

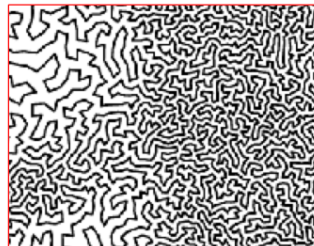
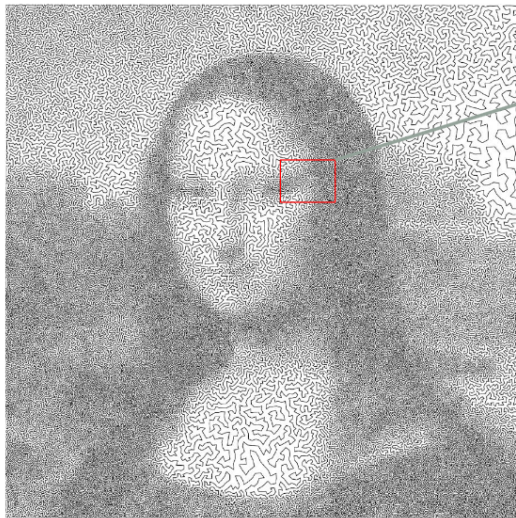
# Traveling Salesman Problem (TSP)

- TSP introduction
- NP-hardness
- Approximation algorithm

# Traveling Salesman Problem

- Given a set of cities along with the cost of travel between them, find the cheapest route visiting all cities and returning to starting city
- Given a complete graph  $G = (V, E)$  with integer cost  $c(u, v)$  for each edge  $(u, v)$ , find a min-cost H cycle
- Metric TSP: costs satisfy triangle inequality:  $c(u, w) \leq c(u, v) + c(v, w)$
- Euclidean TSP: cities are points in the Euclidean space, costs are distances

# Mona Lisa TSP



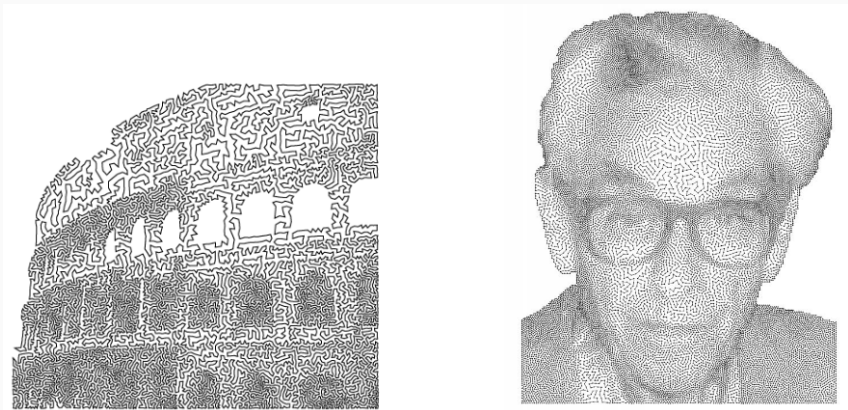
The current best known results for the Mona Lisa TSP are:

Tour: 5,757,191  
Lower Bound: 5,757,084  
Gap: 107 (0.0019%)

\$1,000 prize to the first person to find a tour shorter than 5,757,191.

Source:  
<http://www.math.uwaterloo.ca/tsp/data/ml/monalisa.html>

# Mona Lisa TSP



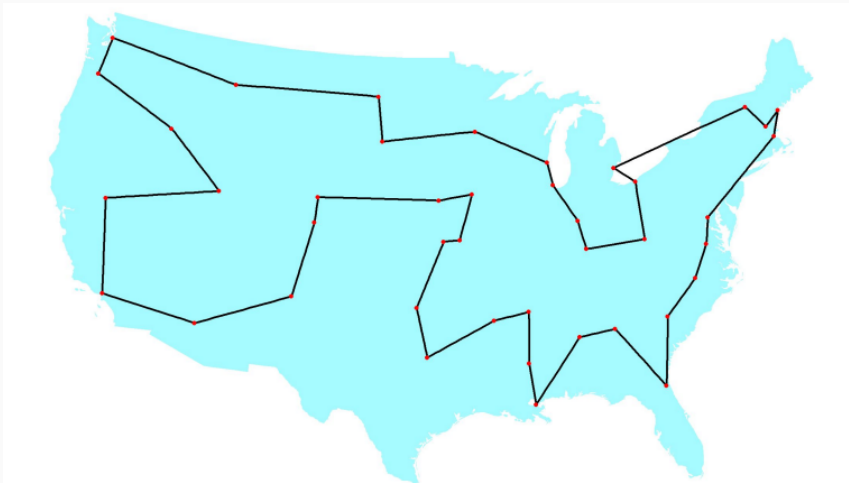
# TSP variants

TSP	Metric ( $\Delta$ -inequality)	Non-metric
Symmetric	<p>1.5-approx.</p>	<p>No <math>\alpha</math>-approx.</p>
Asymmetric	<p><math>O(\log n)</math>-approx.</p>	<p>No <math>\alpha</math>-approx.</p>

There is a PTAS for the Euclidean TSP

# History of TSP

- Dantzig, Fulkerson and Johnson found an optimal tour through 42 cities



[http://www.math.uwaterloo.ca/tsp/history/img/dantzig\\_big.html](http://www.math.uwaterloo.ca/tsp/history/img/dantzig_big.html)

## DFJ solution

- Create a linear program: variable  $x(u, v) = 1$  iff tour goes between  $u, v$
- Solve the LP
- If the solution is integral and forms a tour, done
- Otherwise, find a new constraint to add (cutting plane)

# Hardness of TSP

## Theorem

$\forall \rho > 1$  finding a  $\rho$ -optimal TSP tour is NP-hard

## Proof

Idea: reduce Hamiltonian Cycle problem to  $\rho$ -TSP

- Let  $G = (V, E)$  be an instance of the hamiltonian-cycle problem
- Let  $G' = (V, E')$  be a complete graph with costs  $c_e = 1$  if  $e \in E$ ,  
 $c_e = \rho|V| + 1$  otherwise
- If  $G$  has a H-cycle, then  $G'$  contains a tour of cost  $|V|$
- Otherwise, any tour  $T$  must use some edge  $\notin E$
- $c(T) \geq (\rho|V| + 1) + (|V| - 1) = (\rho + 1)|V| > \rho|V|$
- $\rho$ -optimal TSP tour in  $G'$  computes H-cycle in  $G$  (if one exists)



# Metric TSP: algorithm

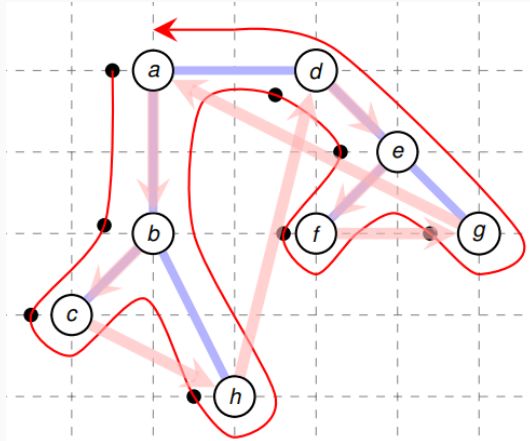
Idea: compute an min spanning tree (MST), create a tour based on it

APPROX-TSP-TOUR( $G, c$ )

- 1 select a vertex  $r \in G.V$  to be a “root” vertex
- 2 compute a minimum spanning tree  $T$  for  $G$  from root  $r$   
using MST-PRIM( $G, c, r$ )
- 3 let  $H$  be a list of vertices, ordered according to when they are first visited  
in a preorder tree walk of  $T$
- 4 **return** the hamiltonian cycle  $H$

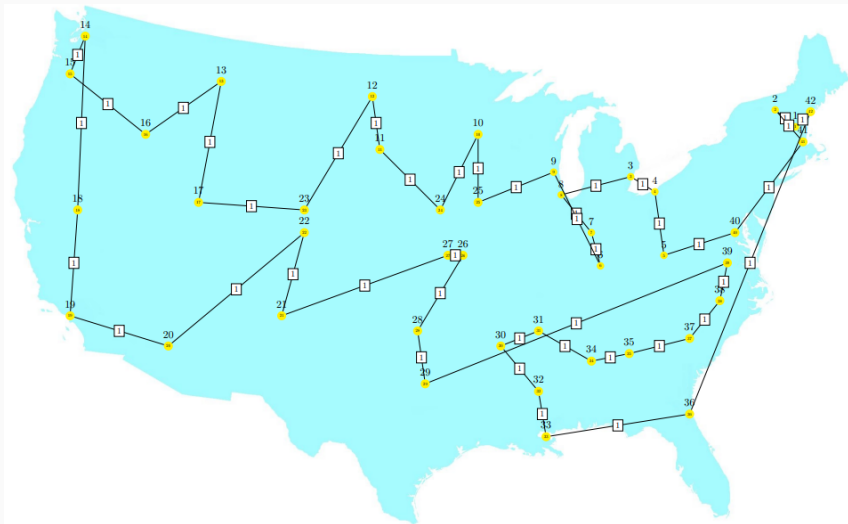
# Metric TSP: algorithm

- Compute MST
- Perform preorder walk on MST
- Return list of vertices according to the preorder tree walk



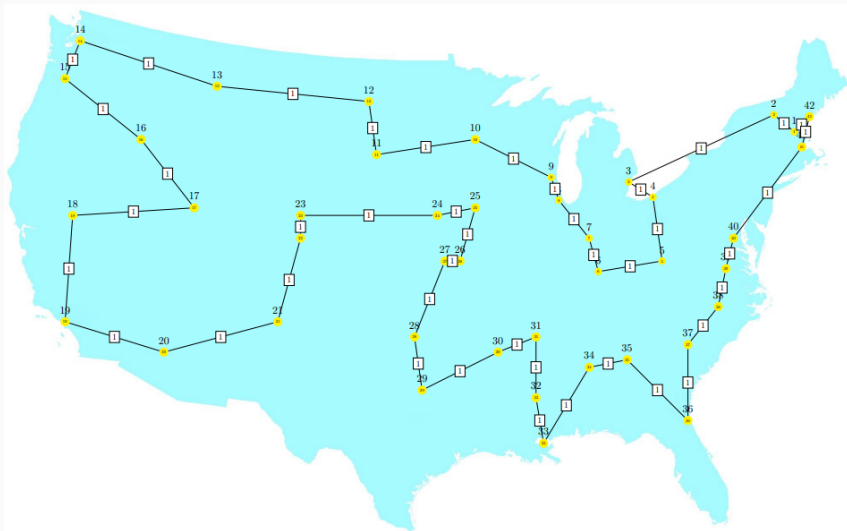
## Practical performance

Cost=921, min-cost=699



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Cost=921, min-cost=699



# Proof of the Approximation Ratio

## theorem

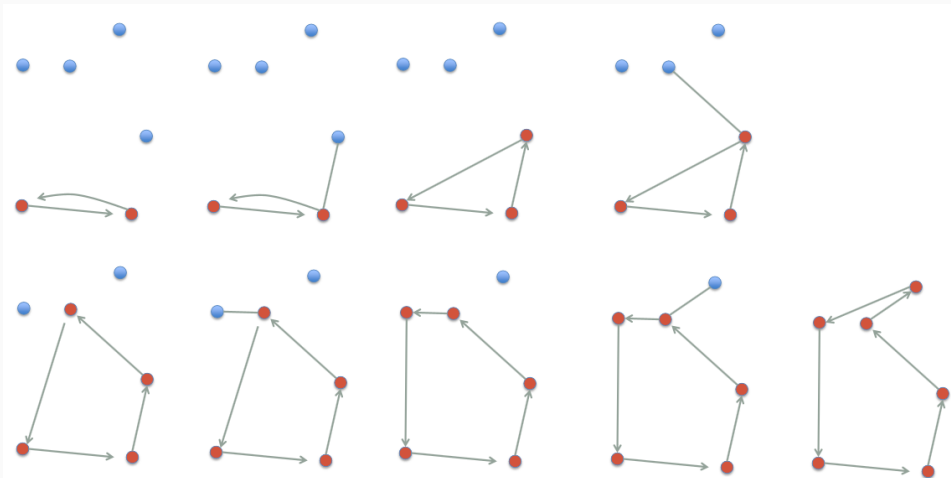
The algorithm produces a 2-optimal TSP tour for metric TSP

## proof

- Consider the optimal tour  $H^*$  and remove an arbitrary edge
- yields a spanning tree  $T$ :  $c(T) \leq c(H^*)$
- Let  $W$  be the walk of  $T_{min}$ :  $c(W) \leq 2c(T_{min}) \leq 2c(T) \leq 2c(H^*)$
- Deleting duplicate vertices from  $W$  yields a tour  $H$  with smaller cost, by triangle inequality:  $c(H) \leq c(W) \leq 2c(H^*)$

# Another algorithm: nearest neighbor

- Start with any vertex
- Keep adding the nearest vertex



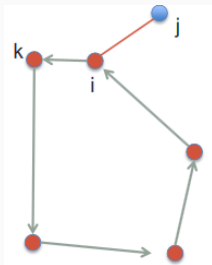
# Nearest neighbor: approximation ratio

## theorem

The algorithm produces a 2-optimal TSP tour

## proof

- By triangle inequality:  $c_{jk} \leq c_{ji} + c_{ik}$ , hence  $c_{jk} - c_{ik} \leq c_{ji}$
- Cost in this step:  $c_{ij} + c_{jk} - c_{ik} \leq 2c_{ij}$
- Total cost  $\leq 2\text{cost}(\text{MST}) \leq 2\text{OPT}$



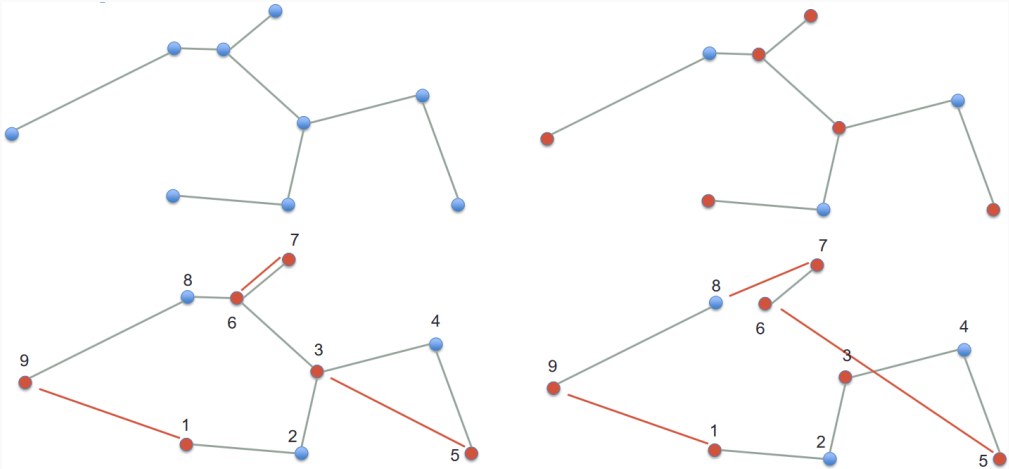
# Algorithm with a better approximation ratio

## Christofides algorithm

- Find an MST  $T$
- Find a minimum matching  $M$  for the odd-degree vertices in  $T$
- Add  $M$  to  $T$
- Find an Euler tour
- Cut short



# Christofides algorithm



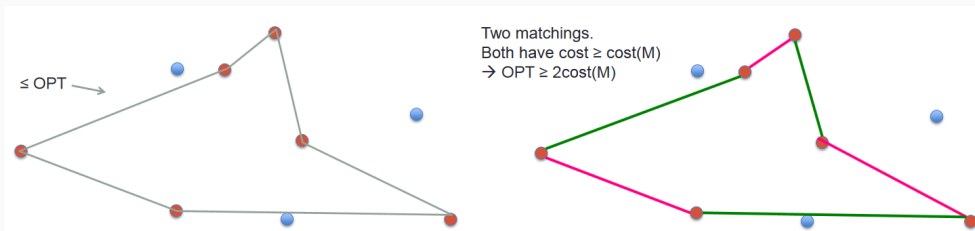
# Christofides algorithm: approximation ratio

## Theorem

Christofides algorithm produces a 1.5-optimal TSP tour

## Proof

- $c(T) < OPT$ , we only need to prove  $c(M) \leq OPT/2$



ALGORITHMS

## Computer Scientists Break Traveling Salesperson Record

22 |

*After 44 years, there's finally a better way to find approximate solutions to the notoriously difficult traveling salesperson problem.*

Now Karlin, Klein and Oveis Gharan have proved that an algorithm devised a decade ago beats Christofides' 50% factor, though they were only able to subtract 0.2 billionth of a trillionth of a trillionth of a percent. Yet this minuscule improvement breaks through both a theoretical logjam and a psychological one. Researchers hope that it will open the floodgates to further improvements.



Nathan Klein (left), a graduate student at the University of Washington, and his advisers, Anna Karlin and Shayan Oveis Gharan.

—  
Flora Holtefeld, from "Embracing Frustration," with permission from Microsoft, courtesy of Shayan Gharan.

"This is a result I have wanted all my career," said [David Williamson](#) of Cornell University, who has been studying the traveling salesperson problem since the 1980s.

Christos Papadimitriou: The TSP is not a problem. It's an addiction.

# Excercise

Solve the multiple-salesmen variant of TSP