

# Surviving in Directed Graphs: A Quasi-Polynomial-Time Poly-logarithmic Approximation for 2-Connected Directed Steiner Tree (STOC'17)

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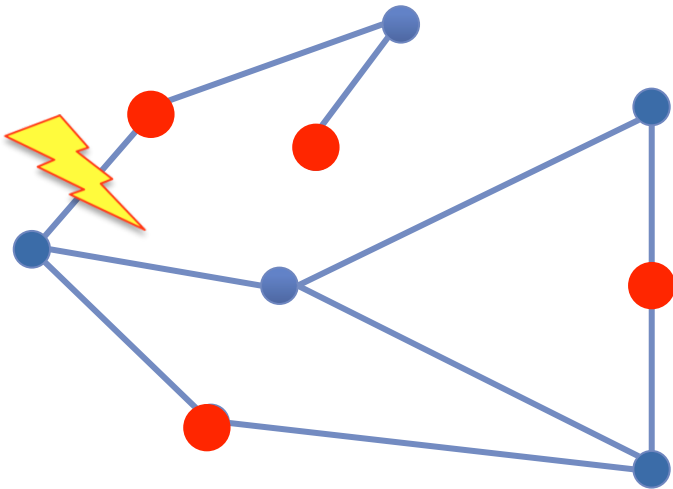
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# Survivable Network Design

**Prob:** Design (cheap) networks that satisfy given connectivity requirements (between pairs or groups of nodes) **despite** a few **edge/vertex failures**

**E.g.:** Connect red nodes



Many SND problems are **NP-hard**, we will focus on **approximation algorithms**

# Surviving in Directed Graphs?

Many approximation algorithms are known for SND problems on **undirected graphs**

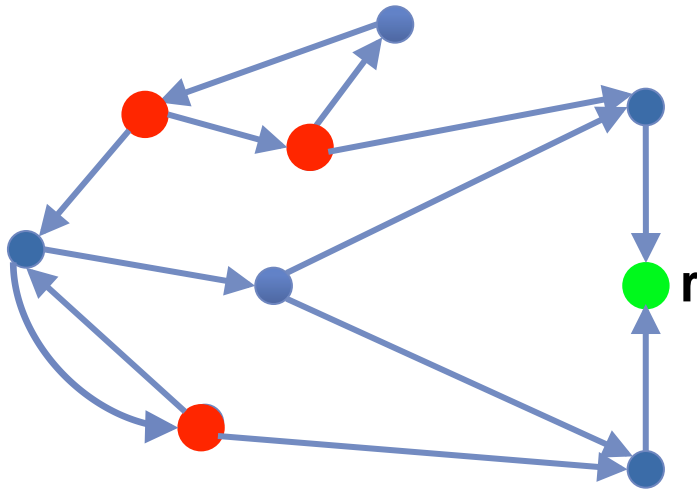
<b>Steiner Network Problem:</b> edge-connectivity $r(u,v)$ between every pair of nodes $(u,v)$	[Jain'01] 2-apx
<b>k-Vertex Connected Steiner Tree:</b> k-vertex connectivity from terminals to a root	[Fleisher et al.'06] 2-apx, $k=2$ [Nutov'12] $O(k \log k)$ -apx
<b>k-Vertex Connected Steiner Subgraph:</b> k-vertex connectivity between terminals	[Fleisher et al.'06] 2-apx, $k=2$ [Nutov'12] $O(k \log^2 k)$ -apx [Cheriyān, Vetta'07] $O(1)$ -apx, metric edge costs
<b>k-Vertex Connected Spanning Subgraph:</b> k-vertex connectivity between all nodes	[Nutov'14] $O(\log(n/(n-k)) \log k)$ -apx, $n = \#$ nodes [Cheriyān, Vegh'14] 6-apx, $n \geq 2k^2$

**Prob:** What about directed graph?

# Directed Steiner Tree (DST)

**Def:** In the **Directed Steiner Tree** problem (**DST**) we are given an **n**-node **directed edge-weighted** graph  $G$ , a **root**  $r$ , and a set of **terminals**  $S = \{1, \dots, h\}$ . Our goal is to compute a min-cost subgraph  $H$  that contains a directed path from each terminal to  $r$

● = terminal



**Thr [Zelikosky'97, Charikar et al.'99]:**

For any  $D > 0$  in  $n^{O(D)}$  time one can compute a  $O(Dh^{1/D} \log 2h)$  approximation for DST

**Cor1:** For fixed  $\epsilon > 0$ ,  $O(h^{1/\epsilon})$  approximation in poly-time

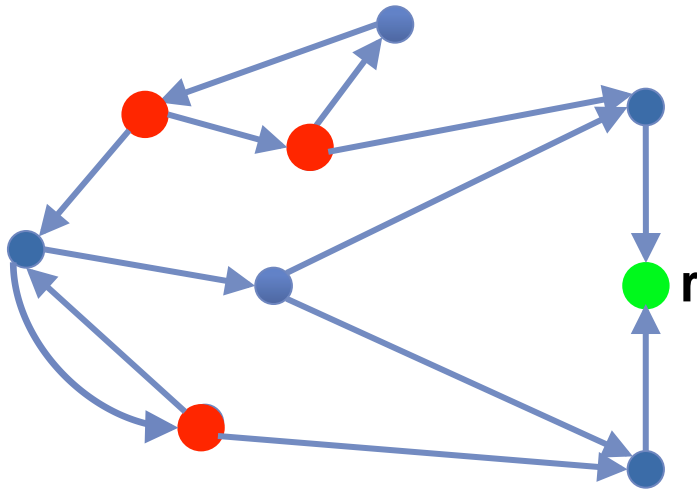
**Cor2:**  $O(\log^3 h)$  approximation in quasi-polynomial-time  $2^{\text{polylog}(n)}$  (QPT)

**Thr [Halperin, Krauthgamer'03]:** DST is  $O(\log^{2-\epsilon} n)$  hard to approximate

# k-Connected Directed Steiner Tree (k-DST)

**Def:** the **k-(Edge)-Connected Directed Steiner Tree** problem (**k-DST**) is the generalization of DST where one wants **k edge-disjoint paths** from each terminal to the root  $r$

● = terminal       $k=2$



# k-Connected Directed Steiner Tree (k-DST)

**Def:** the **k-(Edge)-Connected Directed Steiner Tree** problem (**k-DST**) is the generalization of DST where one wants **k edge-disjoint paths** from each terminal to the root r

[Cheriyān, Laekhanukit, Naves, Vetta '14]	$2^{1/\log^{1-\epsilon} n}$ hard to apx. $k^{\Omega(\delta)}$ hard to apx.
[Laekhanukit '14]	$k^{1/2 - \epsilon}$ hard to apx.
[Laekhanukit '16]	$O(k^{\Omega(D-1)} \log n)$ -apx, <b>D-shallow instances</b> (directed paths of hop-length at most D)

## Prob [Feldam, Kortsarz, Nutov '12]:

- Can we get any non-trivial approximation for the general case?
- Possibly analogous to the DST case?
- Say for  $k=O(1)$ ? Even just for  $k=2$ ?

# k-Connected Directed Steiner Tree (k-DST)

**Def:** the **k-(Edge)-Connected Directed Steiner Tree** problem (**k-DST**) is the generalization of DST where one wants **k edge-disjoint paths** from each terminal to the root  $r$

**Thr [G., Laekhanukit'17]:** For any  $D > 0$  in  $n^{\tilde{O}(D)}$  time one can compute a  **$O(D^3 \log D h^2 / D \log n)$**  approximation for **2-DST**

**Cor1:** For  $\epsilon > 0$ ,  **$O(h^\epsilon)$**

**Cor2:**  **$O(\log^3 h \log n \log \log h)$**  apx in

• <sup>apx</sup> Complex LP where we combine: <sup>QPT</sup>

- Zelikowsky's **height reduction**
- **Divergent Steiner trees**
- **Embedding into shallow trees** [Laekhanukit'16]
- **Group-Steiner-Tree (GST) LP**

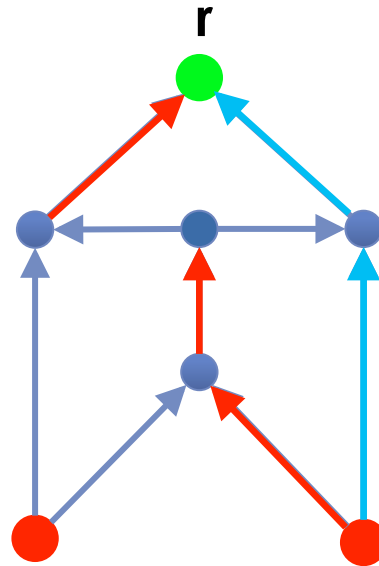
• LP rounding where we combine:

- **GKR rounding** for GST [Garg, Kojevod, Ravi'00]
- **Random path mapping**
- **Cut-based** connectivity analysis [Chalermsook, G., Laekhanukit'15]

# Divergent Steiner Trees

**Prob:** Can we decompose a 2-DST solution into 2 edge disjoint DST solutions?

**NO!**

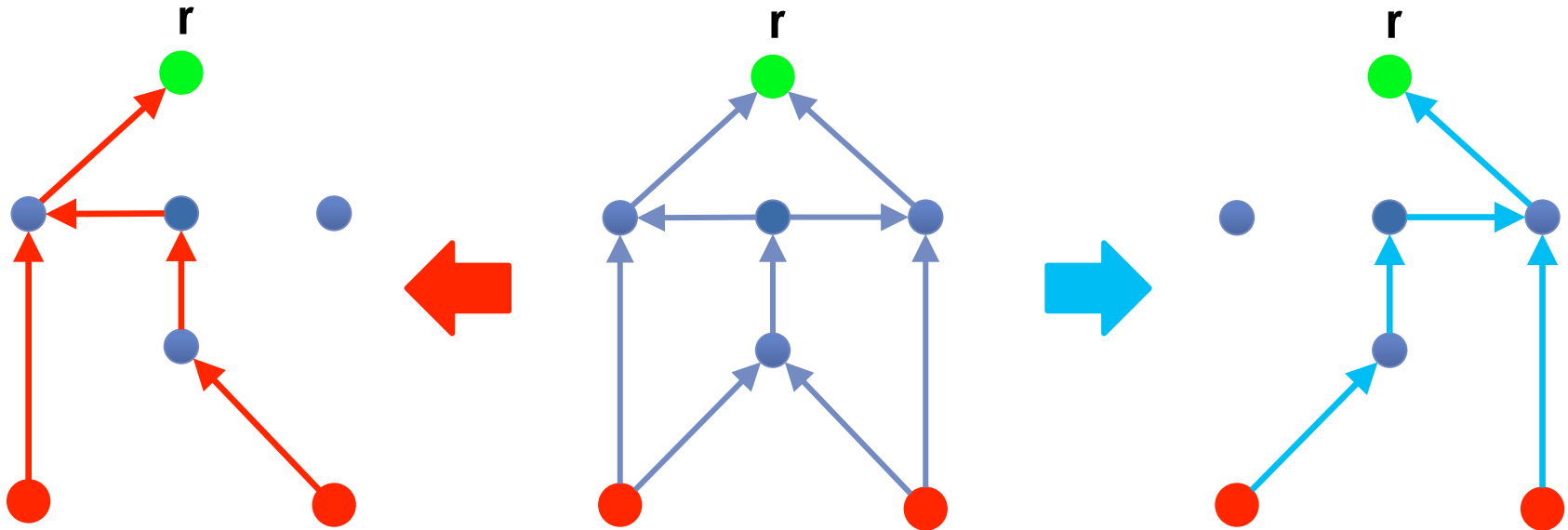




# Divergent Steiner Trees

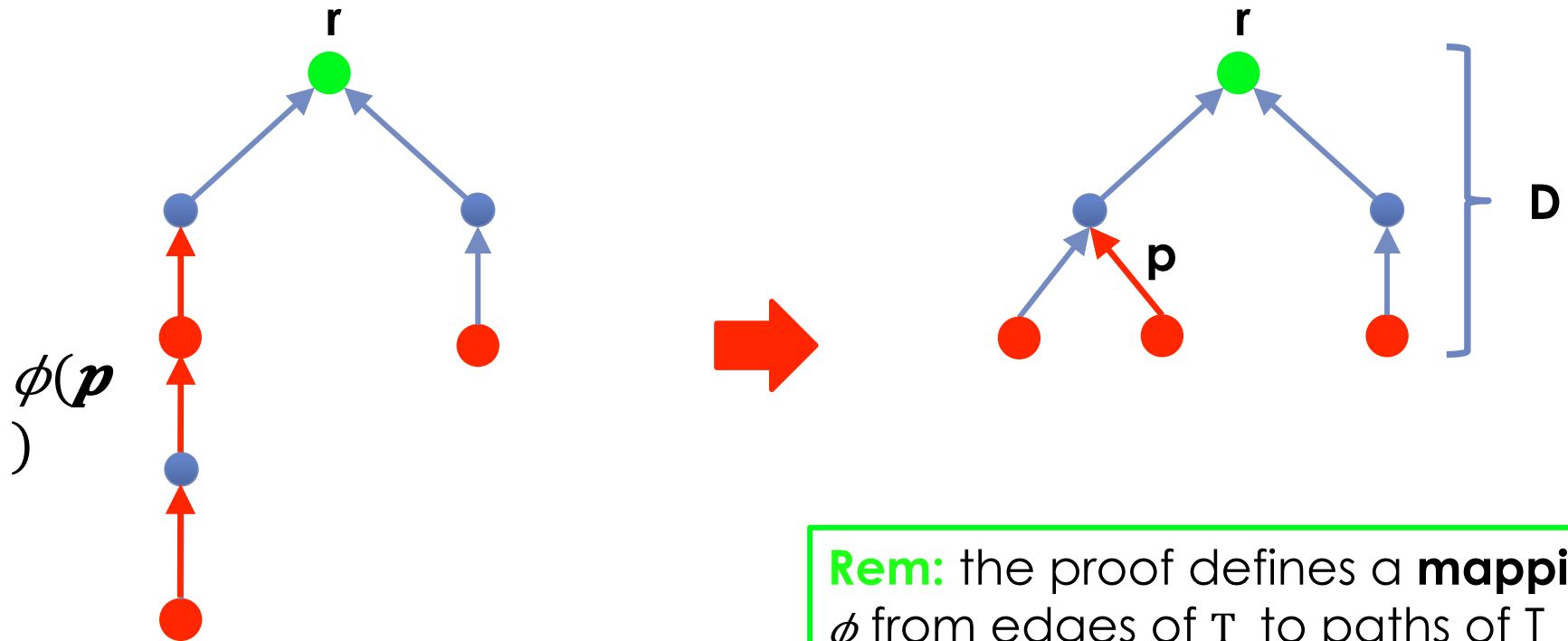
**Def:** two (possibly not edge disjoint) DST solutions  $T_1$  and  $T_2$  are **divergent** if for any terminal  $t$ , the  $t$ - $r$  path in  $T_1$  and  $T_2$  are edge disjoint

**Thr [Georgiadis, Tarjan'05; Berczi, Kovacz'11]:** any 2-DST solution can be “decomposed” into 2 divergent Directed Steiner trees



# Height Reduction

**Thr [Zelikovsky'97]:** for any  $D > 0$  and DST  $T$ , there exists a DST  $T'$  in the metric closure of  $T$  of **depth**  $\leq D$  and cost  $w(T') \leq O(Dh \ln D) w(T)$

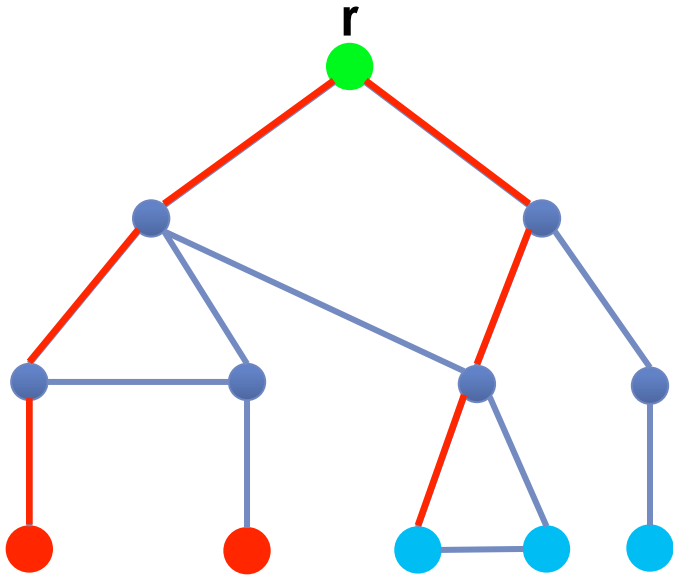


**Rem:** for DST apx. ( $T = \text{OPT}$ ) one can consider the **metric closure** of the overall graph  $G$

**Rem:** the proof defines a **mapping**  $\phi$  from edges of  $T$  to paths of  $T$  (between the same endpoints) where each edge of  $T$  is used  $\leq \beta = O(Dh \ln D)$  times altogether (**bounded congestion**)

# Group Steiner Tree (GST)

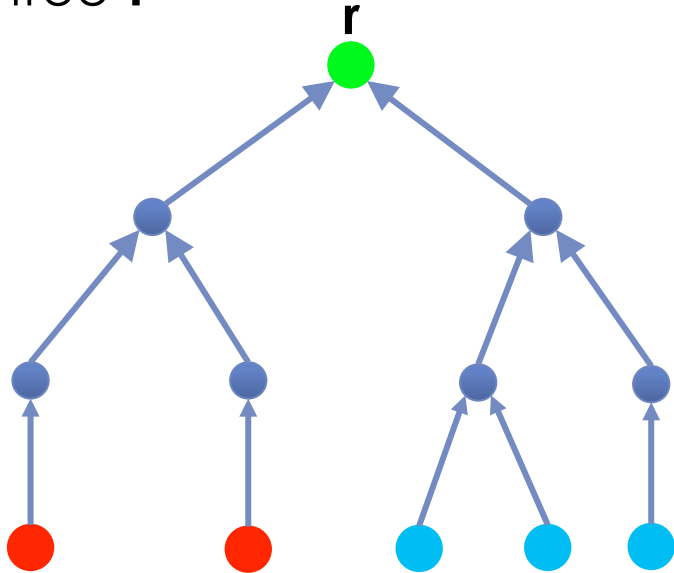
**Def:** in the **Group Steiner Tree** problem (**GST**) we are given an undirected edge-weighted graph  $G$ , a root  $r$ , and  $h$  subsets of nodes  $G \setminus \{r\}, \dots, G \setminus \{r\}$  (**groups**). The goal is to compute the cheapest tree that contains  $r$  and **at least one node per group**



**Rem:** We will consider the **2-GST** generalization, with connectivity 2 between each group and the root

# Group Steiner Tree (GST)

Thr [Garg, Kojevod, Ravi'00]: there is a  $O(\log^2 h)$ -apx for **GST** on a tree  $T$



- Solve GST LP
- Apply **GKR rounding**  $O(\log^2 h)$  times:
  - select edge  $p$  incident to  $r$  independently with probability  $y \downarrow p$
  - otherwise select  $p$  with probability  $y \downarrow p$  if the tree has height  $O(\log h)$  edge  $p$  selected before

$$\begin{aligned} \min \quad & \sum_{p \in E(T)} w(p) y \downarrow p && \text{(GST LP)} \\ \text{s.t.} \quad & f \downarrow p \hat{\tau}_i \leq y \downarrow p && \forall i \in [h] \forall p \in E(T) \\ & \sum_{p \in \delta^{\text{in}}(w)} f \downarrow p \hat{\tau}_i = \sum_{p \in \delta^{\text{out}}(w)} f \downarrow p \hat{\tau}_i && \forall i \in [h] \\ & && \forall w \in V(T) \setminus (\{r\} \cup G \downarrow i) \\ & \sum_{p \in \delta^{\text{out}}(G \downarrow i)} f \downarrow p \hat{\tau}_i \geq 1 && \forall i \in [h] \end{aligned}$$

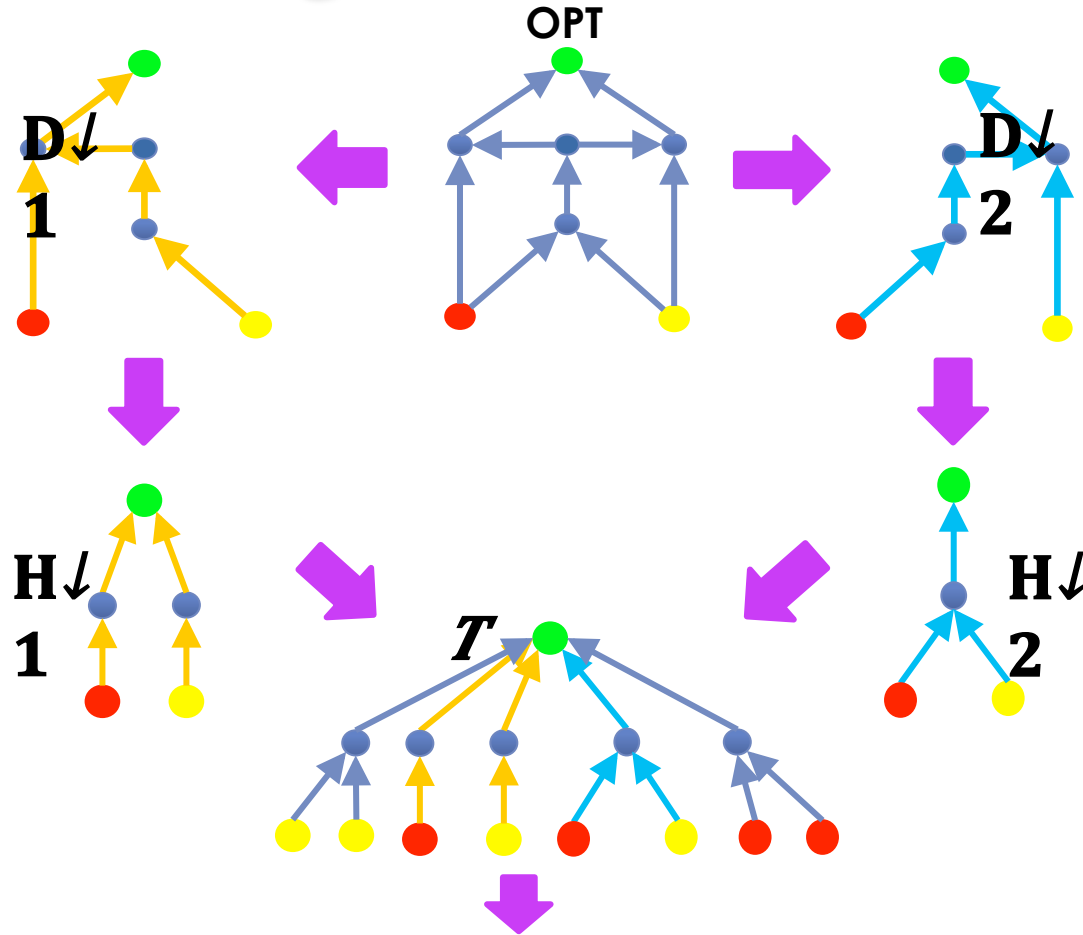
**Rem:** If the tree has height  $O(\log h)$  edge  $p$  selected before sufficient

**Rem:** The same works if the flow leaving  $G \downarrow i$  is  $\Omega(1)$

**Rem:** We will use a similar LP for 2-GST...

# The Big Plan

1. Divergent Steiner Trees
2. D-Height Reduction
3. Embedding into 2-GST instance in a D-Shallow Tree
4. GKR Rounding for 2-GST LP
5. Map back to G

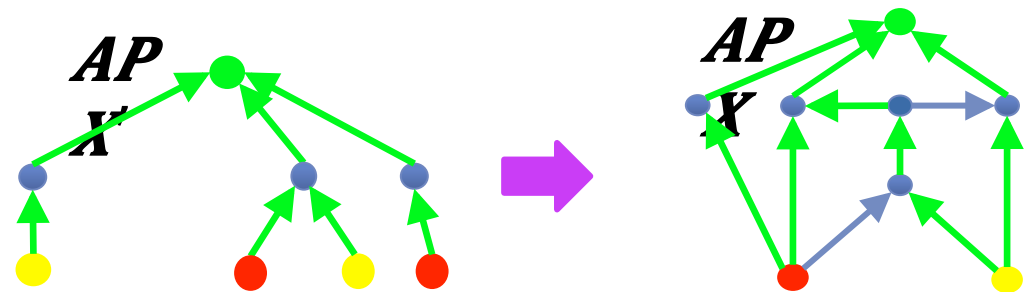


**Prob:** Differently from DST, cannot use metric closure in Height Reduction

$$f_{lp} \leq y_{lp} \quad \forall i \in [h] \forall p \in E(T)$$

$$\sum_{p \in \delta^+(i)} f_{lp} = \sum_{p \in \delta^-(i)} f_{lp} \quad \forall i \in [h]$$

$$\sum_{p \in \delta^+(i)} f_{lp} = \sum_{p \in \delta^-(i)} f_{lp} \quad \forall w \in V(T) \setminus \{r\}$$



# Problem Fixing

**Prob:** Cannot use metric closure in Height Reduction (we would lose connectivity properties of original graph)

**Idea:** Let an LP create the mapping!

- Define a  $(u,v)$ -flow  $f_{p,e}$  of value  $y_p$  in  $G$  for each  $p=(u,v) \in E(T)$
- Enforce **bounded congestion** (to keep cost under control)

$$f_{p,e} \leq x_e$$

$$\forall p \in E(T) \forall e \in E(G)$$

$$\sum_{e \in \delta^{\text{out}}(u)} f_{p,e} = y_p$$

$$\forall p = (u,v) \in E(T)$$

$$\sum_{e \in \delta^{\text{in}}(w)} f_{p,e} = \sum_{e \in \delta^{\text{out}}(w)} f_{p,e}$$

$$\forall p = (u,v) \in E(T) \\ \forall w \in V(G) \setminus \{u,v\}$$

$$\sum_p f_{p,e} \leq 2\beta x_e \in O(Dh \cdot 1/D) x_e$$

$$\forall e \in E(G)$$

**Rem:**  $x_e$  choice variable for  $e \in E(G)$

**Rem:** We will interpret this flow as a **distribution over paths**

# Problem Fixing

**Prob:** Cannot use metric closure in Height Reduction (we would lose connectivity properties of original graph)

**Idea:** Let an LP create the mapping!

- Define a similar flow for each terminal  $i$
- Enforce **divergency** (useful for connectivity analysis)

$$f_{p,e} \leq c_{p,e}$$

$$\forall p \in E(T)$$

$$\forall e \in E(G)$$

$$\forall i \in [h]$$

$$\sum_{e \in \delta^{\text{out}}(u)} f_{p,e} = f_p$$

$$\forall p = (u,v) \in E(T)$$

$$\forall i \in [h]$$

$$\sum_{e \in \delta^{\text{in}}(w)} f_{p,e} = \sum_{e \in \delta^{\text{out}}(w)} f_{p,e}$$

$$\forall p = (u,v) \in E(T)$$

$$\forall i \in [h]$$

$$\forall w \in V(G) \setminus \{u,v\}$$

$$\sum_p f_{p,e} \leq x_e$$

$$\forall e \in E(G)$$

$$\forall i \in [h]$$

# The LP

min	$\sum_e \hat{w}(e) x_e$	(2-DST LP)		
s.t.	$f_{lp} \hat{\tau}_i \leq y_{lp}$	$\forall p \in E(T) \forall i \in [h]$	}	
	$\sum_{p \in \delta^{\text{in}}(w)} \hat{\tau}_i f_{lp} \hat{\tau}_i = \sum_{p \in \delta^{\text{out}}(w)} \hat{\tau}_i f_{lp} \hat{\tau}_i$	$\forall i \in [h] \forall w \in V(T) \setminus (\{r\} \cup G_{li})$		}
	$\sum_{p \in \delta^{\text{out}}(G_{li})} \hat{\tau}_i f_{lp} \hat{\tau}_i \geq 2$	$\forall i \in [h]$		
	$f_{lp,e} \leq x_e$	$\forall p \in E(T) \forall e \in E(G)$	}	
	$\sum_{e \in \delta^{\text{out}}(u)} f_{lp,e} = y_{lp}$	$\forall p = (u,v) \in E(T)$		}
	$\sum_{e \in \delta^{\text{in}}(w)} f_{lp,e} = \sum_{e \in \delta^{\text{out}}(w)} f_{lp,e}$	$\forall p = (u,v) \in E(T) \forall w \in V(G) \setminus \{u,v\}$		
	$\sum_p \hat{\tau}_i f_{lp,e} \leq 2\beta x_e$	$\forall e \in E(G)$	}	
	$f_{lp,e} \hat{\tau}_i \leq f_{lp,e}$	$\forall p \in E(T) \forall e \in E(G) \forall i \in [h]$		}
	$\sum_{e \in \delta^{\text{out}}(u)} f_{lp,e} \hat{\tau}_i = f_{lp} \hat{\tau}_i$	$\forall p = (u,v) \in E(T) \forall i \in [h]$		
	$\sum_{e \in \delta^{\text{in}}(w)} f_{lp,e} \hat{\tau}_i = \sum_{e \in \delta^{\text{out}}(w)} f_{lp,e} \hat{\tau}_i$	$\forall p = (u,v) \in E(T) \forall i \in [h] \forall w \in V(G) \setminus \{u,v\}$	}	
	$\sum_p \hat{\tau}_i f_{lp,e} \leq x_e$	$\forall e \in E(G) \forall i \in [h]$		

2-GST LP

Path mapping

Divergency



# The Algorithm

1. Solve 2-DST LP  $\Rightarrow (x_{lp}, y_{lp}, f_{lp}, f_{lp,e}, f_{lp,e})$
2. For  $j=1, \dots, O(D \log n)$ 
  - I. Round  $\{y_{lp}\}$  with GKR rounding  $\Rightarrow T_{lj} \subseteq T$
  - II. For  $q=1, \dots, O(Dh/D \log D)$ 
    - a) For each  $p=(u,v) \in T_{lj}$ , sample  $(u,v)$ -path  $P_{lp,q}$  "from"  $f_{lp,e}/y_{lp}$
  - III. Let  $H_{lj} = \cup P_{lp,q} \subseteq G$
3. Return  $H = \cup H_{lj}$

**Lem:** the expected cost is  $O(D^3 \log D h^2 / D \log n)$  times the LP value

- Using bounded congestion, in each execution of step a) each edge  $e \in G$  belongs to  $O(\beta) = O(Dh/D)$  paths  $P_{lp,q}$  in expectation

# The Algorithm

1. Solve 2-DST LP  $\Rightarrow (x_{l,e}, y_{l,p}, f_{l,p}, \hat{f}_{l,p,e}, f_{l,p,e}, \hat{f}_{l,p,e})$
2. For  $j=1, \dots, \mathbf{O(D \log n)}$ 
  - I. Round  $\{y_{l,p}\}$  with GKR rounding  $\Rightarrow T_{l,j} \subseteq T$
  - II. For  $q=1, \dots, \mathbf{O(Dh \Delta / D \log D)}$ 
    - a) For each  $p=(u,v) \in T_{l,j}$ , sample  $(u,v)$ -path  $P_{l,p,q}$  “from”  $f_{l,p,e} / y_{l,p}$
  - III. Let  $H_{l,j} = \cup P_{l,p,q} \subseteq G$
3. Return  $H = \cup H_{l,j}$

**Lem:** w.h.p., for each terminal  $i$  and edge  $e$ ,  $H \setminus \{e\}$  contains an  $i$ - $r$  path

**Rem:** inspired by [Chalermsook, G., Laekhanukit '15] for  $k$ -GST

- We discard “bad” edges  $p \in T$  such that  $P_{l,p,q}$  has “large” probability to contain  $e$
- Using divergency and bounded congestion, we show that remaining “good” edges support flow  $\geq 1/2$  from  $G_{l,i}$  to  $r$
- Hence  $H_{l,j} \setminus \{e\}$  has “large enough” probability to connect  $i$  to  $r$

# Open Problems

**Prob:** Obtaining similar approximation for k-DST (say, up to a factor  $f(k)\text{polylog}(n)$ )

**Rem:** the divergency theorem doesn't hold for  $k \geq 3$

**Idea:** our approach would still work with a weakened form of the divergency theorem where:

- We decompose OPT into  **$f(k)\text{polylog}(n)$  trees**  $T_i$  (rather than  $k$ )
- For any  $i$  and set  $F$  of  $k-1$  edges, **at least one**  $T_i \setminus F$  connects  $i$  with  $r$

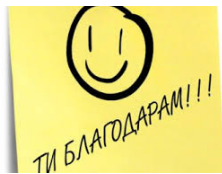
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