

Given: minimization problem  $\mathcal{P}$

An algo  $\text{APX}$  is called an  $\alpha$ -approximation  
if given an instance  $I$  of  $\mathcal{P}$

- ①  $\text{APX}$  produces in poly time a feasible soln  $\text{APX}_I$ , and
- ② The obj val.  $\text{apx}_I$  is at most  $\alpha \cdot \text{opt}_I$   
 $\uparrow$  obj. val. of  $\text{OPT}_I$

Challenge:  $\mathcal{P}$  is often NP-hard and hence we don't usually know  $\text{opt}_I$



Find a polynomial-time computable lower bound  $lb_I \leq opt_I$  s.t.

$$\frac{\text{apx}_I}{\text{opt}_I} \leq \frac{\text{apx}_I}{lb_I} \leq \alpha$$

Popular approach use mathematical programming

- ①  $lb_I$  is the optimal value of an LP/SOP/convex NLP relaxation of the problem

- ② optimal solutions to the relaxations can efficiently be rounded into "high-quality" integral solutions

This class Approx is an exciting vibrant area.  
Give some recent examples to convince you.  
[Focus on ①, ②]

Most examples will be recent but some may also be (elegant) novel proofs of older results

- Goals
- ① Add versatile techniques to your toolkit
  - ② Interest you in area (by pointing out open problems)

Oral exam July 20

Prerequisites Graph algorithms, linear & combinatorial optimization, basics of Approx  
→ KV

Lecture notes: will post handwritten notes

Rough Topic list

- (i) Intro : Approximate Network Design  
(direct LP rounding, graph decomposition, iterative techniques)

(ii) Strengthening LPs

adding strong valid inequalities,  
lift-and-project (Rothvoss)  
rounding solutions to send LPs

(iii) Use Discrepancy theory to round fractional solns to LP

(Lovett, Meka '12 ; Bansal, Nagarajan '16)

Intro

Steiner tree problem

input: undirected graph  $G = (V, E)$ , set of terminals  $R \subseteq V$ , edge costs  $c_e \geq 0 \forall e \in E$ .

goal: compute minimum cost tree  $T$  spanning  $R$

natural IP

$$\begin{aligned}
 \text{(IP)} \quad & \min \sum_{e \in E} c_e x_e \\
 \text{s.t.} \quad & \sum_{e \in \delta(S)} x_e \geq 1 \quad \forall S \subseteq V \text{ s.t. } S \cap R \neq \emptyset \\
 & x_e \in \{0, 1\} \quad \forall e
 \end{aligned}$$

$x(\delta(S))$  →  $\sum_{e \in \delta(S)} x_e$        $\delta(S)$  Steiner cuts

( validity:  $x$  feasible,  $\text{Supp}(x) = \{e \in E : x_e = 1\}$

Claim:  $\text{supp}(x)$  has  $u, v$ -path  $\forall u, v \in R$  )

(ex)

Thm 1 There is a 2-approx for Steiner tree

Pf: Compute an extreme point solution  $x^*$  of LP relaxation  $(P)$  of  $(IP)$ . How?

$x^*$  is rational ( $\rightarrow$  KV chp 3)

Let  $M$  s.t.  $Mx^*$  is integral. Create multi graph on vertex set  $V$  by inserting  $Mx^*_e$  copies of each edge  $e$ .

Form digraph  $D$  by replacing each edge



Pick  $r \in \mathbb{R}$  arbitrarily.

Let  $\lambda_v$  be the # arc-disjoint dipaths in  $D$ , let  $d^-(v)$  &  $d^+(v)$  be in and out degree.

note:  $\lambda_v \geq M \forall v \in V$ ,  $d^-(v) = d^+(v) \forall v \in V$

Powerful tool:

Thm 2 (Bang-Jensen, Frank & Jackson 1995)

$\Rightarrow$  Sufficient

$D = (V, A)$ ,  $d^-(v) = d^+(v) \forall v \in V$

$\lambda_v$ : # arc disj.  $r, v$ -dipaths

$\Rightarrow \exists$  arc disj.  $A_1, \dots, A_p$  arborescences s.t.

$\forall v \in V$ :  $v$  is in  $\geq \lambda_v$  of the arbs

( $n = \max \lambda_v$ ).

$$\forall v \in V: \lambda_v \geq \lambda_v \text{ of the arcs}$$

$$(p = \max_v \lambda_v)$$

Thm 2 applies here and yields arc disjoint arborescences

$$A_1, \dots, A_p$$

$$(p = \max_{v \in V} \lambda_v$$

each spanning  $R$ !

$$= M)$$

↑ why?

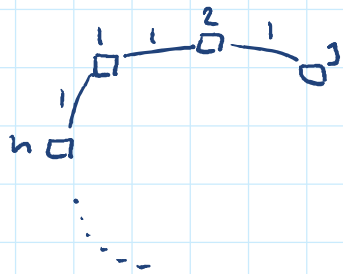
Let  $\chi_i$  be the characteristic vector of  $A_i$ . Then

$$\frac{1}{M} \sum_{i=1}^M \chi_i \leq 2x^*$$

↙ repl. each edge by 2 arcs

$$\Rightarrow \min_i CT \chi_i \leq 2 CT x^* \leq 2 \cdot \text{opt} \quad \square$$

Can we do better with this LP? No!



$$R = V = \{1..n\}$$

$$c_{12} = c_{23} = \dots = c_{n1} = 1$$

$$\text{opt}_p = n-1$$

$$\text{opt}_p = n/2$$

Later: proof of Thm 2 & stronger LPs for Steiner trees

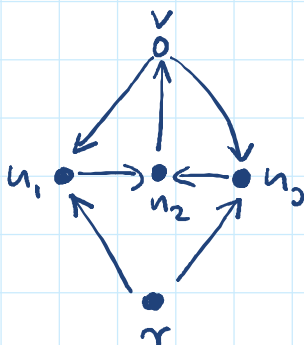
First: using graph decomposition

In Thm 2, can replace  $d^-(v) = d^+(v)$  by  $d^-(v) \geq d^+(v)$ .

Idea: create new digraph  $\mathcal{D}'$  by adding  $d^-(v) - d^+(v)$  copies of arc  $(v, r)$  to  $\mathcal{D}$ , for all  $v \in N \setminus r$ . ↖ auxiliary  
 $\Rightarrow \mathcal{D}'$  is Eulerian and applying Thm 2 to  $\mathcal{D}'$  yields arborescences that do not use auxiliary arcs.

Why is  $d^-(v) \geq d^+(v)$  condition important?

Yes [Lovász]



$\exists 2$  arc-disj.  $r, n_i$ -paths  
 $\forall i=1,2,3$

There are no 2 arc-disj. arb. that both span  $r, n_1, n_2, n_3$ .

note:  $d^-(v) < d^+(v)!$

Thm 2b [BF] '95]

$\mathcal{D} = (N, A), r \in N, T' = \{v \in N \setminus r : d^-(v) < d^+(v)\}$   
If  $\lambda_{\mathcal{D}}(r, v) \geq k \forall v \in T'$  then there are arc disj. arb.  $\mathcal{A}_1, \dots, \mathcal{A}_k$  that each  $v \in N$  belongs to  $\min\{k, \lambda_{\mathcal{D}}(r, v)\}$  of these.

Examples

## Examples

① min cost arborescences  $\mathcal{D}(N, R)$   $r \in N$   $c_a \geq 0 \forall a \in R$   
goal: find arb.  $T$  rooted at  $r$ , spanning  $N$

$$\begin{aligned} \textcircled{P_1} \quad & \min \sum_a c_a x_a \\ \text{s.t.} \quad & \sum_{a \in \delta^+(s)} x_a \geq 1 \quad \forall s \in N, r \notin s \\ & x \geq 0 \end{aligned}$$

Thm 3 (Edmonds '67)  $\textcircled{P_1}$  is integral

Pf: Let  $x$  be an extreme pt soln to  $\textcircled{P_1}$   
and  $M$  s.t.  $x = Mx$  is integral.

Thm 2b  $\Rightarrow \exists$  arb.  $R_1, \dots, R_m$  that  
span  $N$  s.t.

$$x \geq \frac{1}{m} \sum_{i=1}^m \chi(R_i)$$

$\uparrow$   
feasible f.  $\textcircled{P_1}$

$\Rightarrow c(R_i) \leq c^T x$  for some  $i$

$\Rightarrow \textcircled{P_1}$  has an optimal integral soln  
for all  $c \geq 0$ .

$\Rightarrow \textcircled{P_1}$  is integral  $\square$

$\uparrow$   
[Edmonds & Giles '77] see Thm 5.13 IV

② Price collecting Steiner tree  $G = (V, E)$ ,  $c_e \geq 0 \forall e \in E$

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 (PCST) penalty  $\pi_v \geq 0 \forall v \in V, r \in V$

goal Find tree  $T$  rooted at  $r$  st.

$$\sum_{e \in E(T)} c_e + \sum_{v \notin V(T)} \pi_v$$

is minimized

②  $\min \sum_e c_e x_e + \sum_v \pi_v z_v \leftarrow z_v = 1 \text{ if } v \notin V(T)$

$\downarrow x_e = 1 \text{ if } e \in E(T)$

s.t.  $\sum_{e \in \delta(S)} x_e + z_v \geq 1 \quad \forall S \ni v, r \in S$   
 $v \notin S$

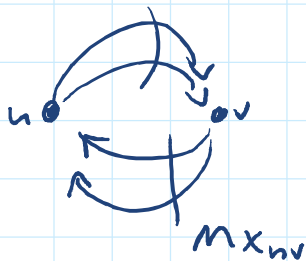
$x_e, z_v \geq 0$

$\forall v \notin S, \delta(S)$   
 must contain  
 $e$  of  $T$  or  $v$   
 is not spanned  
 by  $T$

Solve  $(P_2) \Rightarrow (x, z)$

$\bar{x}, \bar{z} = M(x, z)$  integral for some  $M$

$\mathcal{D} = (V, A)$  where  $A$  has  $Mx_{uv}$  copies of  $(u, v)$  and  $(v, u) \forall u, v \in E$ .



note:  $\min_{\text{arcs}} r, v$ -cut in  $\mathcal{D}$  has  $\geq (1 - z_v) \cdot M$

$\max$  flow - min cut  $\Rightarrow \lambda_{\mathcal{D}}(r, v) \geq (1 - z_v)M$



Thm 2  $\Rightarrow \exists M$  arb.  $A_1, \dots, A_M$  st.

$$\frac{1}{M} \sum_i \chi(A_i) \leq 2x \text{ s.t.}$$

$$|\{i : v \in V(A_i)\}| \geq \lambda_D(\tau, v) \geq (1-\epsilon)M$$

$$\forall v \in V$$

Let  $\bar{A}$  be random arb. from  $\{A_1, \dots, A_M\}$ .  
Then

$$\Pr [v \notin V(\bar{A})] \leq \epsilon_v$$

$$\Pr [e \in E(\bar{A})] \leq 2x_e$$

$$\Rightarrow E \left[ \sum_{e \in \bar{A}} c_e + 2 \sum_{v \notin V(\bar{A})} z_v \right] \leq 2 (c^T x + \pi^T z)$$

Theorem 4 (Goemans & Williamson '95)

There is (Lagrangian-Multiplier Preserving)

LMP

2-approx for PCST.

Notes: LMP property can be used to...

① approximate partial Steiner tree:

find min cost ST spanning  $\geq k$  terminals

[Chudak, Roughgarden, Williamson '04]

② get a  $(2-\epsilon)$ -approx for PCST ( $\epsilon > 0$  small)

[Archer et al. '11]