

# Minimum Spanning Tree(MST)

CS101 Fall 2024

CS101 Course Team

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# Spanning Tree

Why Spanning Tree:

- Tree has a linear scale. ( $|E| = \Theta(|V|)$ )
- Tree has no cycle. (Unique Path)

Existence of spanning trees  $\Leftrightarrow$  Connectedness.

Note: Path on Minimum Spanning Tree  $\neq$  Shortest Path!

Another note (by Prof.):

Weights may not be distinct! So MST may not be unique!

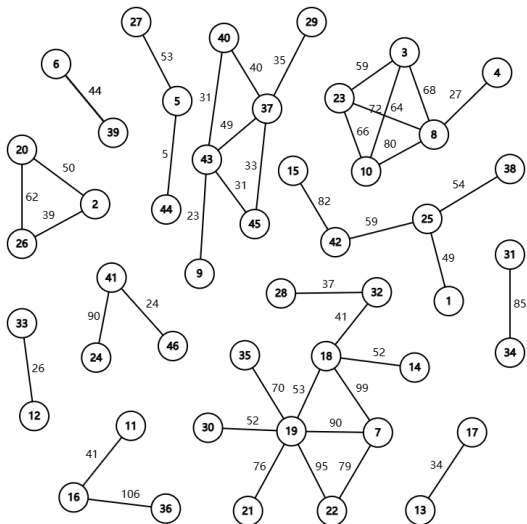
Another note (by ta):

Graph with distinct weights has a unique MST.



## Application

## Analyzing Network.



## 我要和你保持距离



# Number of Spanning Trees/Forests

Multiplication Rule: Count every connected component then multiply.

Naive Method:

- Selection:  $\binom{|E|}{|V|-1}$ .
- Cut: Enumerate all impossible edge combinations. (e.g. Ones form cycles.)

A universal method: Matrix-Tree Theorem.



# Number of Spanning Trees/Forests

## Notation

$G = (V, E)$  is a graph.

Degree Matrix:  $D = \text{diag}\{d_i\}$ , where  $d_i$  is degree of vertex  $i$  i.e.  $\deg(i)$ .

Adjacency Matrix:  $A_{ij} = 1$  if  $(i, j) \in E$  otherwise 0.

Laplace Matrix:  $L = D - A$ .

Notice that the sum of each line in the Laplace Matrix is 0, which means that  $\det(L) = 0$ .

## Matrix-Tree Theorem

The number of spanning trees of  $G$  equals the determinant of (every)  $(|V| - 1)$ -level major minor of  $L$ .

Corollary: Note that  $L$  is semi-positive definite.  $0 = \lambda_1 \leq \lambda_2 \leq \dots \leq \lambda_{|V|}$  is the eigenvalue of  $L$ . Then the number of spanning trees is  $\frac{1}{n} \lambda_2 \cdots \lambda_{|V|}$

One corollary:  $K_n$  has  $n^{n-2}$  spanning trees.

# Minimum Spanning Tree

- From edges: Kruskal's Algorithm
- From vertices: Prim's Algorithm

## Public Notation

$G = (V, E)$  is a connected weighted simple graph.

$n = |V|, m = |E|$ .

$V = \{v_1, \dots, v_n\}, E = \{e_1, \dots, e_m\}, e_i = (x_i, y_i, w_i)$  refers to the edge connected  $x_i$  and  $y_i$  weighted  $w_i$ .

Sometimes also see  $E$  as a subset of  $V \times V$ . (ignore weights)



# Cut Property & Cycle Property

Cut: A partition which divides  $V$  into 2 disjoint sets:  $S$  and  $V \setminus S$ .

Crossing edges: The edges in  $|E| \cap S \times V \setminus S$ .

## Cut property

For all cuts, the minimum weighted crossing edges must be in an MST.

Dual Proposition: Cycle property. (Maximum weighted cycle edges must not be in any MSTs.)

More referred to: [https://piazza.com/class\\_profile/get\\_resource/m11nrjwg6r35ku/m3u111zjdd05de](https://piazza.com/class_profile/get_resource/m11nrjwg6r35ku/m3u111zjdd05de)



# Prim's Algorithm

Core idea: Using cut property to extend edges.

Initialization: Choosing a vertex  $v$ ,  $S = \{v\}$ .  $C = \{e \mid e \text{ contains } v\}$ .

## Every iteration

- 1 Find the minimum crossing edge  $e$  between  $S$  and  $V \setminus S$ .
- 2 Denote the crossing edge as  $e = (u, v)$ ,  $u \in S$ . Add  $v$  into  $S$ .
- 3 Add all additional crossing edges into  $C$ . ( $\{(u, v) \mid u \in V \setminus S\}$ )

Naive version:  $O(|V|^2)$ . (Maintain distance of every vertex.)

Using binary heaps to maintain  $C$ :  $O(|E| \log |V|)$ .

Correctness: Cut property.





# Kruskal's Algorithm

Core idea: Always find the legal minimum weighted edges.

Initialization: Make  $E$  sorted.  $T = \emptyset$

Traverse all edges  $e = (u, v)$ .

Check whether  $u$  and  $v$  are connected in  $T$ . If so, skip it.

Otherwise, add  $e = (u, v)$  in  $T$ .

Pseudocode (Cite from [HTTPS://OI-WIKI.ORG/GRAPH/MST/](https://oi-wiki.org/graph/mst/))

```
1  Input. The edges of the graph  $e$ , where each element in  $e$  is  $(u, v, w)$   
   denoting that there is an edge between  $u$  and  $v$  weighted  $w$ .  
2  Output. The edges of the MST of the input graph.  
3  Method:  
4   $result \leftarrow \emptyset$   
5  sort  $e$  into ascending order by weight  $w$   
6  for each  $(u, v, w)$  in the sorted  $e$   
7      if  $u$  and  $v$  are not connected in the union-find set  
8          connect  $u$  and  $v$  in the union-find set  
9           $result \leftarrow result \cup \{(u, v, w)\}$   
10 return  $result$ 
```

# Kruskal's Algorithm

Time complexity:

Naive version:  $O(|V||E|)$ .

Optimization with disjoint sets:  $O(|E| \log |E|)$ .

Correctness: Using contradiction method:

Adding the extra edge and  $T$  forms a cycle, using the cycle property, which contradicts to the algorithm.



# Example

## 2023 HW8

In SC101 country, there are  $n$  cities and  $m$  **broken** roads, with each broken road connecting two different cities. You can consider this as a graph  $G = (V, E)$ .

Now the government wants to build a traffic net in the SC101 country. There are 2 crucial steps to take in constructing this traffic network:

- 1 Establish an airport in the  $i$ -th city with a cost of  $a_i$
- 2 Repair the broken road  $e_j = (u_j, v_j)$  to connect the city  $u_j$  and  $v_j$ , cost  $b_j$ .

In the final network, every city will either have an airport or be connected to a city with an airport. Your task is to design an algorithm to find the minimum cost to build the network.

Solution: MST.



# Network Flow\*

Abstraction for material flowing through the edges.

$G = (V, E)$  = directed graph

Two distinguished nodes:  $s$  = source,  $t$  = sink.

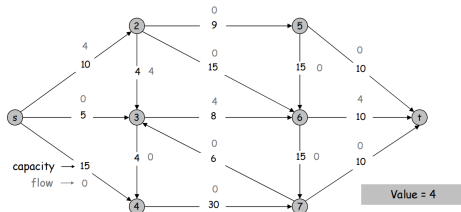
$c(e)$  = nonnegative capacity of edge  $e$

## Flows

Def. An  $s$ - $t$  flow is a function that satisfies:

- For each  $e \in E$ :  $0 \leq f(e) \leq c(e)$  (capacity)
- For each  $v \in V - \{s, t\}$ :  $\sum_{e \text{ in to } v} f(e) = \sum_{e \text{ out of } v} f(e)$  (conservation)

Def. The value of a flow  $f$  is:  $v(f) = \sum_{e \text{ out of } s} f(e)$ .

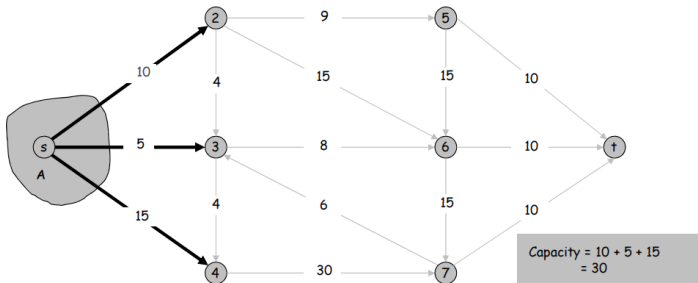


# Network Flow\*

## Cuts

Def. An **s-t cut** is a partition  $(A, B)$  of  $V$  with  $s \in A$  and  $t \in B$ .

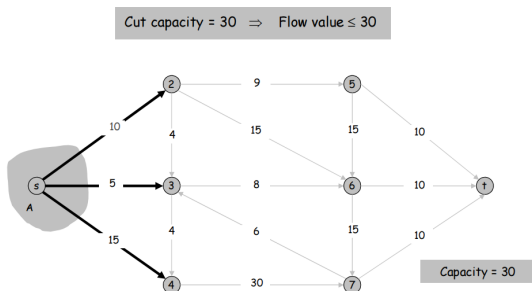
Def. The **capacity** of a cut  $(A, B)$  is:  $cap(A, B) = \sum_{e \text{ out of } A} c(e)$



# Network Flow\*

**Weak duality:** Let  $v$  be any flow, and let  $(A, B)$  be any  $s$ - $t$  cut. Then  $v \leq \text{cap}(A, B)$

**Strong duality**(Max-flow min-cut theorem) [Ford-Fulkerson 1956]: The value of the max flow is equal to the value of the min-cut.



# Network Flow\*

Algorithms for solving the max-flow / min-cut.

$n = |V|, m = |E|, m = \Omega(n)$

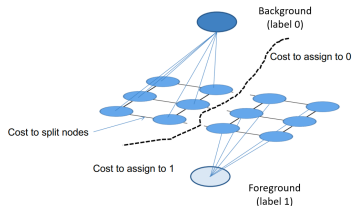
- 1 Edmonds–Karp(EK) algorithm:  $O(nm^2)$
- 2 Dinic:  $O(n^2m)$
- 3 Highest Label Preflow Push(HLPP):  $O(n^2\sqrt{m})$



# Network Flow\*

- 1 Bipartite (Perfect) Matching
- 2 Survey Design
- 3 Project Selection
- 4 Image Segmentation

Graph cuts segmentation



More details for applications and proofs: welcome to CS240!

