Simplex Partitioning and the Multiway Cut Problem

Roy Schwartz

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Simplex Partitioning and Multiway Cut











Definition

- Input: G = (V, E) and $T = \{t_1, t_2, \dots, t_k\} \subseteq V$.
- Output: $\{S_1, S_2, \dots, S_k\}$ a partition of V minimizing:

$$\frac{1}{2}\sum_{i=1}^k \delta(S_i),$$

s.t. $t_i \in S_i \quad \forall i$.

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Note: For k = 2 problem is easy (min s - t cut).

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[Dahlhaus-Johnson-Papadimitriou-Seymour-Yannakakis-92]



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2-approximation

[Dahlhaus-Johnson-Papadimitriou-Seymour-Yannakakis-92]



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2-approximation

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NP-hard and APX-complete $(k \ge 3)$

Geometric Approach

[Călinescu-Karloff-Rabani-98]



Geometric Approach

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Geometric Approach

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Geometric Approach (cont.)

$$\Delta_k = \left\{ \mathbf{x} \in \mathbb{R}^k_+ : \sum_{i=1}^k x_i = 1 \right\}$$

$$\min \sum_{\substack{(u,v)\in E \\ i \in \Delta_k}} \frac{1}{2} \|\mathbf{u} - \mathbf{v}\|_1$$

$$s.t. \quad \mathbf{u} \in \Delta_k \qquad \qquad \forall u \in V$$

$$\mathbf{t}_i = \mathbf{e}_i \qquad \qquad \forall i = 1, \dots, k$$

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Geometric Approach (cont.)

$$\Delta_k = \left\{ \mathbf{x} \in \mathbb{R}^k_+ : \sum_{i=1}^k x_i = 1 \right\}$$

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Gap Implies Hardness:

$$gap \begin{cases} \frac{8}{7+(k-1)^{-1}} & [Freund-Karloff-00] \\ \frac{6}{5+(k-1)^{-1}} & [Angelidakis-Makarychev-Manurangsi-16] \\ (assuming UGC) & [Manokaran-Naor-Raghavendra-S-08] \end{cases}$$

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Geometric Approach (cont.)

Question: How to extract a partitioning from Δ_k ?

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Random partition $\{S_1, \dots, S_k\}$ of Δ_k s.t.: • $\mathbf{e}_i \in S_i$ • $\Pr[u \text{ and } v \text{ separated}] \le \alpha \cdot \frac{1}{2} ||\mathbf{u} - \mathbf{v}||_1$

Image: A math a math



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 $\alpha\text{-approximation}$ for MULTIWAY-CUT

Image: A math a math



Note: all algorithms besides the greedy 2-approximation bound α .

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Image: A math and A

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 $\alpha\text{-approximation}$ for MultIWAY-Cut

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$$\mathbf{u} = (u_1, \dots, u_{i-1}, u_i, u_{i+1}, \dots, u_{j-1}, u_j, u_{j+1}, \dots, u_k)$$

$$\mathbf{v} = (u_1, \dots, u_{i-1}, u_i + \varepsilon, u_{i+1}, \dots, u_{j-1}, u_j - \varepsilon, u_{j+1}, \dots, u_k)$$



Random partition $\{S_1, \ldots, S_k\}$ of Δ_k s.t.: • $\mathbf{e}_i \in S_i$ • $\Pr[u \text{ and } v \text{ separated}] \le \alpha \cdot \frac{1}{2} ||\mathbf{u} - \mathbf{v}||_1$

 $\alpha\text{-approximation}$ for Multiway-Cut

Image: A math a math

$$\mathbf{u} = (u_1, \dots, u_{i-1}, \quad u_i \quad , u_{i+1}, \dots, u_{j-1}, \quad u_j \quad , u_{j+1}, \dots, u_k) \mathbf{v} = (u_1, \dots, u_{i-1}, \quad u_i + \varepsilon \quad , u_{i+1}, \dots, u_{j-1}, \quad u_j - \varepsilon \quad , u_{j+1}, \dots, u_k)$$

Cut density of (i, j)-edge is $\alpha_{i,j} \triangleq \lim_{\varepsilon \to 0} \frac{1}{\varepsilon} \Pr[(u, v) \text{ is cut}].$

[Buchbinder-Naor-S-13] [Ge-He-Ye-Zhang-11]

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$$Z_1, \ldots, Z_k \sim \exp(1)$$
 i.i.d $S_i = \left\{ u \in \Delta_k : \frac{Z_i}{u_i} \le \frac{Z_1}{u_1}, \ldots, \frac{Z_k}{u_k} \right\}$

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 $Z = (Z_1, Z_2, Z_3) / (Z_1 + Z_2 + Z_3) \in \Delta_3$

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How is Z distributed ?

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How is Z distributed ? $Z \sim Unif(\Delta_3)$

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All boundaries of the Δ_3 partition Z induces

[Buchbinder-Naor-S-13] [Ge-He-Ye-Zhang-11]

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How is Δ_3 partitioned given u?

Theorem [Buchbinder-Naor-S-13]

Building Block I has cut density:

 $\alpha_{i,j} \le 2 - u_i - u_j.$

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Theorem [Buchbinder-Naor-S-13]

Building Block I has cut density:

 $\alpha_{i,j} \le 2 - u_i - u_j.$

Note: can use algorithm of [Kleinberg-Tardos-99] instead.

[Călinescu-Karloff-Rabani-98]

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 π random permutation on terminals $r \sim \text{Unif}[0, 1]$



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 i^{th} step: assign all unassigned $\mathbf{u} \in \Delta_k$ with $u_{\sigma(i)} \ge r$ to $t_{\sigma(i)}$.

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Theorem [Călinescu-Karloff-Rabani-98]

Assuming $u_1 \ge \ldots \ge u_k$ Building Block II has cut density:

$$\alpha_{i,j} \le \frac{1}{i} + \frac{1}{j}.$$

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Assuming $u_1 \ge \ldots \ge u_k$ Building Block II has cut density:

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Note: Building Block II provides a (3/2)-approximation for MULTIWAY-CUT.

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Cut density:
$$\alpha_{i,j} \leq \frac{g'(u_i)}{i} + \frac{g'(u_j)}{j}$$

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$$\alpha_{i,j} \leq \frac{g'(u_i)}{i} + \frac{g'(u_j)}{j}$$

• Threshold Dependency: independent, descending.

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Question: why multiple building blocks?

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Example:

 $\begin{cases} Expo. Clocks & w.p 2/3 \\ CKR (quadratic distort) & w.p 1/3 \end{cases}$ [Buchbinder-Naor-S-13]

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Question: why multiple building blocks? different bad cases!

Example:

$$\begin{cases} Expo. Clocks & w.p^{2/3} \\ CKR (quadratic distort) & w.p^{1/3} \end{cases}$$
[Buchbinder-Naor-S-13]

Cut density:
$$\alpha_{i,j} \leq \frac{2}{3} \left(2 - u_i - u_j\right) + \frac{1}{3} \left(\frac{2u_i}{i} + \frac{2u_j}{j}\right) \leq \frac{4}{3}$$
.

1.5 [Călinescu-Karloff-Rabani-98]

CKR

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1.3438 [Karger-Klein-Stein-Thorup-Young-99]

CKR

CKR (truncated distort)

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Independent (truncated distort)

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1 2065	[Charmen) (and with 14] (as manutan assisted)	ſ	Expo. Clocks CKR (piecewise quadratic distort)

1.2965 [Sharma-Vondrák-14] (computer assisted)

Independent (truncated distort) Descending (truncated distort)

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1.2965	[Sharma-Vondrák-14] (computer assisted)	{	Expo. Clocks CKR (piecewise quadratic distort) Independent (truncated distort)

Question: simpler approach?

Descending (truncated distort)

Distorting the Simplex

$$\begin{cases} \mathbf{u} = (u_1, \dots, u_k) \\ g : [0,1] \to [0,1] \end{cases} \quad \rightsquigarrow \quad (g(u_1), \dots, g(u_k)) \end{cases}$$

Distorting the Simplex

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Distorting the Simplex (cont.)

$$\begin{cases} \mathbf{u} = (u_1, \dots, u_k) \\ g_i : \Delta_k \to [0, 1]^k \end{cases} \quad \rightsquigarrow \quad (g_1(\mathbf{u}), \dots, g_k(\mathbf{u})) \end{cases}$$

Distorting the Simplex (cont.)

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$$\begin{cases} \mathbf{u} = (u_1, \dots, u_k) \\ g_i : \Delta_k \to [0, 1]^k \end{cases} \quad \rightsquigarrow \quad (g_1(\mathbf{u}), \dots, g_k(\mathbf{u})) \end{cases}$$



- expresses dependencies
- lower bound does not hold

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Feasible Distortion?

• Terminals are fixed points



Feasible Distortion?

- Terminals are fixed points
- Symmetry



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- Terminals are fixed points
- Symmetry

sort coordinates

- apply distortion according to position in order
- oplace back

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- Terminals are fixed points
- Symmetry
- Well defined

Tie breaking does not affect g:

$$g_i(u_1, \dots, u_k) \triangleq g_1(\underbrace{u_i, \dots, u_i}_{i \text{ times}}, u_{i+1}, \dots, u_k)$$

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- Terminals are fixed points
- Symmetry
- Well defined
- Monotonic : $u_i \ge u_j \Rightarrow g_i(\mathbf{u}) \ge g_j(\mathbf{u})$

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Case Study – Breaking the $\frac{3+\sqrt{5}}{4} \approx 1.309$ Lower Bound

Image: A mathematical states and a mathem

Case Study – Breaking the $\frac{3+\sqrt{5}}{4} \approx 1.309$ Lower Bound

$$g_{1}(\mathbf{u}) = u_{1}^{2} + \frac{1}{3}u_{1}(u_{2} + u_{3} + \ldots + u_{k})$$

$$g_{2}(\mathbf{u}) = u_{2}^{2} + \frac{1}{3}u_{2}(u_{2} + u_{3} + \ldots + u_{k})$$

$$g_{3}(\mathbf{u}) = u_{3}^{2} + \frac{1}{3}u_{3}(u_{3} + u_{3} + \ldots + u_{k})$$

$$\vdots$$

$$g_{t}(\mathbf{u}) = \left(1 + \frac{t-1}{3}\right)u_{t}^{2} + \frac{1}{3}u_{t}(u_{t+1} + \ldots + u_{k})$$

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Case Study – Breaking the $\frac{3+\sqrt{5}}{4} \approx 1.309$ Lower Bound

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Theorem [Buchbinder-S-Weizman-17]

Mixing Exponential Clocks with CKR with above g yields an approximation of:

$$\frac{17}{13} \approx 1.3077 < 1.309 \approx \frac{3 + \sqrt{5}}{4}$$

for Multiway-Cut.

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Theorem [Buchbinder-S-Weizman-17]

There exists a feasible $g: \Delta_k \rightarrow [0,1]^k$ such that mixing Exponential Clocks with CKR with g yields an approximation of 1.2969 for MULTIWAY-CUT.

Image: A math a math

Theorem [Buchbinder-S-Weizman-17]

There exists a feasible $g: \Delta_k \rightarrow [0,1]^k$ such that mixing Exponential Clocks with CKR with g yields an approximation of 1.2969 for MULTIWAY-CUT.

Note: (almost) matches the 1.2965 of [Sharma-Vondrák-14].

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Open Questions

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On variable transformations with dependencies help?

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- On variable transformations with dependencies help?
- **2** What is the best possible cut density of Δ_k ?

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