Shortest Cycles With Monotone Submodular Costs

Fedor V. Fomin, Petr A. Golovach, <u>Tuukka Korhonen</u>, Daniel Lokshtanov¹, and Giannos Stamoulis²



¹University of California Santa Barbara ² LIRMM, Universite de Montpellier, CNRS

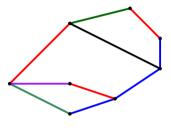
SODA 2023

23 January 2023

MINIMUM COLOR CYCLE

Input: Edge-colored undirected graph.

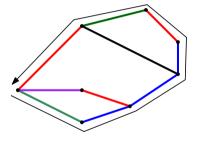
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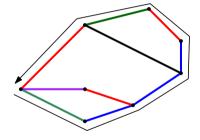
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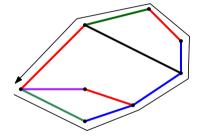


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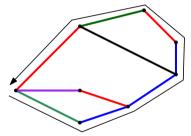


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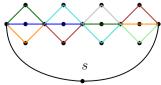
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- If all edges have different colors, equivalent to shortest cycle
- If we require the cycle to include a specified vertex s, then NP-hard [Broersma, Li, Woeginger, Zhang '05]

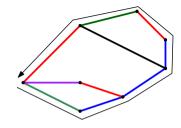


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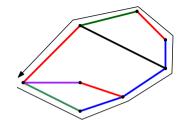
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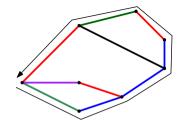
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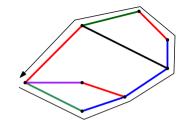
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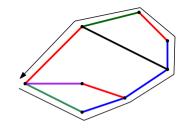
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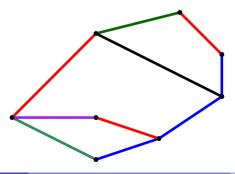
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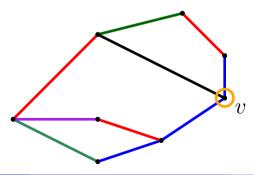
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Note: The approximation scheme implies the $n^{\mathcal{O}(\log \mathsf{OPT})}$ algorithm

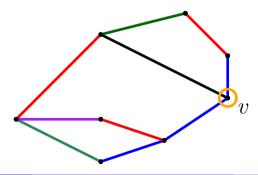


Goal: Recursive algorithm with $\mathcal{O}(\log \mathsf{OPT})$ recursion levels

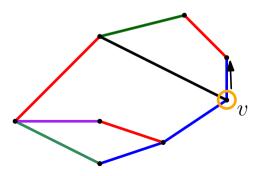
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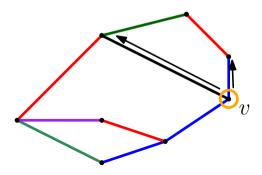
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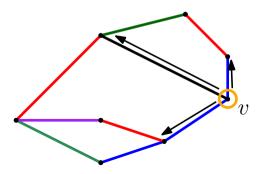
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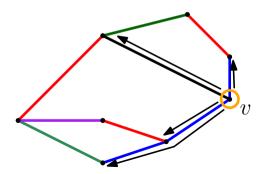
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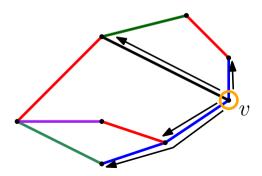
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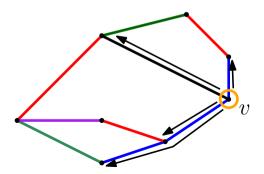
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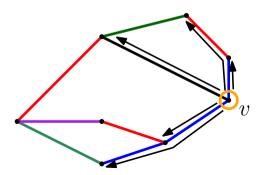
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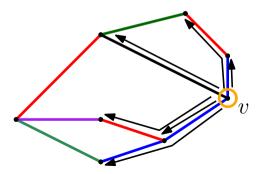
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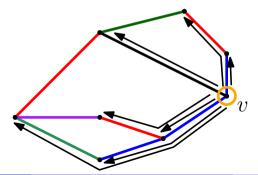
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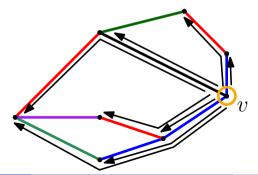
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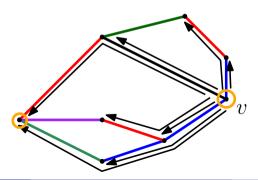
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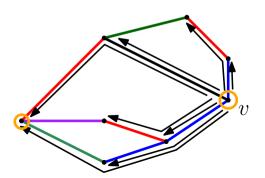
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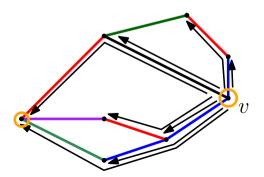
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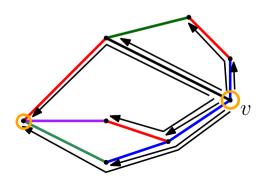
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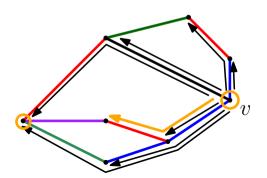
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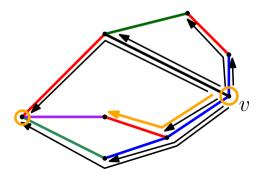
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- Similar lower bounds also for perfect matching, spanning tree, and (s, t)-cut [Goel, Karande, Tripathi, Wang '09; Jegelka and Bilmes '09]

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For every ε , at least $n^{\log_2(1/\varepsilon)-\mathcal{O}(1)}$ queries are required to $(1+\varepsilon)$ -approximate shortest submodular cycle.

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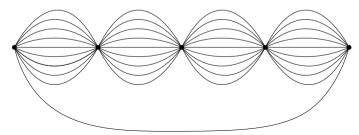
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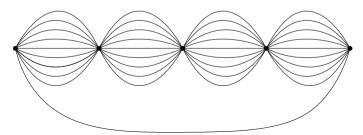
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Proof idea:

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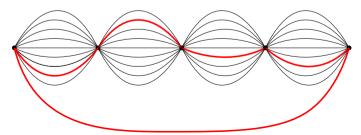


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- Let $k = \lfloor \log_2(1/\epsilon) \rfloor 1$, and let the number of pumpkins be k (here k = 4)
- One long cycle of cost $2^k 2 = 14$ and all other cycles cost $2^k 1 = 15$

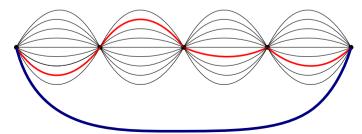


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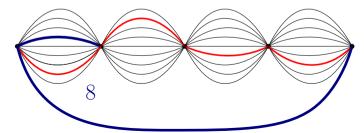


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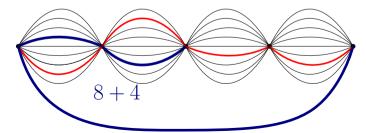


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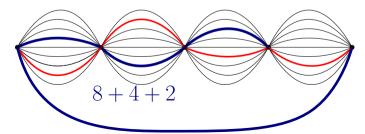


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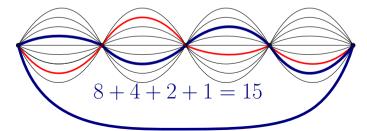


Theorem

For every ε , at least $n^{\log_2(1/\varepsilon)-\mathcal{O}(1)}$ queries are required to $(1+\varepsilon)$ -approximate shortest submodular cycle.

(i.e., our algorithm is tight for every value of $\varepsilon)$

- Let $k = \lfloor \log_2(1/\varepsilon) \rfloor 1$, and let the number of pumpkins be k (here k = 4)
- One long cycle of cost $2^k 2 = 14$ and all other cycles cost $2^k 1 = 15$
- Adding *i*:th edge increases value by 2^{k-i}
- We learn if we made right choices only at the end



EDGE-SUBMODULAR MIN-CUT

Input: Graph *G* and a monotone submodular function $f: 2^{E(G)} \to \mathbb{R}_{\geq 0}$.

Output: Cut $C \subseteq E(G)$ that minimizes f(C).

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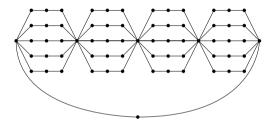
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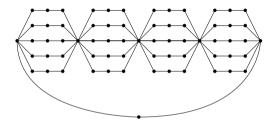
- On planar graphs, this generalizes the $n^{\mathcal{O}(\log 1/\varepsilon)}$ -time $1 + \varepsilon$ -approximation of [Ghaffari, Karger & Panigrahi; SODA'17] for colored min-cut
 - Which was proven to be optimal (for general graphs only!) by [Jaffke, Lima, Masarik, Pilipczuk & Souza; SODA'23]

1. Is there a polynomial-time algorithm for minimum color cycle?

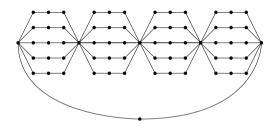
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 - Open even for "pumpkin graphs"



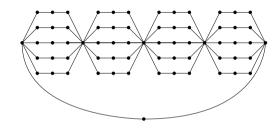
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Thank you!