# Approximating the Held-Karp Bound for Metric TSP in Nearly Linear Work and Polylog Depth

Zhuan Khye (Cedric) Koh

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- ► APX-hard [Lampis '14]
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- $ightharpoonup 3/2-10^{-36}$  approximation [Karlin, Klein, Oveis Gharan '22]

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- ▶ 3/2 10<sup>-36</sup> approximation [Karlin, Klein, Oveis Gharan '22]
- Metric TSP on  $(G,c) \equiv \mathsf{TSP}$  on the metric completion  $(\hat{G},\hat{c})$

 $\hat{G} = \text{Complete graph on } V$  $\hat{c}_{uv} = \text{Shortest path length between } u \text{ and } v \text{ in } G$ 

[Dantzig, Fulkerson, Johnson '54]

$$\begin{aligned} & \text{min } \hat{c}^{\top} x \\ & \text{s. t. } \sum_{v} x_{uv} = 2 \qquad \forall \, u \in V \\ & \sum_{u \in S, v \notin S} x_{uv} \geq 2 \qquad \forall \, \emptyset \subsetneq S \subsetneq V \\ & x_{uv} \geq 0 \qquad \forall \, u, v \in V \end{aligned}$$

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**Conjecture:** The LP integrality gap is at most 4/3 [Goemans '95].

• LP relaxation of the 2-edge-connected spanning multisubgraph problem:

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  - Multiplicative weight update (MWU)

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Framework: Width-independent epoch-based MWU.

[Garg, Könemann '07] [Fleischer '00] [Luby, Nisan '93] [Young '01]

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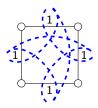


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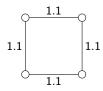
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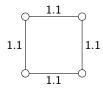
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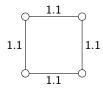
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- $\implies \tilde{O}(\log(|\mathcal{C}^*|)/\varepsilon^4)$  iterations [Luby, Nisan '93] [Young '01].
- $\implies \tilde{O}(1/\varepsilon^4)$  iterations because  $|\mathcal{C}^*| = O(n^2)$  for cuts.

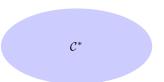
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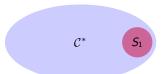


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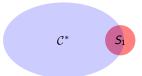
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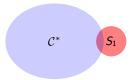
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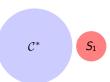
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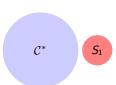


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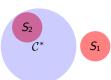
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#### **Definition**

The sequence  $S = (S_1, \dots, S_\ell)$  of representative sets is called a core-sequence of the epoch.

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### Theorem [KWY '25]

If MWU uses a core-sequence of length  $\leq \ell$  with sets of size  $\leq k$  in every epoch, then the number of iterations is

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• Tradeoff between  $\ell$  and k.

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There is a parallel FPTAS for the Held–Karp bound that runs in  $\tilde{O}(m/\varepsilon^4)$  work and  $\tilde{O}(1/\varepsilon^4)$  depth.

**Tree Packing**: Compute  $O(\log n)$  spanning trees  $\mathcal{T}$  such that w.h.p., every cut in  $\mathcal{C}^*$  intersects  $\leq 2$  edges of some  $\mathcal{T} \in \mathcal{T}$ . [Karger '00]

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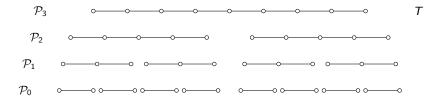
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 $S_i:=\{ ext{Cuts in }\mathcal{C}^* ext{ that intersect} \leq 2 ext{ edges of } T ext{ on some } P\in \mathcal{P}_i\},$  then  $|S_i|=O(n)$  for all i.

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