



Tecniche Algoritmiche per Grafi e Reti

**Algoritmi approssimati  
e parametrizzati**

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# A world full of NP-Hard problems

- ▶ **Problem:** I want to travel among a set of cities driving the fewest possible number of KMs.

- IT'S DIFFICULT!!



- ▶ **Problem:** I want to put a set of objects into some bags, knowing that each bag can not afford more than 10 KGs and trying to use as few bags as possible.

- IT'S DIFFICULT!!



# How to deal with NP-Hard problems?

## ▶ **Exact Algorithms**

- Esatti ma lenti. Solo istanze piccole

## ▶ **Approximation Algorithms**

- Veloci ma non esatti, errore limitato

## ▶ **Fixed-Parameter Algorithms**

- Se un certo parametro è costante, problema polinomiale

## ▶ **Randomized Algorithms**

- Non-determinismo
- Probabilmente esatti; veloci e probabilmente non molto sbagliati; oppure esatti e probabilmente non troppo lenti

# Approximation Algorithms

# Approximation Algorithms

- ▶ We want a solution that is **close** to the optimal one
- ▶ Given a minimization problem  $P$ , an algorithm is an  **$\alpha$ -approximation** for  $P$  if, for every instance  $I$  of  $P$ , it outputs a solution  $SOL(I)$  such that

$$SOL(I)/OPT(I) \leq \alpha$$

# Approximation Algorithms

$$SOL(I)/OPT(I) \leq \alpha$$

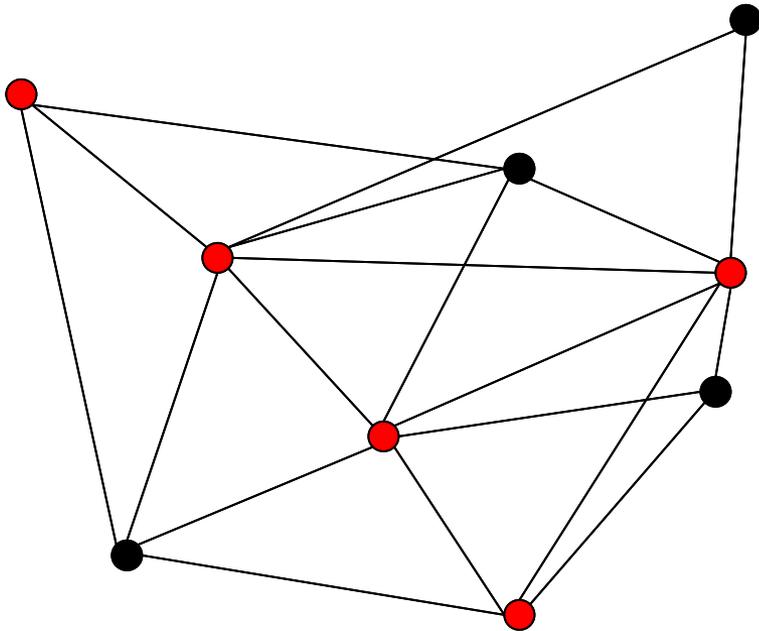
If we knew  $OPT(I)$  we would not need an approximated solution...



## Lower Bounds

# Vertex Cover

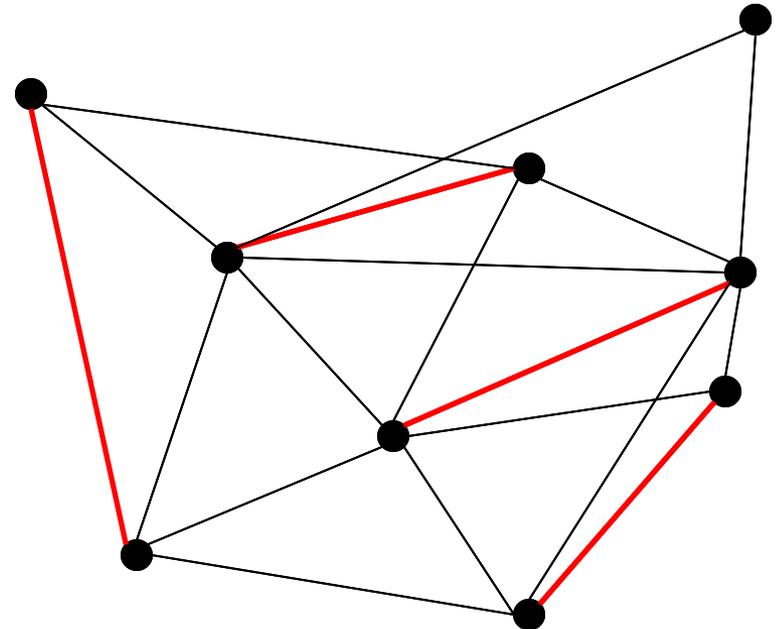
- ▶ **Problem:** find a *minimum vertex cover* of a graph  $G(V,E)$ , that is, the smallest set  $V' \subseteq V$  such that every edge of  $E$  has an end-vertex in  $V'$ .



NP-hard ☹️  
[Karp]

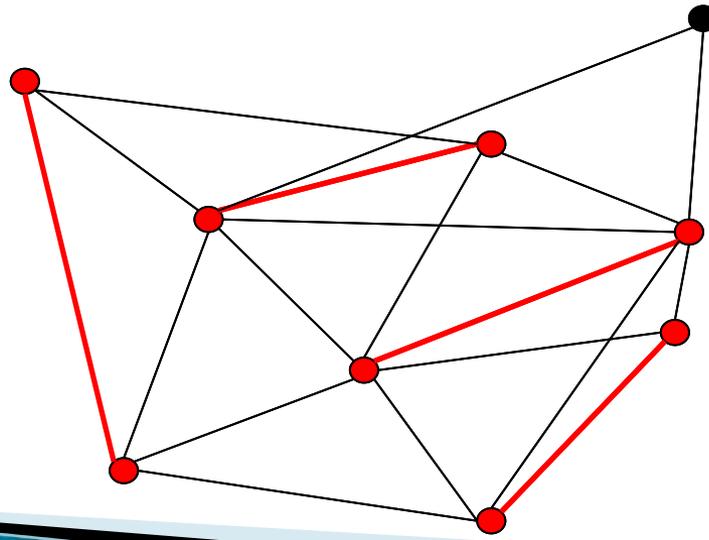
# Vertex Cover – Lower Bound

- ▶ A *matching*  $M$  of a graph  $G(V,E)$  is a set of edges such that no two edges share an end-vertex.
- ▶ A matching is *maximal* if no matching  $M'$  exists such that  $M \subset M'$ .
- ▶ The size of a matching is a **lower bound** on the size of an optimal solution of *Vertex Cover*



# Vertex Cover – Maximal Matching

- ▶ **Lemma:** the set of matched vertices in a maximal matching  $M$  of a graph  $G(V,E)$  is a vertex cover of  $G$ .
- ▶ **Proof:** Suppose, for a contradiction, that there exists an edge  $(u,v)$  such that  $u$  and  $v$  are not in the vertex cover. Then,  $u$  and  $v$  are not matched, as well. Hence,  $(u,v)$  could be added to  $M$ , a contradiction.



# Vertex Cover – Approximation Algorithm

**Algorithm:** Find a *maximal matching*  $M$  of  $G$  and output the set  $S$  of *matched vertices*.

$$SOL(G) = |S| = 2|M| \leq 2OPT(G)$$

$$SOL(G) / OPT(G) \leq 2$$

The above algorithm is a *2-approximation*

# Approximation Algorithms: Complexity Classes

**INAPX**

*Maximum Clique Problem*

**APX**

*Vertex Cover*

**PTAS**

*Traveling Salesman Problem  
(1 +  $\epsilon$ )-approx in  $O(n^{1/\epsilon})$*

**FPTAS**

*Knapsack Problem  
(1 +  $\epsilon$ )-approx in  $O(2^{1/\epsilon} n^{O(1)})$*

**P**