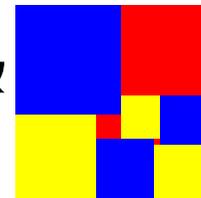


# Packing via Covering and LP-Relative Approximation

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# Linear Program–Based Combinatorial Optimization in a Nutshell

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- LPs used for exact algorithms since mid-century (e.g., flow, matching, matroids)
  - Literature developed lots of *proof techniques* & *algorithmic techniques* (LP duality, total unimodularity, uncrossing, ellipsoid algorithm)
- Broad base of knowledge applied also to approximation algorithms ~30 years ago
  - Spurred more techniques, e.g. primal–dual schema, randomized rounding, scaling, grouping, iterated rounding/relaxation

# Technique-Based Theory

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- LP-based combinatorial optimization thereby exhibits the best & worst of mathematical problem-solving:

# Technique-Based Theory

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- LP-based combinatorial optimization thereby exhibits the best & worst of mathematical problem-solving:
  - Best: techniques are elementary when considered individually, and combining them gives some very great results
  - Worst: it can be very hard to figure out how to combine them!

# Approximation algorithms

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- For NP-hard optimization problems optimal value  $\text{OPT}$  cannot be found by a poly-time algorithm (unless  $P=NP$ )
- Thus in poly-time the best we can do is find an *approximately* optimal answer
- Our convention: An  $\alpha$ -*approximation algorithm* for a “max” problem always returns feasible solution with value at least  $\text{OPT}/\alpha$ . For “min” problem, always returns value at most  $\text{OPT} \cdot \alpha$ . ( $\alpha \geq 1$ ; exact  $\equiv \alpha = 1$ )

# Iterated LP Relaxation

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- Background: Iterated relaxation (Lau, Naor, Salavatipour, Singh, STOC 2007) finds solutions with *additive violation of constraints* instead of multiplicative factor
  - Bounded degree spanning tree: can find a spanning tree with super-optimal weight but violating degree bounds by up to +1 (SL '07)
  - Integral multicommodity flow in a tree: can find a flow with super-optimal weight but violating edge capacities by up to +2 (KPP '08)



# Contribution of Our Work

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- Can iterated rounding help when constraints are inflexible?

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- Can iterated rounding help when constraints are inflexible?
- Our contribution: Techniques that remove violation (at expense of value)
  - General approach that works in most iterated rounding situations (where a “counting lemma” exists)
- Gives new algorithmic results
  - Ultimate goal: understanding best possible approximation ratios for problems

# Rest of Talk

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- Def<sup>n</sup>: Multicommodity Flow in a Tree (MFT)
- Def<sup>n</sup>: LP-Relative Approximation Ratio
- Counting lemma for MFT and consequences
- Results in case of MFT:
  - $1 + 1/O(\textit{minimum capacity})$  approx algorithms
- Mini-Technique: LP-Relative Covers Help Cover
- Technique: LP-Relative Covers Help Pack
- General Form of Results, Open Problems

# Integer multicommodity flow in a tree (MFT)

- **Input:** tree with edge capacities  $c_e$ ; pairs of terminals, profit  $w_i$  for each commodity  $i$ .
  - Let  $path(i)$  denote path between terminals for  $i$
- **Goal:** integers  $x_i \geq 0$  such that for each  $e$

$$\sum_{i: e \in path(i)} x_i \leq c_e$$

such that  $\sum_i w_i x_i$  is maximized

- E.g. ship kegs on tree network
- APX-complete (GVY '93),  
4-*apx* (CMS '03)



# Key Notion: LP-Relative Approximation

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- *Natural LP* for MFT: flow values  $x$  can be fractional, otherwise the same. LP-OPT can be found in poly-time. Note  $\text{LP-OPT} \geq \text{OPT}$ .
- Def<sup>n</sup>. An *LP-relative  $\alpha$ -approx. algorithm* for a “max” problem always returns value at least  $\text{LP-OPT}/\alpha$ ; “min” is analogous
  - Same as “ $\alpha$ -approx.” def<sup>n</sup> with  $\text{OPT} \Rightarrow \text{LP-OPT}$
  - Stronger notion
  - Abundant in papers but no common term?
    - E.g. 4-approx for MFT, min degree+1 spanning tree

# Counting Lemma for MFT

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- (KPP 08) “Let  $x$  be an extreme solution to the natural LP for MFT. If  $x_i < 1$  for every commodity  $i$ , then some edge  $e^*$  has the following property:
  - At most 3 commodities  $i$  have  $x_i > 0$  and  $i$  in  $path(e^*)$ ”
- Same works for *covering version* of MFT
- (‘09) Also holds for arc- and vertex-capacitated versions of MFT, with 3 replaced by 7
  - Won’t state these versions explicitly from now on but all results in this talk go through

# Counting Lemma Consequences

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- i) Capacitated covering-MFT: some var has value  $\geq 1/3 \Rightarrow 3$ -apx by iterated rounding

ratio  $\swarrow$  violation  $\nwarrow$

- ii)  $(1, +2)$ -approximation for MFT by iterated relaxation as mentioned earlier
- iii)  $(1, -2)$ -approximation for covering-MFT
- Key: these results are all LP-relative!

# Results as Applied To MFT

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- Let  $\mu$  be minimum (edge/arc/ $v^x$ ) capacity
- We get  $1+O(1/\mu)$  approximation algorithm
  - Previous best ratio: constant (4/4/5)
  - Asymptotically optimal in terms of  $\mu$ :  $\exists \epsilon > 0 \forall \mu$ , we get  $1+O(\epsilon/\mu)$  inapproximability
  - Also get  $1+O(1/\mu)$  approximation algorithm for covering-MFT
- Next up: sketches of the techniques

# Mini-Technique: LP-Relative Covers Help Cover (e.g.: MFT)

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□ *There is a  $(1+2/\mu)$ -apx alg for covering-MFT*

□ Proof

- Artificially increase all requirements  $c_e$  by 2
- Scaling: if  $x$  is an optimum to the old LP, then  $x^*(2+\mu)/\mu$  is a solution to the new LP
- So  $\text{LP-OPT}' \leq \text{LP-OPT}^*(2+\mu)/\mu$
- Now apply the LP-relative  $(1, -2)$  approximation to the new requirements, gives a solution which meets old requirements and has cost at most

$$1 * \text{LP-OPT}' \leq \text{LP-OPT}^*(2+\mu)/\mu$$

# Technique: LP-Relative Covers Help Pack (e.g.: MFT)

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- *There is a  $1+O(1/\mu)$ -apx alg for MFT*
- **Proof**
  - Let  $x$  be output of  $(1, +2)$  approx. algorithm
  - For each  $e$  let  $f_e$  be overload of  $e$  by  $x$  ( $0 \leq f_e \leq 2$ )
  - Look @ capacitated MFT-covering w/ requirements  $f$  and capacities  $x$ :
    - Scaling:  $x \cdot 2/(2+\mu)$  is a feasible fractional covering
    - So  $\text{LP-OPT}' \leq c(x) \cdot 2/(2+\mu)$
  - Run 3-apx alg for capacitated cover-MFT  $\Rightarrow y$
  - $x - y$  is a solution to original MFT instance and  $c(x-y) \geq c(x) \cdot (1 - 3 \cdot 2/(2+\mu)) \geq \text{LP-OPT}/(1+O(1/\mu))$

# Generalized Results

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- Consider a family of integer linear programs  $(A, b)$
- Define  $\mu := b_{\min}$
- If “counting lemma”  $\Rightarrow$  known LP-rel consequences
  - $(\alpha', -v')$  for uncapacitated covering  $\min \{cx \mid Ax \geq b, 0 \leq x\}$
  - $(\alpha, +v)$  for capacitated packing  $\max \{cx \mid Ax \leq b, 0 \leq x \leq d\}$
  - $\beta$  for capacitated covering  $\min \{cx \mid Ax \geq b, 0 \leq x \leq d\}$
- Our techniques give in addition:
  - $\alpha'(1+v'/\mu) = \alpha'(1+O(1/\mu))$  for covering
  - $\alpha/(1-\beta v/(\mu+v)) =^* \alpha(1+O(1/\mu))$  for capacitated packing
  - *Remark:* can't hope to  $1+O(1/\mu)$ -approx *capacitated covering* in general since we can increase  $\mu$  artificially

# Related Open Problems

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- Smallest  $k$ -edge-connected subgraph [GG 08]: best known apx ratio is  $1 + 1/2k + O(1/k^2) + \dots$ 
  - What about *min-cost*  $k$ -edge-connected multisubgraph?
    - Best known apx is 2, can we get  $1+O(1/k)$ ?
- [\*] Our packing techniques give no result when  $\mu$  is too small. Is this avoidable or not?
  - E.g. *column-sparse packing ILPs* admit a counting lemma but need ad-hoc techniques to get const ratio for small  $\mu$
- Demand multicommodity flow in a tree?
  - Case of a star (*demand matching*) is well-studied and also a special case of column-sparse integer programs
  - $1+O(\text{dem}_{\max}/\mu)^{1/2}$  best known, can we get  $1+O(\text{dem}_{\max}/\mu)$ ?

Merci!

