Chapter 9 - Graph

- A Graph G consists of a set V, whose members are called the vertices of G, together with a set E of pairs of distinct vertices from V.
- The pairs in E are called the edges of G.
- If the pairs are unordered, G is called an undirected graph or a graph. Otherwise, G is called a directed graph or a digraph.
- Two vertices in an undirected graph are called adjacent if there
 is an edge from the first to the second.

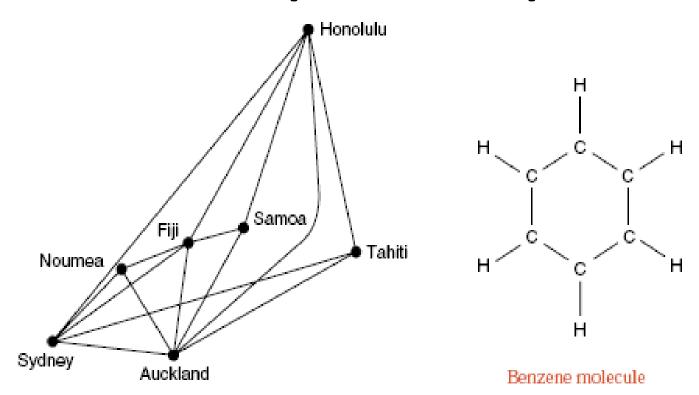
Chapter 9 - Graph

- A path is a sequence of distinct vertices, each adjacent to the next.
- A cycle is a path containing at least three vertices such that the last vertex on the path is adjacent to the first.
- A graph is called connected if there is a path from any vertex to any other vertex.
- A free tree is defined as a connected undirected graph with no cycles.

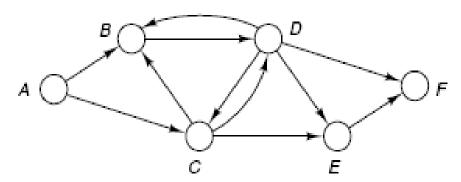
Chapter 9 - Graph

- In a directed graph a path or a cycle means always moving in the direction indicated by the arrows.
- A directed graph is called strongly connected if there is a directed path from any vertex to any other vertex.
- If we suppress the direction of the edges and the resulting undirected graph is connected, we call the directed graph weakly connected

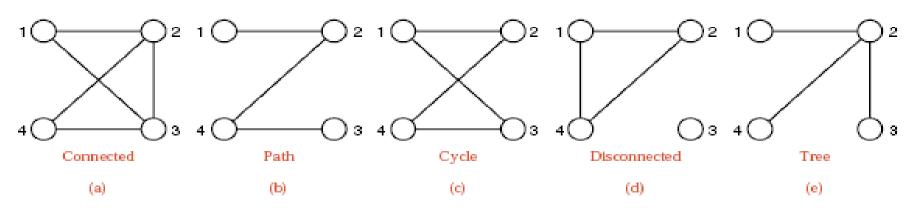
Examples of Graph

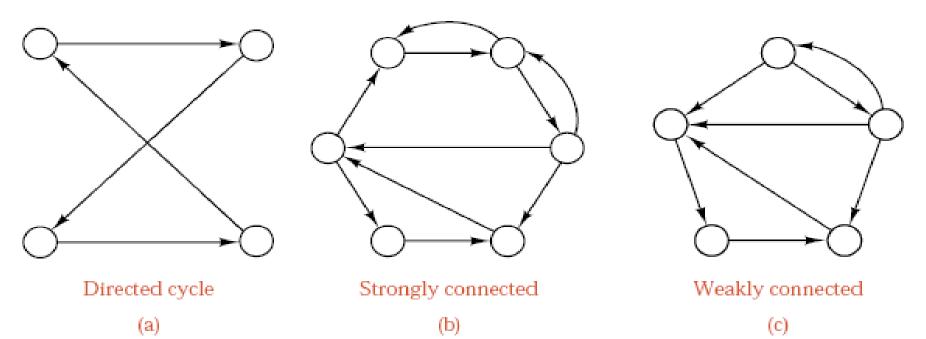


Selected South Pacific air routes

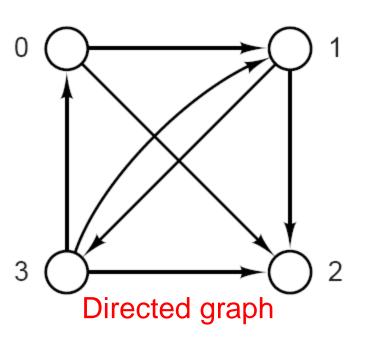


Examples of Graph

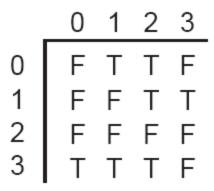




Digraph as an adjacency table



```
vertex Set
0 {1,2}
1 {2,3}
2 Ø
3 {0,1,2}
```

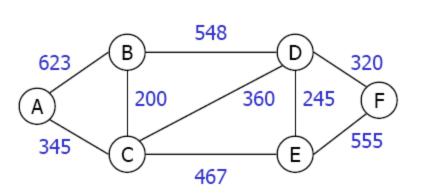


Adjacency set

Adjacency table

```
Digraph
```

Weighted-graph as an adjacency table



Weighted-graph

Α	
В	
U	
Δ	
Е	
F	

	Α	В	С	D	Е	F
4	0	623	345	0	0	0
3	623	0	200	548	0	0
С	345	200	0	360	467	0
)	0	548	360	0	245	320
Ξ	0	0	467	245	0	555
=	0	0	0	320	555	0

vertex vector

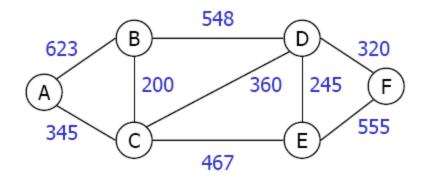
adjacency table

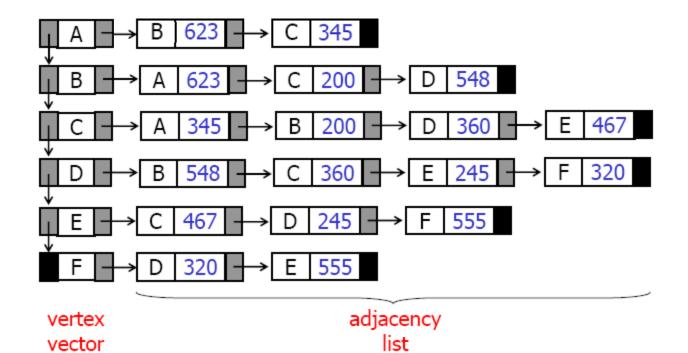
```
WeightedGraph
```

```
count <integer>
edge<array of<array of<WeightType>>> // Adjacency table
End WeightedGraph
```

```
// Number of vertices
```

Weighted-graph as an adjacency list



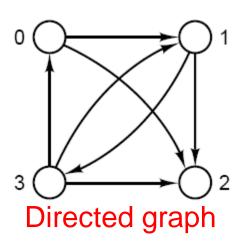


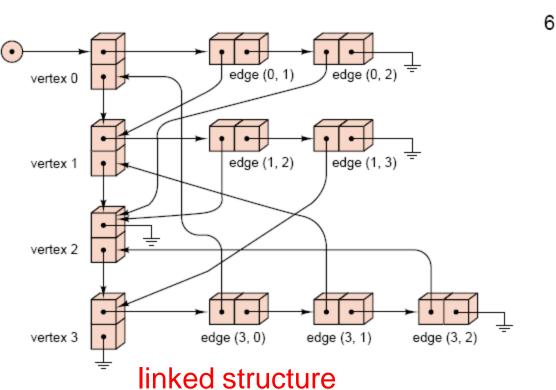
Digraph as an adjacency list

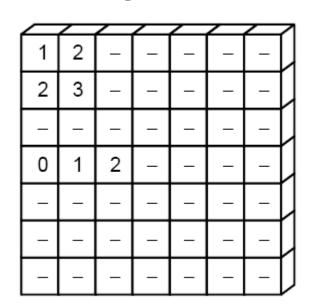
0

3

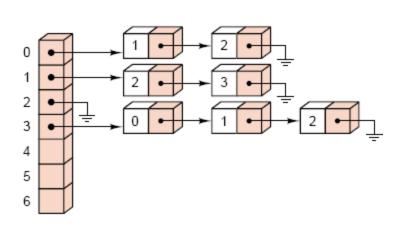
5





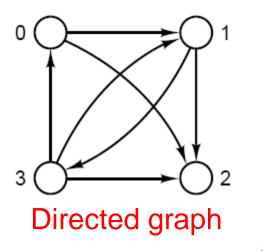


contiguous structure



mixed structure

Digraph as an adjacency list (not using List ADT)



VertexNode

first_edge <pointer to EdgeNode>
next_vertex<pointer to VertexNode>

End VertexNode

EdgeNode

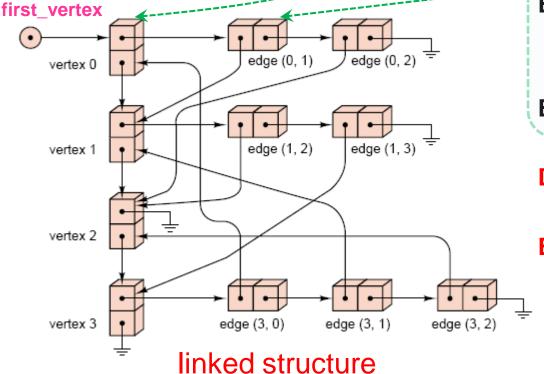
vertex_to <pointer to VertexNode>
next_edge <pointer to EdgeNode>

End EdgeNode

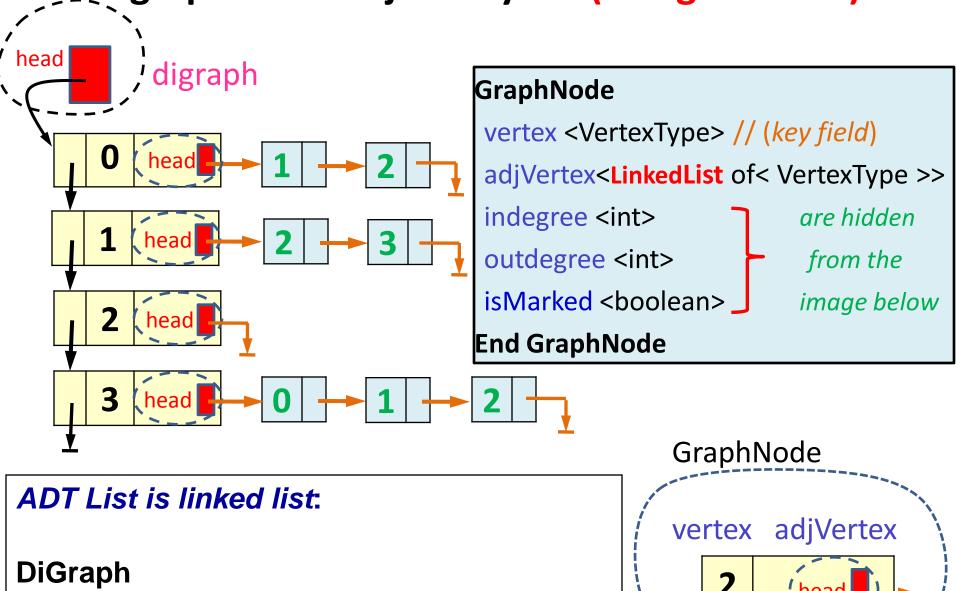
DiGraph

first_vertex <pointer to VertexNode>

End DiGraph



Digraph as an adjacency list (using List ADT)

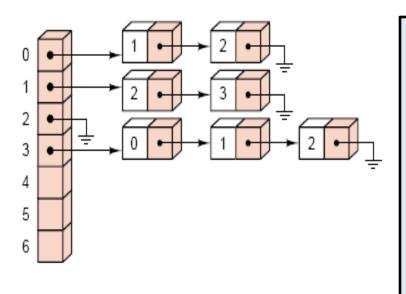


digraph <LinkedList<of<GraphNode>>

End DiGraph

2 (head

Digraph as an adjacency list (using List ADT)



GraphNode

vertex <VertexType> // (key field)
adjVertex<LinkedList of< VertexType >>
indegree <int>
outdegree <int>
isMarked <boolean>
End GraphNode

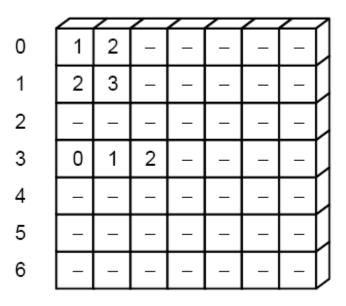
mixed list

ADT List is contiguous list.

DiGraph

digraph <ContiguousList<of<GraphNode>>
End DiGraph

Digraph as an adjacency list (using List ADT)



contiguous list

```
GraphNode
vertex <VertexType> // (key field)
adjVertex <ContiguousList of < VertexType >>
indegree <int>
outdegree <int>
isMarked <boolean>
End GraphNode
```

ADT List is contiguous list.

DiGraph

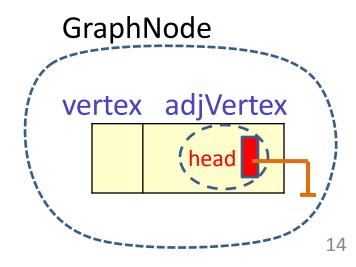
digraph <ContiguousList<of<GraphNode>>
End DiGraph

GraphNode

<void> GraphNode() // constructor of GraphNode

- 1. indegree = 0
- 2. outdegree = 0
- 3. adjVertex.clear() // By default, constructor of adjVertex made it empty.

End GraphNode



Operations for Digraph

- > Insert Vertex
- ➤ Delete Vertex
- > Insert edge
- ➤ Delete edge
- > Traverse

Digraph

```
Digraph
  private:
       digraph <List of <GraphNode> > // using of List ADT.
       <void> Remove EdgesToVertex(val VertexTo <VertexType>)
  public:
       <ErrorCode> InsertVertex (val newVertex <VertexType>)
       <ErrorCode> DeleteVertex (val Vertex <VertexType>)
       <ErrorCode> InsertEdge (val VertexFrom <VertexType>,
                                val VertexTo <VertexType>)
       <ErrorCode> DeleteEdge (val VertexFrom <VertexType>,
                                val VertexTo <VertexType>)
      // Other methods for Graph Traversal.
```

End Digraph

Methods of List ADT

Methods of Digraph will use these methods of List ADT:

```
<ErrorCode> Insert (val DataIn <DataType>) // (success, overflow)
<ErrorCode> Search (ref DataOut <DataType>) // (found, notFound)
<ErrorCode> Remove (ref DataOut <DataType>) // (success , notFound)
<ErrorCode> Retrieve (ref DataOut <DataType>) // (success , notFound)
<ErrorCode> Retrieve (ref DataOut <DataType>, position <int>)
                                                 // (success , range error)
<ErrorCode> Replace (val DataIn <DataType>, position <int>)
                                                 // (success, range error)
<ErrorCode> Replace (val DataIn <DataType>, val DataOut <DataType>)
                                                 // (success, notFound)
<body><br/><br/><br/>dean> isFull()
<boolean> isEmpty()
<integer> Size()
```

Insert New Vertex into Digraph

<ErrorCode> InsertVertex (val newVertex <VertexType>)

Inserts new vertex into digraph.

Pre newVertex is a vertex needs to be inserted.

Post if the vertex is not in digraph, it has been inserted and no edge

is involved with this vertex.

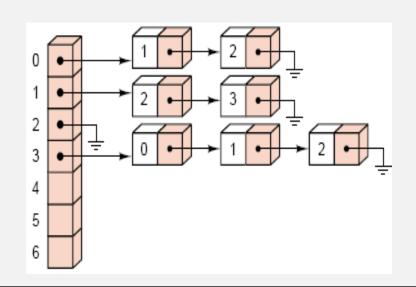
Return *success, overflow,* or *duplicate_error*

Insert New Vertex into Digraph

```
<ErrorCode> InsertVertex (val newVertex <VertexType>)
```

- DataOut.vertex = newVertex
- 2. if (digraph.Search(DataOut) = success)
 - 1. return *duplicate_error*
- 3. else
 - 1. return digraph.Insert(DataOut) // success or overflow

End InsertVertex



GraphNode

vertex <VertexType> // (key field)
adjVertex<List of< VertexType >>
indegree <int>
outdegree <int>
isMarked <boolean>

End GraphNode

Delete Vertex from Digraph

<ErrorCode> DeleteVertex (val Vertex <VertexType>)

Deletes an existing vertex.

Pre Vertex is the vertex needs to be removed.

Post if Vertex 's indegree <>0, the edges ending at this vertex have

been removed. Finally, this vertex has been removed.

Return *success*, or *notFound*

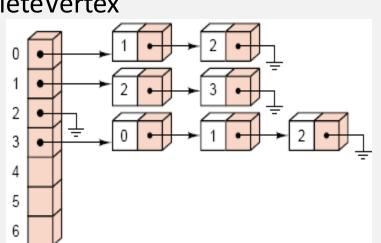
Uses Function Remove_EdgeToVertex.

Delete Vertex from Digraph

```
<ErrorCode> DeleteVertex (val Vertex <VertexType>)
```

- DataOut.vertex = Vertex
- 2. if (digraph.Retrieve(DataOut) = success)
 - 1. if (DataOut.indegree>0)
 - digraph.Remove_EdgeToVertex(Vertex)
 - digraph.Remove(DataOut)
 - 3. return *success*
- 3. else
- 1. return *notFound*

End DeleteVertex



GraphNode

vertex <VertexType> // (key field)
adjVertex<List of< VertexType >>
indegree <int>

outdegree <int>

isMarked <boolean>

End GraphNode

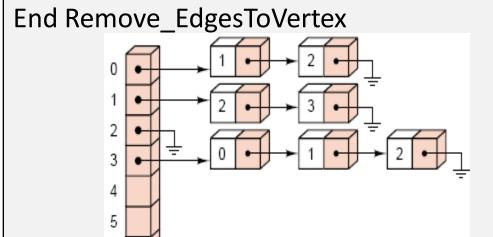
Auxiliary function Remove all Edges to a Vertex

```
Auxiliary full cubit Refilove all Luges to a verter
```

<void> Remove_EdgesToVertex(val VertexTo <VertexType>)

Removes all edges from any vertex to VertexTo if exist.

- 1. position = 0
- 2. loop (digraph.Retrieve(DataFrom, position) = success)
 - 1. if (DataFrom.outdegree>0)
 - 1. if (DataFrom.adjVertex.Remove(VertexTo) = success)
 - 1. DataFrom.outdegree = DataFrom.outdegree 1
 - digraph.Replace(DataFrom, position)
 - 2. position = position + 1



GraphNode

vertex <VertexType> // (key field)
adjVertex<List of< VertexType >>

indegree <int>

outdegree <int>

isMarked <boolean>

End GraphNode

Insert new Edge into Digraph

Return *success*, *overflow*, *notFound_VertexFrom*, *notFound_VertexTo* or *duplicate_error*

1. DataFrom.vertex = VertexFrom DataTo.vertex = VertexTo if (digraph.Retrieve(DataFrom) = success) **3.** 1. if (digraph.Retrieve(DataTo) = success) newData = DataFrom 6 if (newData.adjVertex.Search(VertexTo) = found) return duplicate_error if (newData.adjVertex.Insert(VertexTo) = success) **3.** newData.outdegree = newData.outdegree +1 digraph.Replace(newData, DataFrom) return *success* GraphNode else 4. vertex <VertexType> // (key field) return *overflow* adjVertex<List of< VertexType >> else indegree <int> return *notFound_VertexTo* outdegree <int> else isMarked <boolean> return notFound VertexFrom **End GraphNode** End InsertEdge

Delete Edge from Digraph

Post if VertexFrom and VertexTo are in the digraph, and the edge from VertexFrom to VertexTo is in the digraph, it has been removed

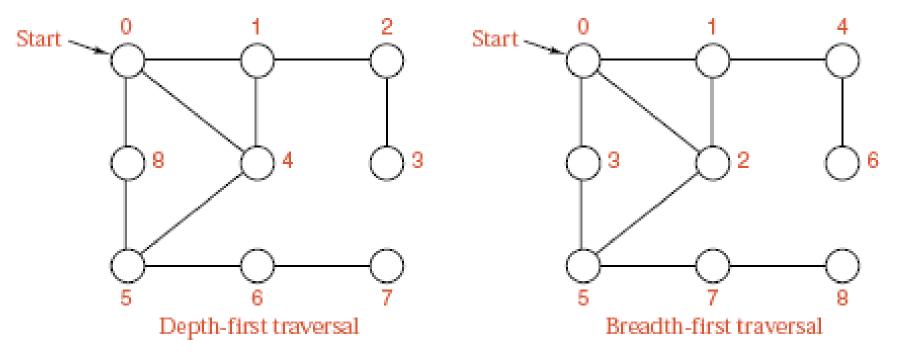
Return *success*, *notFound_VertexFrom*, *notFound_VertexTo* or *notFound_Edge*

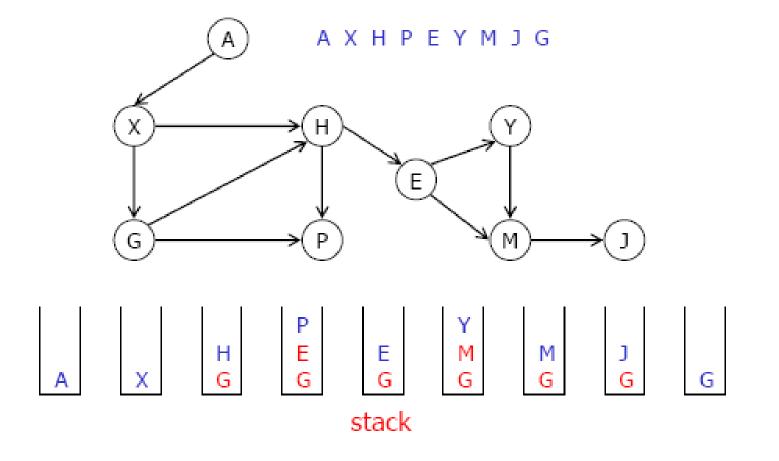
```
1.
    DataFrom.vertex = VertexFrom
    DataTo.vertex = VertexTo
    if ( digraph.Retrieve(DataFrom) = success )
3.
   1. if ( digraph.Retrieve(DataTo) = success )
           newData = DataFrom
           if ( newData.adjVertex.Remove(VertexTo) = success )
               newData.outdegree = newData.outdegree -1
               digraph.Replace(newData, DataFrom)
               return success
           else
      3.
              return notFound Edge
                                          GraphNode
   2. else
                                           vertex <VertexType> // (key field)
           return notFound_VertexTo
                                           adjVertex<List of< VertexType >>
    else
                                           indegree <int>
       return notFound VertexFrom
                                           outdegree <int>
End DeleteEdge
                                           isMarked <boolean>
```

End GraphNode

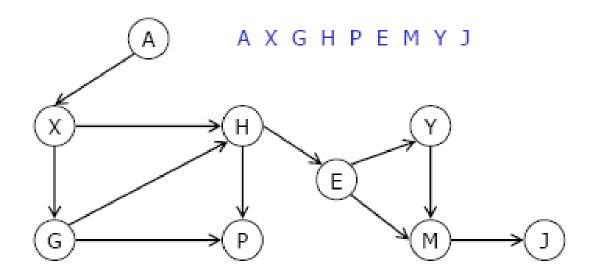
Graph Traversal

- ➤ Depth-first traversal: analogous to preorder traversal of an oredered tree.
- Breadth-first traversal: analogous to level-by-level traversal of an ordered tree.





Breadth-first traversal



Α

Χ

 $\mathsf{G}\,\mathsf{H}$

ΗP

PΕ

Е

ΜY

ΥJ

J

queue

```
<void> DepthFirst
```

(ref <void> Operation (ref Data <DataType>))

Traverses the digraph in depth-first order.

Post The function Operation has been performed at each vertex of the digraph in depth-first order.

Uses Auxiliary function recursiveTraverse to produce the recursive depth-first order.

```
<void> DepthFirst
                 (ref <void> Operation ( ref Data <DataType>))
   loop (more vertex v in Digraph)
   1. unmark (v)
    loop (more vertex v in Digraph)
   1. if (v is unmarked)

    recursiveTraverse (v, Operation)

End DepthFirst
```

function recursiveTraverse recursively.

Uses

```
<void> recursiveTraverse(ref v <VertexType>,
                 ref <void> Operation ( ref Data <DataType>) )
   mark(v)
   Operation(v)
   loop (more vertex w adjacent to v)
   1. if (vertex w is unmarked)
      1. recursiveTraverse (w, Operation)
End Traverse
```

Breadth-first traversal

<void> BreadthFirst

(ref <void> Operation (ref Data <DataType>))

Traverses the digraph in breadth-first order.

Post The function Operation has been performed at each vertex of the digraph in breadth-first order.

Uses Queue ADT.

```
BreadthFirst
queueObj <Queue>
 loop (more vertex v in digraph)
1. unmark(v)
 loop (more vertex v in Digraph)
1. if (vertex v is unmarked)
       queueObj.EnQueue(v)
       loop (NOT queueObj .isEmpty())

    queueObj.QueueFront(w)

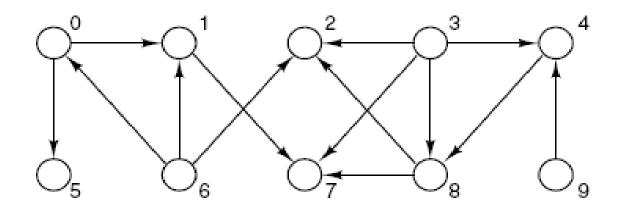
       queueObj.DeQueue()
       3. if (vertex w is unmarked)
             mark(w)
              Operation(w)
              loop (more vertex x adjacent to w)
          3.
```

queueObj.EnQueue(x)

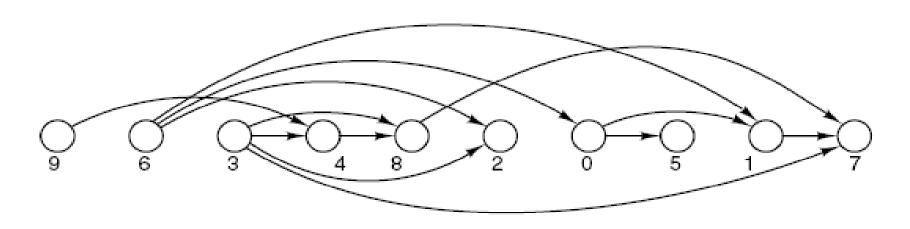
End BreadthFirst

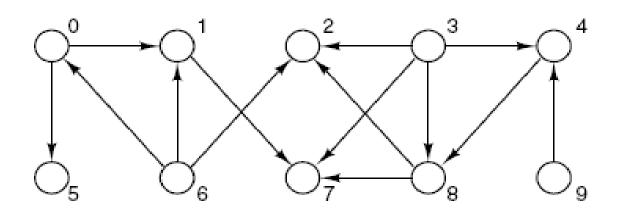
Topological Order

A topological order for G, a directed graph with no cycles, is a sequential listing of all the vertices in G such that, for all vertices v, $w \in G$, if there is an edge from v to w, then v precedes w in the sequential listing.

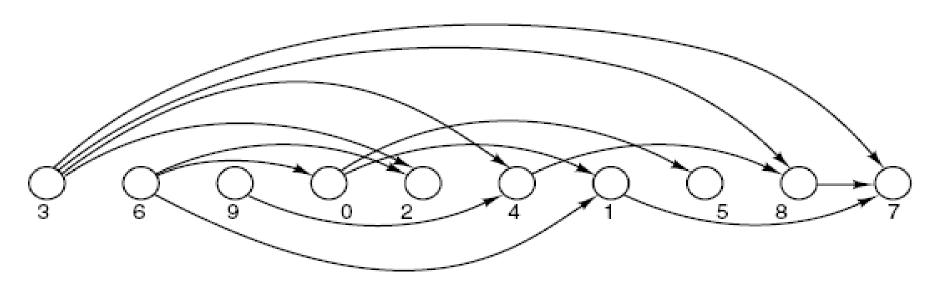


Directed graph with no directed cycles





Directed graph with no directed cycles



Applications of Topological Order

Topological order is used for:

- Courses available at a university,
 - Vertices: course.
 - Edges: (v,w), v is a prerequisite for w.
 - A topological order is a listing of all the courses such that all perequisites for a course appear before it does.
- ➤ A glossary of technical terms: no term is used in a definition before it is itself defined.
- The topics in the textbook.

<void> DepthTopoSort (ref TopologicalOrder <List>)

Traverses the digraph in depth-first order and made a list of topological order of digraph's vertices.

Pre Acyclic digraph.

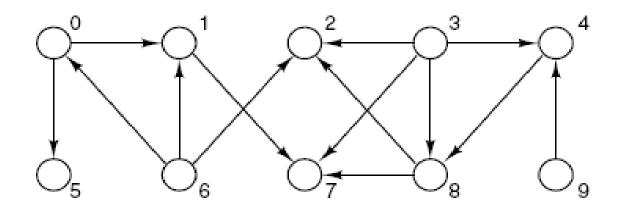
Post The vertices of the digraph are arranged into the list

TopologicalOrder with a depth-first traversal of those vertices that do not belong to a cycle.

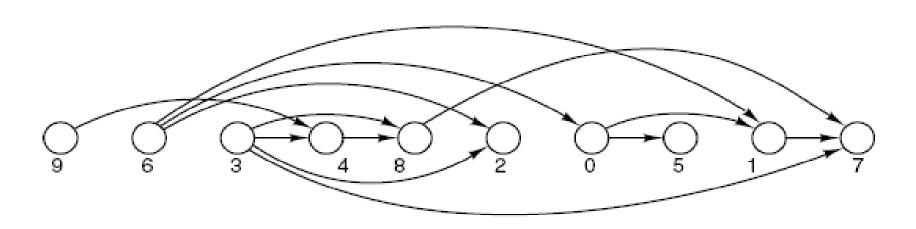
Uses List ADT and function recursiveDepthTopoSort to perform depth-first traversal.

<u>Idea</u>:

- Starts by finding a vertex that has no successors and place it last in the list.
- Repeatedly add vertices to the beginning of the list.
- By recursion, places all the successors of a vertex into the topological order.
- Then, place the vertex itself in a position before any of its successors.



Directed graph with no directed cycles



```
<void> DepthTopoSort (ref TopologicalOrder <List>)
```

- loop (more vertex v in digraph)
 - 1. unmark(v)
- TopologicalOrder.clear()
- **3. loop** (more vertex v in Digraph)
 - **1. if** (vertex v is unmarked)
 - recursiveDepthTopoSort(v, TopologicalOrder)

End DepthTopoSort

<void> recursiveDepthTopoSort (val v <VertexType>,

ref TopologicalOrder <List>)

Pre Vertex v in digraph does not belong to the partially completed list

TopologicalOrder.

Post All the successors of v and finally v itself are added to

TopologicalOrder with a depth-first order traversal.

Uses List ADT and the function recursiveDepthTopoSort.

Idea:

- Performs the recursion, based on the outline for the general function traverse.
- First, places all the successors of v into their positions in the topological order.
- Then, places v into the order.

- mark(v)
- loop (more vertex w adjacent to v)
 - 1. if (vertex w is unmarked)
 - recursiveDepthTopoSort(w, TopologicalOrder)
- TopologicalOrder.Insert(0, v)

End recursiveDepthTopoSort

<void> BreadthTopoSort (ref TopologicalOrder <List>)

Traverses the digraph in depth-first order and made a list of topological order of digraph's vertices.

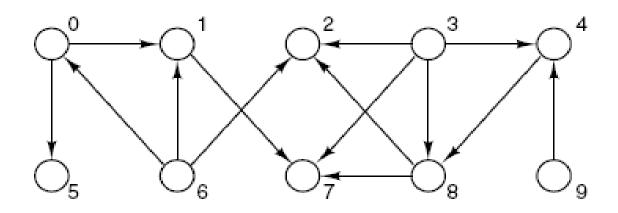
Post The vertices of the digraph are arranged into the list TopologicalOrder with a breadth-first traversal of those vertices that do not belong to a cycle.

Uses List and Queue ADT.

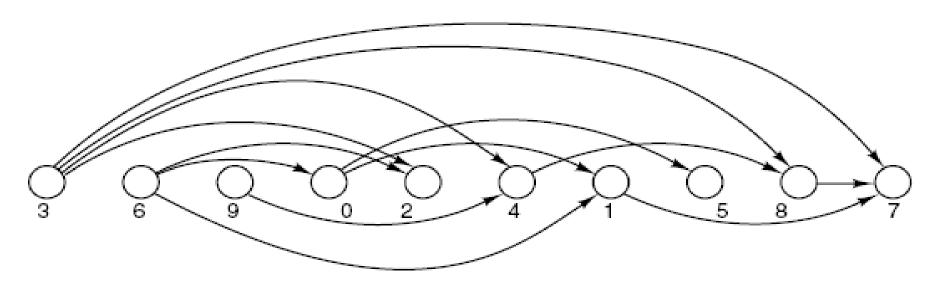
Idea:

- Starts by finding the vertices that are not successors of any other vertex.
- Places these vertices into a queue of vertices to be visited.
- As each vertex is visited, it is removed from the queue and placed in the next available position in the topological order (starting at the beginning).
- Reduces the indegree of its successors by 1.
- The vertex having the zero value indegree is ready to processed and is places into the queue.

45



Directed graph with no directed cycles



```
<void> BreadthTopoSort (ref TopologicalOrder <List>)
```

- TopologicalOrder.clear()
- 2. queueObj <Queue>
- 3. **loop** (more vertex v in digraph)
 - 1. if (indegree of v = 0)
 - queueObj.EnQueue(v)
- 4. loop (NOT queueObj.isEmpty())
 - queueObj.QueueFront(v)
 - queueObj.DeQueue()
 - 3. TopologicalOrder.Insert(TopologicalOrder.size(), v)
 - **4. loop** (more vertex w adjacent to v)
 - 1. decrease the indegree of w by 1
 - 2. if (indegree of w = 0)
 - queueObj.EnQueue(w)

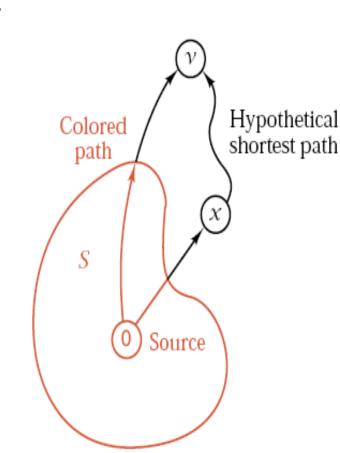
End BreadthTopoSort

Shortest Paths

- Given a directed graph in which each edge has a nonnegative weight.
- Find a path of least total weight from a given vertex,
 called the source, to every other vertex in the graph.

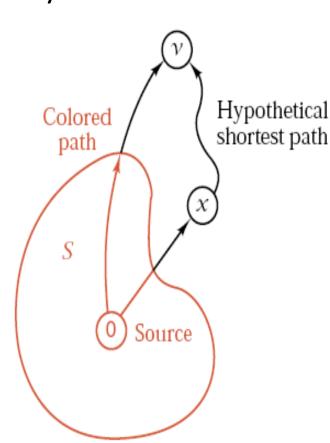
A greedy algorithm of Shortest Paths:
 Dijkstra's algorithm (1959).

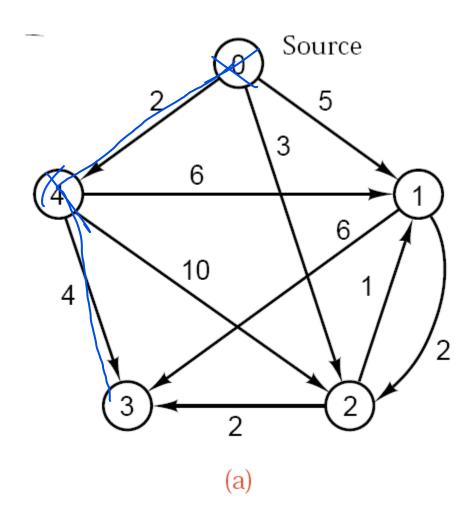
- Let tree is the subgraph contains the shotest paths from the source vertex to all other vertices.
- At first, add the source vertex to the tree.
- Loop until all vertices are in the tree:
 - Consider the adjacent vertices of the vertices already in the tree.
 - Examine all the paths from those adjacent vertices to the source vertex.
 - Select the shortest path and insert the corresponding adjacent vertex into the tree.

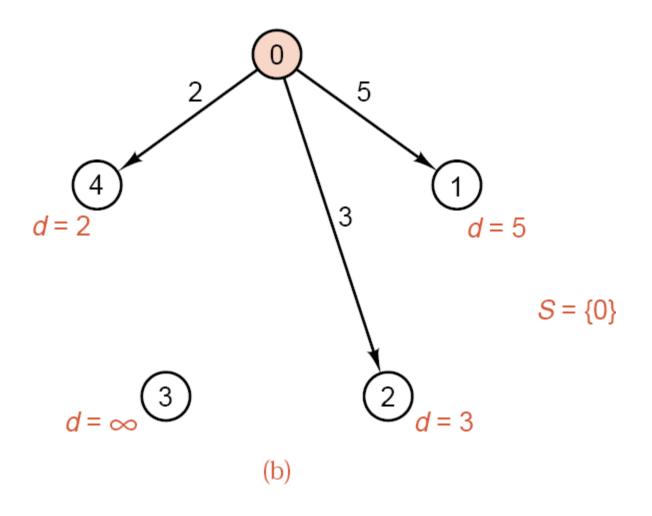


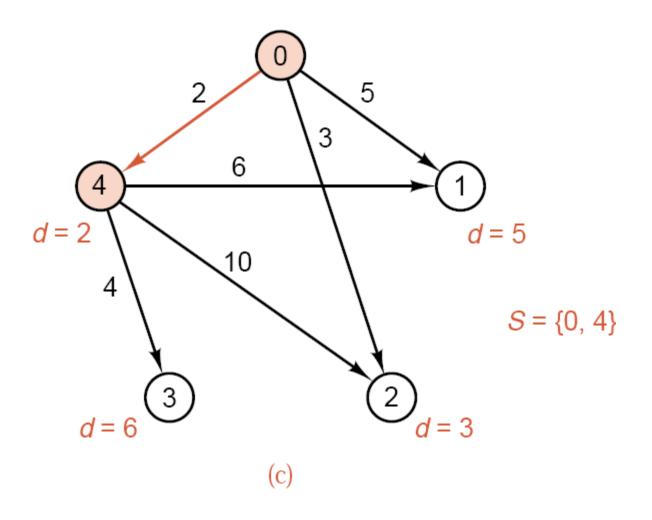
Dijkstra's algorithm in detail

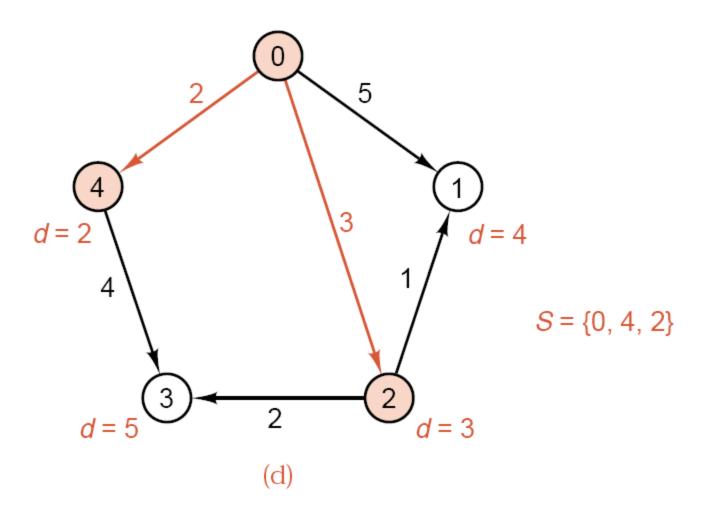
- S: Set of vertices whose closest distances to the source are known.
- Add one vertex to S at each stage.
- For each vertex v, maintain the distance from the source to v, along a path all of whose vertices are in S, except possibly the last one.
- To determine what vertex to add to S at each step, apply the greedy criterion of choosing the vertex v with the smallest distance.
- Add v to S.
- Update distance from the source for all w not in S, if the path through v and then directly to w is shorter than the previously recorded distance to w.

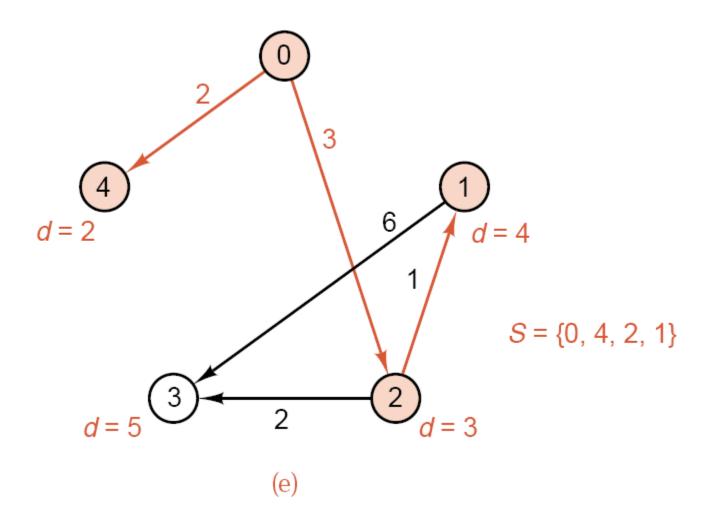


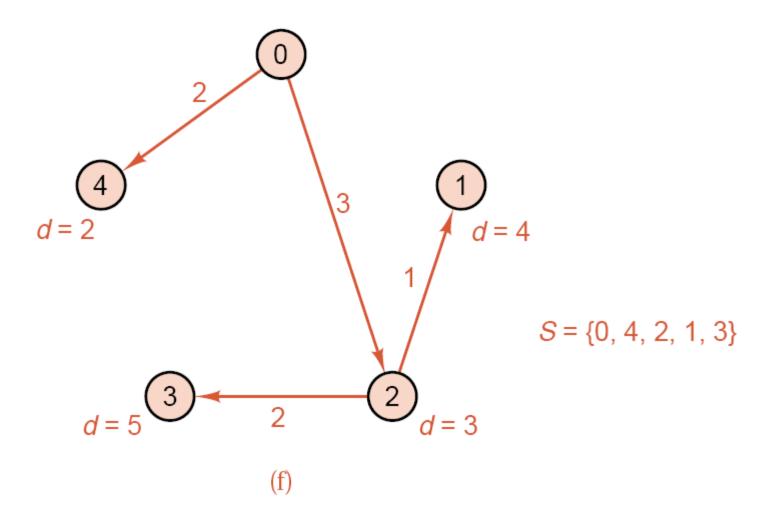












<void> ShortestPath (val source <VertexType>,

ref listOfShortestPath <List of <DistanceNode>>)

Finds the shortest paths from source to all other vertices in digraph.

Post Each node in listOfShortestPath gives the minimal path weight from vertex source to vertex destination in distance field.

DistanceNode

destination <VertexType>
distance <int>
End DistanceNode

// ShortestPath listOfShortestPath.clear()

- Add source to set S
- loop (more vertex v in digraph) // Initiate all distances from source to v **3**.
 - distanceNode.destination = v distanceNode.distance = weight of edge(source, v) // = infinity if
 - listOfShortestPath.Insert(distanceNode)
 - **loop** (more vertex not in S) // Add one vertex v to S on each step.
 - minWeight = infinity // Choose vertex v with smallest distance. **loop** (more vertex w not in S)

 - Find the distance x from source to w in listOfShortestPath
 - if (x < minWeight)</pre> DistanceNode

// edge(source,v) isn't in digraph.

- 1. v = wdestination <VertexType> distance <int> 2. minWeight = x
- End DistanceNode Add v to S.

```
// ShortestPath (continue)
```

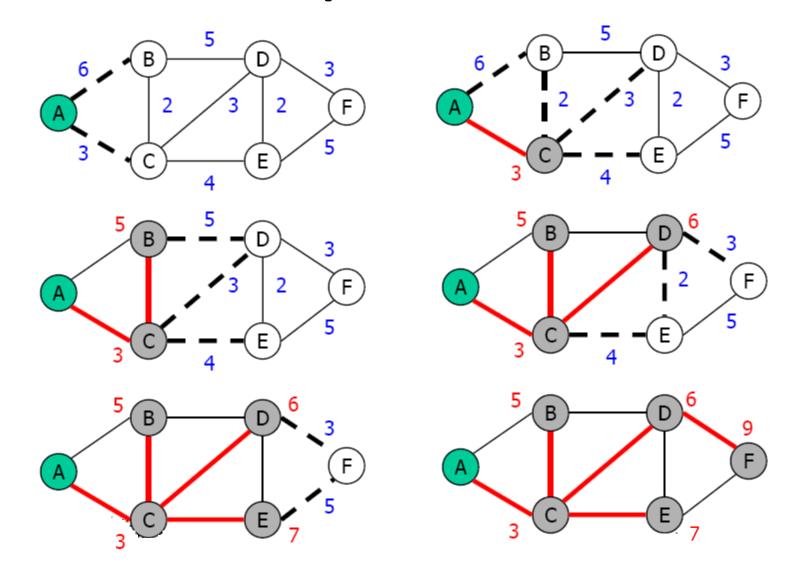
- **4. loop** (more vertex w not in S) // *Update distances from source* // to all w not in S
 - 1. Find the distance x from source to w in listOfShortestPath
 - 2. if ((minWeight + weight of edge from v to w) < x)
 - Update distance from source to w in listOfShortestPath to (minWeight + weight of edge from v to w)

End ShortestPath

DistanceNode

destination <VertexType>
distance <int>
End DistanceNode

Another example of Shortest Paths



Select the adjacent vertex having minimum path to the source vertex

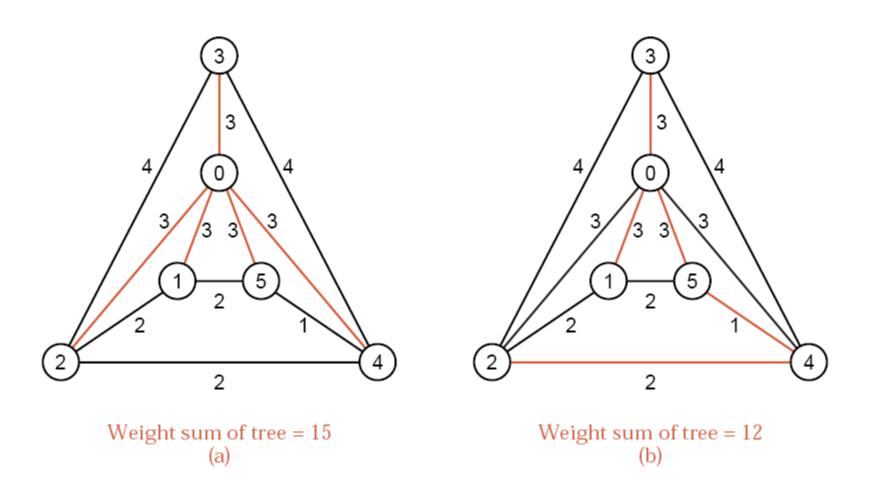
Minimum spanning tree

DEFINITION:

Spanning tree: tree that contains all of the vertices in a connected graph.

Minimum spanning tree: spanning tree such that the sum of the weights of its edges is minimal.

Spanning Trees



Two spanning trees in a network

A greedy Algorithm: Minimum Spanning Tree

- ➤ Shortest path algorithm in a connected graph found an its spanning tree.
- > What is the algorithm finding the minimum spanning tree?
- ➤ A small change to shortest path algorithm can find the minimum spanning tree, that is Prim's algorithm since 1957.

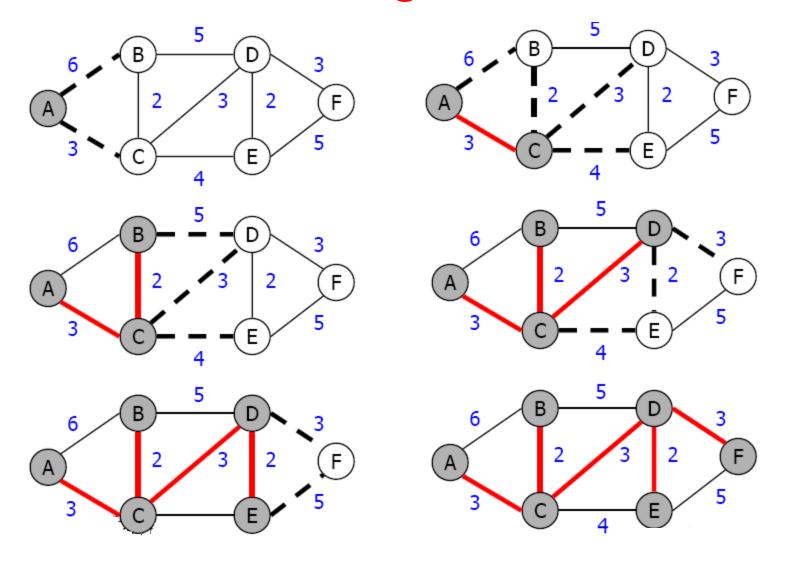
Prim's algorithm

- Let tree is the minimum spanning tree.
- At first, add one vertex to the tree.
- Loop until all vertices are in the tree:
 - Consider the adjacent vertices of the vertices already in the tree.
 - Examine all the edges from each vertices already in the tree to those adjacent vertices.
 - Select the smallest edge and insert the corresponding adjacent vertex into the tree.

Prim's algorithm in detail

- Let S is the set of vertices already in the minimum spanning tree.
- At first, add one vertex to S.
- For each vertex v not in S, maintain the distance from a vertex x to v, where x is a vertex in S and the edge(x,v) is the smallest in all edges from another vertices in S to v (this edge(x,v) is called the distance from S to v). As usual, all edges not being in graph have infinity value.
- To determine what vertex to add to S at each step, apply the greedy criterion of choosing the vertex v with the smallest distance from S.
- Add v to S.
- Update distances from S to all vertices v not in S if they are smaller than the previously recorded distances.

Prim's algorithm



Select the adjacent vertex having minimum edge to the vertices already in the tree.

Prim's algorithm

Finds the minimum spanning tree of a connected component of the original graph that contains vertex source.

Post tree is the minimum spanning tree of a connected component of the original graph that contains vertex source.

Uses local variables:

- Set S
- listOfDistanceNode
- continue <boolean>

DistanceNode

vertexFrom <VertexType>
vertexTo <VertexType>
distance <WeightType>

End DistanceNode

- 1. tree.clear()
- tree.InsertVertex(source)
- 3. Add source to set S
- 4. listOfDistanceNode.clear()
- 5. distanceNode.vertexFrom = source6. loop (more vertex v in graph)//Initiate all distances from source to v
 - distanceNode.vertexTo = v
 - 2. distanceNode.distance = weight of edge(source, v) // = infinity if // edge(source, v) isn't in graph.
 - 3. listOfDistanceNode.Insert(distanceNode)

```
DistanceNode

vertexFrom <VertexType>
vertexTo <VertexType>
distance <WeightType>
End DistanceNode
```

- continue = TRUE
- **8. loop** (more vertex not in S) and (continue) //Add one vertex to S on // each step
 - 1. minWeight = infinity //Choose vertex v with smallest distance toS
 - 2. loop (more vertex w not in S)
 - 1. Find the node in listOfDistanceNode with vertexTo is w
 - 2. if (node.distance < minWeight)</pre>
 - 1. v = w
 - 2. minWeight = node.distance

- **3. if** (minWeight < infinity)
 - 1. Add v to S.
 - tree.InsertVertex(v)
 - tree.InsertEdge(v,w)
 - 4. loop (more vertex w not in S) // Update distances from v to // all w not in S if they are smaller than the // previously recorded distances in listOfDistanceNode
 - Find the node in listOfDistanceNode with vertexTo is w
 - 2. **if** (node.distance > weight of edge(v,w))
 - node.vertexFrom = v
 - node.distance = weight of edge(v,w))
 - 3. Replace this node with its old node in listOfDistance
- 4. else
- continue = FALSE

End MinimumSpanningTree

DistanceNode

vertexFrom <VertexType>

vertexTo <VertexType>

distance <WeightType>

End DistanceNode

Maximum flows

- A network of water pipelines from one source to one destination.
- Water is pumped thru many pipes with many stations in between.
- The amount of water that can be pumped may differ from one pipeline to another.

Maximum flows

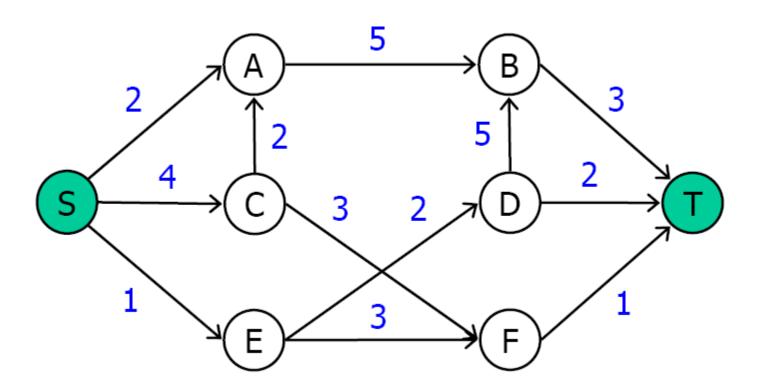
- The flow thru a pipeline cannot be greater than its capacity.
- The total flow coming to a station is the same as the total flow coming from it.

Maximum flows

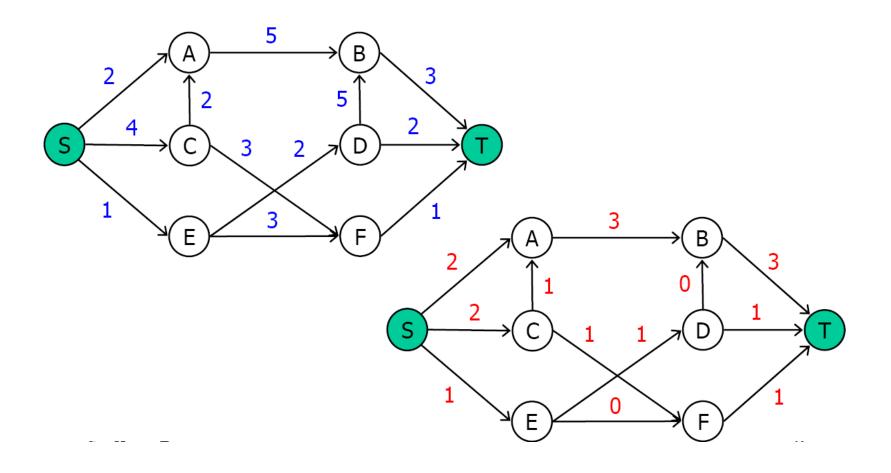
- The flow thru a pipeline cannot be greater than its capacity.
- The total flow coming to a station is the same as the total flow coming from it.

The problem is to maximize the total flow coming to the destination.

Maximum flows



Maximum flows

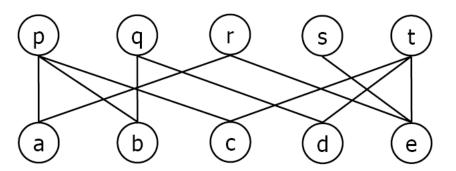


- Applicants: p q r s t
- Suitable jobs: a b c b d a e e c d e
- No applicant is accepted for two jobs, and no job is assigned to two applicants.

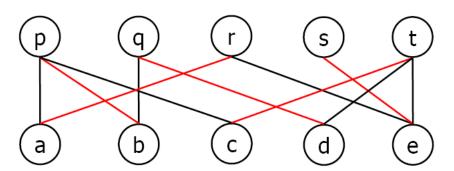
- Applicants: p q r s t
- Suitable jobs: a b c b d a e e c d e
- No applicant is accepted for two jobs, and no job is assigned to two applicants.

The problem is to find a worker for each job.

- Applicants: p q r s t
- Suitable jobs: a b c b d a e e c d e

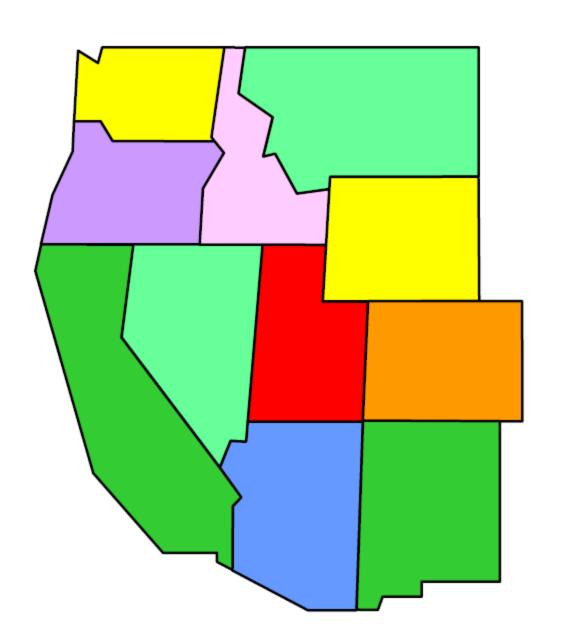


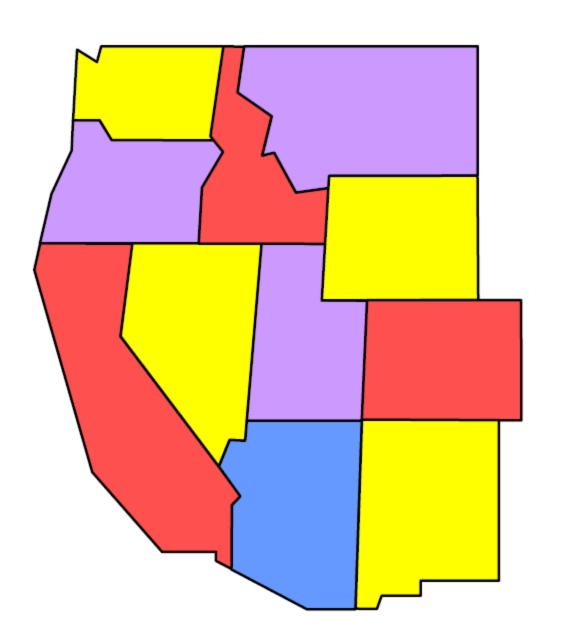
- Applicants: p q r s t
- Suitable jobs: a b c b d a e e c d e

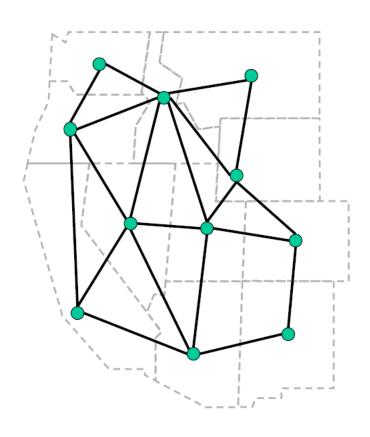


- Maximum matching: as many pairs of worker-job as possible.
- Perfect matching (marriage problem): no worker or job left unmatched.

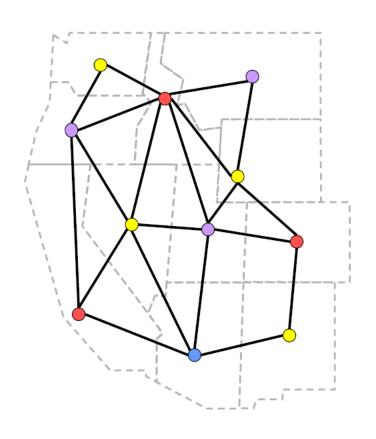
- Given a map of adjacent regions.
- Find the minimum number of colors to fill the regions so that no adjacent regions have the same color.







The problem is to find the minimum number of sets of non-adjacent vertices.



The problem is to find the minimum number of sets of non-adjacent vertices.