

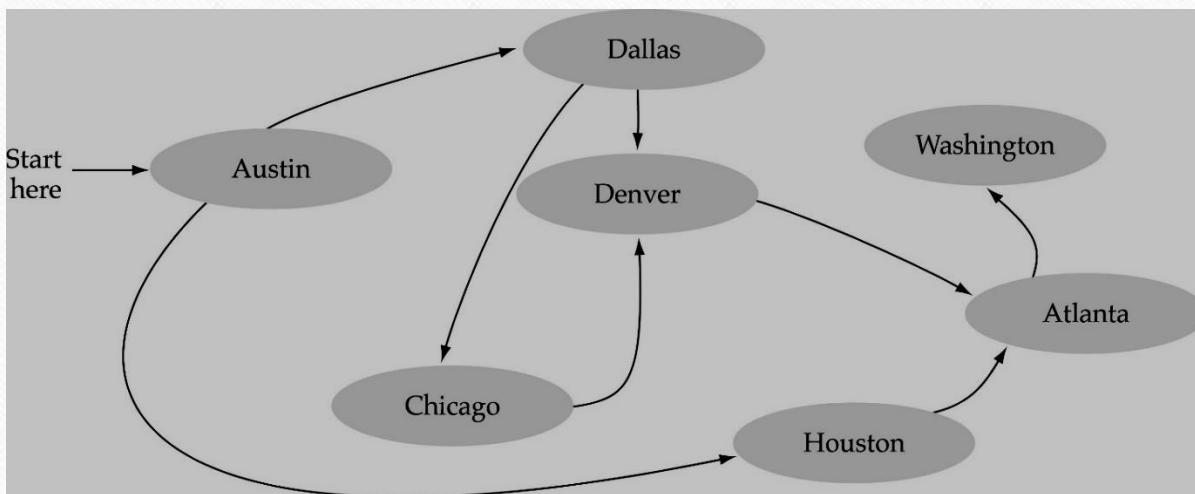
# Graphs

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Design and Analysis of Algorithms

# What is a graph?

- A data structure that consists of a set of nodes (*vertices*) and a set of edges that relate the nodes to each other
- The set of edges describes relationships among the vertices



# Formal definition of graphs

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- A graph  $G$  is defined as follows:

$$G = (V, E)$$

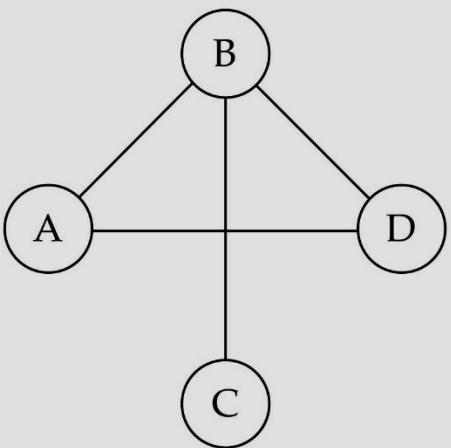
$V(G)$ : a finite, nonempty set of vertices

$E(G)$ : a set of edges (pairs of vertices)

# Directed vs. undirected graphs

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- When the edges in a graph have no direction, the graph is called *undirected* graph.

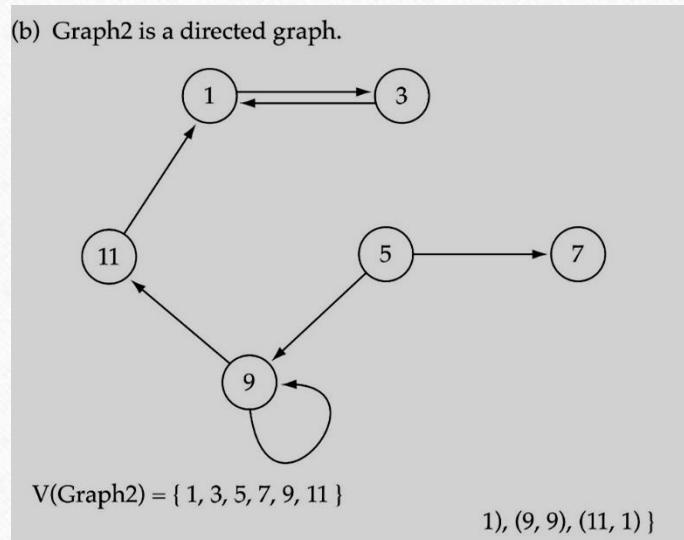


$$V(\text{Graph1}) = \{ A, B, C, D \}$$

$$E(\text{Graph1}) = \{ (A, B), (A, D), (B, C), (B, D) \}$$

# Directed vs. undirected graphs (cont.)

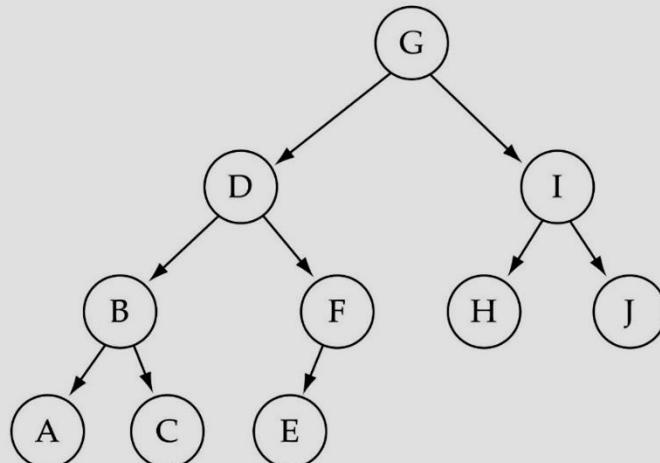
- When the edges in a graph have a direction, the graph is called *directed* (or *digraph*)



# Trees vs graphs

- Trees are special cases of graphs!!

(c) Graph3 is a directed graph.

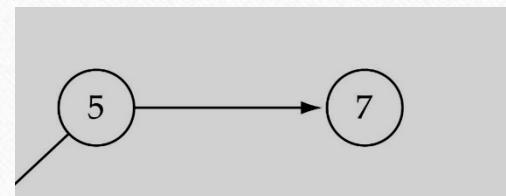


$$V(\text{Graph3}) = \{ A, B, C, D, E, F, G, H, I, J \}$$

$$E(\text{Graph3}) = \{ (G, D), (G, I), (D, B), (D, F), (I, H), (I, J), (B, A), (B, C), (F, E) \}$$

# Graph terminology

- Adjacent nodes: two nodes are adjacent if they are connected by an edge



is adjacent to  
is adjacent from

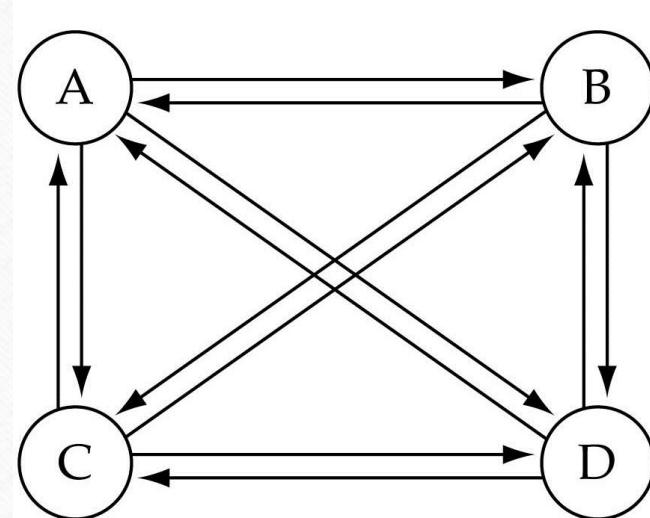
- Path: a sequence of vertices that connect two nodes in a graph
- Complete graph: a graph in which every vertex is directly connected to every other vertex

# Graph terminology (cont.)

- What is the number of edges in a complete directed graph with N vertices?

$O(N^2)$

$N * (N-1)$

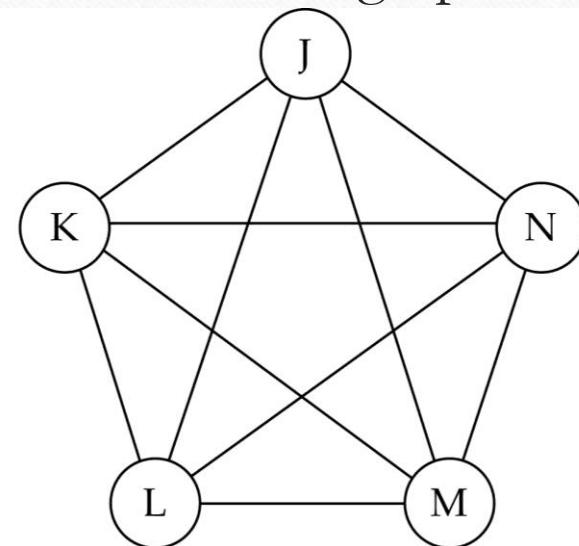


(a) Complete directed graph.

# Graph terminology (cont.)

- What is the number of edges in a complete undirected graph with N vertices?

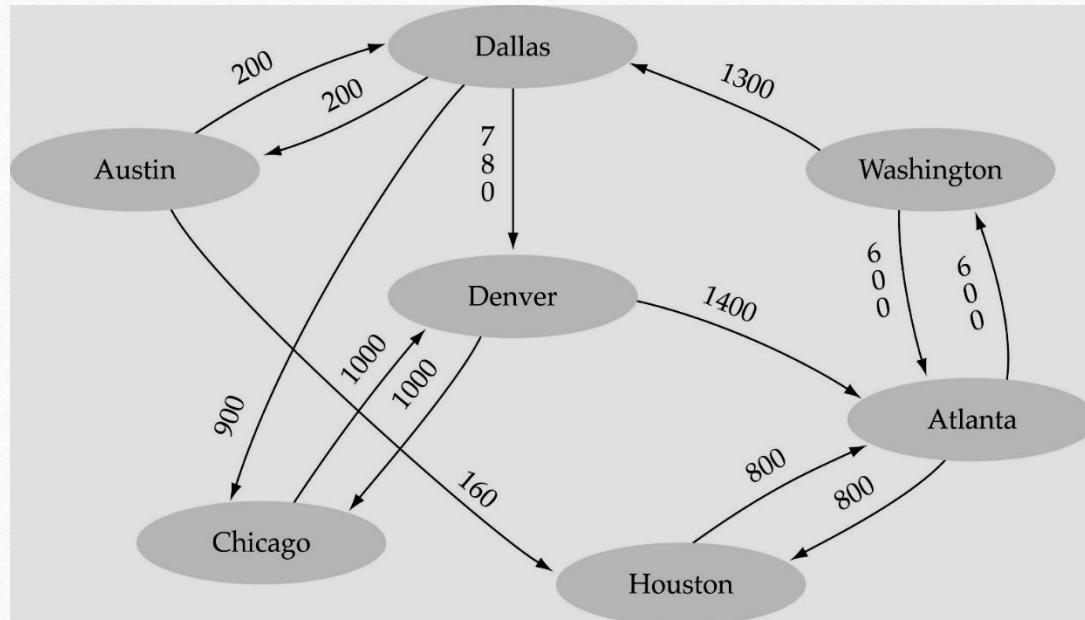
$$O(N^2)$$
$$N * (N-1) / 2$$



(b) Complete undirected graph.

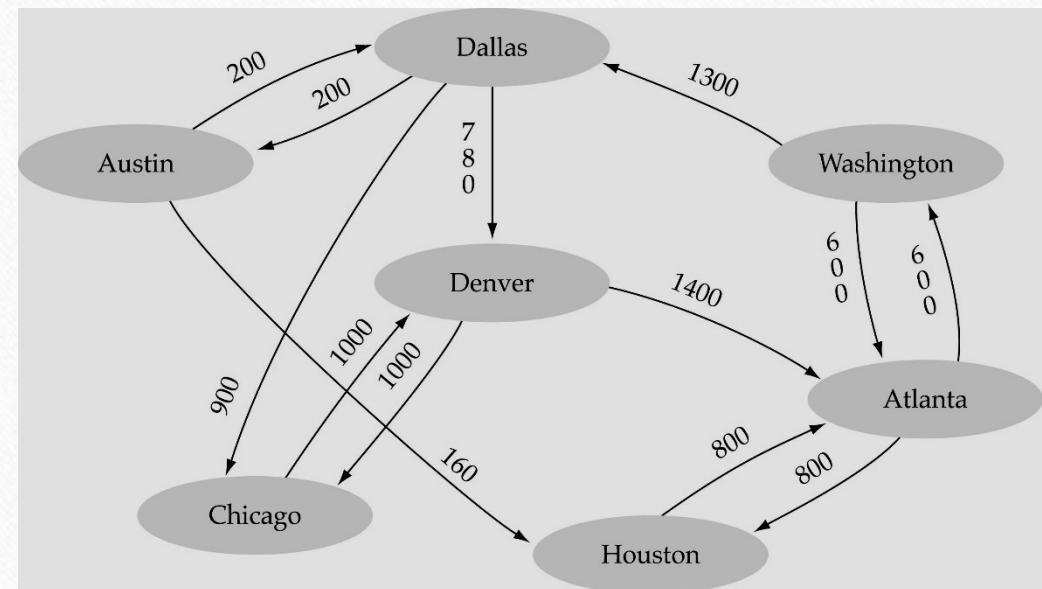
# Graph terminology (cont.)

- Weighted graph: a graph in which each edge carries a value



# Graph implementation

- Array-based implementation
  - A 1D array is used to represent the vertices
  - A 2D array (adjacency matrix) is used to represent the edges



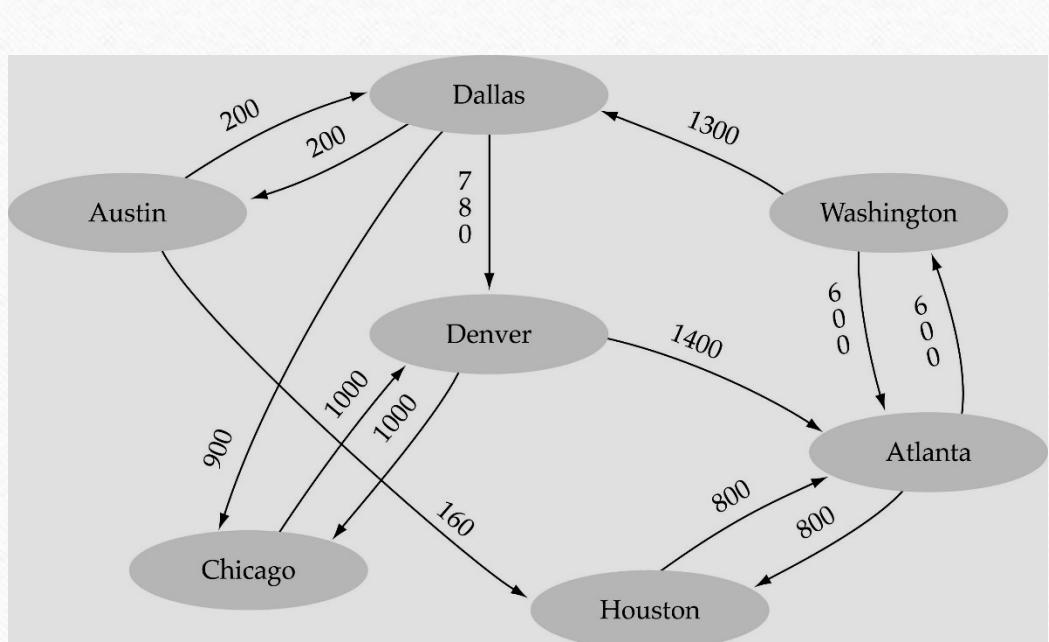
# Array-based implementation

graph		edges									
.numVertices 7											
.vertices											
[0]	"Atlanta "	[0]	0	0	0	0	0	800	600	•	•
[1]	"Austin "	[1]	0	0	0	200	0	160	0	•	•
[2]	"Chicago "	[2]	0	0	0	0	1000	0	0	•	•
[3]	"Dallas "	[3]	0	200	900	0	780	0	0	•	•
[4]	"Denver "	[4]	1400	0	1000	0	0	0	0	•	•
[5]	"Houston "	[5]	800	0	0	0	0	0	0	•	•
[6]	"Washington"	[6]	600	0	0	1300	0	0	0	•	•
[7]		[7]	•	•	•	•	•	•	•	•	•
[8]		[8]	•	•	•	•	•	•	•	•	•
[9]		[9]	•	•	•	•	•	•	•	•	•

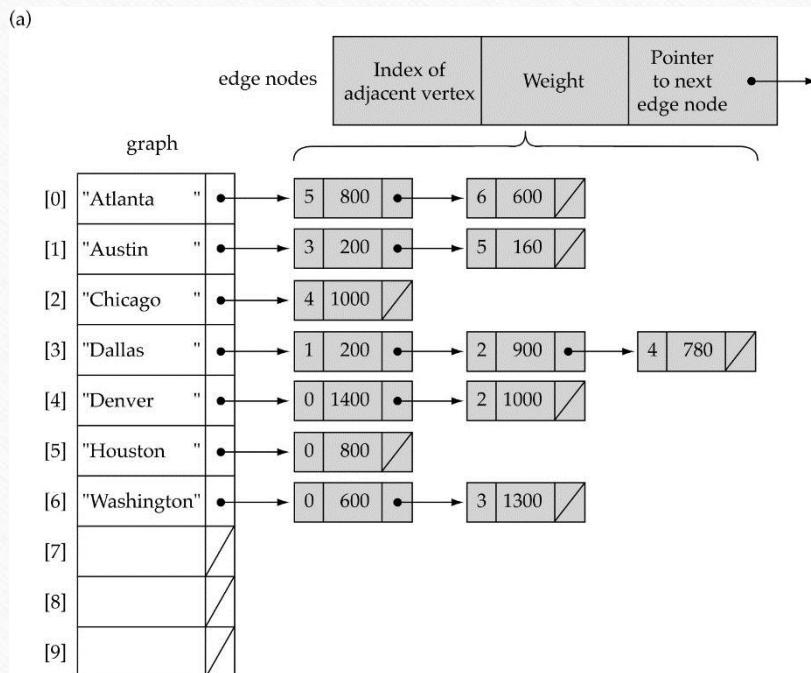
[0] [1] [2] [3] [4] [5] [6] [7] [8] [9]  
(Array positions marked '•' are undefined)

# Graph implementation (cont.)

- Linked-list implementation
  - A 1D array is used to represent the vertices
  - A list is used for each vertex  $v$  which contains the vertices which are adjacent from  $v$  (adjacency list)



# Linked-List Implementation



# Adjacency matrix vs. adjacency list representation

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- **Adjacency matrix**

- Good for dense graphs --  $|E| \sim O(|V|^2)$
- Memory requirements:  $O(|V| + |E|) = O(|V|^2)$
- Connectivity between two vertices can be tested quickly

- **Adjacency list**

- Good for sparse graphs --  $|E| \sim O(|V|)$
- Memory requirements:  $O(|V| + |E|) = O(|V|)$
- Vertices adjacent to another vertex can be found quickly

# Graph specification based on adjacency matrix representation

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```
const int NULL_EDGE = 0;

template<class VertexType>
class GraphType {
public:
    GraphType(int);
    ~GraphType();
    void MakeEmpty();
    bool IsEmpty() const;
    bool IsFull() const;
    void AddVertex(VertexType);
    void AddEdge(VertexType, VertexType, int);
    int WeightIs(VertexType, VertexType);
    void GetToVertices(VertexType, QueType<VertexType>&);
    void ClearMarks();
    void MarkVertex(VertexType);
    bool IsMarked(VertexType) const;
private:
    int numVertices;
    int maxVertices;
    VertexType* vertices;
    int **edges;
    bool* marks;
};
```

```
template<class VertexType>
GraphType<VertexType>::GraphType(int maxV)
{
    numVertices = 0;
    maxVertices = maxV;
    vertices = new VertexType[maxV];
    edges = new int[maxV];
    for(int i = 0; i < maxV; i++)
        edges[i] = new int[maxV];
    marks = new bool[maxV];
}

template<class VertexType>
GraphType<VertexType>::~GraphType()
{
    delete [] vertices;
    for(int i = 0; i < maxVertices; i++)
        delete [] edges[i];
    delete [] edges;
    delete [] marks;
}
```

```
void GraphType<VertexType>::AddVertex(VertexType vertex)
{
    vertices[numVertices] = vertex;

    for(int index = 0; index < numVertices; index++) {
        edges[numVertices][index] = NULL_EDGE;
        edges[index][numVertices] = NULL_EDGE;
    }

    numVertices++;
}

template<class VertexType>
void GraphType<VertexType>::AddEdge(VertexType fromVertex,
                                     VertexType toVertex, int weight)
{
    int row;
    int column;

    row = IndexIs(vertices, fromVertex);
    col = IndexIs(vertices, toVertex);
    edges[row][col] = weight;
}
```

```
template<class VertexType>
int GraphType<VertexType>::WeightIs(VertexType fromVertex,
                                      VertexType toVertex)
{
    int row;
    int column;

    row = IndexIs(vertices, fromVertex);
    col = IndexIs(vertices, toVertex);
    return edges[row][col];
}
```

# Graph searching

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- Problem: find a path between two nodes of the graph (e.g., Austin and Washington)
- Methods: Depth-First-Search (**DFS**) or Breadth-First-Search (**BFS**)

# Depth-First-Search (DFS)

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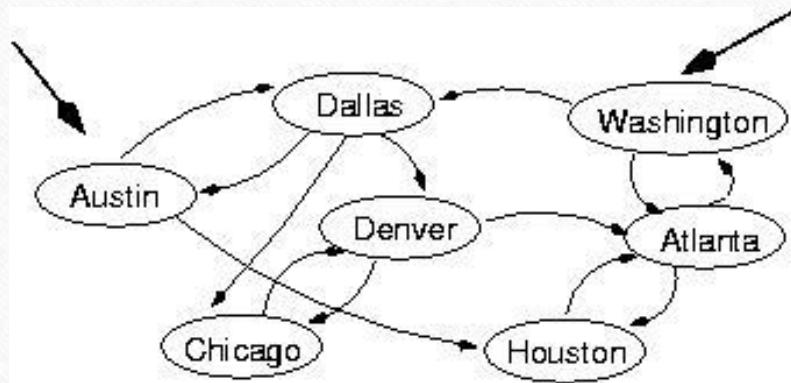
- What is the idea behind DFS?
  - Travel as far as you can down a path
  - Back up *as little as possible* when you reach a "dead end" (i.e., next vertex has been "marked" or there is no next vertex)
- DFS can be implemented efficiently using a *stack*

# Depth-First-Search (DFS) (*cont.*)

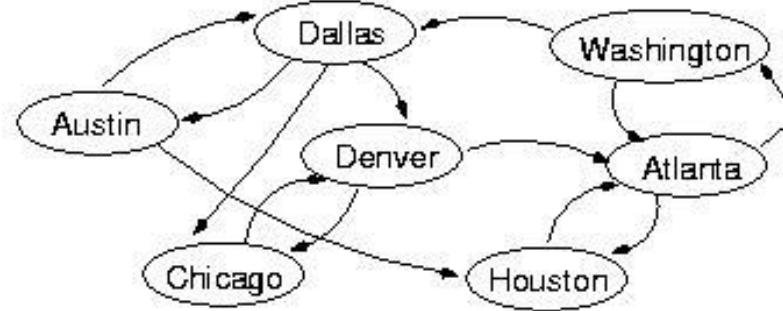
---

```
Set found to false
stack.Push(startVertex)
DO
    stack.Pop(vertex)
    IF vertex == endVertex
        Set found to true
    ELSE
        Push all adjacent vertices onto stack
    WHILE !stack.IsEmpty() AND !found

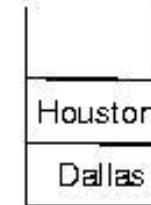
    IF(!found)
        Write "Path does not exist"
```

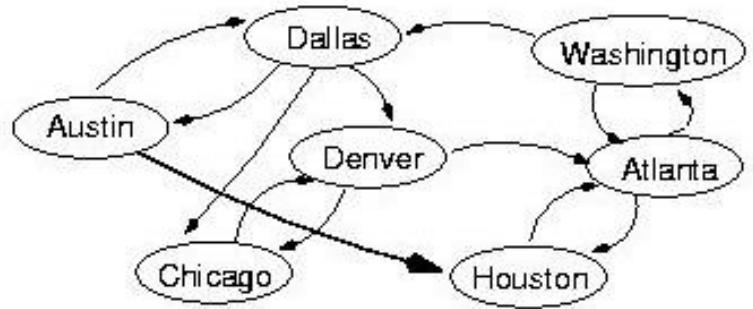


(initialization)

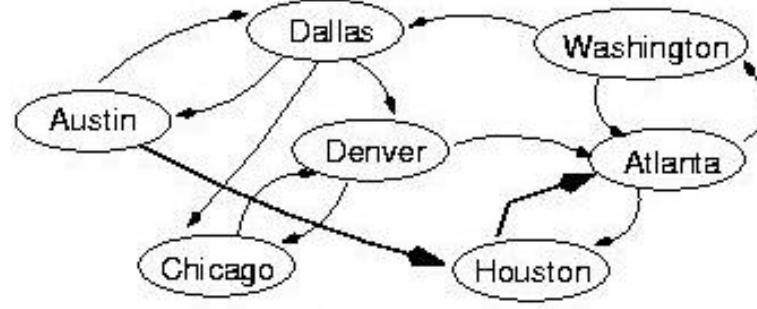


**pop** Austin

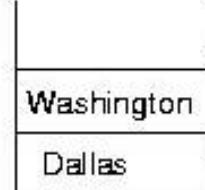


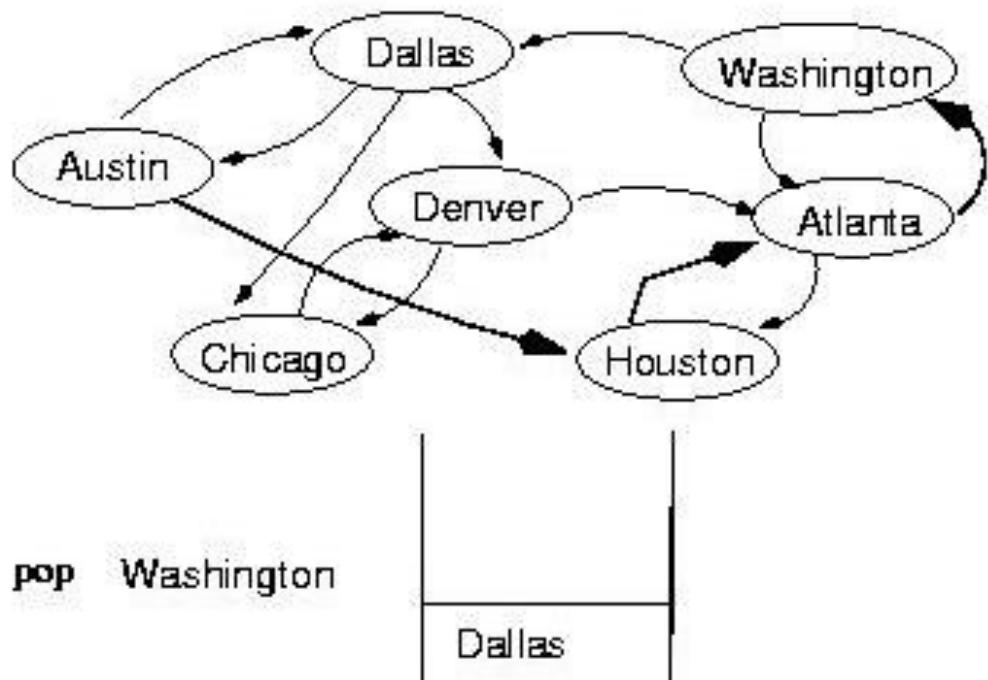


**pop** Houston



**pop** Atlanta





```
template <class ItemType>
void DepthFirstSearch(GraphType<VertexType> graph, VertexType startVertex, VertexType endVertex)
{
    StackType<VertexType> stack;
    QueType<VertexType> vertexQ;

    bool found = false;
    VertexType vertex;
    VertexType item;

    graph.ClearMarks();
    stack.Push(startVertex);
    do {
        stack.Pop(vertex);
        if(vertex == endVertex)
            found = true;
```

```
else {
    if(!graph.IsMarked(vertex)) {
        graph.MarkVertex(vertex);
        graph.GetToVertices(vertex, vertexQ);

        while(!vertexQ.IsEmpty()) {
            vertexQ.Dequeue(item);
            if(!graph.IsMarked(item))
                stack.Push(item);
        }
    }
} while(!stack.IsEmpty() && !found);

if(!found)
    cout << "Path not found" << endl;
}
```

```
template<class VertexType>
void GraphType<VertexType>::GetToVertices(VertexType vertex,
                                         QueTye<VertexType>& adjvertexQ)
{
    int fromIndex;
    int toIndex;

    fromIndex = IndexIs(vertices, vertex);
    for(toIndex = 0; toIndex < numVertices; toIndex++)
        if(edges[fromIndex][toIndex] != NULL_EDGE)
            adjvertexQ.Enqueue(vertices[toIndex]);
}
```

# Breadth-First-Searching (BFS)

---

- What is the idea behind BFS?
  - Look at all possible paths at the same depth before you go at a deeper level
  - Back up *as far as possible* when you reach a "dead end" (i.e., next vertex has been "marked" or there is no next vertex)

# Breadth-First-Searching (BFS) (cont.)

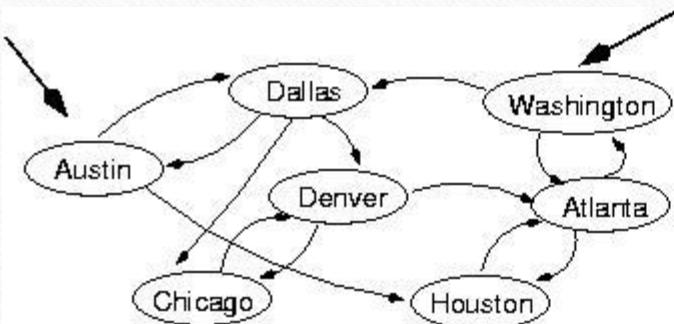
- BFS can be implemented efficiently using a *queue*

```
Set found to false  
queue.Enqueue(startVertex)  
DO  
    queue.Dequeue(vertex)  
    IF vertex == endVertex  
        Set found to true  
    ELSE  
        Enqueue all adjacent vertices onto queue  
    WHILE !queue.IsEmpty() AND !found
```

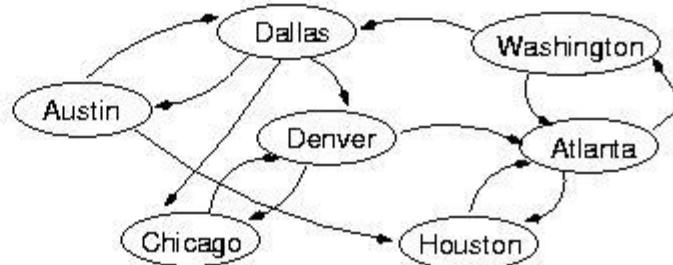
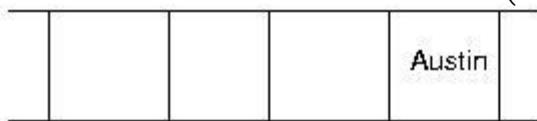
- Should we mark a vertex when it is enqueued or when it is dequeued ?

start

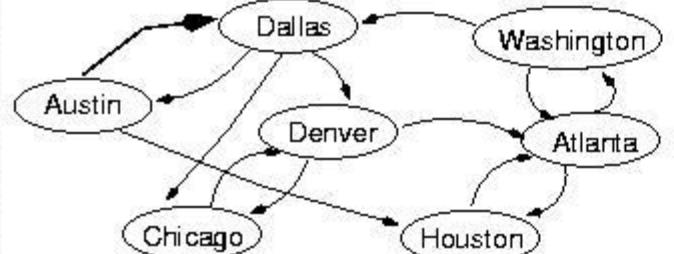
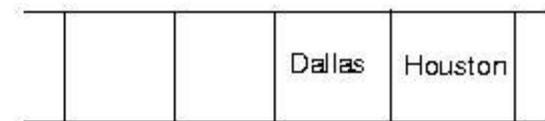
and



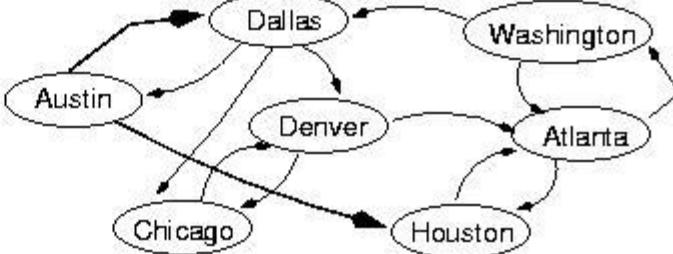
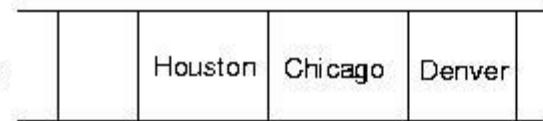
(initialization)



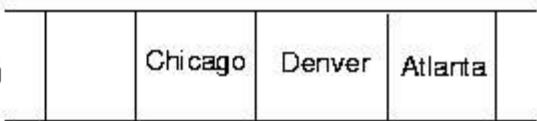
**dequeue** Austin

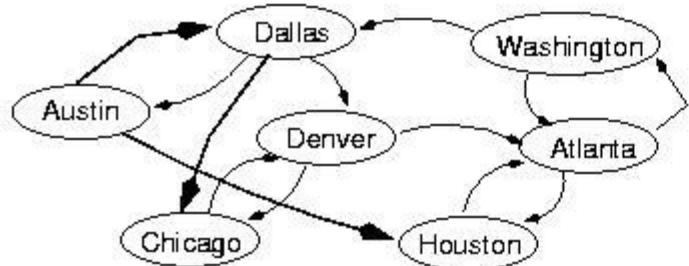


**dequeue** Dallas



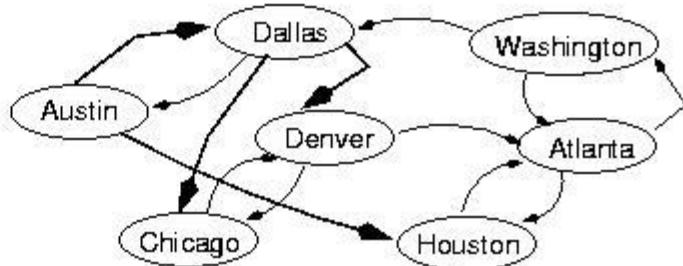
**dequeue** Houston





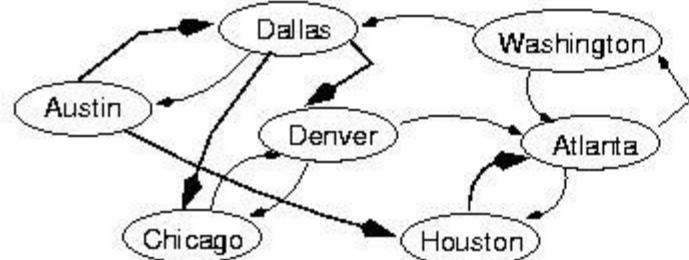
**dequeue** Chicago

		Denver	Atlanta	Denver



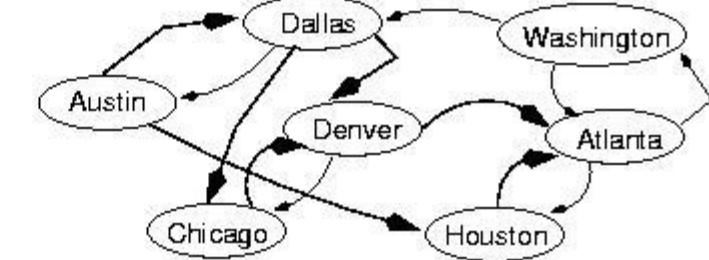
**dequeue** Denver

		Atlanta	Denver	Atlanta



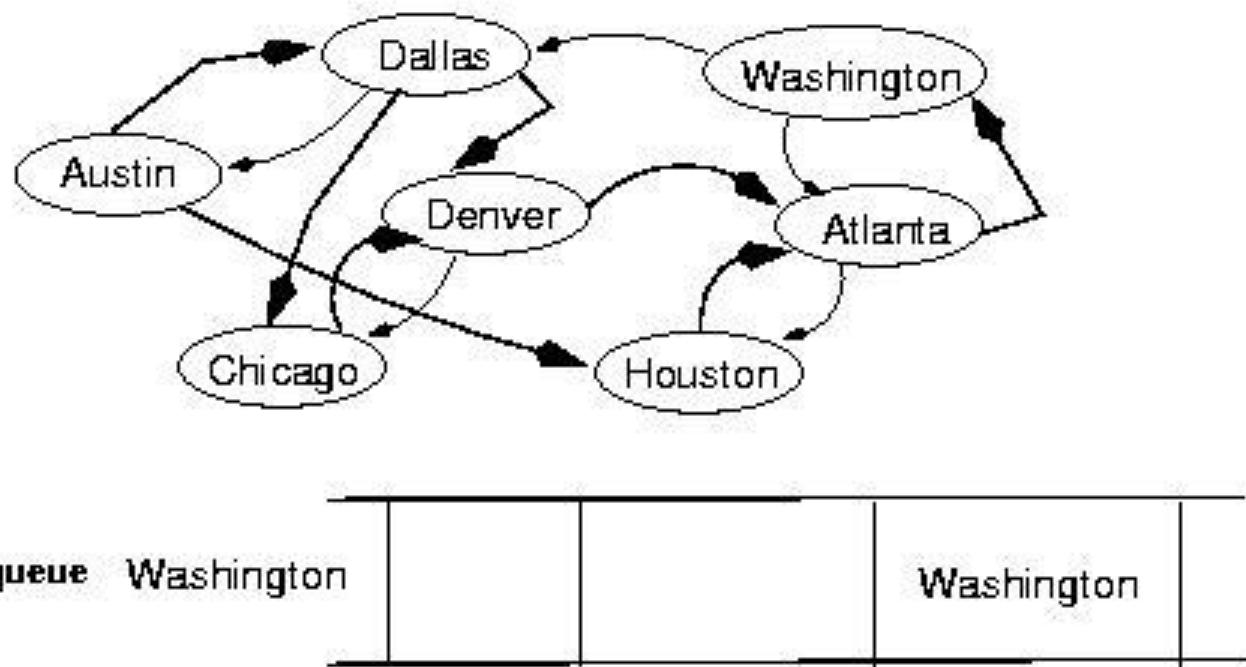
**dequeue** Atlanta

		Denver	Atlanta	Washington



**dequeue** Denver,  
next: Atlanta

		Washington	Washington



```
template<class VertexType>
void BreadthFirstSearch(GraphType<VertexType> graph, VertexType startVertex, VertexType endVertex);
{
    QueType<VertexType> queue;
    QueType<VertexType> vertexQ;//

    bool found = false;
    VertexType vertex;
    VertexType item;

    graph.ClearMarks();
    queue.Enqueue(startVertex);
    do {
        queue.Dequeue(vertex);
        if(vertex == endVertex)
            found = true;
    }
```

```
else {
    if(!graph.IsMarked(vertex)) {
        graph.MarkVertex(vertex);
        graph.GetToVertices(vertex, vertexQ);

        while(!vertexQ.IsEmpty()) {
            vertexQ.Dequeue(item);
            if(!graph.IsMarked(item))
                queue.Enqueue(item);
        }
    }
}
} while (!queue.IsEmpty() && !found);

if(!found)
    cout << "Path not found" << endl;
}
```