# CURSO DE PROGRAMACIÓN COMPETITIVA URJC - 2023

## Sesión 5 (8ª Semana)

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- Raúl Fauste (<u>r.fauste.2020@alumnos.urjc.es</u>)



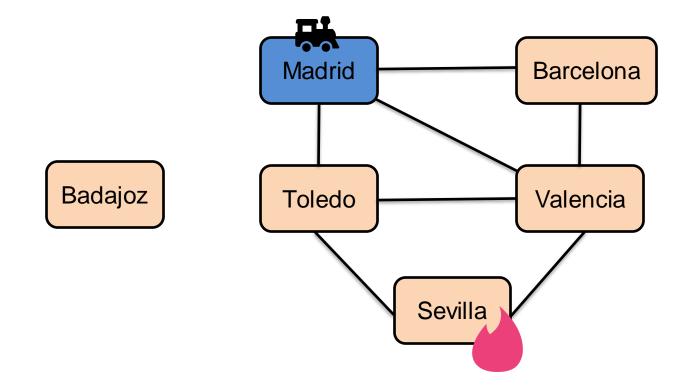
Has hecho match con la pareja de tus sueños. Lo tiene todo, es inteligente, guapa y encima sabe programación competitiva...

Solo tiene un problema...

VIVE EN SEVILLA

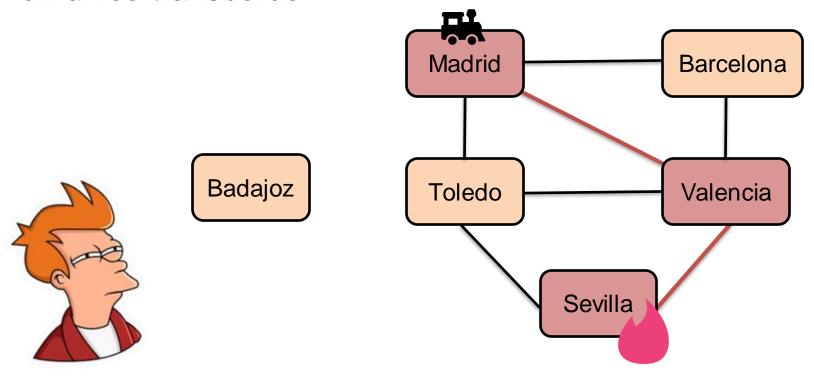


¿Cómo llegamos a Sevilla?



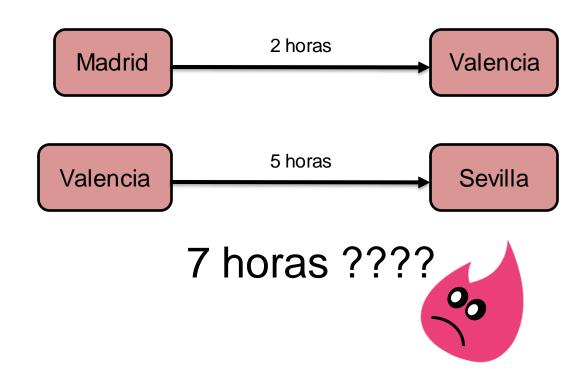


Podemos pasar por Valencia y haremos un único transbordo



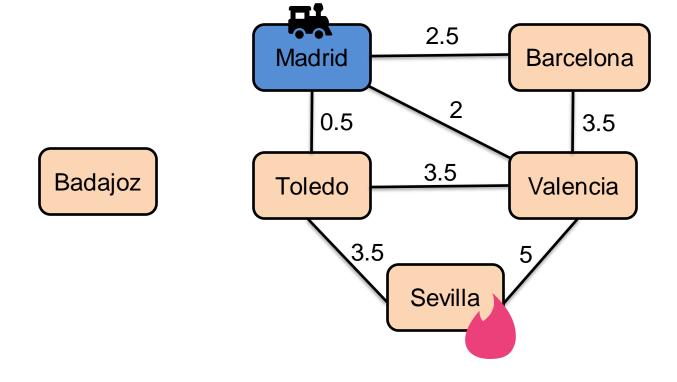


Podemos pasar por Valencia y haremos un único transbordo



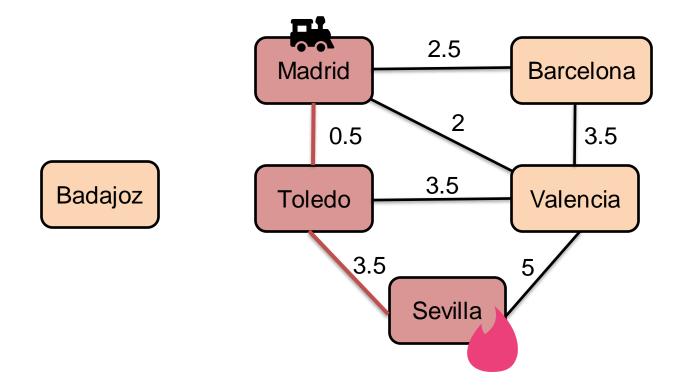


¿Y ahora?



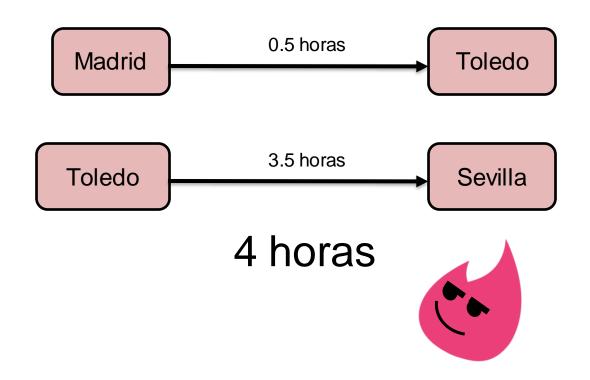


#### Podemos pasar por Toledo





Podemos pasar por Toledo

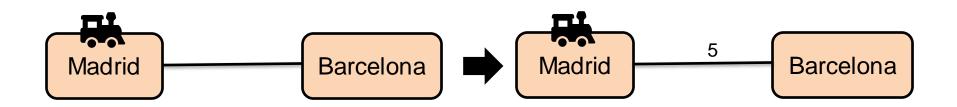




#### **Grafos Ponderados**

A veces no todas las aristas son igual de importantes!!!

Introducimos PESOS en ellas.





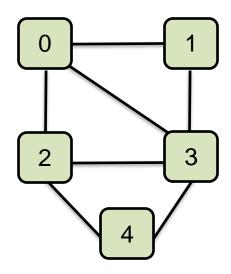
#### **Contenidos**

- Representación de grafos ponderados
- Algoritmos de camino más corto
- Algoritmos de Árboles de Recubrimiento



#### MATRIZ DE ADYACENCIA

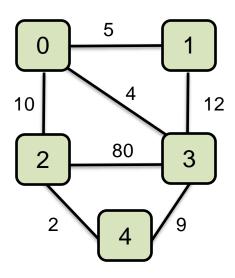
X	0	1	2	3	4
0	1	1	1	1	0
1	1	1	0	1	0
2	1	0	1	1	1
3	1	1	1	1	1
4	0	0	1	1	1





#### MATRIZ DE ADYACENCIA

X	0	1	2	3	4
0	0?	5	10	4	∞
1	5	0?	8	12	∞
2	10	∞	0?	80	2
3	4	12	80	0?	9
4	∞	∞	2	9	0?





#### LISTA DE ARISTAS

(0,1)

(0,2)

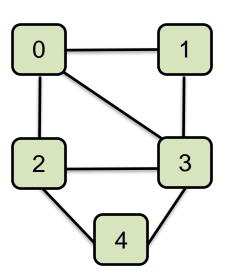
(0,3)

(1,3)

(2,3)

(2,4)

(3,4)





#### LISTA DE ARISTAS

**(0,1,5)** 

(0,2,10)

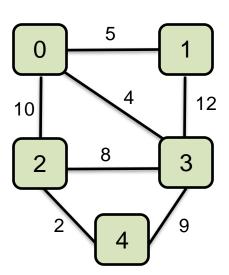
(0,3,4)

(1,3,**12**)

(2,3,80)

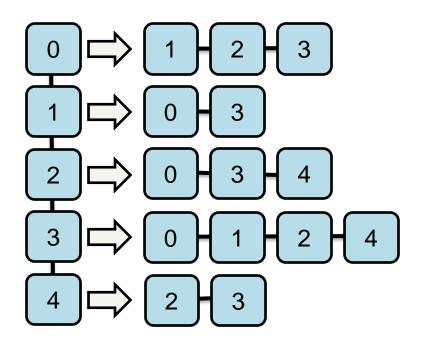
(2,4,**2**)

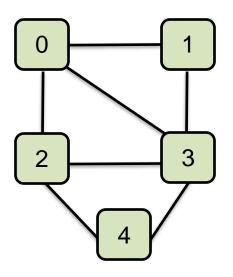
(3,4,**9**)





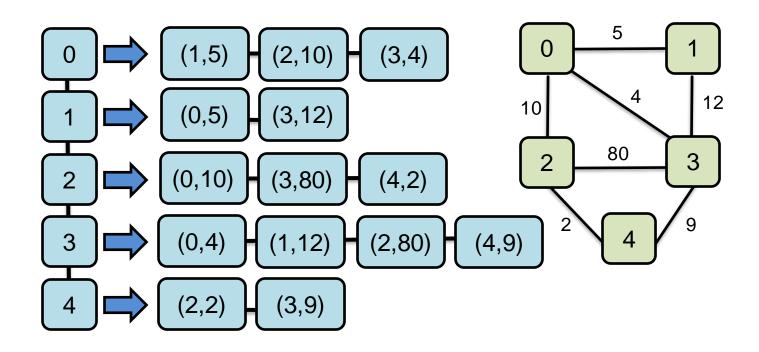
#### LISTA DE ADYACENCIAS







#### LISTA DE ADYACENCIAS





#### LISTA DE ADYACENCIAS

```
class IntPar{
   int nodo, distancia
        IntPar(n,d):
        nodo = n
        distancia = d
}
Arraylist<IntPar>[] = grafo[N]
```



## Problemas y Algoritmos





#### Algoritmos de Caminos más Cortos

Problema 1: ¿CUÁL ES EL CAMINO MÁS CORTO DEL NODO i AL NODO j?

Idea: Problema del viajante (de Tinder)



#### Algoritmos de Caminos más Cortos

#### ALGORITMO DE DIJKSTRA

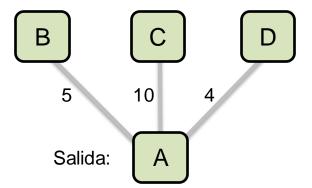
Algoritmo Voraz

IDEA: Si siempre escojo el camino más corto, cuando llegue al final habré llegado en el camino más corto



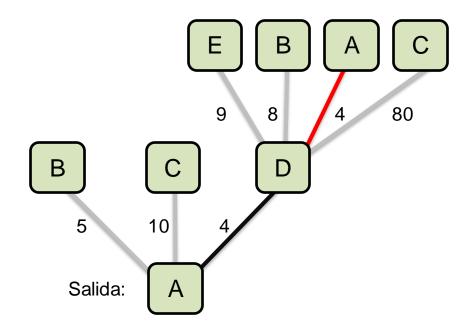


Α	0
В	$\infty$
С	$\infty$
D	$\infty$
Е	∞



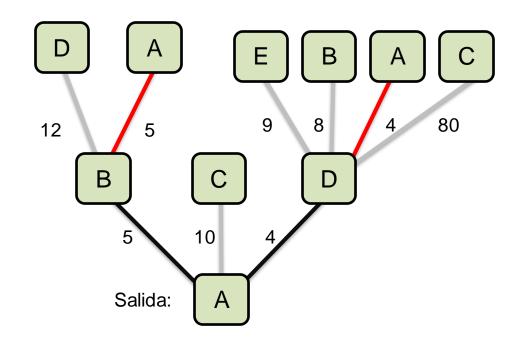


Α	0
В	∞
С	∞
D	4
Е	$\infty$



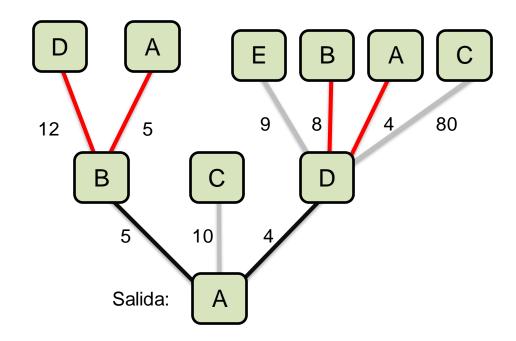


Α	0
В	5
С	$\infty$
D	4
Е	∞



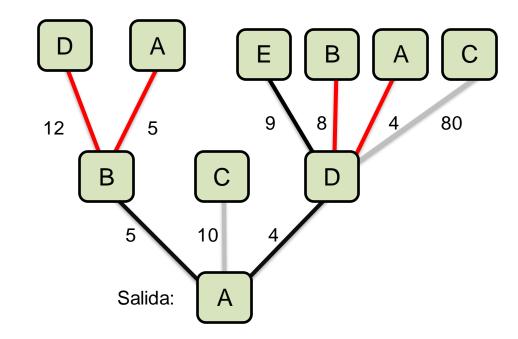


Α	0
В	5
С	∞
D	4
Е	$\infty$





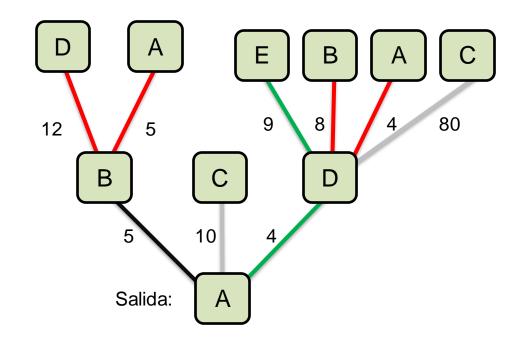
Α	0
В	5
С	∞
D	4
E	13





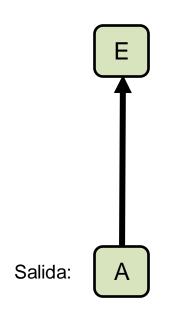


А	0
В	5
С	∞
D	4
Е	13





Α	0
В	5
С	∞
D	4
E	13

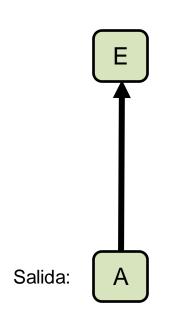




EL CAMINO MÁS CORTO DE A HASTA E ES 13



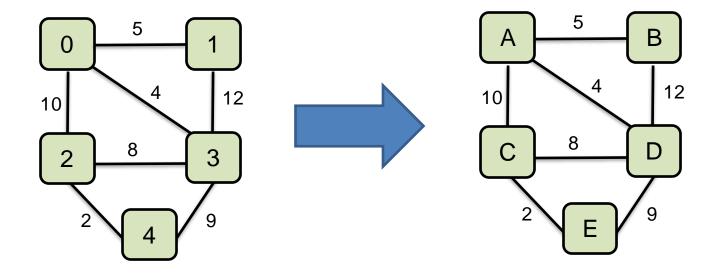
А	0
В	5
С	∞
D	4
E	13



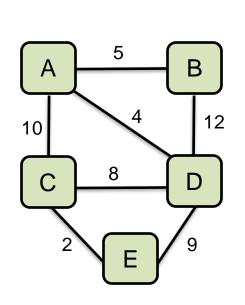


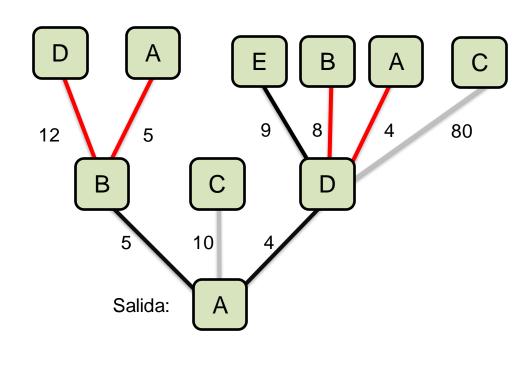
¿¿¿¿EL CAMINO MÁS CORTO DE A HASTA E ES 13????



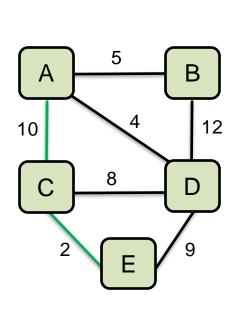


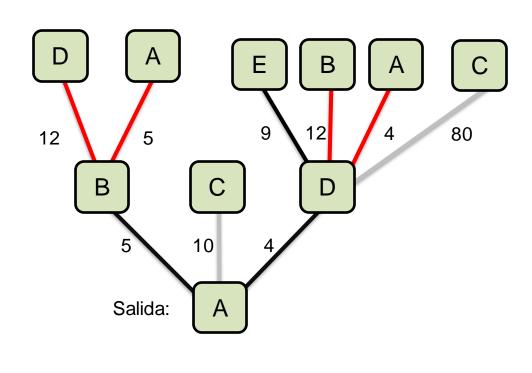






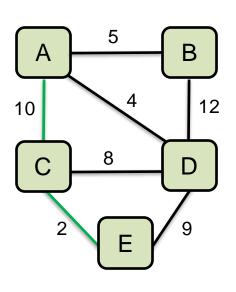


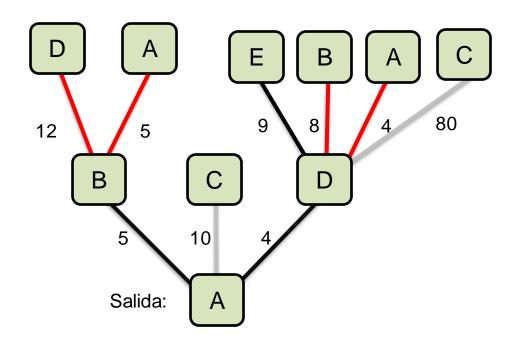






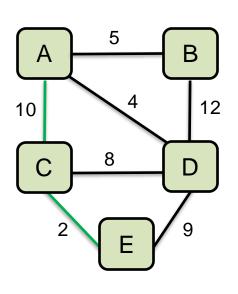
## ¿Dónde está el fallo?

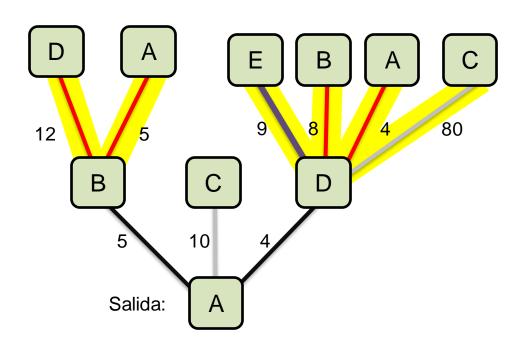






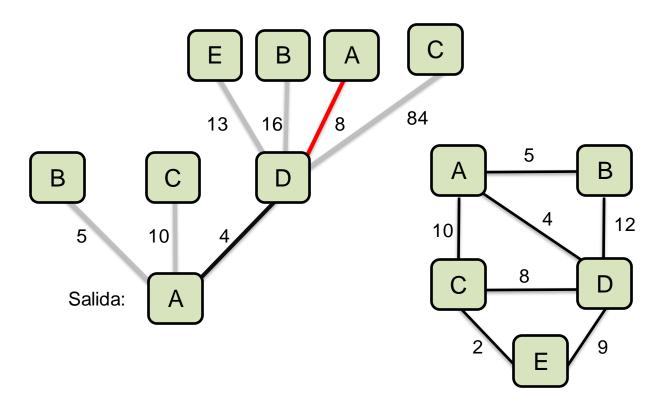
## ¿Dónde está el fallo?







А	0
В	∞
С	$\infty$
D	4
E	$\infty$





# ¿Cómo escogemos el camino más corto de forma eficiente?

iiilterar sobre todas las aristas disponibles en cada paso es muy costoso!!!

O(n) por iteración => O(n²)



#### COLA DE PRIORIDAD

Guardaremos los posibles nuevos caminos con su distancia

¿¿¿Complejidad???



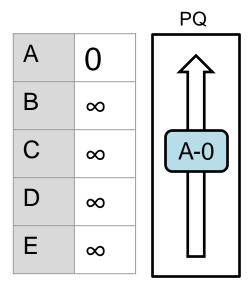
# COLA DE PRIORIDAD

Guardaremos los posibles nuevos caminos con su distancia

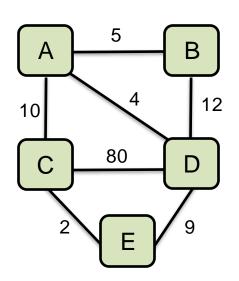
¿¿¿Complejidad??? Insertar y eliminar en una PQ es O(logn) Por cada iteración **O(n logn)** 



Objetivo: E

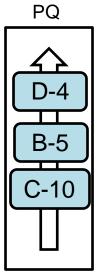


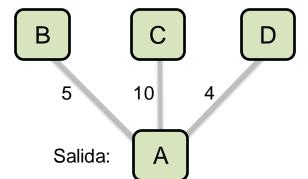
Salida: A

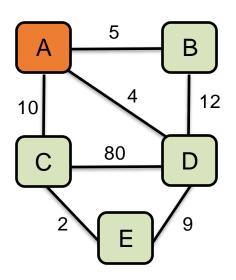




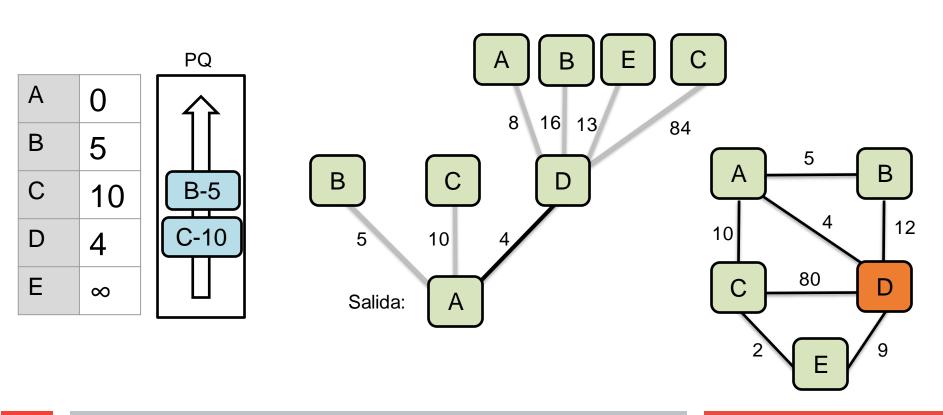
А	0
В	5
С	10
D	4
E	∞



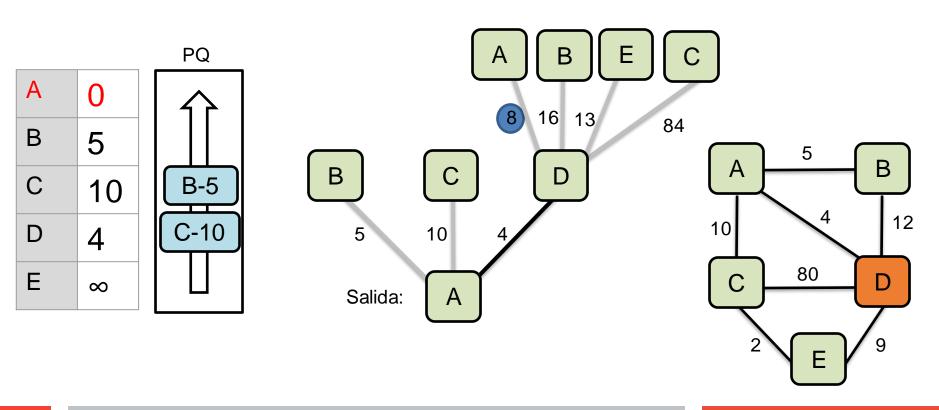




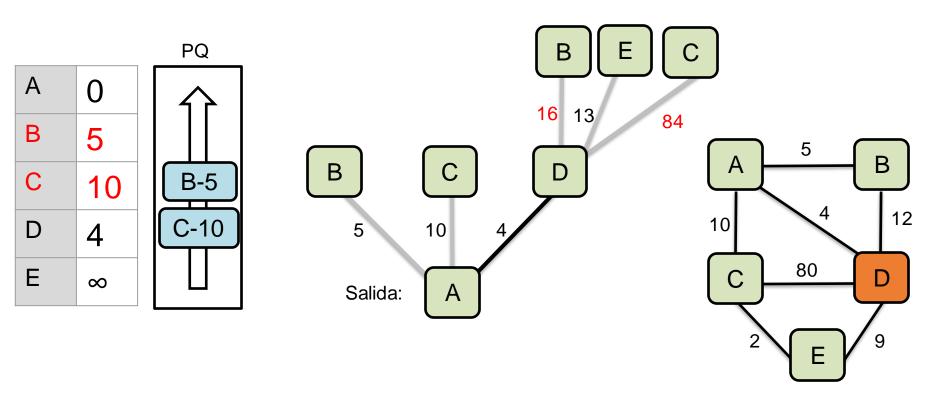




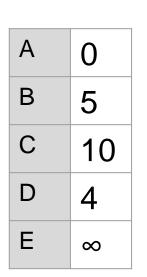


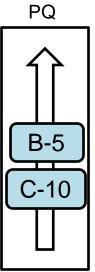


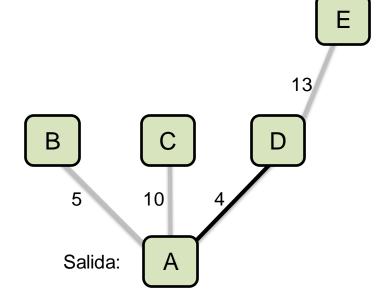


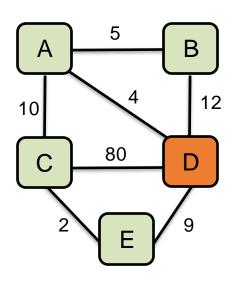






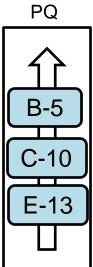


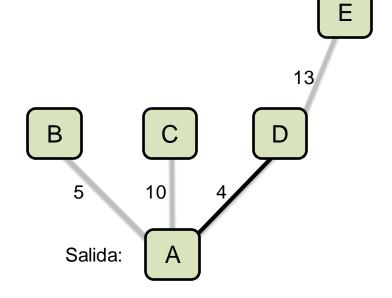


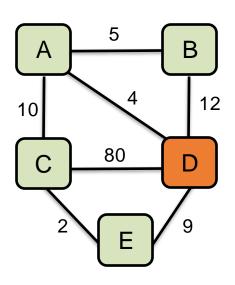




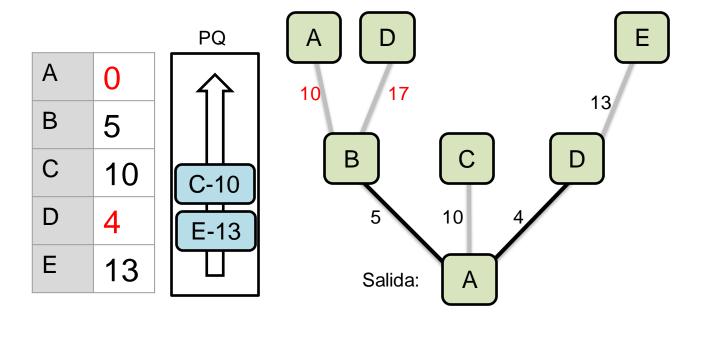
Α	0	
В	5	
С	10	
D	4	
Е	13	

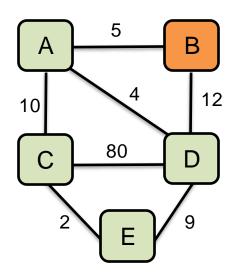




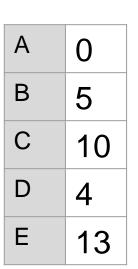


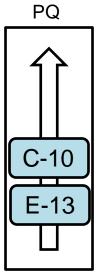


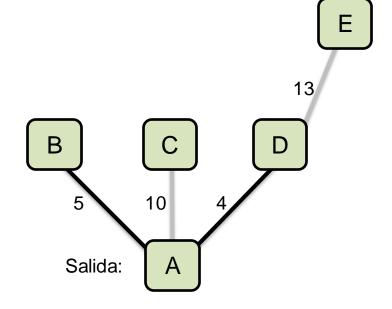


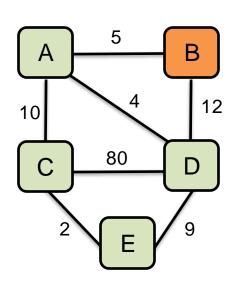






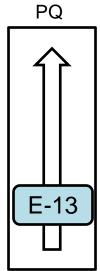


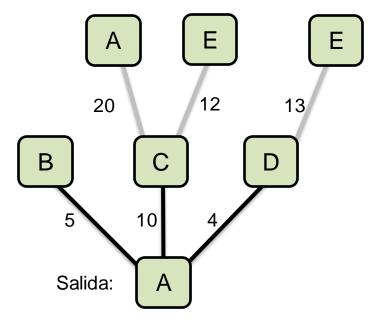


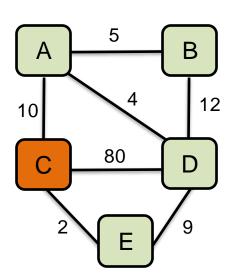




		_
Α	0	
В	5	
С	10	
D	4	
Е	13	

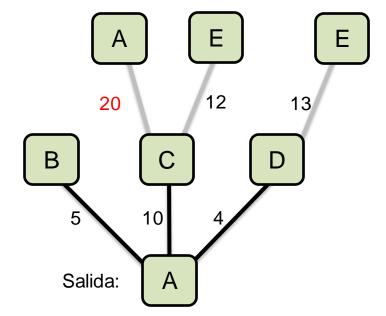


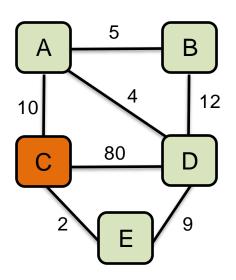






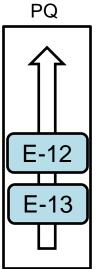
		F	,C	(
Α	0	4	^ 	_ _
В	5			
С	10			
D	4	E	_ -1	3
Е	13			

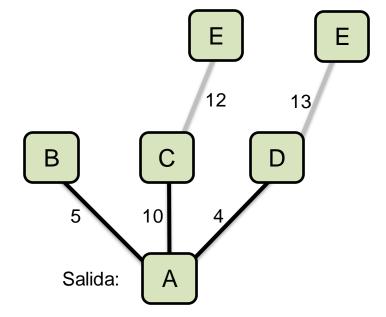


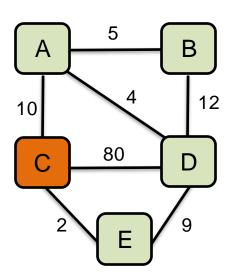




Α	0	
В	5	
С	10	
D	4	
E	12	

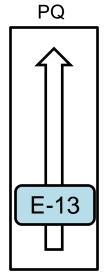


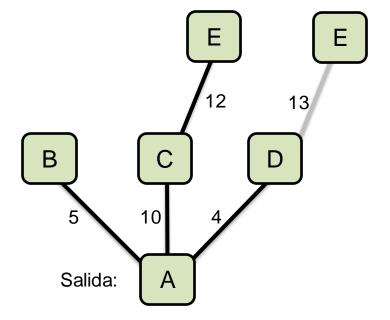


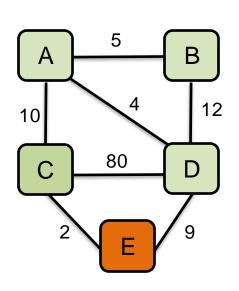




Α	0
В	5
С	10
D	4
E	12

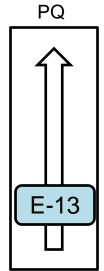


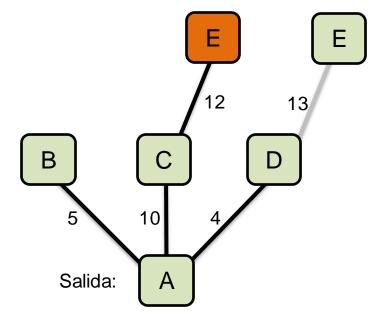


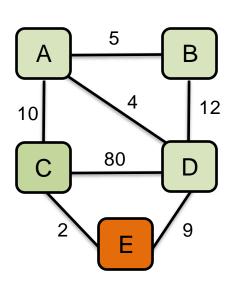




Α	0
В	5
С	10
D	4
E	12









```
DIJKSTRA (Grafo G, nodo s)
       for u \in V[G] do
                                                           Consejo:
           distancia[u] = INFINITO
                                                           Coged un código que
           padre[u] = NULL
           visto[u] = false
                                                           funcione y al dosier!!!
       distancia[s] = 0
       adicionar (cola, (s, distancia[s]))
                                                            https://github.com/stevenhalim/c
       while cola no es vacía do
                                                            pbook-
                                                            code/tree/master/ch4/sssp
           u = extraer_minimo(cola)
           visto[u] = true
           for todos v \in adyacencia[u] do
               if ¬ visto[v]
                   if distancia[v] > distancia[u] + peso (u, v) do
                       distancia[v] = distancia[u] + peso (u, v)
                       padre[v] = u
                       adicionar(cola,(v, distancia[v]))
```



Problema 2: ¿CUÁL ES EL CAMINO MÁS CORTO DEL NODO i AL RESTO?



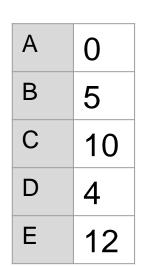
#### ALGORITMO DE DIJKSTRA

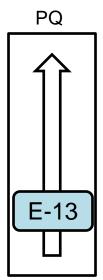
Algoritmo Voraz

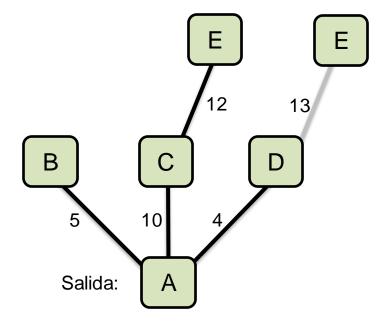
IDEA: Terminar hasta que la PQ esté vacía

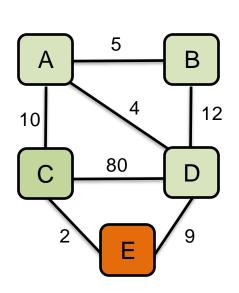




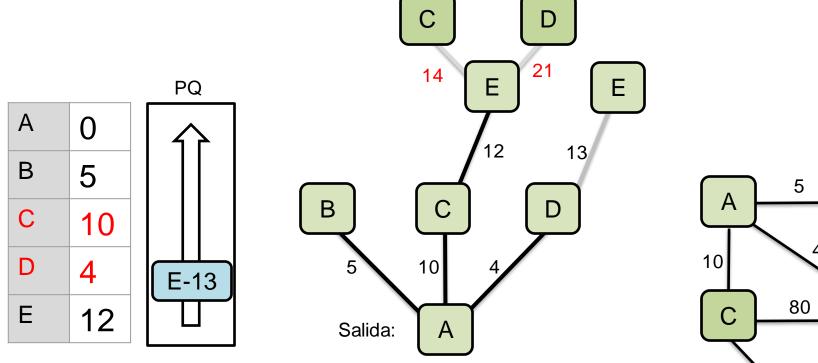


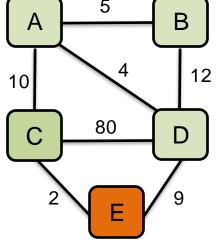




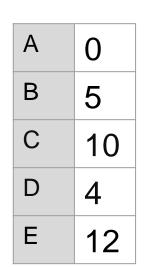


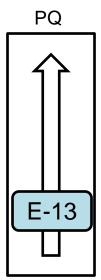


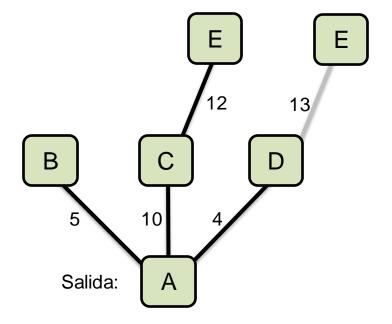


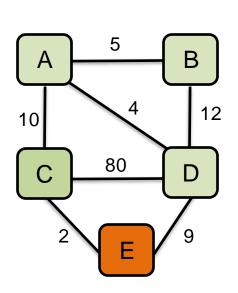




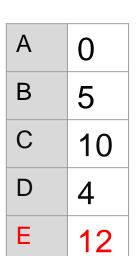


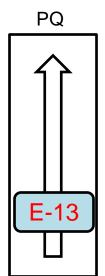


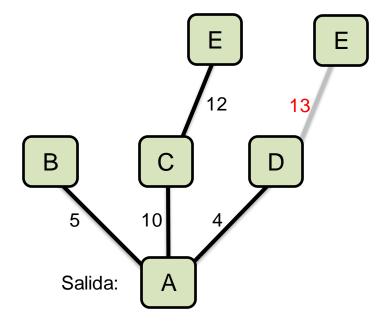


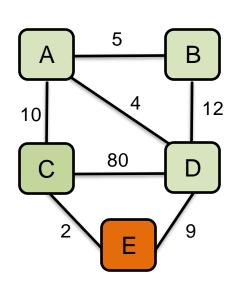




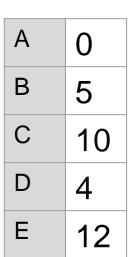


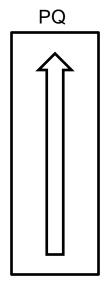


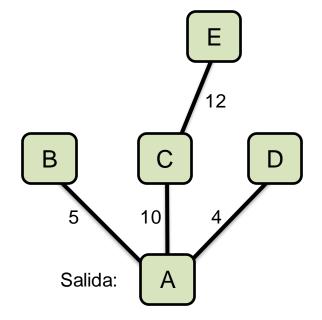


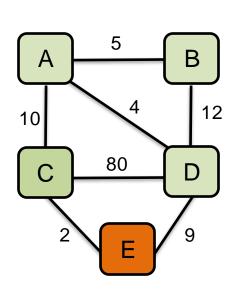






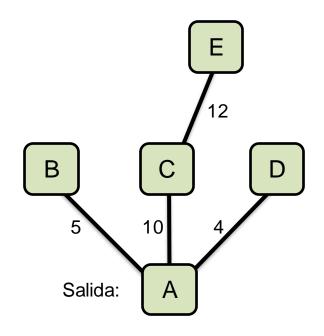








Α	0
В	5
С	10
D	4
Е	12





Problema 3: ¿CUÁL ES EL CAMINO MÁS CORTO DESDE CUALQUIER NODO AL RESTO?



#### ALGORITMO DE DIJKSTRA

Algoritmo Voraz

IDEA: Lanzar un dijkstra desde todos los nodos...





# NO LO VOY A HACER:)





#### ALGORITMO DE FLOYD-WARSHALL

Algoritmo de Programación Dinámica

IDEA: ¿Qué es más rápido ir del nodo i al nodo j pasando por el nodo k o sin pasar?

¡¡Se implementa sobre la matriz de adyacencia!!





```
for k from 0..N
  for i from 0..N
  for j from 0..N
    graph[i][j] = min( graph[i][j], graph[i][k] +
graph[k][j])
```

X	0	1	2	3	4
0	0	5	10	4	∞
1	5	0	∞	12	∞
2	10	∞	0	80	2
3	4	12	80	0	9
4	∞	∞	2	9	0



X	0	1	2	3	4
0	0	5	10	4	12
1	5	0	15	12	18
2	10	15	0	80	2
3	4	12	80	0	9
4	12	18	2	9	0

¿¿¿¿Complejidad????

https://github.com/stevenhalim/cpbook-code/tree/master/ch4

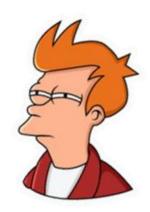
```
for k from 0..N
  for i from 0..N
  for j from 0..N
    graph[i][j] = min( graph[i][j], graph[i][k] +
graph[k][j])
```

```
¿¿¿¿Complejidad????
O(n³)
```

```
for k from 0..N
  for i from 0..N
  for j from 0..N
    graph[i][j] = min( graph[i][j], graph[i][k] +
graph[k][j])
```

```
¿¿¿¿Complejidad????
                            O(n^3)
for k from 0...N
  for i from 0...N
    for j from 0...N
      graph[i][j] = min( graph[i][j], graph[i][k] +
graph[k][j])
```

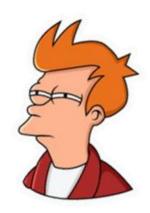
¿¿¿¿Complejidad de lanzar n Dijkstras????



Floyd-Warshall: O(n<sup>3</sup>)

¿¿¿¿Complejidad de lanzar n Dijkstras????

N Dijkstras : O(n² logn)



Floyd-Warshall : O(n<sup>3</sup>)

N Dijkstras: O(n² logn)

¿¿¿¿Para qué usar Floyd-Warshall????



Floyd-Warshall : O(n<sup>3</sup>)

¡¡¡Observad los <u>límites</u> de los problemas!!!

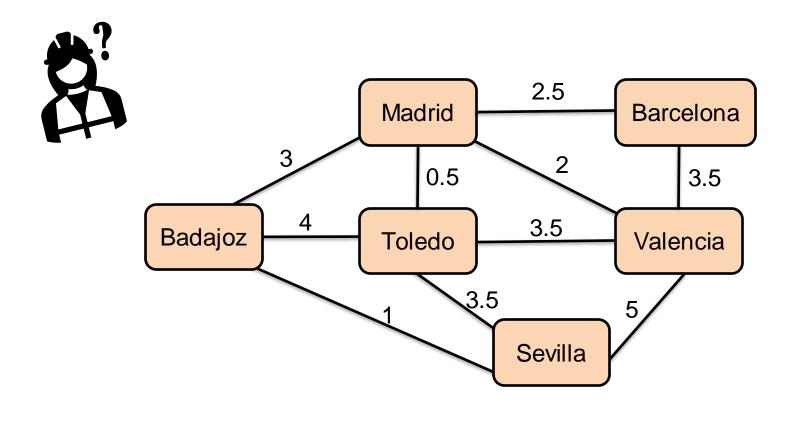
Floyd-Warshall se programa en **segundos** 



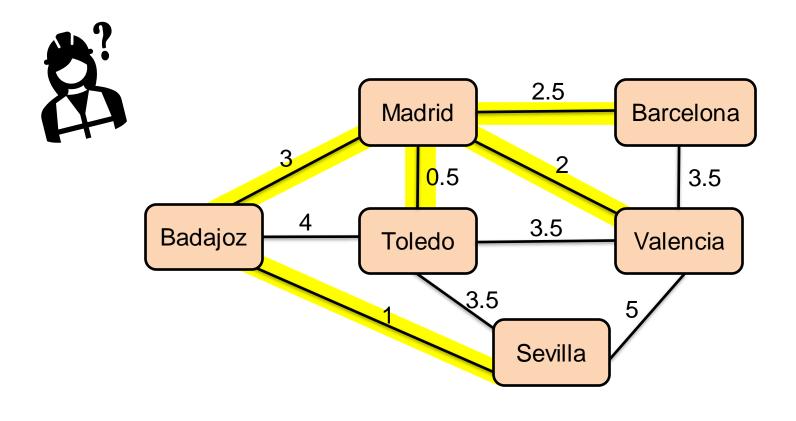
N Dijkstras :  $O(n^2 \log n)$  Floyd-Warshall :  $O(n^3)$ n = 2000 n = 400

Problema 4: Encontrar el subgrafo conexo más pequeño que contiene todos los vértices.

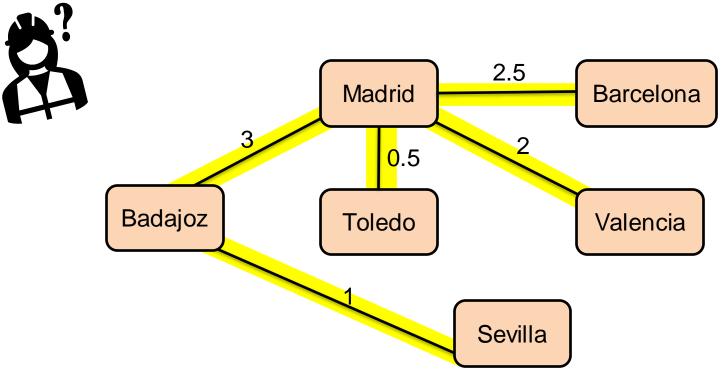






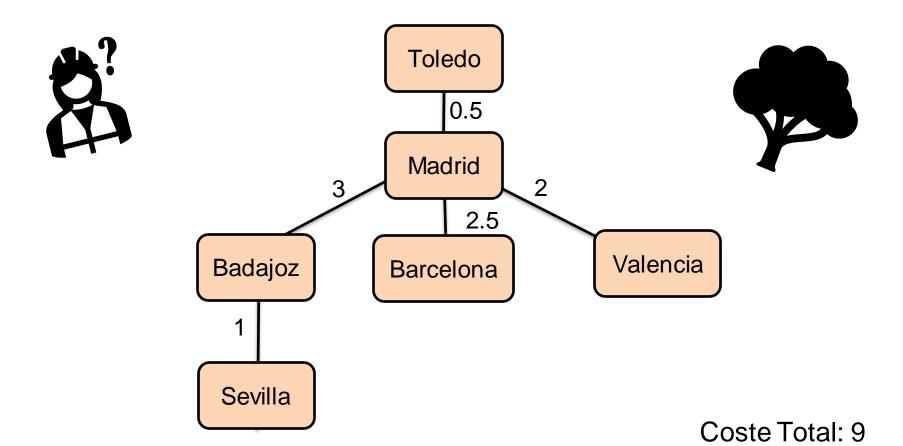






Coste Total: 9







¿Siempre el grafo será un Árbol?

- Grafo Conexo
- Entre todos los vértices
- Acíclico



¿Siempre el grafo será un Árbol?

- Grafo Conexo
- Entre todos los vértices
- Acíclico

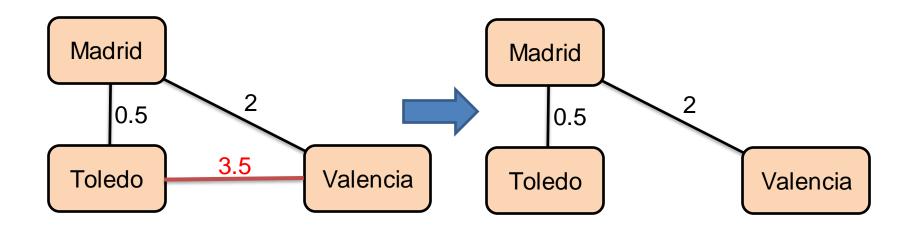


¿Siempre el grafo será un Árbol?

- Grafo Conexo
- Entre todos los vértices
- Acíclico?



#### Los ciclos son inútiles!!!





## Dos Algoritmos:

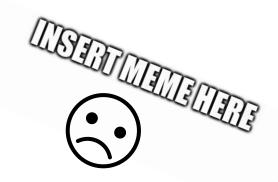
- Algoritmo de Prim
- Algoritmo de Kruskal



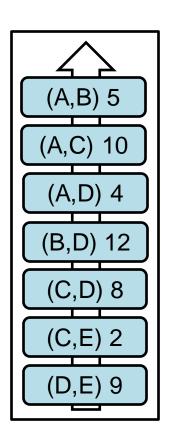
#### ALGORITMO DE KRUSKAL

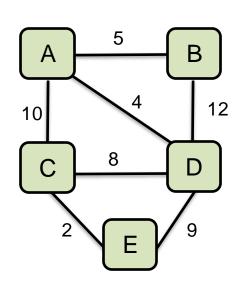
Algoritmo Voraz

IDEA: Ir escogiendo las aristas más pequeñas que no hagan ciclos hasta que el árbol se complete.

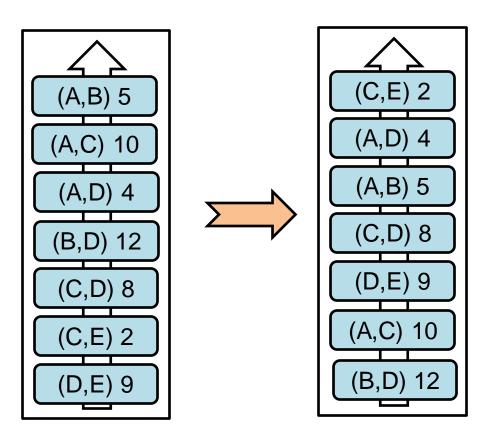


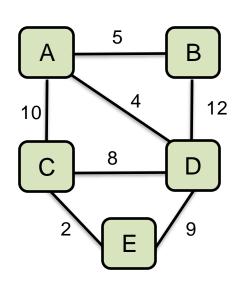




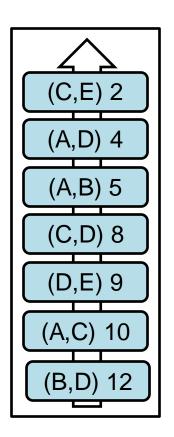


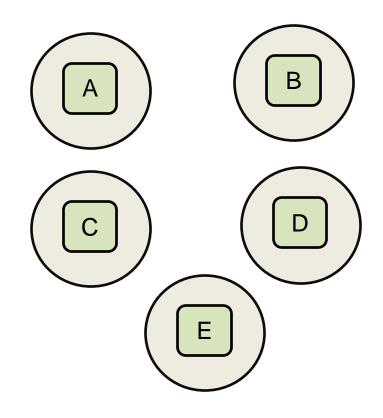


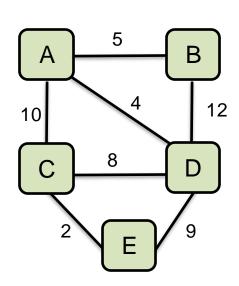






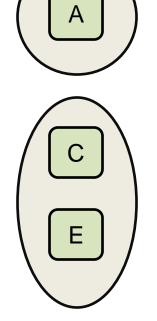


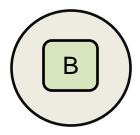


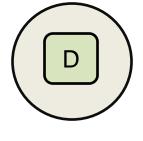


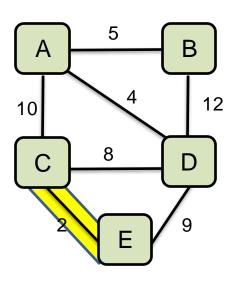


(C,E) 2 (A,D) 4 (A,B) 5 (D,E) 9



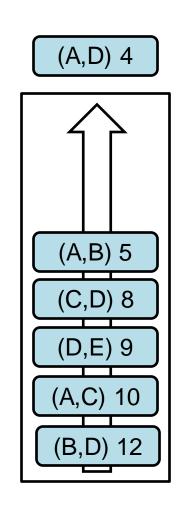


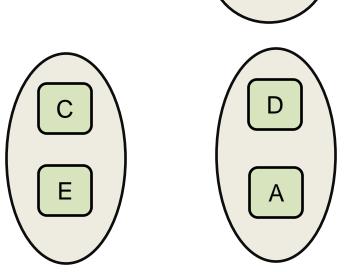


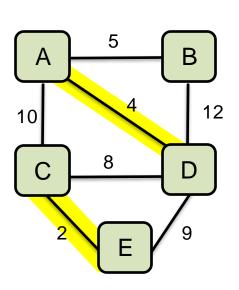




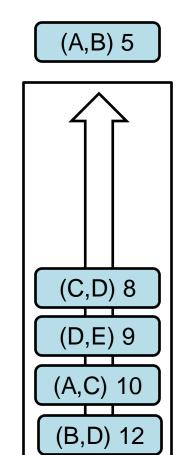
В

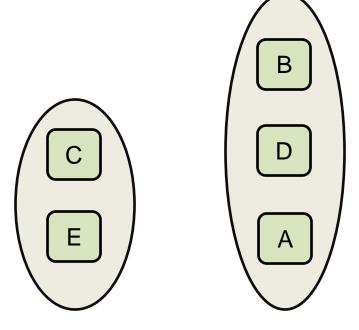


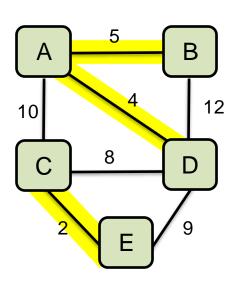




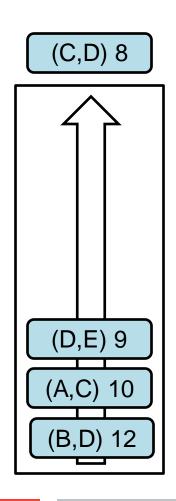


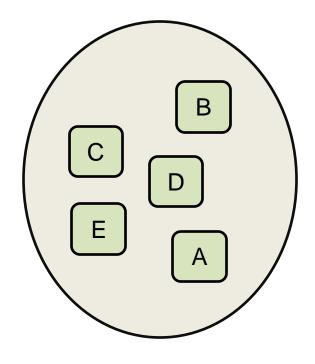


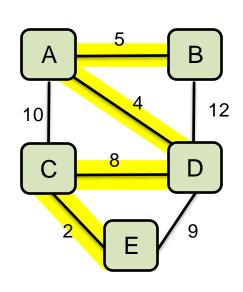




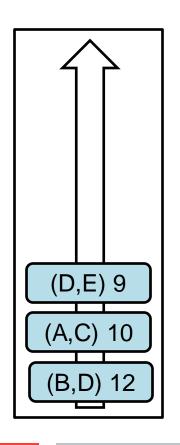


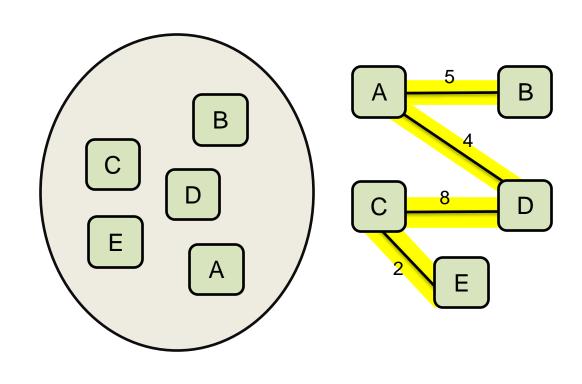




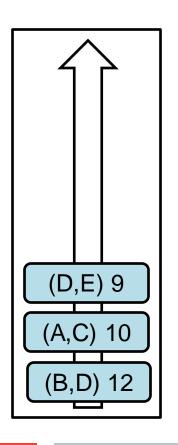


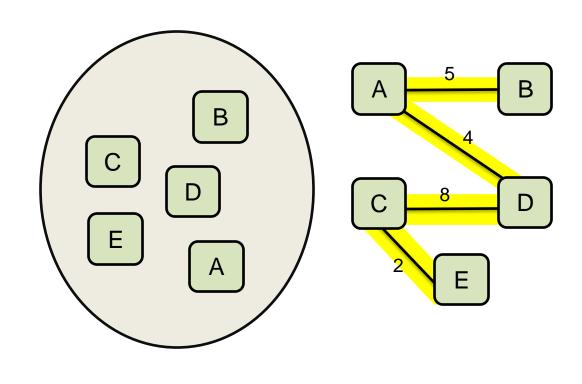










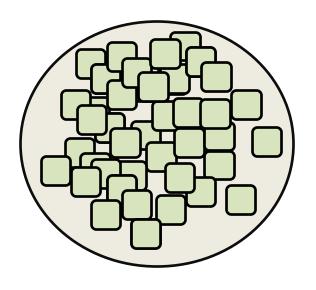


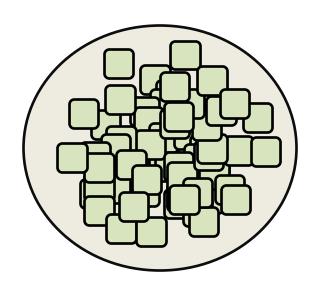


- ¿Cómo hacemos los conjuntos?
- Sets??



- ¿Cómo hacemos los conjuntos?
- Sets??

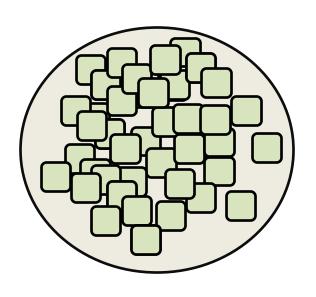




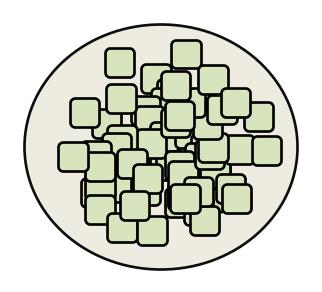


# ¿Cómo hacemos los conjuntos?

Sets??



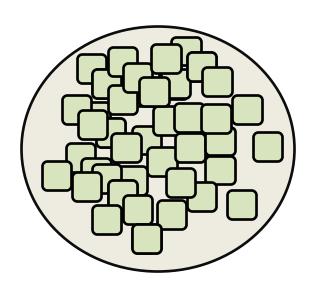
Tenemos que eliminar cada nodo de un conjunto y añadirlo en el otro



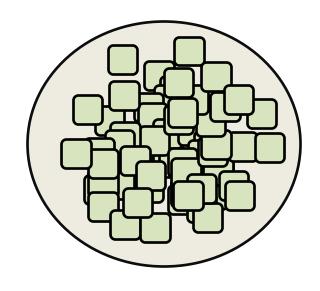


# ¿Cómo hacemos los conjuntos?

Sets??



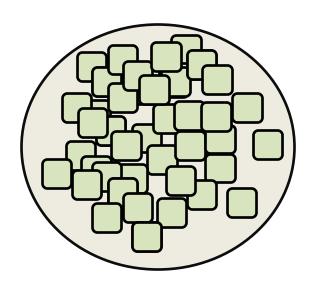
¿Complejidad?





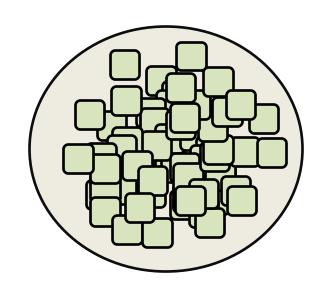
## ¿Cómo hacemos los conjuntos?

Sets??



¿Complejidad?

O(n)





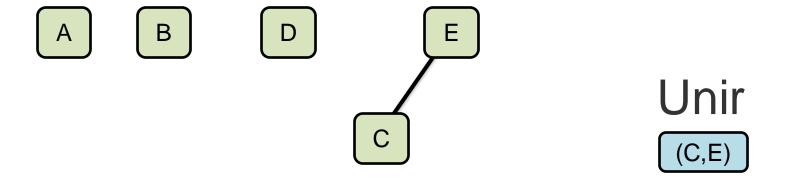
## ¿Cómo hacemos los conjuntos?

- Union-Find
  - Todos los conjuntos son árboles
  - Si dos nodos tienen la misma raíz, se considera que están en el mismo conjunto
  - Operaciones básicas:
    - Buscar
    - Unir
    - Igual

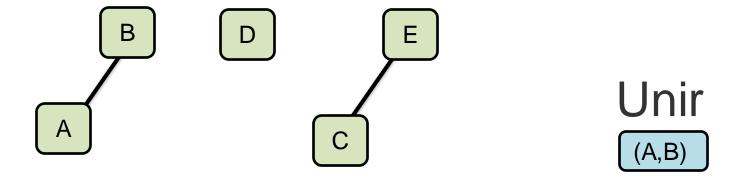




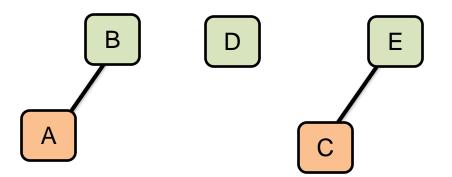


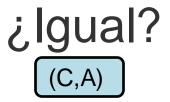




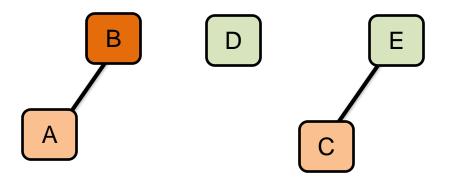


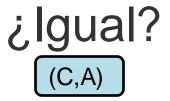






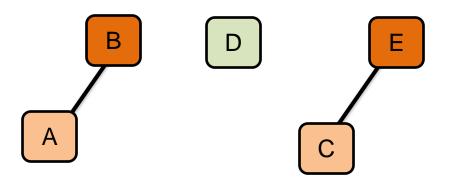


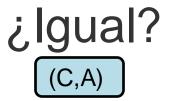




$$B = ?$$

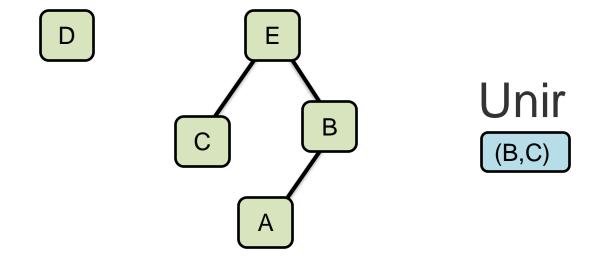






$$B = E$$







```
función Kruskal(G)
  Para cada v en V[G] hacer
    Nuevo conjunto C(v) = {v}.
  Nuevo heap Q que contiene todas las aristas de G,
ordenando por su peso
  Defino un árbol T = Ø
  Mientras T tenga menos de n-1 aristas y
!Q.vacío() hacer
    (u,v) ← Q.sacarMin()
    Si C(v) ≠ C(u) hacer
    Agregar arista (v,u) a T
    Merge C(v) y C(u) en el conjunto
  Responder árbol T
```

Consejo: Coged un código que funcione y al dosier!!!

https://github.com/stevenhalim/cpbook-code/tree/master/ch4/mst



#### ALGORITMO DE PRIM

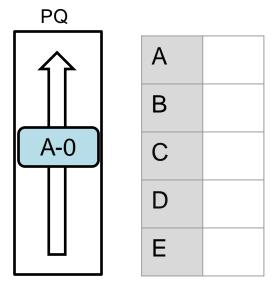
Algoritmo Voraz

IDEA: Iniciar desde un nodo y hacer crecer el árbol por las aristas más pequeñas

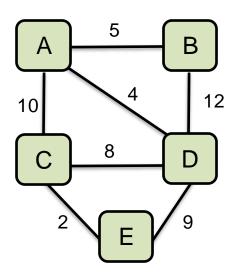




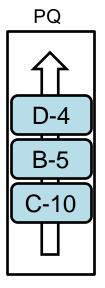
## Algoritmo de Prim



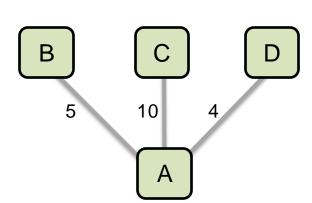


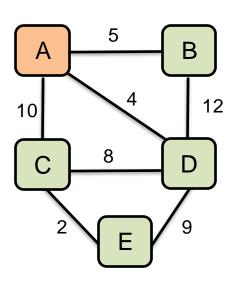




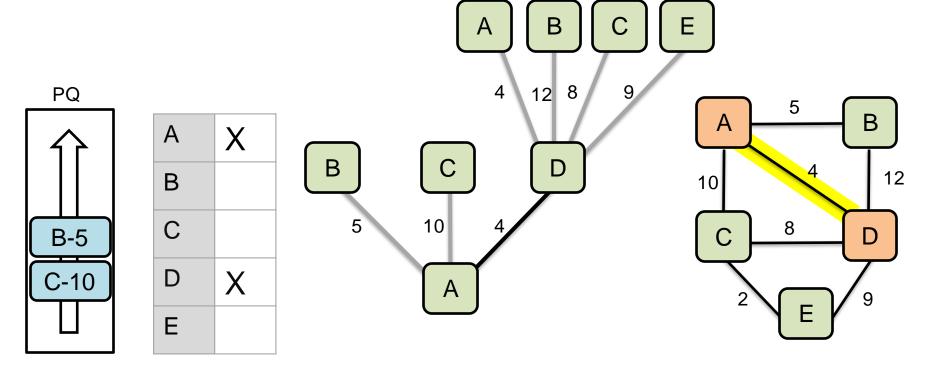


Α	X
В	
С	
D	
E	

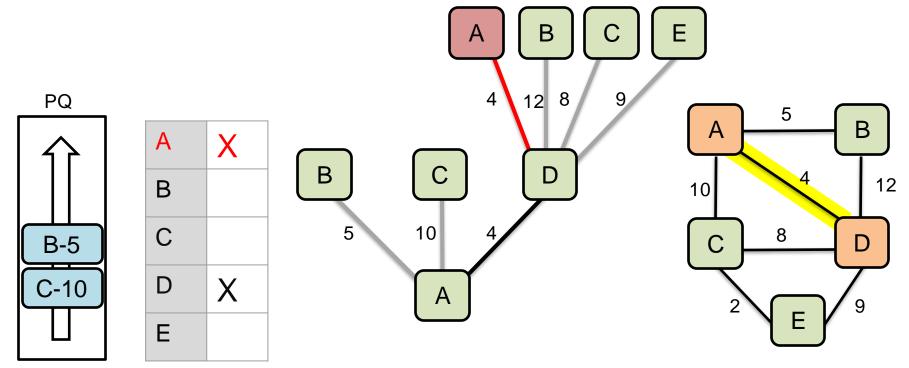




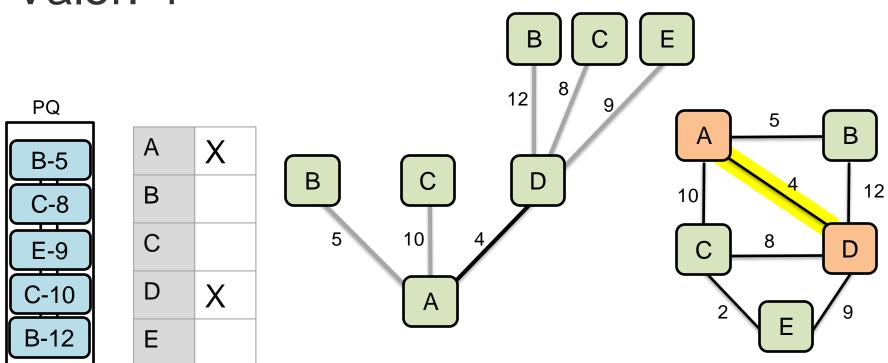




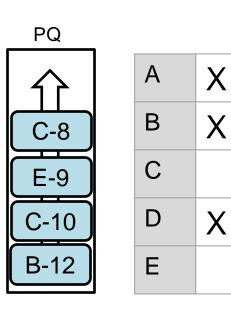


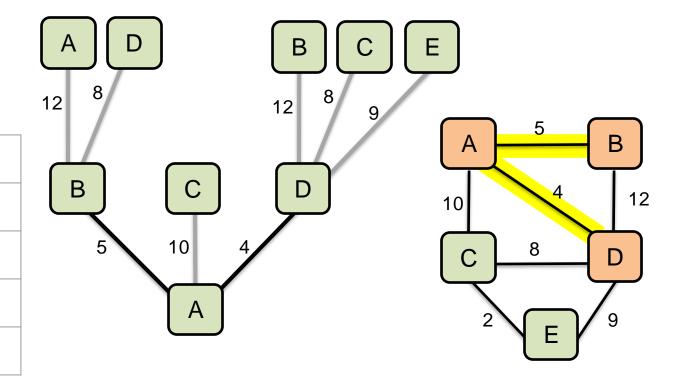




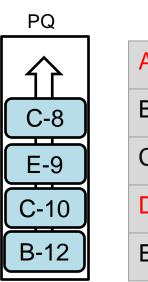


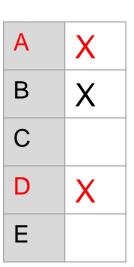


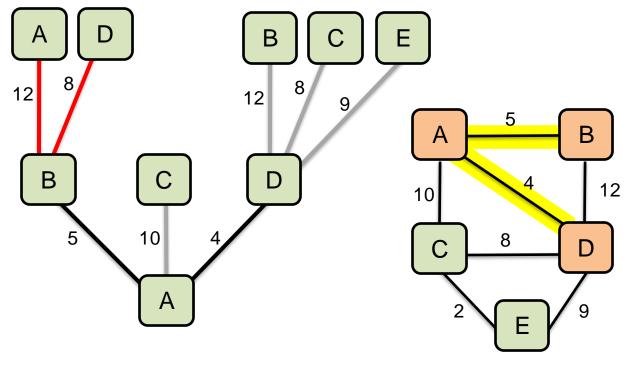




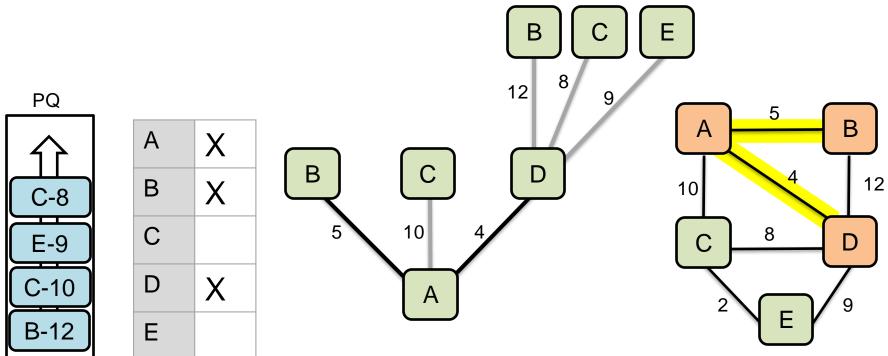




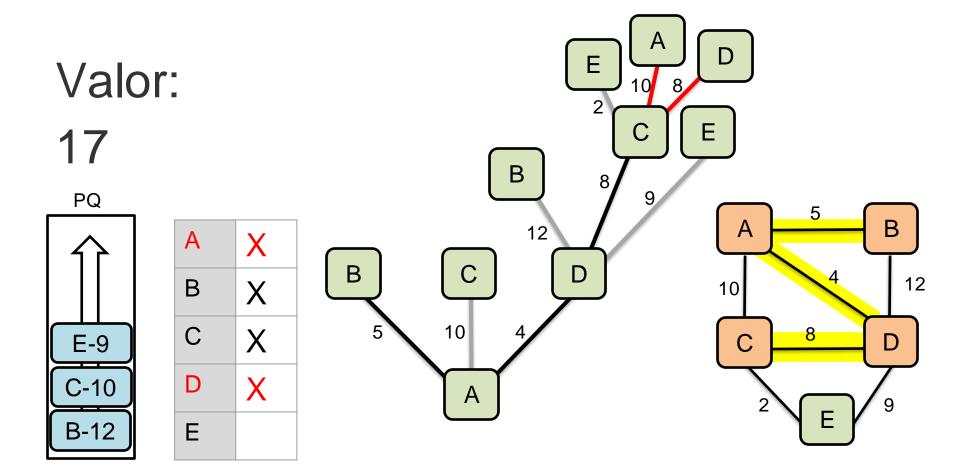




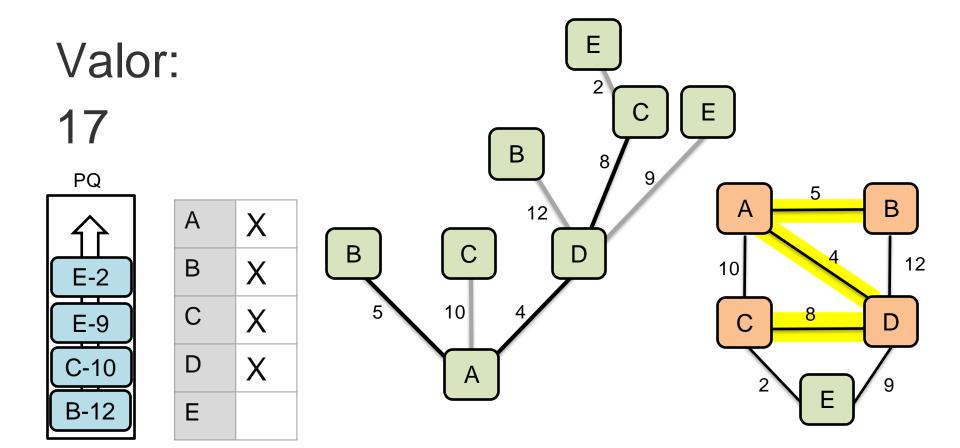




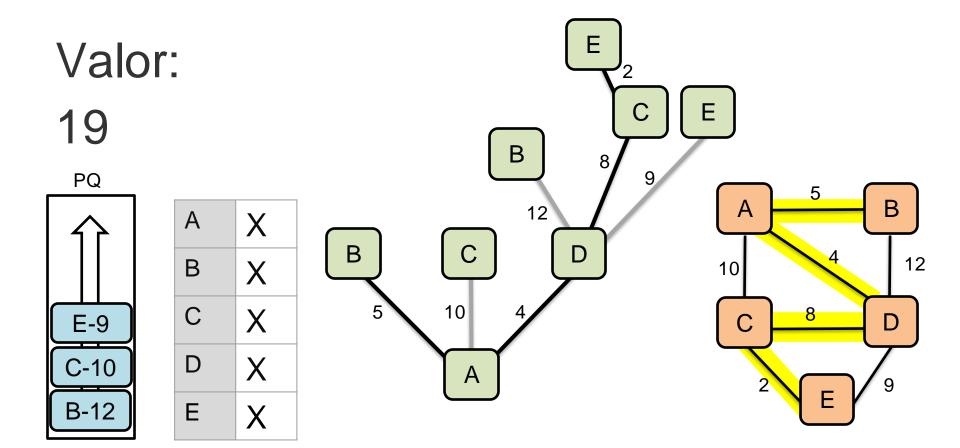




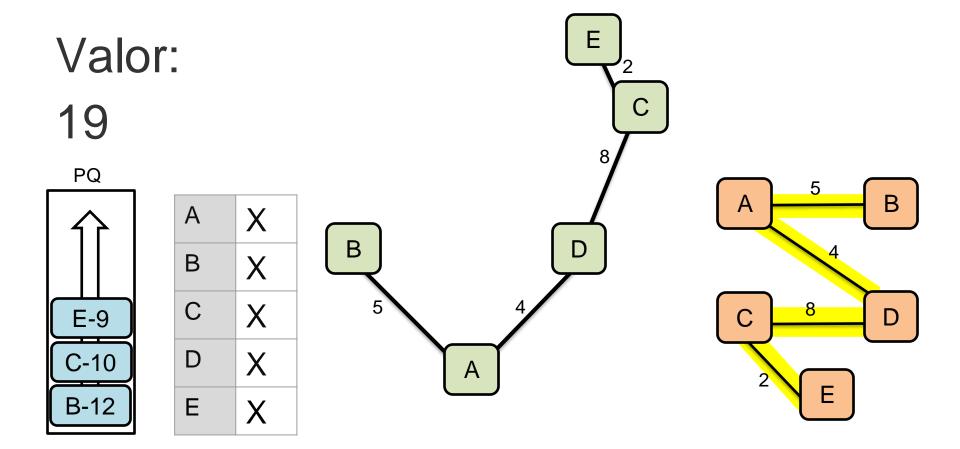














```
Prim (Grafo G)
                                                 Consejo:
      for u en V[G] do
                                                 Coged un código que
          distancia[u] = INFINITO
                                                 funcione y al dosier!!!
          padre[u] = NULL
          Añadir(cola, <u, distancia[u]>)
      distancia[u]=0
                                                https://github.com/stevenhalim/c
                                                pbook-code/tree/master/ch4/mst
      Actualizar(cola, <u, distancia[u]>)
      while !esta vacia(cola) do
          u = extraer minimo(cola)
          for v adyacente a 'u' do
               if ((v \in cola) \&\& (distancia[v] > peso(u, v))
                   padre[v] = u
                   distancia[v] = peso(u, v)
                   Actualizar(cola, <v, distancia[v]>)
```



#### Ejemplo de grafos

## Acepta el reto - De aventuras por el amazonas. Problema: 281

https://onlinejudge.org/index.ph p?option=com\_onlinejudge&lte mid=8&category=24&page=sho w\_problem&problem=1927

https://onlinejudge.org/index.ph p?option=com\_onlinejudge&Ite mid=8&category=24&page=sho w\_problem&problem=2169 https://onlinejudge.org/index.ph p?option=com\_onlinejudge&lte mid=8&category=24&page=sho w\_problem&problem=1742

https://onlinejudge.org/index.ph p?option=com\_onlinejudge&Ite mid=8&category=24&page=sho w\_problem&problem=989

#### **Bloque siguiente...**

# PROGRAMACIÓN DINÁMICA



#### ¡Hasta la próxima semana!

#### Ante cualquier duda Telegram o correo:

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- Raúl Martín (<u>raul.martin@urjc.es</u>)
- Sergio Salazar (<u>s.salazarc.2018@alumnos.urjc.es</u>)
- Francisco Tórtola (<u>f.tortola.2018@alumnos.urjc.es</u>)
- Cristian Pérez (<u>c.perezc.2018@alumnos.urjc.es</u>)
- Xuqiang Liu (x.liu1.2020@alumnos.urjc.es)
- Alicia Pina (<u>a.pinaz.2020@alumnos.urjc.es</u>)
- Sara García (<u>s.garciarod.2020@alumnos.urjc.es</u>)
- Raúl Fauste (<u>r.fauste.2020@alumnos.urjc.es</u>)