



Greedy

Algorísmica Avançada | Enginyeria Informàtica

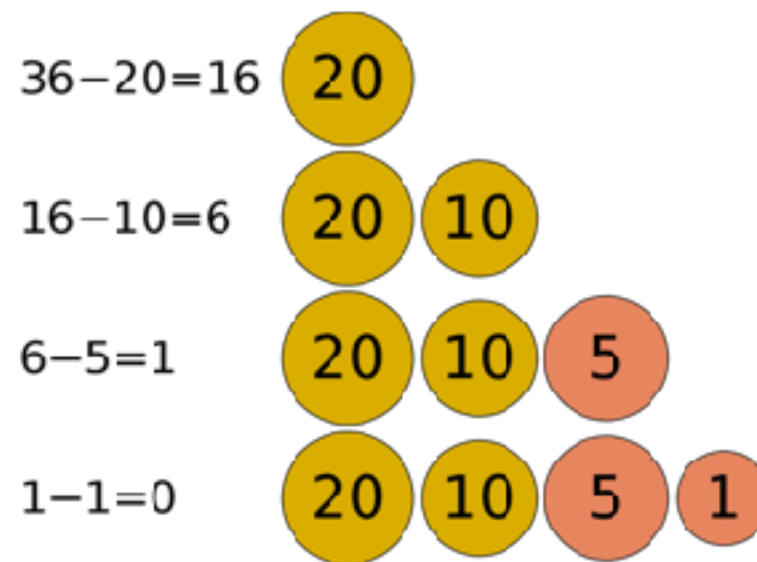
Santi Seguí | 2019-2020

Greedy?

- L'**algorisme greedy (o voraç)** és un **algorisme** que, per resoldre un problema d'optimització, fa una seqüència d'eleccions, prenent en cada pas un òptim local, amb l'esperança (no sempre complerta) d'arribar a un òptim global. L'algorisme greedy no torna mai enrere per reavaluar les eleccions ja preses

Exemple

- Tornar un canvi amb el mínim de monedes. El conjunt de candidats és $\{20, 10, 5, 1\}$

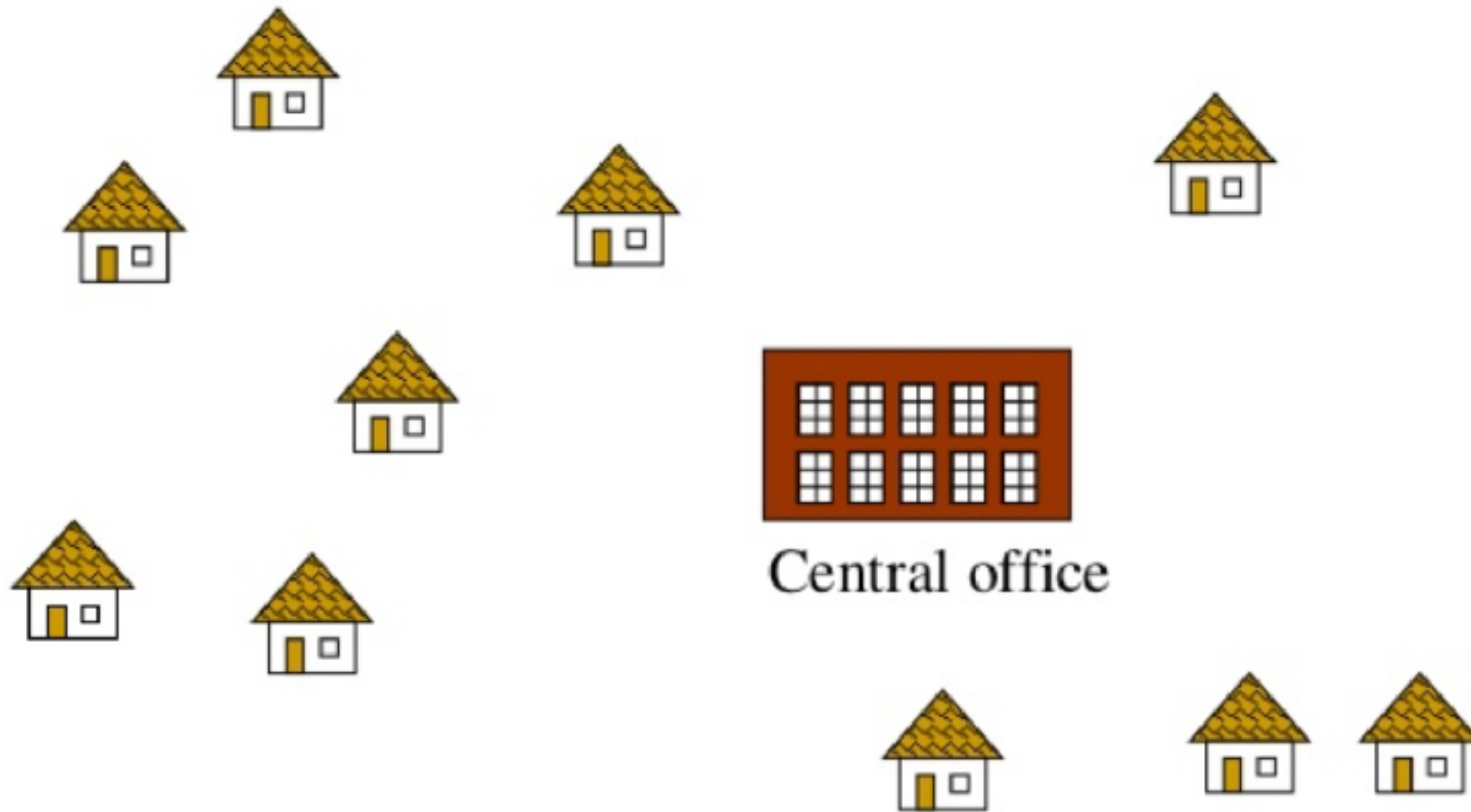


Els algorismes voraços **no garanteixen** sempre **una solució**,
ni que la **solució** obtinguda sigui **l'òptima**

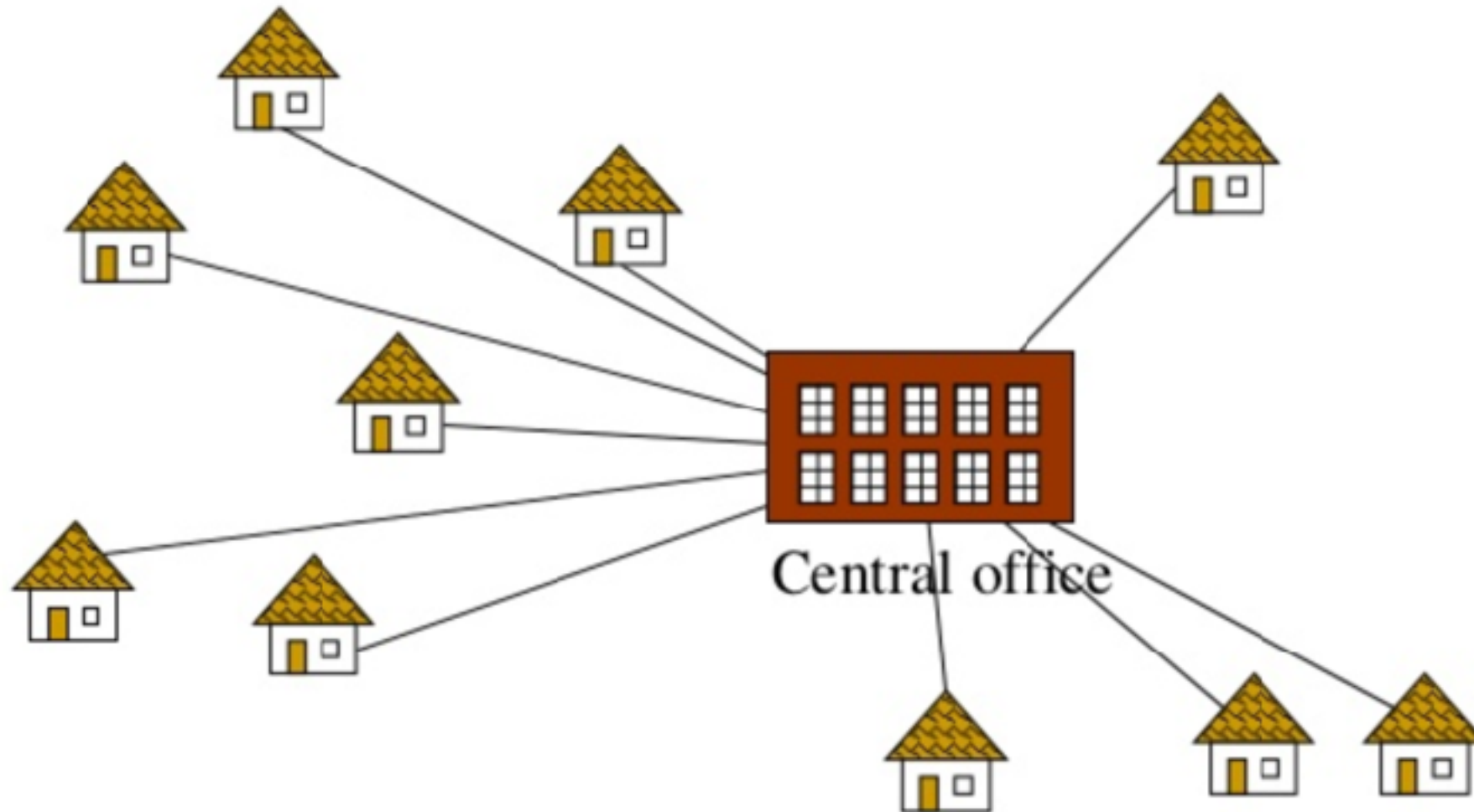
Greedy

- Podem guanyar als escacs pensant només en la següent jugada?
- I al scrabble? → algorithme greedy?
- **Algoritmes greedy troben la millor “jugada” a cada pas**

Problem: Laying Telephone Wire

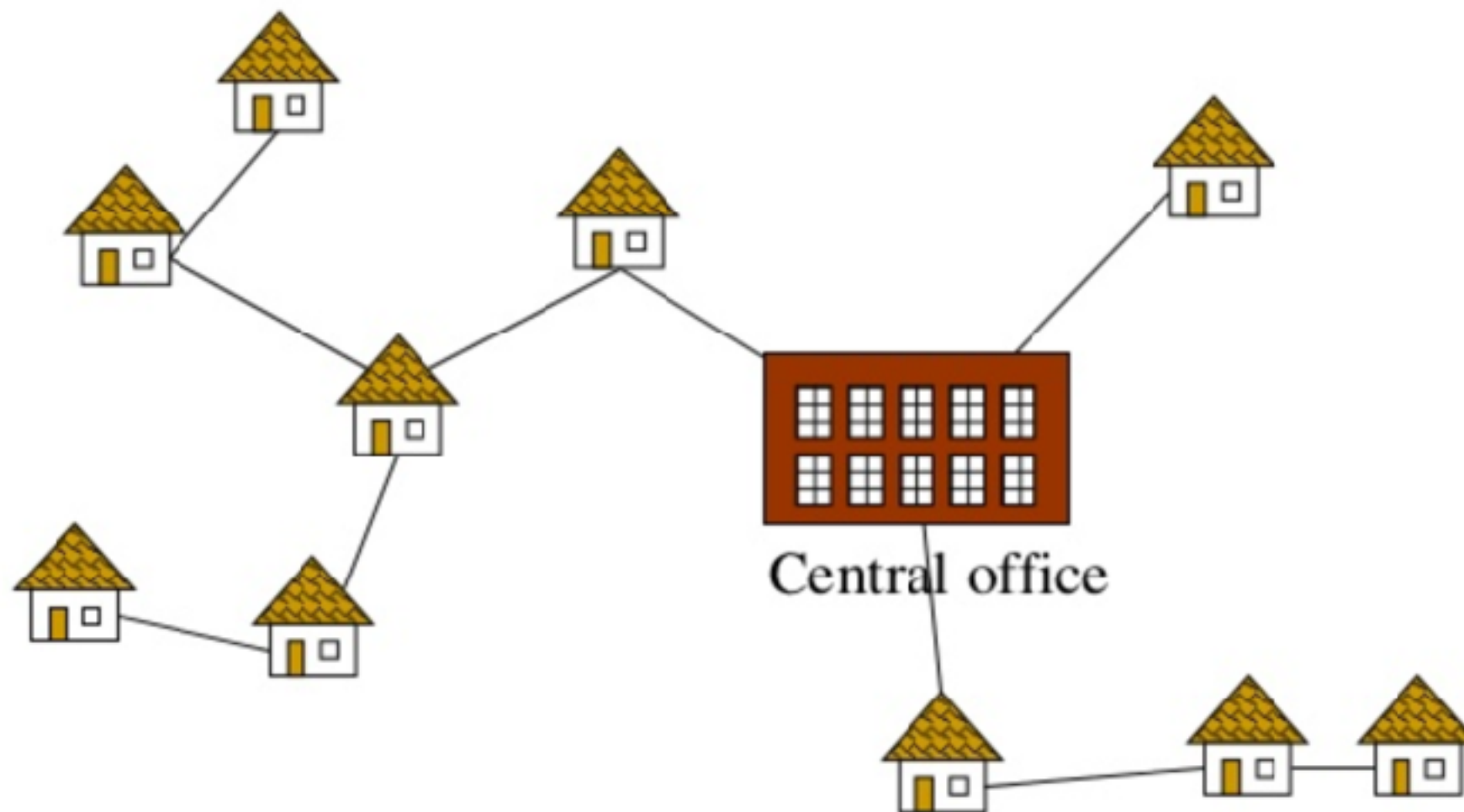


Wiring: Naïve Approach



Expensive!

Wiring: Better Approach



Minimize the total length of wire connecting the customers

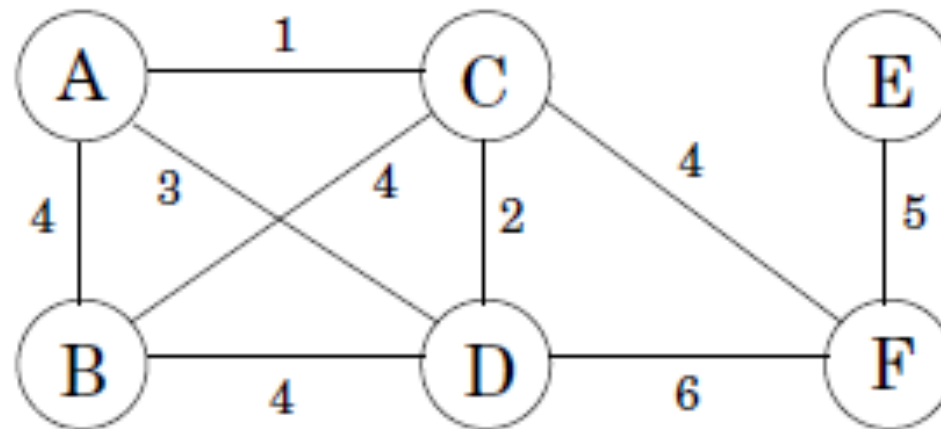
Exemple

Teniu un negoci amb diverses oficines; voleu llogar línies de telèfon per connectar-les entre elles; i l'empresa de telefonia cobra diferents quantitats de diners per connectar les oficines.

Volem un conjunt de línies que **connecti totes** les seves oficines amb un **cost total mínim**. Hauria de ser un arbre extensiu, ja que si una xarxa no és un arbre, sempre podeu treure algunes vores i estalviar diners.

Algoritmes Greedy

- Exemple

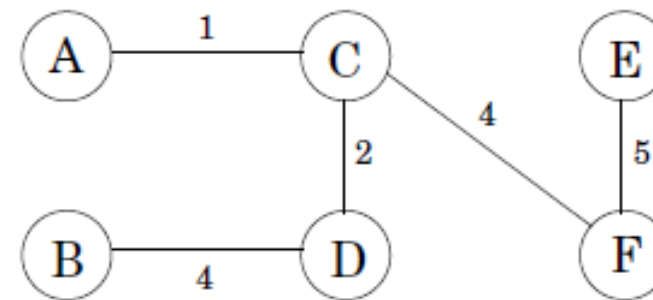
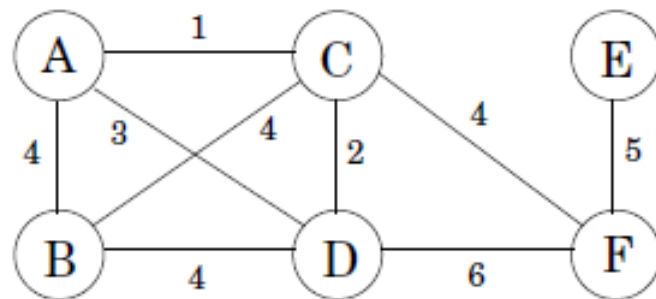


- Volem connectar els oficines (nodes) d'una empresa. Les connexions són les arestes. Cadascuna té un cost. Volem el mínim cost.
 - → llavors no volem cicles
 - → volem un graf no dirigit acíclic connectat
 - → arbre !!!
 - → de mínim cost: **Minimum Spanning Tree** (MST)

Kruskal

Algoritmes Greedy

- MST amb cost 16 (un dels possibles)

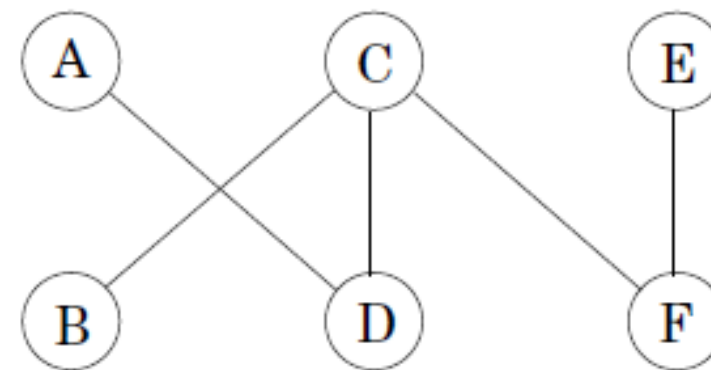
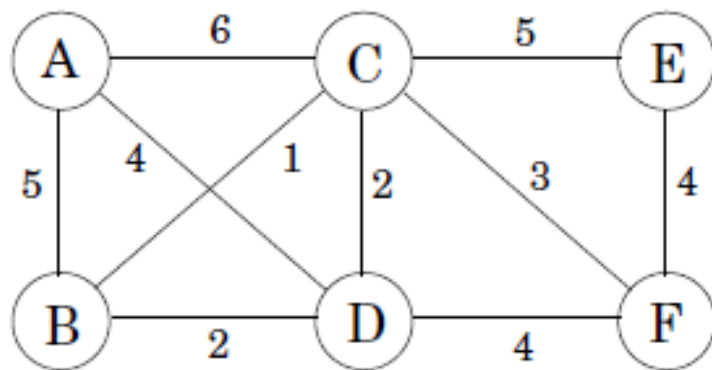


- Algorisme greedy: **Kruskal**
 - Començar amb arbre buit
 - Mentre no estiguin tots els nodes connectats
 - Incloure aresta de cost mínim que no produeix un cicle

Algoritmes Greedy

- Cost 14!

$B - C, C - D, B - D, C - F, D - F, E - F, A - D, A - B, C - E, A - C.$



- Aquest algoritme és **òptim!**

Algoritmes Greedy

- Per què? Propietat de tall “cut”:
 - Un tall és aquella aresta que si la traiem es genera una nova component connexa.
 - El que fem amb Kruskal és anar connectant elements amb el tall de cost mínim.
 - Com ho podem implementar eficientment?

Algoritmes Greedy

```
KRUSKAL(G):  
1 A =  $\emptyset$   
2 foreach v  $\in$  G.V:  
3   MAKE-SET(v)  
4 foreach (u, v) in G.E ordered by weight(u, v), increasing:  
5   if FIND-SET(u)  $\neq$  FIND-SET(v):  
6     A = A  $\cup$  {(u, v)}  
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|V| makeset,
2|E| find
|V| - 1 union

Algoritmes Greedy

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- **Makeset:** Construir un nou conjunt a partir d'un simple node.
Temps constant

After makeset(A), makeset(B), ..., makeset(G):



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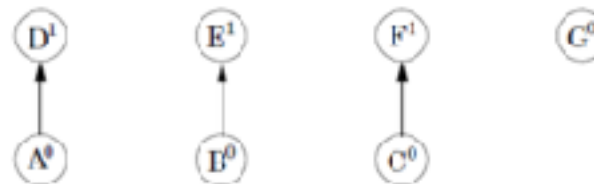
- **Find-Set(u)** : Busca el conjunt que conté l'element **u**.

Algoritmes Greedy

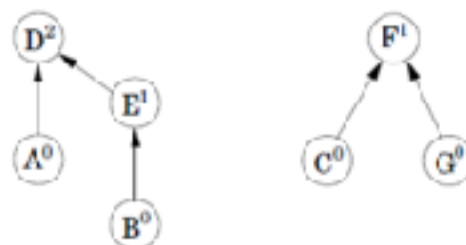
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- **Union(S1, S2)** : Crea un nou conjunt amb l'unió dels conjunts S1 i S2.

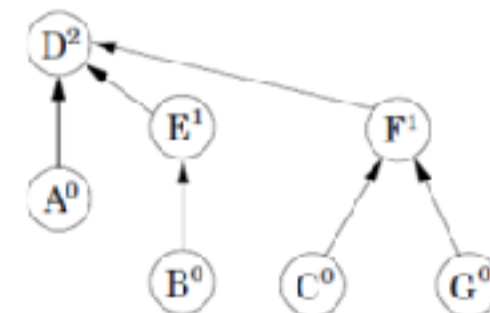
After union(A, D), union(B, E), union(C, F):



After union(C, G), union(E, A):

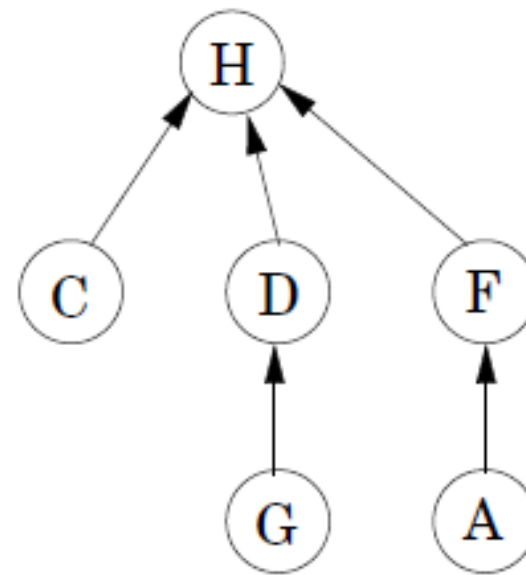


After union(B, G):



Algoritmes Greedy

- Representació dels conjunts: arbres dirigits



procedure makeset (x)

$\pi(x) = x$

$\text{rank}(x) = 0$

function find (x)

while $x \neq \pi(x)$: $x = \pi(x)$

return x

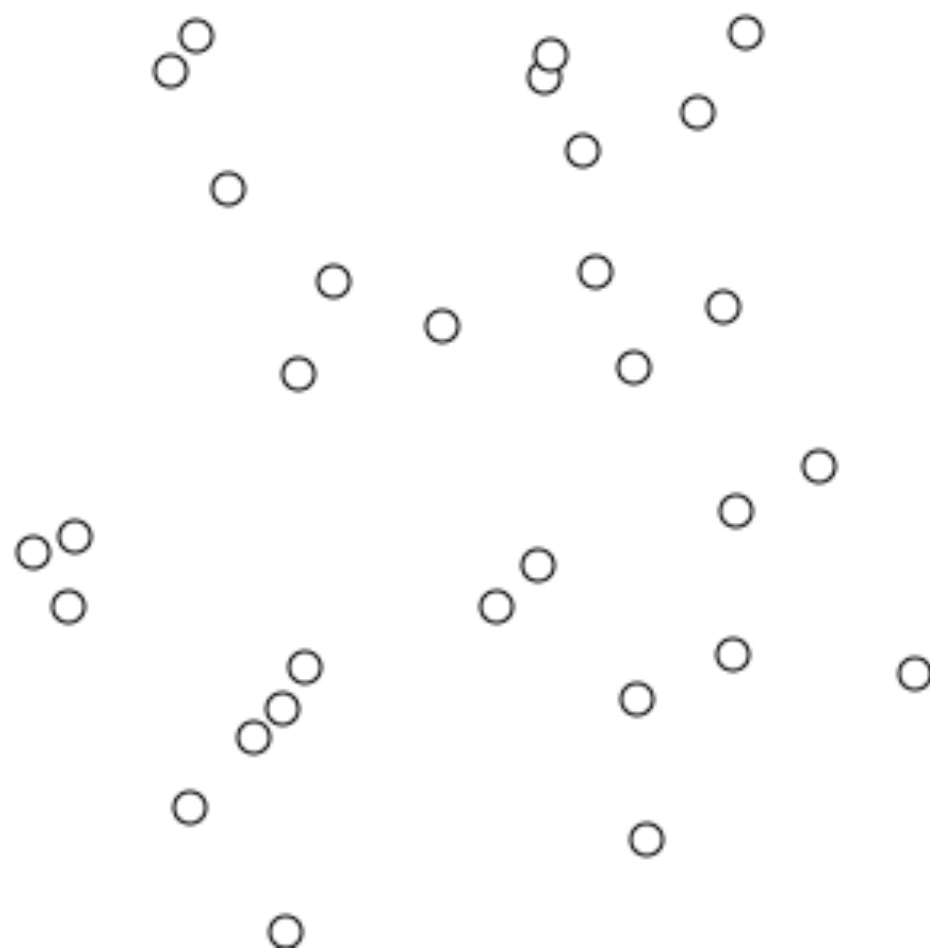
punter

rank: altura dins de l'arbre

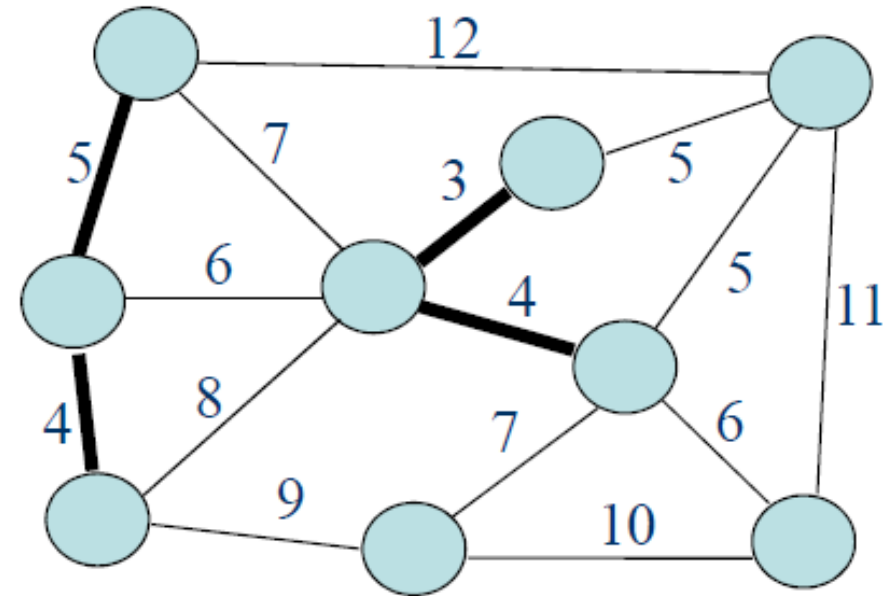
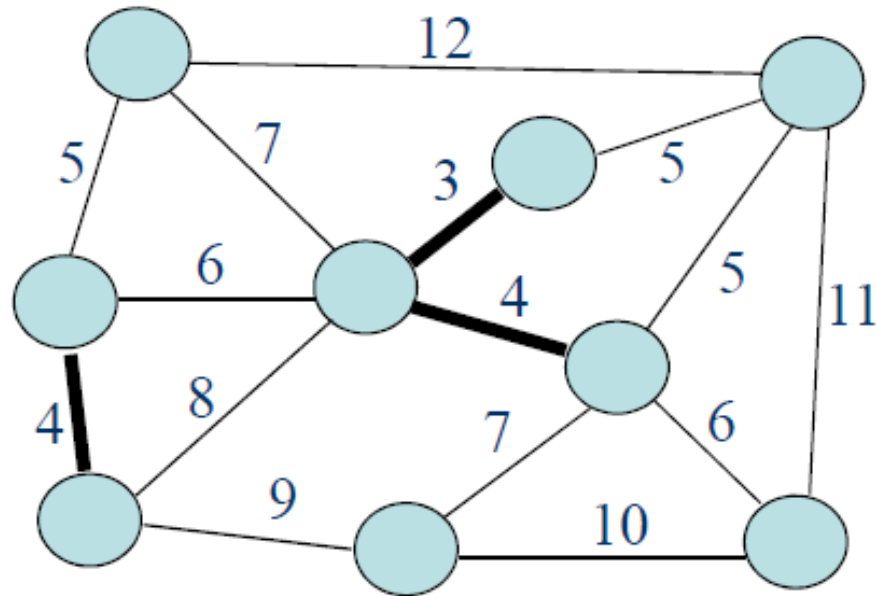
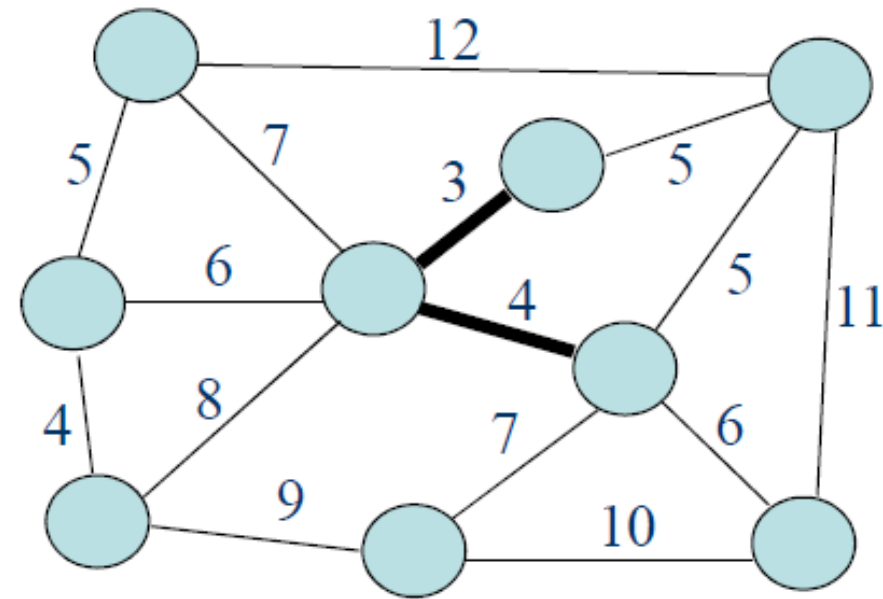
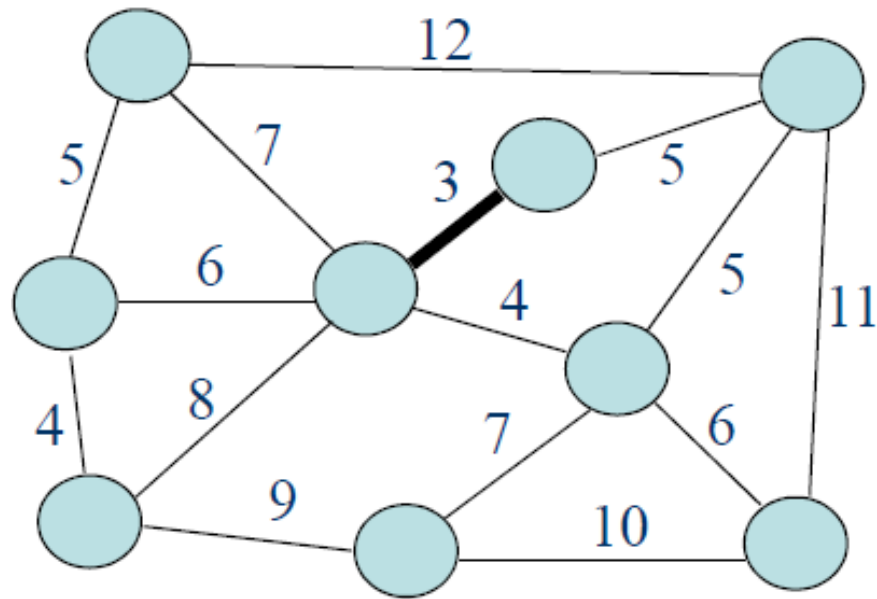
Algoritmes Greedy

- **Makeset**: temps constant
- **Find**: segueix punters dels pares als roots, per tant el temps és proporcional a l'altura
- **Union**: com l'altura ens defineix la complexitat, posem el punter de l'arbre més curt apuntant al punter de l'arbre amb més altura

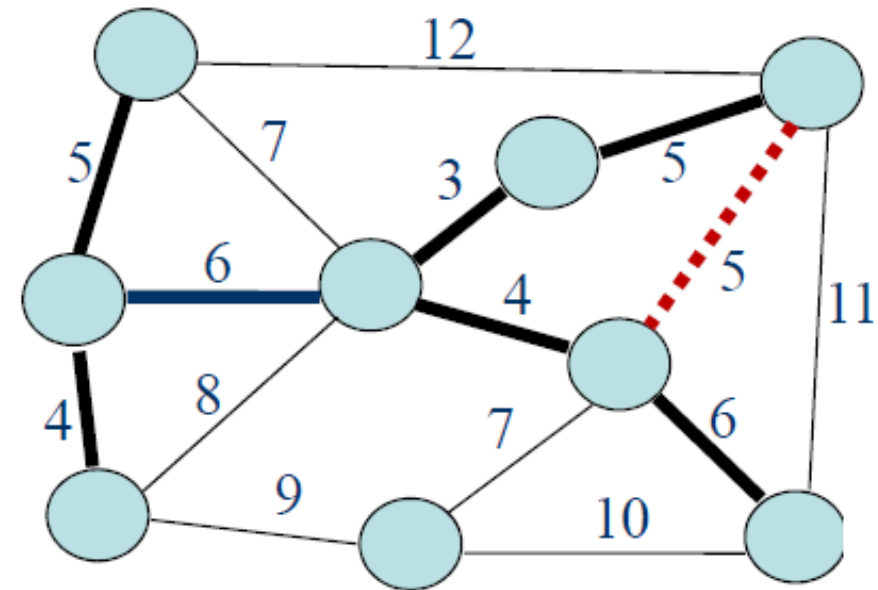
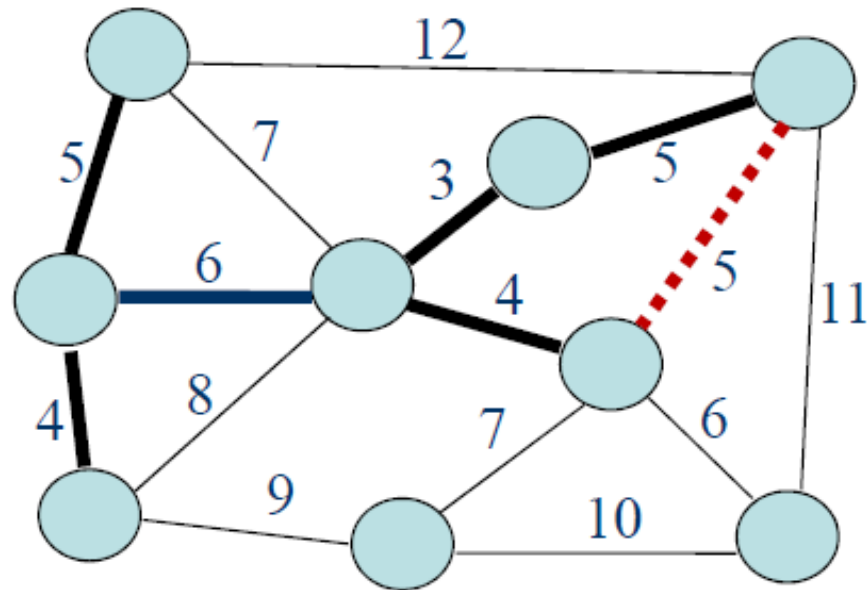
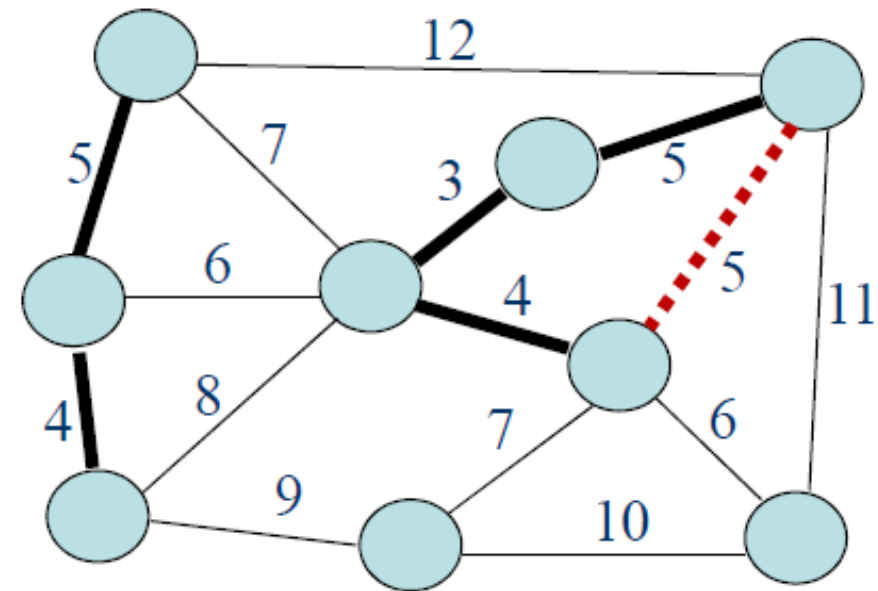
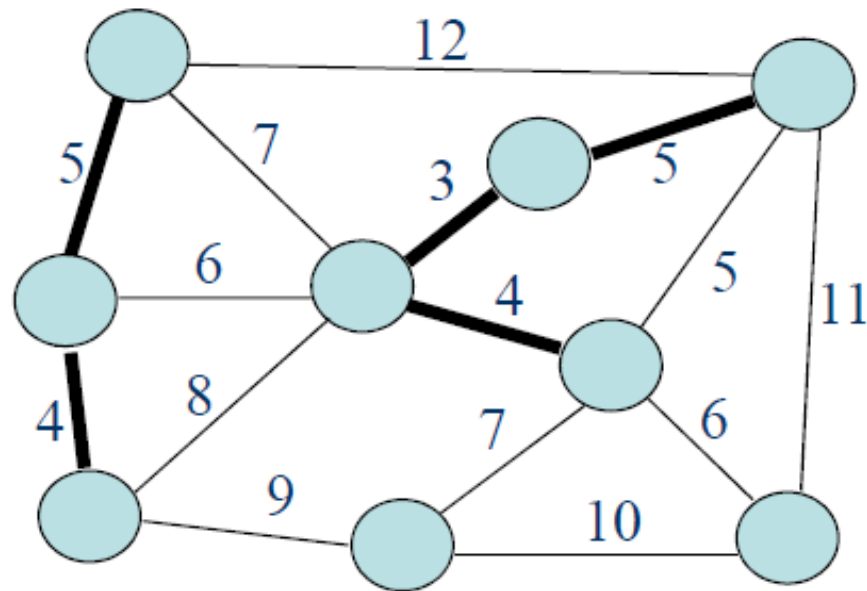
```
procedure union( $x, y$ )  
   $r_x = \text{find}(x)$   
   $r_y = \text{find}(y)$   
  if  $r_x = r_y$ : return  
  if  $\text{rank}(r_x) > \text{rank}(r_y)$ :  
     $\pi(r_y) = r_x$   
  else:  
     $\pi(r_x) = r_y$   
    if  $\text{rank}(r_x) = \text{rank}(r_y)$ :  $\text{rank}(r_y) = \text{rank}(r_y) + 1$ 
```



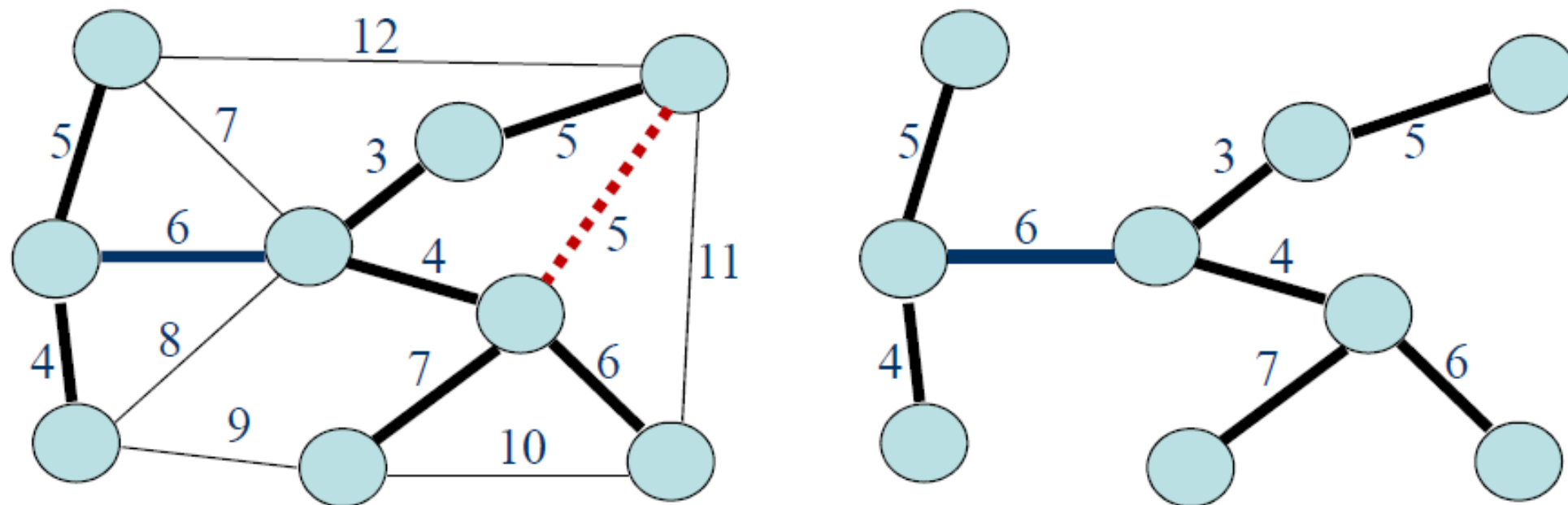
Kruskal example



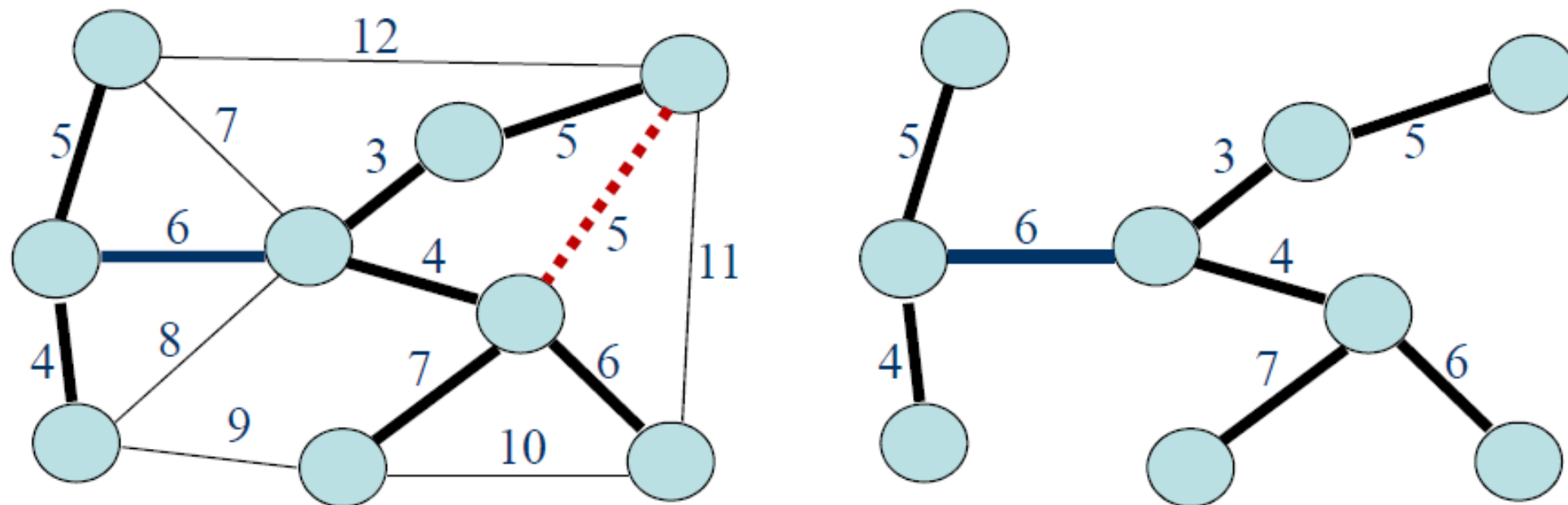
Kruskal example



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2 **foreach** $v \in G.V$:

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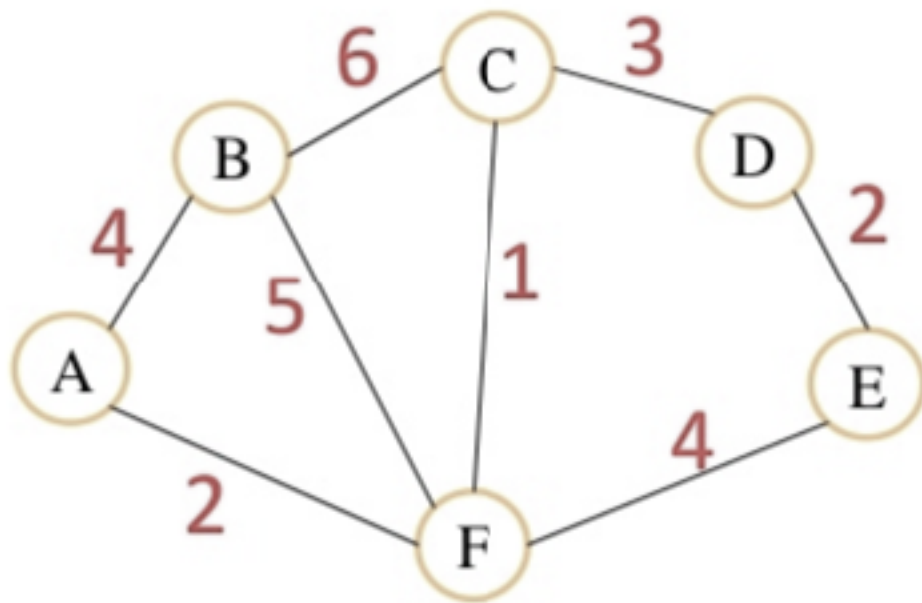
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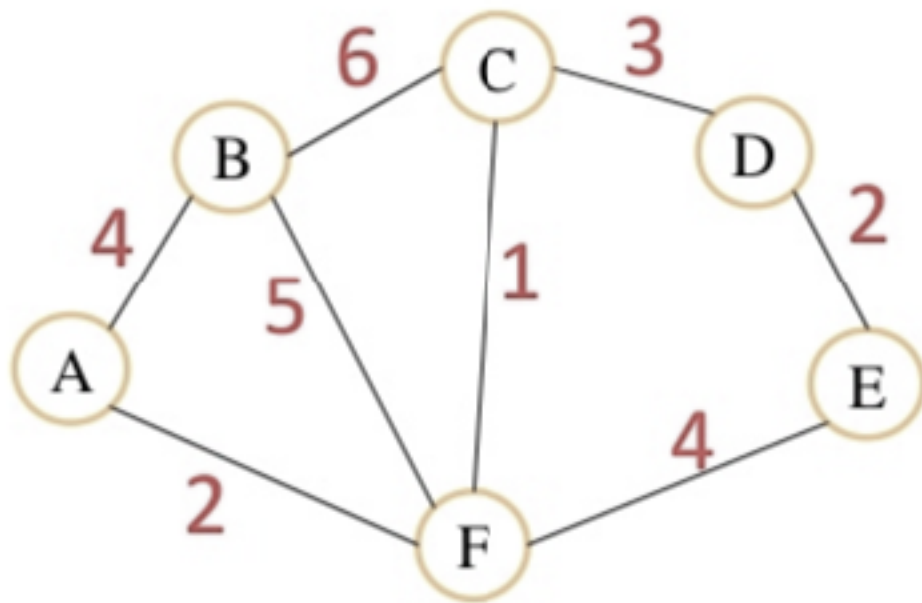
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Edges	Weight
AB	4
BC	6
CD	3
DE	2
EF	4
AF	2
BF	5
CF	1

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8 return  $A$ 
```



$A = \{\}$

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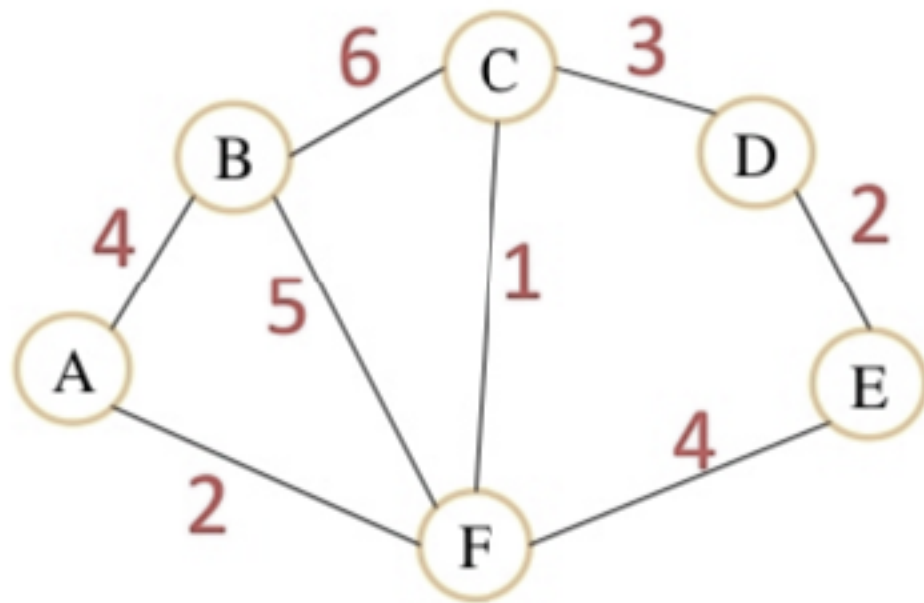
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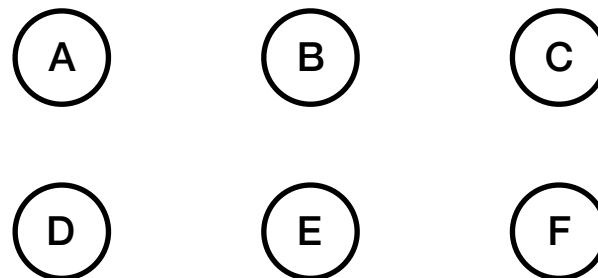
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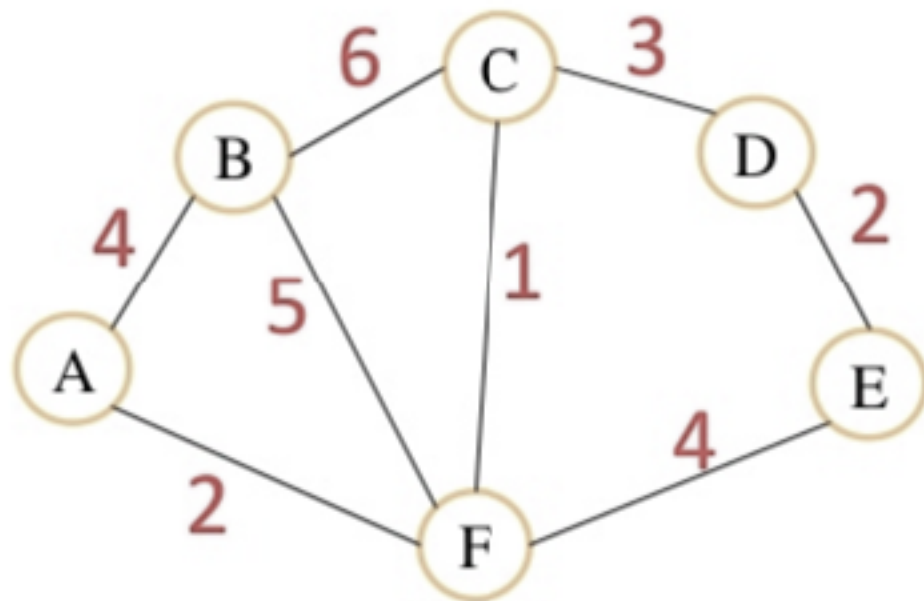
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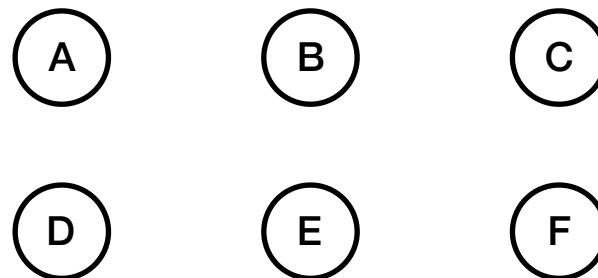
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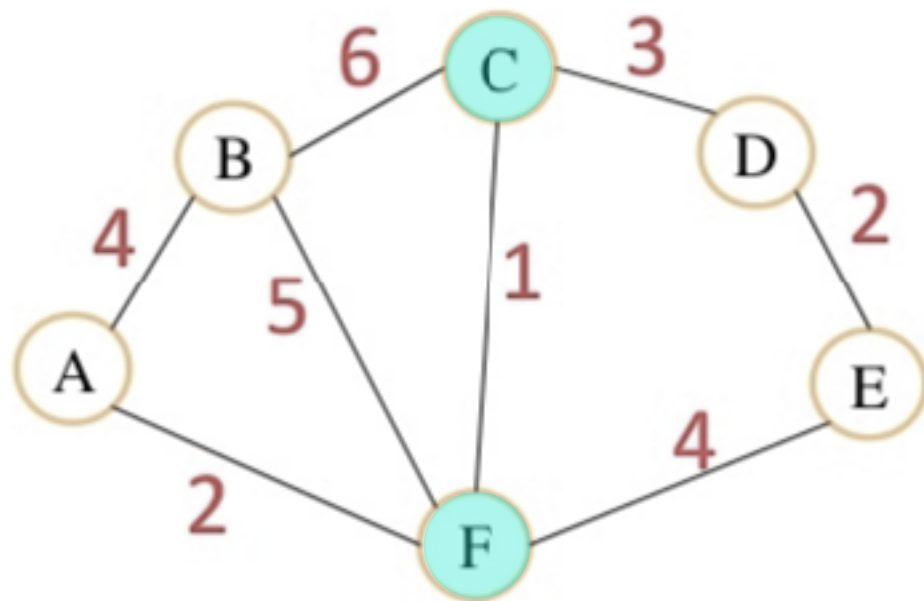
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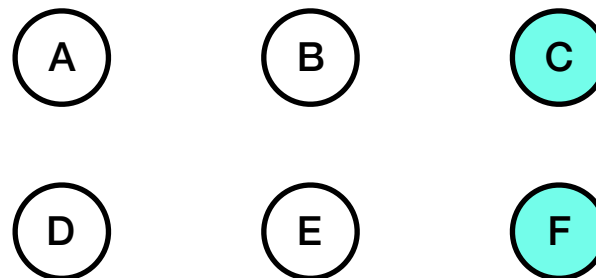
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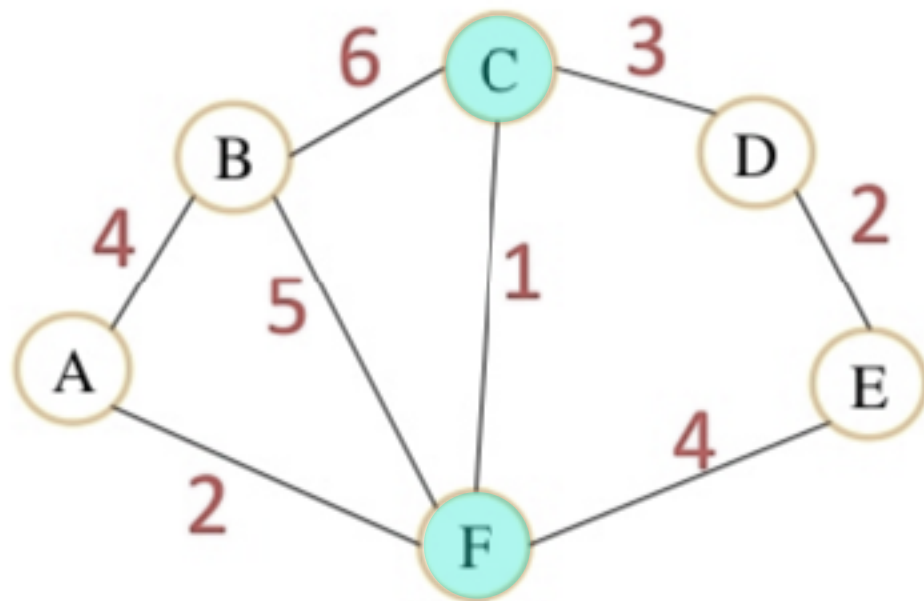
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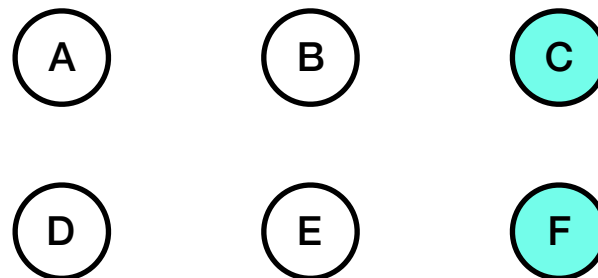
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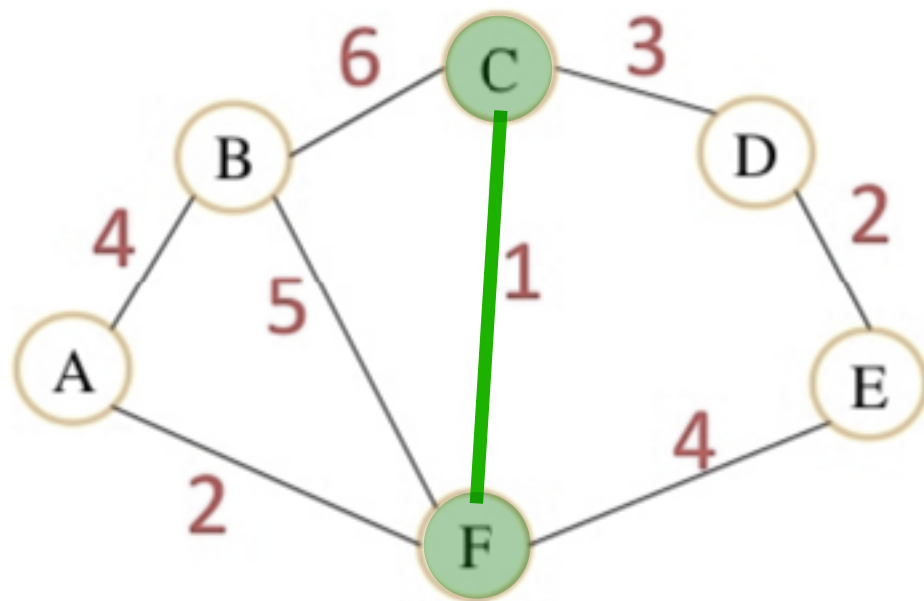
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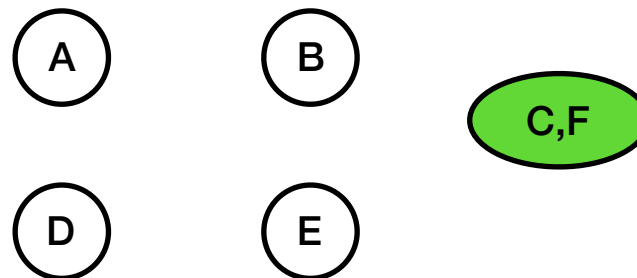
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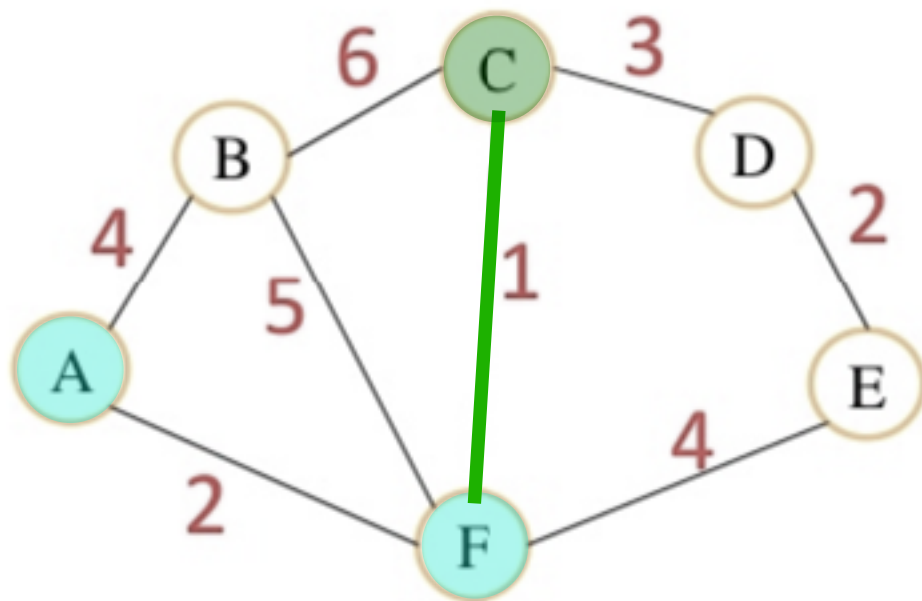
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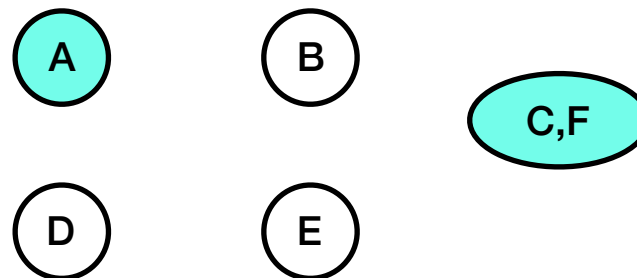
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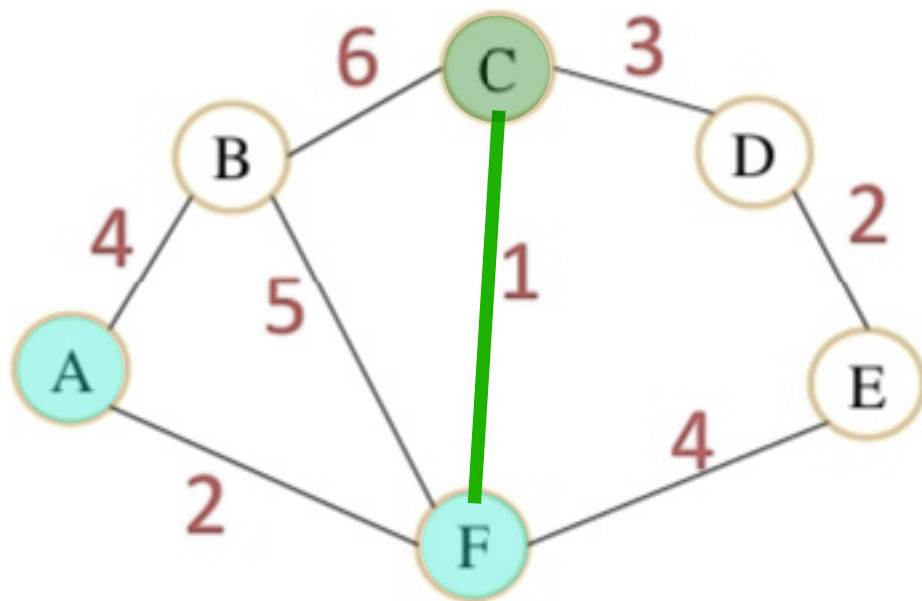
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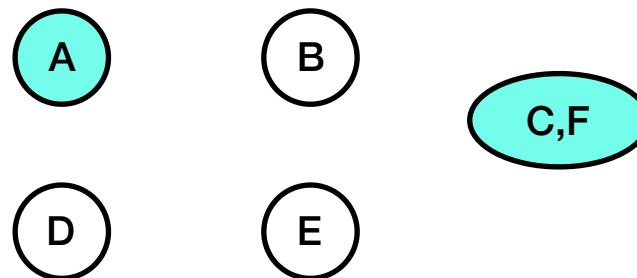
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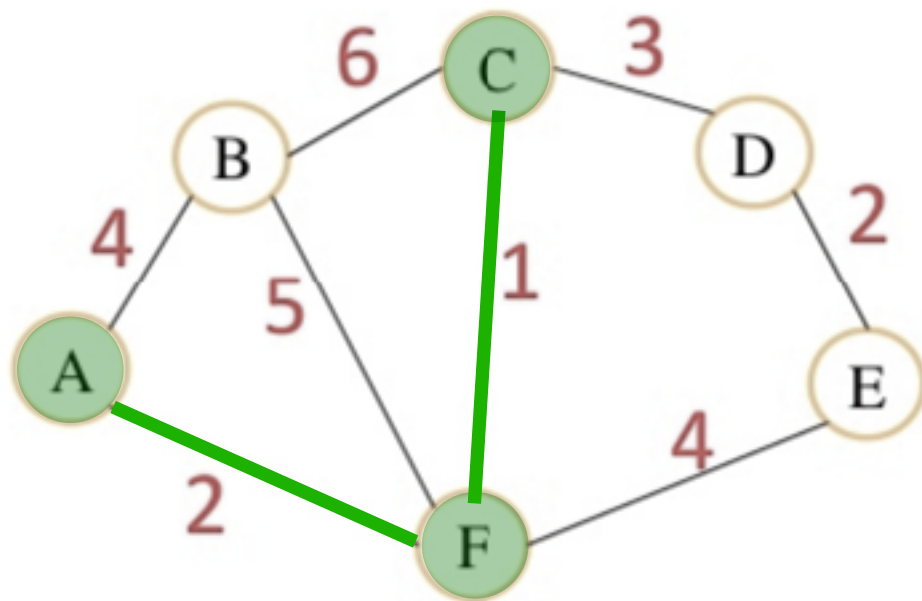
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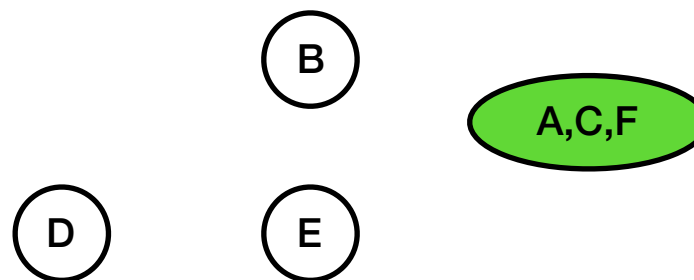
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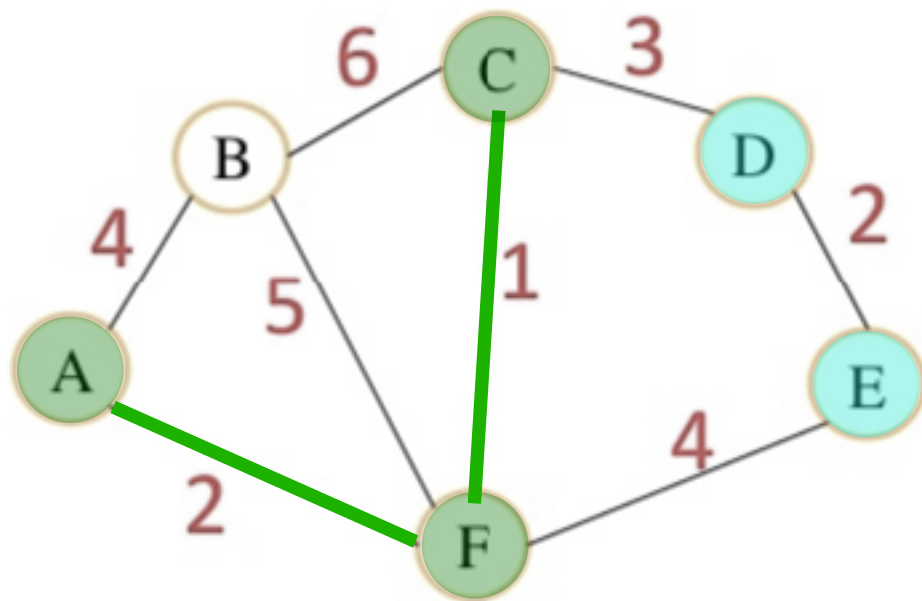
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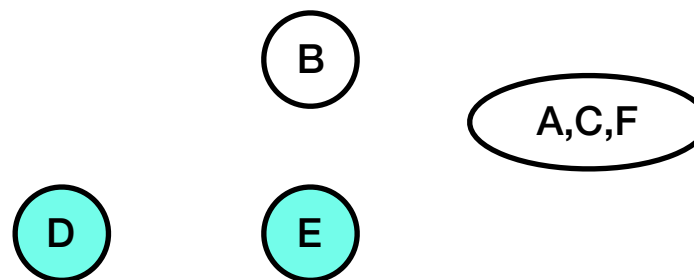
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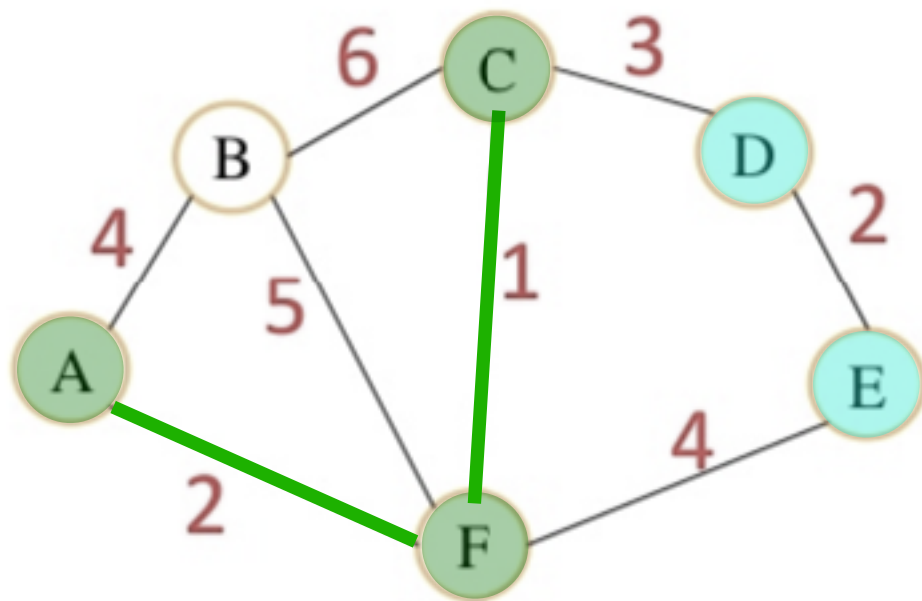
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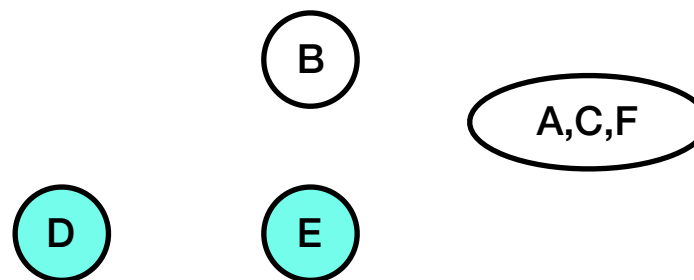
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7 UNION(FIND-SET(u), FIND-SET(v))

8 **return** A



$A = \{(C,F), (A,F), (D,E)\}$



Edges	Weight
CF	1
AF	2
DE	2
CD	3
AB	4
FE	4
BF	5
BC	6

KRUSKAL(G):

1 $A = \emptyset$

2 **foreach** $v \in G.V$:

3 MAKE-SET(v)

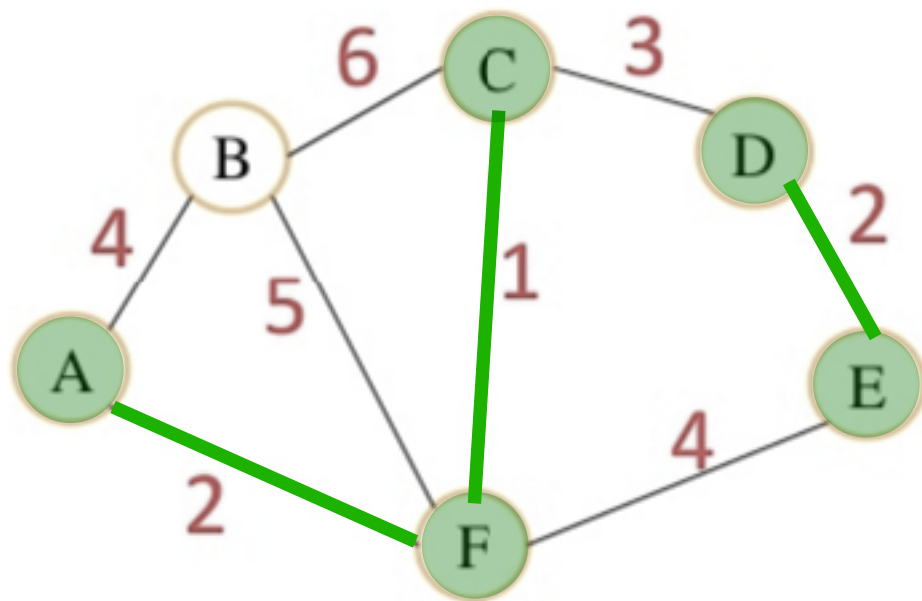
4 **foreach** (u, v) in $G.E$ ordered by $\text{weight}(u, v)$, increasing:

5 **if** FIND-SET(u) \neq FIND-SET(v):

6 $A = A \cup \{(u, v)\}$

7 UNION(FIND-SET(u), FIND-SET(v))

8 **return** A



$A = \{(C,F), (A,F), (D,E)\}$

B

D,E

A,C,F

Edges	Weight
CF	1
AF	2
DE	2
CD	3
AB	4
FE	4
BF	5
BC	6

KRUSKAL(G):

1 $A = \emptyset$

2 **foreach** $v \in G.V$:

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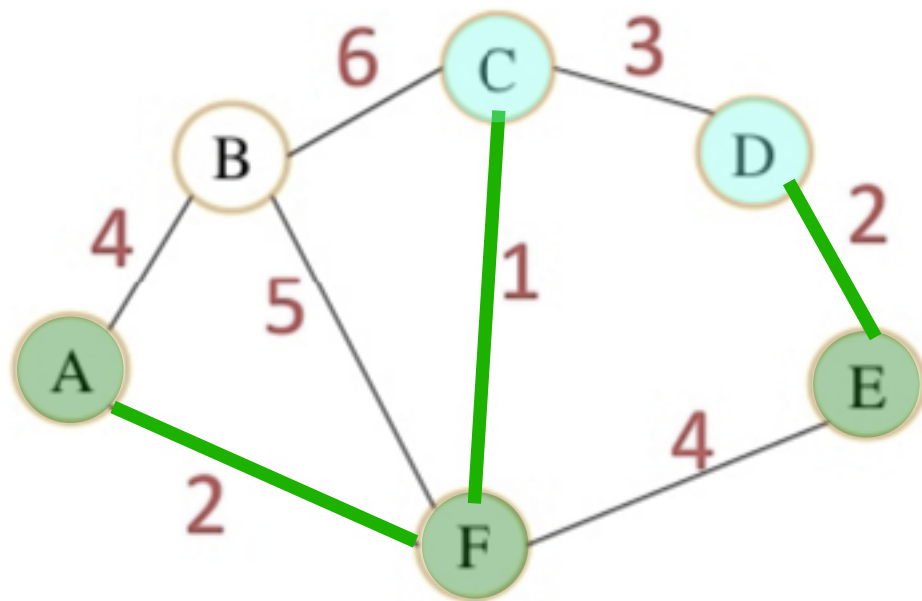
4 **foreach** (u, v) in $G.E$ ordered by $\text{weight}(u, v)$, increasing:

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7 UNION(FIND-SET(u), FIND-SET(v))

8 **return** A



$A = \{(C,F), (A,F), (D,E)\}$

B

D,E

A,C,F

Edges	Weight
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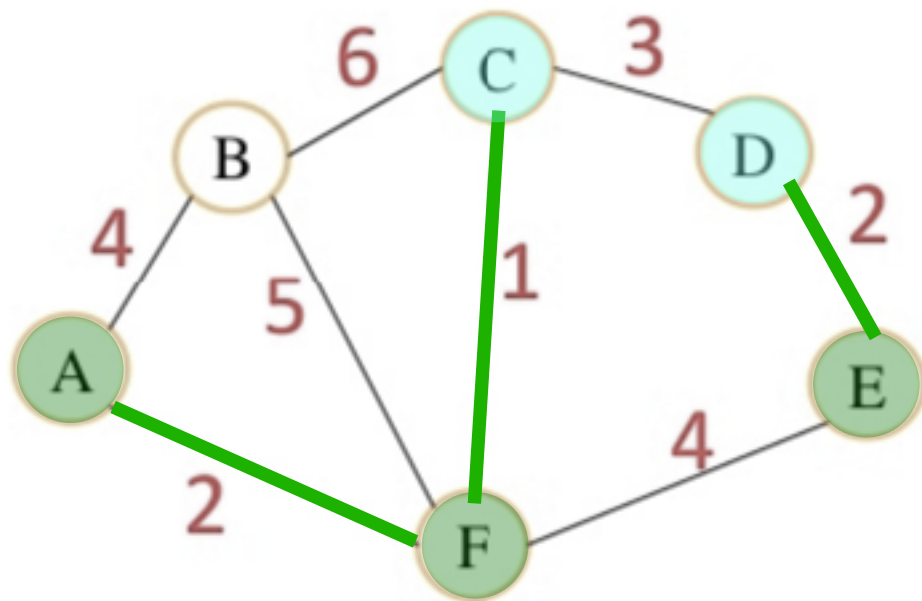
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5 **if** FIND-SET(u) \neq FIND-SET(v):

6 $A = A \cup \{(u, v)\}$

7 UNION(FIND-SET(u), FIND-SET(v))

8 **return** A



$A = \{(C,F), (A,F), (D,E), (C,D)\}$

B

A,C,D,F

Edges	Weight
CF	1
AF	2
DE	2
CD	3
AB	4
FE	4
BF	5
BC	6

KRUSKAL(G):

1 $A = \emptyset$

2 **foreach** $v \in G.V$:

3 MAKE-SET(v)

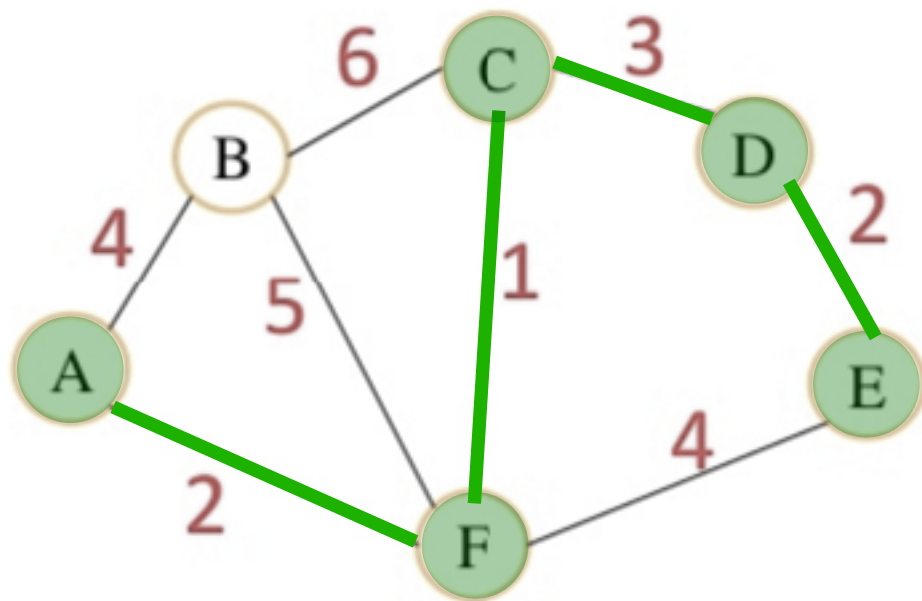
4 **foreach** (u, v) in $G.E$ ordered by $\text{weight}(u, v)$, increasing:

5 **if** FIND-SET(u) \neq FIND-SET(v):

6 $A = A \cup \{(u, v)\}$

7 UNION(FIND-SET(u), FIND-SET(v))

8 **return** A



$A = \{(C,F), (A,F), (D,E), (C,D)\}$

B

A,C,D,F

Edges	Weight
CF	1
AF	2
DE	2
CD	3
AB	4
FE	4
BF	5
BC	6

i continua amb la següent solució:

KRUSKAL(G):

1 $A = \emptyset$

2 **foreach** $v \in G.V$:

3 MAKE-SET(v)

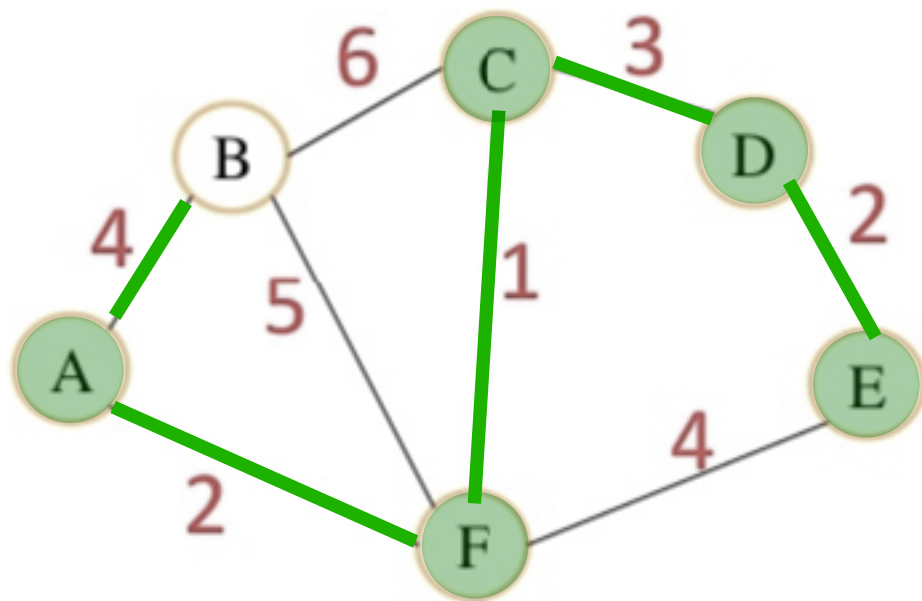
4 **foreach** (u, v) in $G.E$ ordered by $\text{weight}(u, v)$, increasing:

5 **if** FIND-SET(u) \neq FIND-SET(v):

6 $A = A \cup \{(u, v)\}$

7 UNION(FIND-SET(u), FIND-SET(v))

8 **return** A



$A = \{(C,F), (A,F), (D,E), (C,D), (A,B)\}$

A,B,C,D,F

Edges	Weight
CF	1
AF	2
DE	2
CD	3
AB	4
FE	4
BF	5
BC	6

Complexitat Kruskal

KRUSKAL(G):

1 $A = \emptyset$

2 **foreach** $v \in G.V$:

3 MAKE-SET(v)

4 **foreach** (u, v) in $G.E$ ordered by $\text{weight}(u, v)$, increasing:

5 **if** FIND-SET(u) \neq FIND-SET(v):

6 $A = A \cup \{(u, v)\}$

7 UNION(FIND-SET(u), FIND-SET(v))

8 **return** A

?

?

?

Complexitat Kruskal

```
KRUSKAL(G):  
1 A =  $\emptyset$   
2 foreach v  $\in$  G.V:  
3   MAKE-SET(v)  
4 foreach (u, v) in G.E ordered by weight(u, v), increasing:  
5   if FIND-SET(u)  $\neq$  FIND-SET(v):  
6     A = A  $\cup$  {(u, v)}  
7     UNION(FIND-SET(u), FIND-SET(v))  
8 return A
```

$O(V)$

$O(E \log E)$

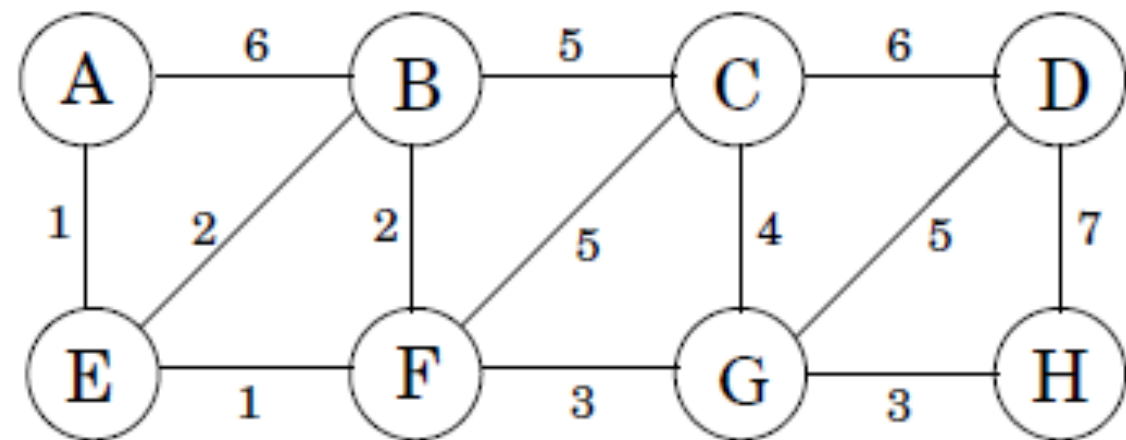
$O(E \log V)$

Complexitat Kruskal

$$\begin{aligned}\text{Complexitat} &= O(1) + O(V) + O(E \log E) + O(E \log V) \\ &= O(E \log E) + O(E \log V) \\ &= O(E \log V)\end{aligned}$$

Exercici: MST i Kruskal

- Exercicis (1):



- A) Quin és el cost del MST?
- B) En quin ordre les arestes són incloses en el MST usant l'algorisme Kruskal?