

# INF280: Competitive programming

More advanced graph algorithms

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# Eulerian Circuits

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# Eulerian Circuits

We study **undirected** graphs and assume they are **connected**:

- Eulerian path:  
Use every edge of a graph **exactly** once. Start and end may **differ**
- Eulerian circuit:  
Use every edge **exactly** once. Start and end at the **same node**
  
- Conditions to find Eulerian **path**:
  - All nodes have even degree **or**
  - Precisely two nodes have odd degree
- For Eulerian **circuit**, all nodes must have even degree

# Hierholzer's Algorithm for Eulerian Paths (assuming they exist)

```
set<int> Adj[MAXN]; vector<int> Circuit;

void Hierholzer(int v) {
    while (!Adj[v].empty()) {
        int tmp = *Adj[v].begin();           // follow edges until stuck
        Adj[v].erase(tmp);                  // remove edge, modifying graph
        Adj[tmp].erase(v);
        Hierholzer(tmp);
    }
    Circuit.push_back(v); // got stuck: append node at the end of circuit
}

void Hierholzer_main() {
    int v = 0; // find node with odd degree, else start with node 0
    for (int u=0; u < N && v == 0; u++)
        if (Adj[u].size() & 1)
            v = u; // node with odd degree
    Hierholzer(v);
}
```

# Implicit graphs

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⇒ describing your problem as a graph problem *usually helps*

### Rabbit

We have a graph where nodes are cells of the grid and edge are between nodes that are neighbors in the grids. *Find the path between two given points?*

### Piggyback

Given a weighted graph  $G$  defining a distance  $d$  between nodes.

*Find the node  $v$  minimizing  $Bd(v, 1) + Ed(v, 2) + Pd(v, n)$ .*

### Moocast

$G$  is the graph where nodes are cows and an edge  $(a, b)$  exists when  $b$  can hear  $a$ .

*Find the node that can reach most other nodes.*

# Why explicit the implicit graphs?

## Help you reason over the problem:

- is it exactly the same problem?
- what are the properties of this implicit graph?
- can the problem on the implicit graph be simplified?
- can we reduce the number of nodes? of transitions?
- are we lacking important properties from the original graph?

## Help you code the problem

The more standard algorithms you use the less likely you are to have bugs.

## Union-find

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**Maintain a collection of non-overlapping sets with the following operations**

- Add a new element, in its own set
- Get the set of an element
- Merge two sets

**Queries we might need to answer**

- Given two elements, are they in the same component?
- What the size of the component of  $x$ ?
- What is the number of components?



## Union-Find

```
repr[x] ; // initialized to -1
int find(int x) {
    if(repr[x] < 0) return x;
    return repr[x]=find(repr[x]); // path compression
}
bool unite(int a, int b) {
    a = find(a);
    b = find(b);
    if(a==b) { return false; }
    if(repr[a] > repr[b]) { swap(a,b); } // size
    repr[a] += repr[b] ;
    repr[b] = a;
    return true;
}
```

# Minimum Spanning Trees (MST)

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## Spanning tree

Given a connected graph  $G = (V, E)$  a spanning tree is a selection of  $E' \subseteq E$  such that  $E'$  forms a tree covering all nodes in  $G$ .

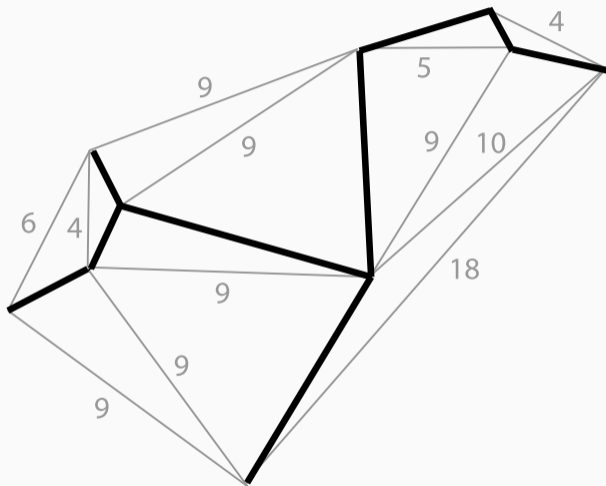
## MST Problem

Find the spanning tree that has minimal total weight.

## Properties

The MST also minimizes the maximal weight of an edge.

## Example: Minimum Spanning Trees



[https://commons.wikimedia.org/wiki/File:Minimum\\_spanning\\_tree.svg](https://commons.wikimedia.org/wiki/File:Minimum_spanning_tree.svg), Dcoetzee, public domain

## Kruskal's algorithm

For all edges  $(a, b)$  by increasing weight

- if  $a$  and  $b$  not in the same component
  - link  $a$  and  $b$

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## Prim's algorithm

Make a modified Dijkstra:

- maintain a set  $S$  of nodes, initialized as  $\{x\}$  for any node  $x$
- while there remains a node not in  $S$ :
  - select an edge  $\{n, n'\} \in E \cap (S, V \setminus S)$  minimizing  $w(n, n')$
  - add  $\{n, n'\}$  to  $E'$

```
vector<pair<weight, pair<int,int> > > edges;  
// ...  
sort(edges.begin(),edges.end());  
long long weight_mst = 0;  
for(auto [w,p] : edges)  
    if(unite(p.first,p.second))  
        weight_mst += w;
```

# Prim

```
long long dist[NB_NODES_MAX];  
//...  
fill(dist,dist+NB_NODES_MAX,INF);  
set<pair<long long,int>> p_queue; // (weight, node)  
p_queue.insert(make_pair(0,start_node));  
dist[start_node] = 0;  
while(!p_queue.empty()) {  
    auto [node_dist, node] = *p_queue.begin() ; // c++17  
    p_queue.erase(p_queue.begin());  
    for(auto v : nxt[node])  
        if(v.second < dist[v.first]) {  
            p_queue.erase(make_pair(dist[v.first],v.first));  
            dist[v.first] = v.second;  
            p_queue.insert(make_pair(dist[v.first],v.first));  
        }  
}
```



# Flows and matching

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## Definition

A flow network  $G$  is a graph where each edge has a capacity value. A flow network generally has a source  $s$  and an target  $t$ .

## Flow

A flow in a  $G$  maps edges  $(a, b)$  to values  $f_{a,b}$  such that:

- the flow along each edge is less than the capacity
- the source has an incoming flow equal to 0
- the sink has an outgoing flow equal to 0
- for other nodes, the total incoming flow is equal to the total outgoing flow

The value of a flow is the outgoing flow from  $s$ .

## Cut

In a flow network  $G$  with source  $s$  and target  $t$ , a cut is a partition of nodes into 2 partitions  $S$  and  $T$  such that  $s \in S$ ,  $t \in T$ . The capacity of a cut is the sum of capacities of edges between  $S$  and  $T$ .

## Theorem

$$\text{Max-Flow} = \text{Min-Cut}$$

This means that the maximal value of a flow is equal to the cut of minimum capacity.

## Matching in bipartite graph

In a weighted bipartite graph  $(V, E)$  with  $V = X \sqcup Y$ , a matching is a selection  $E' \subseteq E$  of edges such that no nodes in  $(V, E')$  have degree higher than 1.

## Maximum matching

A matching of maximal total weighted.

## Reduction to max-flow

Create two new nodes  $s$  and  $t$ , link  $s$  to all nodes in  $X$  and  $t$  to all nodes in  $Y$ . All edges have capacity 1.

# Ford-Fulkerson “algorithm” for flows

## Residual graph

Given a flow network  $G$  and a flow  $f$  we can compute the residual flow network  $G'$  as  $G$  but where the capacity of an edge  $(a, b)$  is  $c_{a,b} - f_{a,b}$ . Notice that an edge is removed when  $f_{a,b} = c_{a,b}$  and using the convention  $f_{a,b} = -f_{b,a}$  an edge is created when  $f_{b,a} < 0$ .

## Ford-Fulkerson Method

- Initialize  $f$  with empty flow
- While there exists a path  $p$  from  $s$  to  $t$  in the residual
  - increase  $f$  with the path  $p$  using maximal capacity

⇒ multiple algorithms to find the path lead to various complexities.

## Ford-Fulkerson with DFS

```
int capa[Tm][Tm], flow[Tm][Tm]; // adjacency matrix
bool visited[Tm];
int dfs(int x, int max_flow) {
    if(visited[x]) return 0; // already search/ed for a flow
    if(x==target) return max_flow; // found our flow
    visited[x] = true; // stop visiting x
    for(int n: nxt[x]) // mixes adjacency lists with matrix
        if(flow[x][n] < capa[x][n]) { // residual
            const int sub_flow = dfs(n,
                min(max_flow, capa[x][n]-flow[x][n]));
            if(sub_flow > 0) {
                flow[x][n] += sub_flow;
                flow[n][x] -= sub_flow;
                return sub_flow;
            }
        }
    return 0; // haven't found a flow
}
```

# Ford-Fulkerson with DFS

```
int totalFlow = 0, curFlow = 1 ;
while(curFlow > 0) {
    fill(visited,visited+Tm,false) ;
    curFlow = dfs(source,INF) ;
    totalFlow += curFlow ;
}
// in the worst case the flow increases by one each time
// hence in  $O(E) \times F$  where  $F$  is the final flow
// if using integers
```

## Recognize flow algorithms

Flow problems are usually a bit counter-intuitive and hard to recognize...

## Multiple algorithms

The code above is for Ford-Fulkerson with DFS, this is not the fastest method but the simplest. You can replace the DFS with a BFS to improve the worst-case complexity.