

Chapter 11 Graph

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Graph Applications

- Modeling computer networks
- Representing maps
- Finding paths from start to goal (AI)
- Ordering tasks
- Modeling relationships (families, organizations)

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Content

- 11.1 terminology and representations
- 11.2 Graph implementations
- 11.3 Graph Traversals
- 11.4 Shortest-Paths Problem
- 11.5 Minimum-Cost Spanning Trees

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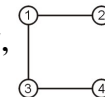
11.1 Terminology and Representations

Terminology (1)

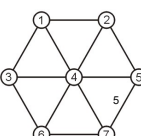
A **graph** $G = (V, E)$ consists of **a set of vertices (顶点)** V , and **a set of edges (边)** E , such that **each edge in E** is a connection between **a pair of vertices in V** .

The **number** of vertices is written $|V|$, and the **number** edges is written $|E|$.

Example 1: given $G_1 = (V, E)$, $V = \{1, 2, 3, 4\}$, $E = \{\{1, 2\}, \{1, 3\}, \{3, 4\}\}$ $|V| = 4$, $|E| = 3$



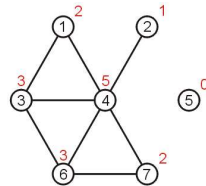
Example 2: given $G_2 = (V, E)$, $V = \{1, 2, 3, 4, 5, 6, 7\}$, $E = \{\{1, 2\}, \{1, 3\}, \{1, 4\}, \{2, 4\}, \{2, 5\}, \{3, 4\}, \{3, 6\}, \{4, 5\}, \{4, 6\}, \{4, 7\}, \{5, 7\}, \{6, 7\}\}$, $|V| = 7$, $|E| = 12$



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Terminology (2)

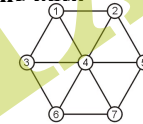
- **Adjacent(邻接):** two vertices are said to be **adjacent** if there exists an edge between the two vertices
 - for example: if there has a edge $\{a, b\}$ in E , then a is adjacent to b , and b is adjacent to a
 - We will assume that a vertex is **not adjacent to itself**, that is, each edge in E is made up of **two distinct vertices**
- **Degree(度):** the degree of a vertex is the **number** of its adjacent vertices



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Terminology (3)

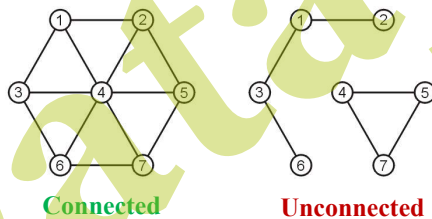
- **Path:** an ordered sequence of vertices $(v_0, v_1, v_2, \dots, v_k)$ is called a path, where $\{v_{i-1}, v_i\}$ is an edge in E for $i = 1, \dots, k$
- **Length of path:** the number of edges in the path
 - $(1, 2, 4, 3, 6, 7, 5): 6$
 - $(1, 4, 2, 4, 3, 4, 5, 4, 6, 4, 7): 10$
 - $(2, 4, 1, 2, 4, 2, 1): 6$
 - $(2, 4, 1, 2): 3$
 - $(1): 0$
- **Simple path:** vertices no repetitions except perhaps the first and last vertices
- **Cycle(环):** a simple path that the first and last vertices are equal



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Terminology (4)

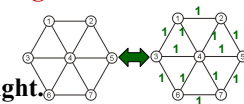
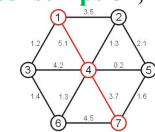
- **Connectedness(连通)**
 - two vertices v_i, v_j are said to be **connected** if there exists a path from v_i to v_j
 - A graph is **connected** if **any two** vertices are **connected**.



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Terminology (5)---Weighted Graphs

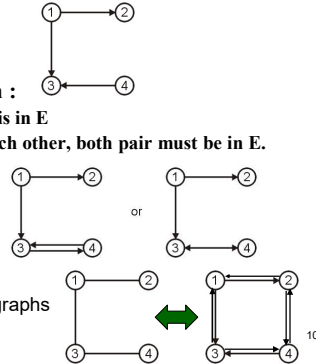
- A **weight(权值)** may be associated with each edge in a graph, which could represent **distance, energy consumption, cost**, etc.
- **weighted graph:** each edge has a weight.
 - The **length of a path** within weighted graph is the sum of the weight in the path. $(1, 4, 7), 8.8$
- There may be **multiple paths** between two vertices, each with a different weighted length
 - $(1, 4, 5, 7), 6.9$
- **Shortest path:** the path with the **shortest length** between two vertices.
 - $(1, 3, 6, 4, 5, 7), 5.7$
- **unweighted graph:** edge no associated weight.
 - can be regarded to be a weighted graph with all edges have weight 1



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Terminology (6)----Directed Graphs/有向图

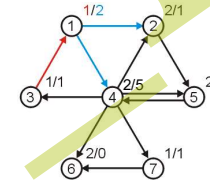
- The edges on a graph may be associated with a **direction**
 - all edges are ordered pairs (v_i, v_j) , where this does denote a connection **from** v_i to v_j , does not a connection **from** v_j to v_i
- Such a graph is termed a **directed graph**
 - For example,
 $V = \{1, 2, 3, 4\}$,
 $E = \{(1, 2), (1, 3), (4, 3)\}$
- Adjacent(邻接)** in a directed graph :
 - A vertex v_i is adjacent to v_j if (v_i, v_j) is in E
 - For two vertices to be adjacent to each other, both pair must be in E .
 - For example
 $V = \{1, 2, 3, 4\}$,
 $E = \{(1, 2), (1, 3), (3, 4), (4, 3)\}$
- undirected graphs**
 - can be considered to be directed graphs with edges in both directions



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Terminology (7)----Directed Graphs

- for a vertices in a Directed Graphs
 - out-degree**: is the number of vertices which are adjacent to the given vertex number of arrows go out
 - in-degree**: is the number of vertices which this vertex is adjacent to, number of arrows coming in
- For example, the **in/out** degrees of each of the vertices in this graph are listed next to the vertex

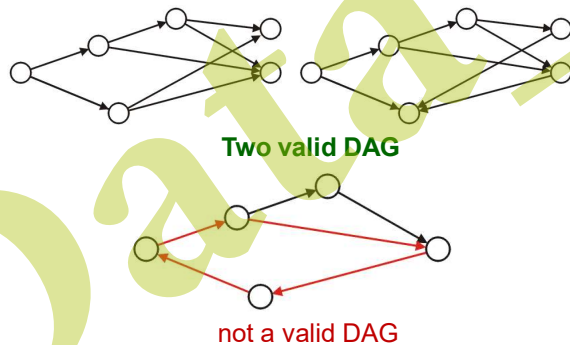


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Terminology (8)----Directed Acyclic Graphs

Directed Acyclic Graph(有向无环图DAG): a directed graph which has no cycles



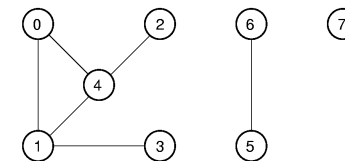
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Terminology (9)---- Connected Components

Subgraph: $G_s = (V_s, E_s)$, if $V_s \subseteq V$, $E_s \subseteq E$, we say G_s is a subgraph of $G = (V, E)$

Connected components(连通分量): the **maximally connected subgraphs** of an **undirected** graph.



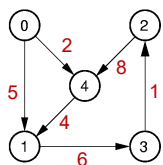
包含3个连通分量的图

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Graph Representation (1)

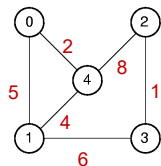
---- Adjacency Matrix/邻接矩阵



	0	1	2	3	4
0	0	5	0	0	8
1	0	0	0	6	0
2	0	0	0	0	4
3	0	0	1	0	0
4	0	4	0	0	0

space cost:
 $O(|V|^2)$

请思考：若graph用邻接矩阵描述，如何获取各顶点的出/入度呢？



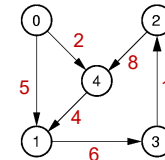
	0	1	2	3	4
0	0	5	0	0	8
1	5	0	0	6	0
2	0	0	0	1	4
3	0	6	1	0	0
4	8	0	4	0	0

非加权图的邻接矩阵呢？

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Graph Representation

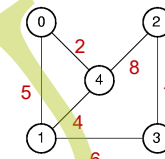
----Adjacency List/邻接链表



	0	1	2	3	4
0		5	2		8
1	5			6	
2	2			1	
3		6	1		
4	8				

space cost:
 $O(|V|+|E|)$
 $= O(|V|)$

再思考：若graph用邻接链表描述，如何获取各顶点的出/入度呢？



	0	1	2	3	4
0		5	2		8
1	5			6	
2	2			1	
3		6	1		
4	8				

非加权图的邻接链表呢？

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11.2 Graph implementations

- Graph ADT Class
- Adjacency Matrix implementation
- Adjacency List implementation

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Graph ADT

- Data: 顶点集
- Relation: 边集
- Basic Operation:
 - 赋值类: `setEdge(i,j,w)`
 - 获得信息类: `n()`, `e()`, `first(i)`, `next(i,j)`, `weight(i,j)`
 - 其他: `delEdge(i,j)`

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Graph ADT Class

class Graph { // Graph abstract class

public:

virtual int n()=0; // get number of vertices

virtual int e()=0; // get number of edges

virtual int first(int v)=0; // Return index of first neighbor of vth vertex

virtual int next(int v, int w)=0; // Return index of next neighbor of vth vertex

virtual void setEdge(int v, int w, int)=0; // Set new edge between vth and wth vertices

virtual void delEdge(int v, int w)=0; // Delete edge connecting vth and wth vertex

virtual int weight(int v, int w)=0; // return weight of edge connecting vth and wth vertices

virtual int getMark(int v)=0; //Get the mark value of the vth vertex

void setMark(int v, int)=0; //Set the mark value of the vth vertex

};

图的基本操作

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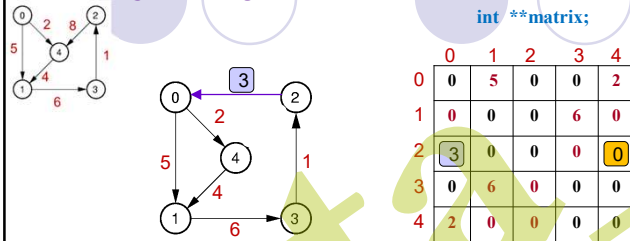
Graph Basic Operation

给出对右图做下列操作后i的值及图的变化（若有的话）

```
i = n();      5
i = e();      6
i = first(0); 1
i = next(0, 1); 4
i = next(1, 3); 5
setEdge(2,0,3);
delEdge(2,4);
i = weight(4, 2); 0
```

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Adjacency Matrix implementation(1)



```
i = n();      5
i = e();      6
i = first(0); 1
i = next(0, 1); 4
i = next(1, 3); 5
setEdge(2,0,3);
delEdge(2,4);
i = weight(4, 2); 0
```

① 1个2D数组描述图的邻接矩阵

② 1个整形变量numV保存顶点个数

③ 1个整形变量numE保存边的条数

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Adjacency Matrix implementation(2)

Class GraphM: public Graph { //implement adjacency matrix
int numVertex, numEdge; // number of vertices and edges
int **matrix;

int *mark; //pointer to a mark array

public:

GraphM(int n){

int i,j;

numVertex = n;

numEdge = 0;

mark = new int[numVertex];

for (i=0;i<n;i++) mark[i]=0;

matrix = (int **) new int * [numVertex];

for(i=0;i<n;i++) matrix[i]= new int[numVertex];

for(i=0;i<n;i++)

for(j=0;j<n;j++) matrix[i][j]= 0;

}

int **matrix;

0	0	0	0	0
0	0	0	0	0
0	0	0	0	0
0	0	0	0	0
0	0	0	0	0

int *mark;

0	0	0	0	0
---	---	---	---	---

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Adjacency Matrix implementation(3)

```

~GraphM () {
    delete [] mark;
    for(i=0; i<n; i++) delete [] matrix[i];
    delete [] matrix;
}
int n() { return numVertex; }
int e() { return numEdge; }
//int setN(int n) { numVertex = n; }
int first(int v) {
    int i;
    for(i=0; (i < numVertex) && (matrix(v,i) == 0); i++);
    return i;
}
int next(int v, int w) {
    int i;
    for(i=w+1; (i < numVertex) && (matrix(v,i) == 0); i++);
    return i;
}

```

思考：若没找到，返回值为？

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Adjacency Matrix implementation(4)

```

void setEdge(int v, int w, int wgt) {
    Assert(wgt > 0, "Illegal weight value");
    if (matrix[v][w] == 0) numEdge++;
    matrix[v][w] = wgt;
}

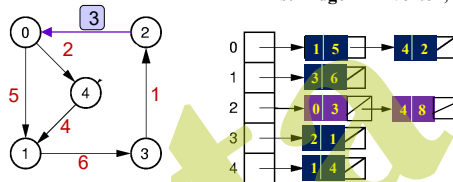
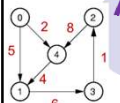
void delEdge(int v, int w) {
    if (matrix[v][w] != 0) { numEdge--; matrix[v][w] = 0; }
}

int weight(int v, int w) { return matrix[v][w]; }
int getMark(int v) { return mark[v]; }
void setMark(int v, int val) { mark[v] = val; }
};

```

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Adjacency List implementation(1)



```

Class Edge {
Public:
    int vertexIndex;
    int weight;
    .....
}

```

- ① 1个数组（元素为链表）描述图的邻接链表
- ② 1个整型变量numV保存顶点个数
- ③ 1个整型变量numE保存边的条数

```

i = first(0);
i = next(0, 1);
i = next(1, 3);
setEdge(2,0,3);
delEdge(2,4);
i = weight(4, 2);

```

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Adjacency List implementation(2)

```

Class Edge {
Public:
    int vertexIndex;
    int weight;
    Edge() { vertexIndex = -1; weight = -1; }
    Edge(int v, int w) { vertexIndex = v; weight = w; }
    Edge operator = (Edge e1) {
        vertexIndex = e1.vertexIndex;
        weight = e1.weight;
        return *this;
    }
};

Class GraphL: public Graph {
private:
    int numVertex, numEdge; // number of vertices and edges
    LList<Edge> ** vertex; // linked list header;
    int *mark; // pointer to a mark array
}

```

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Adjacency List implementation(3)

```
public:
    GraphL(int n){
        int i, j;
        numVertex=n; numEdge=0;
        mark = new int[numVertex]; for (i=0;i<n;i++) mark[i]=0;
        vertex = (LList<Edge>**) new LList<Edge> *[numVertex];
        for(i=0;i<n;i++) vertex[i]= new LList<Edge> [numVertex];
    }

    ~GraphL(){
        delete [] mark;
        for(i=0;i<n;i++) vertex[i]->clear;
        delete [] vertex;
    }
```

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Adjacency List implementation(4)

```
int n() { return numVertex; }
int e() { return numEdge; }
// int setN(int n) { numVertex = n; }
int first(int v) { //若没有, 返回numVertex
    if (vertex[v] -> length() == 0) return numVertex;
    vertex[v]->moveToStart();
    return (vertex[v]->getValue()).vertexIndex;
}

int weight(int v, int w) { //若v,w之间没有弧, 返回0
    Edge curr; int l=vertex[v] -> length();
    curr=vertex[v]->getValue();
    if (curr.vertexIndex != w)
        for (vertex[v]->moveToStart(); vertex[v]->currPos() < l; vertex[v]->next())
            { curr=vertex[v]->getValue(); if (curr.vertexIndex >= w) break; }
    if (curr.vertexIndex == w) return curr.weight;
    else return 0; }
```

在线性表 vertex[v]
中寻找合适的结点

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Adjacency List implementation(5)

```
int next(int v, int w) { //若没有, 返回numVertex
    Edge curr = vertex[v]->getValue();
    int l=vertex[v] -> length();
    if (curr.vertexIndex != w)
    {
        vertex[v]->moveToStart();
        for (; vertex[v]->currPos() < l; vertex[v]->next())
        {
            curr=vertex[v]->getValue();
            if (curr.vertexIndex >= w) break; }
    }
    if (curr.vertexIndex == w)
    { vertex[v].next(); return (vertex[v]->getValue()).vertexIndex; }
    else return numVertex;
}
```

在线性表 vertex[v]
中寻找合适的结点

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Adjacency List implementation(6)

```
void setEdge(int v, int w, int wgt) {
    Assert(wgt > 0, "Illegal weight value");
    int l=vertex[v] -> length();
    Edge it(w,wgt);
    Edge curr=vertex[v]->getValue();
    if (curr.vertexIndex != w) {
        vertex[v]->moveToStart();
        for (; vertex[v]->currPos() < l; vertex[v]->next())
            { curr=vertex[v]->getValue();
              if (curr.vertexIndex >= w) break; } }
    if (curr.vertexIndex == w) vertex[v]->remove(curr);
    else numEdge++;
    vertex[v]->insert(it);
}
```

在线性表 vertex[v]
中寻找合适的结点

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Adjacency List implementation(7)

```
void delEdge(int v, int w) {
    Edge curr;
    curr=vertex[v]->getValue();
    if (curr.vertexIndex != w) {
        vertex[v]->moveToStart();
        for (; vertex[v]->currPos() < 1; vertex[v]->next())
            { curr= vertex[v]->getValue(); if (curr.vertexIndex>=w) break; }
    }
    if (curr.vertexIndex == w) { vertex[v]->remove(); numEdge--; }
}

int getMark(int v){ return mark[v]; }
void setMark(int v, int val){ mark[v] = val; }
};
```

在线性表 vertex[v] 中寻找合适的结点

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11.3 Graph Traversals

11.3.1 Graph Traversal

11.3.2 Depth First Search

11.3.3 Breadth First Search

11.3.4 Topological Sort

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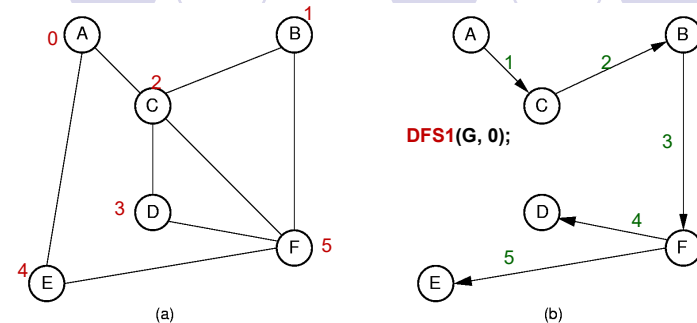
11.3.1 Graph Traversal

- Some applications require visiting every vertex in the graph exactly once. (无条件)
 - Depth First Search: DFS
 - Breadth-First Search: BFS
- The application may require that vertices be visited in some special order based on graph topology.(有条件)
 - Topological Sort
- Application Examples:
 - Connected components analysis
 - Shortest paths problems
 - Artificial Intelligence Search

To insure visiting all vertices **once and only exactly once**

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11.3.2 Depth First Search of connected graph (1)



Visit order: A C B F D E

上述DFS(root-Cs)类似与树的前根遍历

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Depth First Search of **connected graph(2)**

// Depth first search---root-Cs

```
void DFS-RootCs(Graph* G, int v) {
```

```
    G->setMark(v, VISITED);
```

```
    printf("%d\n", v); // print visited vertex
```

```
    for (int w=G->first(v); w<G->n(); w = G->next(v,w))
```

```
        if (G->getMark(w) == UNVISITED)
```

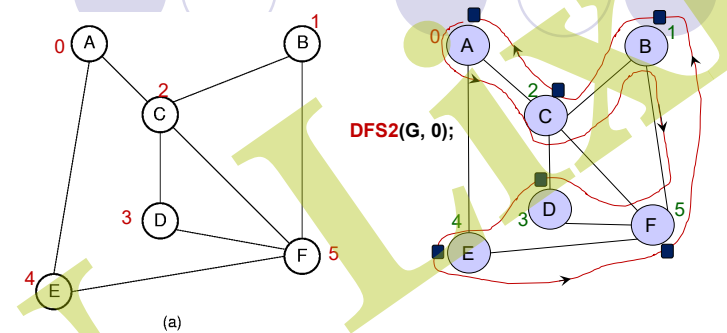
```
            DFS-RootCs(G, w);
```

```
}
```

Cost: $\Theta(|V| + |E|)$.

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11.3.2 Depth First Search of **connected graph (3)**



上述DFS类似 与树的后根遍历

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Depth First Search of **connected graph(4)**

// Depth first search--- Cs--root

```
void DFS-CsRoot(Graph* G, int v) {
```

```
    G->setMark(v, VISITED);
```

```
    for (int w=G->first(v); w<G->n(); w = G->next(v,w))
```

```
        if (G->getMark(w) == UNVISITED)
```

```
            DFS-CsRoot(G, w);
```

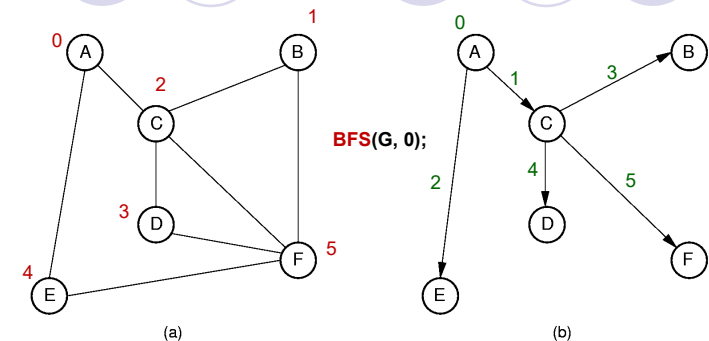
```
    printf("%d\n", v); // print visited vertex
```

```
}
```

Cost: $\Theta(|V| + |E|)$.

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11.3.3 Breadth-First Search of **connected graph (1)**



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Breadth-First Search of connected graph (2)

```
void BFS(Graph* G, int start) {
    int v, w; LQueue<int> Q;
    Q.enqueue(start);
    G->setMark(start, VISITED);
    printf("%d\n", start); // print visited vertex
    while (Q.length() != 0) { // Process Q
        v=Q.dequeue();
        for(w=G->first(v); w<G->n(); w=G->next(v,w))
            if (G->getMark(w) == UNVISITED) {
                Q.enqueue(w);
                G->setMark(w, VISITED);
                printf("%d\n", w); // print visited vertex
            }
    }
}
```

Visit vertex's
neighbors before
continuing deeper
in the graph.

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Connected Graph Traversal conclusion

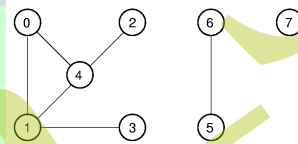
- Depth First Search of graph
 - based on 栈/递归的方式实现
- Breadth-First Search
 - based on 队列的方式实现

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General Graph Traversal (无条件)

```
void graphTraverse(const Graph* G) {
    int v;
    for (v=0; v<G->n(); v++)
        G->setMark(v, UNVISITED); // Initialize
    for (v=0; v<G->n(); v++)
        if (G->getMark(v) == UNVISITED)
            doTraverse(G, v);
}
```



若G为无向图。doTraverse
的执行次数等于图中连通
分量的个数。

BFS(G,v);
or DFS-RootCs(G,v);
or DFS-CsRoot(G,v);

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课后思考

- 前述无条件遍历函数 (P34, P36, P38, P40) 针对的是无向图, 若G为有向图, 要实现无条件遍历可以直接利用前述这些函数吗?
- 若你认为可以, 请分析 doTraverse 的执行次数除了与图本身有关, 还取决于什么?
- 如果想要 doTraverse 的执行次数与结点编号顺序无关, 你有那些修正方案?

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11.3.4 Topological Sort

- Given: a number of tasks, there are often a number of constraints between the tasks:

For example: tasks: A,B,C,D,E

非DAG/有环图?

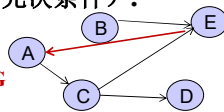
先决条件

- task A must be completed before tasks C can start
- tasks C, B must be completed before task E can start
- tasks C must be completed before task D can start

- Problem: Output the tasks in an order that does not violate any of the prerequisites (先决条件).

- Solution:

- modeling the problem using a DAG
- Topological Sort the DAG

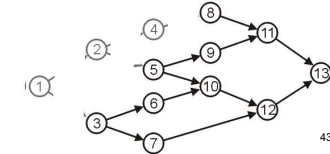


The process of laying out the vertices of a DAG in a linear order to meet the prerequisites rules is called Topological Sort

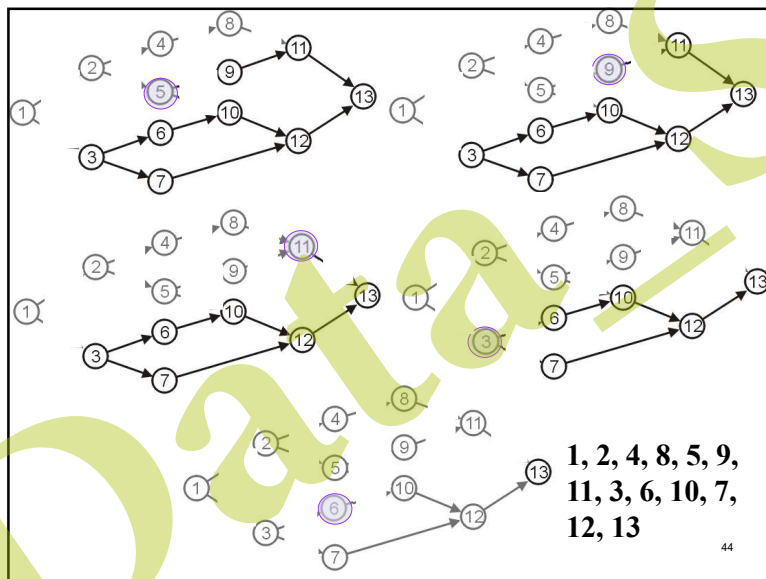
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Topological Sort

- To generate a topological sort, we must start with a vertex with an in-degree of zero: for example: 1
- Then, we may ignore/delete those edges which connect vertex 1 to other vertices, and choose a vertex with an in-degree of zero such as 2 or 3: 1, 2
- then ignore/delete all edges which extend from 2, and choose a vertex with an in-degree of zero, we may choose from vertices 4, 5, or 3: 1, 2, 4
- and then..... 1, 2, 4, 8



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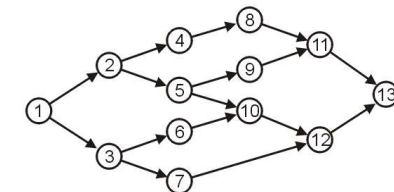


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Topological Sort

Topological Sort result of DAG isn't unique:

- one topological sort is 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13
- another topological sort is: 1, 2, 4, 8, 5, 9, 11, 3, 6, 10, 7, 12, 13
- another topological sort is: 1, 2, 4, 8, 5, 9, 11, 3, 7, 6, 10, 12, 13

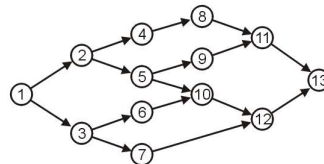


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Queue-Based(BFS-based) Topsort Implementation

步骤:

1. 建一个空队列Q
2. 将所有入度为0的顶点入Q (按顶点的序号)
3. 从Q中出队一顶点v, 按下列步骤处理v
 - 1) 访问(即输出)v;
 - 2) 对v的每一邻接顶点, 将其入度减1, 若入度变为0则将其入队Q
4. 重复步骤3, 直到Q为空



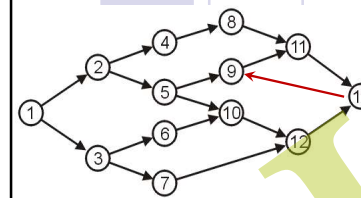
思考:

什么情况下会出现直到Q为空, 依然有顶点没输出?

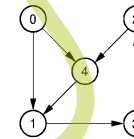
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Queue-Based Topsort ---implementation

若非DAG, 会怎样?



当输入graph为有环图时, 会出现直到Q为空, 依然有顶点没输出的现象。



Q	output
初始:	
1入队:	1
1出队, 2,3入队:	1, 2
2出队, 4,5入队:	1, 2, 3
3出队, 6,7入队:	1, 2, 3, 4
4出队, 8入队:	1, 2, 3, 4, 5
5出队, 9入队:	...
6出队, 10入队:	...
7出队:	
8出队:	
9出队, 11入队:	
10出队, 12入队:	
11出队:	
12出队, 13入队:	
13出队:	1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13

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Queue-Based Topsort Implementation (3)

```

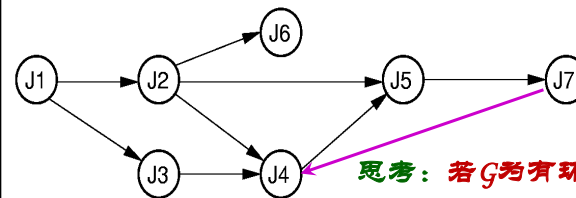
void topsort(Graph* G, Queue<int*> Q) {
    int v, w, *inDegree; // inDegree 用来存放每个顶点的入度
    inDegree = new int[G->n()];
    for (v=0; v<G->n(); v++) inDegree[v] = 0;
    for (v=0; v<G->n(); v++) // set inDegree[] according edges
        for (w=G->first(v); w<G->n(); w = G->next(v,w))
            inDegree[w]++; // increase w's indegree/入度
    for (v=0; v<G->n(); v++) // Initialize Q: 将入度为0的顶点入队Q
        if (inDegree[v] == 0) Q->enqueue(v); // 入度为0, No prereqs
    while (Q->length() != 0) {
        v = Q->dequeue(); cout<<v<<endl; // Process for V such as print
        for (w=G->first(v); w<G->n(); w = G->next(v,w)) {
            inDegree[w]--; // w入度 (prereqs) 减1
            if (inDegree[w] == 0) Q->enqueue(w); // w入度为0, 入队
        }
    }
}
    
```

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DFS-based TopSort Implementation

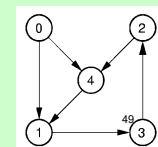
不建议使用

- S1 从入度为0的节点开始, 进行Cs-root遍历
- S2 Reversed order



思考: 若G为有环图, DFS-based的TopSort结果可信吗?

Cs-root result: J7,J5,J4,J6,J2,J3, J1
Reversed, we get the Topological Sort :
J1,J3,J2,J6,J4,J5, J7



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Conclusion of two Topsort methods

➤ Queue-Based(BFS-based) Topsort(可以测定输入 Directed Graph 是否为有环图, 从而可提醒输入的非 DAG 不适合 Topsort: 当 Q 为空时, 依然有顶点没输出, 说明该 directed graph 为有环图, 即图中有环, 不适合 Topsort。

➤ DFS-based TopSort 不管输入 directed graph 是否为 DAG, 总会输出所有顶点, 无输入不当提醒功能: 当输入 graph 为 DAG 时, 输出结果可信, 但当其为非 DAG 时, 结果不可信。

不建议使用

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