



# Data Structures

## Graphs

Teacher : Wang Wei

1. Ellis Horowitz,etc., Fundamentals of Data Structures in C++
2. ,
3. ,
4. <http://inside.mines.edu/~dmehta/>

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## Graphs

- Definition
  - Consists of two sets **V** and **E**
  - Graph=( V, E )**
  - vertices **V = { u | u ∈ DataSet }** , a finite, **V(G) ≠ ∅**
  - edges **E = { (u, v) or <u,v> | u, v ∈ V }**

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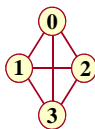
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## Undirected and Directed graphs

- **Undirected graph : graph**
  - no oriented edge
  - any edge is unordered
  - **(u, v) = (v, u)** , the same edge



- **Directed graph : digraph**
  - every edge has an orientation
  - any edge is ordered
  - **<u, v>**, **u : tail, v : head**
  - **<u,v> ≠ <v,u>** , two different edges



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### Restrictions of Graph

(1) may **not** have an **edge** from a vertex **back to itself**

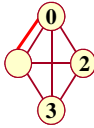
- self edges

-  $(v, v)$  or  $\langle v, v \rangle$  is not legal



(2) may **not** have **multiple occurrences** of the same edge

- if allowed, get a **multigraph**



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### Complete Graphs with $n$ vertex

• A graph

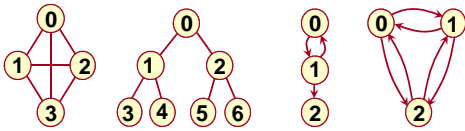
- each edge :  $(u, v), u \neq v$

- the maximum number of edges is =  $n(n-1)/2$

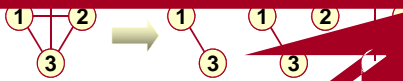
• A digraph

- each edge :  $\langle u, v \rangle, u \neq v$

- the maximum number of edges =  $n(n-1)$



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### Adjacent

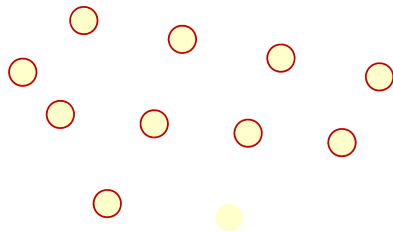
- if  $(u, v) \in E$   
 $u$  and  $v$  are adjacent  
edge  $(u, v)$  is incident on vertices  $u$  and  $v$
- if  $\langle u, v \rangle \in E$   
vertex  $u$  is adjacent to  $v$ , and  $v$  is adjacent from  $u$   
edge  $\langle u, v \rangle$  is incident to  $u$  and  $v$

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### Vertex Degree

Number of edges incident to vertex

degree(2) = 2, degree(5) = 3, degree(3) = 1



### Sum Of In- And Out-Degrees

– with  $n$  vertices and  $e$  edges

**Sum Of In-Degrees = Sum Of Out-Degrees =  $e$**

– each edge contributes **1**

- to the *in-degree* of some *vertex*
- to the *out-degree* of some *other vertex*

### Weighted Graphs : Network

- Network is a graph with weighted edges
  - Driving Distance/Time Map
    -

### Adjacency Matrix

- 0/1  $n \times n$  matrix  $A = (V, E)$
- $n = \text{numbers of vertices}$

Such as

$$A.\text{edge}[i][j] = \begin{cases} 1, & \text{iff } \langle i, j \rangle \in E \text{ or } (i, j) \in E \\ 0, & \text{otherwise} \end{cases}$$

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$A.\text{edge} = \begin{bmatrix} 0 & 1 & 0 & 1 \\ 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 \\ 1 & 0 & 1 & 0 \end{bmatrix}$

$d_i = \sum_{j=0}^{n-1} a[i][j]$

- an graph is symmetric
- a digraph may not be symmetric

$A.\text{edge} = \begin{bmatrix} 0 & 1 & 0 \\ 1 & 0 & 1 \\ 0 & 0 & 0 \end{bmatrix}$

$\text{out-}d_i = \sum_{j=0}^{n-1} a[i][j]$

$\text{in-}d_j = \sum_{i=0}^{n-1} a[i][j]$

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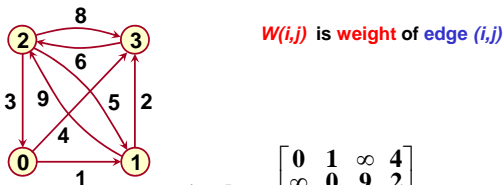
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### Adjacency Matrix of weighted diGraph

$$A.\text{edge}[i][j] = \begin{cases} W(i, j), & i \neq j \text{ and } \langle i, j \rangle \in E \text{ or } (i, j) \in E \\ \infty, & i \neq j \text{ and } \langle i, j \rangle \notin E \text{ or } (i, j) \notin E \\ 0, & i = j \end{cases}$$



$$A.\text{edge} = \begin{bmatrix} 0 & 1 & \infty & 4 \\ \infty & 0 & 9 & 2 \\ 3 & 5 & 0 & 8 \\ \infty & \infty & 6 & 0 \end{bmatrix}$$

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## Class definition using Adjacency Matrix

```
template <class T, class E>
class Graphmtx : public Graph<T, E>
{
    friend istream& operator >> (istream& in, Graphmtx<T, E>& G);
    //
    friend ostream& operator << (ostream& out, Graphmtx<T, E>& G);
    //

```

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```
private:
    T *VerticesList;           //
    E **Edge;                 //

    int getVertexPos (T vertex)
    {
        //      vertex
        for (int i = 0; i < numVertices; i++)
            if (VerticesList[i] == vertex) return i;
        return -1;
    }

```

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```
public:
    Graphmtx (int sz = DefaultVertices); //
    Graphmtx () //
    { delete [] VerticesList; delete [] Edge; }

    T getValue (int i) {
        //      i      , i      0
        return i >= 0 && i <= numVertices ? VerticesList[i] : NULL;
    }

    E getWeight (int v1, int v2) {
        //      (v1,v2)
        return v1 != -1 && v2 != -1 ? Edge[v1][v2] : 0;
    }

```

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```

int getFirstNeighbor (int v);
//      v
int getNextNeighbor (int v, int w);
//      v      w
bool insertVertex (const T vertex);
//      vertex
bool insertEdge (int v1, int v2, E cost);
//      (v1, v2),      cost
bool removeVertex (int v);
//      v
bool removeEdge (int v1, int v2);
//      (v1,v2)
};

```

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```

template <class T, class E>
Graphmtx<T, E>::Graphmtx (int sz) { //
maxVertices = sz;
numVertices = 0; numEdges = 0;
int i, j;

VerticesList = new T[maxVertices]; //

Edge = (int **) new int *[maxVertices];

for (i = 0; i < maxVertices; i++)
Edge[i] = new int[maxVertices]; //

for (i = 0; i < maxVertices; i++) //
for (j = 0; j < maxVertices; j++)
Edge[i][j] = (i == j) ? 0 : maxWeight;
}

```

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```

template <class T, class E>
int Graphmtx<T, E>::getFirstNeighbor (int v) {
//      v
//      ,      -1
if (v != -1)
{
for (int col = 0; col < numVertices; col++)
if (Edge[v][col] && Edge[v][col] < maxWeight)
return col;
}
return -1;
}

```

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```

template <class T, class E>
int Graphmtx<T, E>::getNextNeighbor (int v, int w) {
//      v              w
    if (v != -1 && w != -1) {
        for (int col = w+1; col < numVertices; col++)
            if (Edge[v][col] && Edge[v][col] < maxWeight)
                return col;
    }
    return -1;
}

```

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### Adjacency List

- if explicitly represent only edges
  - when  $e \ll n^2$
- **n rows** of Adjacency Matrix are represented as **n chains**
  - an array of **n** adjacency lists
- Each adjacency list of each vertex is a chain
  - chain **i** is a linear list of vertices adjacent from vertex **i**

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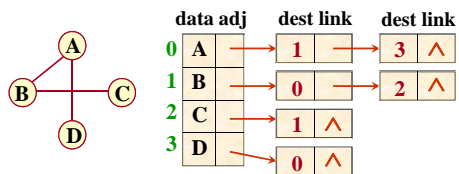
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### Adjacency Lists of Graph



- node structure of vertex : **data** and **adj**
- node structure of chain : **dest** and **link**
- Degree of vertex **i** = number of nodes in chain **i**
- edge  $(v_i, v_j)$  : vertex **i** and vertex **j**

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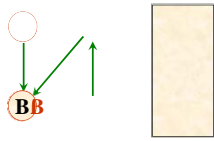
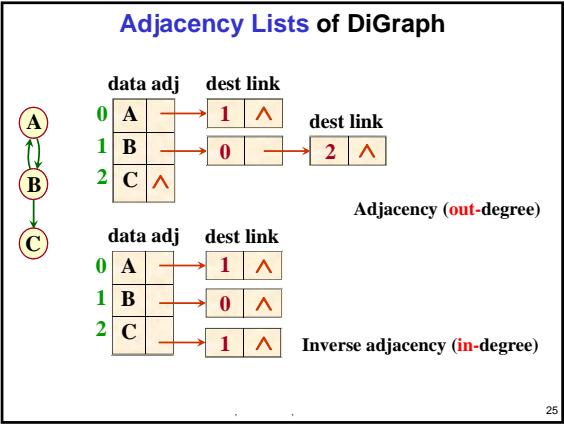
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```

template <class T, class E>
struct Vertex { //
    T data; //
    Edge<T, E> *adj; //
};

template <class T, class E>
class Graphlnk : public Graph<T, E>
{ //
friend istream& operator >> (istream& in, Graphlnk<T, E>& G);
//
friend ostream& operator << (ostream& out, Graphlnk<T, E>& G);
//
}

```

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```

private:
Vertex<T, E> *NodeTable;
// ( )

int getVertexPos (const T vertex)
{
// vertex
for (int i = 0; i < numVertices; i++)
if (NodeTable[i].data == vertex) return i;
return -1;
}

```

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```

public:
Graphlnk (int sz = DefaultVertices); //
~Graphlnk(); //

T getValue (int i) { // i
return (i >= 0 && i < NumVertices) ? NodeTable[i].data : 0;
}
E getWeight (int v1, int v2); // (v1,v2)

bool insertVertex (const T& vertex);
bool removeVertex (int v);
bool insertEdge (int v1, int v2, E cost);
bool removeEdge (int v1, int v2);
int getFirstNeighbor (int v);
int getNextNeighbor (int v, int w);
};

```

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```

template <class T, class E>
Graphlnk<T, E>::Graphlnk (int sz)
{
//
  maxVertices = sz;
  numVertices = 0; numEdges = 0;
  NodeTable = new Vertex<T, E>[maxVertices];
  //

  if (NodeTable == NULL)
    { cerr << " " << endl; exit(1); }

  for (int i = 0; i < maxVertices; i++)
    NodeTable[i].adj = NULL;
}

```

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```

template <class T, class E>
Graphlnk<T, E>:: Graphlnk()
{
//
  for (int i = 0; i < numVertices; i++)
    {
      Edge<T, E> *p = NodeTable[i].adj;

      while (p != NULL)
        {
          NodeTable[i].adj = p->link;
          delete p; p = NodeTable[i].adj;
        }
    }
  delete [ ]NodeTable; //
};

```

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```

template <class T, class E>
int Graphlnk<T, E>::getFirstNeighbor (int v)
{
//
//      v      -1
//
  if (v != -1)
    {
      //      v
      Edge<T, E> *p = NodeTable[v].adj;
      if (p != NULL) return p->dest;
    }
  return -1; //
}

```

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```

template <class T, class E>
int Graphlink<T, E>::getNextNeighbor (int v, int w)
{
//      v      w      -1
//
if (v != -1)
{
Edge<T, E> *p = NodeTable[v].adj;

while (p != NULL && p->dest != w)
p = p->link;

if (p != NULL && p->link != NULL)
return p->link->dest; //
}
return -1; //
}

```

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**Adjacency Multilists** for undirected graph

- node** structure of **edge**

mark	vertex1	vertex2	path1	path2
------	---------	---------	-------	-------

  - mark** : to indicate whether or not the edge has been examined
  - vertex1, vertex2** : two vertices of the edge
  - path1** : to point the adjacency edge of **vertex1**
  - path2** : to point the adjacency vertex of **vertex2**
  - cost** : when **G** is a *network*
- node** structure of **vertex**
  - data** and **firstout**

data	firstout
------	----------
  - firstout** : a pointer to point the adjacency edge of the vertex

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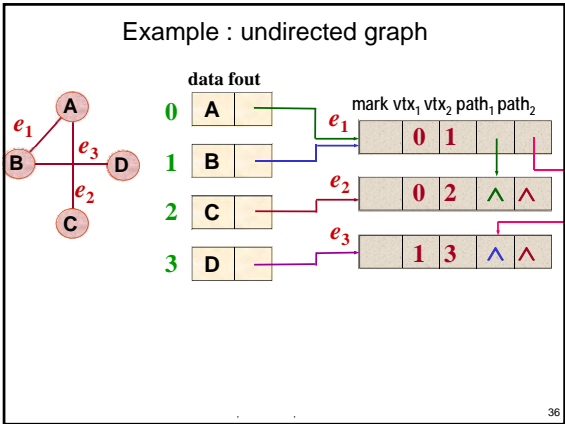
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## Adjacency Multilists for directed graph

- **node** structure of **edge**

mark	vertex1	vertex2	path1	path2
------	---------	---------	-------	-------

- **node** structure of **vertex**

- data  
and

data	firstin	firstout
------	---------	----------

- **firstout** : to point the adjacency edge (**out-degree**)
- **firstin** : to point the adjacency edge (**in-degree**)

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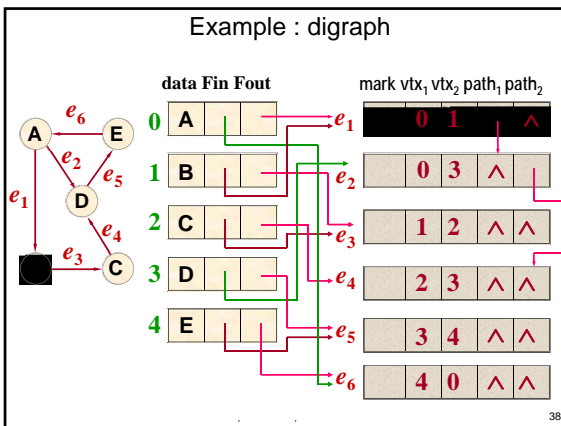
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### Example : digraph



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## Path

- a **path**

- from  $u$  to  $v$
- a sequence of vertices  $u, i_1, i_2, \dots, i_k, v$
- $G$  is undirected

$(u, i_1), (i_1, i_2), \dots, (i_k, v)$  are edges in  $E$

- $G'$  is directed

$\langle u, i_1 \rangle, \langle i_1, i_2 \rangle, \dots, \langle i_k, v \rangle$  are edges in  $E'$

- **path length**

- the number of edges on the path
- or
- the sum of the weights of the edges on the path

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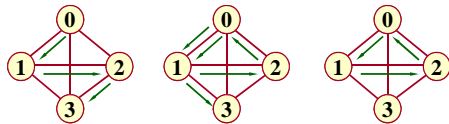
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- Since a graph may have more than one path between two vertices
- May be interested in finding a path with a particular property
- For example
  - find a path with **minimum length**
  - find a path with **maximum length**

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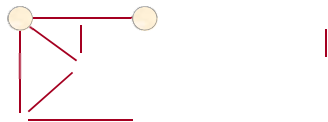
70F8B83SfB83SfEBW (•P2W!Dh2&A0eu#21

- **simple path**
  - all vertices except possibly the first and last are distinct
- **cycle**
  - the first and last vertices are the same
- for **directed** graph, **paths** and **cycles** are **directed**



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### DFS (Depth First Search)



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### DFS

- Begin by visiting the start vertex  $v$
- Next an unvisited vertex  $w_1$  adjacent to  $v$  is selected
- From  $w_1$  to visit an unvisited vertex  $w_2$  adjacent to  $w_1$
- From  $w_2$  to  $w_3$ , and so on
- When a vertex  $u$  is reached
  - all its adjacent vertices have been visited
- Back up to the last vertex visited
  - that has an unvisited vertex  $w$
- Search terminates
  - When no unvisited vertex can be reached from any of the visited vertices

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### DFS Algorithm

```
template<class T, class E>
void DFS (Graph<T, E>& G, const T& v)
{
    //      v      G
    int i, loc, n = G.NumberOfVertices(); //
    bool *visited = new bool[n]; //
    for (i = 0; i < n; i++) visited [i] = false; //
                                                //      visited
    loc = G.getVertexPos(v);
    DFS (G, loc, visited); //      0
    delete [] visited; //      visited
}
```

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```
template<class T, class E>
void DFS (Graph<T, E>& G, int v, bool visited[])
{
    cout << G.getValue(v) << ' '; //      v
    visited[v] = true; //
    int w = G.getFirstNeighbor (v); //

    while (w != -1)
    { //      w
        if ( !visited[w] ) DFS(G, w, visited);
        //      w ,
        w = G.getNextNeighbor (v, w); //      w
    }
}
```

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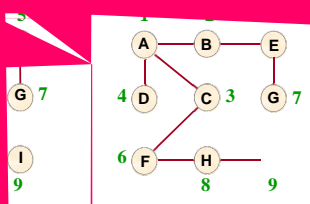
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### BFS Algorithm

```
template <class T, class E>
void BFS (Graph<T, E>& G, const T& v)
{
    int i, w, n = G.NumberOfVertices(); //
    bool *visited = new bool[n];
    for (i = 0; i < n; i++) visited[i] = false;

    int loc = G.getVertexPos (v); //
    cout << G.getValue (loc) << ' '; // v
    visited[loc] = true; //
    Queue<int> Q; Q.Enqueue (loc);
    //
}
```

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```
while (!Q.IsEmpty() ) { //
    Q.DeQueue (loc);
    w = G.getFirstNeighbor (loc); //
    while (w != -1) { // w
        if (!visited[w]) { //
            cout << G.getValue (w) << ' '; //
            visited[w] = true;
            Q.Enqueue (w); // w
        }
        w = G.getNextNeighbor (loc, w); // loc
    }
} //
delete [] visited;
}
```

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### Analysis of BFS

- Using a queue
  - each visited vertex enters it exactly **once**
- Adjacency lists
  - $T(n)$  is  $O(e)$
- Adjacency matrix
  - Loop time:  $T(n)$  is  $O(n)$
  - Total time:  $T(n)$  is  $O(n^2)$

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### Connectedness

- **u and v are connected**
    - iff : a path in  $G$  from  $u$  to  $v$  (also from  $v$  to  $u$ )
  - **an undirected  $G$  is connected**
    - iff : for every pair of distinct  $u$  and  $v$  in  $V$ , there is a path from  $u$  to  $v$
- So
- a path between every pair of vertices

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- **A undirected  $G$  is connected**
  - can **not add vertices** and **edges** from original graph and retain connectedness
- **A connected graph has exactly 1 component**
  - a maximal subgraph
- **A directed  $G'$  is strongly connected**
  - every pair of distinct  $u$  and  $v$
  - a directed path from  $u$  to  $v$  and also from  $v$  to  $u$
- **A strongly connected component**
  - a maximal subgraph

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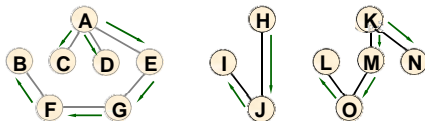
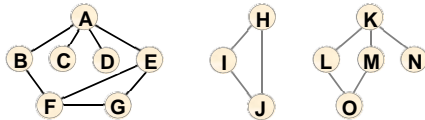
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Connected components of connected  $G$



Connected components of **unconnected**  $G$

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## Determining Connected Components

```
template <class T, class E>
void Components (Graph<T, E>& G)
{
    // DFS
    int i, n = G.NumberOfVertices(); //
    bool *visited = new bool[n]; //
    for (i = 0; i < n; i++) visited[i] = false;
    for (i = 0; i < n; i++) //
        if (!visited[i]) { //
            DFS (G, i, visited); //
            OutputNewComponent(); //
        }
    delete [] visited;
}
```

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## Analysis of Components Algorithm

- Adjacency lists
  - for loops time:  $T(n)$  is  $O(n)$
  - DFS total time:  $T(n)$  is  $O(n+e)$
- Adjacency matrix
  - Total time:  $T(n)$  is  $O(n^2)$

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## Biconnected Component

- A vertex  $v$  is an **articulation point**(关节点)
  - in undirected  $G$
  - iff  $v$  be deleted, together with the deletion of all edges incident to  $v$  the graph has at least two connected components
- **Biconnected graph** (双/重连通图)
  - is a connected graph that has no articulation points
  - 任何一对顶点之间至少存在有两条路径, 在删去某个顶点及与该顶点相关的边时, 不破坏图的连通性
- **Biconnected component** (双/重连通分)
  - is a maximal biconnected subgraph
  - $G$  contains no other subgraph
  - No edge can be in two or more biconnected components

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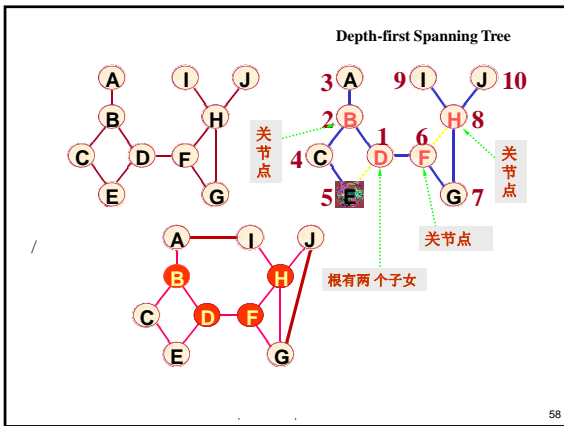
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- No edge can be in two or more biconnected components
  - Undirected graph  $G$ , the biconnected components can be found by using any depth-first spanning tree
  - root of the depth-first spanning tree is an articulation point
    - iff it has at least two children
  - other vertex  $u$  is an articulation point
    - iff it has at least one children, such as  $w$ 
      - it is not possible to search an ancestor of  $u$  using a path composed solely of  $w$ , descendants of  $w$ , and a single back edge
  - Back edge
  - Cross edge
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## Data Structures

### Spanning Trees

Teacher : Wang Wei

1. Ellis Horowitz, etc., Fundamentals of Data Structures in C++
2. .
3. .
4. <http://inside.mines.edu/~dmehra/>

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## spanning tree

- **Minimum-Cost Spanning Tree**

- weighted connected undirected graph
- cost of spanning tree is **sum** of edge costs
- find spanning tree that has **minimum cost**

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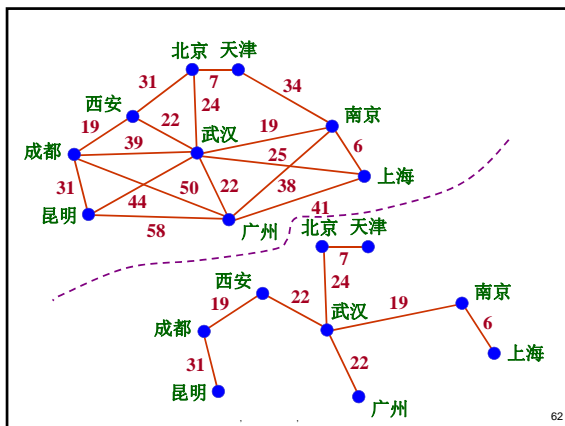
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## Constraints

- **To construct minimum-cost spanning tree**

- must **use only** edges **within** the graph
- must **use exactly**  $n-1$  edges and  $n$  vertices
- may **not** use edges that **produce a cycle**
- the cost is **least**

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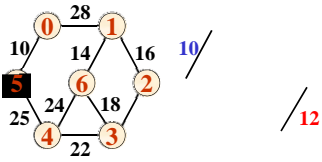
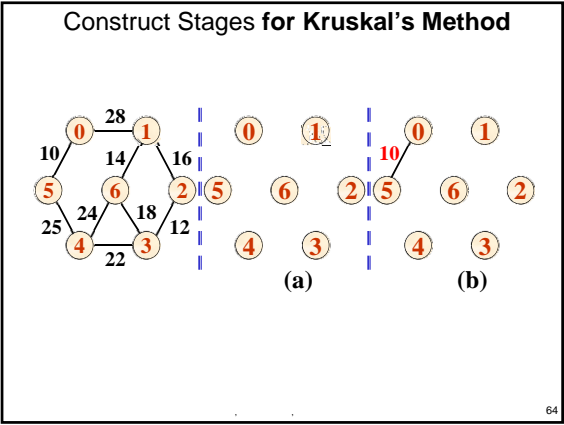
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- using **Min-Heap** to store edges

vertrx1	vertex2	wei ght
u	v	cost

- using **UFS** to determine if **v** and **w** is or not already connected by the earlier selection of edges

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```

const float maxValue = FLOAT_MAX
//
//
template <class T, class E>
struct MSTEdgeNode
{
    int tail, head; //
    E cost; //
    MSTEdgeNode() : tail(-1), head(-1), cost(0) { } //
};

```

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```

//MST
template <class T, class E>
class MinSpanTree
{
protected:
    MSTEdgeNode<T, E> *edgevalue; //
    int maxSize, n; //
public:
    MinSpanTree (int sz = DefaultSize-1) : MaxSize (sz), n (0)
    {
        edgevalue = new MSTEdgeNode<T, E>[sz];
    }
    int Insert (MSTEdgeNode& item);
};

```

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```

#include "heap.h"
#include "UFSets.h"
template <class T, class E>
void Kruskal (Graph<T, E>& G,
             MinSpanTree<T, E>& MST)
{
    MSTEdgeNode<T, E> ed;           //
    int u, v, count;
    int n = G.NumberOfVertices();   //
    int m = G.NumberOfEdges();      //
    MinHeap <MSTEdgeNode<T, E>> H(m); //
    UFSets F(n);                   //

```

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```

for (u = 0; u < n; u++)
    for (v = u+1; v < n; v++)
        if (G.getWeight(u,v) != max Value)
        {
            ed.tail = u; ed.head = v;
            ed.cost = G.getWeight (u, v);
            H.Insert(ed);
        }

```

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```

count = 1;           //
// , n-1
while (count < n)
{ H.Remove(ed);     //
  u = F.Find(ed.tail); v = F.Find(ed.head);
  // u v
  if (u != v)
  {
      F.Union(u, v); //
      MST.Insert(ed); // MST
      count++;
  }
}
}

```

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```

#include "heap.h"
template <class T, class E>
void Prim (Graph<T, E>& G, const T u0,
          MinSpanTree<T, E>& MST)
{
    MSTEdgeNode<T, E> ed;           //
    int i, u, v, count;
    int n = G.NumberOfVertices();   //
    int m = G.NumberOfEdges();      //
    int u = G.getVertexPos(u0);     //
    MinHeap <MSTEdgeNode<T, E>> H(m); //
    bool Vmst = new bool[n];        //

```

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```

    MinHeap <MSTEdgeNode<T, E>> H(m); //

    bool Vmst = new bool[n];          //
    for (i = 0; i < n; i++)
        Vmst[i] = false;

    Vmst[u] = true;                    //u

```

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```

    count = 1;
    do { //
        v = G.getFirstNeighbor(u);

        while (v != -1)
        { // u
            if (!Vmst[v]) //v mst
            {
                ed.tail = u; ed.head = v;
                ed.cost = G.getWeight(u, v);
                H.Insert(ed); // (u,v)
            } // u mst , v mst
            v = G.getNextNeighbor(u, v);
        }
    }

```

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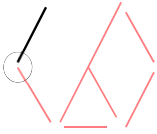
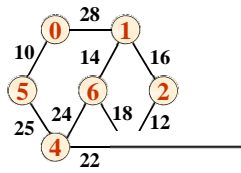
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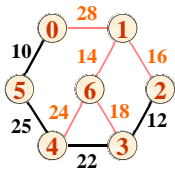
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```
while (!H.IsEmpty() && count < n)
{
  H.Remove(ed); //
  if (!Vmst[ed.head])
  {
    MST.Insert(ed); //
    u = ed.head; Vmst[u] = true; //u
    count++;
    break;
  }
} while (count < n);
// end of prim
```

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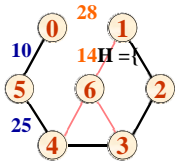


$H = \{(3,2,12), (3,6,18), (4,6,24), (0,1,28)\}$

$ed = (3, 2, 12)$

$V_{mst} = \{t, f, f, t, t, t, f\}$

$V_{mst} = \{t, f, t, t, t, t, f\}$



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