

Graphs (part 2/2)

Competitive programming

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Content

- BFS
- Floyd-Warshall
- Network Flow
- Bipartite matching
- Other graph problems

BFS

- **Breadth First Search:** A queue is used to insert discovered vertices.
- The algorithm starts by visiting and inserting one vertex into the queue.
- At each step the head is removed from the queue, and its adjacent unvisited vertices are visited and enqueued. This ensures a level-by-level path from the initial vertex.

BFS

We may visit the node
when it is queued or
dequeued; depends!

- **Breadth First Search, o búsqueda en anchura:**

```
void BFS(graph &g, int k) {  
    for(int i = 0; i < g.size(); i++)  
        g[i].visited = -1;  
    list<int> q; // the queue  
    // Mark as visited and enqueue it  
    g[k].visited = 1; q.push_back(s);  
    while(!q.empty()) {  
        // Dequeue  
        k = q.front();  
        q.pop_front();  
        for (edge *p = g[k].adj; p; p=p->next)  
            if (g[p->v]->visited == -1) {  
                g[p->v]->visited = 1;  
                q.push_back(p->v);  
            }  
    }  
}
```

BFS

- **Breadth First Search**, some problems/algorithms:
- Shortest path and minimum spanning tree.
- On social networks, search for friends, friends of friends, and successively up to N levels.
- Broadcast on a real network from a node.
- Network flow, the Ford–Fulkerson algorithm.
- Check if a network is bipartite.
- Prim's minimum spanning tree.
- Disjkstra.

BFS

- **Spanning tree:** or minimal spanning tree for undirected and weighted graphs (in arcs), is a connected subgraph without cycles that includes all vertices.
- **Minimum spanning tree (MST):** This is the spanning tree of minimum sum of arcs. It might not be unique. Applications: in communications networks, hydraulics, air and land routes, biological networks, etc. We'll assume connected graphs.
- We will study **Prim and Kruskal**

BFS

- **Prim's algorithm:** is a voracious or greedy algorithm; starting from any vertex, it adds one arc at a time to the tree. Selects the minimum weight arc that joins a vertex of the tree with a vertex that is not in the tree.

BFS

- **Prim's algorithm:** How to quickly find the candidate arc?. Each time an arc a (and the end vertex v) is selected, v is marked as visited, and the arcs (v,w) of $\text{ady}(v)$ are added to the priority queue (ordered by weight). Some arcs might contain both marked vertices. These will be ignored by the algorithm (lazy priority queue update).


```
struct vertex {
    edge *ady;
    bool visited = false;
};
```

BFS

```
struct edge {
    int left, right;
    float weight;
    edge *next;
};
```

- **Prim's algorithm:**

```
void LazyPrimMST(graph &g, list<edge *> &mst) {    // O(m log n)
    PriorityQueue<edge*> pq; // sorted ascendantly by edge::weight
    mst.clear();
    visit(g, 0, pq);
    while (!pq.empty()) {
        edge *e = pq.deleteMin(); // get lowest-weight
        if (g[e->left].visited && g[e->right].visited) continue; //lazy
        mst.push_back(e);
        if (!g[e->left].visited) visit(g, e->left, pq);    // add vertex to tree
        if (!g[e->right].visited) visit(g, e->right, pq); // the same
    }
}

void visit(graph g, int v, PriorityQueue<edge *> pq) {
    g[v].visited = true;
    for (edge *p = g[v].adj ; p != NULL; p=p->next)
        if ( ! g[p->right].visited) pq.insert(e);
}
```

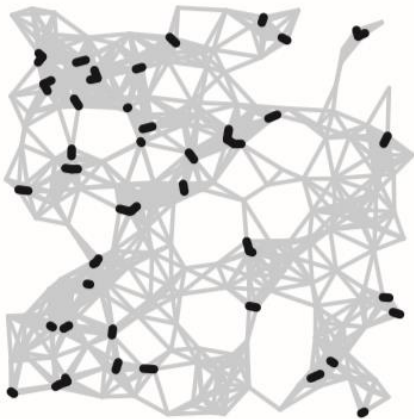
BFS

- **Kruskal algorithm:** in this case, all arcs are simply sorted ascending by weight.
- Starting from a forest of trees (each tree is just one vertex at the beginning), these arcs are added one by one if they do not form a cycle, until V arcs ($V-1$ vertices) are completed.
- Each added arc "joins" two trees in the set.

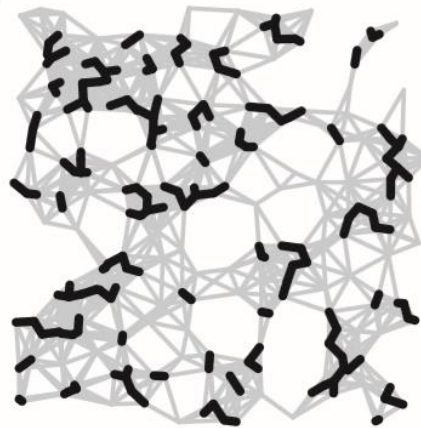
BFS

- Kruskal algorithm:

20%



60%



MST



BFS

```
struct edge {  
    int left, right;  
    float weight;  
    edge *next;  
};
```

- **Kruskal algorithm:**

```
Void KruskalMST(graph &g, queue<edge*> &mst) {  
    PriorityQueue<edge *> pq; // heaps de mínimos  
    insertAllEdges(pq, g);    // sorted by weight; O(m.logm)  
    disjointSet <int>ds;      // yeah, disjoint set  
    while (!pq.empty() && mst.size() < g.size()-1)    { // O(m)  
        edge *e = pq.deleteMin();                    // O(logm)  
        if (ds.root(e->left) != NULL &&  
            ds.root(e->left) == ds.root(e->right)) continue;  
        ds.unionFind(e->left, e->right, true); // Merge  
        mst.push_back(e);  
    }  
}
```

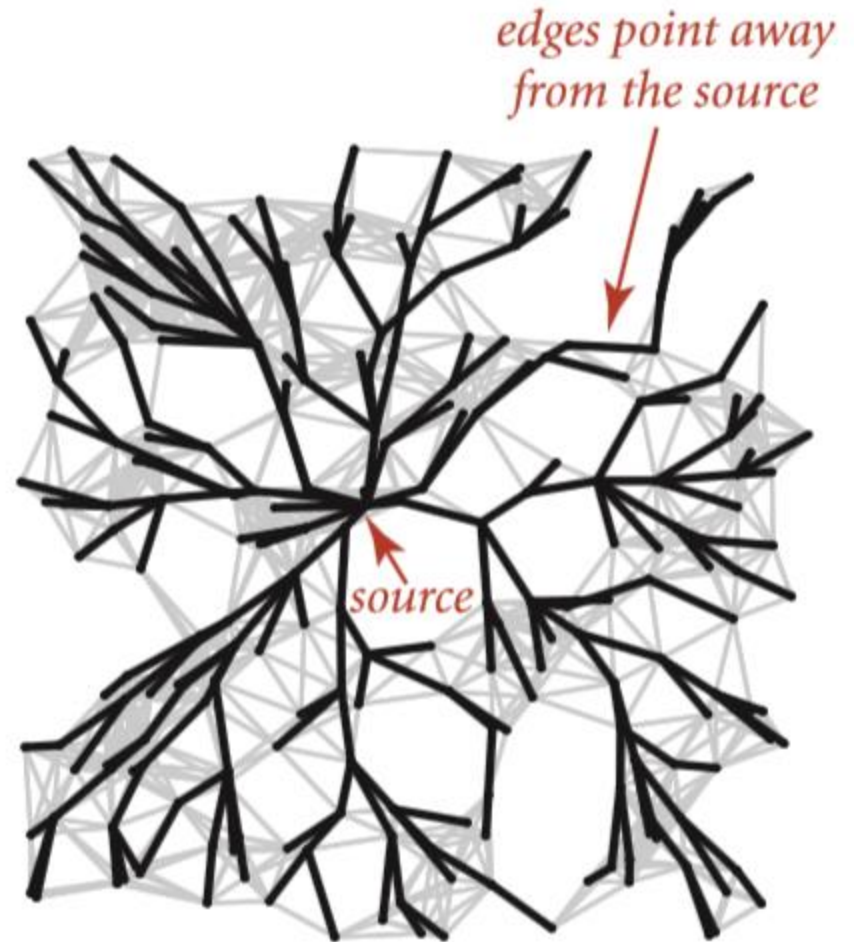
Disjoint set operations are $O^*(1)$
Then, Kruskal is $O(m \log m)$, with $m = |E|$

BFS

- **Shortest path:** Find the shortest path between a pair of vertices.
- Let's assume it's a directed graph, but it also applies to undirected graphs.
- The weight of the arc can mean time, length, cost, etc. In any case, it is something that you want to minimize. We will initially assume weights ≥ 0 .

BFS

- **Shortest path:** a shortest path tree is usually constructed; from a vertex s , a subgraph containing s is generated, and specifically a rooted tree in s , where each path from s to any vertex of the tree is the shortest in the original graph. Then you can do many queries from s .

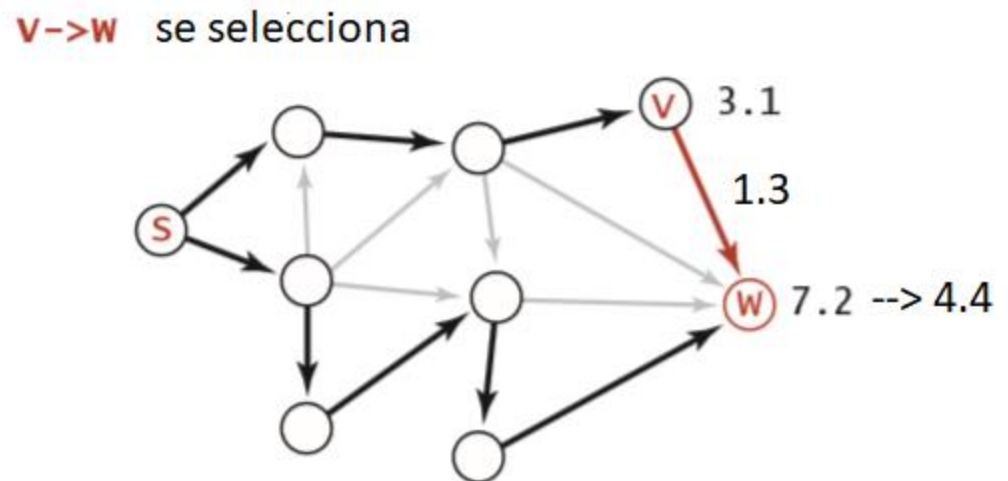
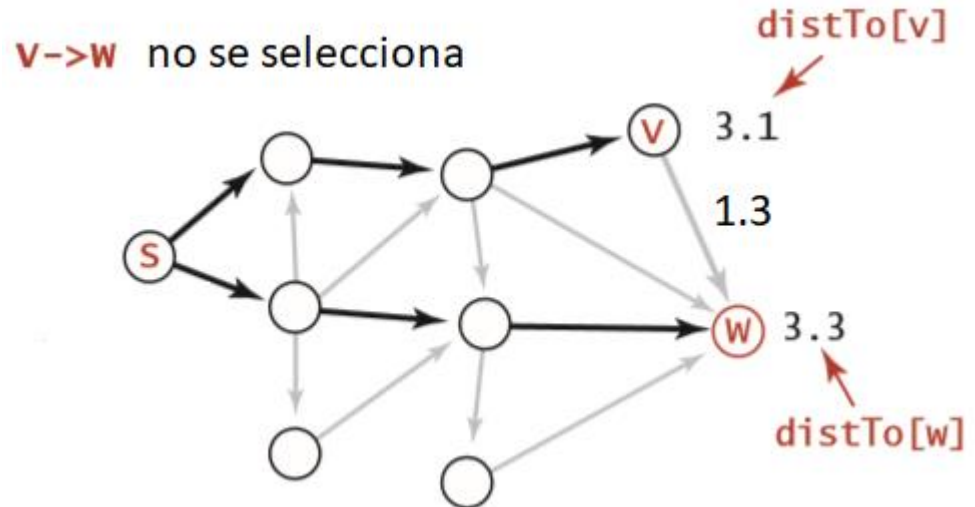


BFS

- **Shortest path:**
- Let edgeTo be an array of n integers (indexes to vertices), such that edgeTo[v] contains the index to the parent of v in the tree.
- Let distTo be an array of n floating point numbers, such that distTo[v] is the minimum distance from s to v .
- distTo[s] = 0.
- Initially, distTo[v] = ∞ ($v \neq s$), and edgeTo[v]=1 for every vertex v .
- There are 2 classic algorithms: edge relaxation and vertex relaxation.

BFS

- **Shortest path (edge relaxation):** On each step a side (v,w) is considered. When processing this side you simply check if it is shorter to go through the arc (v,w) or not?.



BFS

- **Shortest path (edge relaxation):** an Edge is relaxed

```
vector<edge *> edgeTo;  
vector<float> distTo;
```

```
void relax(edge *e) {  
    int v = e->left;  
    int w = e->right;  
    if (distTo[w] > distTo[v] + e->weight) {  
        distTo[w] = distTo[v] + e->weight;  
        edgeTo[w] = e;  
    }  
}
```

BFS

- **Shortest path (vertex relaxation):** a vertex is relaxed by relaxing all its edges:

```
vector<edge *> edgeTo;  
vector<float> distTo;  
  
void relax(digraph &g, int v) {  
    for (edge *p = g[v]->ady; p; p=p->next) {  
        int w = p->right;  
        if (distTo[w] > distTo[v] + p->weight) {  
            distTo[w] = distTo[v] + p->weight;  
            edgeTo[w] = v;  
        }  
    }  
}
```

BFS

- **Shortest path (Dijkstra):** similar to Prim's algorithm. The difference is that Prim selects the minimum weight arc that joins a vertex of the tree with a vertex that is not in the tree. Dijkstra instead adds the nearest vertex in distance to the "source" s .
- We start by queueing (in a priority queue) the vertex s with distance 0. Then we extract the first vertex of the tail, "relax" the vertex, queueing the adjacent unvisited vertices (or updating its weight if visited).

BFS

- **Shortest path (Dijkstra):**

```
void Dijkstra(digraph &g, int s) {  
    for (int u=0; u<g.size(); u++) {  
        distTo[u] = INFINITO ; edgeTo[u] = NULL; g[u].visited = false;  
    }  
    distTo[s] = 0; queue <pair<int, double>> q;  
    q.insert(make_pair<s, distTo[s]>);  
    while (! queue.empty()) {  
        int u = q.min().index; q.pop();  
        g[u].visited= true;  
        for (edge *e = g[u].ady; e; e = e->next) /*if (!g[e->right].visited)*/ {  
            v = e->right;  
            if (distTo[v] > distTo [u] + e->weight) {  
                distTo [v] = distTo [u] + e->weight;  
                edgeTo [v] = u;  
                q.insert(make_pair<v, distTo[v]>);  
            }  
        }  
    }  
}
```

BFS

- **Shortest path (Dijkstra):**
 - $O(m \log n)$ using priority queue, as each arc (m arcs) is inserted into a priority queue with at most n vertices ($\log n$ per insertion)
 - There is an $O(n \log n + m)$ implementation using fibonacci heap

Floyd-Warshall

- **Floyd-Warshall:** the goal is to have a structure that gives us the shortest path between any pair of nodes. Used for multiple queries (shortest path between 2 vertices) on same graph.
- This is equivalent to transitive closure, but storing as weight the distance between the two vertices.
- This algorithm is n^3 if we use the adjacency matrix. It is based on the idea of edge relaxation.

Floyd-Warshall

- **Floyd-Warshall:**

*adjacency matrix. If the arc doesn't exist, then it's infinite
it is further assumed that $ady[i][i] = 0$ (zero diagonal)*

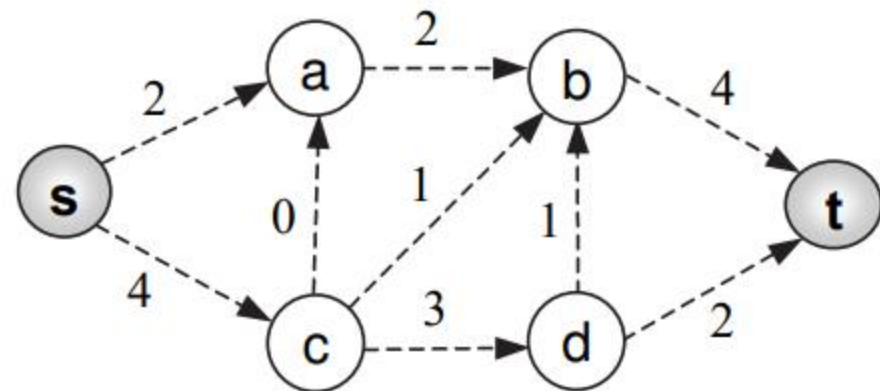
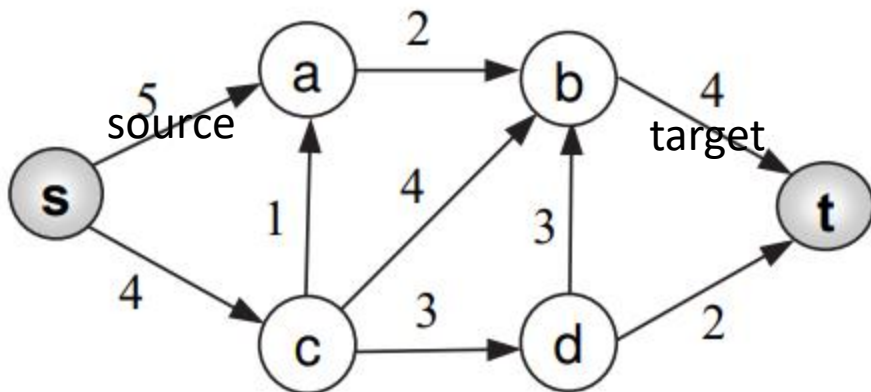
Returns an array with minimum distances

```
void floydWarshall(int ady[n][n], int path[n][n]) {  
    memcpy(path, ady, n*n*sizeof(int));  
    for (int k = 0; k < n; k++)  
        for (int i = 0; i < n; i++)  
            for (int j = 0; j < n; j++){  
                int d= path[i][k] + path[k][j];  
                if (path[i][j] > d)  
                    path[i][j] = d;  
            }  
}
```

What is better, n Dijkstras, o one Floyd-Warshall?

Maximum network flow

- **Maximum network flow:** The problem with maximum flow is to calculate the maximum amount of flow that can be transported from a starting point or origin (source or fountain) to an arrival or destination point (target or water well).



Maximum network flow

- **Maximum network flow:**
 - There are two special vertices: source and well
 - The weight of the arc represents the capacity of the arc. It cannot be exceeded
 - The final value of the flow is the total flow that comes out of the source, and equivalently the one that reaches the well
 - Capacity can be thought of as amount of water in pipe, bandwidth, etc.

Maximum network flow

- Naive solution: Each iteration checks for a path in the network (with capacity > 0 per arc) from the source to the well.
- If the path exists, increases the flow at each arc of the road in the resulting network as possible, while reducing the capacity of the arcs involved in the residual network.
- It is required to trace the capacity used (resulting network) and the remaining capacity.
- The process ends when there is no other path.

Maximum network flow

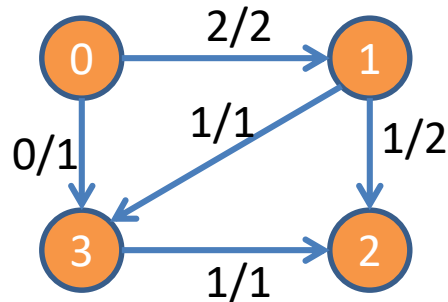
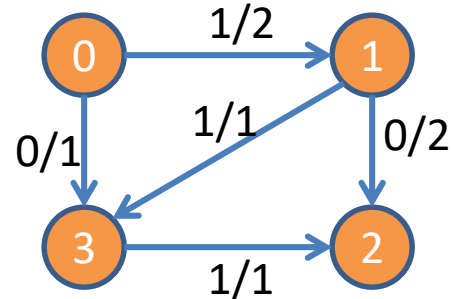
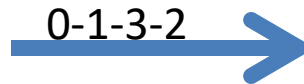
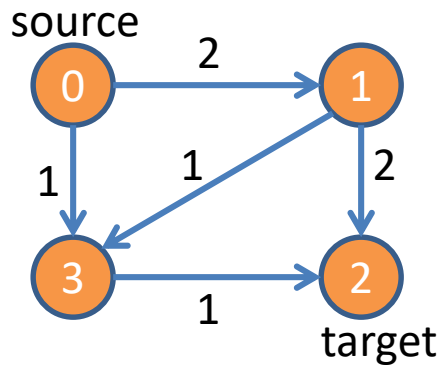
- **Naive approach:**

```
void naive(pair g[n][n], int s, int t) { // NOT optimal
    vector<pair> path;
    while (findPath(g, s, t, path)) {
        int min = g[path[0]][path[1]].capacity;
        for (int i=1; i<path.size()-1; i++)
            if (min > g[path[i]][path[i+1]].capacity)
                min = g[path[i]][path[i+1]].capacity;
        for (int i=0; i<path.size()-1; i++) {
            int u = path[i], v = path[i+1];
            g[u][v].capacity -= min; // reduce capacity
            g[u][v].flow += min; // add flow
        }
    }
}
```

// for findPath, use DFS or BFS

Maximum network flow

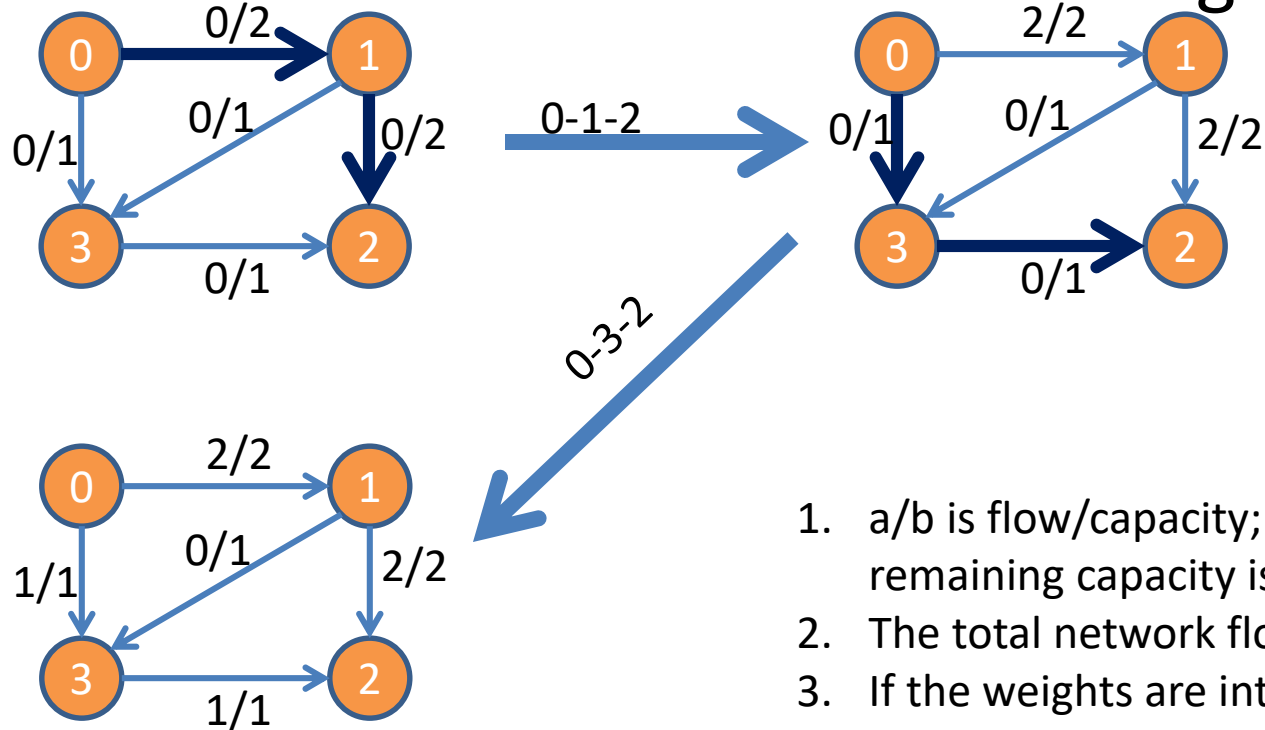
- **Naive approach: example**



1. There are no more roads to destiny
2. Remaining Cap. = Initial - Flow
3. The total network flow is 2
4. A better solution is to choose:
5. 0-1-2 (with a flow of 2)
6. 0-3-1 (with a flow of 1), adding 3
- 7.

Maximum network flow

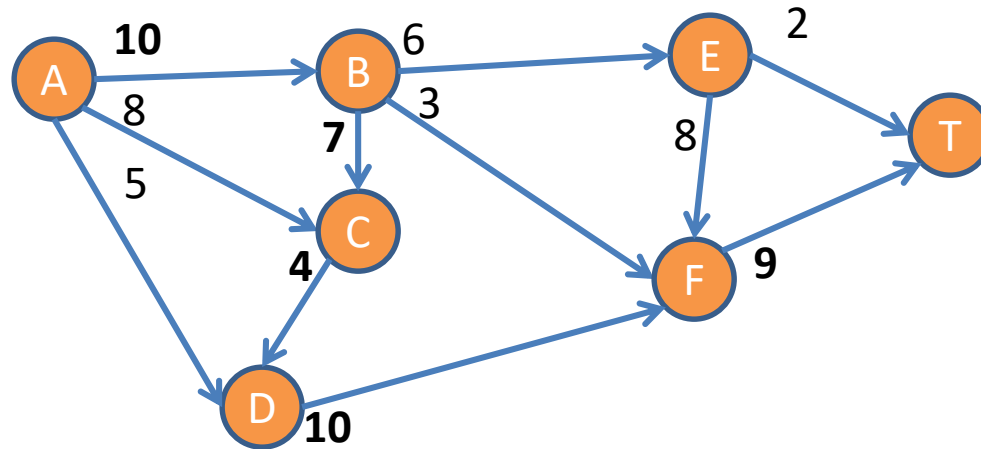
- **Another maximum flow algorithm:** at each step I take the arc with the most remaining capacity



1. a/b is flow/capacity; the remaining capacity is $b-a$
2. The total network flow is 3
3. If the weights are integers, the complexity is $\text{maxflow} * |E|$

Maximum network flow

- **Another maximum flow algorithm:** at each step I take the arc with the most remaining capacity

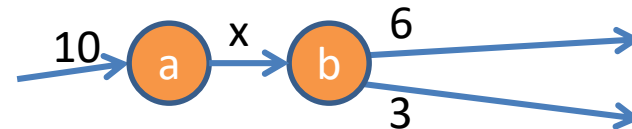
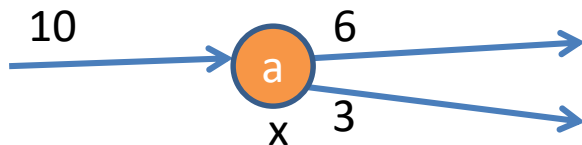


Maximum network flow

- **Another maximum flow algorithm:** as you can see, these algorithms are not optimal.
- Optimal algorithms (require a residual graph):
 - Ford Furkelson
 - Edmons-Karp

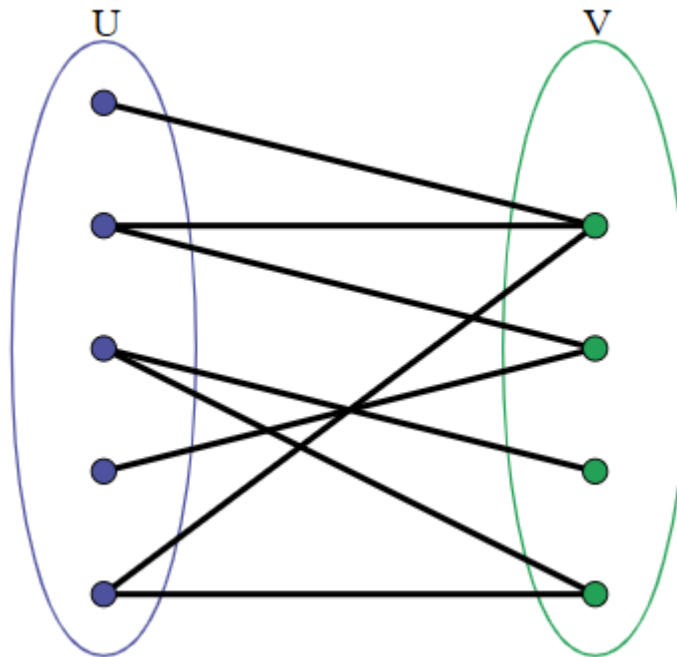
Maximum network flow

- If there are multiple sources (or targets), add a dummy source (or target) with a link to each actual source (or target). What would be the capacity to each source (or target)?
- If there is an “vertex with capacity= x ”, we replace it with 2 vertices and a link with that capacity



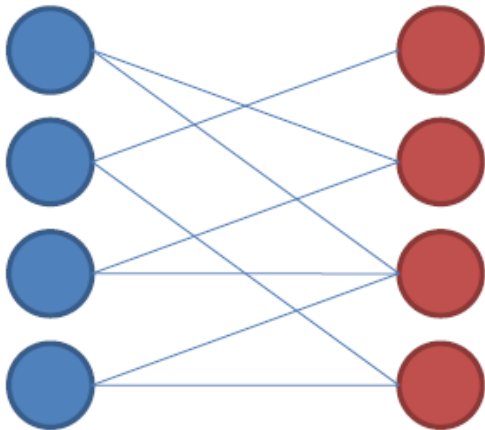
Bipartite graphs

- It is a graph whose vertices can be separated into two disjoint sets U and V , where there are no arcs connecting 2 nodes of U , nor two nodes of V , but there can be arcs connecting nodes from U to V .

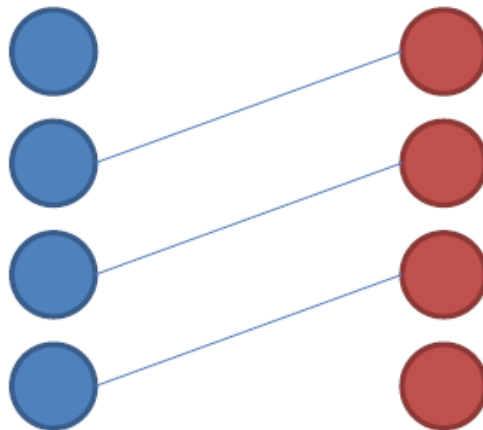


Bipartite graphs

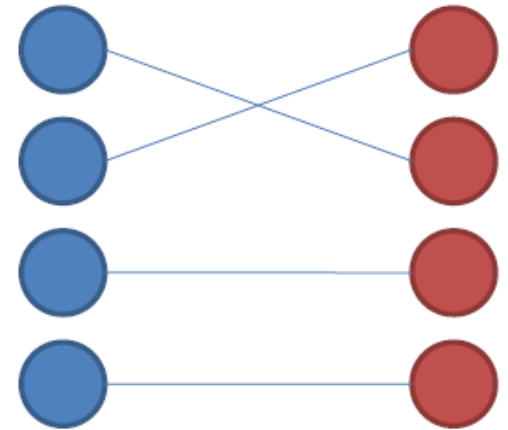
- A "matching" consists of selecting arcs from U to V so that vertex has (as much) one adjacent arc.
- Maximum bipartite matching (MBM) means that this matching has to be maximum in number of arcs.



Bipartite graph



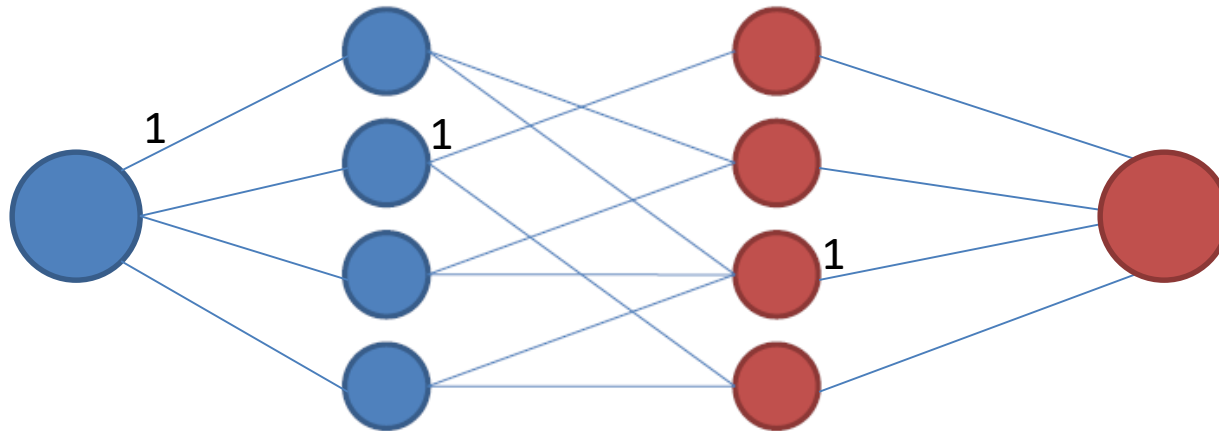
A matching



Maximum bipartite
matching

Bipartite graphs

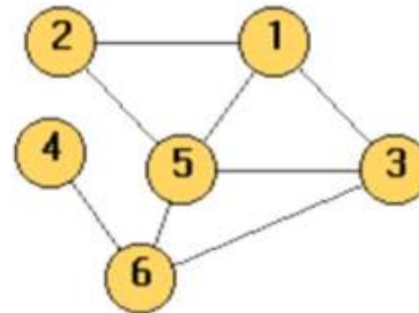
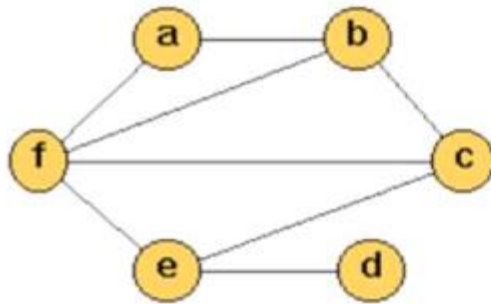
- Adding a source and target, we can convert this problem into a “maximum network flow”.



weight = 1 for each arc

Other problems with graphs

- Is the graph flat? That is, can you draw in 2D without crossing the arcs? It is $O(n+m)$ using Tarjan Hopcroft Algorithm
- Isomorphism of graphs: find a bijection between vertices of two graphs, such that both graphs are equivalent. This is equal to re-labeling the vertices so that both graphs are equal.



$\{(a \rightarrow 2), (b \rightarrow 1), (c \rightarrow 3), (d \rightarrow 4), (e \rightarrow 6), (f \rightarrow 5)\}$

Other problems with graphs

- Min Cost Max Flow
- Min-Cut: minimal cutting in graphs
- Hungarian algorithm
- RMQ (Range Minimum Query), Lowest Common Ancestor (LCA)
- PERT (program evaluation and review technique)
CPM (critical path analysis)
- In network: Ford Furkenson, Edmonds-Karp algorithm, Push & Relabel

Spoj

There are many BFS problems

<https://www.spoj.com/problems/tag/bfs>

And graphs in general

<https://www.spoj.com/problems/tag/graph>

Minimum spanning tree

<https://www.spoj.com/problems/MST/>

Prim or Kruskal

<https://www.spoj.com/problems/CSTREET/>

Spoj

Interesting (DS + MST)

<https://www.spoj.com/problems/IITWPC4I/>

Just MST (Kruskal ?)

<https://www.spoj.com/problems/BLINNET/>

Network flow

<https://www.spoj.com/problems/FASTFLOW/>

<https://www.spoj.com/problems/COCONUTS/>

Spoj

Bipartite graphs

<https://www.spoj.com/problems/MATCH/>

Hungarian algorithm

<https://www.spoj.com/problems/SCITIES>

For next class (January 10)

- Group 1: study and prepare Ford Furkenson and/or Edmons-Karp (power point). Solve 1 problem related to network Flow and one problem related to bipartite matching. Try a third problem related to MST, Kruskal, Prim, Dijkstra, Floyd-Warshal
- Group 2: study and prepare Hungarian algorithm (power point). Solve one problem related to Hungarian algorithm. Solve 1 or more problems related to Prim, Kruskal, Dijkstra, Floyd-Warshal