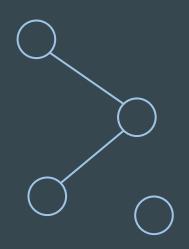
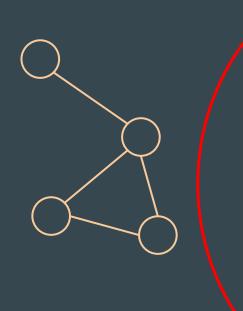


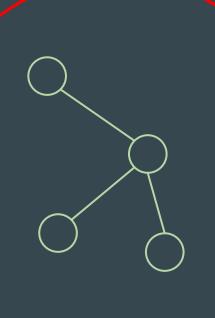
### Reminder: what is a tree?



acyclic graph



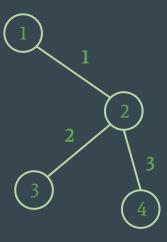
connected graph



tree = connected + acyclic

## Some properties of trees...

- A tree has N-1 edges for N vertices
- A tree is a connected & acyclic graph
- Remove any edge from the tree and it disconnects the graph
- In the general case vertice can have any degree
  - Some trees are more specific : binary trees, k-trees



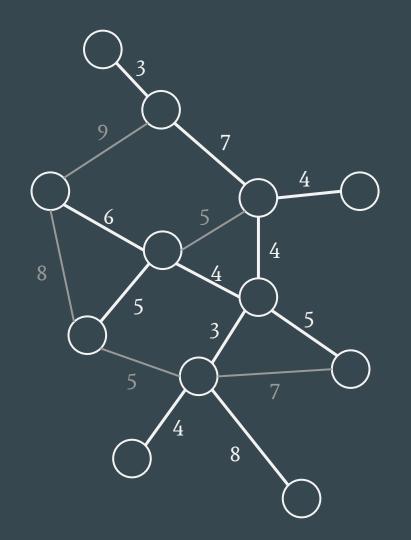
# Minimum spanning tree

We are given a connected graph with weighted edges

→ what is the minimum cost to connect all the nodes?

(on this graph: 53)

/!\ Multiple MST are possible



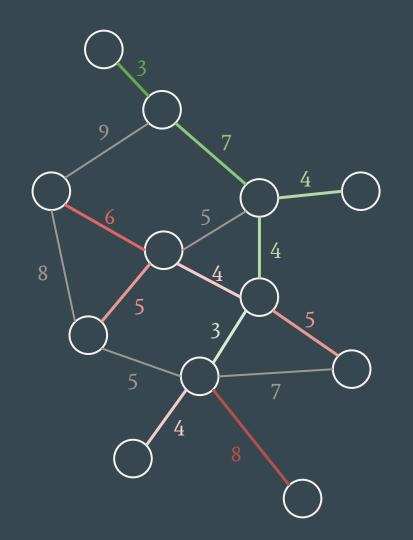
## Prim's algorithm

### Greedy algorithm:

- put a random starting node in the tree
- while the tree doesn't have all the nodes:
  - select the node closest to the tree
  - add the corresponding edge in the tree

Implemented with a heap (remember Dijkstra last week?)

 $\rightarrow$  Complexity : O(|V| + |E| log |E|) see hq op complexity) (on the right, from green to red, order of addition in the tree)



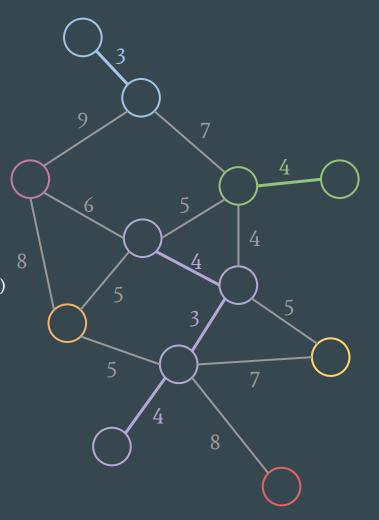
# Kruskal's algorithm

### Greedy algorithm:

- create a trivial forest (all nodes are alone)
- as long as we can, we use the smallest edge that creates a bridge between two trees

(on the right, example of a forest at some point during execution)

How to avoid making cycles?

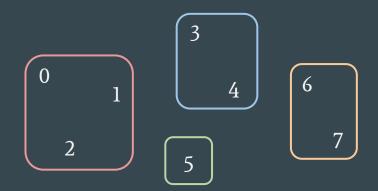


## Disjoint sets (union-find d.s.)

We need a data structure to store disjoint sets with the following near-constant-time operations:

- add a new set
- merge two sets
- determine whether two
  elements are in the same set

Naive idea: let's use a list of sets



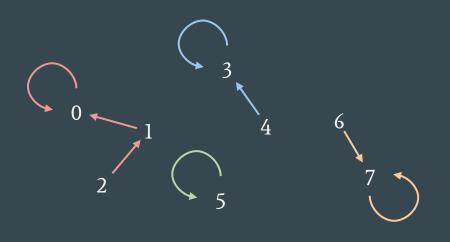
$$[\{0,1,2\}, \{3,4\}, \{5\}, \{6,7\}]$$

Add a new set	0(1)
Merge two sets	0(n)
Determine whether 2 elements are in the same set	0(n)

# Disjoint sets (union-find d.s.)

#### Better idea: let's use a forest

- each node has a parent, the root of every tree is its own parent
- to merge two sets, point the root node of a set to any node of the other (you will usually use the *find* operation before, to check if the two sets are disjoint or the same)
- to determine whether 2 elements are in the same set, find the roots of their trees and compare them



{0:0,	1:0,	2:1,	3:3,
4:3,	5:5,	6:7,	7:7}

Add a new set	0(1)
Merge two sets	0( s <sub>1</sub>  + s <sub>2</sub>  )
Determine whether 2 elements are in the same set	0( s <sub>1</sub>  + s <sub>2</sub>  )

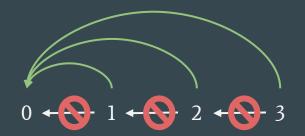
## Disjoint sets (union-find d.s.)

How to improve complexity?

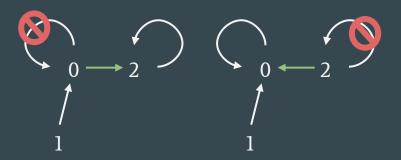
- $\rightarrow$  try to have shallow trees
- → this is achieved with *union by rank* (or *by size*) and *path compression* (or path *halving* or *splitting*)

Add a new set	0(1)
Merge two sets	0(α(n)) *
Determine whether 2 elements are in the same set	O(α(n)) *

<sup>\*</sup>  $\alpha(n)$  < 5 for any n that can be written in this physical universe, so that's basically O(1) (see inverse Ackermann function)



path compression on the path from a node to its root during a *find* operation



arbitrary union (left) VS *union by rank* (right)

### **Union-find in Python**

- Bad news: this structure isn't implemented by default in Python
- Good news: Louis Sugy <u>made a library</u> for us 3 years ago! (if lazy, just do pip install unionfind)
- Create a Union-find data structure with O(1) approximate complexities
- Use find(element) to get the root of an element
- Use union(el, e2) to merge the sets containing el and e2
- Use is\_same\_set(e1, e2) to determine whether e1 and e2 are in the same set

### Back to Kruskal

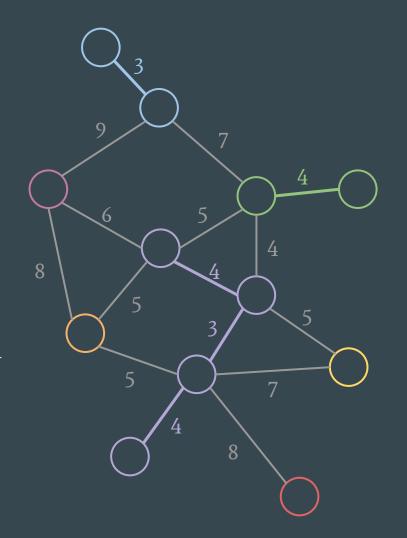
### Greedy algorithm:

- create a trivial forest (all nodes are alone)
- as long as we can, we use the smallest edge that creates a bridge between two trees

### Complexity?

 $\rightarrow$  0(|E| log |E|) with an optimized Union-Find data structure and a heap to select the next edge

Note: Bernard Chazelle has found a  $O(|E|\alpha(m,n))$  solution based on soft heaps, but that's a story for another time



### **Credits**

Slides: Louis Sugy for INSAlgo

Edited in 2022 by Goll Sebastien and in 2023 by Lecorché Adriaan

#### Thanks to:

- Cormen, Thomas H.; Leiserson, Charles E.; Rivest, Ronald L.; Stein, Clifford (2009) [1990]. *Introduction to Algorithms* (3rd ed.), chapter 23
- Wikipedia