

# CS 344: Design and Analysis of Computer Algorithms

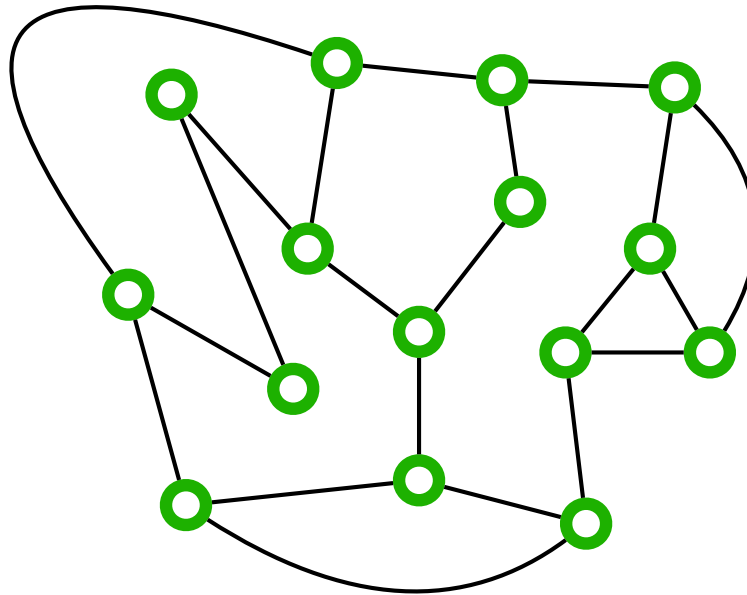
(Spring 2022 — Sections 5,6,7,8)

## Lecture 17: Minimum Spanning Trees: The Generic “Algorithm”

# The Minimum Spanning Tree Problem

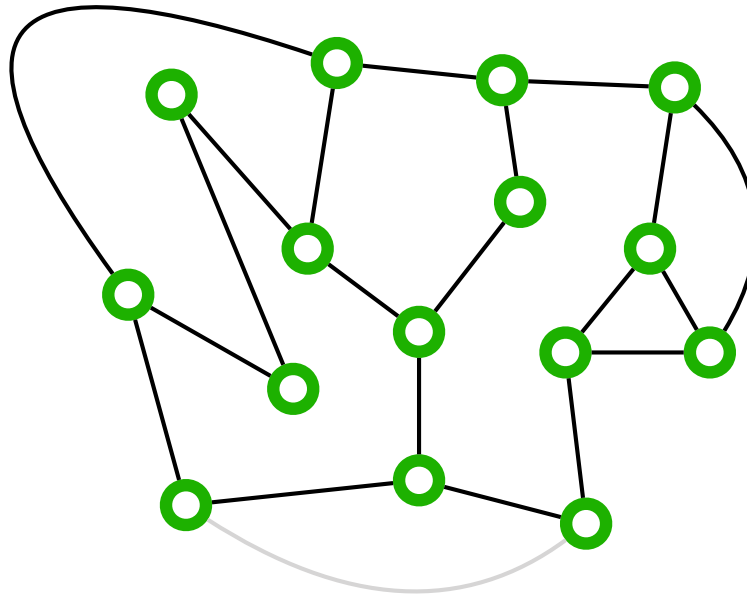
# Spanning Tree

- For a connected graph  $G = (V, E)$ , what is a minimal subset of edges of  $G$  we can pick that it still remains connected?



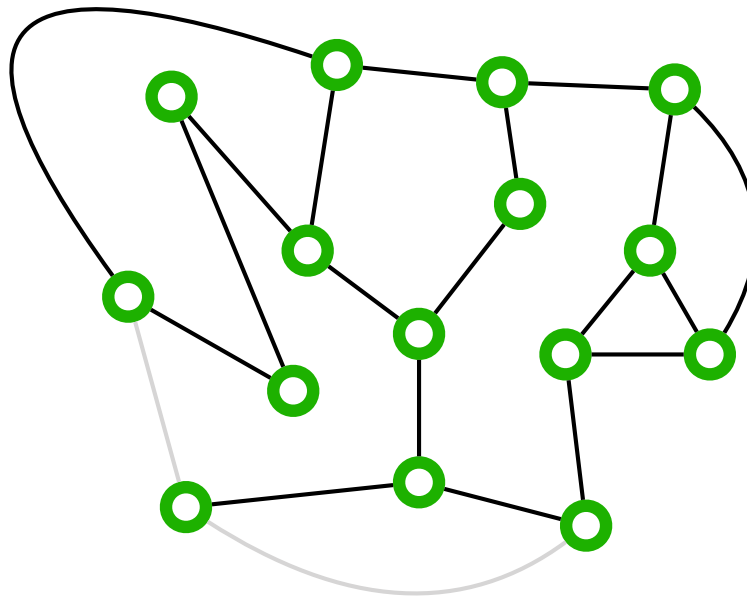
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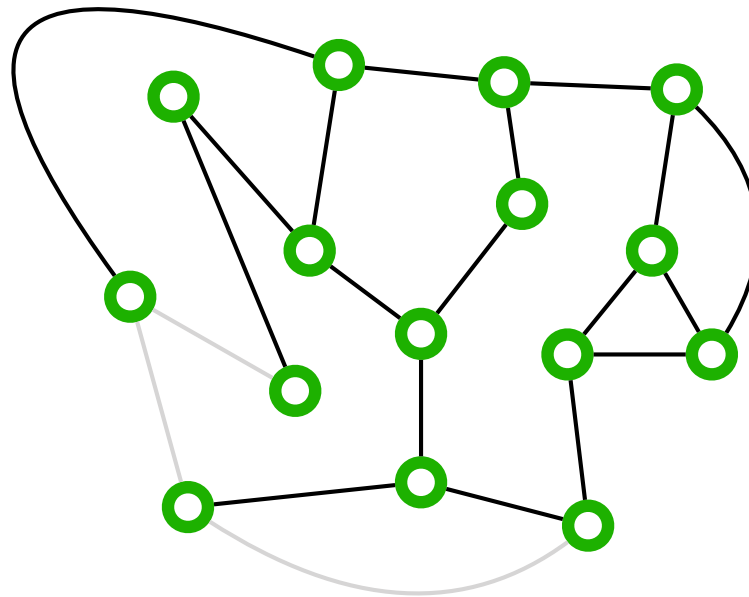
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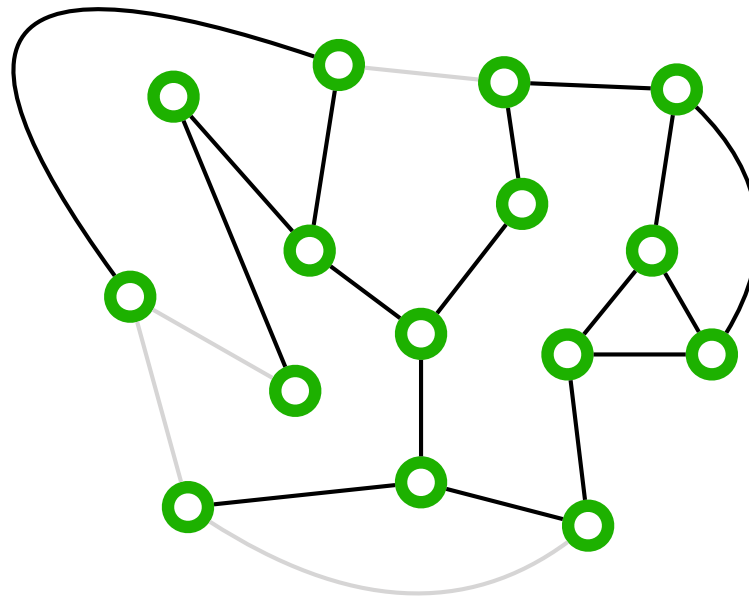
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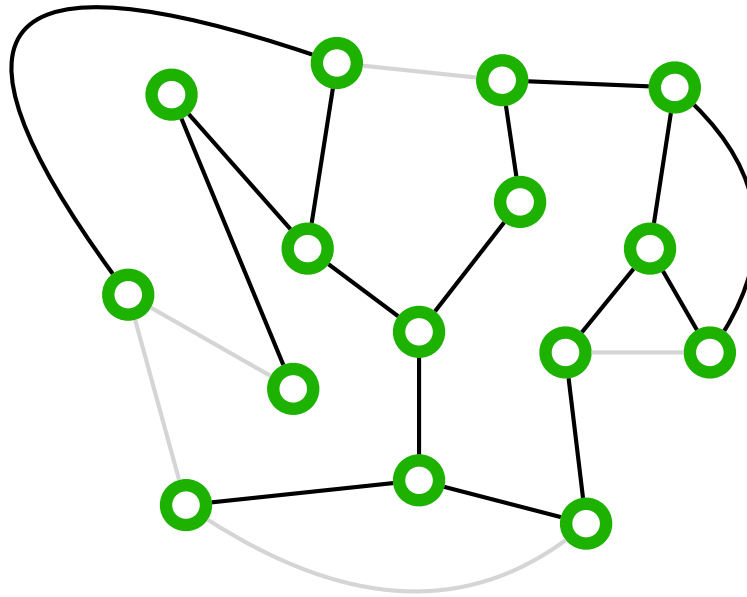
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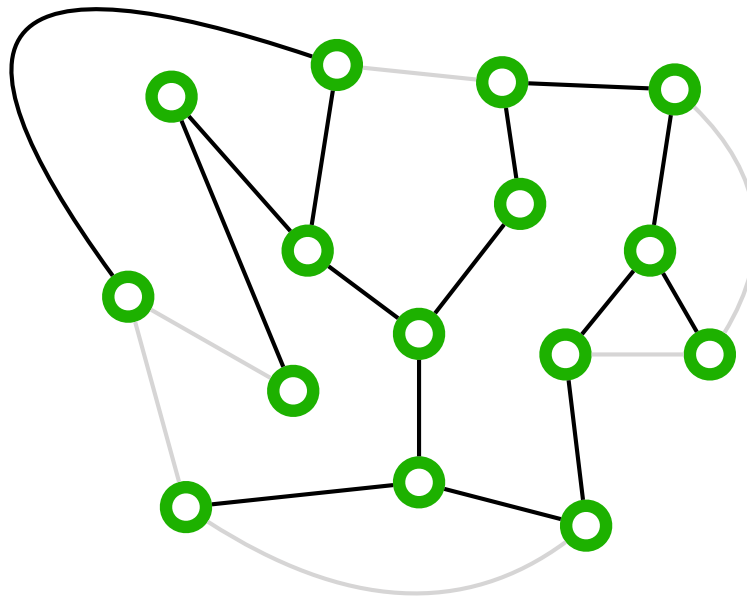
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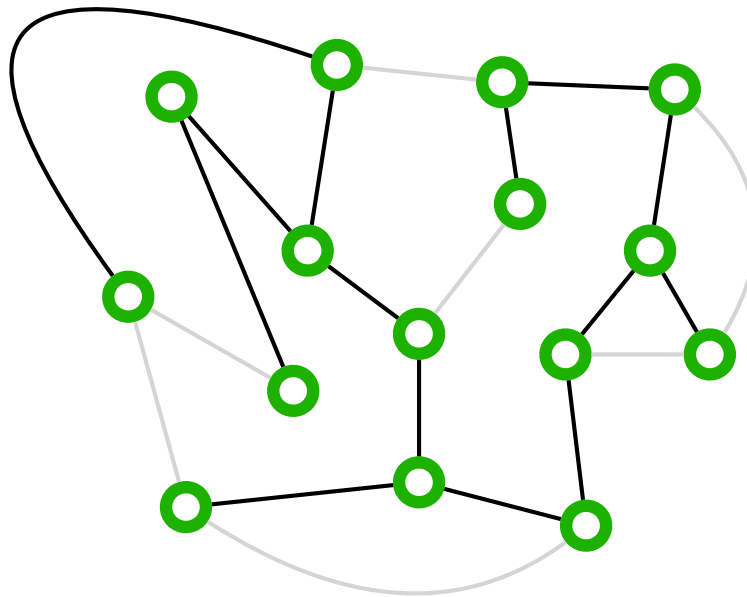
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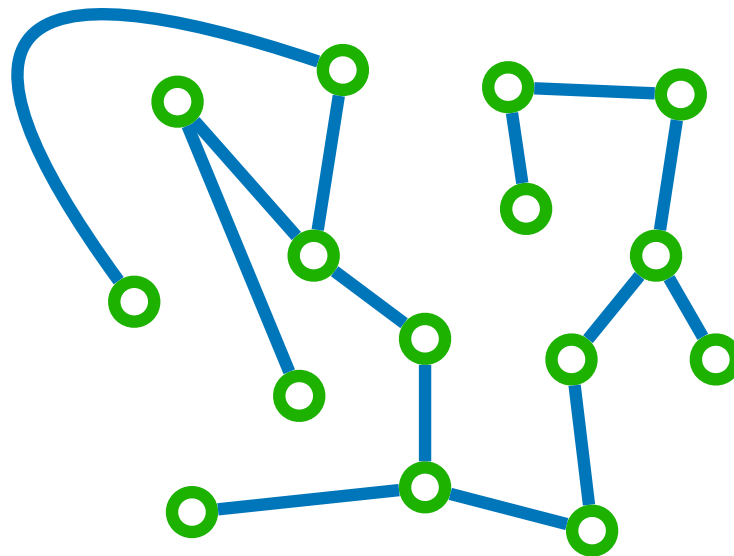
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# Spanning Tree

- For a connected graph  $G = (V, E)$ , what is a minimal subset of edges of  $G$  we can pick that it still remains connected?
- As long as there is a **cycle** in the graph, we can remove **any arbitrary edge** of the cycle
- We get a connected graph with no cycle: this is called a **tree**
  - Every tree has exactly  $n - 1$  edges
- **Spanning tree**: a **subgraph** of  $G$  on all vertices which is a tree

# The Minimum Spanning Tree Problem

- **Input:**

- An undirected connected graph  $G = (V, E)$
- Positive weights on edges of  $G$ : edge  $e$  has weight  $w_e > 0$

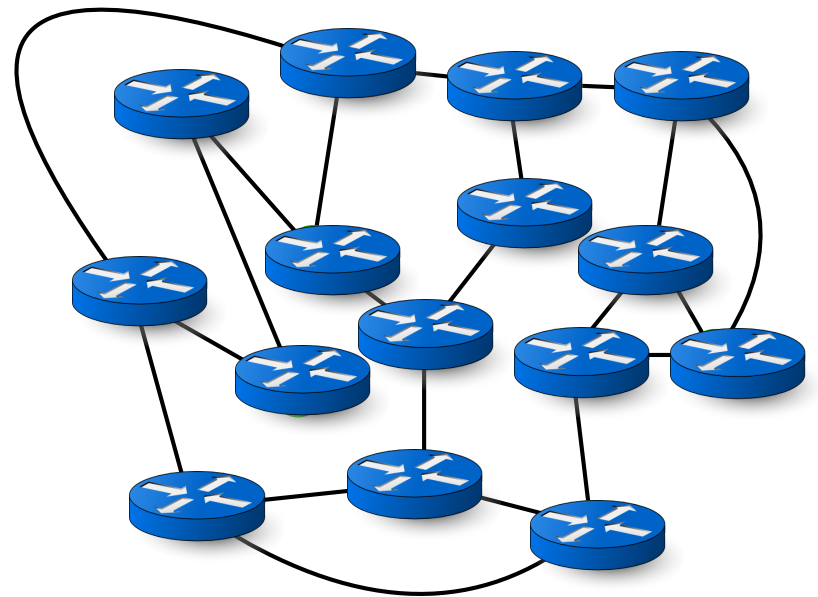
- **Output:**

- A spanning tree  $T$  in  $G$  with minimum weight

- Weight of  $T = \sum_{e \in T} w_e$

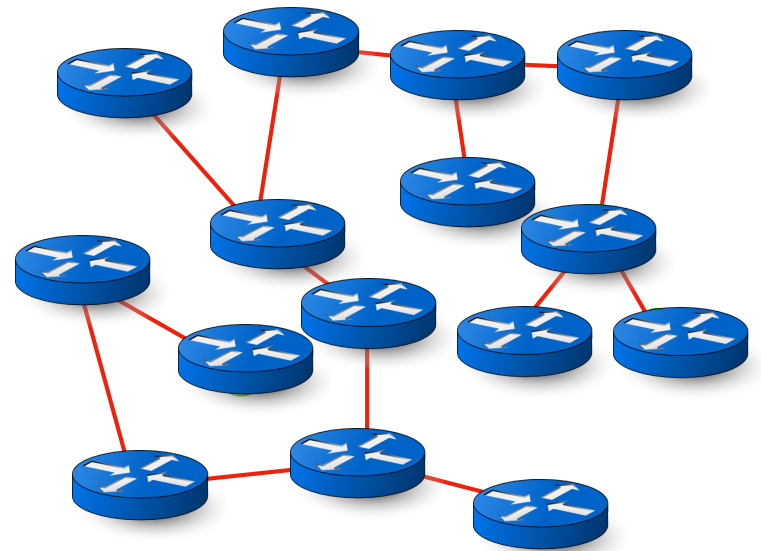
# Example

- A collection of switches in a computer network
- Pick a minimum cost way of connecting all switches together



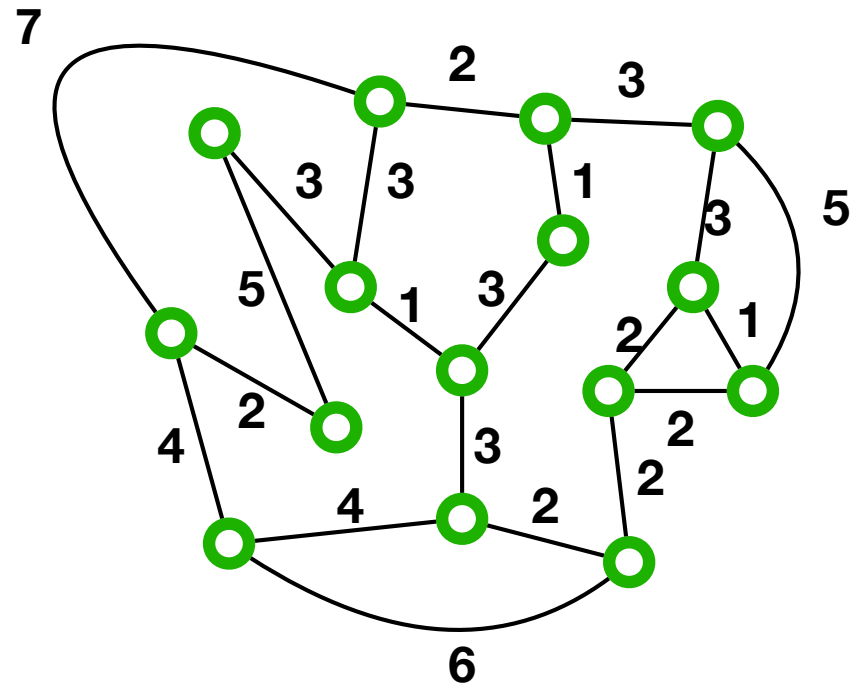
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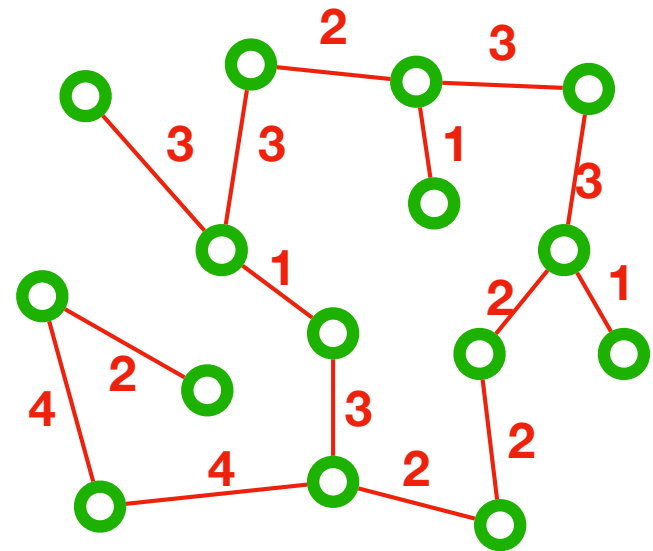
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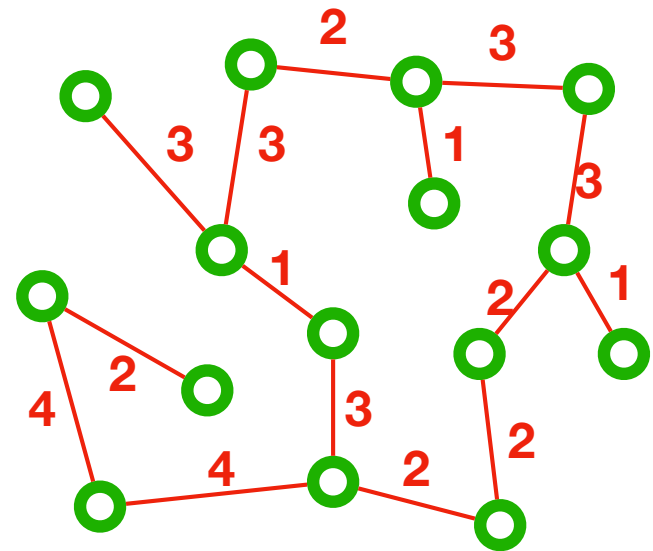


# Example

- A collection of switches in a computer network
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- Total weight is:

- $3 \cdot 1 + 5 \cdot 2 + 5 \cdot 3 + 2 \cdot 4 = 36$



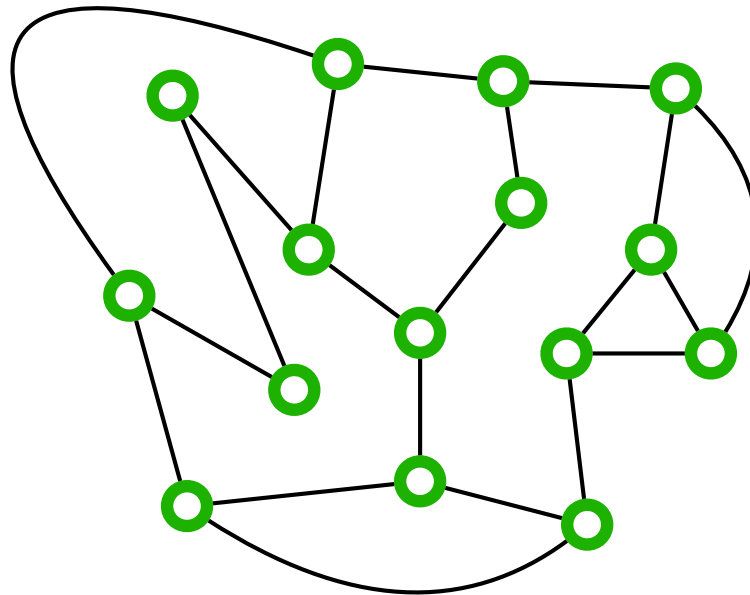
# Detour: Graph Cuts

# Graph Cuts

- A highly helpful notion when working with graphs
- Specially for designing algorithms related to “connectivity”

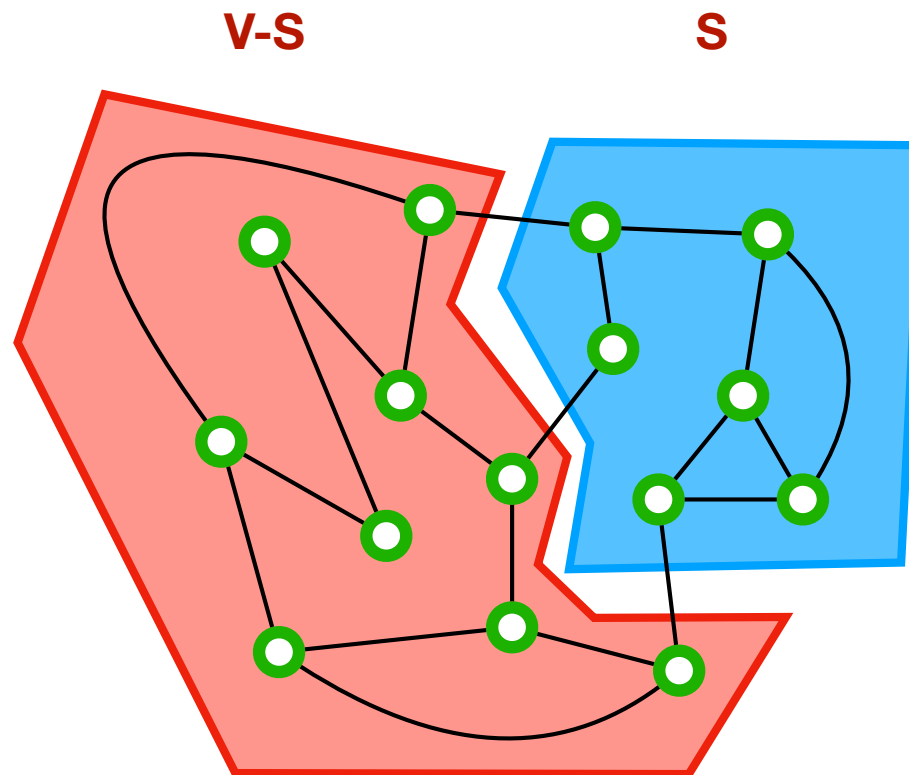
# Graph Cuts

- A cut is partition of vertices into two **non-empty** sets **S** and **V - S**



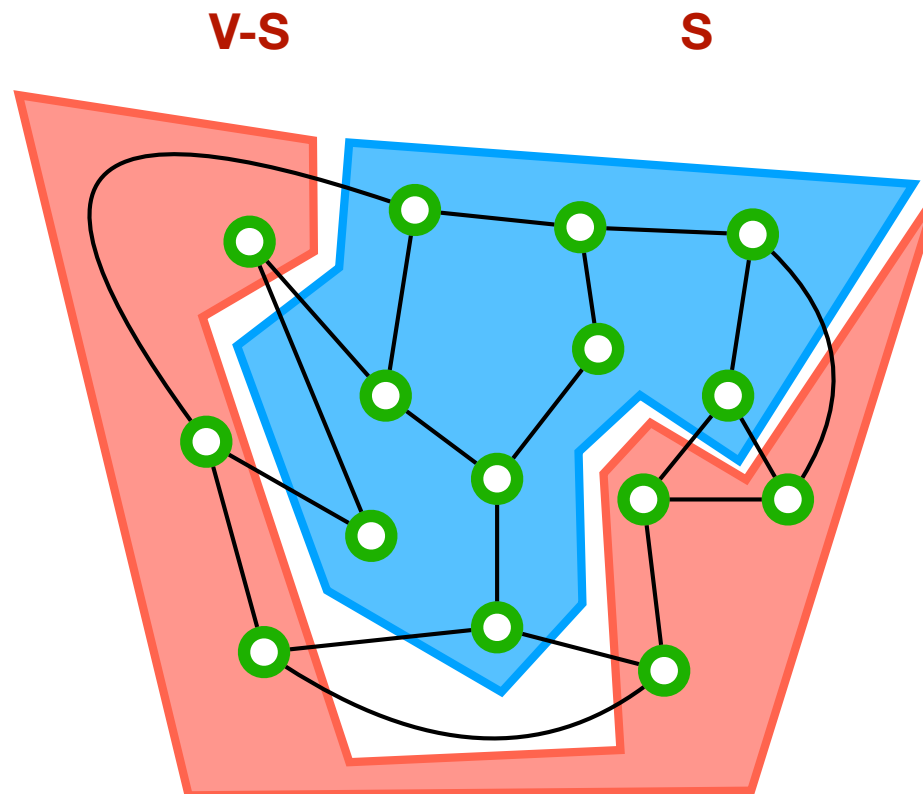
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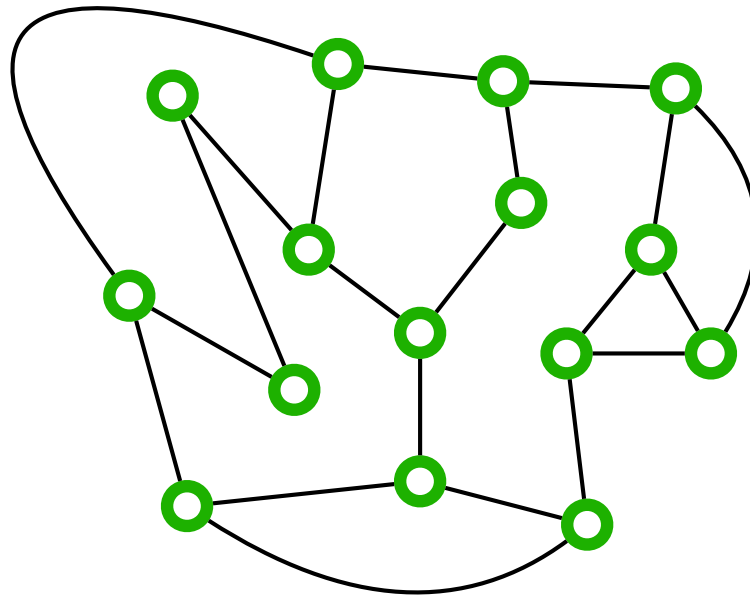
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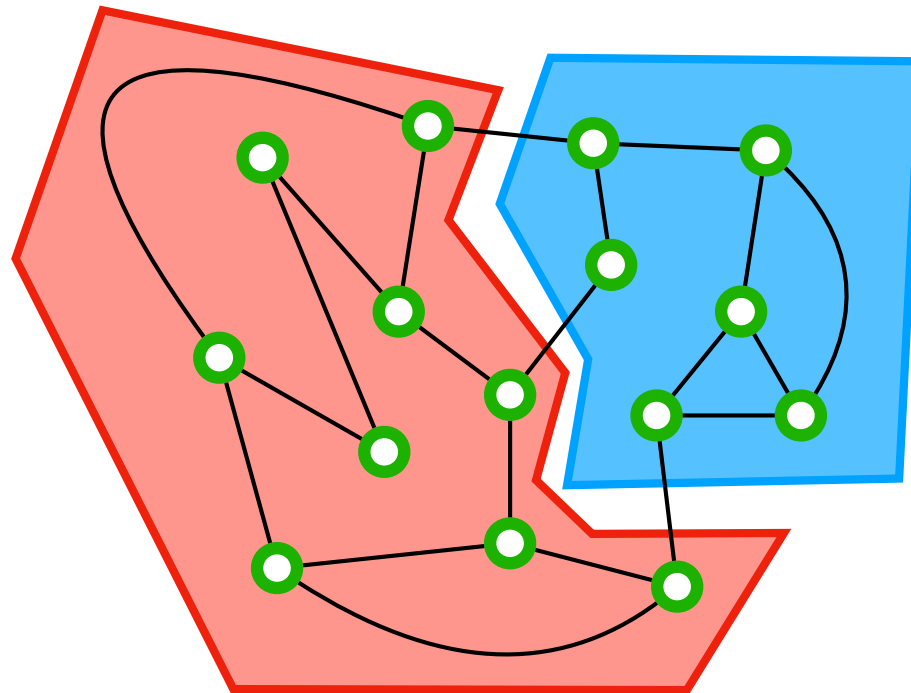
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- **Cut edge**: any edge between **S** and **V-S**





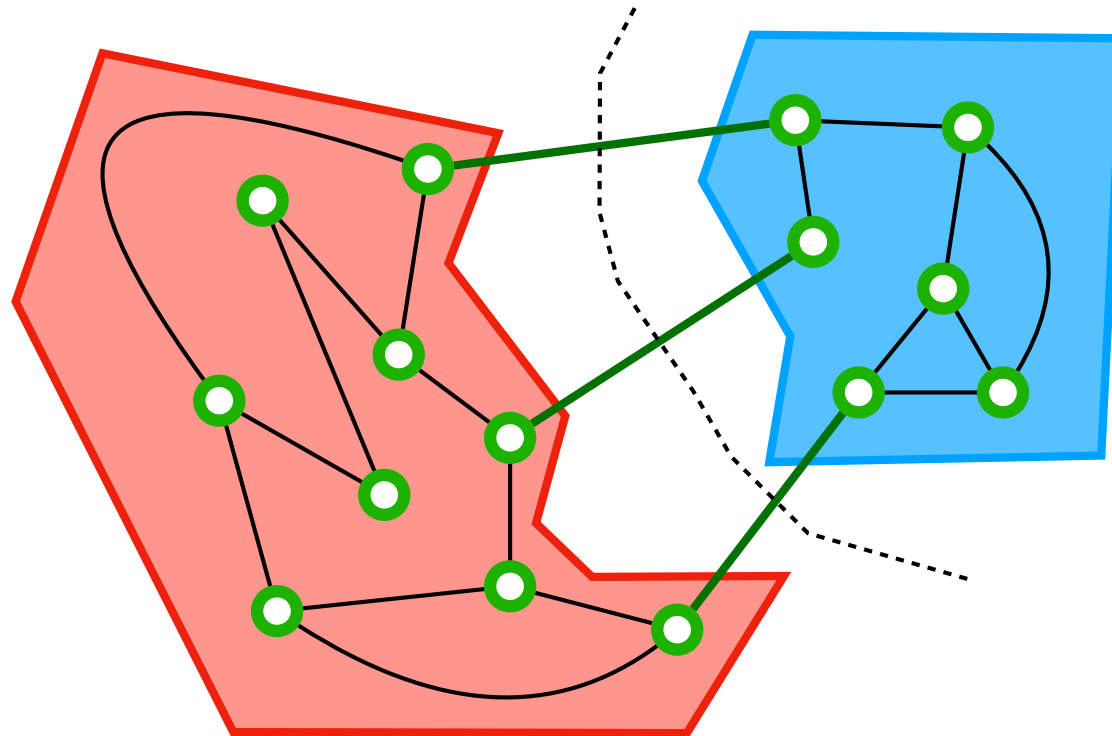
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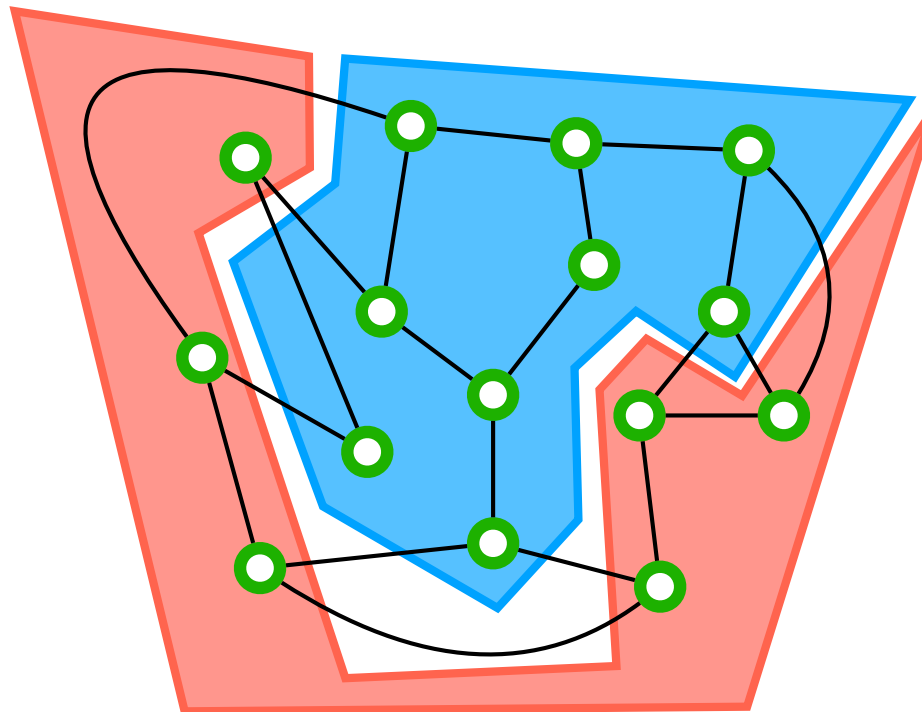
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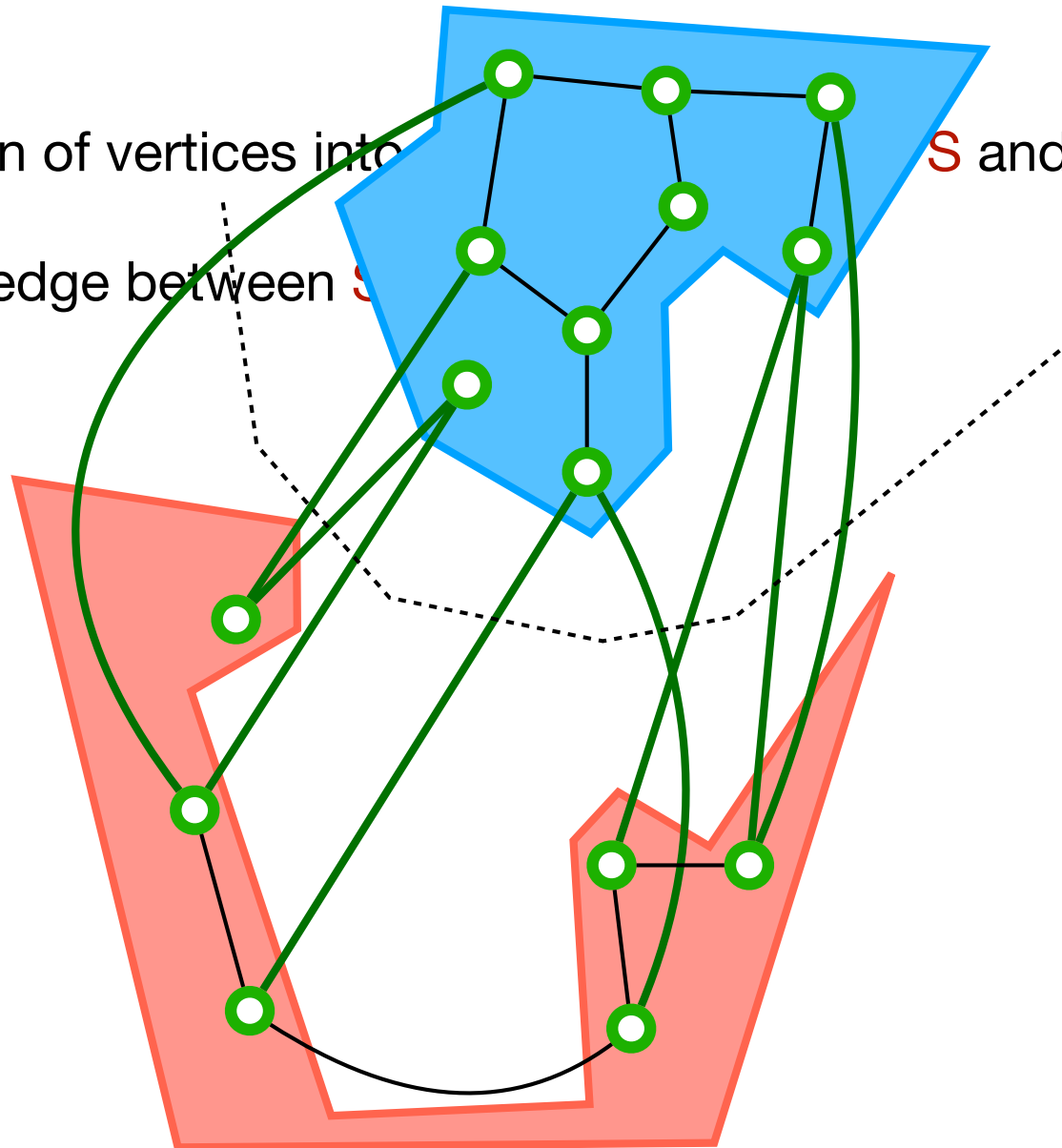
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# Graph Cuts

- A cut is partition of vertices into two non-empty sets  $S$  and  $V - S$
- Cut edge: any edge between  $S$  and  $V - S$
- We use  $\delta(S)$  to denote the set of all cut edges

# Exercise with Graph Cuts

- How many different cuts are in a graph?

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- Number of cut edges in a singleton cut  $(\{v\}, V - \{v\})$ ?  $\deg(v)$

# Exercise with Graph Cuts

- An undirected graph  $G=(V,E)$  is **connected** if and only if for every cut  $(S,V-S)$  in  $G$ , there is **at least one cut edge**, i.e.,  $|\delta(S)| > 0$

# Exercise with Graph Cuts

- Let  $(S, V-S)$  be a cut with no cut edges in a graph  $G$ . Then, if we add any edge  $e$  to this cut,  $G+e$  will not have a cycle

# A Generic “Algorithm” for MST

# Algorithm Design Process

- What is the problem?
  - How do we solve it?
  - Why our solution is correct?
  - How efficient is our solution?
- 
- We will see a great example of this process in designing algorithms for the MST problem

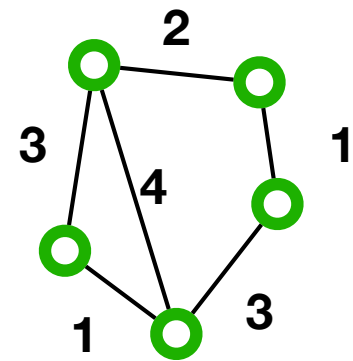
# A Meta-Algorithm (“Algorithm”)

- A high level strategy to solve the MST problem
- Less detailed and precise than an actual algorithm
- So we call it a meta-algorithm
  - A rather made-up term with no precise definition

# Some Definitions

- Forest:
  - Any subgraph of a tree
- MST-good forest:
  - A forest that is a subgraph of some MST of the input graph
- Safe edge for an MST-good forest  $F$ 
  - An edge  $e$  is safe for  $F$  if  $F \cup \{e\}$  is another MST-good forest

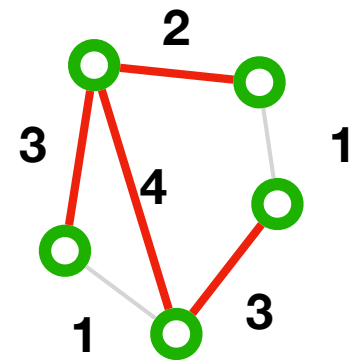
# Illustration





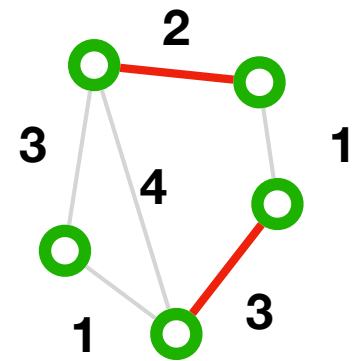
# Illustration

- Forest



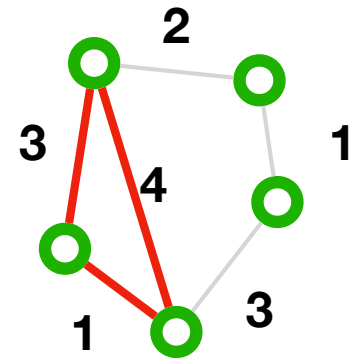
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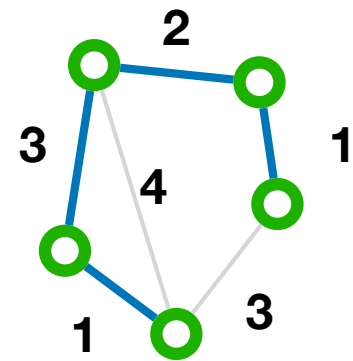
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- NOT a forest



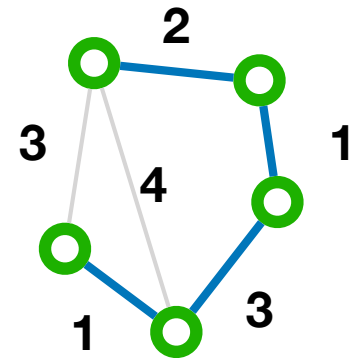
# Illustration

- One MST



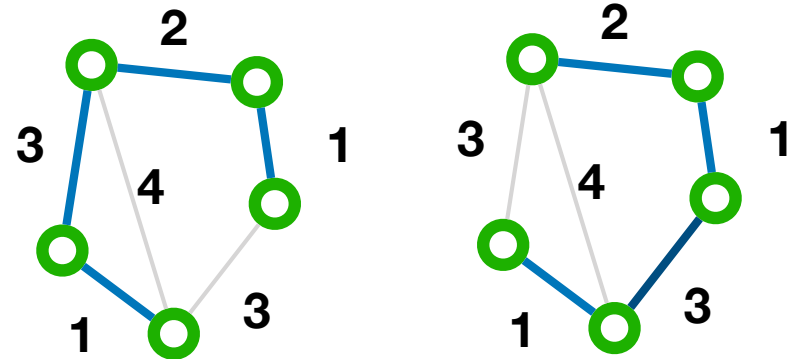
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- Another MST



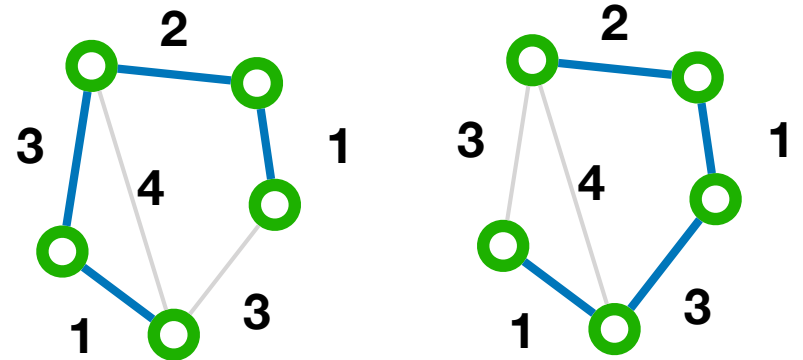
# Illustration

- All MSTs of the input graph

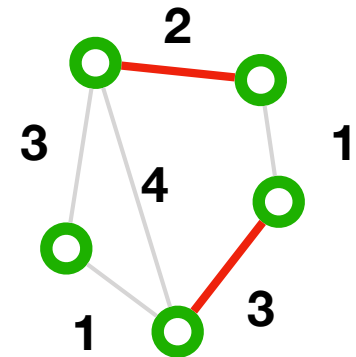


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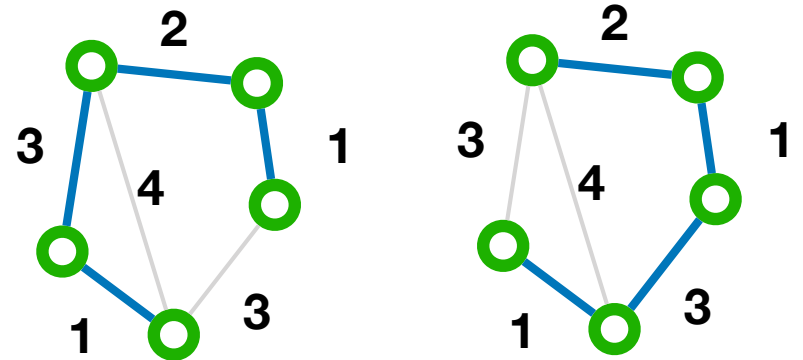


- An MST-good forest

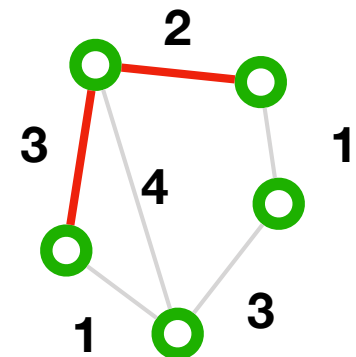


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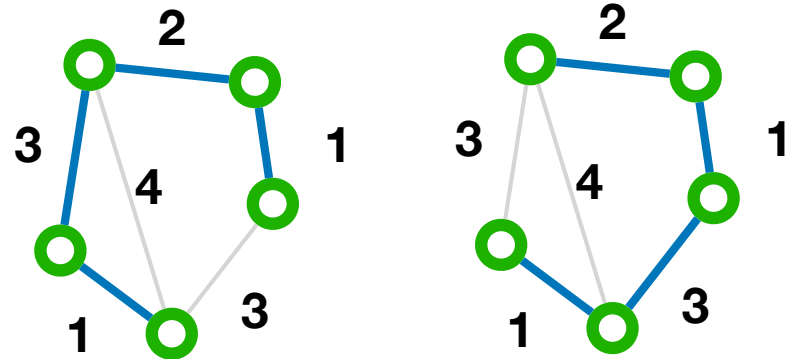
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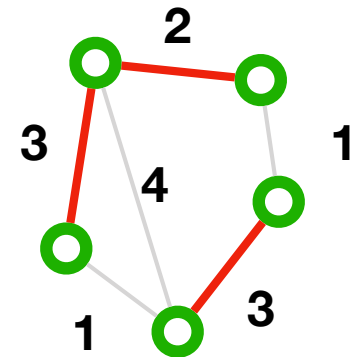


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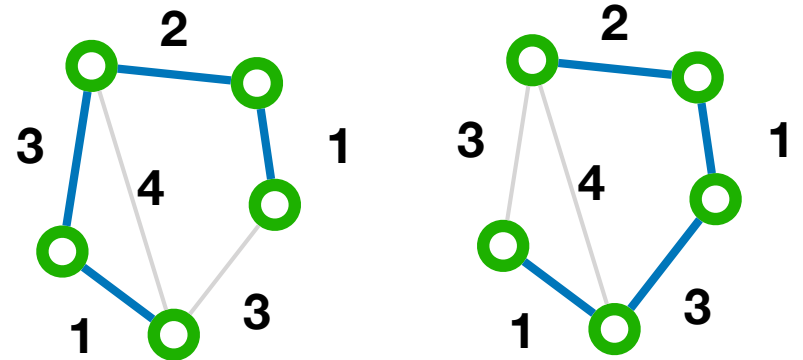


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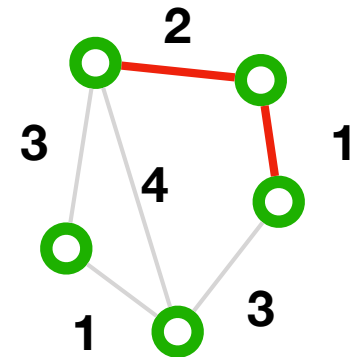


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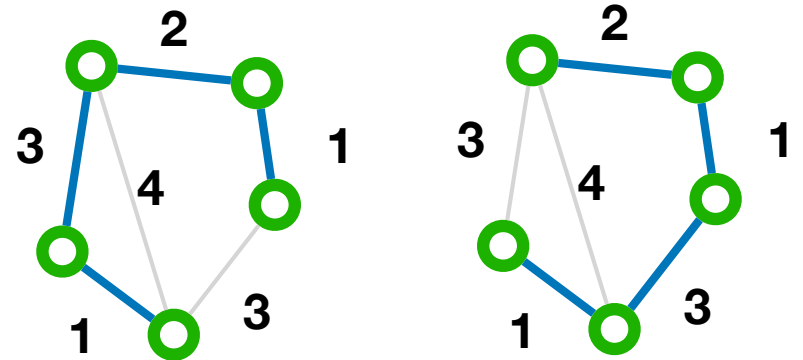


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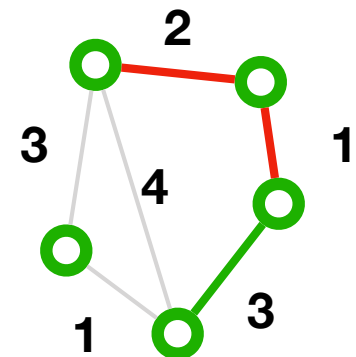


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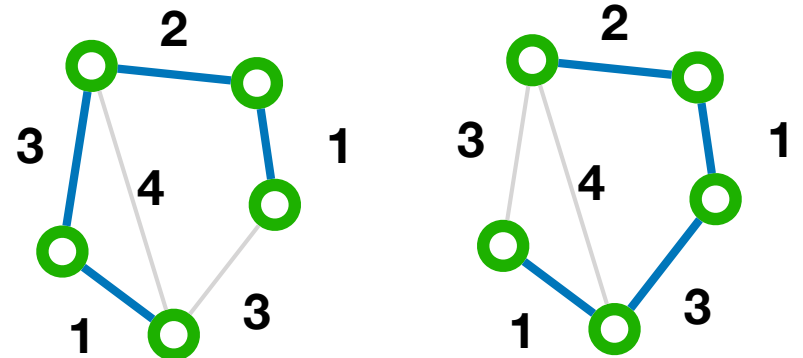


- An MST-good forest
  - A safe edge for this forest

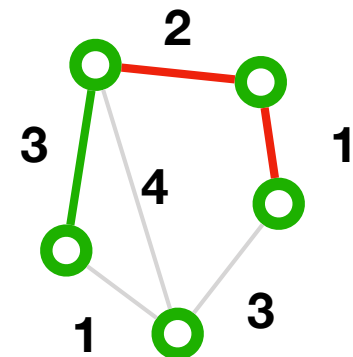


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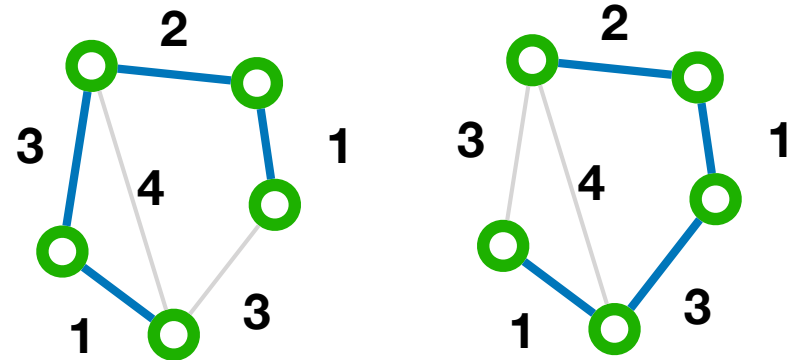


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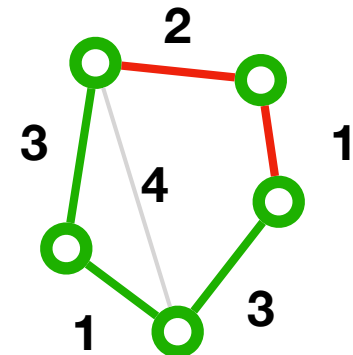


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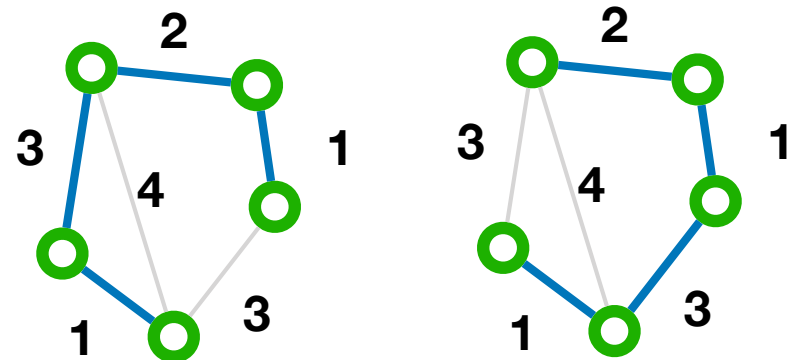


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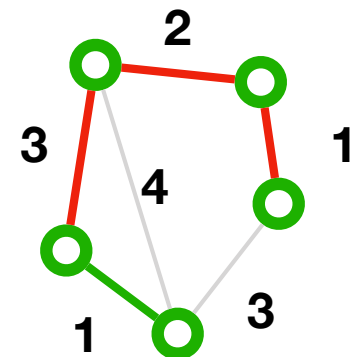


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# A Generic Meta-Algorithm

- Let  $F = \emptyset$  be an empty forest initially
- For  $i = 1$  to  $n-1$  steps:
  - Find a safe edge  $e$  for the current forest  $F$
  - Update  $F = F + e$
- Output the final  $F$  as an MST

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# Proof of Correctness

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- We should now find a way of finding safe edges

# An Approach for Finding Safe Edges

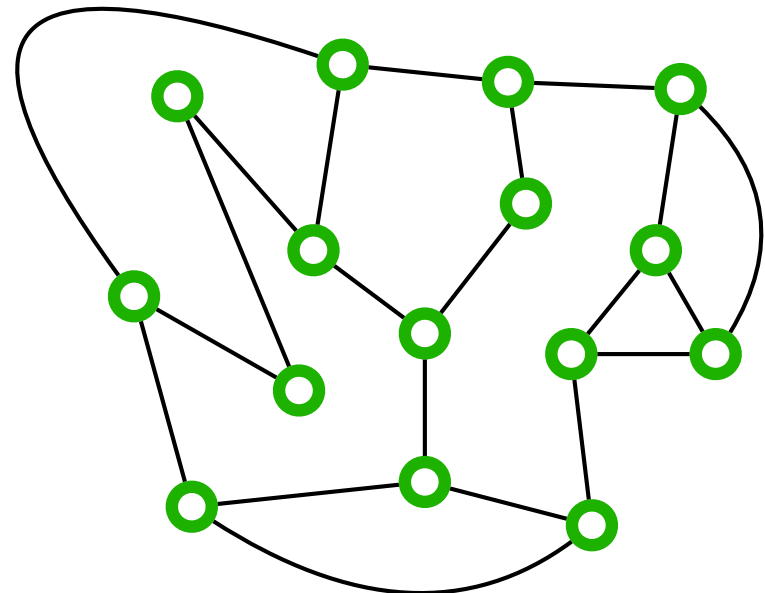
- **Theorem:**

- Suppose  $F$  is MST-good but not a tree yet
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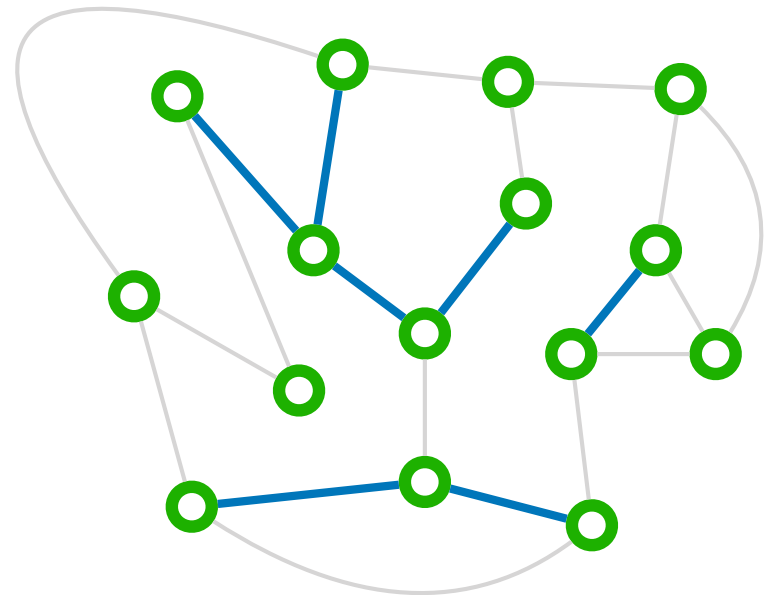
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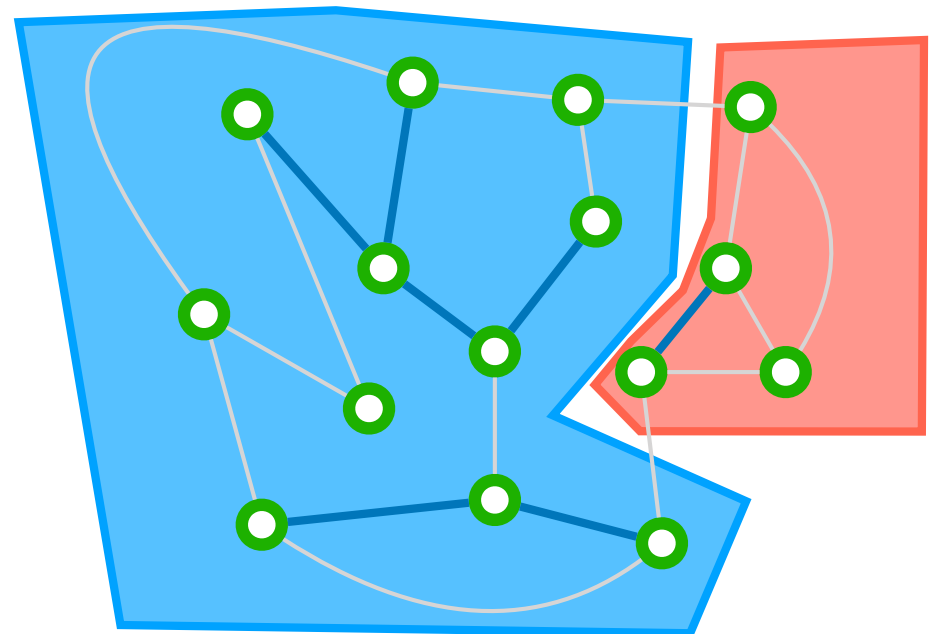
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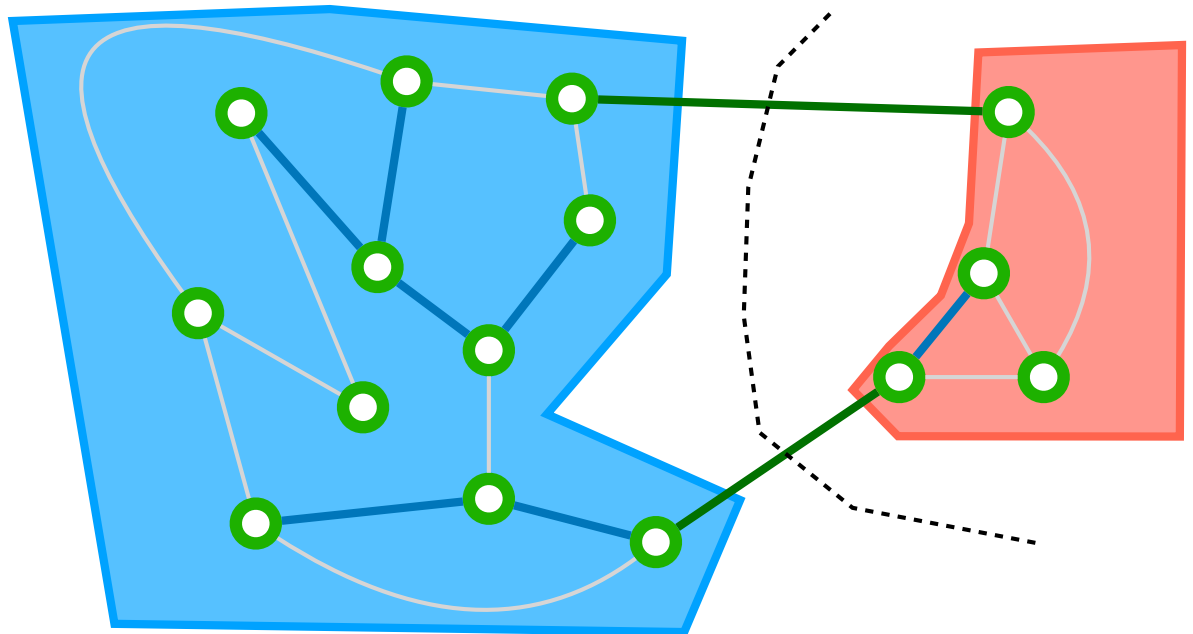
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# Proof