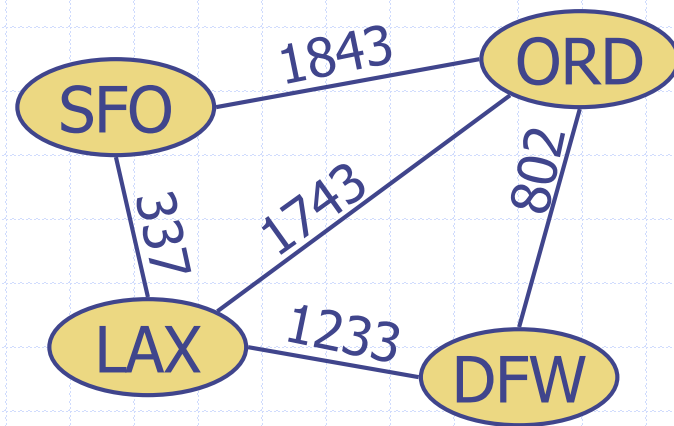
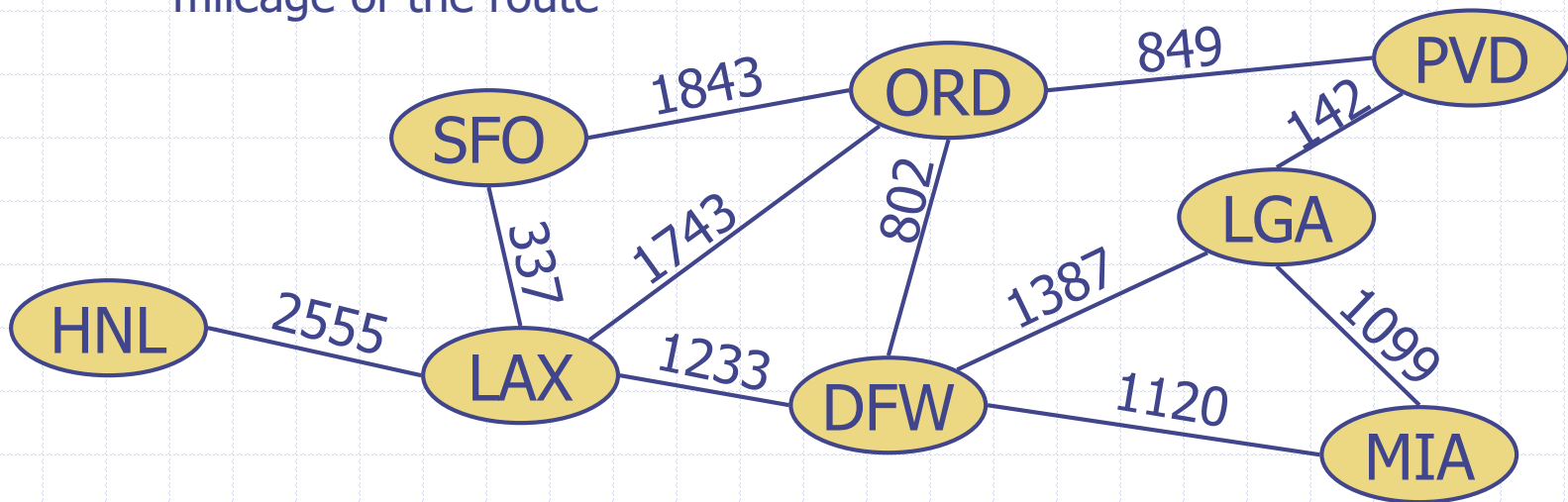


Graphs



Graphs

- A graph is a pair (V, E) , where
 - V is a set of nodes, called **vertices**
 - E is a collection of pairs of vertices, called **edges**
 - Vertices and edges are positions and store elements
- Example:
 - A vertex represents an airport and stores the three-letter airport code
 - An edge represents a flight route between two airports and stores the mileage of the route



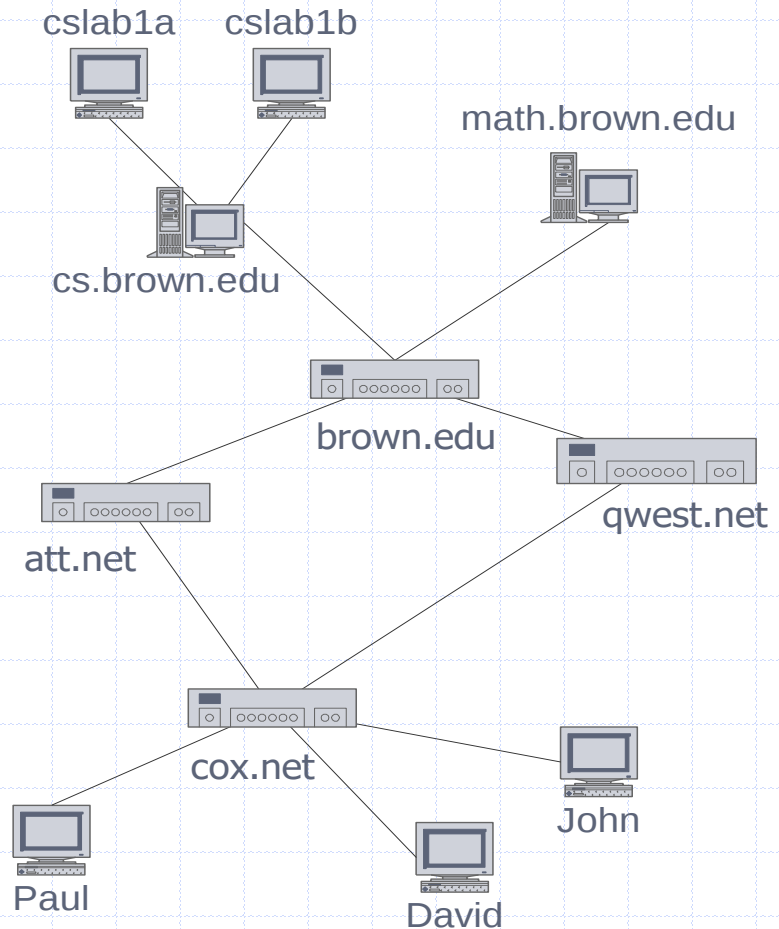
Edge Types

- Directed edge
 - ordered pair of vertices (u,v)
 - first vertex u is the origin
 - second vertex v is the destination
 - e.g., a flight
- Undirected edge
 - unordered pair of vertices (u,v)
 - e.g., a flight route
- Directed graph
 - all the edges are directed
 - e.g., route network
- Undirected graph
 - all the edges are undirected
 - e.g., flight network



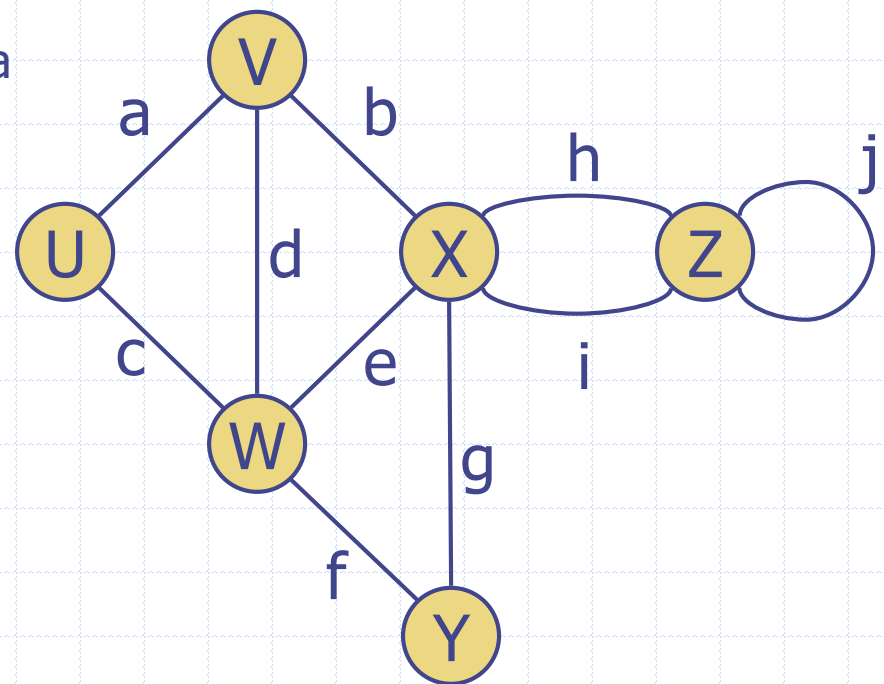
Applications

- ❑ Electronic circuits
 - Printed circuit board
 - Integrated circuit
- ❑ Transportation networks
 - Highway network
 - Flight network
- ❑ Computer networks
 - Local area network
 - Internet
 - Web
- ❑ Databases
 - Entity-relationship diagram



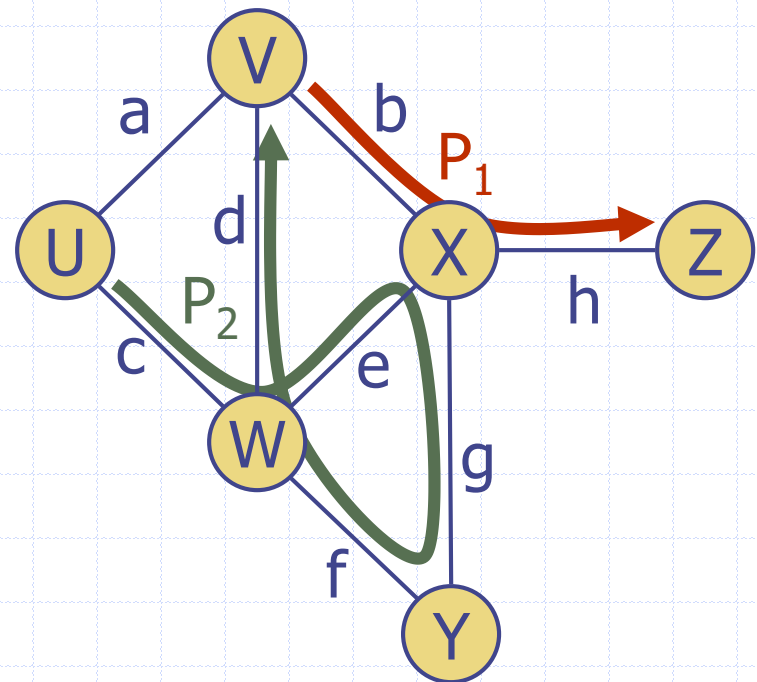
Terminology

- End vertices (or endpoints) of an edge
 - U and V are the endpoints of a
- Edges incident on a vertex
 - a, d, and b are incident on V
- Adjacent vertices
 - U and V are adjacent
- Degree of a vertex
 - X has degree 5
- Parallel edges
 - h and i are parallel edges
- Self-loop
 - j is a self-loop



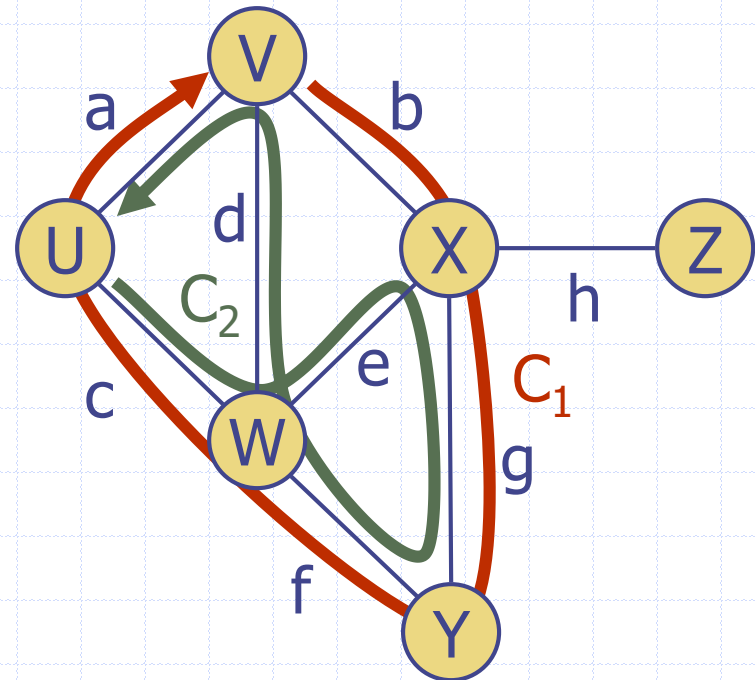
Terminology (cont.)

- Path
 - sequence of alternating vertices and edges
 - begins with a vertex
 - ends with a vertex
 - each edge is preceded and followed by its endpoints
- Simple path
 - path such that all its vertices and edges are distinct
- Examples
 - $P_1 = (V, b, X, h, Z)$ is a simple path
 - $P_2 = (U, c, W, e, X, g, Y, f, W, d, V)$ is a path that is not simple



Terminology (cont.)

- Cycle
 - circular sequence of alternating vertices and edges
 - each edge is preceded and followed by its endpoints
- Simple cycle
 - cycle such that all its vertices and edges are distinct
- Examples
 - $C_1 = (V, b, X, g, Y, f, W, c, U, a, \downarrow)$ is a simple cycle
 - $C_2 = (U, c, W, e, X, g, Y, f, W, d, V, a, \downarrow)$ is a cycle that is not simple



Properties

Property 1

$$\sum_v \deg(v) = 2m$$

Proof: each edge is counted twice

Property 2

In an undirected graph with no self-loops and no multiple edges

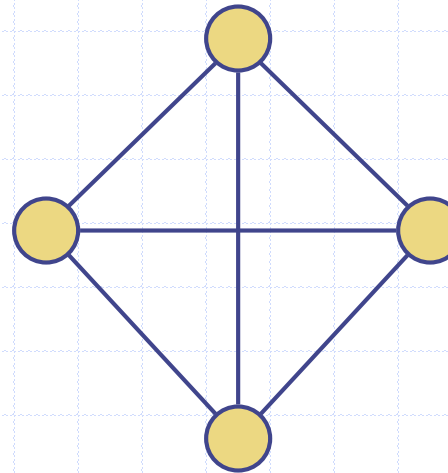
$$m \leq n(n-1)/2$$

Proof: each vertex has degree at most $(n-1)$

What is the bound for a directed graph?

Notation

n	number of vertices
m	number of edges
$\deg(v)$	degree of vertex v



Example

- $n = 4$
- $m = 6$
- $\deg(v) = 3$

Vertices and Edges

- ❑ A **graph** is a collection of **vertices** and **edges**.
- ❑ We model the abstraction as a combination of three data types: Vertex, Edge, and Graph.
- ❑ A **Vertex** is a lightweight object that stores an arbitrary element provided by the user (e.g., an airport code)
 - We assume it supports a method, `element()`, to retrieve the stored element.
- ❑ An **Edge** stores an associated object (e.g., a flight number, travel distance, cost), retrieved with the `element()` method.
- ❑ In addition, we assume that an Edge supports the following methods:
 - `endpoints()`: Return a tuple (u, v) such that vertex u is the origin of the edge and vertex v is the destination; for an undirected graph, the orientation is arbitrary.
 - `opposite(v)`: Assuming vertex v is one endpoint of the edge (either origin or destination), return the other endpoint.

Graph ADT

`vertex_count()`: Return the number of vertices of the graph.

`vertices()`: Return an iteration of all the vertices of the graph.

`edge_count()`: Return the number of edges of the graph.

`edges()`: Return an iteration of all the edges of the graph.

`get_edge(u,v)`: Return the edge from vertex u to vertex v , if one exists; otherwise return `None`. For an undirected graph, there is no difference between `get_edge(u,v)` and `get_edge(v,u)`.

`degree(v, out=True)`: For an undirected graph, return the number of edges incident to vertex v . For a directed graph, return the number of outgoing (resp. incoming) edges incident to vertex v , as designated by the optional parameter.

`incident_edges(v, out=True)`: Return an iteration of all edges incident to vertex v . In the case of a directed graph, report outgoing edges by default; report incoming edges if the optional parameter is set to `False`.

`insert_vertex(x=None)`: Create and return a new Vertex storing element x .

`insert_edge(u, v, x=None)`: Create and return a new Edge from vertex u to vertex v , storing element x (`None` by default).

`remove_vertex(v)`: Remove vertex v and all its incident edges from the graph.

`remove_edge(e)`: Remove edge e from the graph.

Graph ADT: Basic Usage

```
def basic_graph_example_1():
    g = Graph()
    v1 = g.insert_vertex(1)
    v2 = g.insert_vertex(2)
    v3 = g.insert_vertex(3)
    v4 = g.insert_vertex(4)
    v5 = g.insert_vertex(5)

    e1 = g.insert_edge(v1,v4)
    e2 = g.insert_edge(v3,v1)
    e3 = g.insert_edge(v5,v3)
    e4 = g.insert_edge(v2,v5)

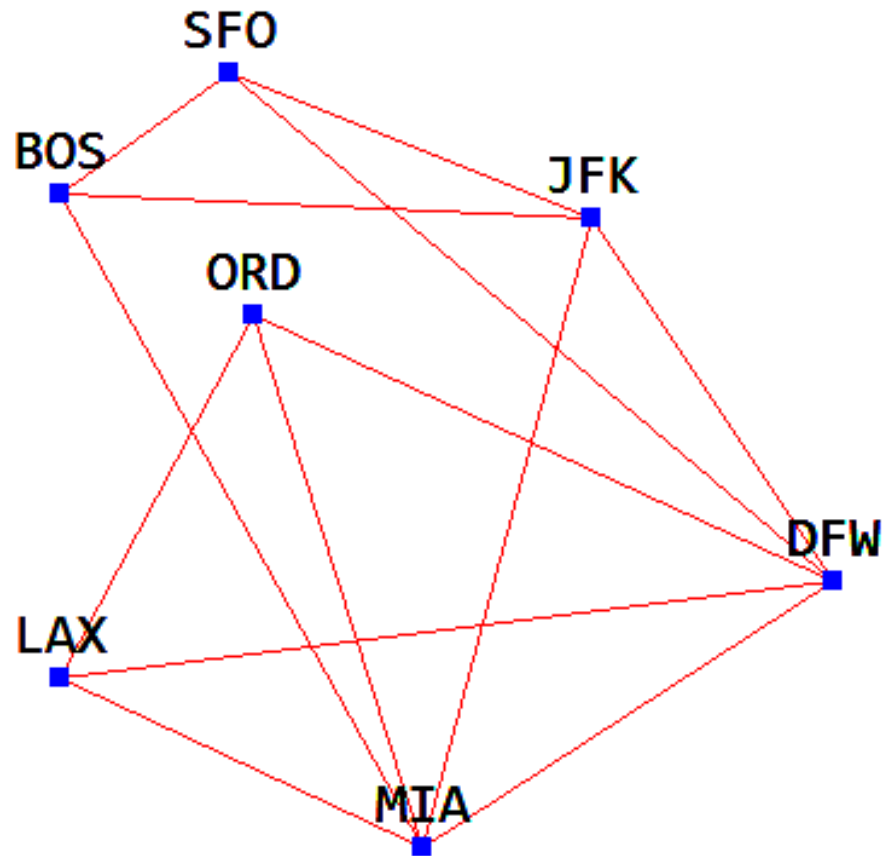
    print "Vertices:"
    for v in g.vertices():
        print v.element()

    print "Edges:"
    for e in g.edges():
        a,b = e.endpoints()
        print a.element(), b.element()
```

Graph ADT: Airport Map Example

```
loc = {  
    'BOS': (80,90),      # BASCO Airport  
    'SFO': (150,40),     # San Francisco International Airport  
    'JFK': (300,100),    # John F. Kennedy Airport, NY  
    'MIA': (230,360),    # Miami Airport, Florida  
    'DFW': (400,250),    # Dallas/Fort Worth International Airport  
    'ORD': (160,140),    # Chicago O'Hare International Airport  
    'LAX': (80,290),     # Los Angeles International Airport  
}  
  
E = ( # Airport connections  
    ('BOS','SFO'), ('BOS','JFK'), ('BOS','MIA'), ('JFK','BOS'),  
    ('JFK','DFW'), ('JFK','MIA'), ('JFK','SFO'), ('ORD','DFW'),  
    ('ORD','MIA'), ('LAX','ORD'), ('DFW','SFO'), ('DFW','ORD'),  
    ('DFW','LAX'), ('MIA','DFW'), ('MIA','LAX'),  
)
```

Graph ADT: Graphical View



Graph ADT: Code

```
def draw_airport_map():
    g = Graph(True) # directed graph !
    vert = dict()   # dictionary from label to vertex object
    for a in loc:
        vert[a] = g.insert_vertex(a)

    for a,b in E:
        g.insert_edge(vert[a], vert[b])

    for v in g.vertices():
        airport = v.element()
        p = Point(*loc[airport])
        p.draw()
        p.text(airport)

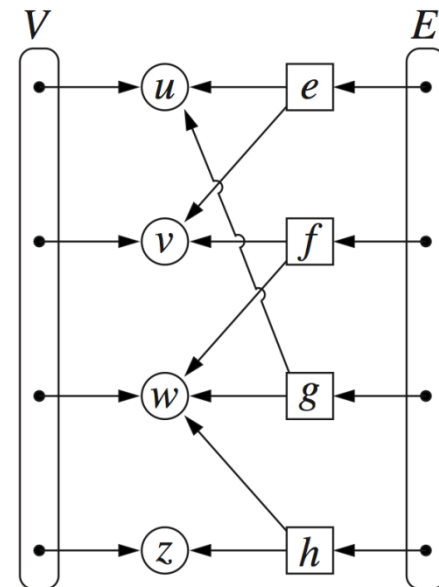
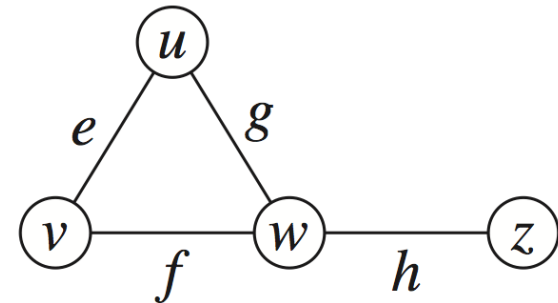
    for e in g.edges():
        a, b = e.endpoints()
        x1, y1 = loc[a.element()]
        x2, y2 = loc[b.element()]
        l = Line.from_coords(x1, y1, x2, y2)
        l.draw(fill="red", width=1, arrow="last", arrowshape=[10,14,4])
```

```
loc = {
    'BOS': (80,90),      # BASCO Airport
    'SFO': (150,40),    # San Francisco International Airport
    'JFK': (300,100),   # John F. Kennedy Airport, NY
    'MIA': (230,360),   # Miami Airport, Florida
    'DFW': (400,250),   # Dallas/Fort Worth International Airport
    'ORD': (160,140),   # Chicago O'Hare International Airport
    'LAX': (80,290),    # Los Angeles International Airport
}

E = ( # Airport connections
    ('BOS','SFO'), ('BOS','JFK'), ('BOS','MIA'), ('JFK','BOS'),
    ('JFK','DFW'), ('JFK','MIA'), ('JFK','SFO'), ('ORD','DFW'),
    ('ORD','MIA'), ('LAX','ORD'), ('DFW','SFO'), ('DFW','ORD'),
    ('DFW','LAX'), ('MIA','DFW'), ('MIA','LAX'),
)
```

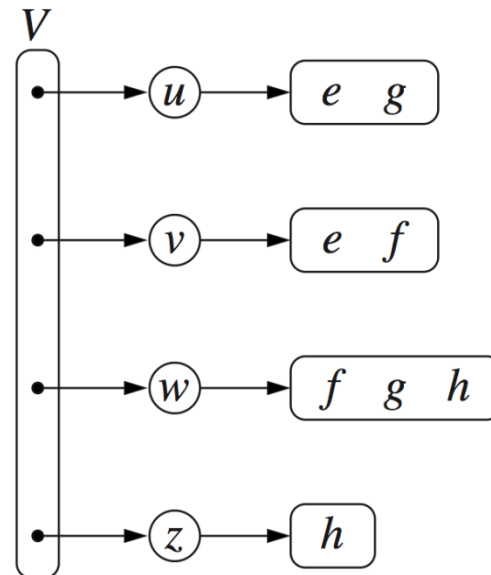
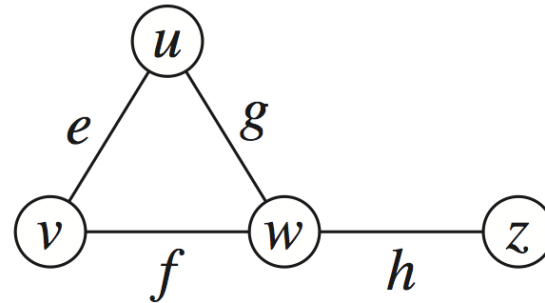
Edge List Structure

- Vertex object
 - element
 - reference to position in vertex sequence
- Edge object
 - element
 - origin vertex object
 - destination vertex object
 - reference to position in edge sequence
- Vertex sequence
 - sequence of vertex objects
- Edge sequence
 - sequence of edge objects



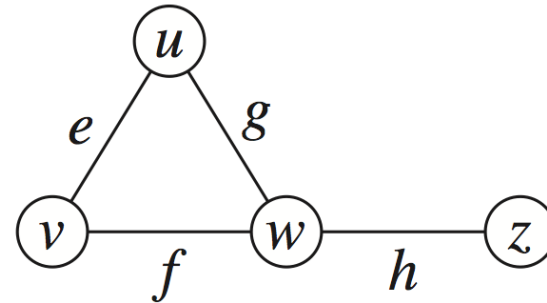
Adjacency List Structure

- Incidence sequence for each vertex
 - sequence of references to edge objects of incident edges
- Augmented edge objects
 - references to associated positions in incidence sequences of end vertices



Adjacency Matrix Structure

- Edge list structure
- Augmented vertex objects
 - Integer key (index) associated with vertex
- 2D-array adjacency array
 - Reference to edge object for adjacent vertices
 - Null for non adjacent vertices
- The “old fashioned” version just has 0 for no edge and 1 for edge



		0	1	2	3	
u	$\longrightarrow$	0		e	g	
v	$\longrightarrow$	1	e		f	
w	$\longrightarrow$	2	g	f		h
z	$\longrightarrow$	3			h	

Performance

▪ n vertices, m edges ▪ no parallel edges ▪ no self-loops	Edge List	Adjacency List	Adjacency Matrix
Space	$n + m$	$n + m$	n^2
incidentEdges (v)	m	$\deg(v)$	n
areAdjacent (v, w)	m	$\min(\deg(v), \deg(w))$	1
insertVertex (o)	1	1	n^2
insertEdge (v, w, o)	1	1	1
removeVertex (v)	m	$\deg(v)$	n^2
removeEdge (e)	1	1	1

Python Graph Implementation

- We use a variant of the *adjacency map* representation.
- For each vertex v , we use a Python dictionary to represent the secondary incidence map $I(v)$.
- The list V is replaced by a top-level dictionary D that maps each vertex v to its incidence map $I(v)$.
 - Note that we can iterate through all vertices by generating the set of keys for dictionary D .
- A vertex does not need to explicitly maintain a reference to its position in D , because it can be determined in $O(1)$ expected time.
- Running time bounds for the adjacency-list graph ADT operations, given above, become *expected* bounds.

Vertex Class

```
1  #----- nested Vertex class -----
2  class Vertex:
3      """Lightweight vertex structure for a graph."""
4      __slots__ = '_element'
5
6      def __init__(self, x):
7          """Do not call constructor directly. Use Graph's insert_vertex(x)."""
8          self._element = x
9
10     def element(self):
11         """Return element associated with this vertex."""
12         return self._element
13
14     def __hash__(self):                # will allow vertex to be a map/set key
15         return hash(id(self))
```

Edge Class

```
17 #----- nested Edge class -----
18 class Edge:
19     """ Lightweight edge structure for a graph. """
20     __slots__ = '_origin', '_destination', '_element'
21
22     def __init__(self, u, v, x):
23         """ Do not call constructor directly. Use Graph's insert_edge(u,v,x). """
24         self._origin = u
25         self._destination = v
26         self._element = x
27
28     def endpoints(self):
29         """ Return (u,v) tuple for vertices u and v. """
30         return (self._origin, self._destination)
31
32     def opposite(self, v):
33         """ Return the vertex that is opposite v on this edge. """
34         return self._destination if v is self._origin else self._origin
35
36     def element(self):
37         """ Return element associated with this edge. """
38         return self._element
39
40     def __hash__(self): # will allow edge to be a map/set key
41         return hash( (self._origin, self._destination) )
```

Graph, Part 1

```
1 class Graph:
2     """Representation of a simple graph using an adjacency map."""
3
4     def __init__(self, directed=False):
5         """Create an empty graph (undirected, by default).
6
7         Graph is directed if optional paramter is set to True.
8         """
9         self._outgoing = { }
10        # only create second map for directed graph; use alias for undirected
11        self._incoming = { } if directed else self._outgoing
12
13    def is_directed(self):
14        """Return True if this is a directed graph; False if undirected.
15
16        Property is based on the original declaration of the graph, not its contents.
17        """
18        return self._incoming is not self._outgoing # directed if maps are distinct
19
20    def vertex_count(self):
21        """Return the number of vertices in the graph."""
22        return len(self._outgoing)
23
24    def vertices(self):
25        """Return an iteration of all vertices of the graph."""
26        return self._outgoing.keys()
27
28    def edge_count(self):
29        """Return the number of edges in the graph."""
30        total = sum(len(self._outgoing[v]) for v in self._outgoing)
31        # for undirected graphs, make sure not to double-count edges
32        return total if self.is_directed( ) else total // 2
33
34    def edges(self):
35        """Return a set of all edges of the graph."""
36        result = set( ) # avoid double-reporting edges of undirected graph
37        for secondary_map in self._outgoing.values():
38            result.update(secondary_map.values()) # add edges to resulting set
39        return result
```

Graph, end

```
40 def get_edge(self, u, v):
41     """Return the edge from u to v, or None if not adjacent."""
42     return self._outgoing[u].get(v)          # returns None if v not adjacent
43
44 def degree(self, v, outgoing=True):
45     """Return number of (outgoing) edges incident to vertex v in the graph.
46
47     If graph is directed, optional parameter used to count incoming edges.
48     """
49     adj = self._outgoing if outgoing else self._incoming
50     return len(adj[v])
51
52 def incident_edges(self, v, outgoing=True):
53     """Return all (outgoing) edges incident to vertex v in the graph.
54
55     If graph is directed, optional parameter used to request incoming edges.
56     """
57     adj = self._outgoing if outgoing else self._incoming
58     for edge in adj[v].values():
59         yield edge
60
61 def insert_vertex(self, x=None):
62     """Insert and return a new Vertex with element x."""
63     v = self.Vertex(x)
64     self._outgoing[v] = { }
65     if self.is_directed():
66         self._incoming[v] = { }          # need distinct map for incoming edges
67     return v
68
69 def insert_edge(self, u, v, x=None):
70     """Insert and return a new Edge from u to v with auxiliary element x."""
71     e = self.Edge(u, v, x)
72     self._outgoing[u][v] = e
73     self._incoming[v][u] = e
```