

$O(\ln n / \ln \ln n)$

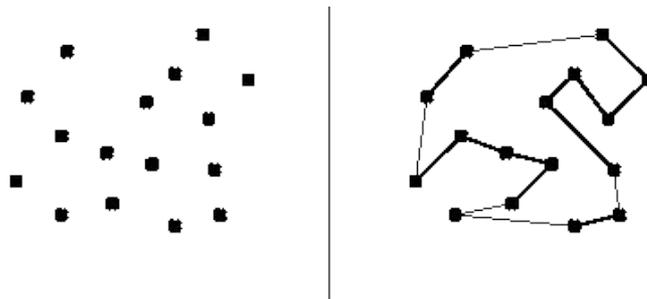
# An $O(\ln n / \ln \ln n)$ -approximation Algorithm for the Asymmetric Traveling Salesman Problem and its Prerequisites

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# Asymmetric Traveling Salesman Problem (ATSP)

- As a Practical Problem



INPUT

OUTPUT

- Formal Definition

Graphs  
MAC0320

*Given a complete digraph  $D = (V, A)$  and a cost  $c \geq 0$  on the arcs, find a minimum cost cycle that traverses each vertex of  $D$  exactly once.*

# How to attack it?

- TSP and ATSP are NP-hard

Algs  
MAC0338

- Moreover, they cannot be approximated unless  $P = NP$
- However, their *metric* versions can (mTSP and mATSP)

- For each  $u, v, w$  in  $V$ , we impose  $c_{uw} \leq c_{uv} + c_{vw}$

- Thus, I will show the approximation algorithm developed by

**(Asadpour et al., 2010)** for the mATSP

Approx  
MAC0450

# Approximation Algorithms

- Optimization Problem of Minimization with  $OPT$ 
  - An algorithm is an  $\alpha$ -approximation algorithm if it returns a candidate whose cost is at most  $\alpha OPT$  where  $\alpha \geq 1$
- Paradigm: Lose optimality, Gain efficiency with guaranteed quality

# Christofides Algorithm and Asadpour et al. Algorithm

**Input:** Graph  $\mathbf{G}$ , metric cost  $c \geq 0$  (mTSP)

1. Find a MST  $\mathbf{T}$  in  $\mathbf{G}$
2. Transform  $\mathbf{T}$  into an Eulerian graph  $\mathbf{G}'$  with a min-cost perfect matching involving vertices of  $\mathbf{T}$  of odd degree
3. Find a closed walk  $\mathbf{W}$  that traverses each edge of  $\mathbf{G}'$  once
4. Shortcut  $\mathbf{W}$

**Input:** Digraph  $\mathbf{D}$ , metric cost  $c \geq 0$  (mATSP)

1. Find opt-sol  $\mathbf{x}^*$  to Held-Karp relaxation of mATSP
2. Find  $\mathbf{T}^*$  that is  $(\alpha, 2)$ -thin tree “wrt”  $\mathbf{x}^*$  with high probability
3. Transform  $\mathbf{T}^*$  into an Eulerian digraph  $\mathbf{D}'$  with a min-cost integer circulation of cost at most  $(2\alpha + 2)\text{OPT}_{\text{HK}}$
4. Find a closed eulerian trail  $\mathbf{W}$  in  $\mathbf{D}'$
5. Shortcut  $\mathbf{W}$

# Find opt-sol $x^*$ to Held-Karp relaxation of mATSP

- Formulate mATSP as an optimization problem involving 0-1 variables and **exponentially many constraints**
- Allow fractional values in  $[0, 1]$  and obtain a **linear optimization program** called Held-Karp relaxation of mATSP
- Equivalence optimization and separation problems helps to solve HK relaxation in polynomial-time
  - Ellipsoid Method
- Reduction to Max-flow Min-Cut and Flow Algorithms

LinProg  
MAC0315

LinAlg  
MAT0122

CombOpt  
MAC0325

# Find $T^*$ that is a $(\alpha, 2)$ -thin tree “wrt” $x^*$ with high probability

- We want a 0-1 vector that represents a spanning tree with a certain structure (thin-tree)
- However, we have a fractional vector  $x^*$
- Rounding
  - Randomized Swap Rounding (RSR) by **(Chekuri et al., 2009)**
- Spanning tree sampled from RSR is  $\alpha$ -thin with high probability.
  - Chernoff Bounds (Concentration Bound) Prob  
MAE0121
  - Result on counting  $\beta$ -minimum cuts due to **(Karger, 1993)**

# Conclusion

- Important breakthrough for an important problem
- Wide and interesting connection of areas
  - Linear Algebra, Graph Theory, Probability Theory, Linear Programming, Combinatorial Optimization, Approximation Algorithms, Analysis of Algorithms

# Bibliography

- Asadpour, A., M. Goemans, A. Madry, S. O. Gharan, and A. Saberi. 2010. “An  $O(\log n / \log \log n)$ -approximation Algorithm for the Asymmetric Traveling Salesman Problem.” *In Proceedings of the Twenty-First ACM-SIAM Symposium on Discrete Algorithms*.
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Thank you!