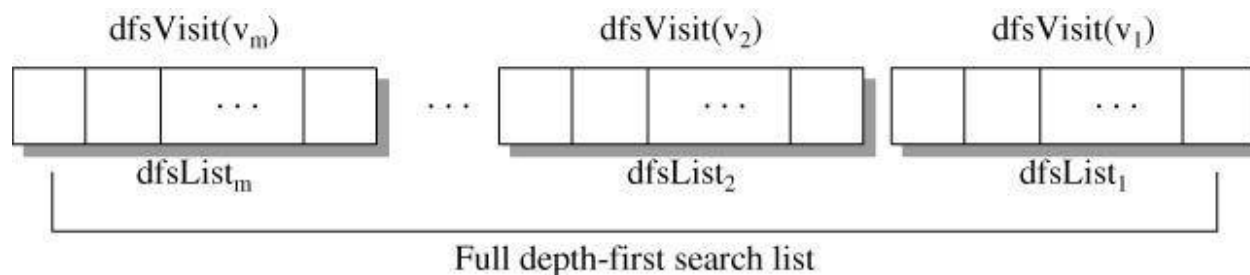


```
finishOrder = new LinkedList<String>();  
g.colorWhite();  
try  
{  
    DiGraphs.dfsVisit(g, "E", finishOrder, true);  
    System.out.println("finishOrder: " + finishOrder);  
}  
catch (IllegalPathStateException ipse)  
{  
    System.out.println(ipse.getMessage());  
}
```

Output: dfsVisit(): cycle involving vertices D and E

Depth-First Search Algorithm

- Depth-first search begins with all WHITE vertices and performs depth-first visits until all vertices of the graph are BLACK.
- The algorithm returns a list of all vertices in the graph in the reverse order of their finishing times.



Combined list of visits for the depth-first search.

dfs()

```
// depth-first search; dfsList contains all
// the graph vertices in the reverse order
// of their finishing times
public static <T> void dfs(DiGraph<T> g,
LinkedList<T> dfsList)
{
    Iterator<T> graphIter;
    T vertex = null;

    // clear dfsList
    dfsList.clear();

    // initialize all vertices to WHITE
    g.colorWhite();
}
```

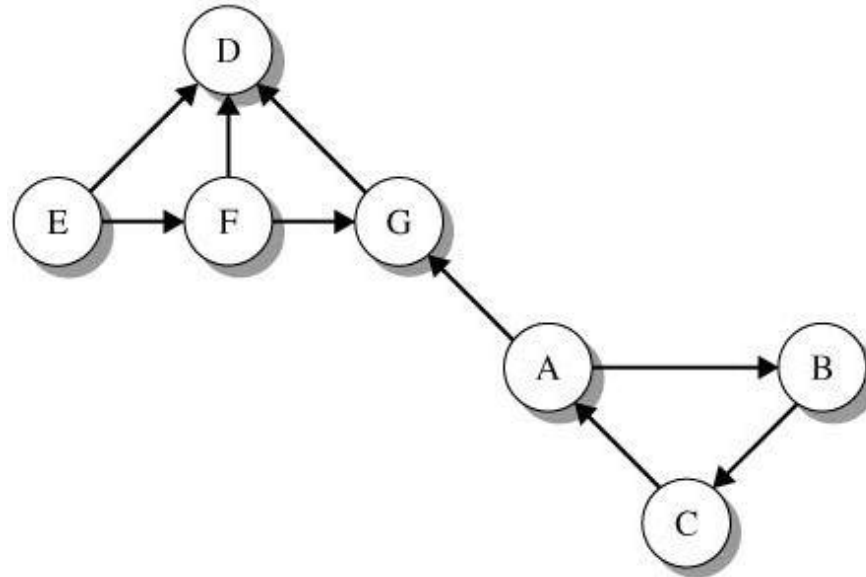
dfs() (concluded)

```
// call dfsVisit() for each WHITE vertex
graphIter = g.vertexSet().iterator();
while (graphIter.hasNext())
{
    vertex = graphIter.next();
    if (g.getColor(vertex) == VertexColor.WHITE)
        dfsVisit(g, vertex, dfsList, false);
}
}
```


Running Time for Depth-First Search

- An argument similar to that for the breadth-first search shows that the running time for `dfs()` is $O(V+E)$, where V is the number of vertices in the graph and E is the number of edges.

Depth-First Search Example



`dfsVisit()` starting at E followed by `dfsVisit()` starting at A
`dfsList: [A, B, C, E, F, G, D]`

Acyclic Graphs

- To check for a cycle anywhere in a graph, traverse all of the vertices by using multiple calls to `dfsVisit()`.
 - This is essentially the `dfs()` algorithm where the focus is on identifying cycles and not obtaining a list of visited vertices. This approach relies on the fact that any cycle must be included within one of the calls to `dfsVisit()`. The method, with `checkForCycle` set to `true`, identifies the cycle.

acyclic()

```
// determine if the graph is acyclic
public static <T> boolean acyclic(DiGraph<T> g)
{
    // use for calls to dfsVisit()
    LinkedList<T> dfsList = new LinkedList<T>();
    Iterator<T> graphIter;
    T vertex = null;

    // initialize all vertices to WHITE
    g.colorWhite();

    // call dfsVisit() for each WHITE vertex; catch
    // an IllegalPathStateException in a call to
    // dfsVisit()
    try
    {
        // call dfsVisit() for each WHITE vertex
        graphIter = g.vertexSet().iterator();
    }
}
```

acyclic() (concluded)

```
while (graphIter.hasNext())
{
    vertex = graphIter.next();
    if (g.getColor(vertex) == VertexColor.WHITE)
        dfsVisit(g, vertex, dfsList, true);
}

catch (IllegalPathStateException iae)
{
    return false;
}

return true;
}
```

Program 24.2

```
import java.io.FileNotFoundException;

import ds.util.DiGraph;
import ds.util.DiGraphs;

public class Program24_2
{
    public static void main(String[] args)
        throws FileNotFoundException
    {
        DiGraph<String> g = DiGraph.readGraph("cycle.dat");

        // determine if the graph is acyclic
        if (DiGraphs.acyclic(g))
            System.out.println("Graph is acyclic");
        else
            System.out.println("Graph is not acyclic");
    }
}
```

Program 24.2 (concluded)

```
// add edge (E,B) to create a cycle
System.out.print("    Adding edge (E,B): ");
g.addEdge("E", "B", 1);

// retest the graph to see if it is acyclic
if (DiGraphs.isAcyclic(g))
    System.out.println("New graph is acyclic");
else
    System.out.println("New graph is not acyclic");
}
}
```

Run:

Graph is acyclic

Adding edge (E,B): New graph is not acyclic