The Art of Incremental Improvements

Karol Węgrzycki



















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- ► fast algorithm,
- argument that it cannot solved faster.



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Thank you: Antonios Antoniadis, Karl Bringmann, Jana Cslovjecsek, Marek Cygan, François Dross, Krzysztof Fleszar, Sándor Kisfaludi-Bak, Jędrzej Olkowski, Marcin Mucha, Jesper Nederlof, Marvin Künnemann, Andrzej Pacut, Jakub Pawlewicz, Michał Pilipczuk, Adam Polak, Lars Rohwedder, Mateusz Rychlewicz, Piotr Sankowski, Céline Swennenhuis, Adam Witkowski, Michał Włodarczyk, Anna Zych-Pawlewicz





1973: Exponential Time Algorithm







Faster Algorithm

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2021:

Currently Best Algorithm



Faster Algorithm

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2021:

Currently Best Algorithm



















Plan for the talk

















Source: Robert Bosch

Euclidean Traveling Salesman Problem (Euclidean TSP): Given n points in \mathbb{R}^2 , find the shortest roundtrip tour that contains all the points.







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Euclidean TSP is NP-hard [Papadimitriou 1977]. We need to settle for approximation

PTAS for Euclidean TSP: for any fixed $\varepsilon > 0$ find a tour that is at most $(1 + \varepsilon)$ times longer than optimal in $n^{\mathcal{O}(1)}$ time.

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2010 Gödel prize winners!

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Our result: Simple $2^{O(1/\varepsilon)} n \log n$ time algorithm (joint work with Sándor Kisfaludi-Bak and Jesper Nederlof)

Arora's algorithm



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1. Add randomly shifted quadtree

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Guess selected portals out of $\mathcal{O}(\log(n)/\varepsilon)$

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Dynamic Programming For each cell find shortest path cover for a given matching on portals

Total runtime: $n^{\mathcal{O}(1)} \cdot 2^{\mathcal{O}(g)} = n^{\mathcal{O}(1/\varepsilon)}$



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Proof that this scheme works: Highly technical, check our paper

Part 4: Is it incremental improvement?

Maybe it is? Maybe it is not?

$$(1/\varepsilon)^{\mathcal{O}(1/\varepsilon)} n \log n \longrightarrow 2^{\mathcal{O}(1/\varepsilon)} n \log n$$

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Theorem: No $2^{o(1/\varepsilon)} \cdot n^{100}$ time algorithm (assuming a widely believed hypothesis).

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Theorem: No $2^{o(1/\varepsilon)} \cdot n^{100}$ time algorithm (assuming a widely believed hypothesis).

The point: This is the final improvement!





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My usual goal: settle the runtime complexity of fundamental problems



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