# A Constant-Factor Approximation Algorithm for the Asymmetric Traveling Salesman Problem

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## Introduction to ATSP

#### What is ATSP?

- The **Traveling Salesman Problem (TSP)** is a well-known problem in which a salesman must visit a set of cities once and return to the starting city, minimizing total travel cost.
- The Asymmetric TSP (ATSP) variation accounts for directional distances, meaning the cost from city A to B may differ from B to A.

#### • Challenges in ATSP:

- **NP-hard**: Like other combinatorial optimization problems, ATSP is NP-hard, making exact solutions infeasible for large inputs.
- **Approximation difficulty**: Without symmetry, prior algorithms could only achieve logarithmic approximation ratios.

## **Problem Statement and Goal**

• **Objective**: Find a polynomial-time algorithm for ATSP that provides a constant-factor approximation.

#### Traditional Approach:

- The **Held-Karp relaxation** is often used as an LP relaxation to find a lower bound on TSP solutions.
- Known integrality gap of at least 2 for ATSP, making constant-factor approximations difficult.

#### Contribution of the Paper:

• This paper achieves a constant-factor approximation for ATSP using a novel approach, specifically through a reduction to Local-Connectivity ATSP and structured instance simplification.

- Definition: ATSP Instance
- Formally, an ATSP instance is defined as a directed graph G=(V,E) where V represents cities and EE contains weighted edges with distances  $w(e)\geq 0$  for all  $e\in E$ .
- Definition: Held-Karp Relaxation
- The **Held-Karp relaxation** (HK) is an LP relaxation for TSP, setting the basis for many approximations by relaxing the requirement for an integer solution:

$$\min \sum_{e \in E} w(e) \cdot x(e)$$

- Subject to:
- $x(\delta+(v)) = x(\delta-(v)) = 1$  for each  $v \in V$ .
- $x(\delta(S)) \ge 2$  for all subsets  $S \subset V$ .
- $x(e) \ge 0$  for all  $e \in E$ .
- This LP provides a **lower bound on tour costs** but cannot guarantee integer solutions. Its integrality gap is critical to approximations in ATSP..

# **Previous Work and Challenges**

- Previous Work and Challenges
- Previous Algorithms:
  - Early solutions for ATSP achieved an approximation factor of (O(log(n))).
  - Asadpour et al. (2010) introduced thin spanning trees for approximations, achieving a  $(O(\log(n)/\log(\log(n))))$  factor.
- Challenges of ATSP:
  - Unlike symmetric TSP, where Christofides' algorithm achieves a 1.5-approximation, **ATSP lacks such straightforward approximations**.
  - The **integrality gap** of the Held-Karp relaxation is bounded below by 2, making constant approximations elusive.

# Main Contributions of the Paper

- This paper's main contributions are:
- Constant-Factor Approximation: The authors provide the first constant-factor approximation for ATSP.
- Structured Reductions:
  - Reduce ATSP to simpler cases, like laminarly-weighted instances.
- Local-Connectivity ATSP:
  - Simplifies ATSP by introducing a framework to handle local subtours across defined partitions of vertices.

# Core Methodology Overview

- Methodology:
- Held-Karp LP Relaxation: Solves ATSP by obtaining a lower bound.
- Laminarly-Weighted Instances: Reduces complex graphs into simpler structures.
- Recursive Reduction:
  - The reduction is recursive, starting from general cases to **irreducible instances** and finally to **vertebrate pairs**.

## Core Definitions and Reductions

- Definition: Laminar Family of Sets
- A **laminar family** ( $\{L\}$ ) is a collection of subsets such that for any two sets  $A,B\in L$ , either  $A\cap B=\emptyset$ ,  $A\subseteq B$ , or  $B\subseteq A$ .
- Reduction to Laminarly-Weighted Instances:
- Instances where weights on edges can be represented using a laminar family of sets, making the problem more tractable.
- Reduction Process:
- Held-Karp LP → Laminarly-Weighted Instances → Irreducible Instances → Vertebrate Pairs.

# Theorem on Constant-Factor Approximation

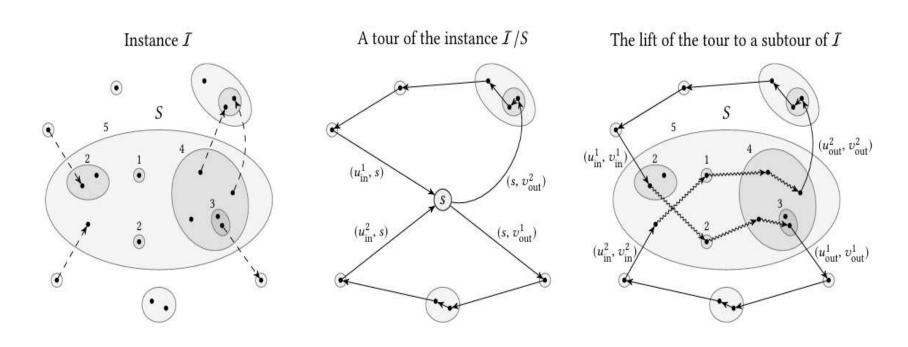
• **Theorem 1**: There exists a polynomial-time algorithm for ATSP that produces a solution with a weight within a constant factor of the Held-Karp lower bound.

#### Proof Outline:

- By recursively reducing the ATSP instance to vertebrate pairs, each sub-instance maintains a bounded approximation ratio.
- Finally, the solution to the vertebrate pair approximates the original ATSP instance within a constant factor.

## Reduction to Irreducible Instances

- Irreducible Instances: Instances where no further reduction is possible without losing essential connectivity.
- **Key Property**: Irreducible instances provide a bounded cost reduction, simplifying approximations.



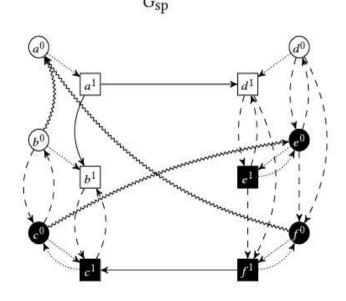
# Vertebrate Pairs and Backbone Structure

- Definition: Vertebrate Pair:
  - A structured instance with a **backbone path** crossing all critical subsets.
- Use in Approximation:
  - Allows the algorithm to maintain connectivity across key points with manageable subtours.

## **Local-Connectivity ATSP**

- Definition: Local-Connectivity ATSP
- Finds subtours that only need to connect specific vertex sets.
- Algorithm:
- Ensures each subtour is an **Eulerian edge set**, which collectively approximate the full tour in ATSP.

$$G$$
 and  $\mathcal{L}_{\geq 2} = \{S_1, S_2, S_3\}$ 



# Results and Implications

#### • Results:

- · Constant-factor approximation achieved for ATSP.
- Bounded the integrality gap of Held-Karp to a constant for ATSP.

#### • Implications:

• This technique can apply to other directed graph problems, paving the way for constant approximations in asymmetric routing.

## Conclusion and Future Work

• **Conclusion**: This work demonstrates the first constantfactor approximation algorithm for ATSP, addressing a major open problem in approximation algorithms.

#### Future Directions:

- Optimizing the constant factor further.
- Applying similar reductions to related NP-hard problems, such as **bottleneck ATSP**.

### References

- Primary Paper: Svensson, Tarnawski, Végh. A Constant-Factor Approximation Algorithm for the Asymmetric Traveling Salesman Problem. STOC 2018.
- Additional sources on ATSP approximations.