

Theorem: Maximum Clique is NP-hard

Proof: decision version: input:  $\langle G=(V,E), k \rangle$   
output:  $\exists$  in  $G$  a clique of size  $k$ ?

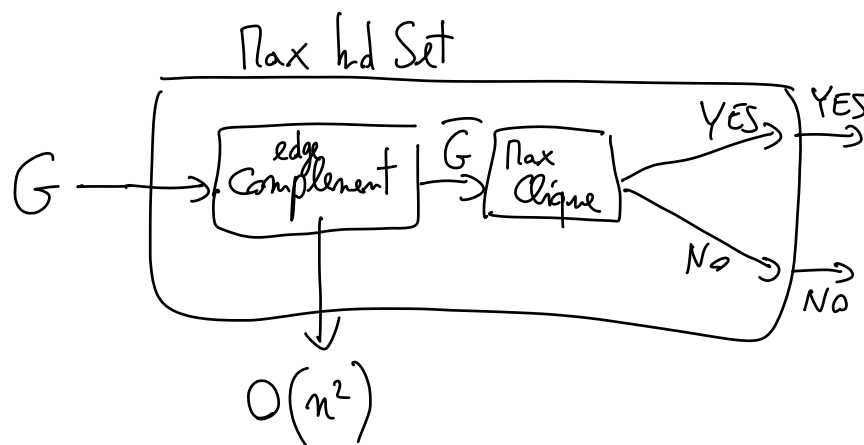
reduction from max. ind. set

intuition: clique: vertices with all edges between them  
max. ind. set: vertices with no edges between them

Def.: given a graph  $G=(V,E)$ , its edge-complement  
 $\bar{G}=(V,\bar{E})$  has the same vertex set  $V$  and  
an edge set  $\bar{E}$  such that  $(u,v) \in \bar{E} \Leftrightarrow$   
 $(u,v) \notin E$

Obs.: a set of vertices  $S$  is independent in  $G$   
 $\Leftrightarrow S$  is a clique in  $\bar{G}$

$\Rightarrow$  the largest ind. set in  $G$  has the same size  
as the largest clique in  $\bar{G}$



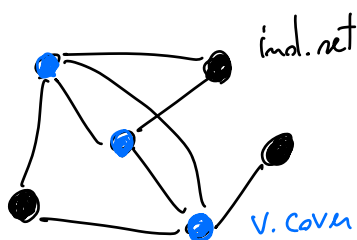
Theorem: Vertex Cover is NP-hard

Proof: decision version: input:  $\langle G=(V,E), k \rangle$

output:  $\exists$  in  $G$  a vertex cover of size  $k$ ?

reduction from max. ind. set

Obs.: a set of vertices  $S$  is independent in  $G$   
 $\Leftrightarrow V \setminus S$  is a vertex cover of  $G$



$\Rightarrow$  the largest ind. set in  $G$  has size  $n-k$ ,  
where  $k$  is the size of the smallest vertex cover  
of  $G$

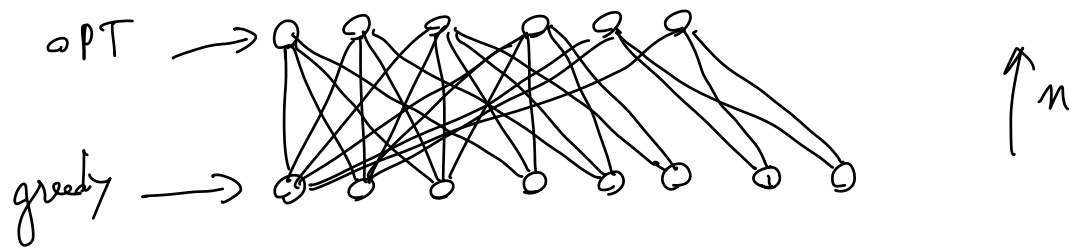
Exercises: show that:

min vertex cover  $\leq_p$  max. ind. set

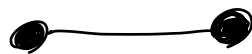
max clique  $\leq_p$  min vertex cover

$\Rightarrow$  these 3 problems are equivalent

Degree-based greedy approximation for vertex cover

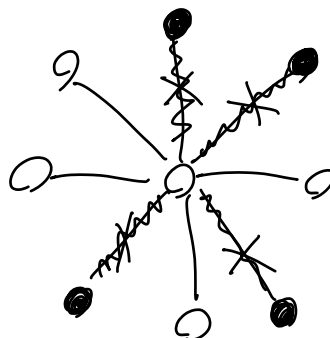


Exercise: show that the approximation factor of `Approx-Vertex-Cover` is exactly 2 :



OPT: just one vertex

Exercise: modify `Approx-vertex-cover` so as to select only one vertex instead of both of them



"star graph"

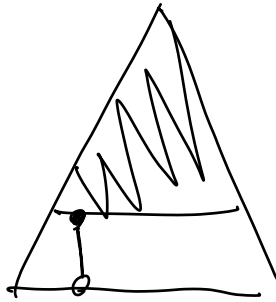
OPT: 1 vertex

our modified alg. :  $n-1$  vertices

$$\rho \geq n-1$$

Exercise : Consider the following approximation algorithm for vertex cover :

- 1) run DFS from an arbitrary vertex
- 2) return all the non-leaf vertices of the DFS tree



Show that this is a 2-approximation algorithm for vertex cover.

State of the art:

- $\exists$   $2 - \Theta(1/\sqrt{\log n})$  approximation
- vertex cover cannot be approximated better than  $\sim 1.36$
- Conjecture : cannot be approximated better than 2

# The Traveling Salesperson Problem (TSP)

Definition: given a complete undirected graph and a function  $w: E \rightarrow \mathbb{R}^+$ , output a tour (i.e. a cycle that visits every vertex exactly once)

$T \subseteq E$  minimizing  $\sum_{e \in T} w(e)$ .

$w: E \rightarrow \mathbb{R}^+$  is wlog because every TSP tour has the same number of edges  $\Rightarrow$  I can add a large weight to each edge s.t. edges have non-negative weights

Theorem: For any function  $p(n)$  that can be computed in time polynomial in  $n$ , there is no polynomial-time  $p(n)$ -approximation algorithm for TSP, unless  $P = NP$ .

Proof: reduction from Hamiltonian Circuit

$G \rightarrow G' = (V, E')$  complete

$$w(e \in E') = \begin{cases} 1 & e \in E \\ p \cdot n + 1 & \text{otherwise} \end{cases}$$

idea: weights are far apart

1)  $G$  has Hamiltonian circuit  $\Rightarrow \exists$  a tour of cost  $n \Rightarrow$  TSP algorithm run on  $G'$  returns a tour of cost  $\leq pn$

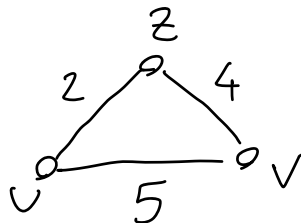
2)  $G$  has no Hamiltonian circuit  $\Rightarrow$  the TSP algorithm run on  $G'$  returns a tour of cost  $\geq pn+1 > pn$

Thus, if we could approximate TSP within a factor of  $p$  in poly-time, then we would have a poly-time algorithm for Hamiltonian Circuit.

## Metric TSP

A special case of TSP where the weight function  $w$  satisfies the triangle inequality:

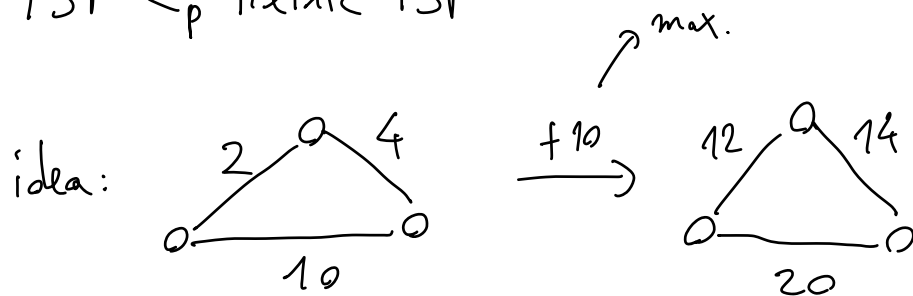
$\forall u, v, z \in V$ , it holds that  $w(u, v) \leq w(u, z) + w(z, v)$



Is metric TSP in P?

Theorem: Metric TSP is NP-hard

Proof:  $TSP \leq_p \text{Metric TSP}$



$$\langle G = (V, E), w, k \rangle$$



$$\langle G' = (V, E), w', k' \rangle$$

$$w'(u, v) = w(u, v) + W$$
$$W = \max_{u, v \in V} \{ w(u, v) \}$$

$$k' = k + nW$$

to be shown:

- 1)  $w'$  satisfies triangle inequality
- 2)  $\exists$  Ham. circuit of cost  $k$  in  $G \iff \exists$  Ham. circuit of cost  $k'$  in  $G'$