Proposition: If G is a graph with m edges, then:

$$\sum_{v \in G} deg(v) = 2m$$

Justification:

- An edge (u,v) is counted twice in the summation above:
 - once by its endpoint u when considered an origin
 - once by its endpoint v when considered an origin
- Thus, the total contribution of the edges to the degrees of the vertices is twice the number of edges.

Proposition: If G is a **directed** graph with m edges, then:

$$\sum_{v \in G} indeg(v) = \sum_{v \in G} outdeg(v) = m$$

Justification:

- In a directed graph, an edge (u,v) contributes:
 - One unit to the out-degree of its origin u
 - One unit to the in-degree of its destination v
- Based on this:
 - > The total contribution of the edges to the **in-degrees** equals the number of edges
 - The total contribution of the edges to the **out-degrees** equals the number of edges

Proposition: Let G be a graph with n vertices and m edges. If G is a simple undirected, then $m \le n(n-1)/2$, and if G is simple directed, then $m \le n(n-1)$

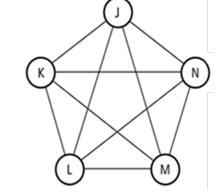
Justification:

- If G is a simple undirected graph:
 - Since G is simple, then for each vertex v we have: $deg(v) \le n-1$, implying that:

$$\sum_{v \in G} deg(v) \le n(n-1)$$

Since G is undirected, then we already proved that

$$\sum_{v \in G} deg(v) = 2m$$



Example: Given a simple undirected

The above two equations imply that:

 $2m \le n(n-1) \equiv m \le n(n-1)/2$ graph of **5** vertices, the **maximum** possible degree of a vertex is **4**

Proposition: Let G be a graph with n vertices and m edges. If G is a simple undirected, then $m \le n(n-1)/2$, and if G is simple directed, then $m \le n(n-1)$

Justification:

- If G is a simple <u>directed</u> graph:
 - Since G is simple, for each vertex v we have: $indeg(v) \le n 1$, implying that:

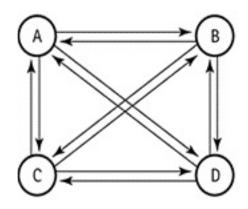
$$\sum_{v \in G} indeg(v) \le n(n-1)$$

Since G is directed, then we already proved that

$$\sum_{v \in G} indeg(v) = m$$

The above two equations imply that:

$$m \le n(n-1)$$



Example: Given a simple directed graph of 4 vertices, the maximum possible in-degree of a vertex is 3

THE GRAPH ADT

- The abstract data type has a position for each vertex, and a position for each edge.
- Each **Vertex** object, **u**, supports at least the following operations:

```
operator*(): Return the element associated with u.
incidentEdges(): Return an edge list of all the edges incident on u.
isAdjacentTo(v): Test whether vertices u and v are adjacent.
```

Each Edge object e supports at least the following operations:

```
operator*(): Return the element associated with e (e.g., it could be the weight of e) endVertices(): Return a vertex list containing e's end vertices.

opposite(v): Return the end vertex of edge e distinct from vertex v (an error occurs if e is not incident on v).
```

isAdjacentTo(f): Test whether edges e and f are adjacent. isIncidentOn(v): Test whether e is incident on v.

THE GRAPH ADT

The Graph ADT itself supports at least the following operations:

```
vertices(): Return a vertex list of all the vertices of the graph.
edges(): Return an edge list of all the edges of the graph.
insertVertex(x): Insert and return a new vertex storing element x.
insertEdge(v,w,z): Insert and return a new undirected edge with end vertices v and w and storing element z.
eraseVertex(v): Remove vertex v and all its incident edges.
eraseEdge(e): Remove edge e.
```

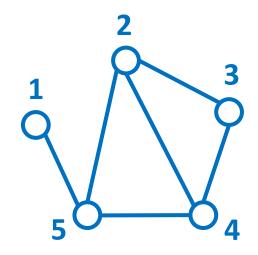
DATA STRUCTURES FOR GRAPHS

DATA STRUCTURES FOR GRAPHS

How would you represent such a graph in memory?

We can use an **EDGE LIST**, which simply lists all the edges one by one:

- **•** (1, 5)
- **•** (2, 3)
- **(2, 4)**
- **•** (2, 5)
- **(3, 4)**
- **•** (4, 5)

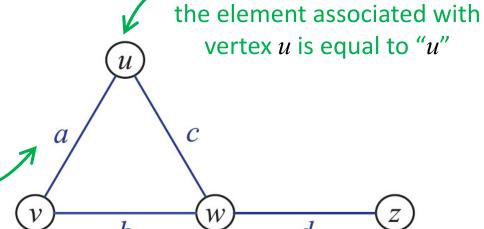


EDGE LIST

Here is the edge list of this graph:

- (v,u)
- \bullet (v, w)
- (*u*, *w*)
- (w,z)

a is the element associated with (u, v) (e.g., it represents the edge's weight)

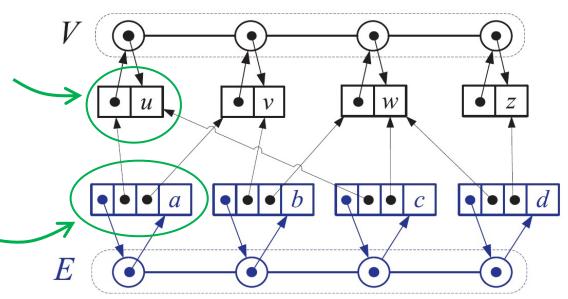


For simplicity, assume that

Here is how to represent this edge list:

A vertex object consists of the element u and the position of the object in the collection V

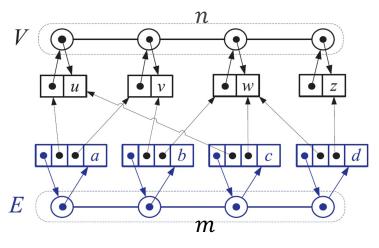
An edge object consists of the element a and the object's **position** in the collection E as well as **positions** associated with its two endpoints, u and v



EDGE LIST - COMPLEXITY

• Given an Edge List, what is the complexity of these operations?

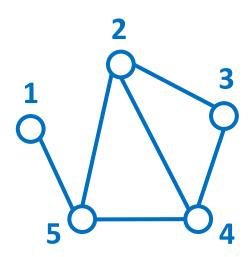
- O(n) vertices: Return a list of all vertices
- O(m) edges: Return a list of all edges
- O(1) insertVertex: Inserts a **new vertex**
- O(1) insertEdge: Insert a **new edge**
- O(m) eraseVertex: Remove a vertex and all its incident edges
- O(1) eraseEdge: Remove an edge
- O(m) incidentEdges: Return a list of all edges incident on a vertex
- O(m) is Adjacent To: Test whether two vertices are adjacent
- O(1) endVertices: Return the two endpoints of an edge
- O(1) opposite: Given an endpoint of an edge, return the other endpoint
- O(1) is Incident On: Test whether an edge is incident on given vertex



ADJACENCY LIST

We discussed how this graph can be represented as an edge list, which simply lists the edges:

- **•** (1, 5)
- **•** (2, 3)
- **•** (2, 4)
- **•** (2, 5)
- **•** (3, 4)
- **4** (4, 5)



An alternative is an ADJACENCY LIST, which lists the vertices that are adjacent to each vertex

- **1**: 5
- **2:** (3, 4, 5) ←

This is called the "incidence collection" of vertex 2, denoted by I(2)

- **3**: 2, 4,
- **4**: 2, 3, 5
- **5**: 1, 2, 4

ADJACENCY LIST

Here is the adjacency list of this graph:

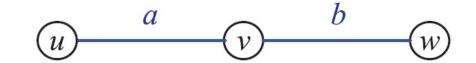
- *u*: *v*
- *v*: *u*, *w*
- *w*: *v*

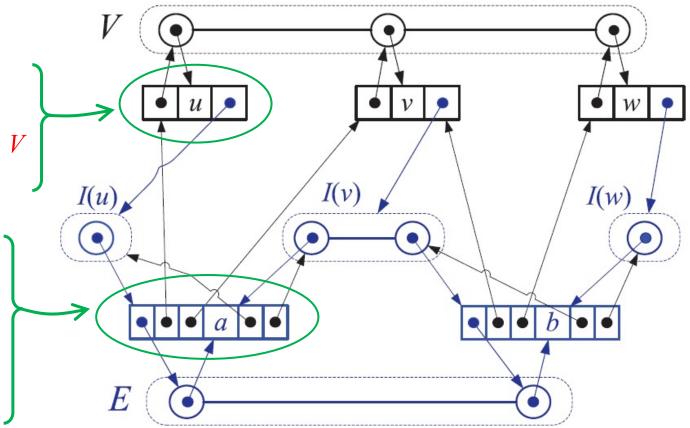
A vertex object consists of:

- The **element** *u*
- The object's **position** in collection V
- A reference to I(u)

An edge object consists of:

- The **element** *a*
- The object's **position** in the collection *E*
- The **positions** associated with u and v
- References to the edge's position in I(u) and the edge's position in I(v)

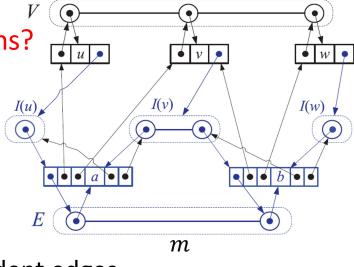




ADJACENCY LIST - COMPLEXITY

• Given an adjacency list, what is the complexity of these operations?

- O(n) vertices: Return a list of all vertices
- O(m) edges: Return a list of all edges
- O(1) insertVertex: Inserts a **new vertex**
- O(1) insertEdge: Insert a **new edge**
- $O(\deg(v))$ eraseVertex(v): **Remove a vertex** and all its incident edges
 - O(1) eraseEdge: Remove an edge
- $O(\deg(v))$ v.incidentEdges(): Return a list of all edges incident on a vertex
- $O(\min(\deg(v), \deg(w)))$ v.isAdjacentTo(w): Test whether v and w are adjacent
 - O(1) endVertices: Return the two endpoints of an edge
 - O(1) opposite: Given an endpoint of an edge, return the other endpoint
 - O(1) is Incident On: Test whether an edge is incident on given vertex



n

ADJACENCY MATRIX

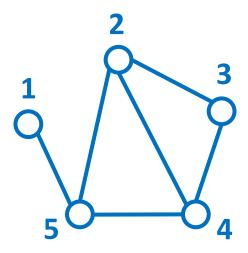
An edge list simply lists the edges:

- **•** (1, 5)
- **•** (2, 3)
- **•** (2, 4)
- **•** (2, 5)
- **•** (3, 4)
- **•** (4, 5)

An adjacency list specifies the vertices

that are adjacent to each vertex:

- **1**: 5
- **2**: 3, 4, 5
- **3**: 2, 4,
- **4**: 2, 3, 5
- **5**: 1, 2, 4



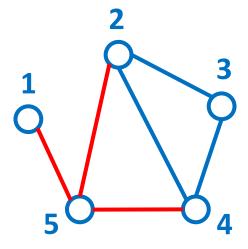
ADJACENCY MATRIX

An edge list simply lists the edges:

- **•** (1, 5)
- **•** (2, 3)
- **•** (2, 4)
- **•** (2, 5)
- **•** (3, 4)
- **•** (4, 5)

An adjacency list specifies the vertices that are adjacent to each vertex:

- **1**: 5
- **2**: 3, 4, 5
- **3**: 2, 4,
- **4**: 2, 3, 5
- **5**: 1, 2, 4



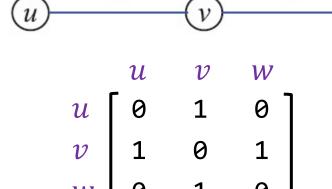
We can use an ADJACENCY MATRIX, where:

- A[i, j] = 1 means j is adjacent to i
- A[i,j] = 0 means j is not adjacent to i

ADJACENCY MATRIX

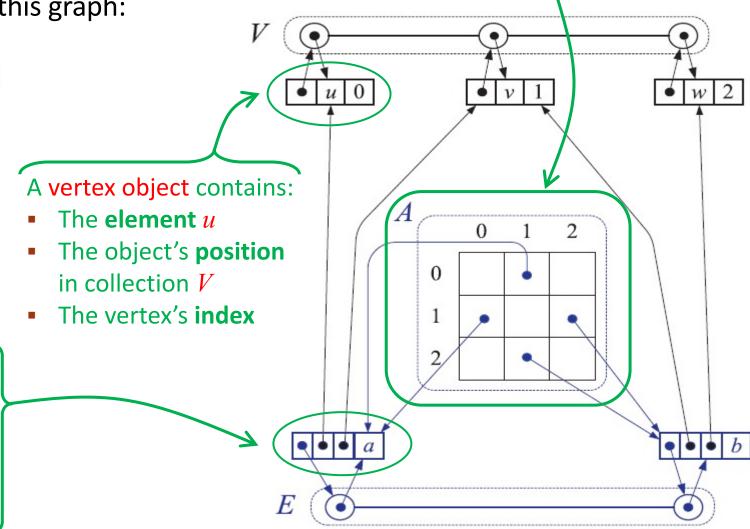
A[i, j] holds a **reference** to the edge between the vertices whose indices are i and j (if such an edge exists)

Here is the adjacency Matrix of this graph:



An edge object consists of:

- The **element** *a*
- The object's **position** in the collection *E*
- The positions associated
 with the endpoints u and v



ADJACENCY MATRIX - COMPLEXITY

• Given an adjacency matrix, what is the complexity of these operations?

O(n) vertices: Return a list of all vertices

 $O(n^2)$ edges: Return a list of all edges

 $O(n^2)$ insertVertex: Inserts a **new vertex**

O(1) insertEdge: Insert a **new edge**

 $O(n^2)$ eraseVertex: **Remove a vertex** and all its incident edges

O(1) eraseEdge: Remove an edge

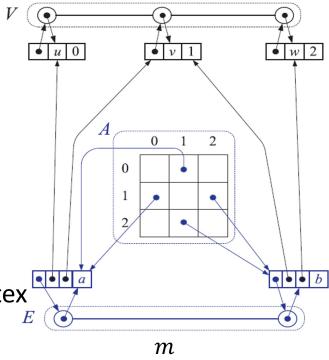
O(n) incidentEdges: Return a list of all edges incident on a vertex

O(1) isAdjacentTo: Test whether two vertices are adjacent

O(1) endVertices: Return the two endpoints of an edge

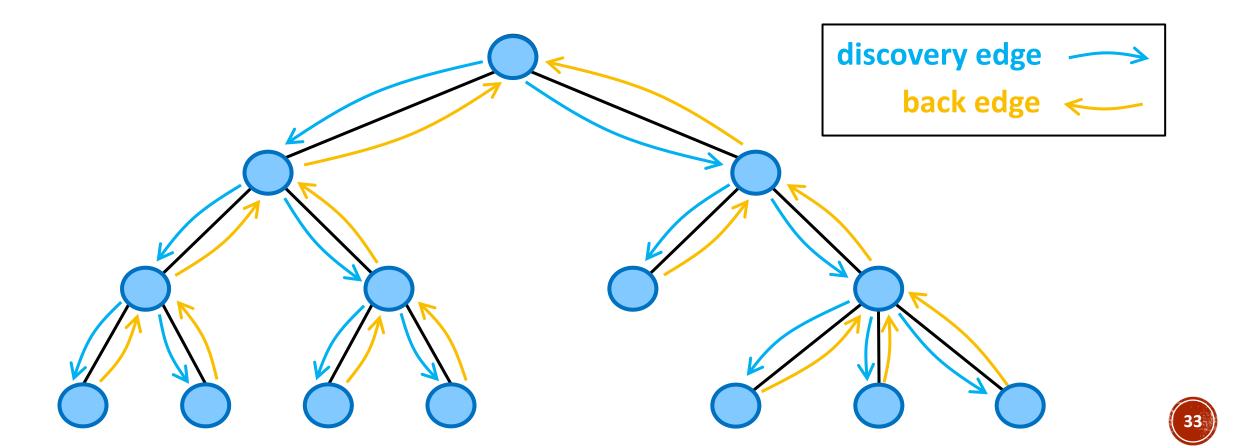
O(1) opposite: Given an endpoints of an edge, return the other endpoint

0(1) isIncidentOn: Test whether an edge is incident on given vertex



DEPTH-FIRST SEARCH (DFS)

- How to traverse a tree, i.e., visit all of its vertices one by one?
- One way to do this is to use the "depth-first search" algorithm:



BREADTH-FIRST SEARCH (BFS)

• An alternative to depth-first search is to called "breadth-first search", which works in trees as follows:

