

# Arora's PTAS for Euclidean TSP

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# Introduction

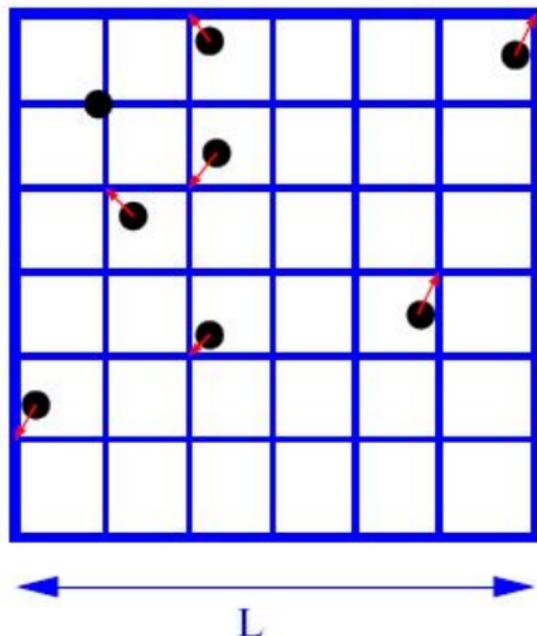
- Traveling Salesman Problem NP-complete
  - Hard to approximate.
- Metric TSP
  - Edge costs satisfy triangle inequality.
  - Factor 2 approximation algorithm in  $O(m + n \log n)$ .
  - Factor  $3/2$  approximation algorithm in  $O(n^3)$ .
- Euclidean TSP
  - Special case of Metric TSP.
  - Euclidean distance as cost function.
- Objective: Present a PTAS for Euclidean TSP.

# Instance I

- 1 Consider  $n$  points in  $\mathbb{R}^d$ .
- 2 The graph is complete.
- 3 Euclidean distance  $\text{dist}(\mathbf{x}, \mathbf{y}) = \left( \sum_{i=1}^d (x_i - y_i)^2 \right)^{1/2}$ .
- 4 We consider the case  $d = 2$ , i.e.  $n$  points in the plane.
  - Most of it applies to the general case with slight modifications.

# Transform $I$ to $I'$

- Consider the smallest square that encloses all  $n$  points.
  - At least two nodes are on opposite edges of the square.
  - $OPT \geq 2L$ .
- Set the length of each edge of the square to  $L = 4n^2$ .
  - Just a scale factor, so optimal tour is invariant
- Consider  $n$  to be a power of 2, so  $L$  is a power of 2 also, i.e.  $L = 2^k$ .
  - $k = 2 + 2 \log n = O(\log n)$ .
- Relocate every node of  $G$  to the nearest gridpoint.

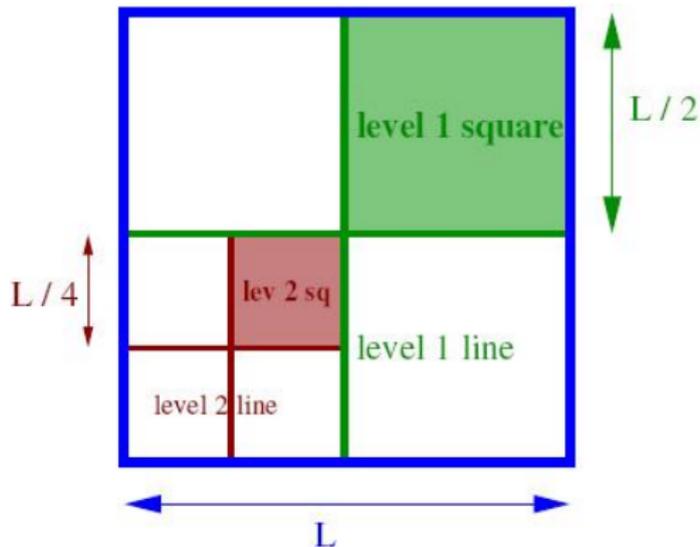


# Solving $I'$ is enough

- Maximum distance from arbitrary point to the nearest grid point is  $\sqrt{2}/2$ .
- Absolute error per node is  $\sqrt{2}$ , i.e. total absolute error  $n\sqrt{2}$ .
- $$\frac{|SOL - OPT|}{OPT} \leq \frac{n\sqrt{2}}{2L} = \frac{n\sqrt{2}}{8n^2} = \frac{1}{4\sqrt{2}n}.$$
- Thus, given a  $(1 + \epsilon)$ -solution to  $I'$ , the corresponding solution to  $I$  is  $(1 + \epsilon + \frac{1}{4\sqrt{2}n})$ -approximate.
  - For sufficiently large  $n$  we can adjust  $\epsilon$  to compensate for the relative error.

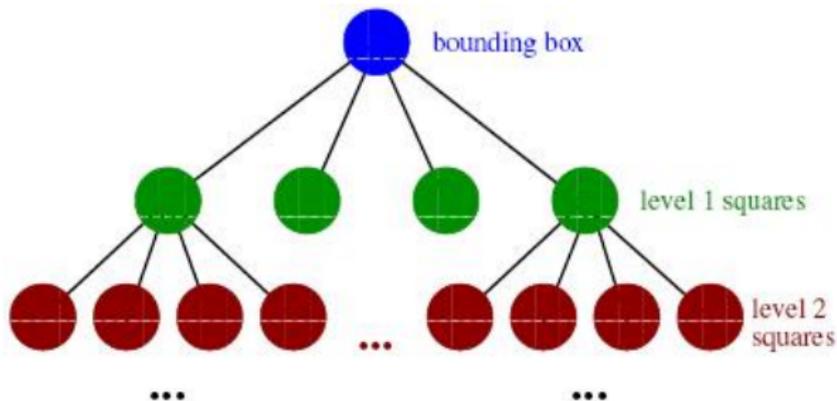
# Basic dissection

- Partition the square with two lines into 4-sub-squares.
- Recursively partition the resulting squares until unit squares are obtained.
- A level  $i$  square has size  $L/2^i \times L/2^i$ .



# Basic dissection

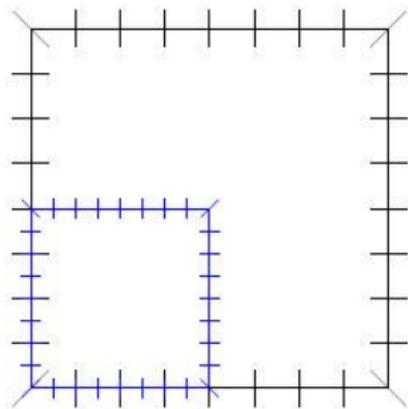
- Basic dissection can be seen as a 4-ary tree with depth  $k$ .



- Number of nodes  
 $1 + 4 + \dots + 4^k = O(4^{k+1}) = O(4^{2+2\log n}) = O(n^4)$ .

# Portals

- Restrict the tour to intersect the level lines at certain points (*portals*).
- Each square has one portal for each corner and  $m - 1$  portals for each edge, i.e. all in all  $4m$  portals for each square.

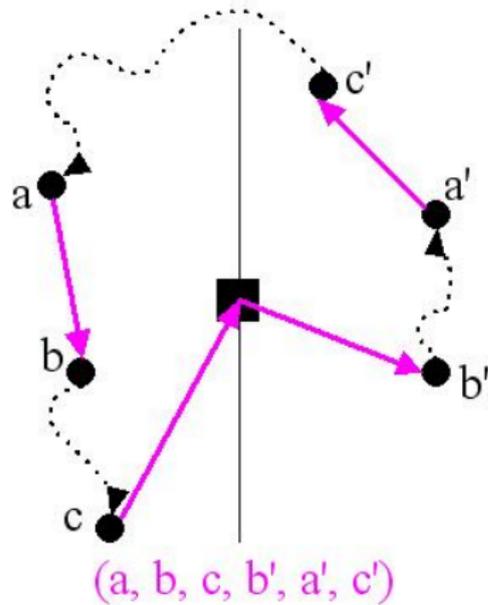
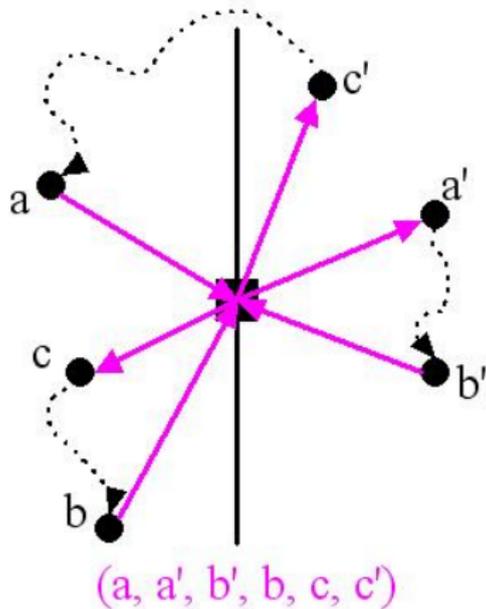


- Choose  $m$  a power of 2 in the interval  $\left[\frac{k}{\epsilon}, \frac{2k}{\epsilon}\right]$ .
- Level  $i$  portals are also level  $i + 1$  portals.

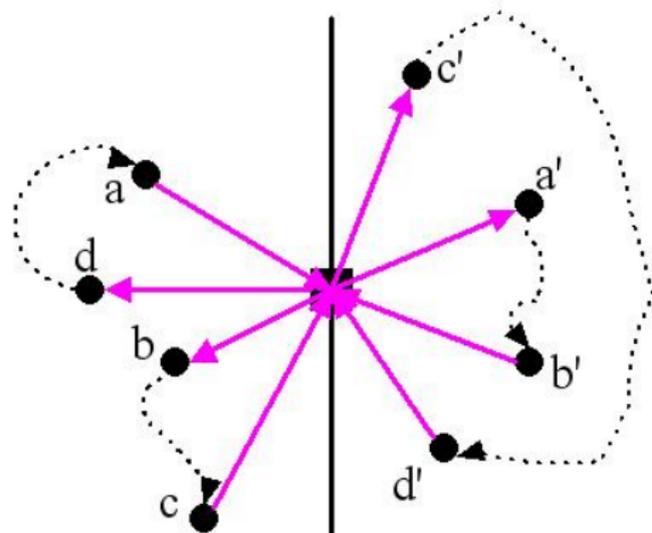
# Well-behaved tours

- 1 A tour is *well-behaved* if it is a tour on the  $n$  points and any subset of the portals.
- 2 A tour is *well-behaved with limited crossings* if it is a well-behaved tour and visits each portal at most twice.
- 3 Claim: Any well-behaved tour can be transformed to a well-behaved tour with limited crossings without increasing its length.
- 4 Thus, it suffices (??) to search for well-behaved with limited crossings tours.
  - No guarantee though that a well-behaved tour is actually close enough to the optimum. In fact, there are counterexamples that prove the contrary.
  - This difficulty will be treated later.

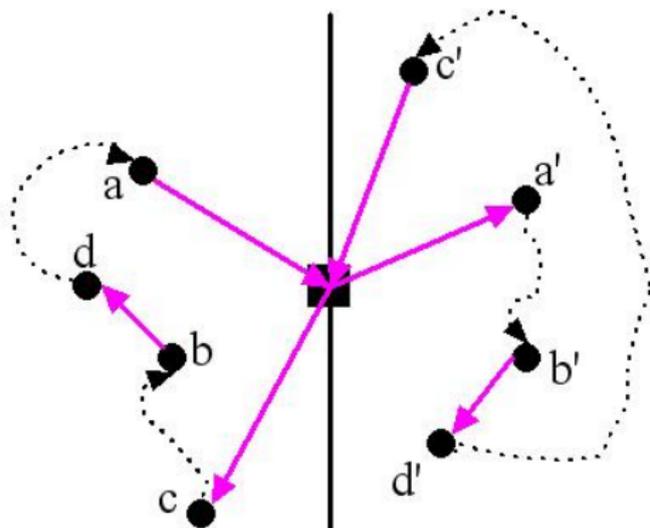
# Making crossings $\leq 2$ : Odd number of crossings



# Making crossings $\leq 2$ : Even number of crossings



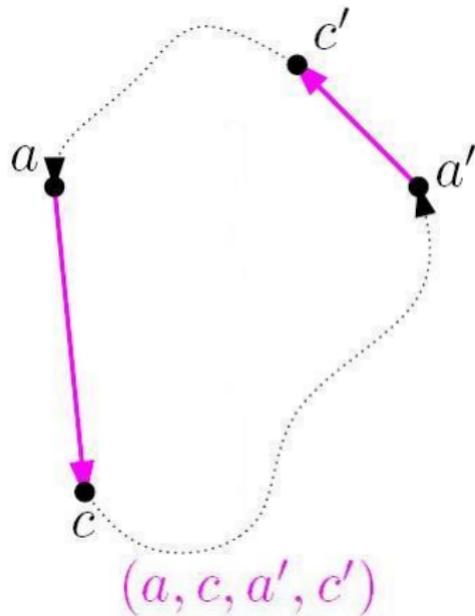
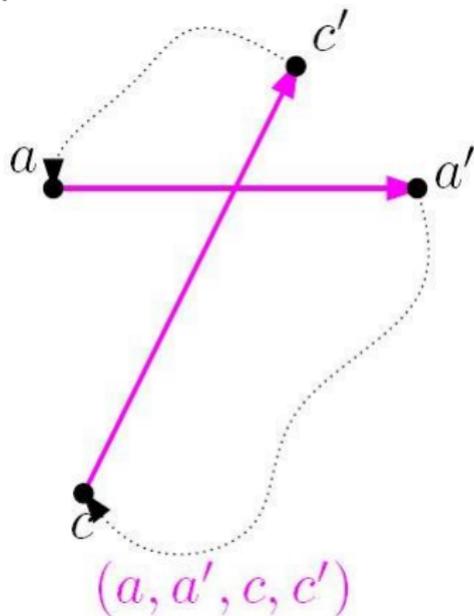
(a, a', b', b, c, c', d', d)



(a, a', b', d', c', c, b, d)

# Eliminating an intersection

We further restrict the tour to not intersect itself apart possibly a portal.



Triangle inequality guarantees that we haven't increased the length of the tour.

# New objectives

We need to:

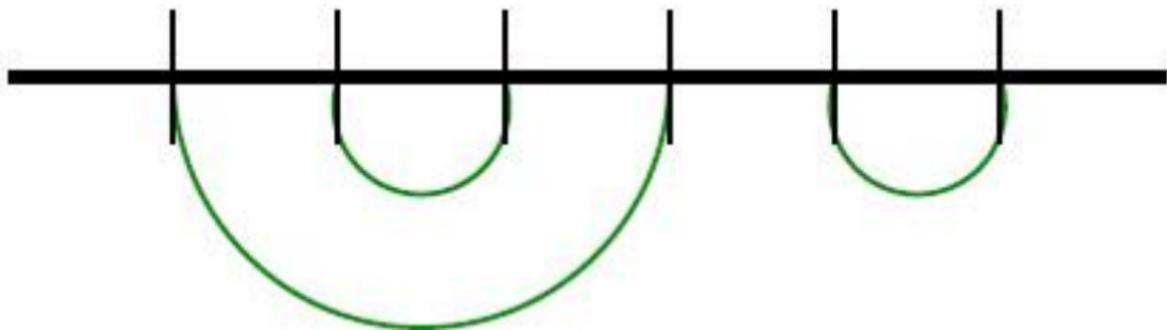
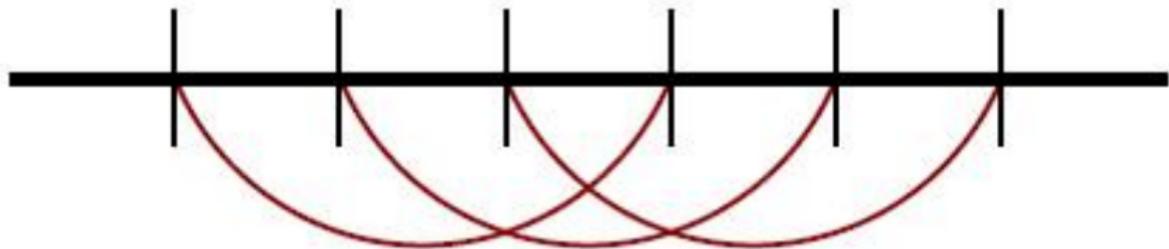
- 1 Find an optimal well-behaved tour with limited crossings.
- 2 Prove that this optimal tour is short enough.

We will use dynamic programming to fulfill the first goal.

# Dynamic Programming

- We look only for tours with limited crossings, i.e. each portal can be used 0, 1 or 2 times.
- $4m$  portals in total for each square, thus  $3^{4m} = 2^{4m \log 3} = 2^{4k \log 3/\epsilon} = n^{O(1/\epsilon)}$  possibilities for each square.
- Once we have selected the portals, not every possible pairing is allowed because no self-intersection is allowed.

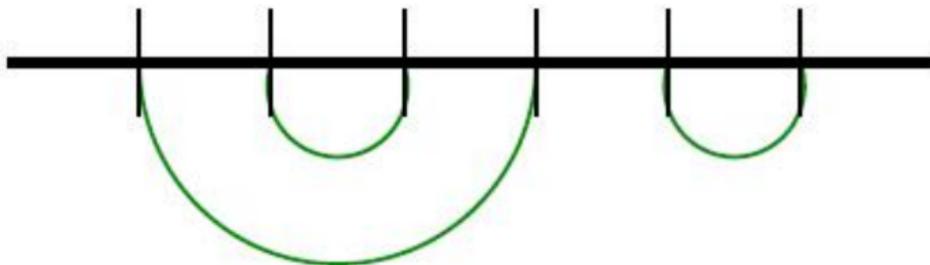
# Valid pairings





# Counting valid pairings

- There is a bijection between valid pairings with  $2r$  portals and balanced arrangement of  $2r$  parentheses.
- $(( ))()$



- The latter is the  $r$ -th Catalan number,  $C_r = \frac{1}{r+1} \binom{2r}{r} < 2^{2r}$ .
- Each visit on the portals of a square uses at most  $8m$  portals, thus the number of valid pairings is at most

$$2^{8m} = 2^{8k/\epsilon} = n^{O(1/\epsilon)}.$$

# Putting it together

- $n^{O(1/\epsilon)}$  possibilities of portal usage.
- $n^{O(1/\epsilon)}$  valid pairings for each portal usage.
- Total number of valid visits :  $n^{O(1/\epsilon)} \cdot n^{O(1/\epsilon)} = n^{O(1/\epsilon)}$ .

# Dynamic Programming

minimum costs	level 0	level 1				...
	square 1	square 1	square 2	square 3	square 4	...
valid visit 1						
valid visit 2						
valid visit 3						
⋮						

#columns = #nodes in 4-ary tree =  $O(n^4)$ .

#rows = #valid visits =  $n^{O(1/\epsilon)}$ .

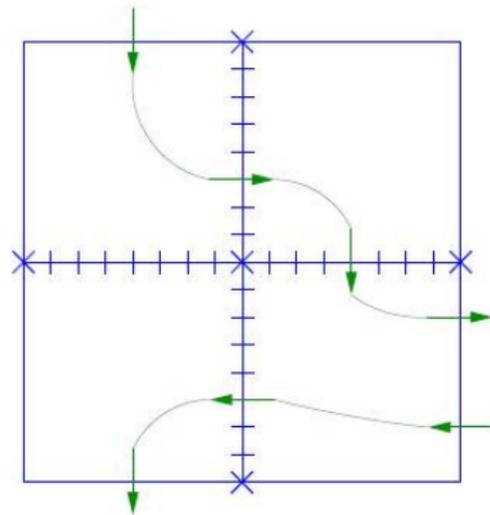
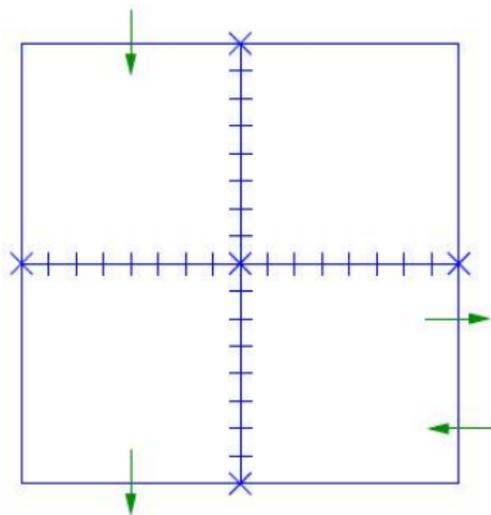
#entries =  $n^{O(1/\epsilon)} \cdot n^{O(1/\epsilon)} = n^{O(1/\epsilon)}$ .

# Dynamic Programming

minimum costs	level 0	level 1				...
	square 1	square 1	square 2	square 3	square 4	...
valid visit 1						
valid visit 2						
valid visit 3						
⋮						

- 1 Start at the leaves of the tree.
- 2 Use the results of the four children squares to compute the visits of the corresponding parent square.

# Dynamic Programming - Cost per entry



- $4m + 1$  internal portals, thus  $3^{4m+1} = n^{O(1/\epsilon)}$  possible portal usage.
- Using again Catalan numbers, we obtain at most  $2^{8m+2} = n^{O(1/\epsilon)}$  valid pairings.
- In total, we have  $n^{O(1/\epsilon)}$  configurations to consider.

## Dynamic Programming - Cost per entry

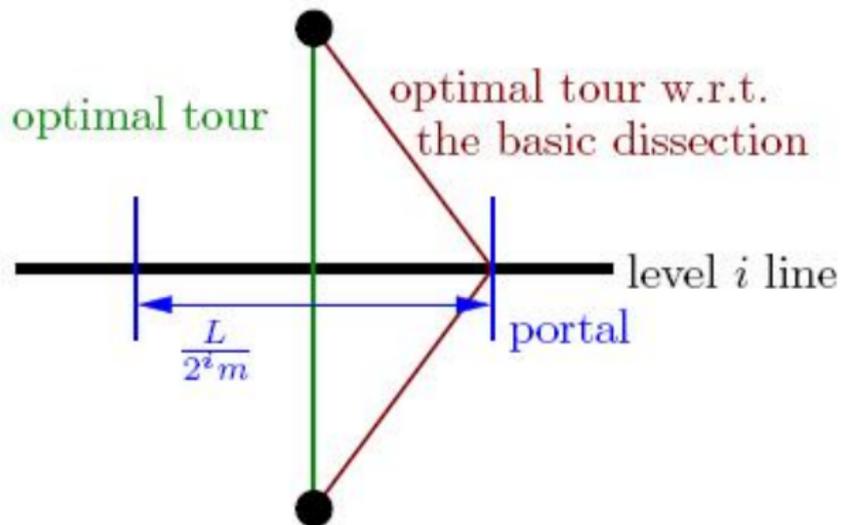
minimum costs	level 0	level 1				...
	square 1	square 1	square 2	square 3	square 4	...
valid visit 1						
valid visit 2						
valid visit 3						
⋮						

- Sum the corresponding lengths of the appropriate visits of the children squares and find the minimum.
- Total cost =  $\# \text{entries} \cdot n^{O(1/\epsilon)} = n^{O(1/\epsilon)} \cdot n^{O(1/\epsilon)} = n^{O(1/\epsilon)}$ .

# Losses

- We have computed the optimal well-behaved tour. Is it short enough?
- NO!

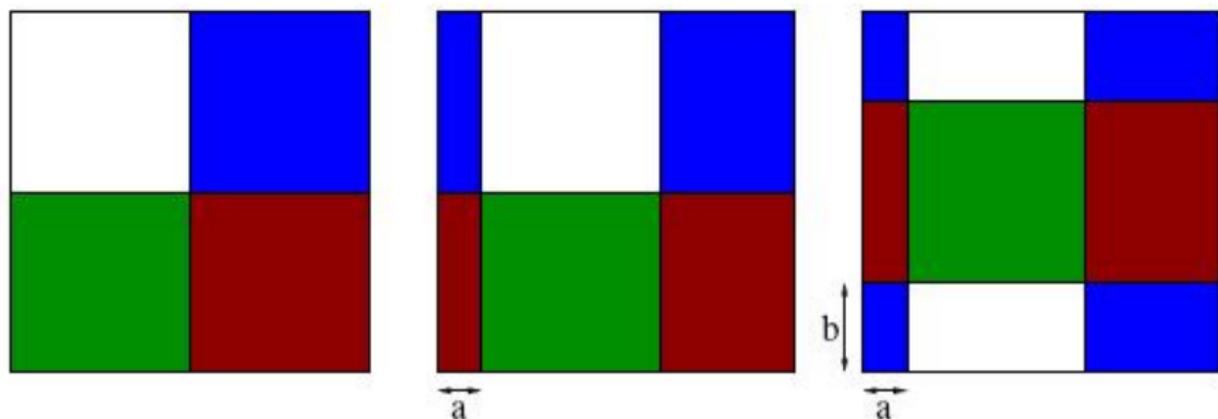
# Why not?





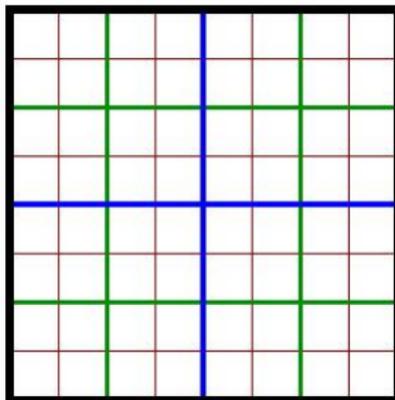
# Shifted dissection

Choose randomly integers  $a, b$  such that  $0 \leq a, b < L$  and shift each vertical line  $x$  to  $x + a \pmod L$  and each horizontal line  $y$  to  $y + b \pmod L$ .



This way any specific line has random level.

# Shifted dissection



- 1  $2^1$  level 1 lines,  $2^2$  level 2 lines,  $\dots$ ,  $2^k$  level  $k$  lines.
- 2 #lines =  $2^{k+1} - 1$ .
- 3 Probability that a randomly chosen line has level  $i$  is

$$p(i) = \frac{2^i}{2^{k+1} - 1} = \frac{2^i}{2L - 2} \leq \frac{2^i}{L}.$$

# Expected value of indirection

- ① Maximum indirection when a level  $i$  line is crossed is

$$x(i) = \frac{L}{2^i m}$$

- ② Expected value of indirection when a random line is crossed is

$$E(X) = \sum_{i=1}^k p(i)x(i) \leq \sum_{i=1}^k \frac{2^i}{L} \cdot \frac{L}{2^i m} = \frac{k}{m} \leq \epsilon$$

## Expected value of total indirection

- 1 In order to find the expected value of total indirection we need to bound the number of crossings.
- 2 Let  $\tau$  an optimal tour and let  $N(\tau)$  the total number of crossings (both vertical and horizontal). Then

$$N(\tau) \leq \sqrt{2} \cdot OPT$$

- 3 If  $Y$  is the total indirection

$$E(Y) = N(\tau) \cdot E(X) \leq \sqrt{2} \cdot OPT \cdot \epsilon$$

- 4 Markov inequality implies

$$\Pr[Y \geq 2\sqrt{2}\epsilon \cdot OPT] \leq \frac{E(Y)}{2\sqrt{2}\epsilon \cdot OPT} \leq \frac{1}{2}$$

# Error Bound

- 1 From the preceding, the probability that the error bound exceeds  $2\sqrt{2}\epsilon$  is less than  $1/2$ . The  $2\sqrt{2}$  constant can be tackled with a suitably chosen  $\epsilon'$  ( $2\sqrt{2}\epsilon' = \epsilon$ ).
- 2 The algorithm can be derandomized by checking all the  $O(L^2) = O(n^4)$  possibilities for  $a, b$ .

# Proving $N(\tau) \leq \sqrt{2} \cdot OPT$

- Number of crossings equals the perimeter of the square (red line).
- $c^2 = a^2 + b^2$ .
- $a^2 + b^2 \geq (a + b)^2/2$ .
- $c\sqrt{2} \geq (a + b)$ .
- Adding up we obtain the desired result.

