### PTAS for Euclidean TSP Sanjeev Arora

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- Traveling Salesman Problem
- Variants
- PTAS for Euclidean TSP

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  - Intuition
  - Algorithm



Introduction

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### **Classical Formulation**

#### Traveling Salesman Problem

Given List of cities with pairwise distances.

Required Shortest possible tour visiting each city only once.

#### Example

TSP Tour through Germany's 15 largest cities, shortest among 43589145600 routes. Introduction

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Figure: TSP German Cities

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### Graph based Formulation

#### TSP as Undirected Graph

Given An undirected Graph G = (V, E, W)where V set of vertices, E set of edges and  $W : E \to \mathbb{R}$  is cost function Required Most cost effective path visiting every vertex only once.

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Figure: Graph based Representation

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### Variants

### Asymmetric TSP

• Directed Graph •  $|\overrightarrow{AB}| \neq |\overrightarrow{BA}|$ 

#### Metric TSP

 Metric based cost function
 triangle inequality for Edges i.e. AB + BC > AC

#### Euclidean TSP

- Special case of Metric TSP
- Euclidean distance (i.e. l<sub>2</sub>norm) as cost function.

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Traveling Salesman Problem Variants PTAS for Euclidean TSP

### Variants

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Introduction

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### PTAS for Eulcidean TSP

- Euclidean TSP
- PTAS solution from Arora et. al.
- $O\left(n\left(\log n\right)^{O(c)}\right)$  run time
- (1+1/c)-approximation
- c > 1



Figure: Euclidean TSP

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### Motivation

- A very large class of problem can be modeled as TSP
- Genome Sequence Assembly to assemble DNA fragments.
- Software Testing to ensure coverage of all use cases.
- Transportation & logistics
- PCB design
- One of the most challenging problems

Problem Description Intuition Algorithm

### Problem Description

- $\mathbb{R}^d$  space
- *n*points as vertices.
- Complete Graph i.e. n(n-1)/2edge
- Euclidean distance  $l_2$ norm =  $\left(\sum_{i=1}^d (x_i y_i)\right)^{1/2}$
- For simplicity we will consider the case for d=2 i.e  $\mathbb{R}^2$
- can be extended to higher dimensions.
- points will be represented using x and y coordinates.

Problem Description Intuition Algorithm

# Bounding Box

- n points in a plane.
- Consider the smallest square that can enclose all the points
- Let *L* be the length of each edge of the bounding box.
- lower bound on  $OPT \ge L$



Figure: Bounding Box

Problem Description Intuition Algorithm

### Geometric Partitioning

- Partition the problem space
- Each Partition will contain single point
- Use Recursive Geometric Partitioning
- Start with bounding box,
- Let it call *level* 0
- Recursively Partition each resulting four square.
- Continue till only one point per square.
- Create a Quad-tree structure



Figure: Partitioning



Figure: Quad Tree

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Problem Description Intuition Algorithm

# Transformation

- Make problem instance well rounded.
  - Integral Coordinates
  - Minimum nonzero internode Distance is 8
  - Max. internode Distance is O(n)
- Make a Grid
- Set Granularity =L/8nc
- Move node to the gridpoint
- Transformation Error  $\leq OPT/4c$



Figure: Transformation

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Problem Description Intuition Algorithm

### Portals

- Limit the possible paths to few fixed path.
- Can be thought of as bending the path
- Restrict the tour to only cross the edge of square at some predefined points '*Portals*'
- Each square would have m 1 portals on each edge
- Each corner will also be a portal.
- Total portals = 4m



Figure: Portals

Problem Description Intuition Algorithm

# Patching Lemma

- Consider set of paths crossing a line at more than three times through some portals.
- It can be patched to cross the line at most twice.
- These results are known as patching lemma.
- It requires that portals must be paired together.
- Which one should we choose?



Figure: Patching

Problem Description Intuition Algorithm

### MultiPath Problem

- A team of salesmen have to visit a set of clients.
- Each client has to be visited by some salesman
- Each path should start and end at some portal.
- Use Dynamic Programming
- Construct look up Table bottom up. i.e. smallest square first.
- Entry for the bounding box will give the resultant cost of the path.
- Back track to get the path.

Problem Description Intuition Algorithm

# Partitioning Revisited

• What if no suitable path can be found?

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- Shift squares , so nodes will have different set of portals.
- Randomly select integers a, b such that  $0 \leq a, b < L$
- Shift vertical line x to x + a mod L and horizontal y to y + b mod L
- Wrap around



**Figure:** Initial



Figure: Shifted

PTAS for Euclidean TSP

Problem Description Intuition Algorithm

### Putting it together!

Step 1 Transform Problem Instance - requires  $O(n \log n)$ Step 2 Construct Shifted Quad tree - requires  $O(n \log^2 n)$ 

- Bounding Box Size L = O(n)
- Depth of Partitioning=O(log n)
- No. of Squares  $T = O(n \log n)$

Step 3 Dynamic Programming - requires  

$$O\left(T\left(m+4\right)^{8r}\left(4r\right)^{4r}\left(4r!\right)^{2}\right) = O\left(n\left(\log n\right)^{O(c)}\right)$$

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# Conclusion

- Structure Theoreme , with a, b choosen randomly, there is 1/2 probability of finding (1+1/c)- approximate solution , for some c>1
- $O\left(n\left(\log n\right)^{O(c)}\right)$  time solution for Euclidean TSP in  $\mathbb{R}^2$

• 
$$O\left(n\left(\log n\right)^{\left(O\left(\sqrt{dc}\right)\right)^{d-1}}\right)$$
 time solution for Euclidean TSP in  $\mathbb{R}^{d}$ 

- Similar schemes can be applied to other NP-hard Euclidean problems:
  - Minimum Steiner Tree
  - k-TSP
  - k-MST

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### Thank You

#### Thankyou!

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