

* Exam 1 graded : Median 74 + 13

* HW 3 due on Thursday

* Recap: LPs and LP duality

Approximation Algorithms

While designing an algorithm, we usually want:

- ① Fast
- ② optimal
- ③ General

But if these are not simultaneously achievable,
we relax

e.g. ① Polytime \rightarrow Pseudo-polytime

② optimal \rightarrow Approx

③ General graphs \rightarrow Trees

Focus in this
part of course \rightarrow

Approx Alg: For any optimization pb where the goal is

to max/min an objective s.t. constraints,
(e.g., MST, Knapsack, indep set, ...)

we say that an algo is α -approx for $\alpha \geq 1$ if

(A) For a max pb, $\text{alg value} \geq \frac{1}{\alpha} \text{opt value}$

(B) For a min pb, $\text{alg cost} \leq \alpha \cdot \text{opt cost}$

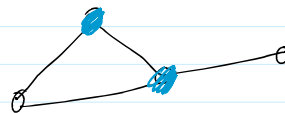
If someone says β -approx for $\beta < 1$, then take $\alpha = 1/\beta$.

Vertex Cover

Given undirected $G = (V, E)$

Find smallest $S \subseteq V$ s.t.

$\forall (u, v) \in E$ at least one of u or v is in S



Q1: Is there a polytime algo to find optimal soln?

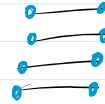
— No, unless $P = NP$

Q2: Can we get α -approx in polytime? What is the smallest α ?

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Thm: There is a 2-approx polytime algo. ← It is unknown whether < 2 is possible

Pf: Find a max-size matching M and return all matched vertices, i.e., $\text{size} = 2|M|$



Claim: This is a valid vertex cover

If an edge is not covered, M is not max-matching.

Claim 2: optimum vertex cover has $\text{size} \geq |M|$

Any soln needs to cover the M -edges.

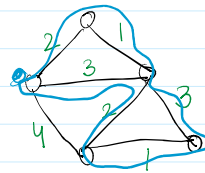
Since these M -edges don't share any vertex, $\text{opt} \geq |M|$.

Hence, we have a 2-approx alg. ▀

Traveling Salesman Problem

Given an undirected graph $G = (V, E)$

weights $w : E \rightarrow \mathbb{R}_{\geq 0}$



Goal: Find a tour π (cycle with vertex repeats allowed) that visits all vertices and has shortest length.

Remark: Known to be NP-Hard.

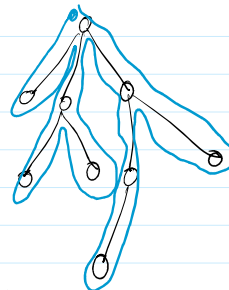
Thm: There is a 2-approx algo for this problem. ← we even know (1.5- ϵ) approx algo

Pf: Find MST of G .

To get tour π_{alg} , take 2 copies of every MST edge.

$$\Rightarrow \pi_{\text{alg}} \leq 2 \cdot \text{MST}$$

n.b. this tour connects all vertices



$$\Rightarrow \|Alg\| \leq 2 \cdot MST$$

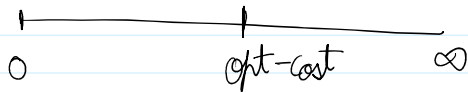
Note that optimum tour connects all vertices

$$\Rightarrow \pi_{OPT} \geq MST$$

Hence, a 2-approx.



LP-Based Approx Algo



Idea:

① Capture the pb 'roughly' using an LP. Solve the LP.

② Convert the optimal fractional soln into an integ soln, while losing approx ratio.

Vertex Cover Pb

Given $G = (V, E)$

Find $S \subseteq V$ s.t. every edge is covered.

Define LP vars x_u for $u \in V$

$$x_u = \begin{cases} 1 & \text{if } u \in S^* \\ 0 & \text{o.w.} \end{cases}$$

$$\min \sum_u x_u$$

$$\text{s.t. } x_u \geq 0$$

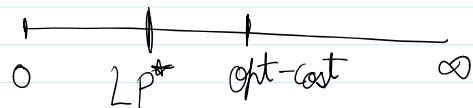
$$\forall (a, b) \in E: \\ x_a + x_b \geq 1$$

Observe: Any $\{0, 1\}$ integ soln to this LP is a valid vertex cover.

Claim 1: Optimal LP value = $\sum_u x_u^* \leq \text{min-vertex-cover}$.

Pf: Suppose S^* is the opt integ soln.

$$x_u = \begin{cases} 1 & \text{if } u \in S^* \\ 0 & \text{o.w.} \end{cases}$$



$$\sum_u x_u^* \leq \text{min-vertex-cover}$$

$$u \in \{0, 1\}^V \text{ s.t.}$$

This is feasible soln and has objective value $|S^*|$

Alg: Return all u s.t. $x_u^* \geq 1/2$.

Claim 1: This is a valid vertex cover.
 $\forall (a,b): x_a^* + x_b^* \geq 1 \Rightarrow$ at least one of a or b in vertex cover

Claim 2: Its cost $\leq 2 \cdot \sum_u x_u^* \leq 2 \cdot \text{opt}$
 ∴ I am at most doubling x_u^* .

