

Approximate  $k$ -MSTs and  
 $k$ -Steiner Trees  
via  
the Primal-Dual Method  
and Lagrangean Relaxation

Tim Roughgarden  
Cornell University  
and IBM Almaden

joint work with  
Fabián A. Chudak (Tellabs)  
David P. Williamson (IBM Almaden)

# The k-MST Problem

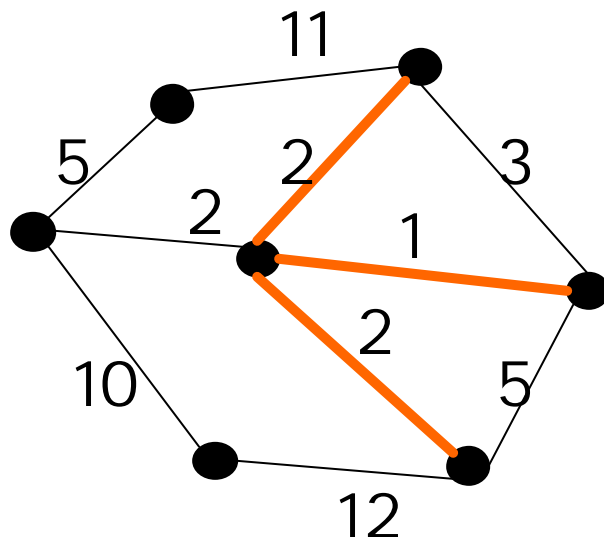
## Given :

- An undirected graph  $G = (V, E)$
- costs  $c_e \geq 0$  on edges
- a parameter  $k$

## Goal :

- min-cost tree spanning  $\geq k$  vertices

Example ( $k = 4$ ):



# Some History

**Fact:**  $k$ -MST is NP-hard

## Approximation Algorithms:

- $O(k^{1/2})$  [Ravi et al. 94]
- $O(\log^2 k)$  [Awerbuch et al. 95]
- $O(\log k)$  [Rajagopalan/Vazirani 95]
- 17 [Blum/Ravi/Vempala 95]
- 5 [Garg 96]
- 3 [Garg 96]
- $2 + ?$  [Arora/Karakostas 00]
- 2 [Garg 00]

# Motivating Question

**Observation:** all constant-factor approx algs for k-MST rely on a primal-dual alg for prize-collecting Steiner tree

**Prize-collecting Steiner tree:**

- **given:** graph  $G=(V,E)$ , costs  $c_e \geq 0$  on  $E$ , penalties  $\geq 0$  on  $V$
- **goal:** tree minimizing cost of its edges + penalties of unspanned vertices

**Question:** why?

# The Connection

**Punchline:** a PCST problem arises as a Lagrangean relaxation of the  $k$ -MST problem

**Roughly:**

- complicating constraint =  
tree spans  $\geq k$  vertices
  - lift to objective function
    - use parameter  $\lambda \geq 0$  to penalize trees spanning  $< k$  vertices
- $\exists$  get a PCST problem with all vertex penalties equal to  $\lambda$

# The Agenda

**Our goal:** with this insight,  
**revisit** existing approx algs for  
k-MST and derive

- a simpler algorithm description
- a simpler proof of approx ratio

↳ we will focus on Garg's 5-  
approximation algorithm

# Our Inspiration

Jain/Vazirani '99 gave:

- a primal-dual 3-approximation algorithm for uncapacitated facility location
  - a reduction from k-median to facility location, via Lagrangean relaxation
    - nasty constraint = open = k medians
    - facility cost = penalty parameter ?
- $\mathcal{P}$  yields a 6-approximation algorithm for k-median

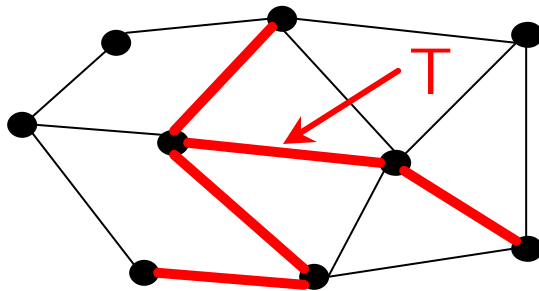
# Sketch of k-MST Formulation

minimize:

cost of edges in tree  $T = c(T)$

subject to:

vertices spanned by  $T$  are  
connected



also:

$T$  fails to span  $= n - k$  vertices



# Lagrangean Relaxation of k-MST

**Choose:** value for Lagrangean penalty parameter  $\lambda \geq 0$

**Lagrangean relaxation** k-MST( $\lambda$ ):

**minimize:**  $c(T) + \lambda [ \underbrace{||V \setminus T||}_{\substack{\# \text{ of unspanned} \\ \text{vertices}}} - (n-k) ]$

**subject to:**

vertices spanned by  $T$  are connected

**Fact:**  $\lambda \geq 0$  is a lower bound for k-MST

# Prize-Collecting Steiner Tree

**Suppose:** penalty on every vertex is set to  $\alpha \geq 0$ .

minimize:

$$c(T) + \alpha |V \setminus T|$$

# of unspanned vertices

subject to:

vertices spanned by  $T$  are connected

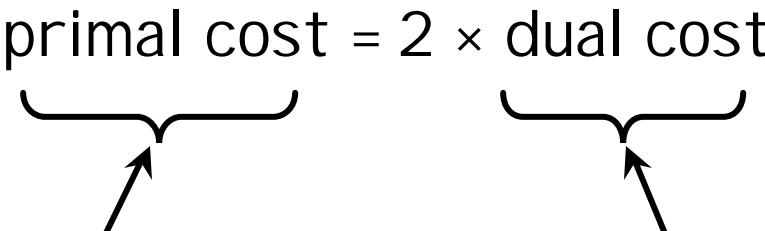
same as before

↳ only difference from  $k$ -MST(?) is missing  $-\alpha(n-k)$  in obj fn

# A Primal-Dual Algorithm for PCST

**Good news:** we know how to approximate PCST well.

- **Theorem [Goemans, Williamson 95]:**  
In poly-time, can construct a tree  $T$  + feasible (fractional) dual s.t.

$$\underbrace{\quad\quad\quad}_{c(T) + \text{penalty of } V \setminus T} = 2 \times \underbrace{\quad\quad\quad}_{\text{from dual of PCST LP relaxation}}$$


- Stronger [GW 95]:

$$c(T) + 2 \times \text{penalty of } V \setminus T = 2 \times \text{dual cost}$$

# From PCST to k-MST

**\$64K Question:** What does the PCST result imply for k-MST?

- interpret k-MST(?) as a PCST instance with all penalties =  $\lambda \geq 0$

## Problems:

- different primal objective fns
  - k-MST:  $c(T)$
  - PCST:  $c(T) + \lambda |V \setminus T|$
- different duals
  - recall: k-MST(?), PCST differ only by a  $\lambda(n-k)$  term in obj fns
  - $\mathbb{P}$  duals identical except for this  $\lambda(n-k)$  term (in obj fns)

# An Inherited Guarantee

- running GW algorithm on  $k$ -MST( $\lambda$ ) yields tree  $T$ , dual s.t.:

$$c(T) + 2\lambda |V \setminus T| = 2 \times \text{PCST dual cost}$$

- if  $|V \setminus T| = n - k$  ( $T$  spans  $k$  vertices)

↳ subtracting  $2\lambda(n - k)$  on each side:

$$c(T) = 2 \times [\text{PCST dual cost} - \lambda(n - k)]$$

$$= 2 \times [k\text{-MST}(\lambda) \text{ dual cost}]$$

$$= 2 \times \text{OPT}$$

↳ done if we can find magic value for  $\lambda$  ?

# The Catch

**Problem:** what if no value of  $\lambda$  yields a tree  $T$  spanning exactly  $k$  vertices?

**Solution** (a la [Jain/Vazirani 99])

- $\lambda = 0 \Rightarrow T$  will be empty
- $\lambda$  suff. large  $\Rightarrow T$  spans all vertices
- via bisection search, can find:
  - $\lambda_1 < \lambda_2$  and  $\lambda_1 \approx \lambda_2$
  - $(\lambda_1, T_1, y_1)$ ,  $T_1$  spans  $k_1 < k$  vertices
  - $(\lambda_2, T_2, y_2)$ ,  $T_2$  spans  $k_2 > k$  vertices
- will combine  $T_1, T_2$  and  $y_1, y_2$  to get feasible + near-optimal solution

# Combining Two Guarantees

**So far:** we have guarantees for  $i=1,2$ :

$$c(T_i) + 2\lambda_i(n-k_i) = 2[\text{PCST dual cost of } y_i]$$

**Idea:** take a **convex combination** of the two so previous calculation works.

⊢ choose  $\mu_1, \mu_2$  s.t.

$$\mu_1(n-k_1) + \mu_2(n-k_2) = n-k$$

⊢ assume  $\lambda = \lambda_1 = \lambda_2$ , get:

$$\begin{aligned} \mu_1 c(T_1) + \mu_2 c(T_2) + 2\lambda(n-k) & \quad \text{feasible dual} \\ & \quad \swarrow \quad \searrow \\ & = 2[\text{PCST dual cost of } \mu_1 y_1 + \mu_2 y_2] \end{aligned}$$

**Result:**  $\mu_1 c(T_1) + \mu_2 c(T_2) = 2 \times \text{OPT}$

# An Easy Case

We have:

$$\mu_1 c(T_1) + \mu_2 c(T_2) = 2\text{OPT}$$

$T_2$  (the big tree) is a feasible solution

⊢ if  $\mu_2 \geq \frac{1}{2}$ , just return  $T_2$  for a 4-approximation

⊢ can assume  $\mu_1 \geq \frac{1}{2}$ ,  $\mu_2 = \frac{1}{2}$

**In harder case:** supplement the small tree ( $T_1$ ) with a few vertices from  $T_2$

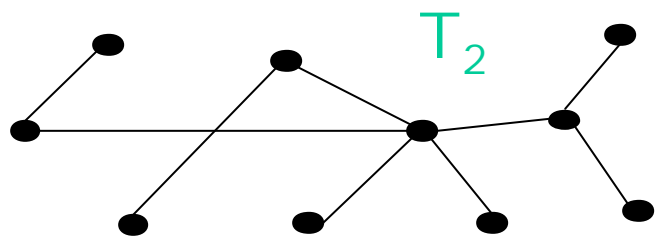
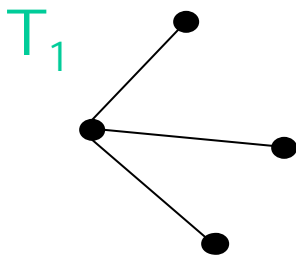


# Supplemental Vertices

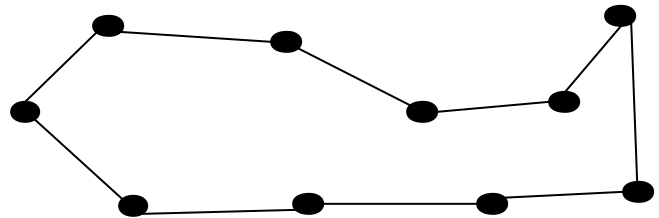
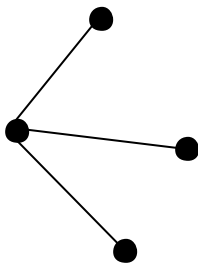
Algorithm [Garg 96]

$k = 7$

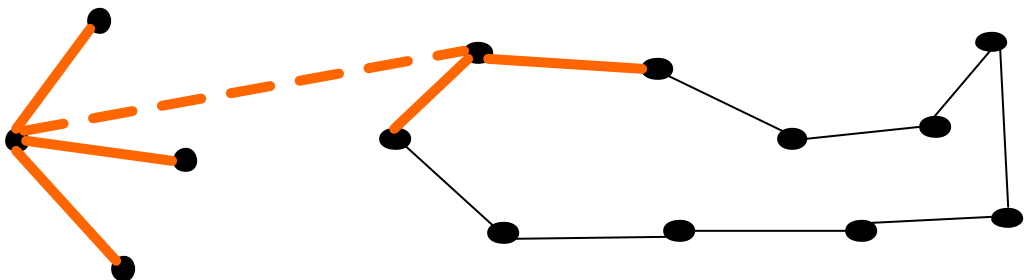
$k_1 = 4, k_2 = 10$



double edges of  $T_2$  + shortcut to tour:



connect  $T_1$  to cheapest path of tour:



# k-Steiner Trees

## The k-Steiner tree problem:

- given a graph with costs on edges and a distinguished set of terminal vertices
- find the min-cost tree spanning at least k terminals

## Result:

- can extend previous algorithm + analysis, get a 5-approximation
  - use vertex penalties only for terminals

# Open Questions

## Directions for future work:

- further applications of Jain/Vazirani's techniques
  - Garg's 3-approximation algorithm
  - other NP-hard problems
- extend framework to handle many complicating constraints