# Approximation Algorithms

Lecture 9:

An Approximation Scheme for EuclideanTSP

Part I:

TravelingSalesmanProblem

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Given: A set of *n* houses (points) in  $\mathbb{R}^2$ .

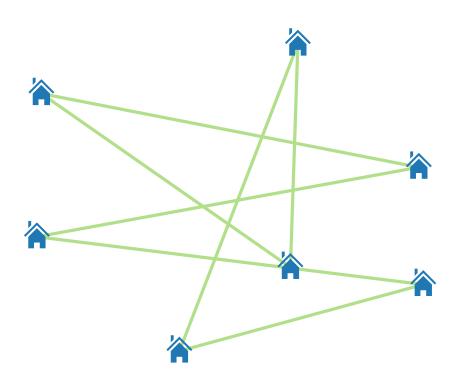


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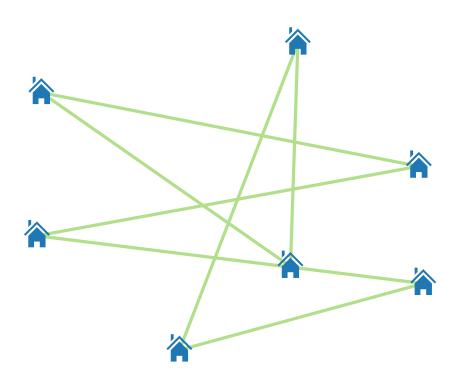


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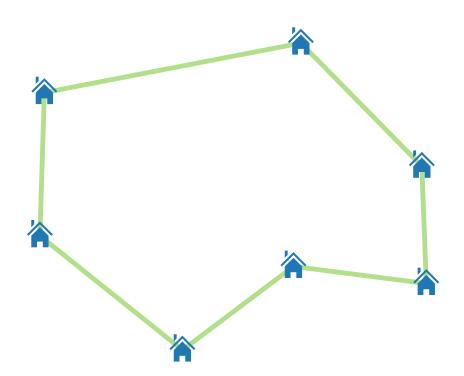


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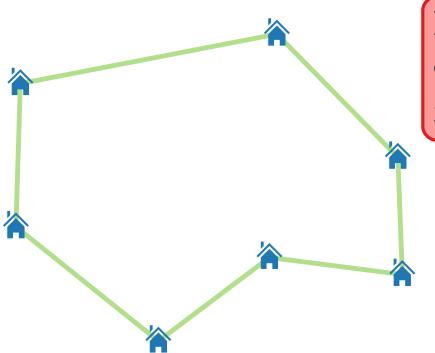


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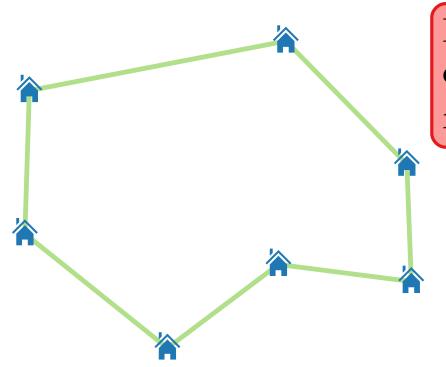
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For every polynomial p(n), TSP cannot be approximated within factor  $2^{p(n)}$  (unless P=NP).

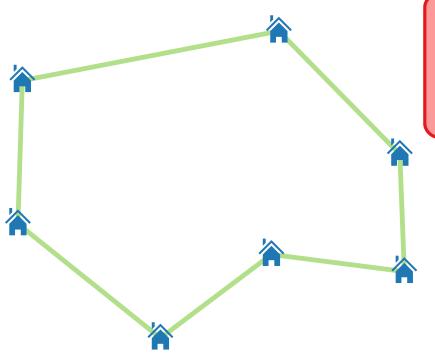
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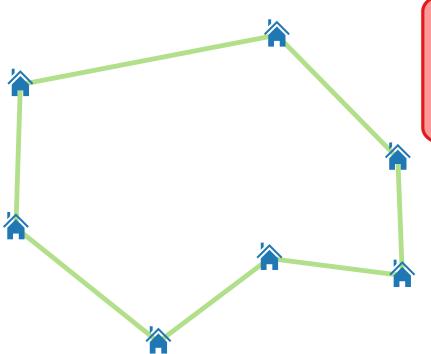
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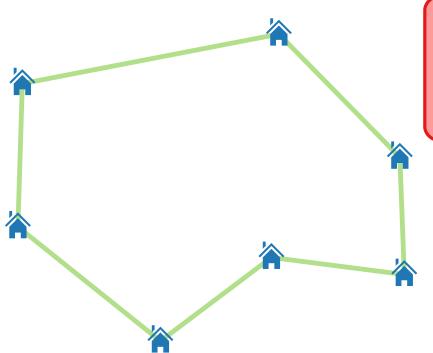
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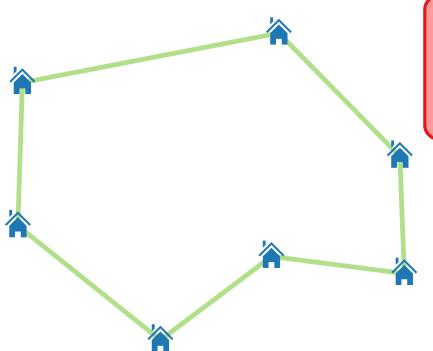
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The Salesman can fly  $\Rightarrow$  Euclidean distance.



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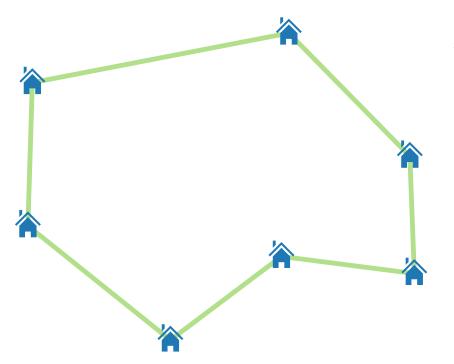
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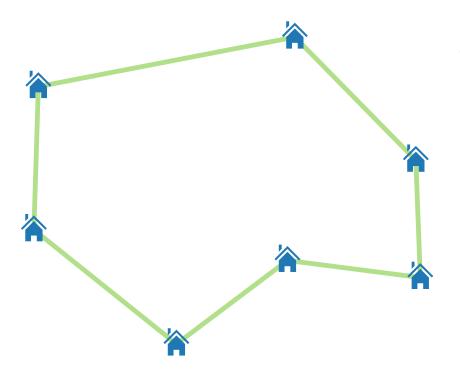
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#### **Simplifying Assumptions**

Houses inside  $(L \times L)$ -square

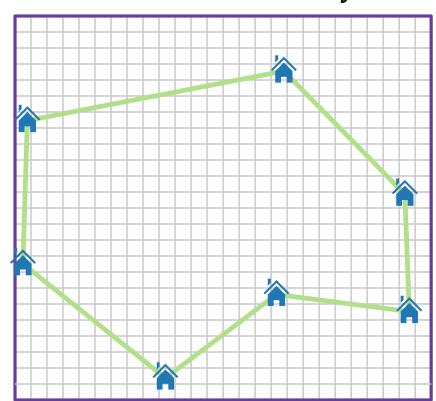
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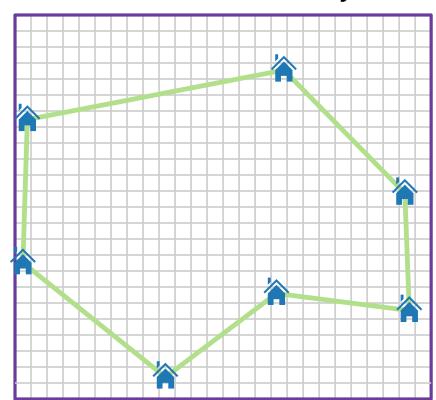
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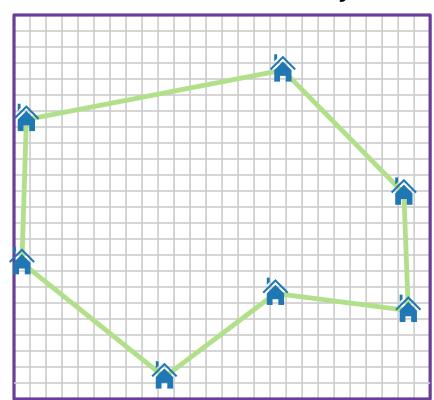
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- Houses inside  $(L \times L)$ -square
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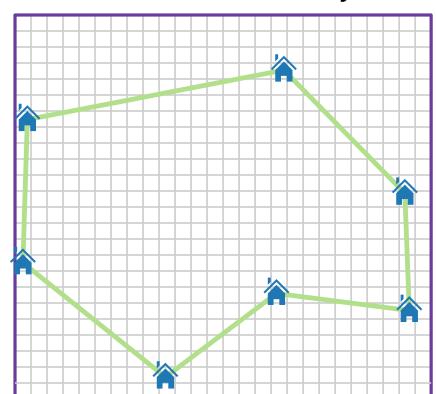
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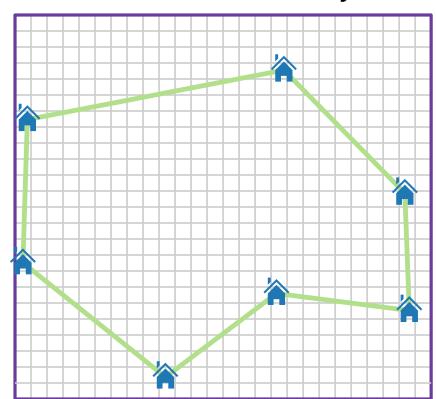
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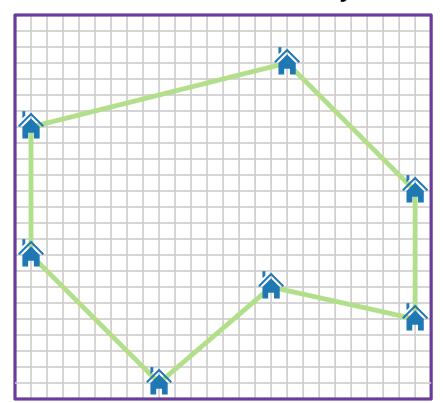
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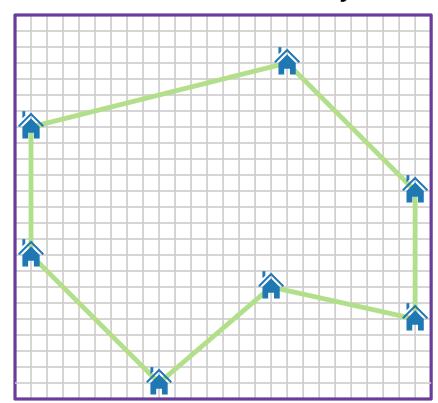
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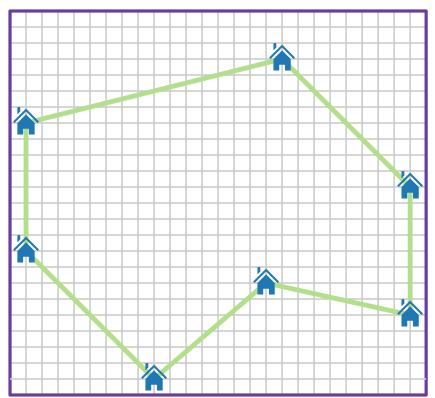
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L := 
$$4n^2 = 2^k$$
;  
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integer coordinates

 $(1+\varepsilon)$ -approximation!

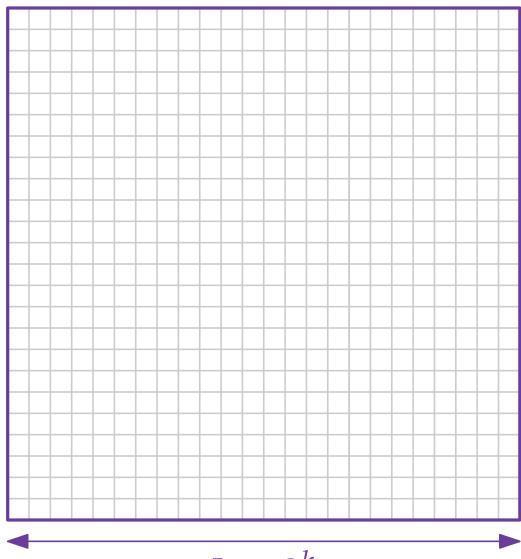
Goal:

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# Approximation Algorithms

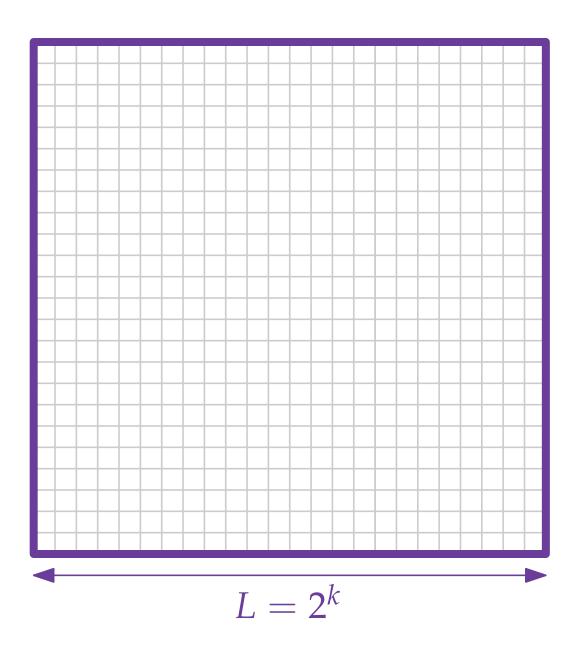
Lecture 9: PTAS for EuclideanTSP

Part II:
Dissection

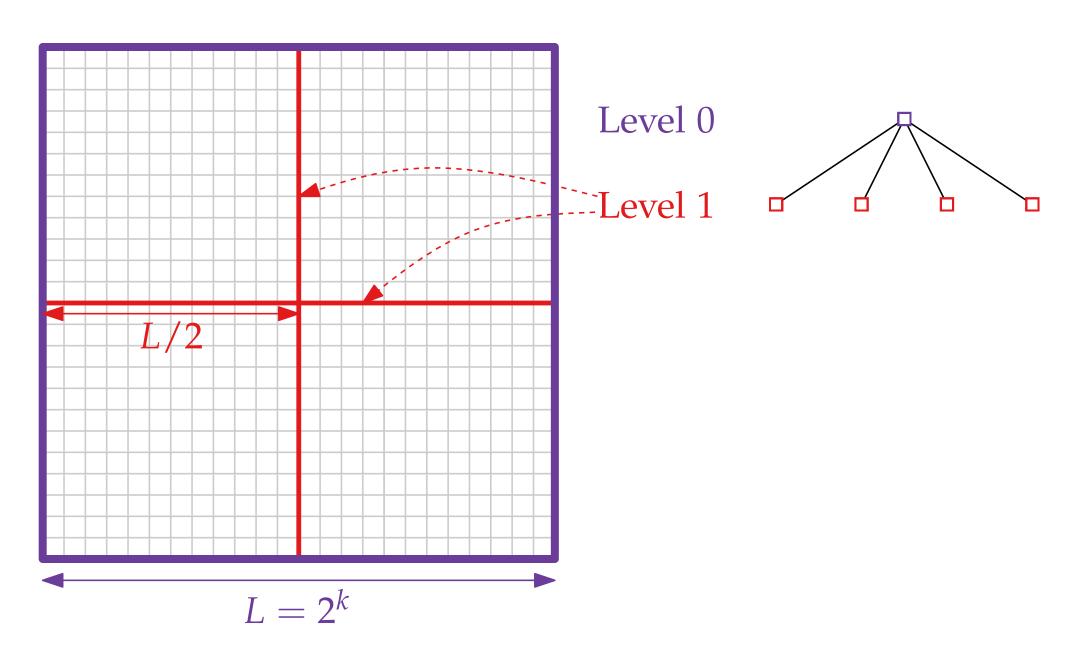


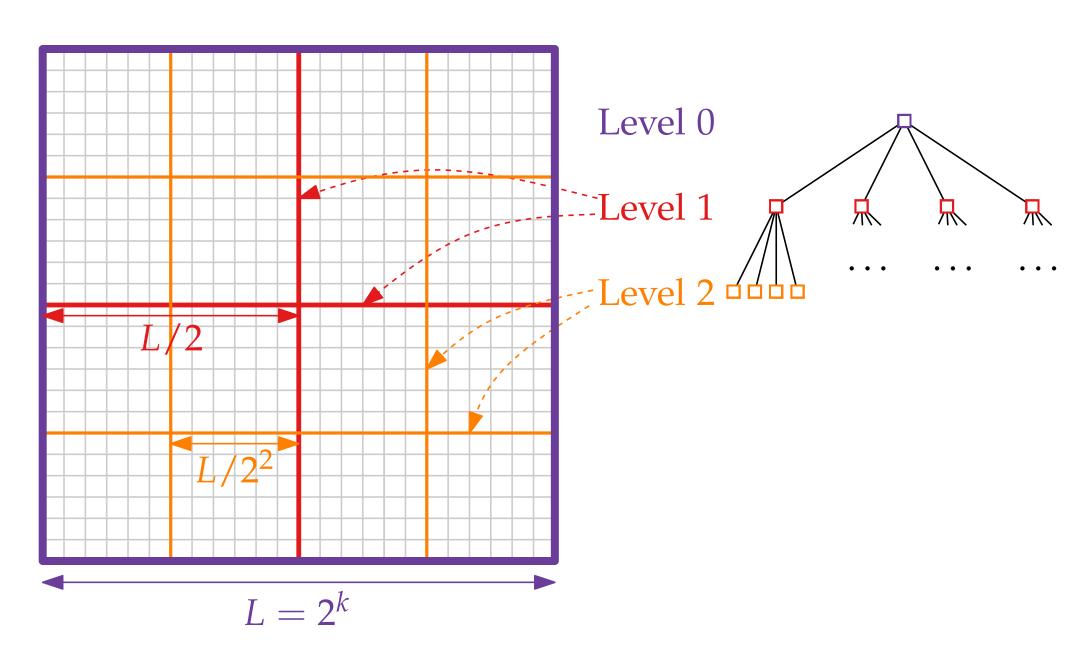
$$L=2^k$$

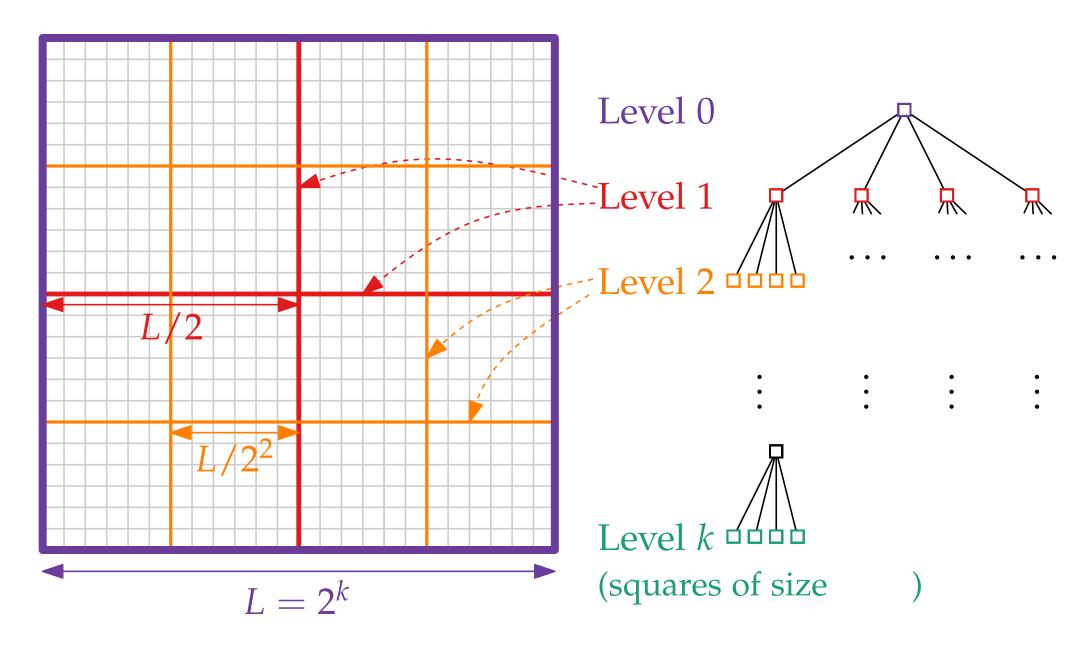
### Basic Dissection

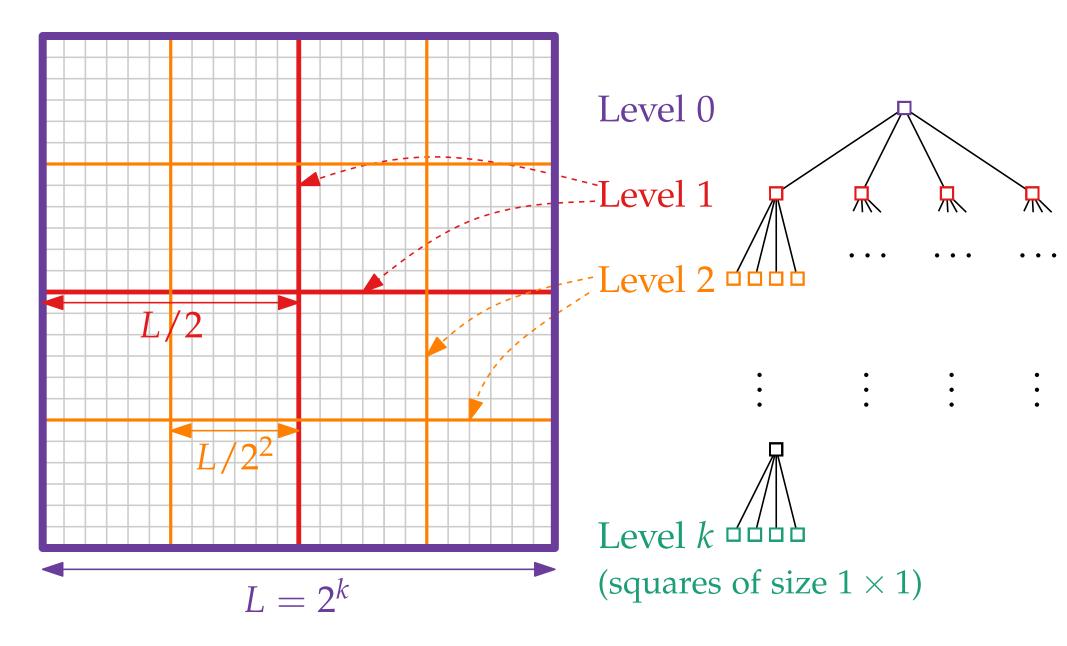


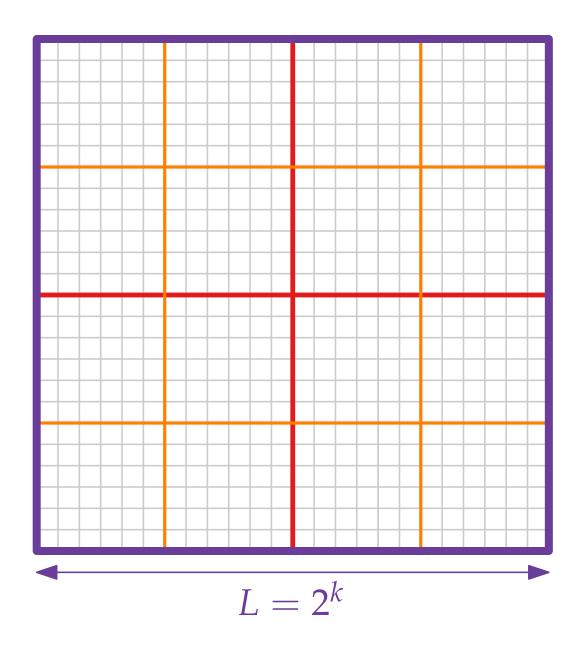
Level 0

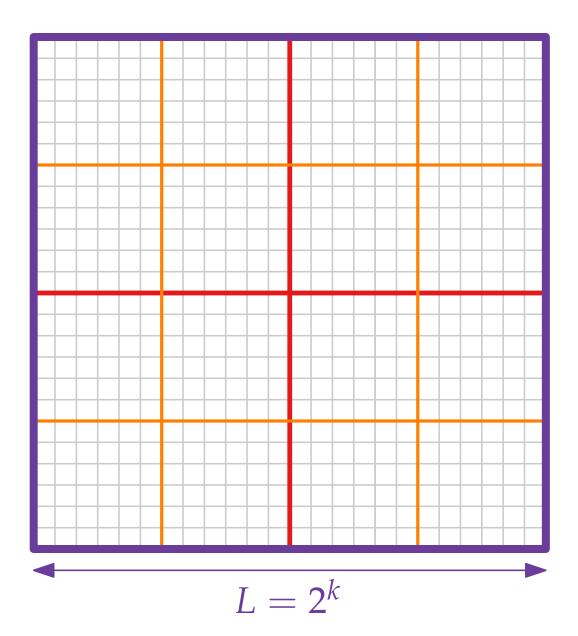




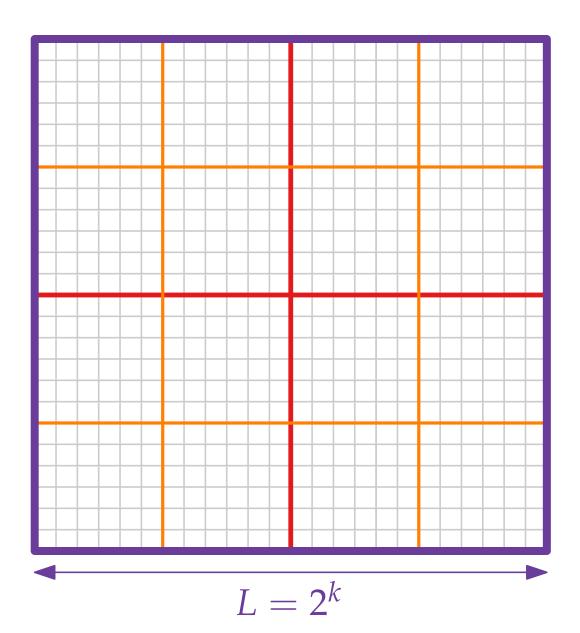






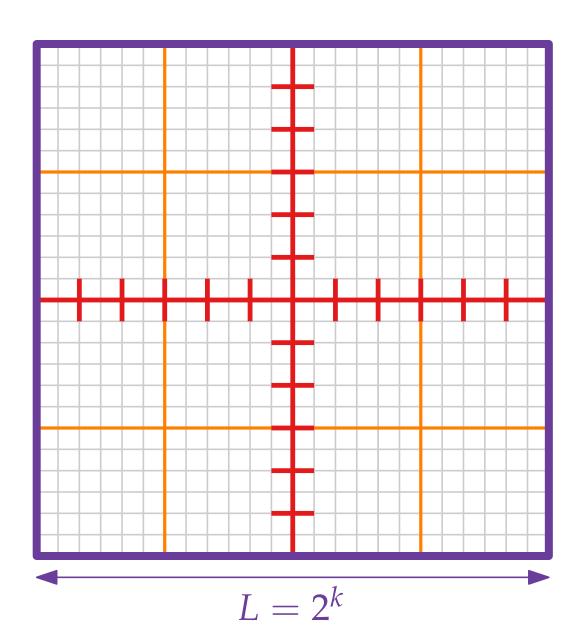


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$$\Rightarrow m = O((\log n)/\varepsilon)$$

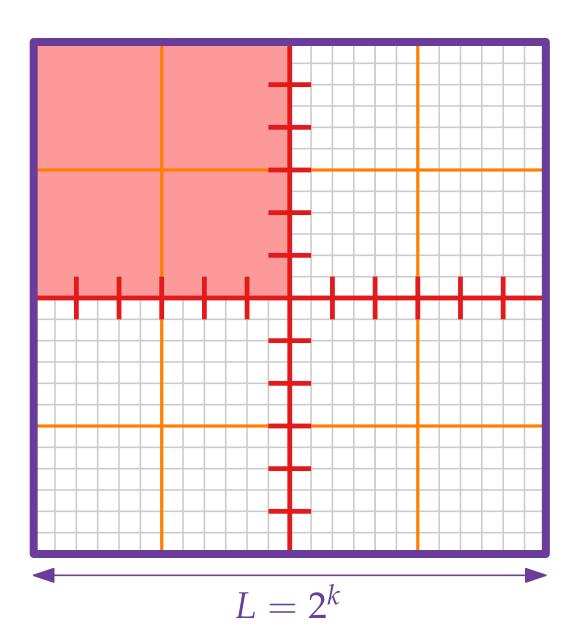


**m** power of two in interval  $[k/\varepsilon, 2k/\varepsilon]$ 

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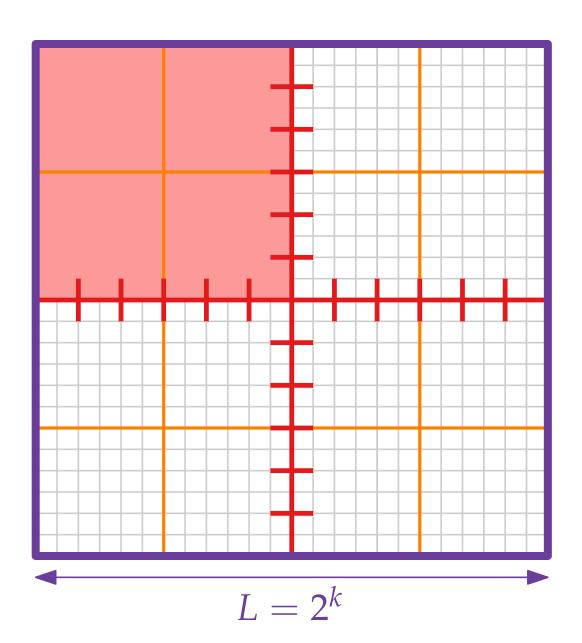
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Portals on level-*i*-line with distance  $L/(2^i m)$ 



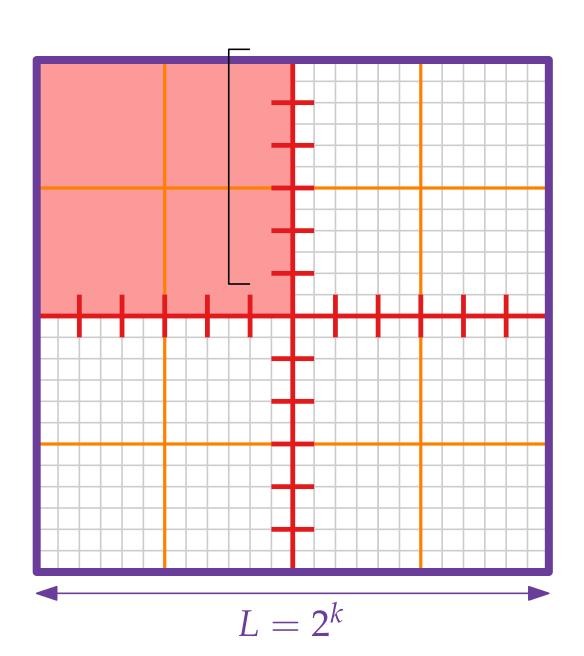
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- Portals on level-*i*-line with distance  $L/(2^i m)$
- Level-*i*-square: size



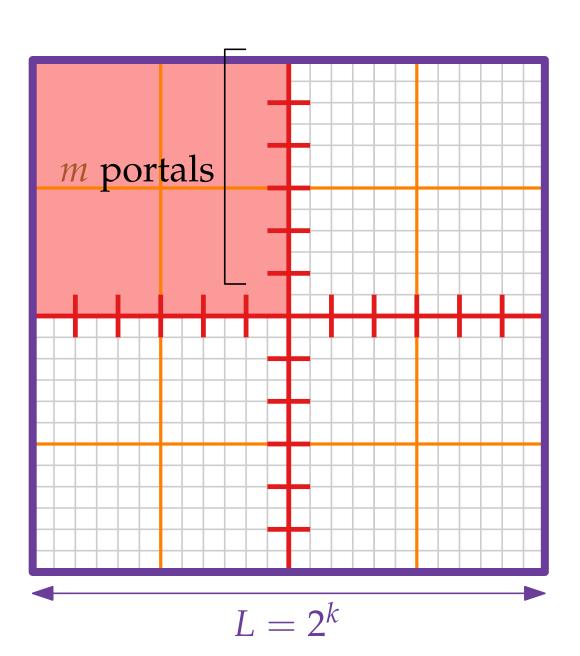
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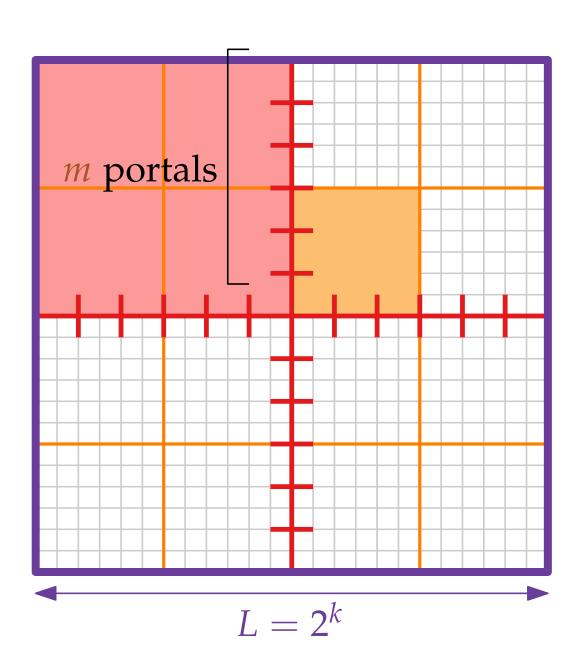
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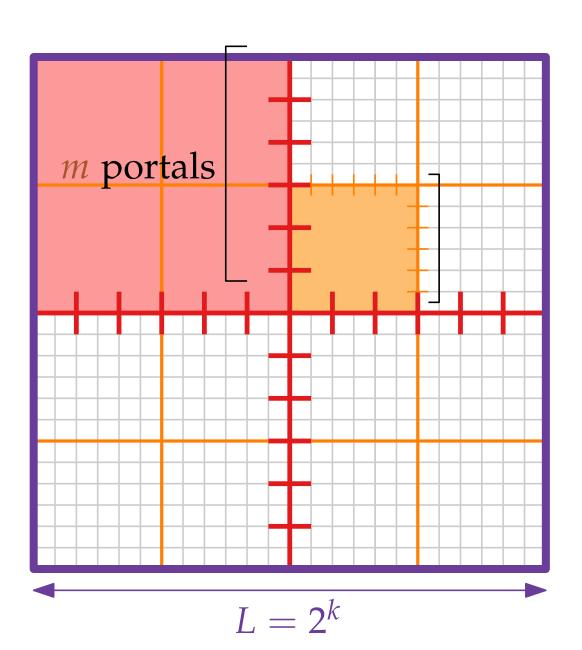
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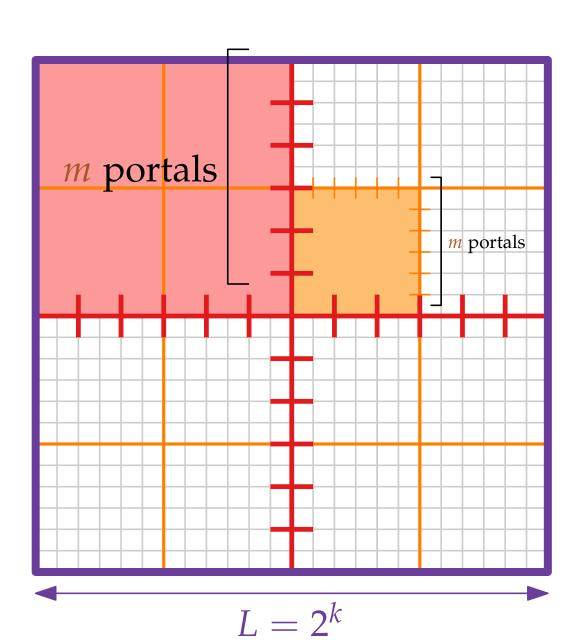
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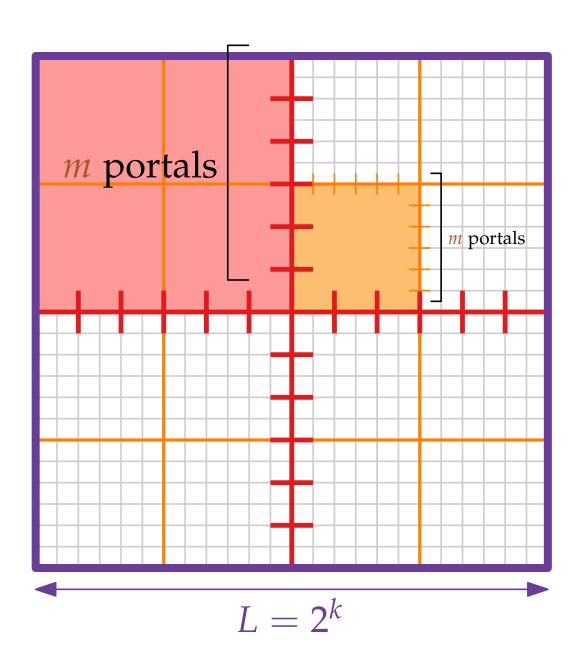
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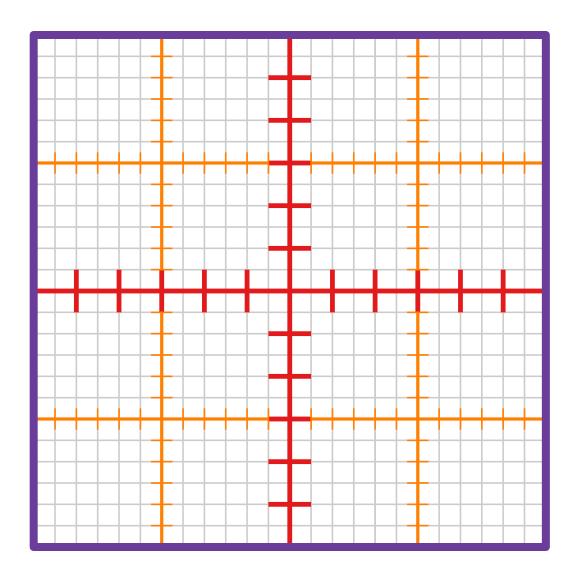
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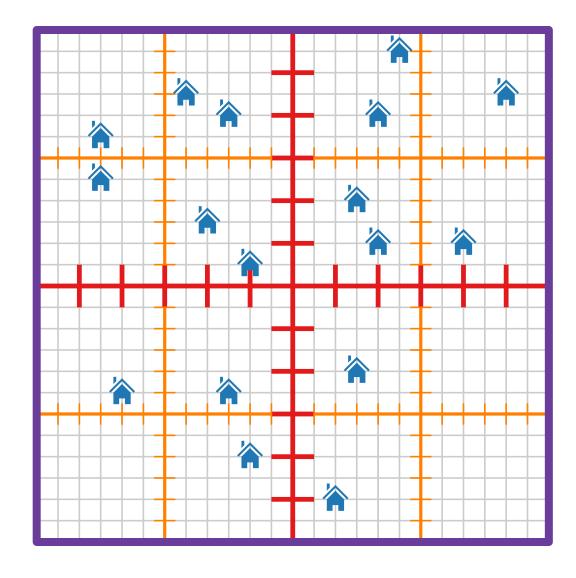
- **Portals** on level-*i*-line with distance  $L/(2^i m)$
- Level-*i*-square: size  $L/2^i \times L/2^i$
- Level-*i*-square has at most4*m* portals on its boundary.

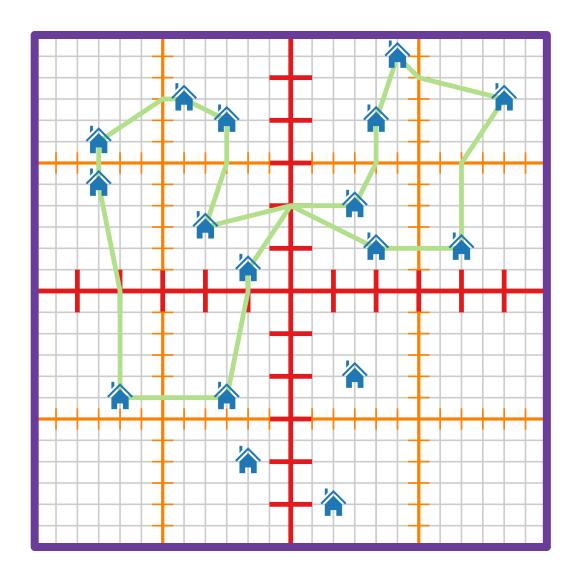
# Approximation Algorithms

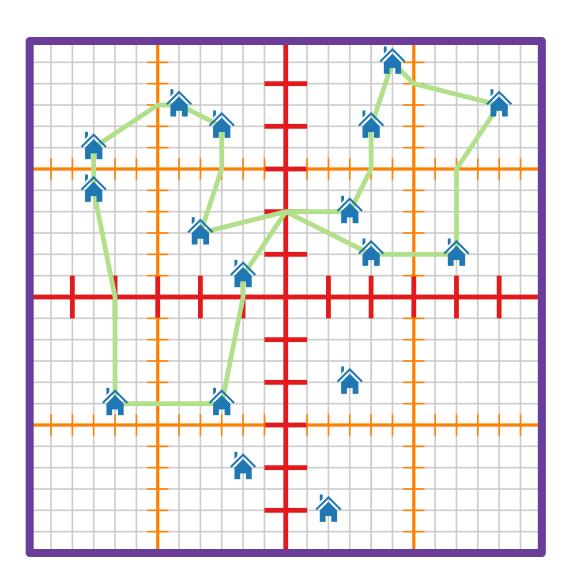
Lecture 9: PTAS for EuclideanTSP

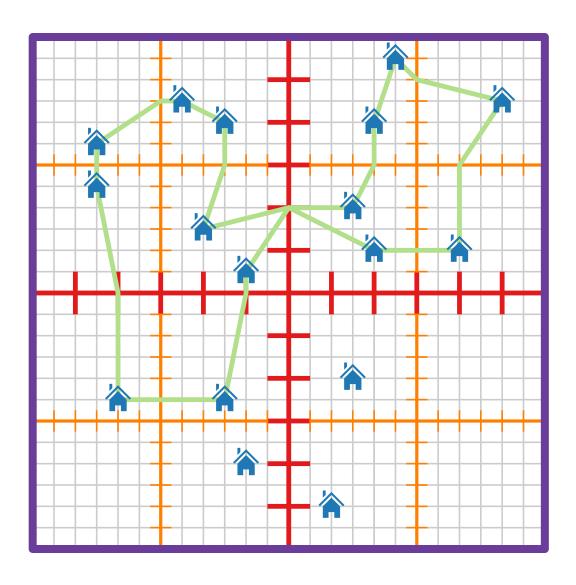
Part III:
Well Behaved Tours





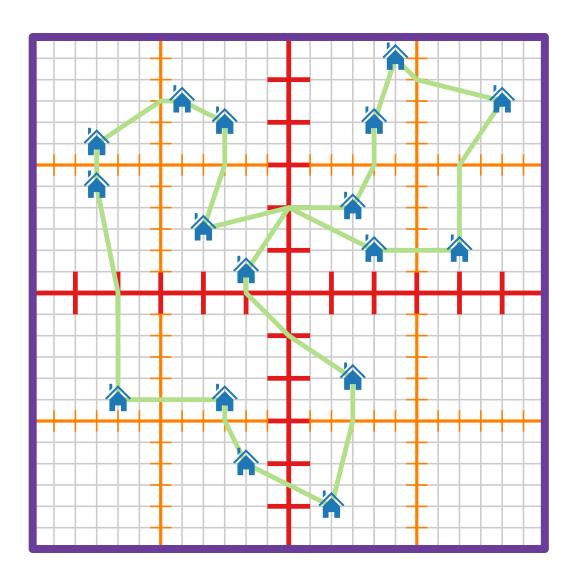






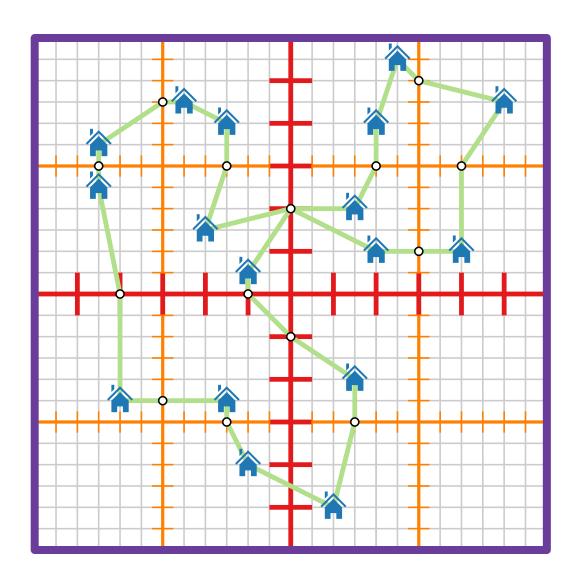
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it involves all houses



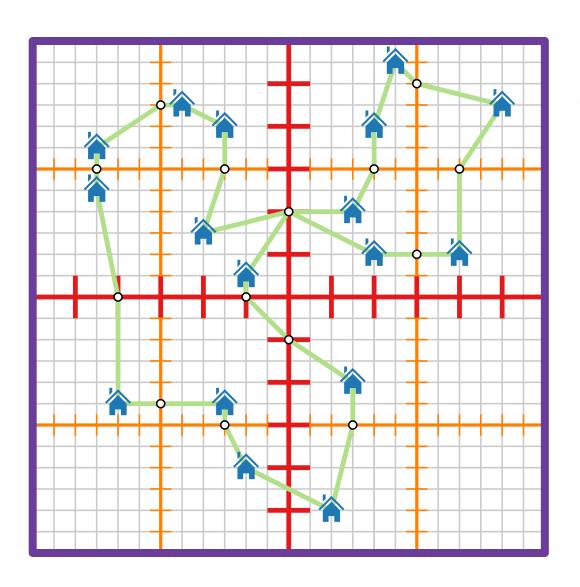
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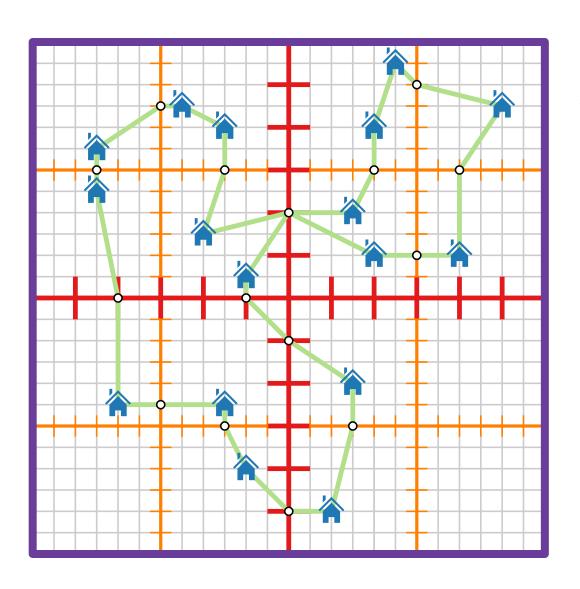


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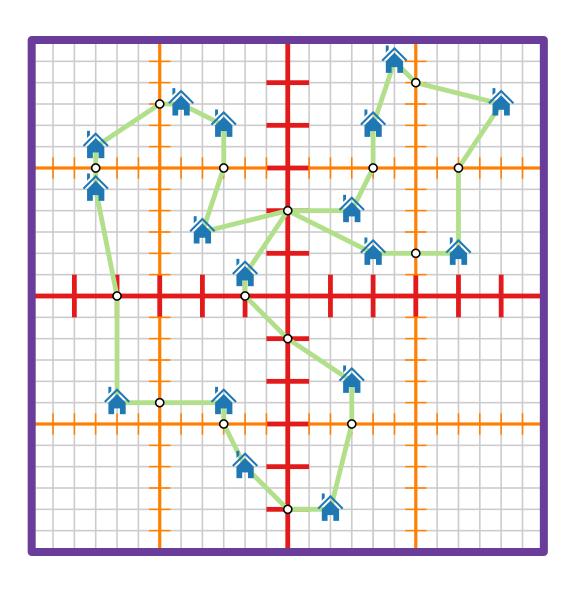
it involves all houses and a subset of the portals,



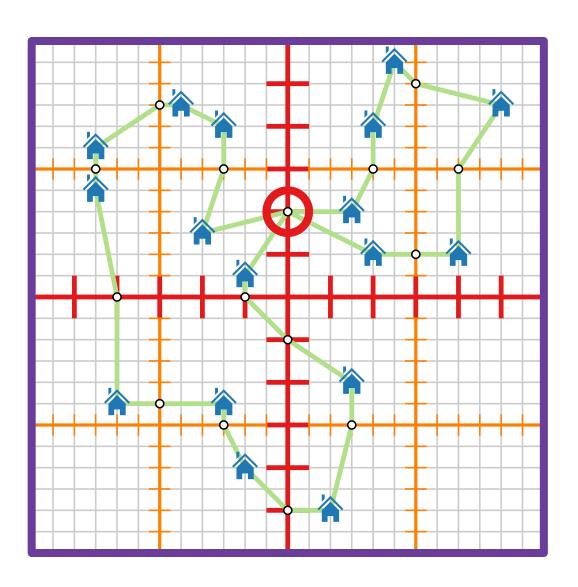
- it involves all houses and a subset of the portals,
- no edge of the tour crosses a line of the basic dissection,



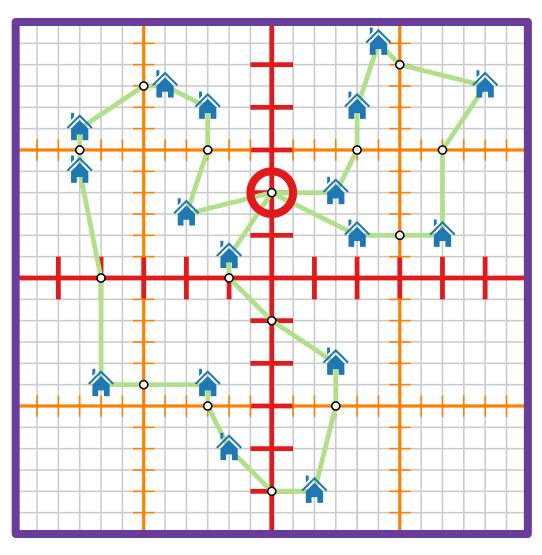
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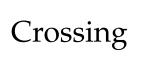
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- no edge of the tour crosses a line of the basic dissection,
- it is crossing-free.



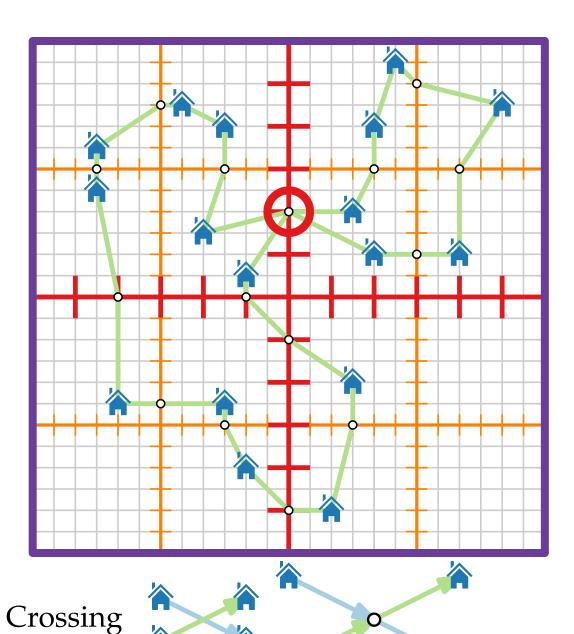
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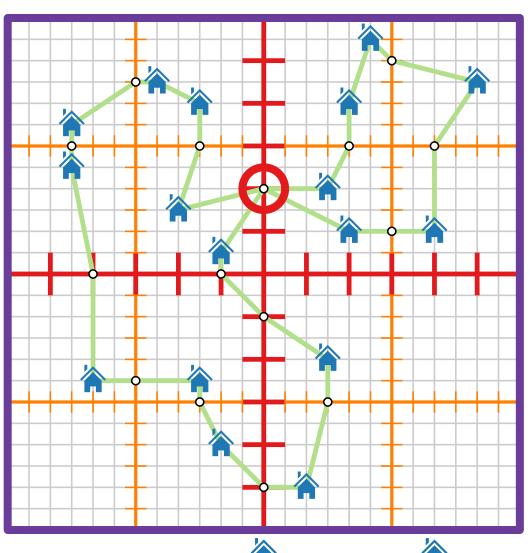
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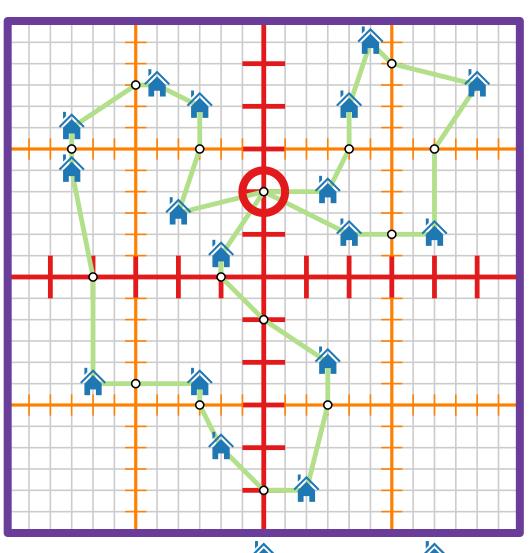
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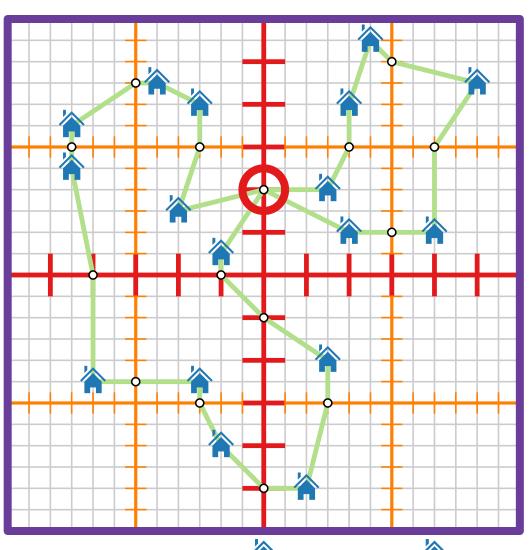




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A tour is well behaved if

- it involves all houses and a subset of the portals,
- no edge of the tour crosses a line of the basic dissection,
- it is crossing-free.

W.l.o.g. (homework):
No portal visited more than twice



No crossing



Lemma.

An optimal well behaved tour can be computed in  $2^{O(m)} = n^{O(1/\epsilon)}$  time.

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Sketch.

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Dynamic Programming!

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Sketch.

- Dynamic Programming!
- Compute sub-structure of an optimal tour for each square in the dissection tree.

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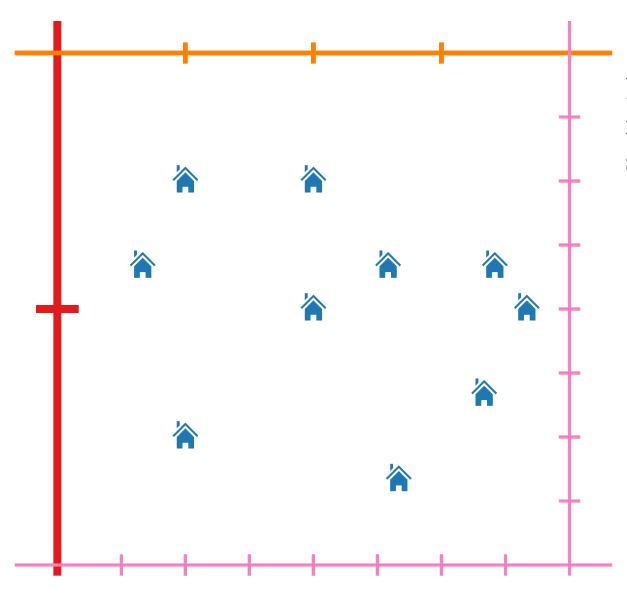
Sketch.

- Dynamic Programming!
- Compute sub-structure of an optimal tour for each square in the dissection tree.
- These solutions can be efficiently propagated bottom-up through the dissection tree.

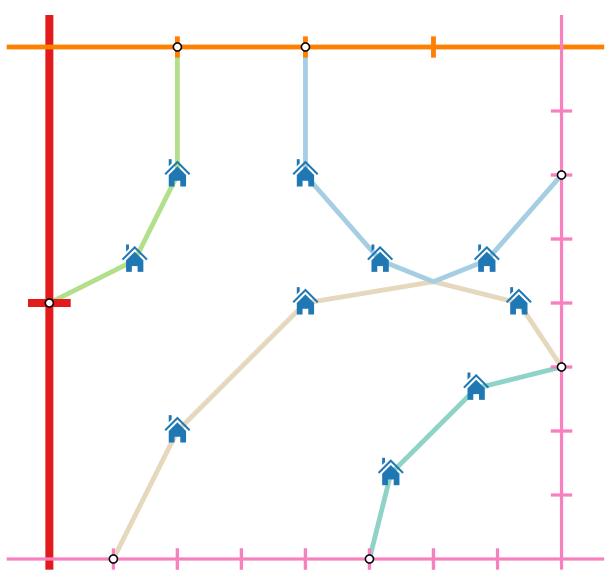
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Lecture 9: PTAS for EuclideanTSP

Part IV: Dynamic Program

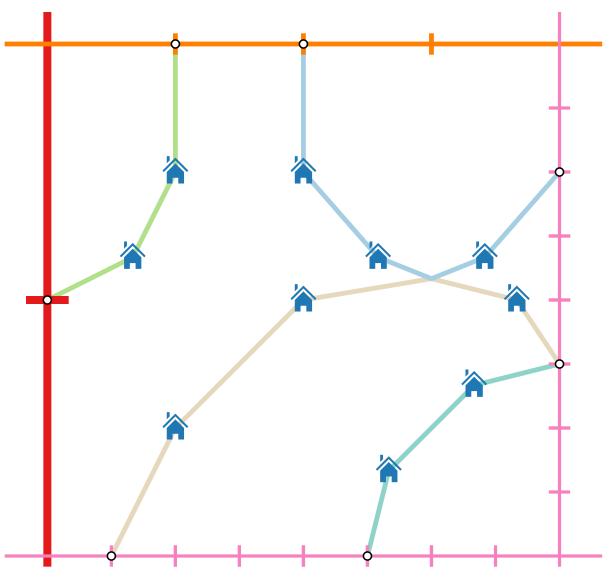


Each well behaved tour induces the following in each square *Q* of the dissection:



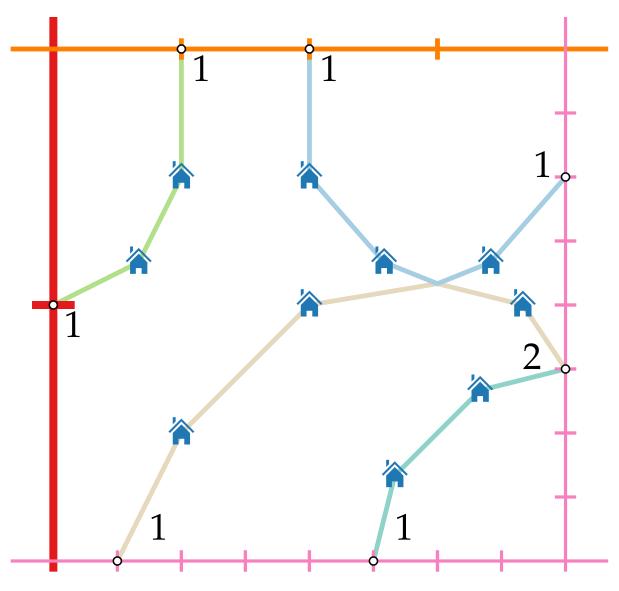
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A path cover of the houses in *Q* 



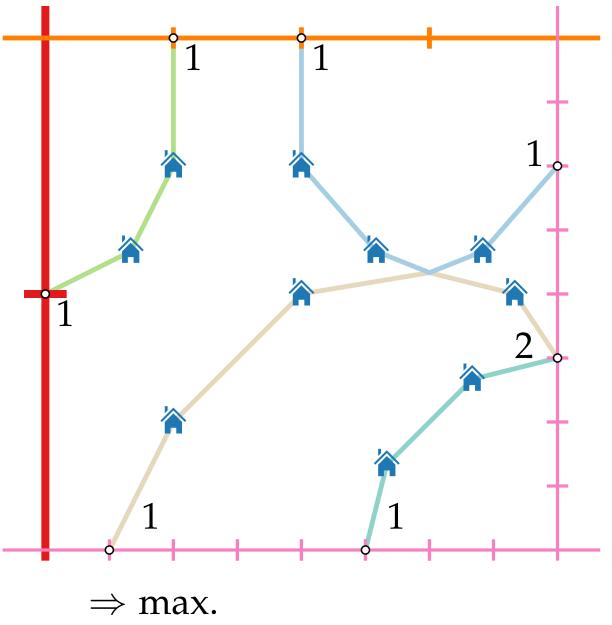
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- A path cover of the houses in *Q*
- Each portal of Q is visited 0,1 or 2 times by this path cover



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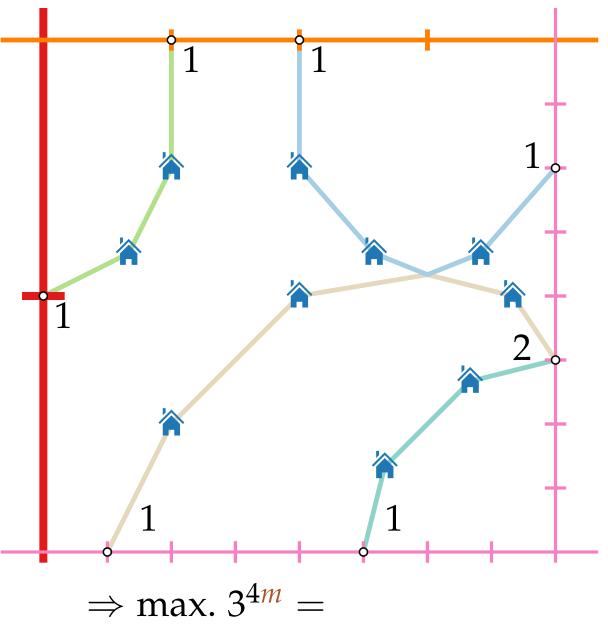
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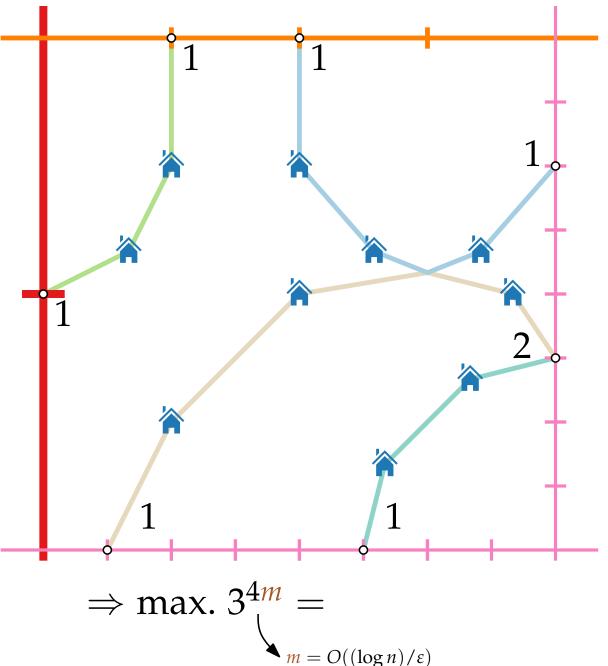
possibilities



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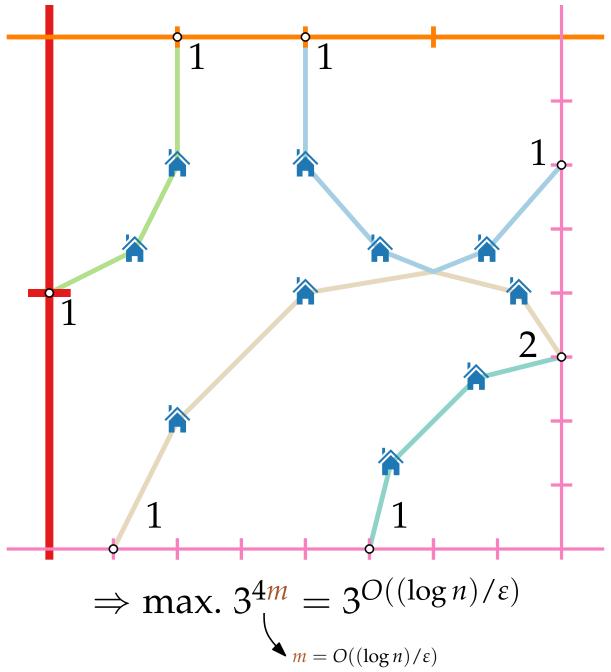
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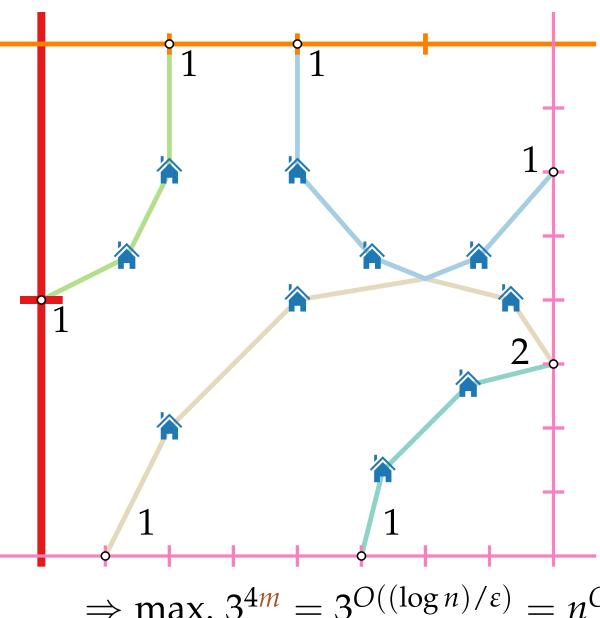
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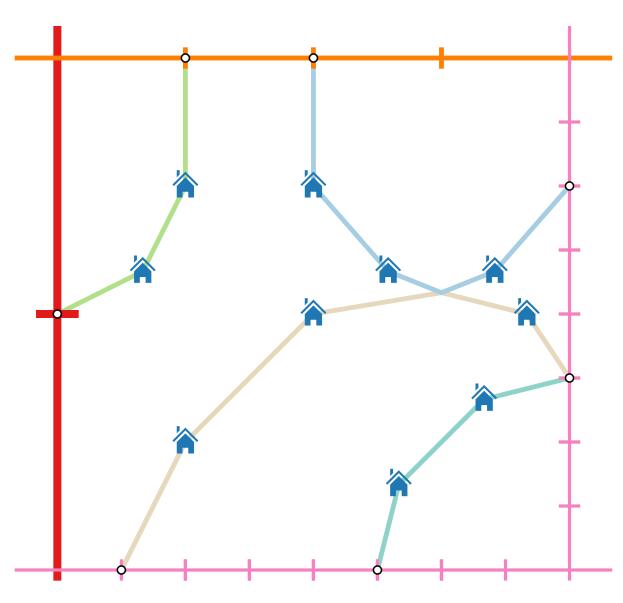
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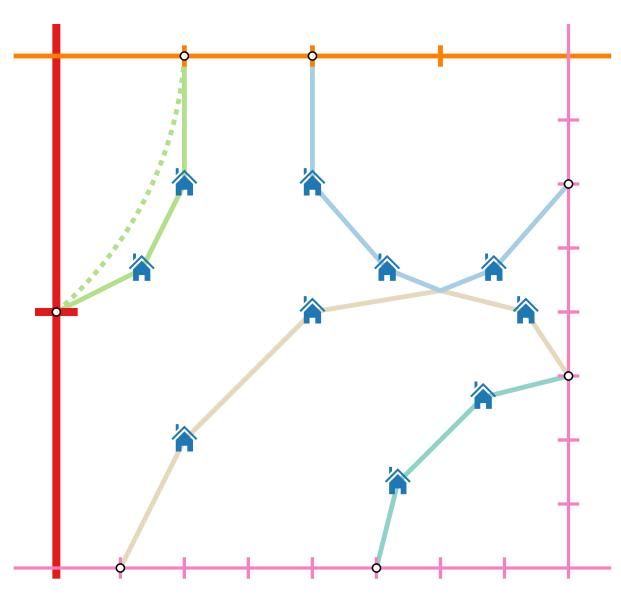


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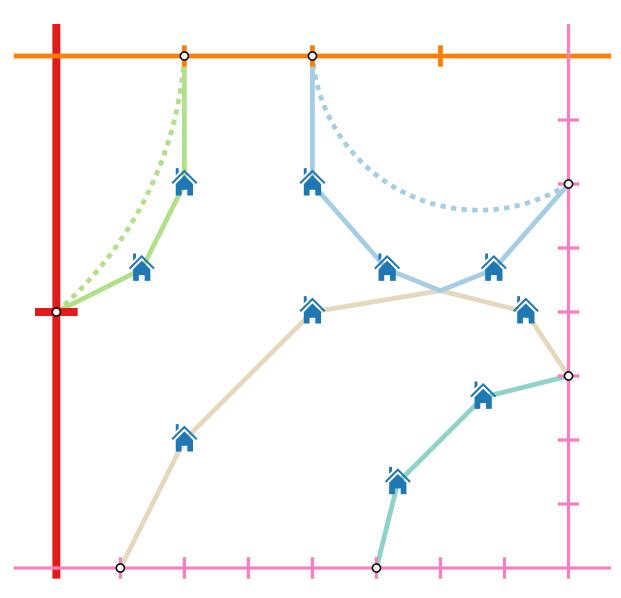
$$\Rightarrow$$
 max.  $3^{4m} = 3^{O((\log n)/\varepsilon)} = n^{O(1/\varepsilon)}$  possibilities  $m = O((\log n)/\varepsilon)$ 



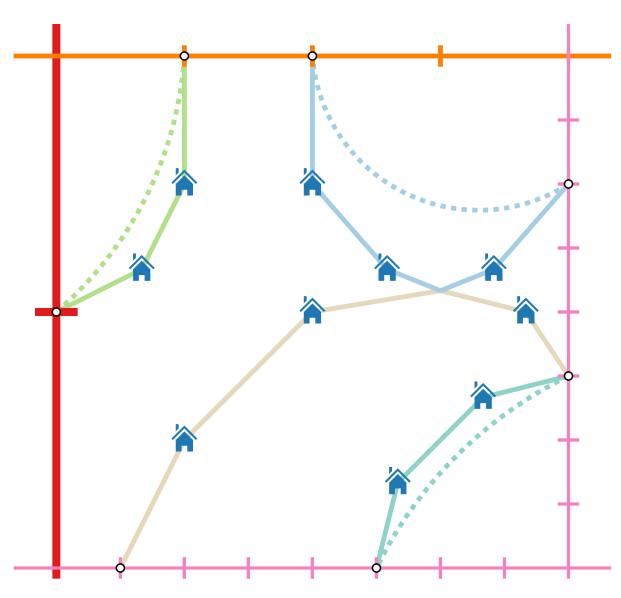
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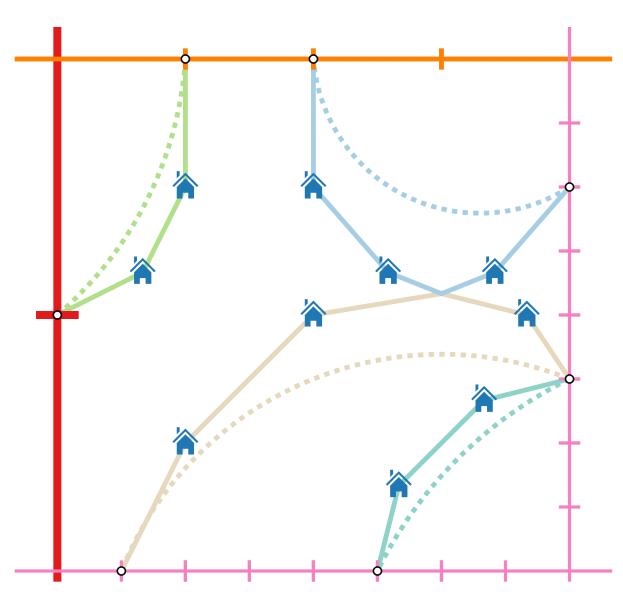
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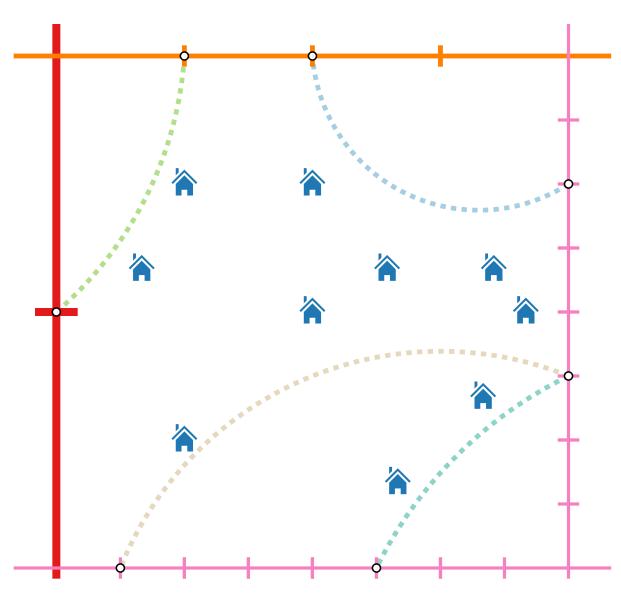
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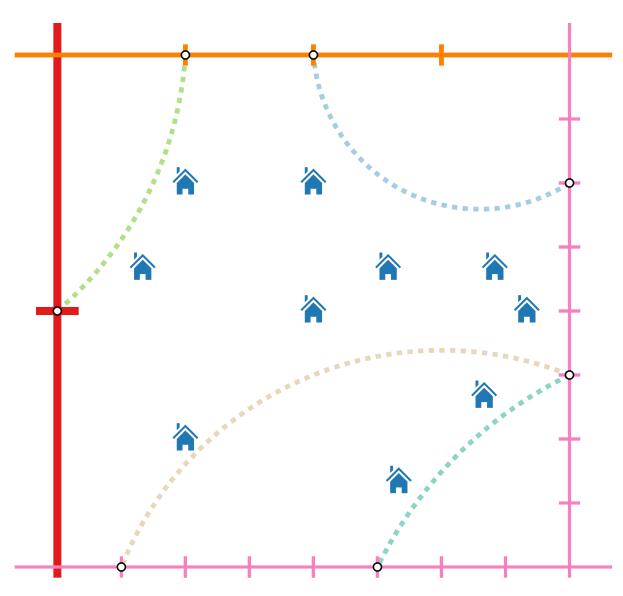
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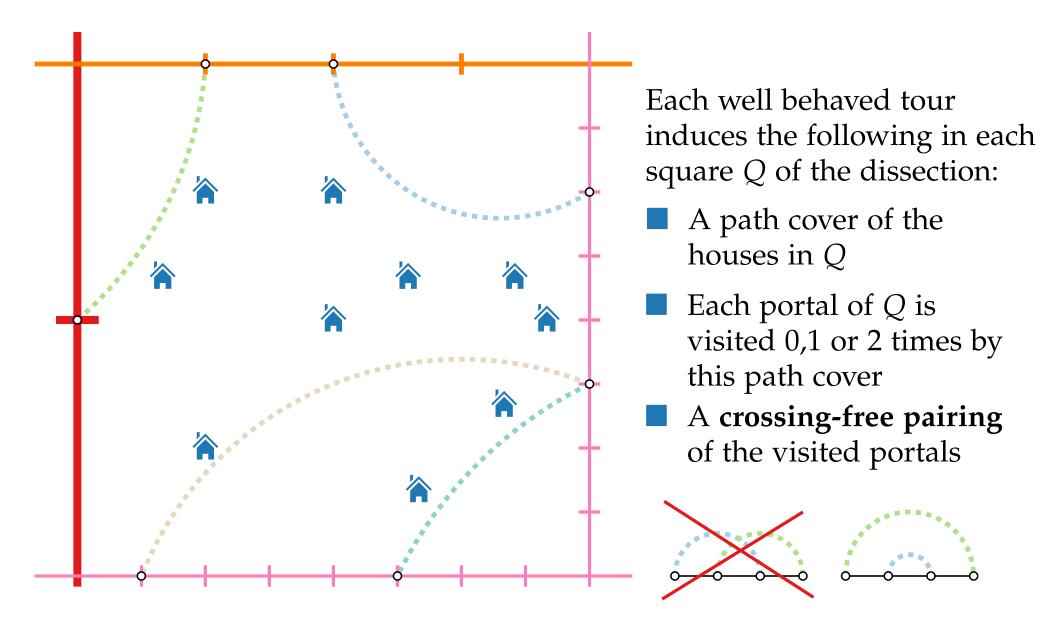


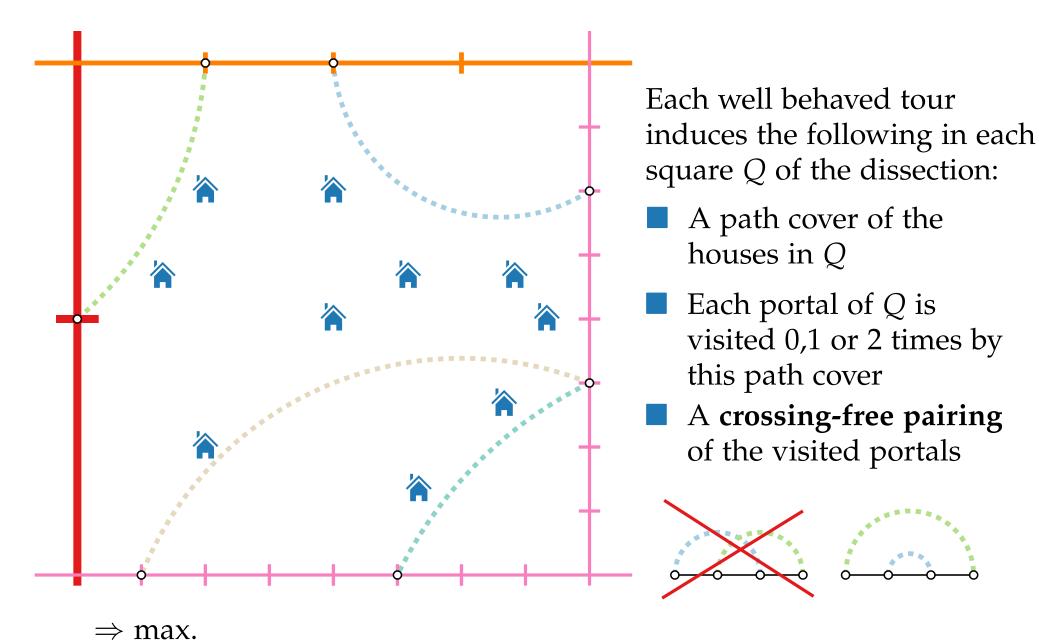
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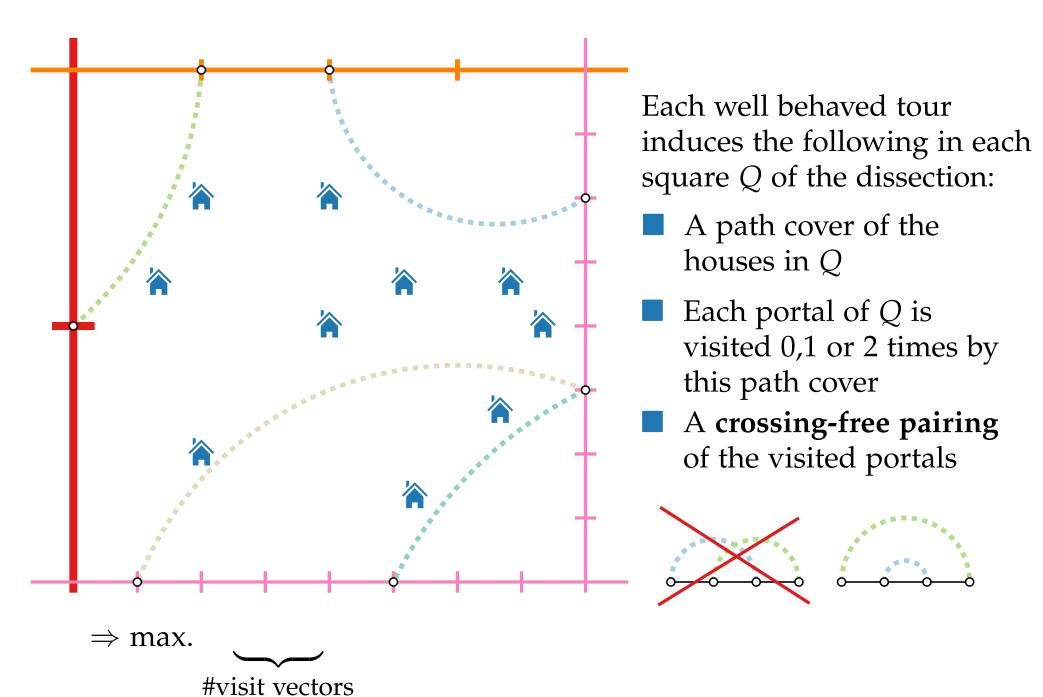


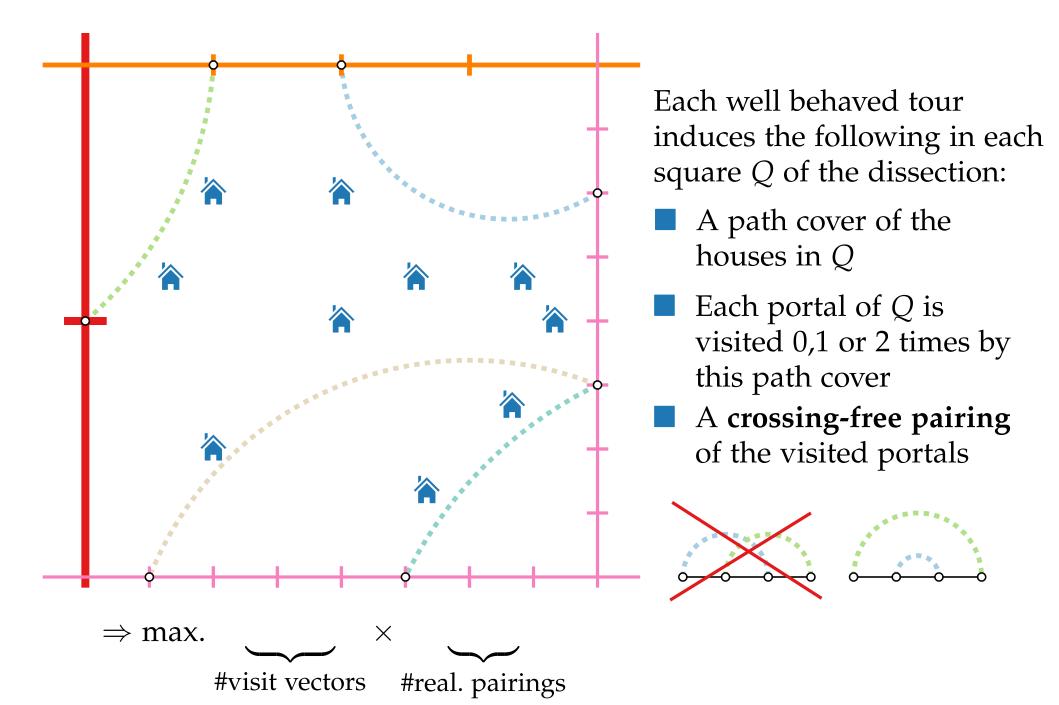
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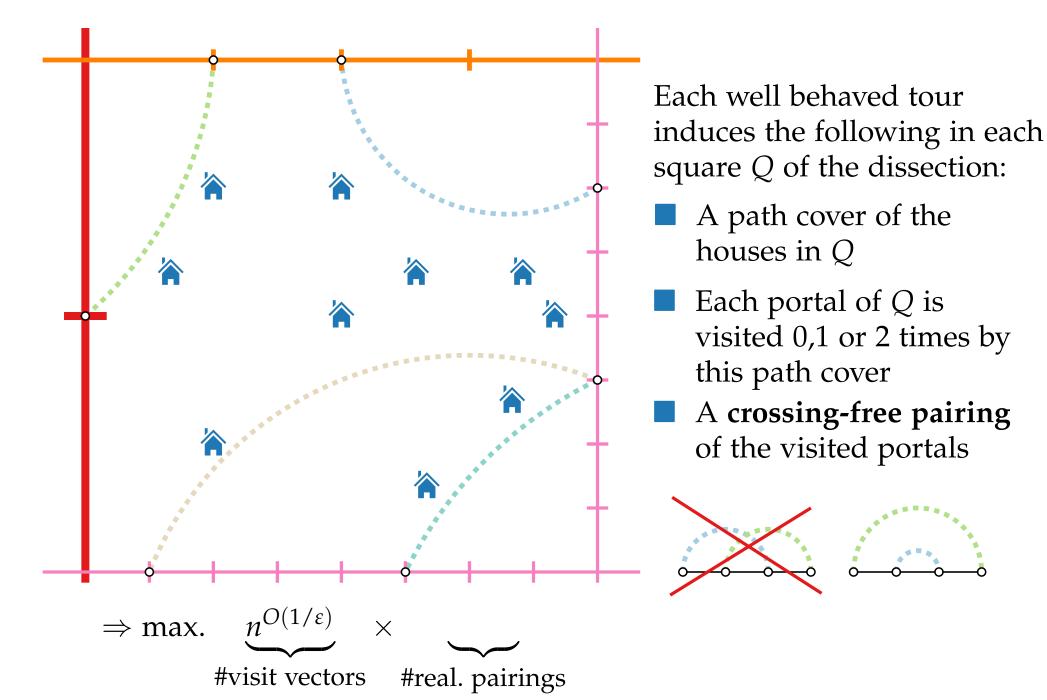


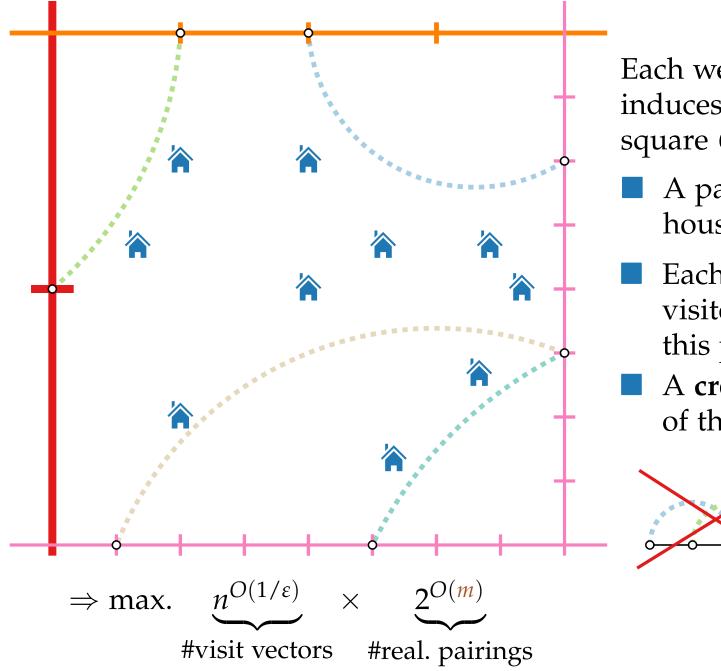




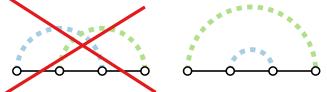


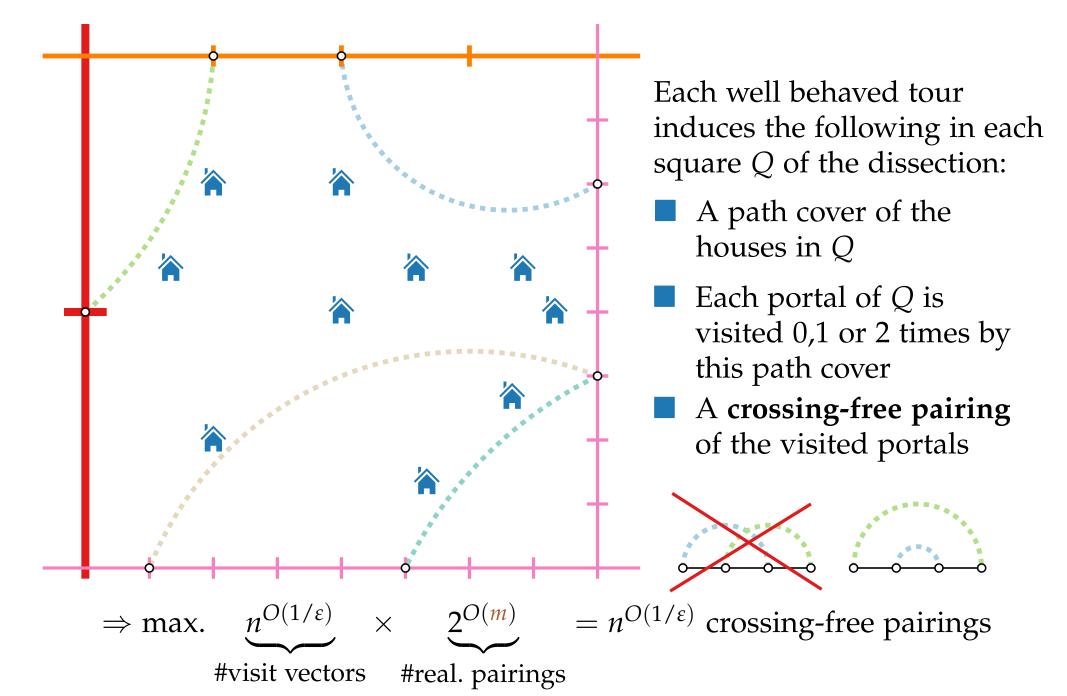


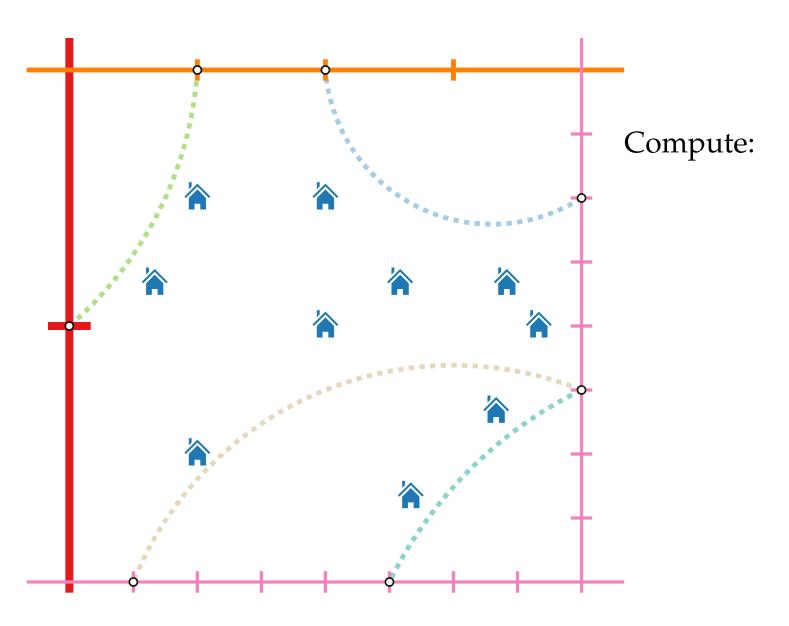


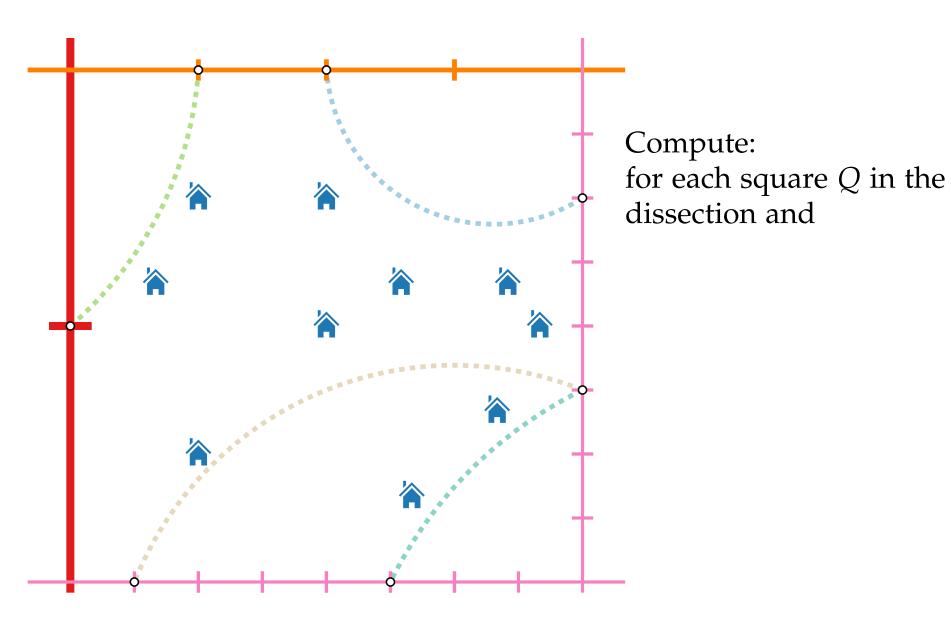


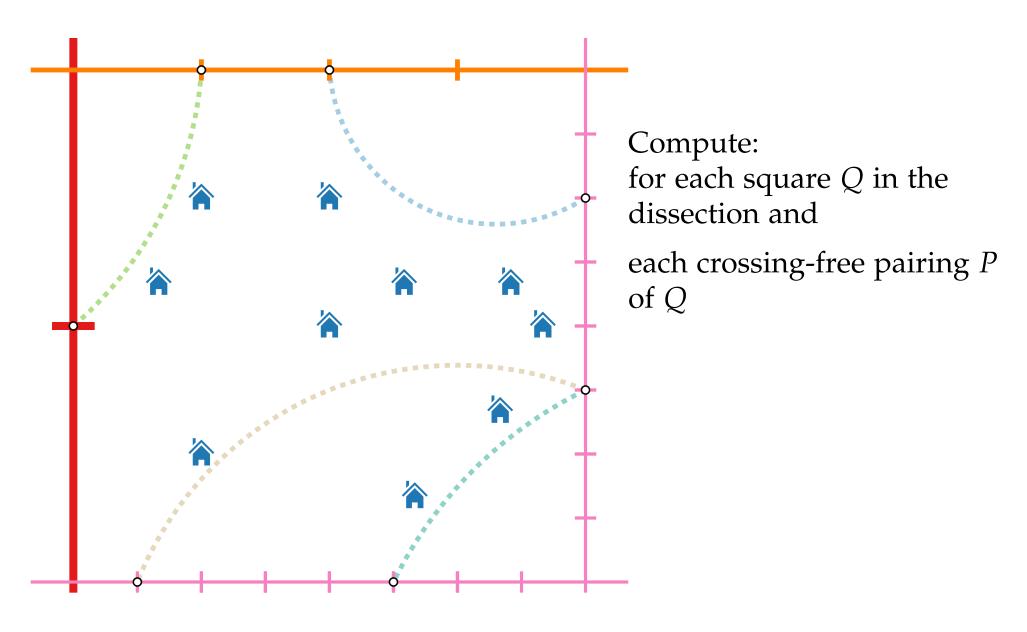
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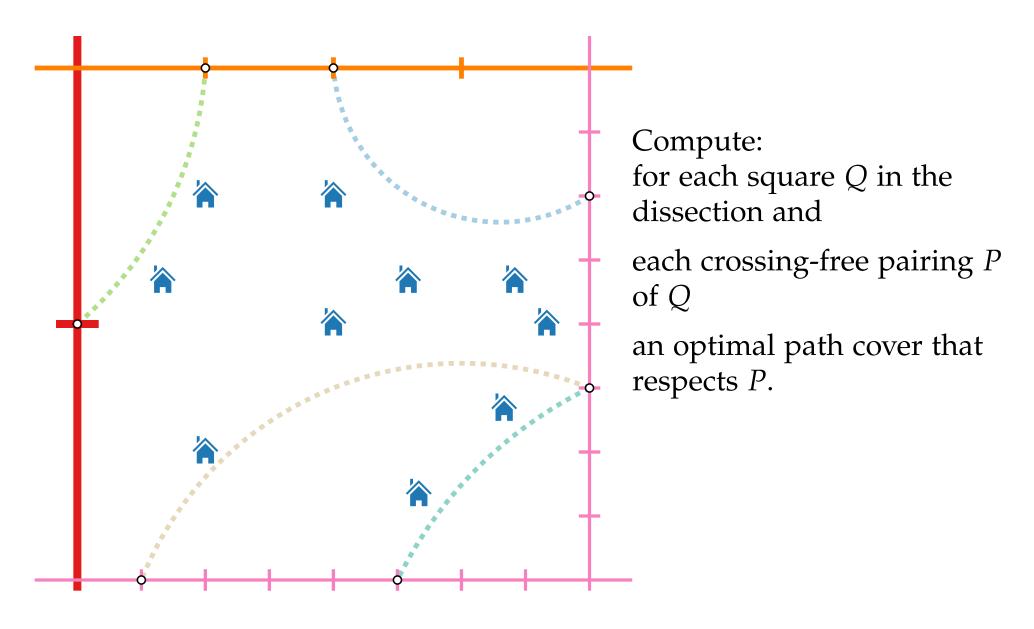


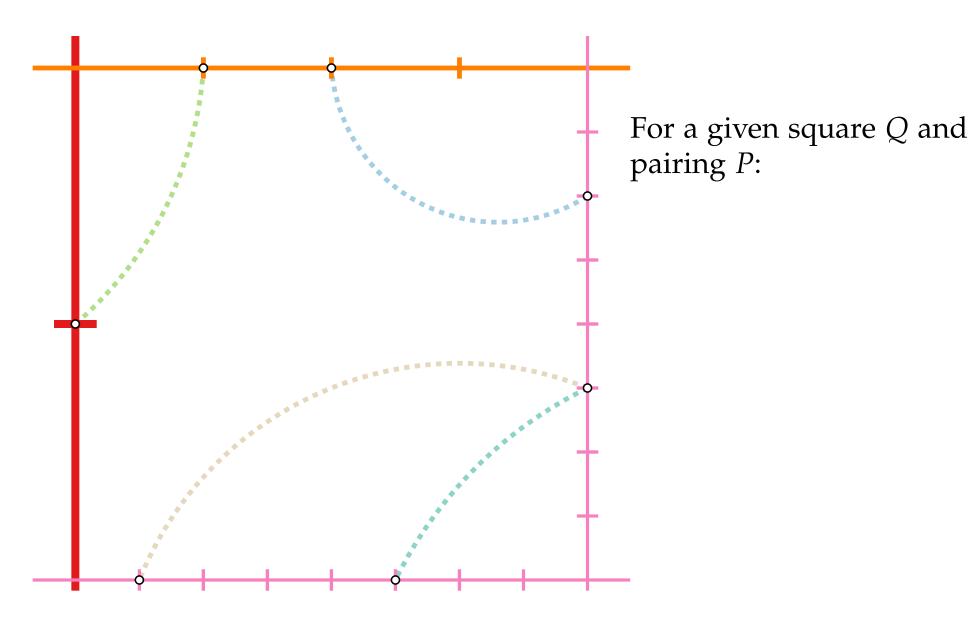


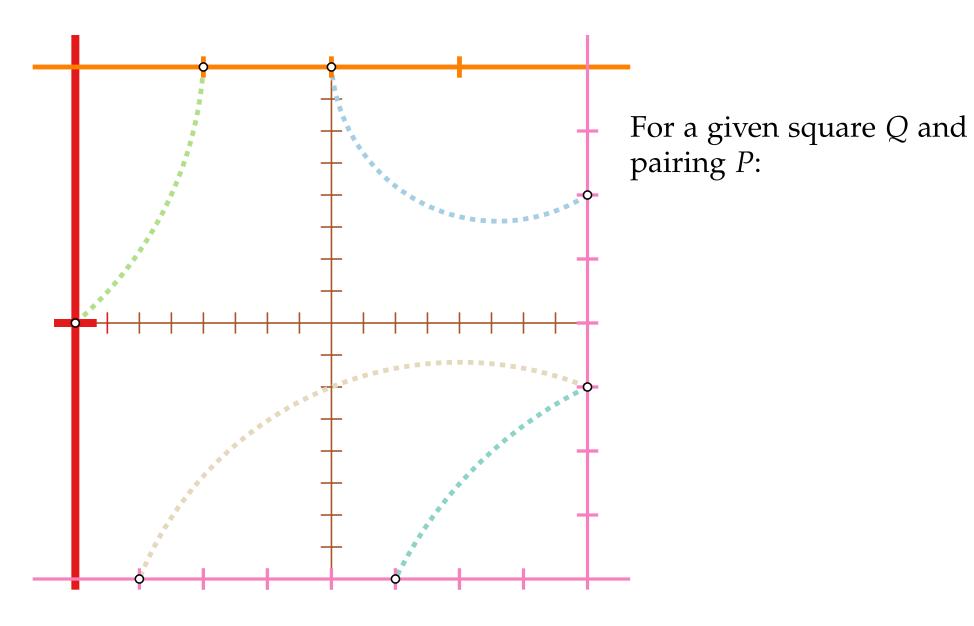


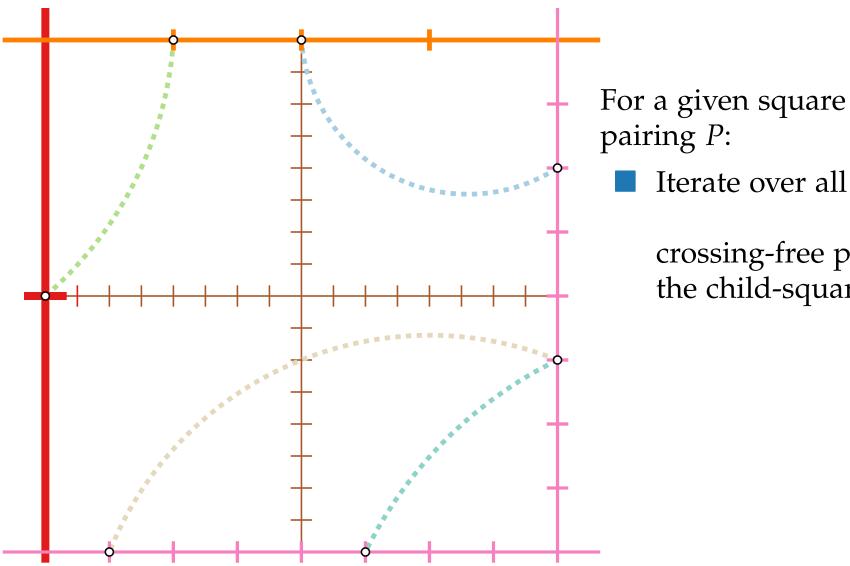






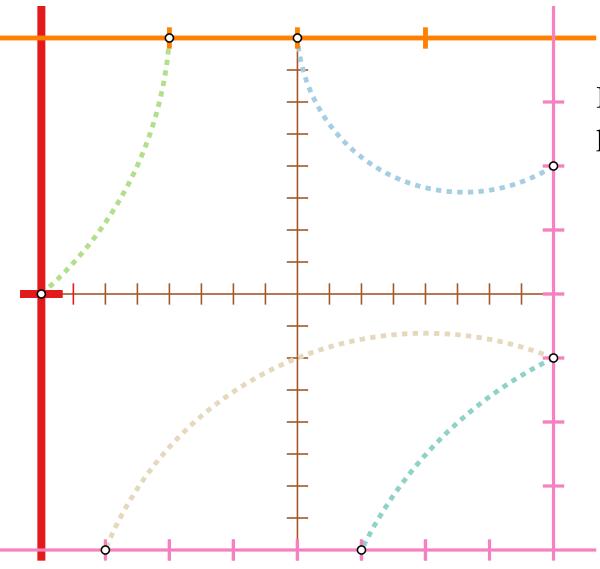






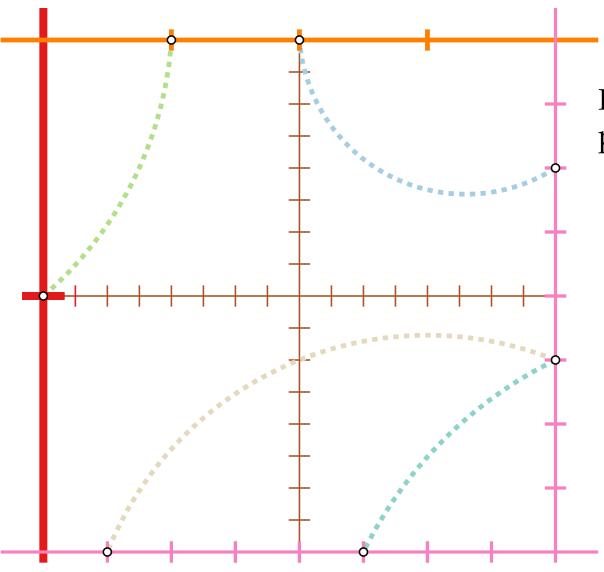
For a given square Q and

crossing-free pairings of the child-squares



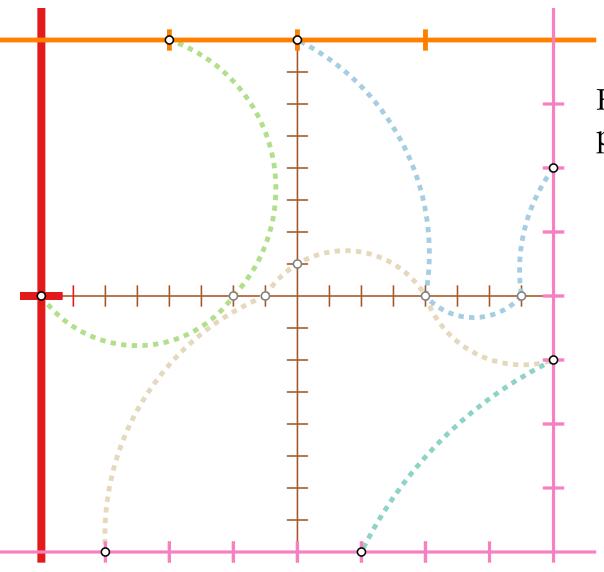
For a given square *Q* and pairing *P*:

Iterate over all  $(n^{O(1/\varepsilon)})^4 =$  crossing-free pairings of the child-squares



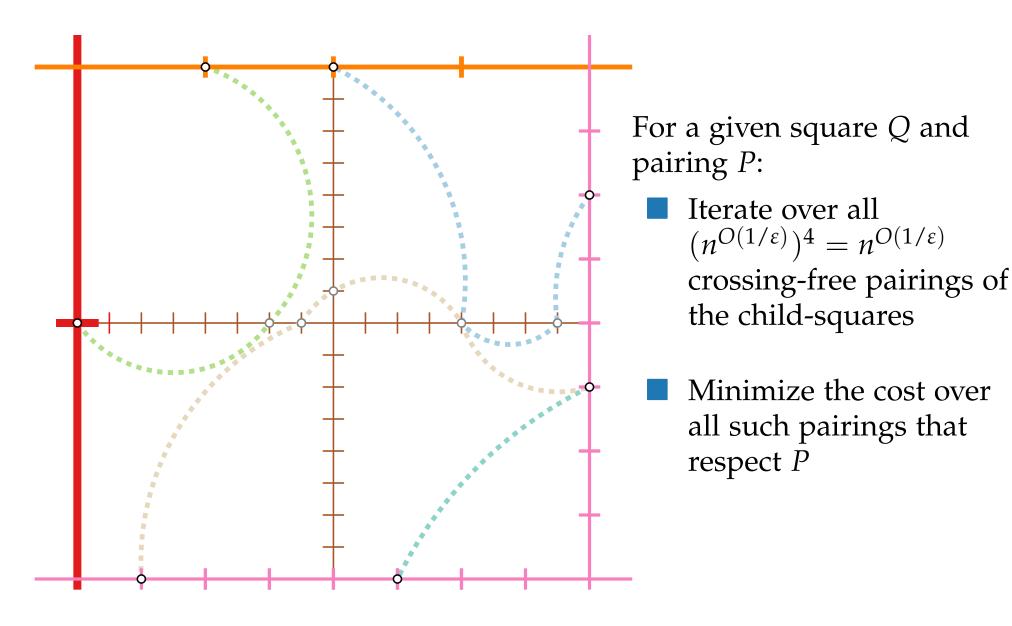
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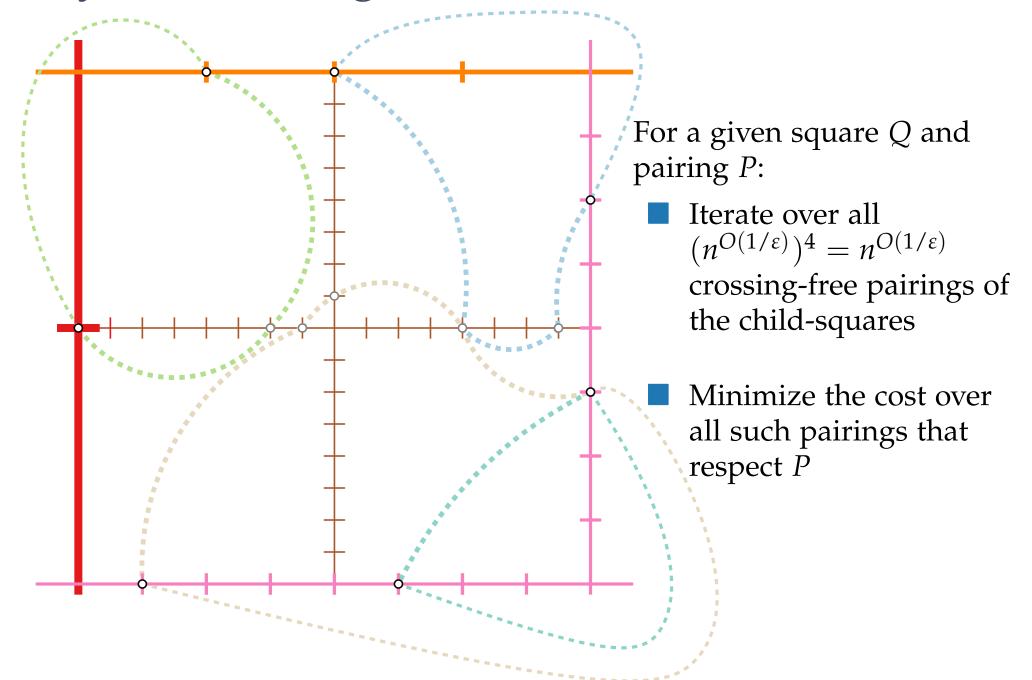
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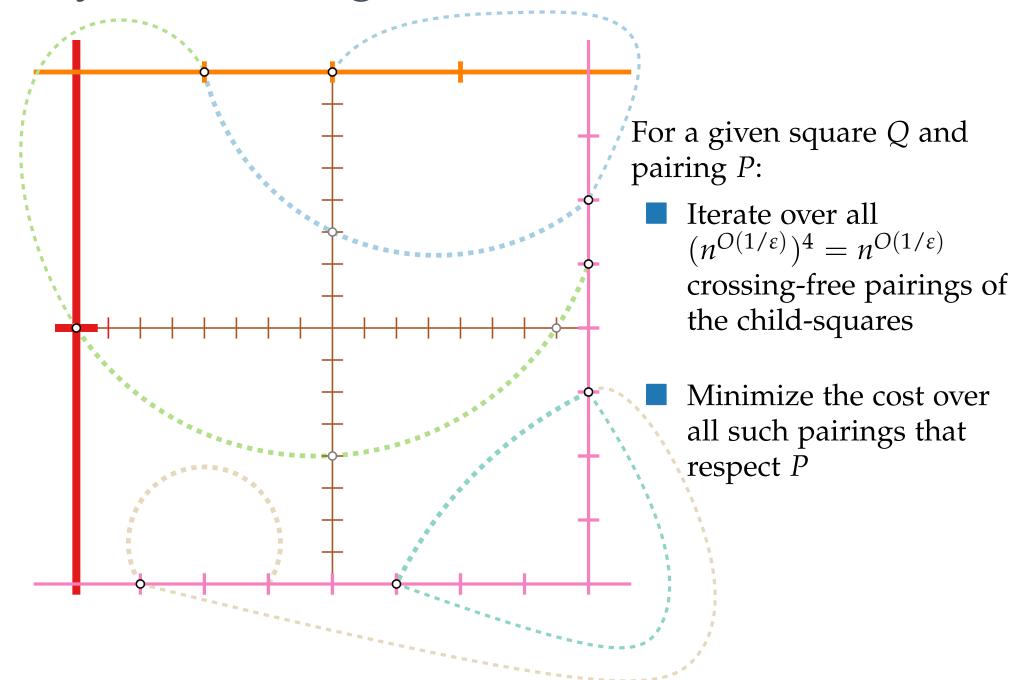


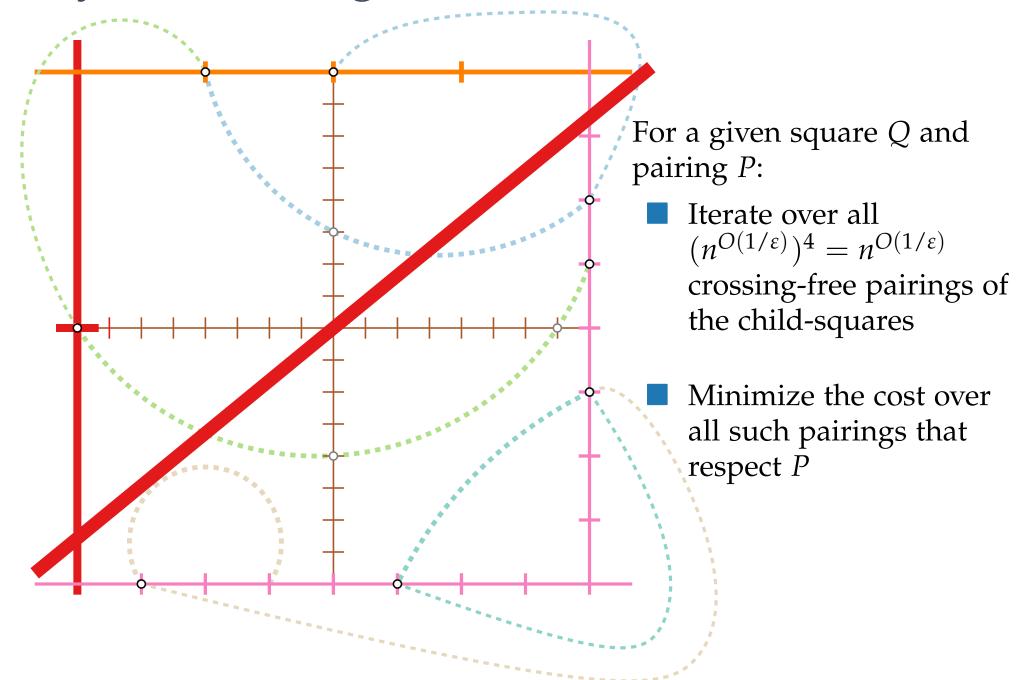
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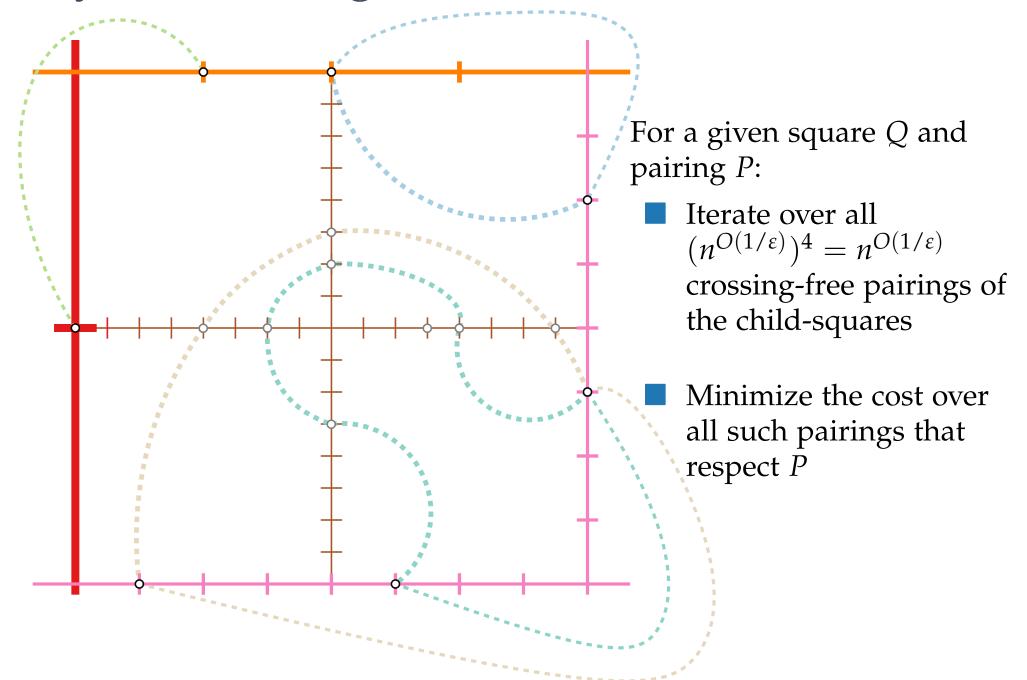
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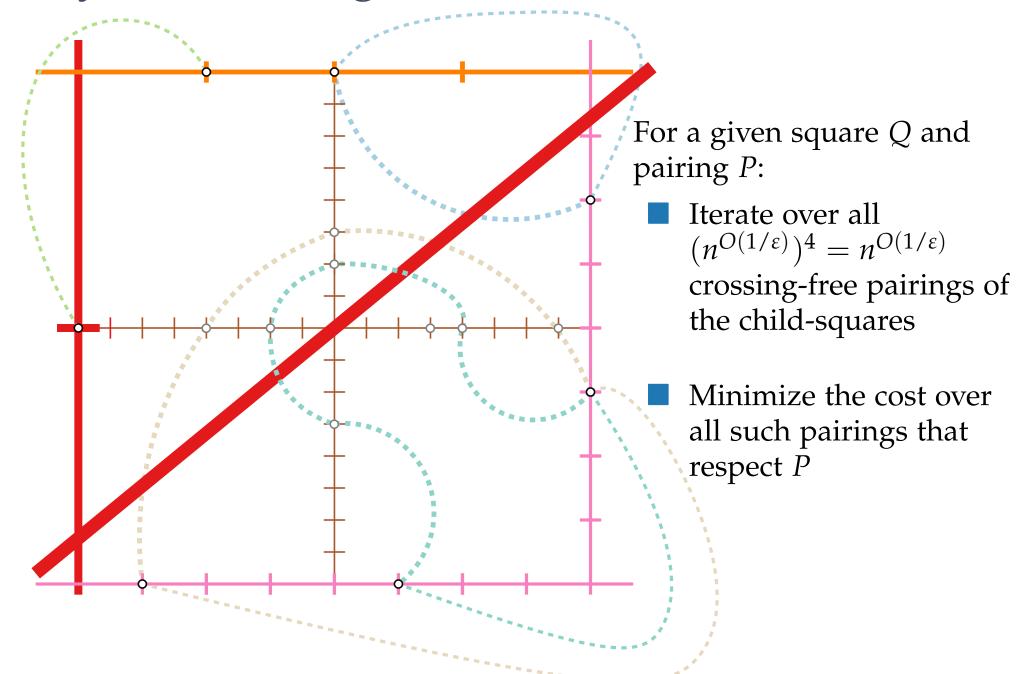


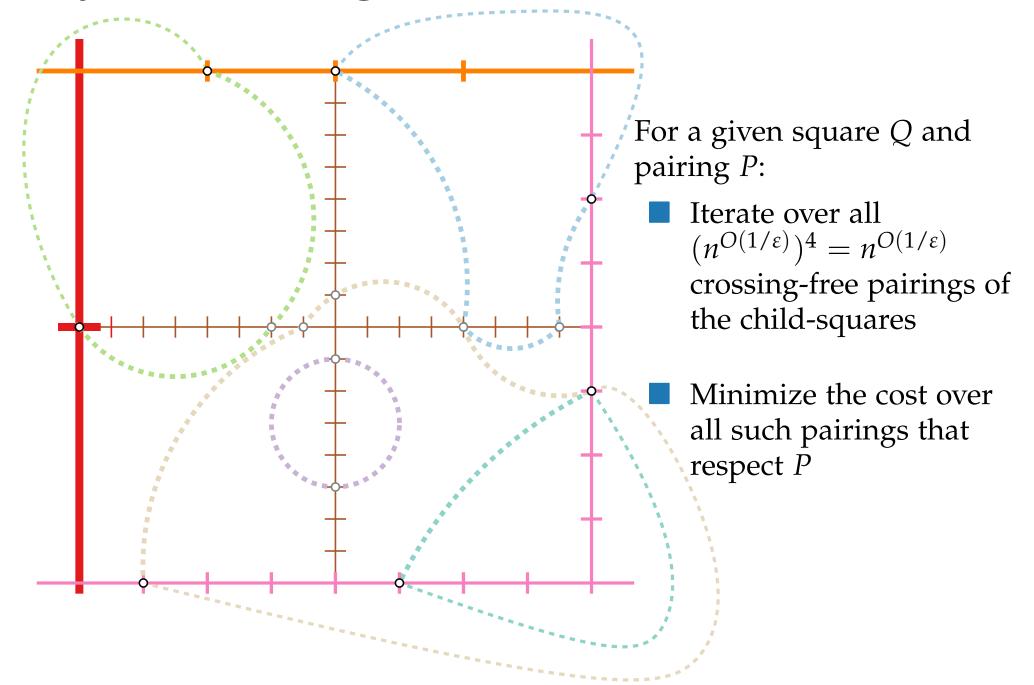


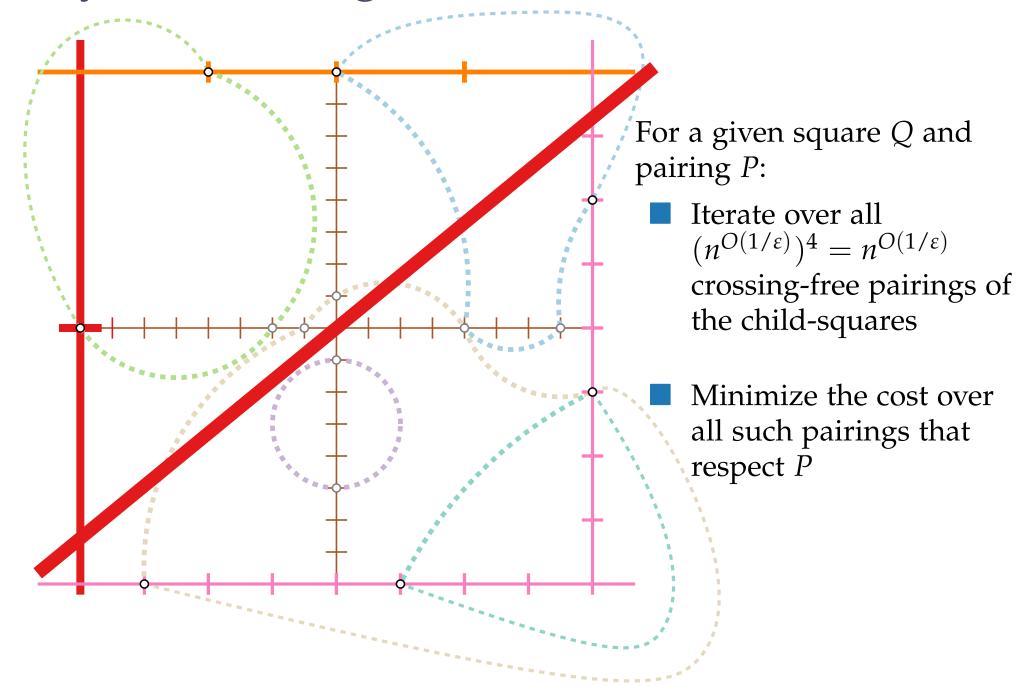


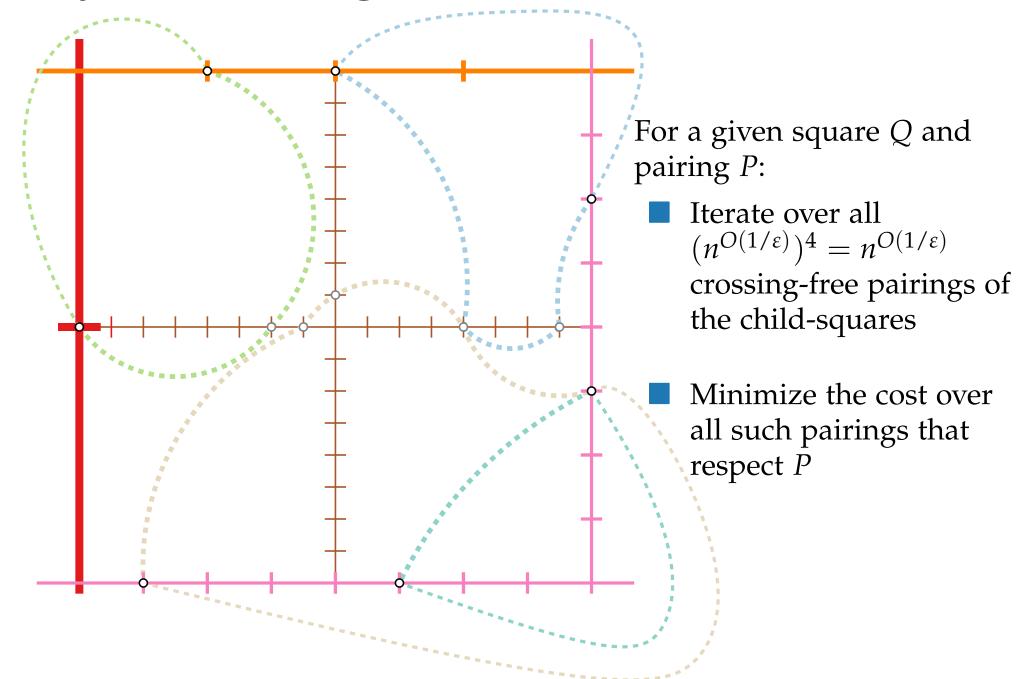


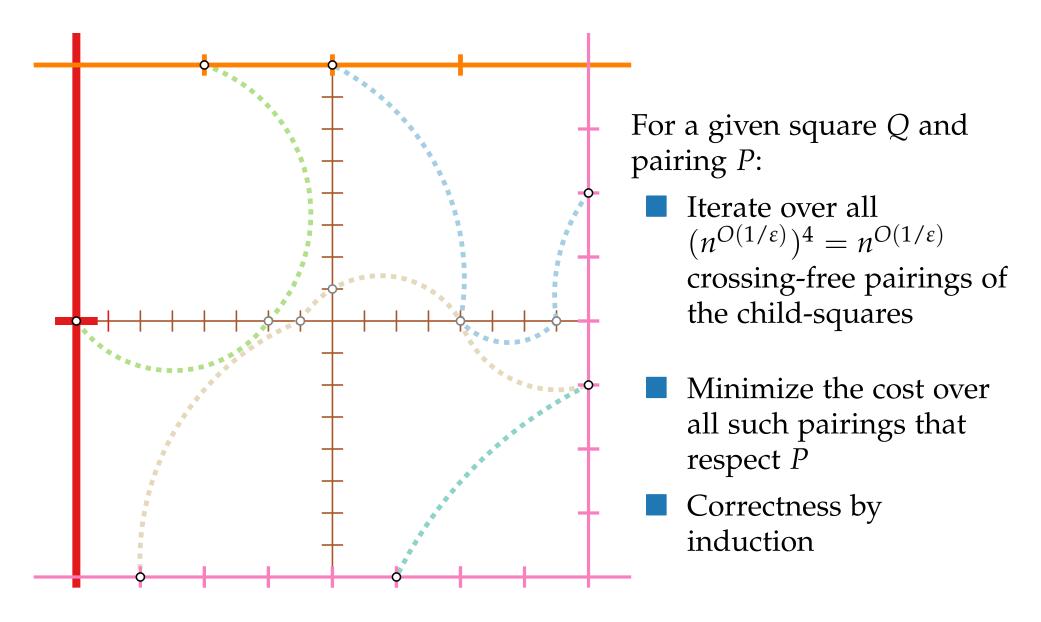




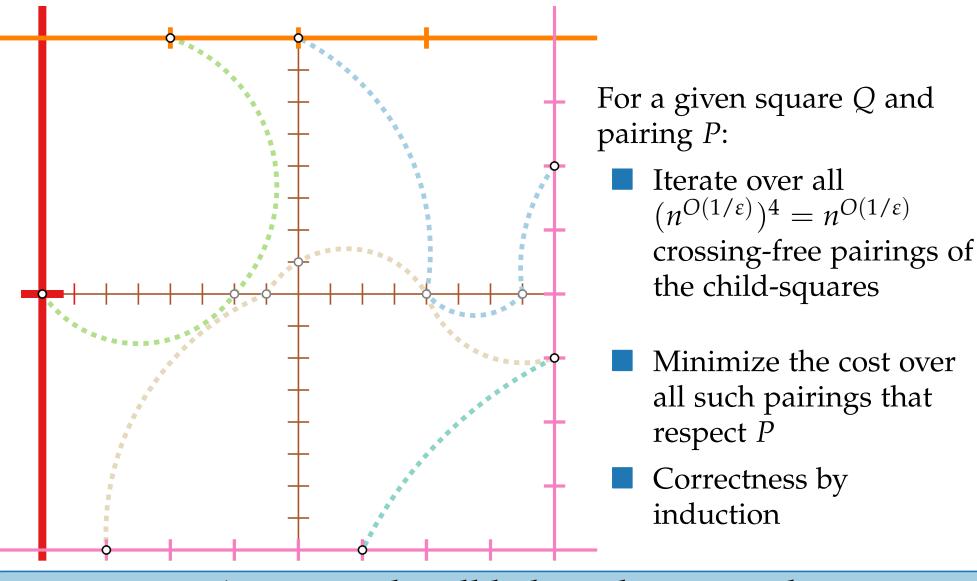








## Dynamic Program (III)

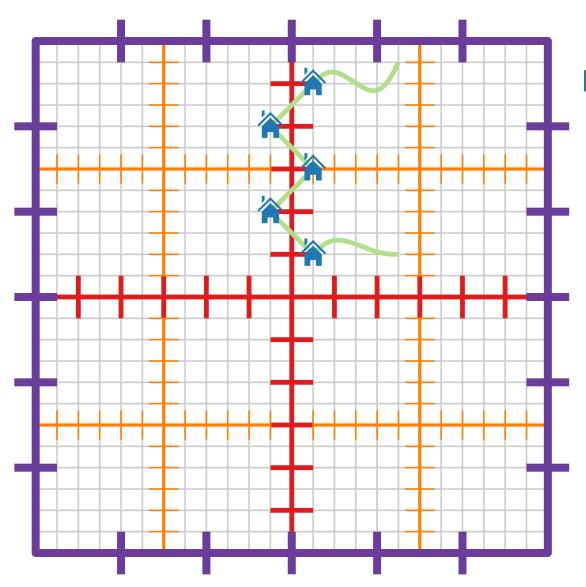


Lemma. An optimal well behaved tour can be computed in  $2^{O(m)} = n^{O(1/\epsilon)}$  time.

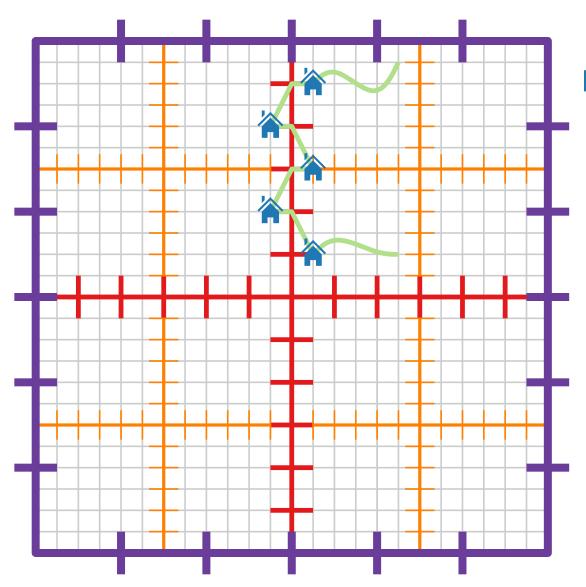
# Approximation Algorithms

Lecture 9: PTAS for EuclideanTSP

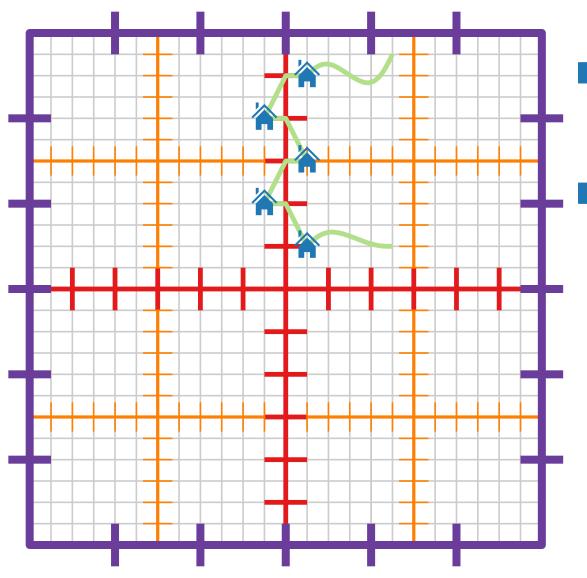
Part V: Shifted Dissections



The best well behaved tour can be a bad approximation.

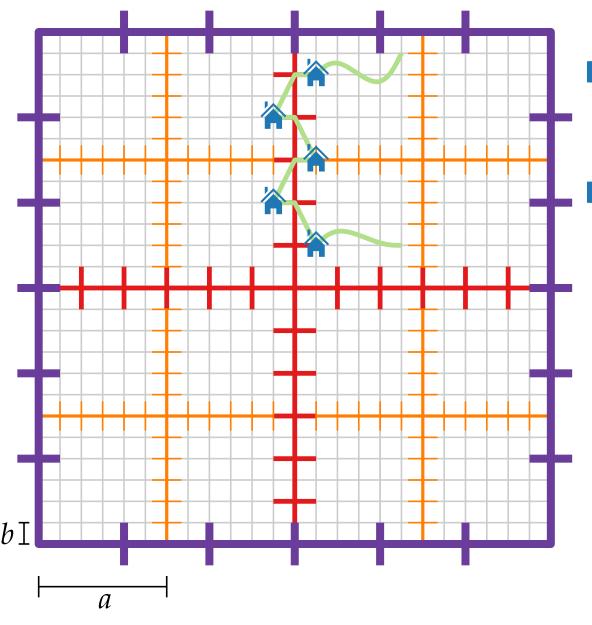


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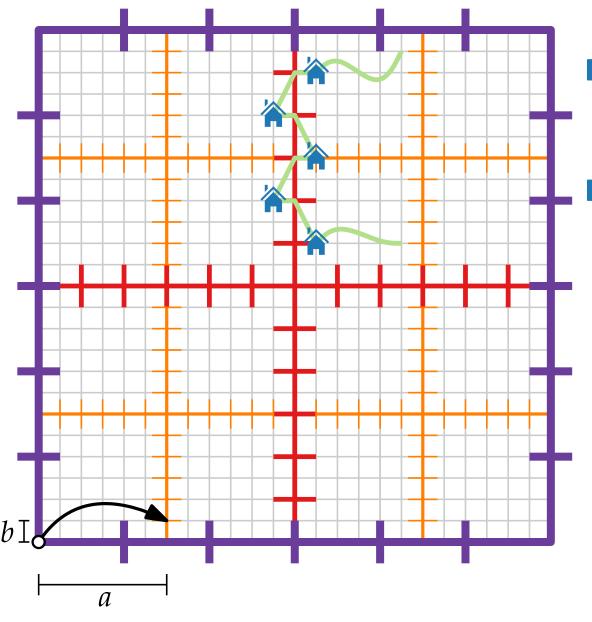
- The best well behaved tour can be a bad approximation.
- Consider an (a, b)-shifted dissection:

$$x \mapsto (x+a) \mod L$$
  
 $y \mapsto (y+b) \mod L$ 



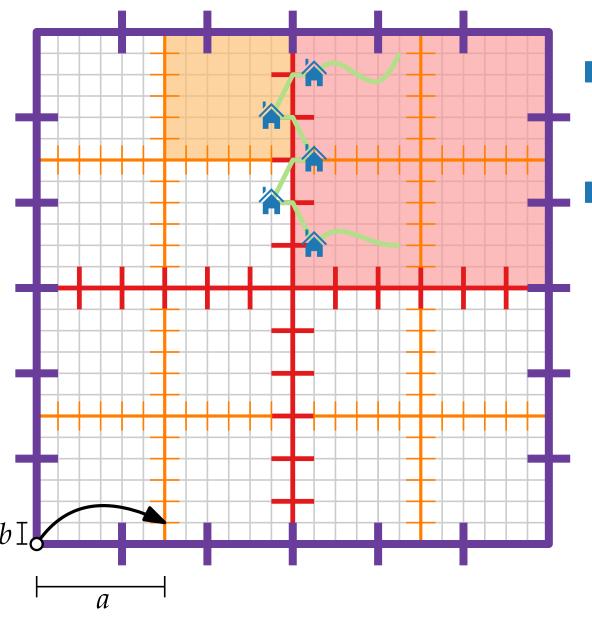
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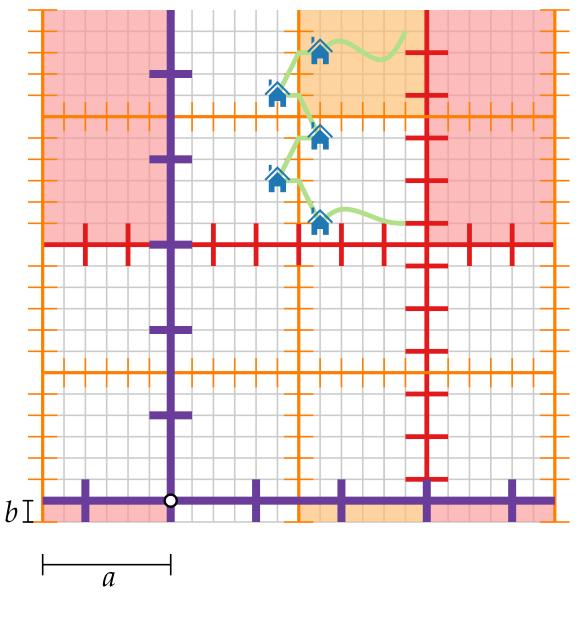
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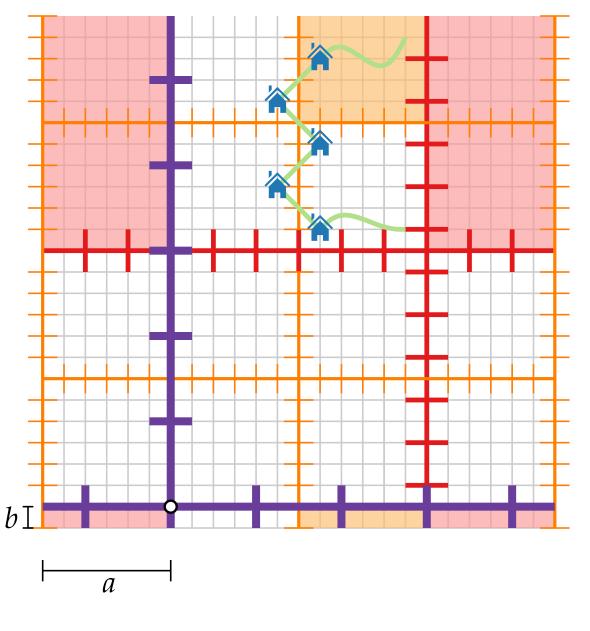
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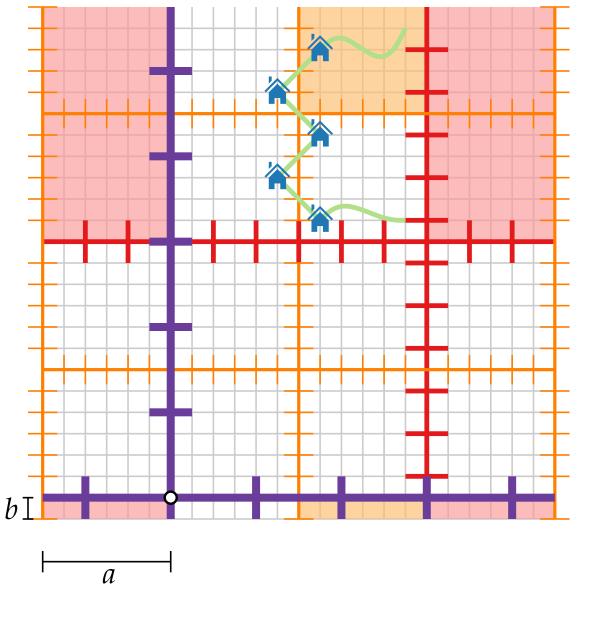
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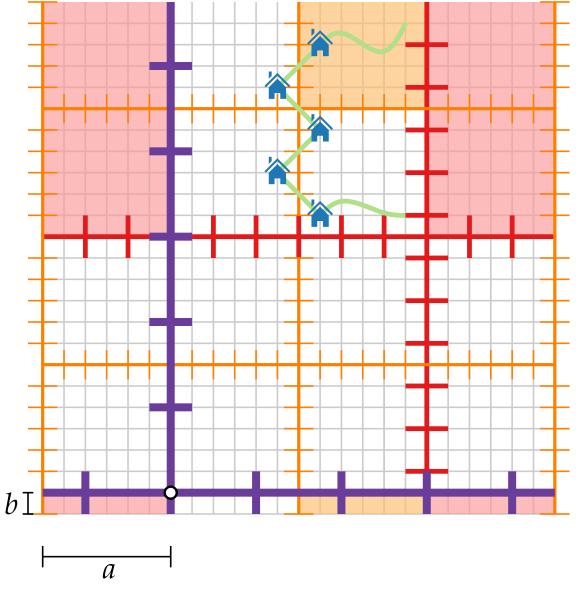
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- Squares in the dissection tree are "wrapped around".
- Dynamic program must be modified accordingly.

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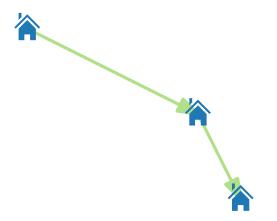


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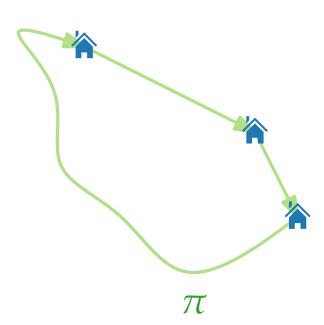


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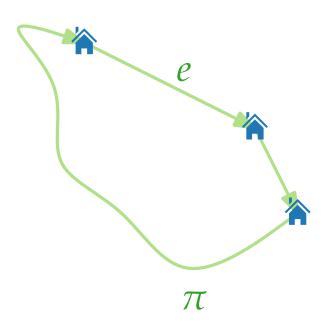
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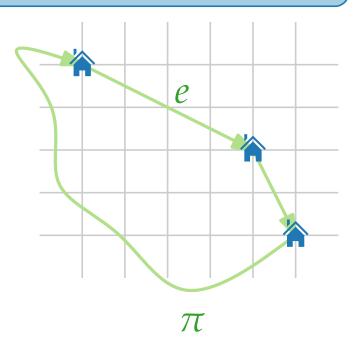
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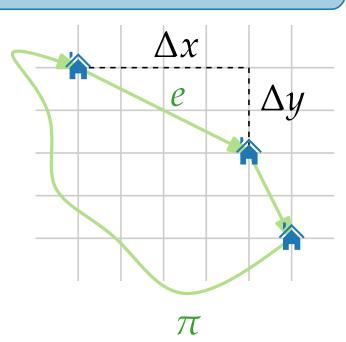
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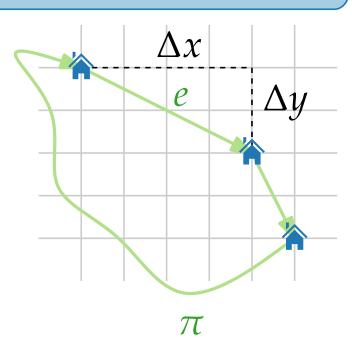
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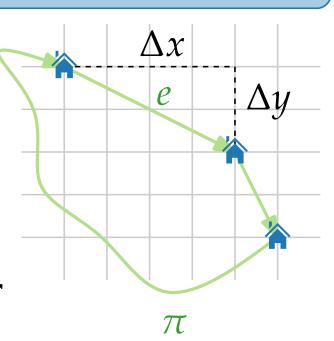
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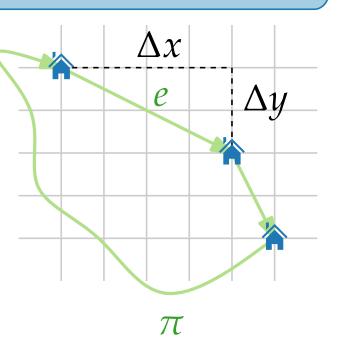


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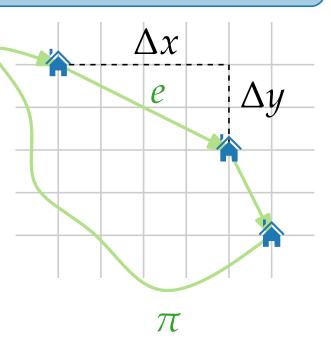
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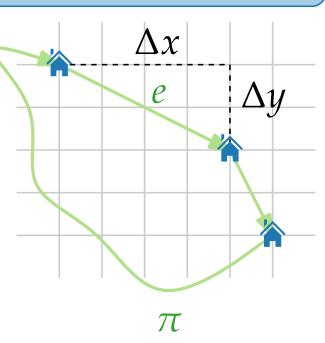


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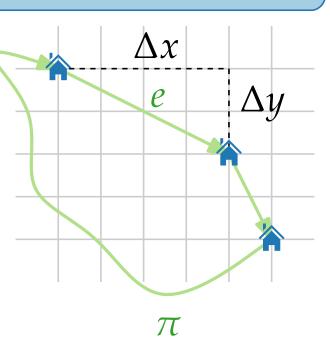


$$N_e^2 \le (\Delta x + \Delta y)^2 \le 2(\Delta x^2 + \Delta y^2) =$$

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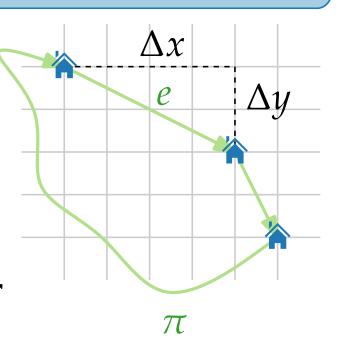


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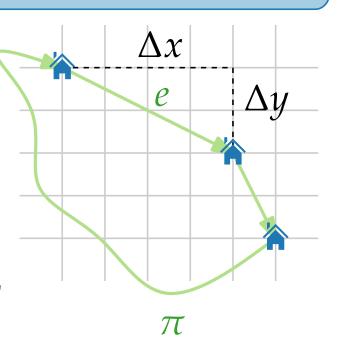
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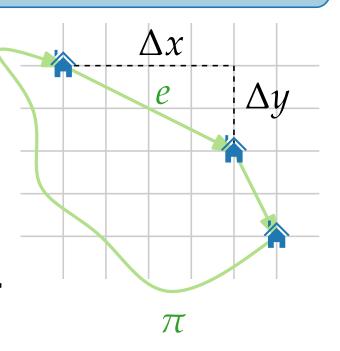
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$$N(\pi) = \sum_{e \in \pi} N_e \le$$

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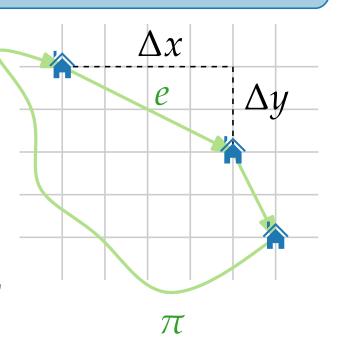
$$N_e^2 \le (\Delta x + \Delta y)^2 \le 2(\Delta x^2 + \Delta y^2) = 2|e|^2.$$

$$N(\pi) = \sum_{e \in \pi} N_e \le \sum_{e \in \pi} \sqrt{2|e|^2}$$

Lemma.

Let  $\pi$  be an optimal tour and  $N(\pi)$  be the number of crossings of  $\pi$  with the lines of the  $(L \times L)$ -grid. Then we have  $N(\pi) \leq \sqrt{2} \cdot \mathsf{OPT}$ .

- Consider a tour as an ordered cyclic sequence.
- Each edge e generates  $N_e \leq \Delta x + \Delta y$  crossings.
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# Approximation Algorithms

Lecture 9: PTAS for EuclideanTSP

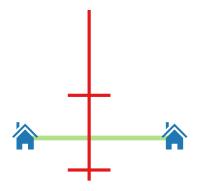
Part VI:
Approximation Factor

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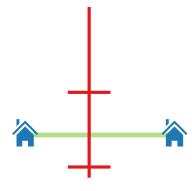
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**Proof.** Consider optimal tour  $\pi$ .



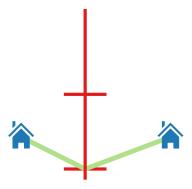
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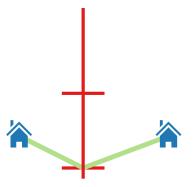
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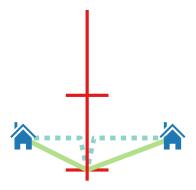
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Summing over all  $N(\pi) \le \sqrt{2} \cdot \text{OPT}$  intersection points, and applying linearity of expectation, provides the claim.

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