

Data Structures and Algorithms

(CS210A)

Lecture 35

- A new algorithm design paradigm: Greedy strategy
part II

Continuing Problem from last class

JOB Scheduling

Largest subset of non-overlapping job

A job scheduling problem

Formal Description

INPUT:

- A set J of n jobs $\{j_1, j_2, \dots, j_n\}$
- job j_i is specified by two real numbers
 - $s(i)$: start time of job j_i
 - $f(i)$: finish time of job j_i
- A single server

Constraints:

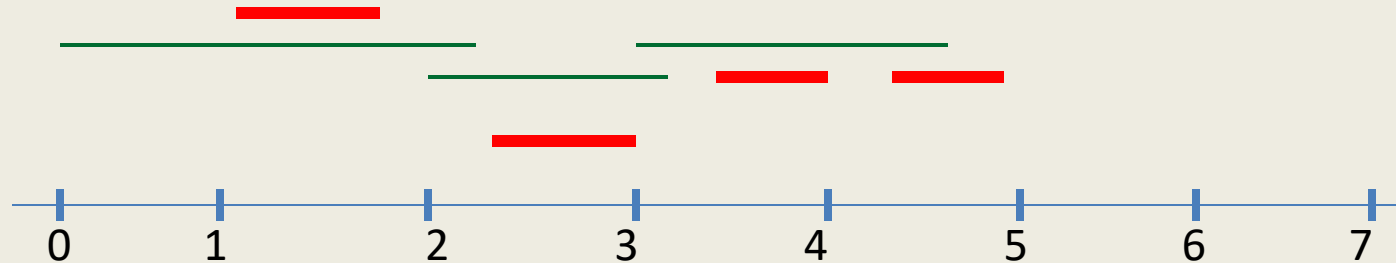
- Server can execute at most one job at any moment of time and a job.
- Job j_i , if scheduled, has to be scheduled during $[s(i), f(i)]$ only.

Aim:

To select the **largest** subset

Designing **algorithm** for the problem

Strategy 4: Select the job with **earliest finish time**



Intuition:

Selecting such a job will **free** the server **earliest**

➔ hence more no. of jobs might get scheduled.

Algorithm “earliest finish time”

Proof of correctness ?

Let $x \in J$ be the job with earliest finish time.

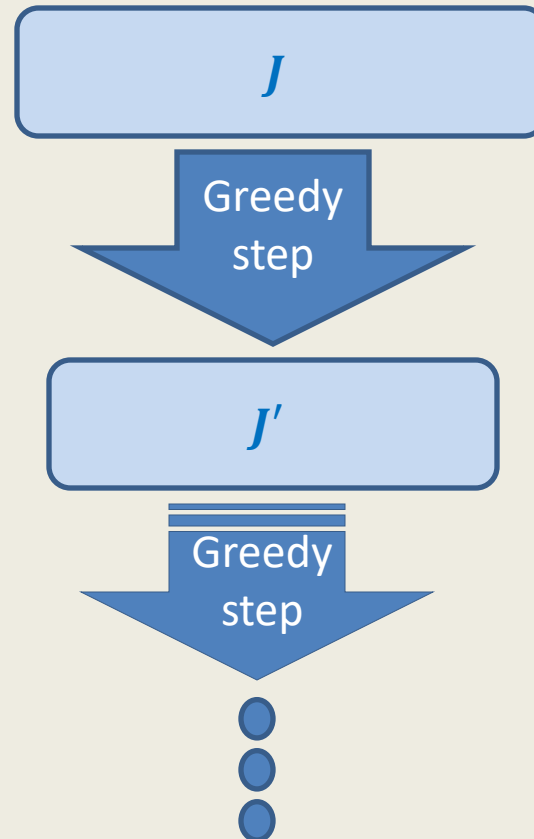
Let $J' = J \setminus \text{Overlap}(x)$

Algorithm (Input : set J of n jobs.)

1. Define $A \leftarrow \emptyset$;
2. **While** $J \neq \emptyset$ **do**
 { Let $x \in J$ has earliest finish time;
 $A \leftarrow A \cup \{x\}$;
 $J \leftarrow J \setminus \text{Overlap}(x)$;
 }
3. Return A ;

Lemma1 (last class):

There exists an optimal solution for J containing the **earliest finish time** job.



Algorithm “earliest finish time”

How to prove it ?

proof by contradiction

Proof of correctness ?

Let $x \in J$ be the job with earliest finish time.

Let $J' = J \setminus \text{Overlap}(x)$

$\text{Opt}(J)$

Lemma 1

$\text{Opt}(J')$

$$\text{Opt}(J) = \text{Opt}(J') + 1$$

J

Greedy
step

J'

Greedy
step

Notation:

$\text{Opt}(J)$:

Theorem: $\text{Opt}(J) = \text{Opt}(J') + 1.$

- Proof has two parts

$$\text{Opt}(J) \geq \text{Opt}(J') + 1$$

$$\text{Opt}(J') \geq \text{Opt}(J) - 1$$



Try to give a physical interpretation to these inequalities.

- Proof for each part is a proof **by construction**

Algorithm “earliest finish time”

Proving $\text{Opt}(J) \geq \text{Opt}(J') + 1$.

Observation: start time of every job in J' is greater than finish time of x .

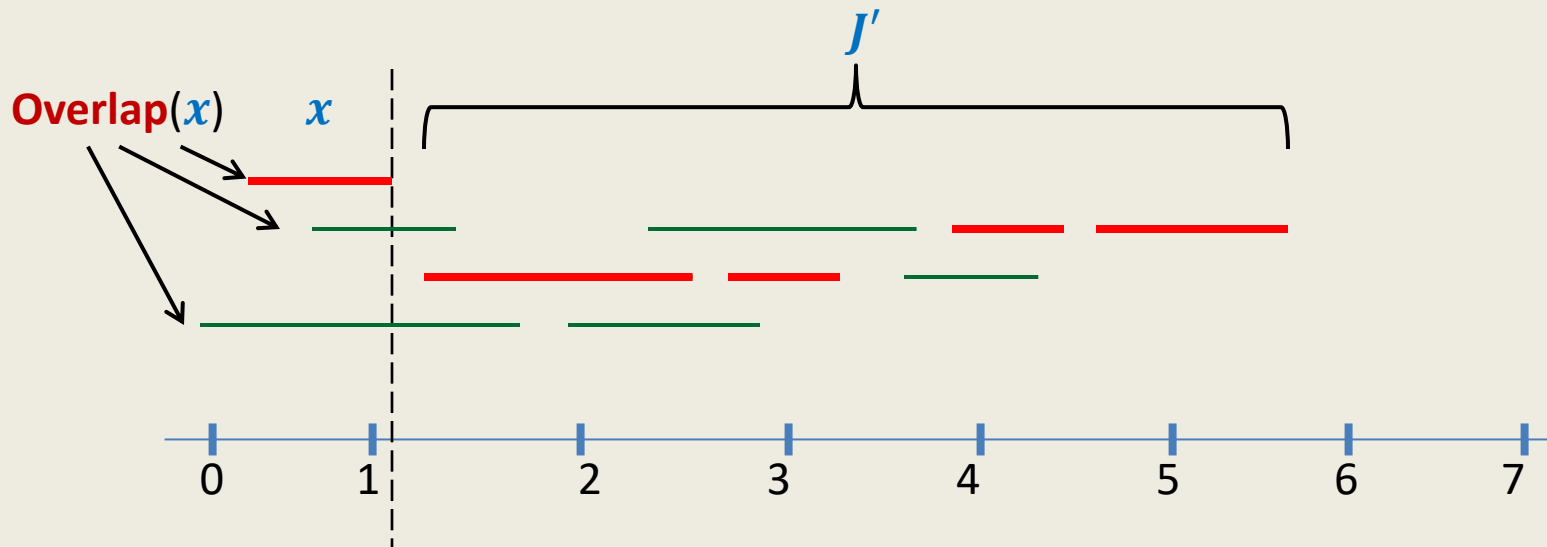
Let O' be any optimal solution for J' .

None of the jobs in

From an optimal solution of J'

Hence $O' \cup \{x\}$ is a

Therefore $\text{Opt}(J) \geq |O'| + 1$



Algorithm “earliest finish time”

Lemma1 (last class): There exists an optimal solution for J in which x is present.

Let O be an optimal solution for J containing x .

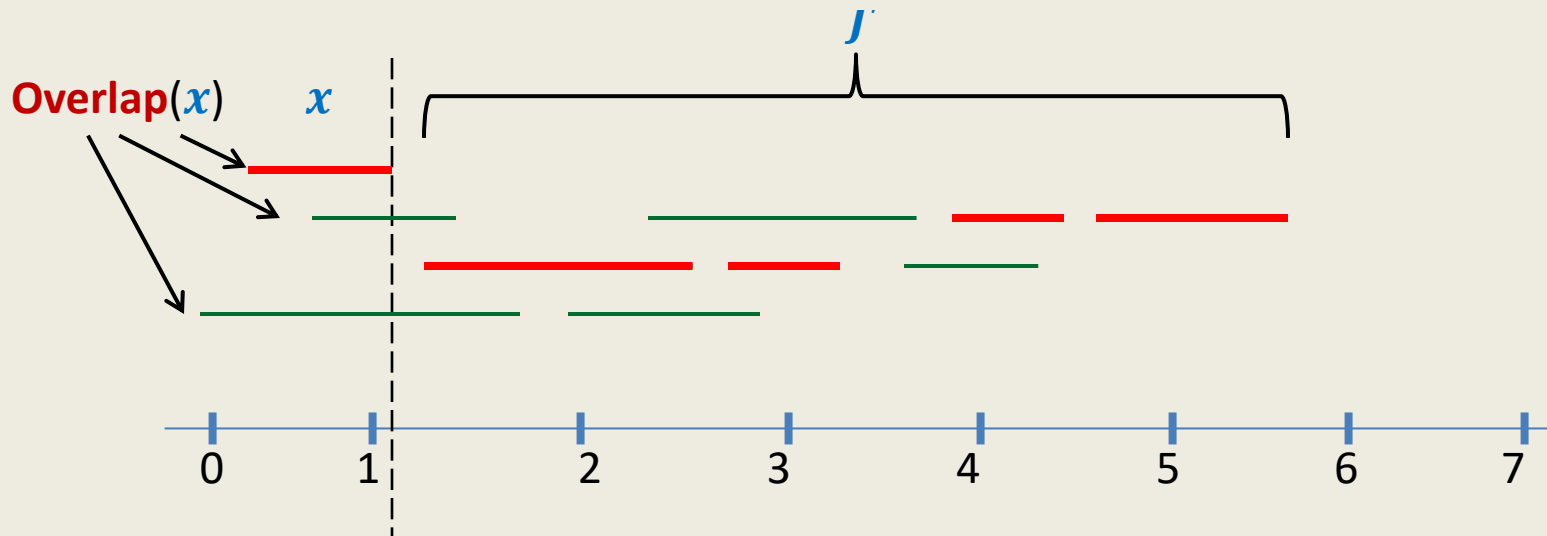
None of the jobs in O overlaps with x .

→ Every job from O

From an **optimal solution** of J
can you derive a solution for J' with one job less?

Hence $O \setminus \{x\}$ is a subset of non-overlapping jobs from J .

Therefore $\text{Opt}(J') \geq |O| - 1$:



Theorem:

Given any set J of n jobs,
the algorithm based on “**earliest finish time**” approach
computes the largest subset of non-overlapping job.

$O(n \log n)$ implementation of the Algorithm

This is not the only way to achieve $O(n \log n)$ time. Many students gave multiple solutions (even simpler than this) in the class.
Kudos to them! 😊

Algorithm (Input : set J of n jobs.)

1. Define $A \leftarrow \emptyset$;

2. While $J \neq \emptyset$ do

{ Let $x \in J$ have earliest finish time;

$A \leftarrow A \cup \{x\}$;

$J \leftarrow J \setminus \text{Overlap}(x)$;

}

3. Return A ;

Maintain a **binary min-heap** for J based on **finish time** as the key.

Sort J in increasing order of **start time**.

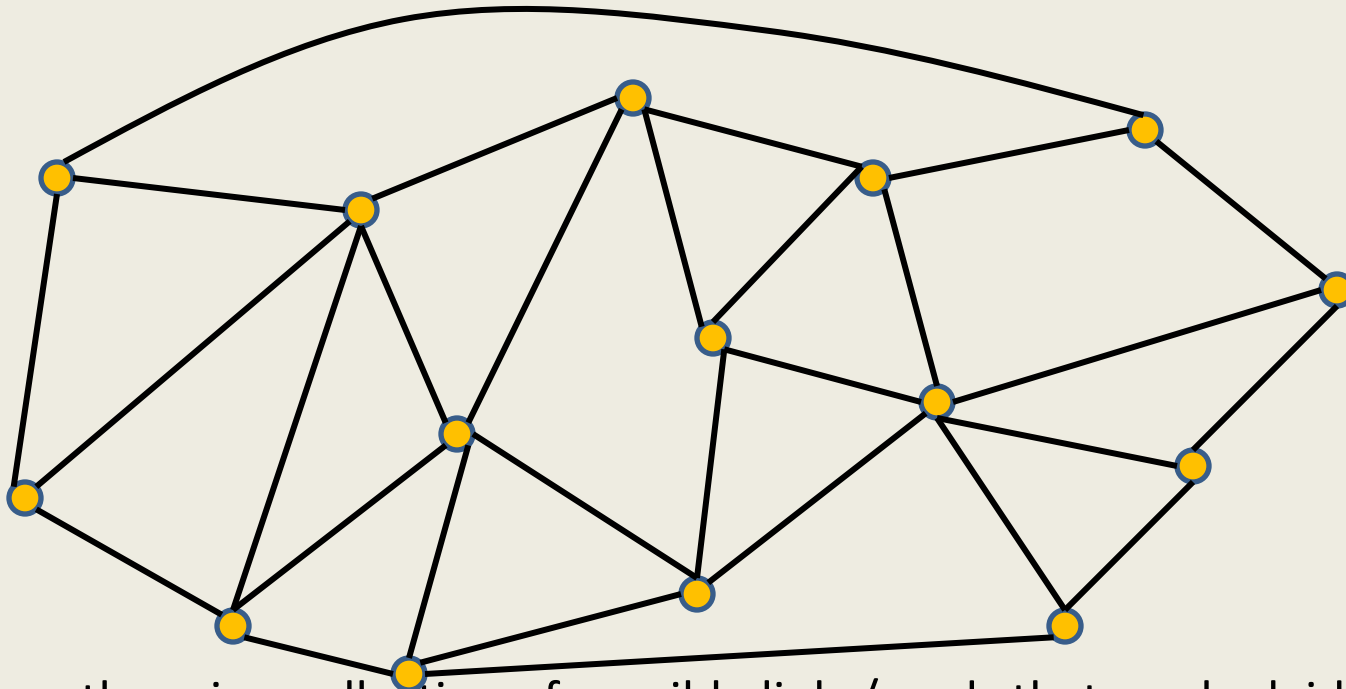
→ $O(n^2)$ time complexity is obvious

Problem 2

First we shall give motivation.

Motivation:

A road or telecommunication network



Suppose there is a collection of possible links/roads that can be laid.
But laying down each possible link/road is costly.

Aim: To lay down **least number** of links/roads to ensure **connectivity** between each pair of nodes/cities.

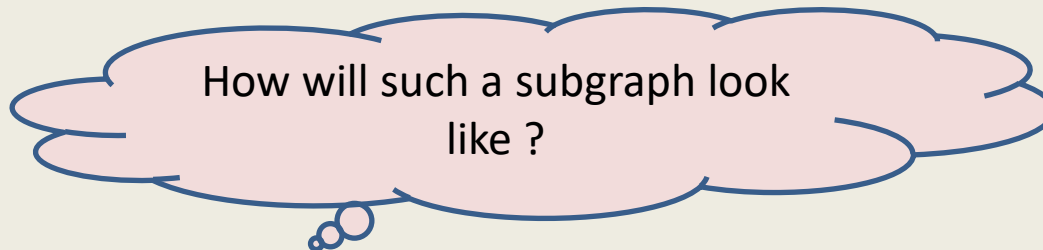
Motivation

Formal description of the problem

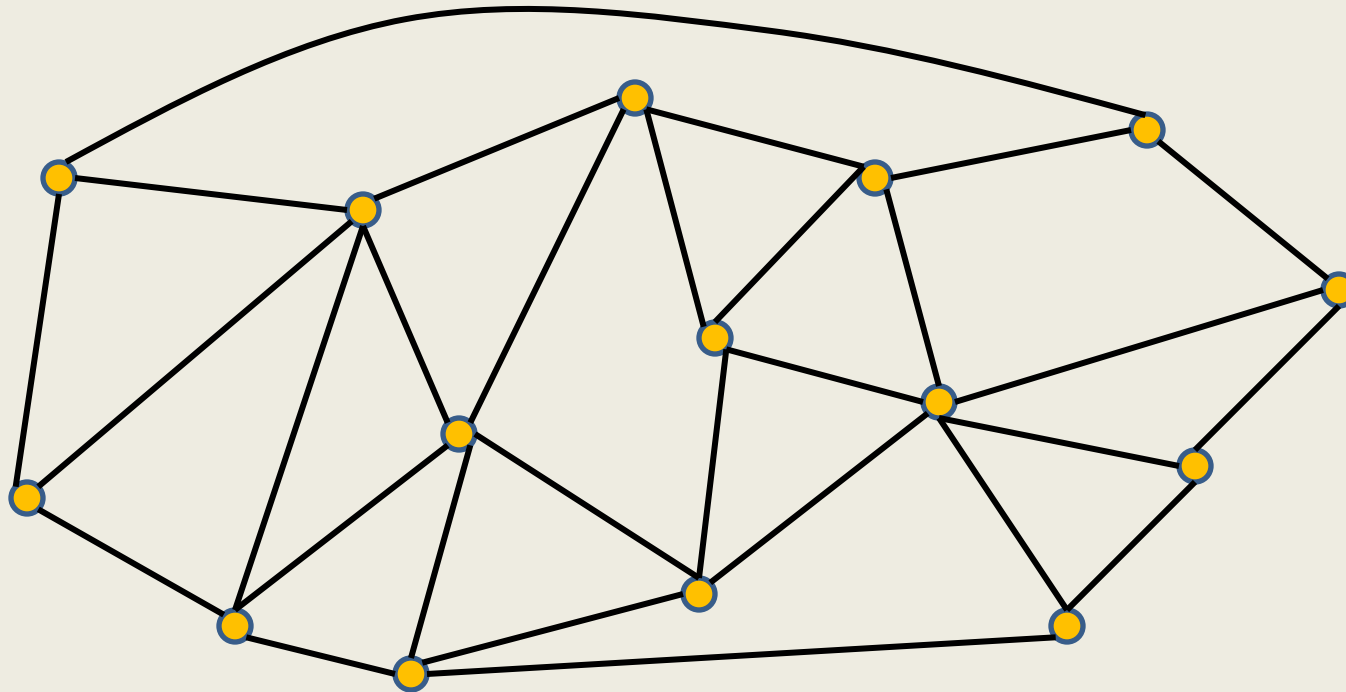
Input: an undirected graph $G=(V,E)$.

Aim: compute a **subgraph** (V,E') , $E' \subseteq E$ such that

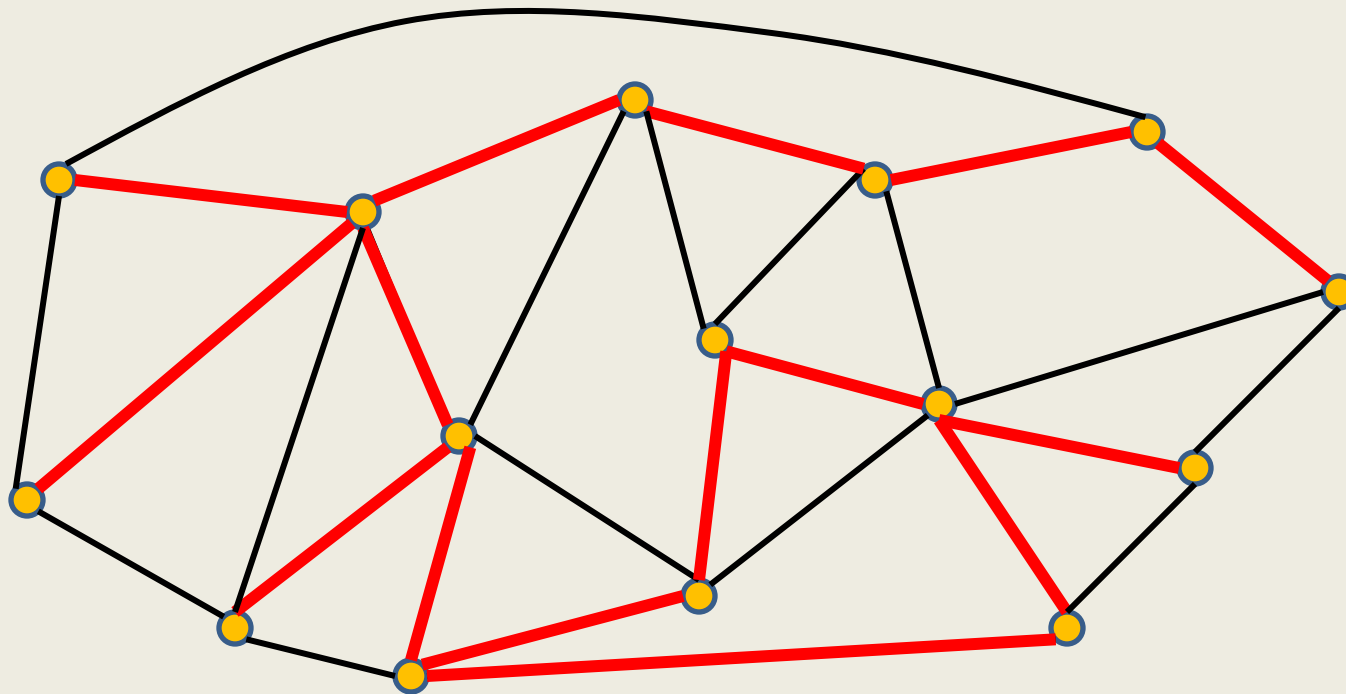
- **Connectivity** among all V is guaranteed in the **subgraph**.
- $|E'|$ is **minimum**.



A road or telecommunication network



A road or telecommunication network



No	Yes	No
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Is this subgraph meeting our requirement ?

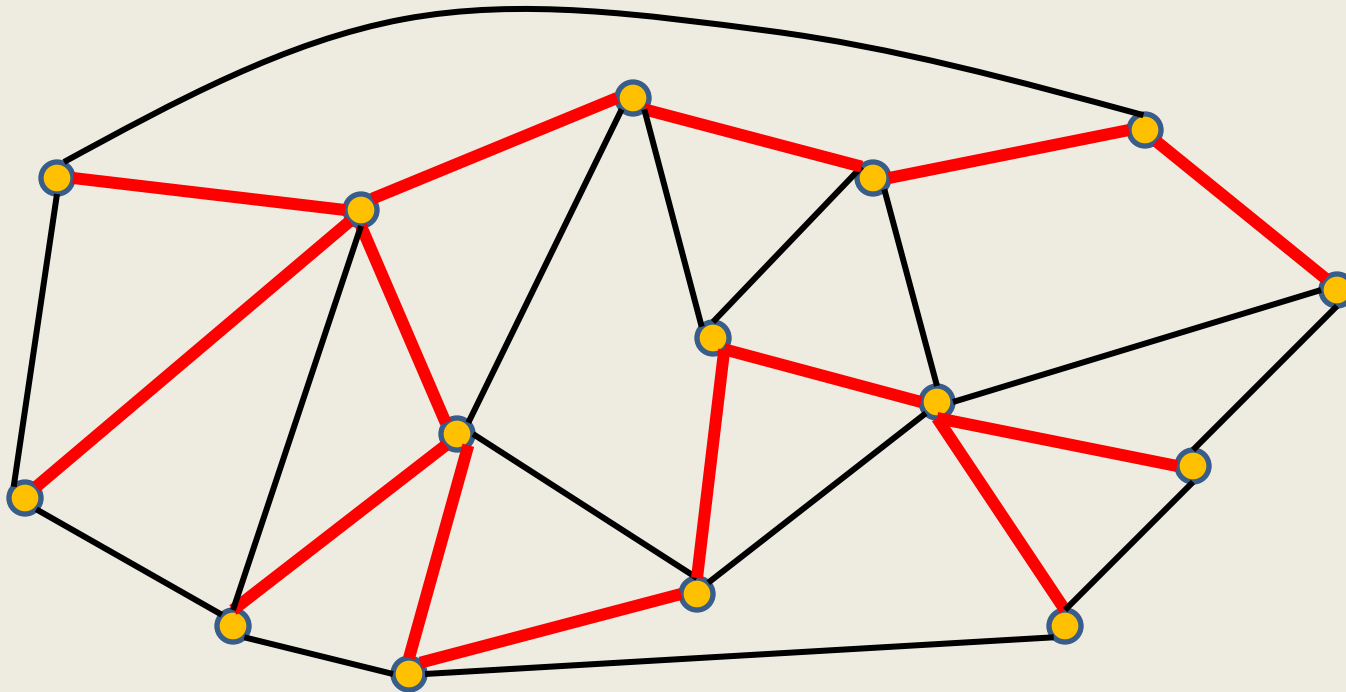
A tree

The following definitions are **equivalent**.

- An undirected graph which is **connected**
- An undirected graph where each pair of vertices has
- An undirected **connected** graph on n vertices and $n - 1$ edges
- An undirected graph on n vertices and $n - 1$ edges and

A Spanning tree

Definition: For an undirected graph (V, E) ,
A spanning tree is a **subgraph** (V, E') , $E' \subseteq E$ which is a tree.

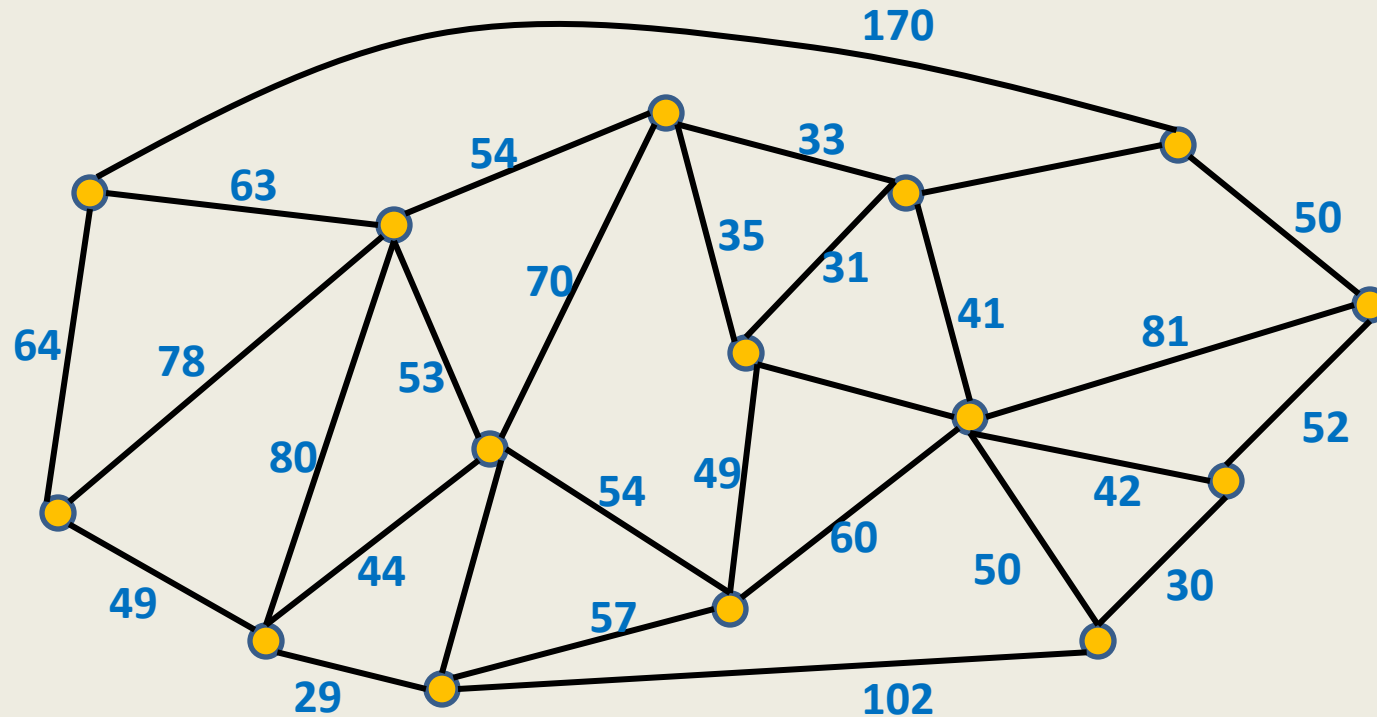


Observation: Given a spanning tree T of a graph G , adding a nontree edge e to T creates a unique cycle.

There will be total $m - n + 1$ such cycles. These are called **fundamental cycles** in G induced by the spanning tree T .

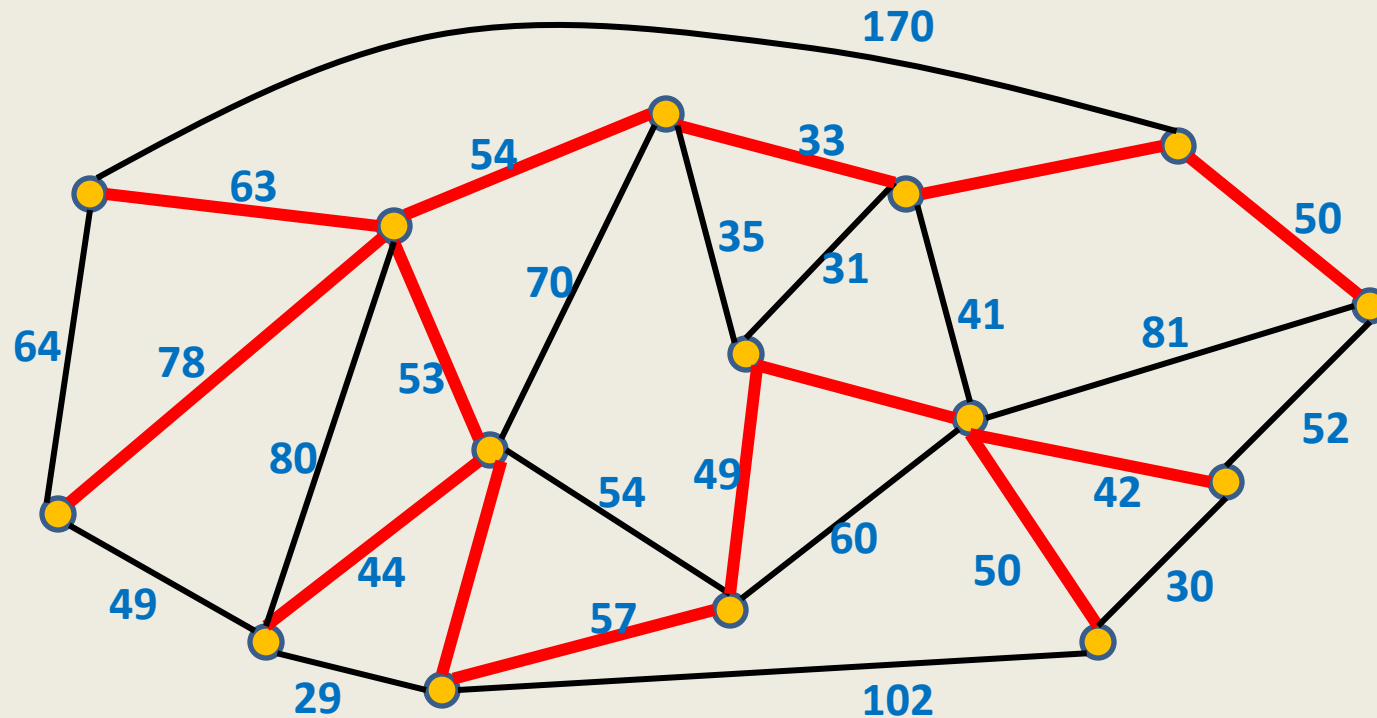
A road or telecommunication network

Assign each edge a **weight/cost**.



Adding more reality to the problem

A road or telecommunication network



Any arbitrary spanning tree (like the one shown above) will not serve our goal☹.

We need to select the spanning tree with **least weight/cost**.

Problem 2

Minimum spanning tree

Problem Description

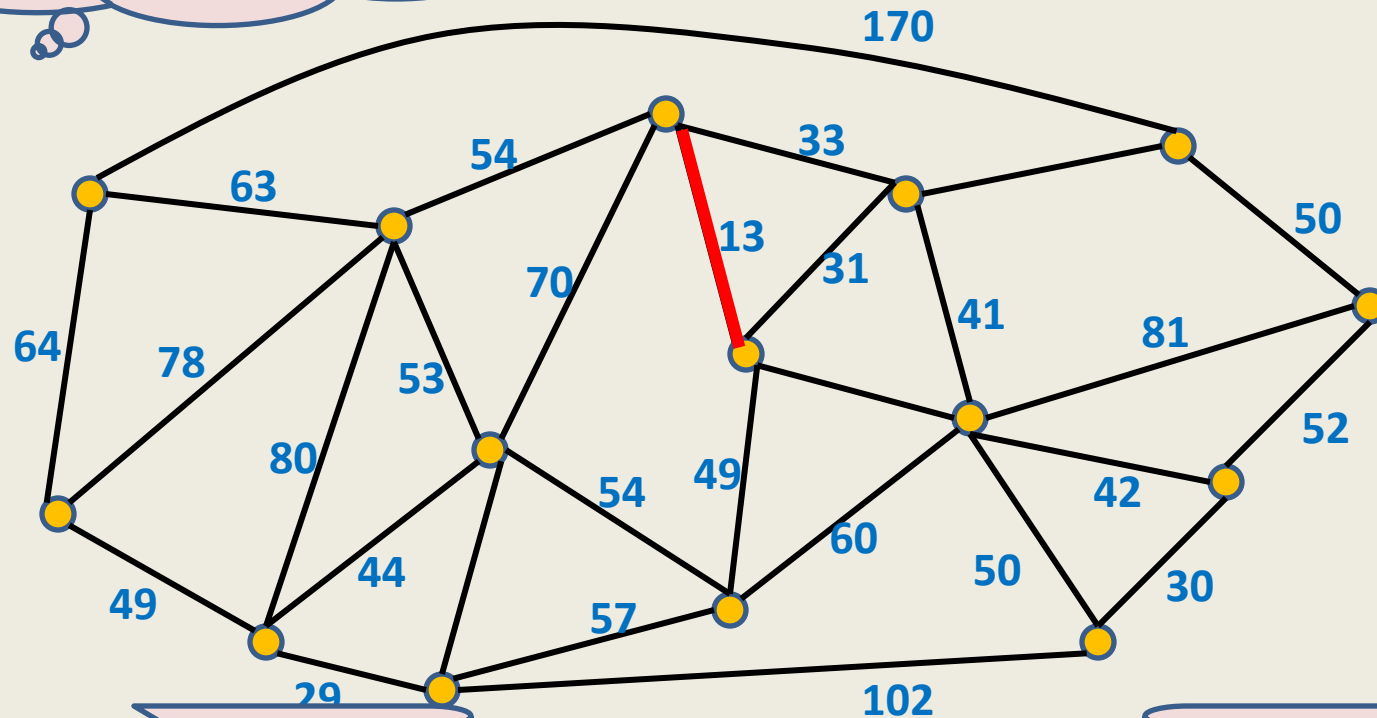
Input: an undirected graph $G=(V,E)$ with $w: E \rightarrow \mathbb{R}$,

Aim: compute a **spanning tree** (V,E') , $E' \subseteq E$ such that

$\sum_{e \in E'} w(e)$ is **minimum**.

How to compute a MST ?

The least weight edge
should be in MST.
But why ?



Look at the edge with weight 13. Is there any edge for which you feel
strongly to be present in MST ?

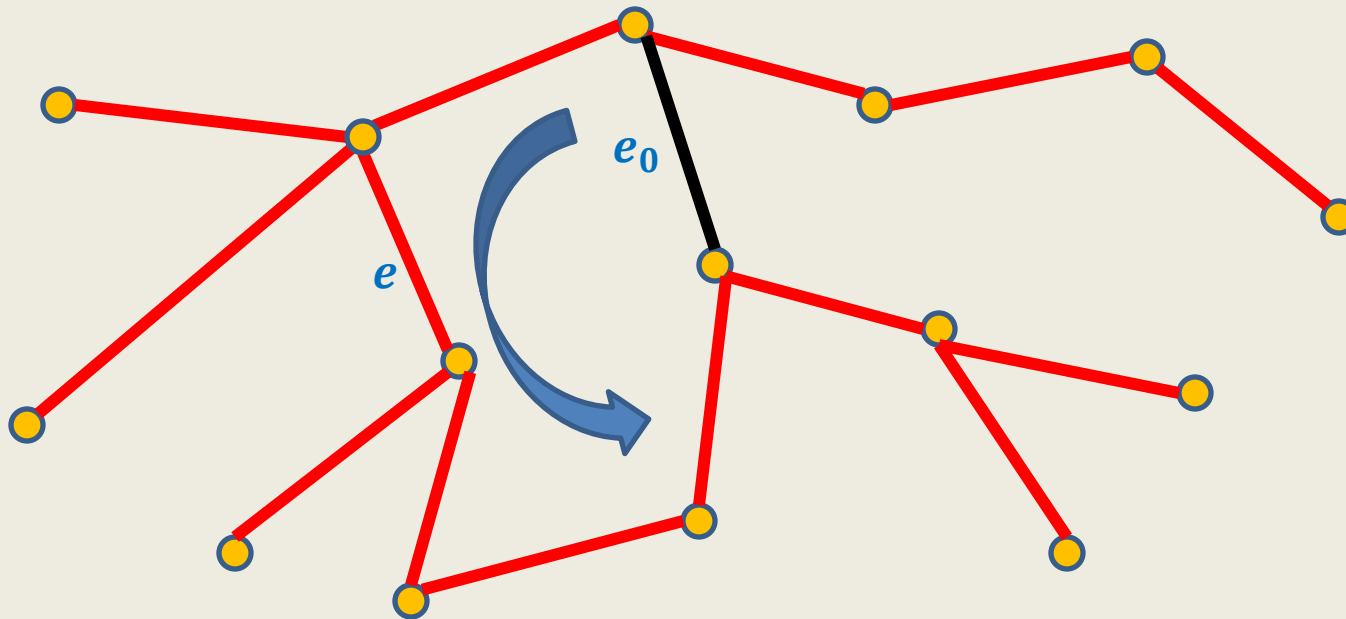
Let $e_0 \in E$ be the edge of least weight in the given graph.

Lemma2: There is a **MST** T containing e_0 .

Proof: Consider any **MST** T . Let $e_0 \notin T$.

Consider the fundamental cycle C defined by e_0 in T .

Swap e_0 with any edge $e \in T$ present in C .



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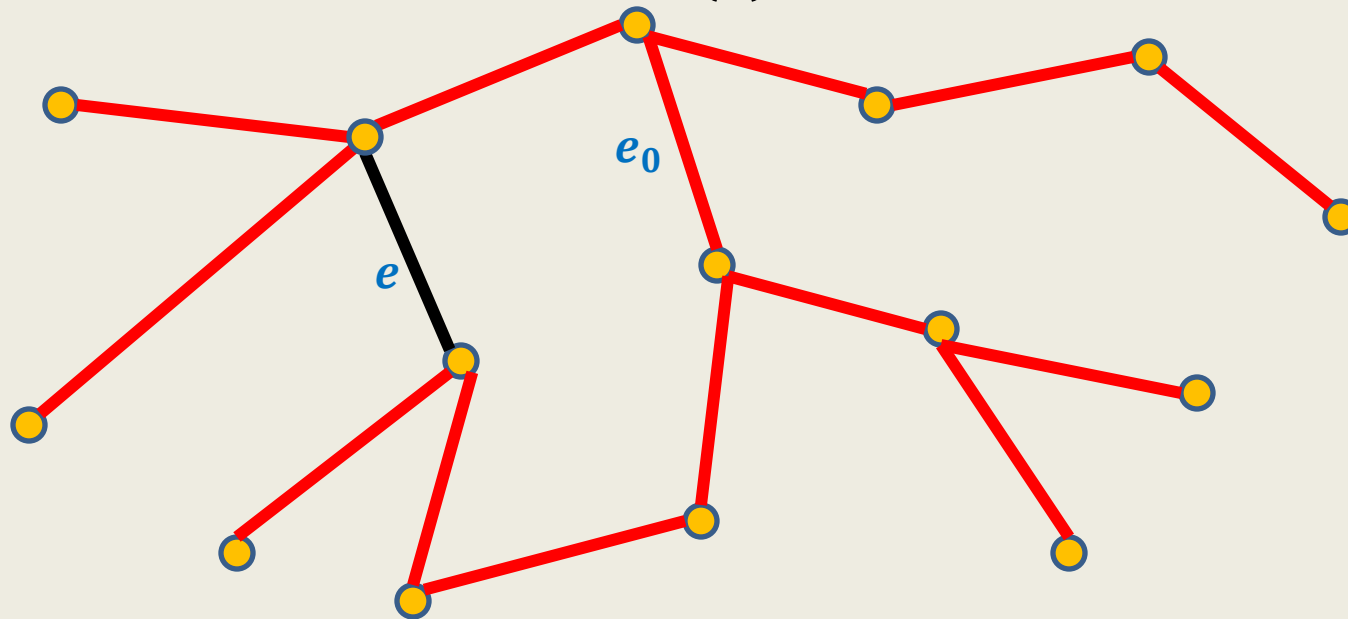
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Consider the fundamental cycle C defined by e_0 in T .

Swap e_0 with any edge $e \in T$ present in C .

We get a spanning tree of weight $\leq w(T)$.



Try to translate Lemma2 to an algorithm for MST ?

with **inspiration** from the job scheduling problem 😊

Next lecture class: Sunday (3rd April) at 11 AM...