

# Electric routing and concurrent flow cutting

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ISAAC'09

# Outline

- ❖ Oblivious routing, history, results
- ❖ Geometry and routing
- ❖ Electric flow and electric routing
- ❖ Congestion and  $L_1$  spectral inequalities
- ❖ Remarks and other results

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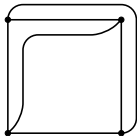
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# Oblivious routing problem

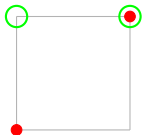
1 Graph instance



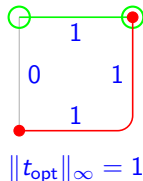
2 Oblivious routes



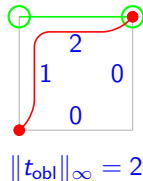
3 Adversarial demands



4 Optimal routing



5 Oblivious routing



$$\text{Ratio } \eta = \max_{G,D} \frac{\|t_{\text{obl}}\|_{\infty}}{\|t_{\text{opt}}\|_{\infty}}$$

## Problem history

Input family	Type	Ratio $\frac{\ t_{\text{obl}}\ _p}{\ t_{\text{opt}}\ _p}$	Time	
hypercube	$l_2$	$O(\log n)$	n/a	Valiant'81
any	$l_\infty$	$O(\log^3 n)$	$\exp(n)$	Räcke'02
any	$l_\infty$	$O(\log^2 n \cdot \log \log n)$	$\text{poly}(n)$	Harrelson'03
any	$l_{1 \leq p \leq \infty}$	$O(\log n)$	$\text{poly}(n)$	Räcke'08'10
expanders	$l_\infty$	$O(\log n)$	$\tilde{O}(n)$	this work
"	$l_{1 \leq p \leq \infty}$	"	n/a	Lawler'09

❖ Ratio lower-bound  $\Omega(\log n / \log \log n)$  for expanders Hajiaghayi'06

# New Algorithmics

## ❖ Computation

- ❖ Vertices = processors, edges = communication links
- ❖  $O(\log n)$  rounds of communication (for expanders)
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## ❖ Routing scheme representation

- ❖ Per-vertex routing tables of size  $\deg(v) \cdot n$

## ❖ Querying the routing scheme

- ❖ At vertex  $v$ , given source  $s$  and sink  $t$ ,
- ❖ Compute the next hop in  $O(1)$  time using local table



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- ❖ We use **electric flow**
- ❖ We use a geometric framework
- ❖ Ratio bound equals  $\|L^\dagger\|_{1 \rightarrow 1} \leq O\left(\frac{\log n}{\lambda}\right)$ 
  - ❖ New rounding techniques
  - ❖ Also see Lawler'09

# New Mathematics

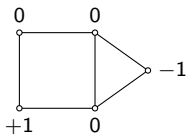
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- ❖ **Fault-tolerance** = statements about distribution of edge-flow in electric current

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- ❖ **Geometry** and routing
- ❖ Electric flow and electric routing
- ❖ Congestion and  $L_1$  spectral inequalities
- ❖ Remarks and other results

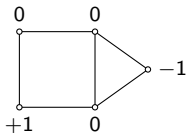
## Demand and flow

- ❖ A **demand** is a vector like  $d = \mathbb{1}_s - \mathbb{1}_t$
- ❖ Formally, any  $d \in \mathbb{R}^V$  with  $\sum_v d_v = 0$



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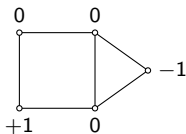
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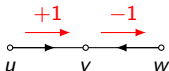
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- ❖ Fix any **orientation**  $u \rightarrow v$  on  $G$ 's edges
- ❖ A **flow** is a vector  $f \in \mathbb{R}^E$ 
  - ❖ Think  $f_{(u,v)}$  flow travels from  $u$  to  $v$  if  $u \rightarrow v$



## Divergence operator, flow-demand connection

- ♣ The **divergence operator**,  $div : \mathbb{R}^E \rightarrow \mathbb{R}^V$ ,
- ♣ Maps an **edge flow** to **vertex flow imbalance**



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- ❖ **Vertex flow imbalance** = incoming flow - outgoing flow

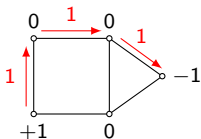
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- ❖ Say that **flow  $f$  routes demand  $d$**  if  $div \cdot f = d$



## Linear routing schemes

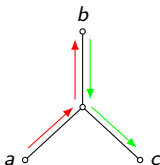
- ❖ A **linear routing scheme** is a function  $R$  such that
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- ❖ Examples
  - ❖ Routing along a spanning tree, or
  - ❖ Electric routing



## Sets of demands and flows

- ❖ Write a **set of demands**  $\{d_i \in \mathbb{R}^V\}_{i=1,\dots,k}$  as  $\oplus_i d_i \in \mathbb{R}^{V \times k}$
- ❖ Similarly, a **set of flows**  $\{f_i \in \mathbb{R}^E\}_{i=1,\dots,k}$  as  $\oplus_i f_i \in \mathbb{R}^{E \times k}$

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- ❖ Say **flows**  $\oplus_i f_i$  **route demands**  $\oplus_i d_i$  if  $\text{div} \cdot (\oplus_i f_i) = \oplus_i d_i$
- ❖ Simply means:
  - ❖ Flow  $f_i$  routes demand  $d_i$  for all  $i$ , by applying  
“flow  $f$  routes demand  $d$  if  $\text{div} \cdot f = d$ ”

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## Congestion and norms

- ❖ For a set of flows  $F = \oplus_i f_i$  the **congestion equals**
  - ❖ The traffic on the most loaded edge, or
  - ❖  $\|F^*\|_{1 \rightarrow 1}$  where  $\|A\|_{1 \rightarrow 1} := \sup_x \frac{\|Ax\|_1}{\|x\|_1}$
- ❖ Notably, congestion is a **norm** (over  $\mathbb{R}^{E \times \infty}$ )
- ❖ Abbreviate it as  $\|F\|$



## Worst-case demands

- ❖ Recall, for a scheme  $R$ , **ratio** is  $\eta_R := \max_D \frac{\|R(D)\|}{\|opt(D)\|}$
- ❖ W.L.O.G.  $\|opt(D)\| = 1$

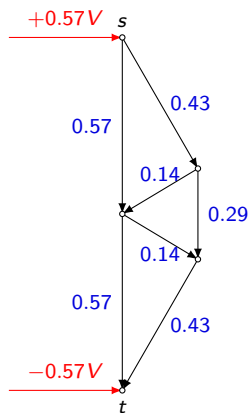
**Theorem** For all such  $D$ ,  $\|R(D)\| \leq \|R(D_{\text{worst}})\|$ , where  $D_{\text{worst}}$  demands one unit of flow between endpoints of every edge in  $G$ .

- ❖ **So**,  $\eta_R = \|R(D_{\text{worst}})\|$

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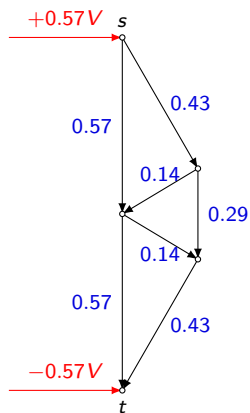
# Electric flow



❖ How to map **demand** to **electric flow**?

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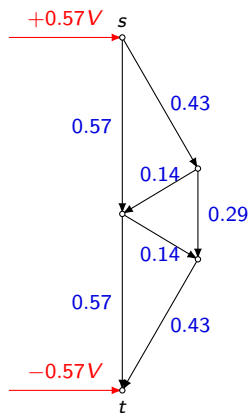


- ❖ How to map **demand** to **electric flow**?

$$\nabla \cdot L^\dagger : \mathbb{R}^V \rightarrow \mathbb{R}^E$$

- ❖ where  $\nabla : \mathbb{R}^V \rightarrow \mathbb{R}^E$  maps **vertex potentials** to **edge potential differences**

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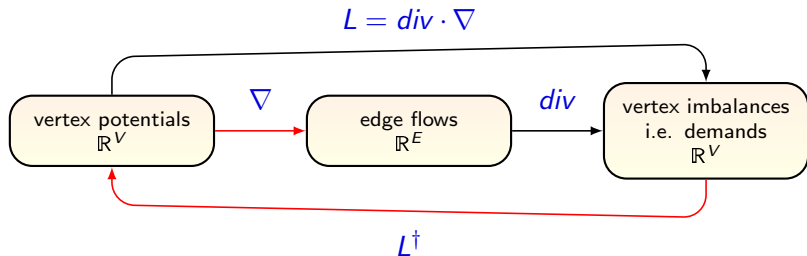
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- ❖ and  $L := \text{div} \cdot \nabla$

## Derivation of electric flow



- ❖ **Ohm's law:** edge flow = potential difference \* edge conductance
- ❖  $\nabla$  maps **vertex potentials** to **edge flow** (Ohm's law)
- ❖ **div** maps **edge flows** to **vertex flow imbalance** (a.k.a. **demand**)
- ❖  $\nabla \cdot L^\dagger$  maps **demand** to **edge flows**

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## Ratio of electric routing

- ❖ Electric routing operator is  $\nabla \cdot L^\dagger$
- ❖ Worst-case demands are  $D_{\text{worst}}$  (by theorem)  
One unit of demand between the endpoints of every edge in  $G$ .
- ❖ So, competitive ratio equals  $\|\nabla \cdot L^\dagger \cdot D_{\text{worst}}\|$



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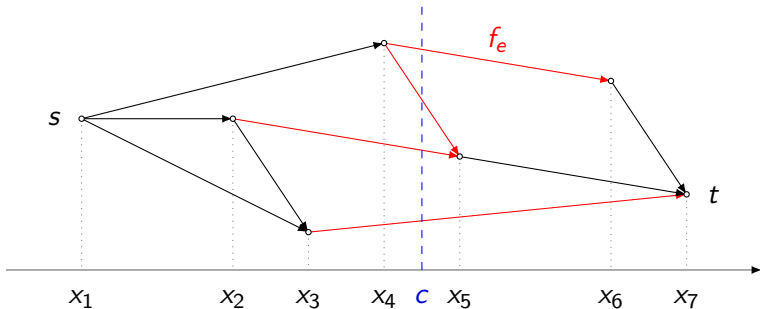
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 $\approx \|L^\dagger\|_{1 \rightarrow 1}$  when  $G$  is bounded degree  
 $= \max_{s \neq t} \|\nabla \cdot L^\dagger(\mathbb{1}_s - \mathbb{1}_t)\|_1$

## Laplacian $l_1 \rightarrow l_1$ norm bound

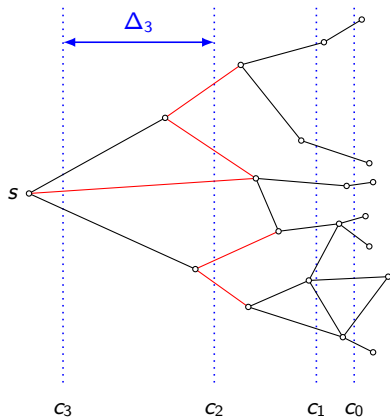
**Theorem:**

$$\|\nabla L^\dagger(\mathbb{1}_s - \mathbb{1}_t)\|_1 \leq O(\log n), \text{ if } \min_{S \subseteq V} \frac{|E(S, S^c)|}{\min |S|, |S^c|} = O(1).$$

- ❖ Think  $(\mathbb{1}_s - \mathbb{1}_t) \xrightarrow{L^\dagger} x \xrightarrow{\nabla} f$ , and ask  $\|f\|_1 \leq ?$
- ❖ **Local property:** Sum of edge lengths on any cut equals 1



## Rounding argument



$k_i$  = number of edges cut by  $c_i$

$n_i$  = number of vertices to left of  $c_i$

**Idea** Make a few cuts, then upper-bound total edge length by (scaled) edge length on cuts.

- ❖ **Invariant**  $k_i = \Theta(n_i)$
- ❖ **Cut spacing**  $\Delta_{i+1} = |c_i - c_{i+1}| =$  twice the avg. edge length on  $c_i$   
 $\Rightarrow k_{i+1} \leq \theta k_i$  where  $0 < \theta < 1$  const.  
 $\Rightarrow \Delta_{i+1} \geq \frac{\Delta_i}{\theta}$
- ❖ Using  $\sum_i \Delta_i \leq \lambda^{-1} = O(1)$
- ❖ Conclude at most  $O(\log n)$  cuts

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# Remarks

## ❖ Computation

- ❖ Approximate  $L^\dagger$  by low-degree power-series polynomial in  $L$
- ❖ Multiplication by  $L$  is one distributed step

## ❖ Potential perturbation

- ❖ Computed potentials are not exact
- ❖ **Theorem** Electric flow under perturbed potentials as good

## ❖ Laplacian symmetrization to get degree independence

Thank you!

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