

# A Theorem on Subdivision Approximation and Its Application to Obtaining PTAS's for Geometric Optimization Problems

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# A Dedication

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Happy 60<sup>th</sup> Birthday!!



Michael Ian Shamos:

PhD thesis "Computational Geometry", Yale University, 1978



# Motivating Problem: TSP with Neighborhoods

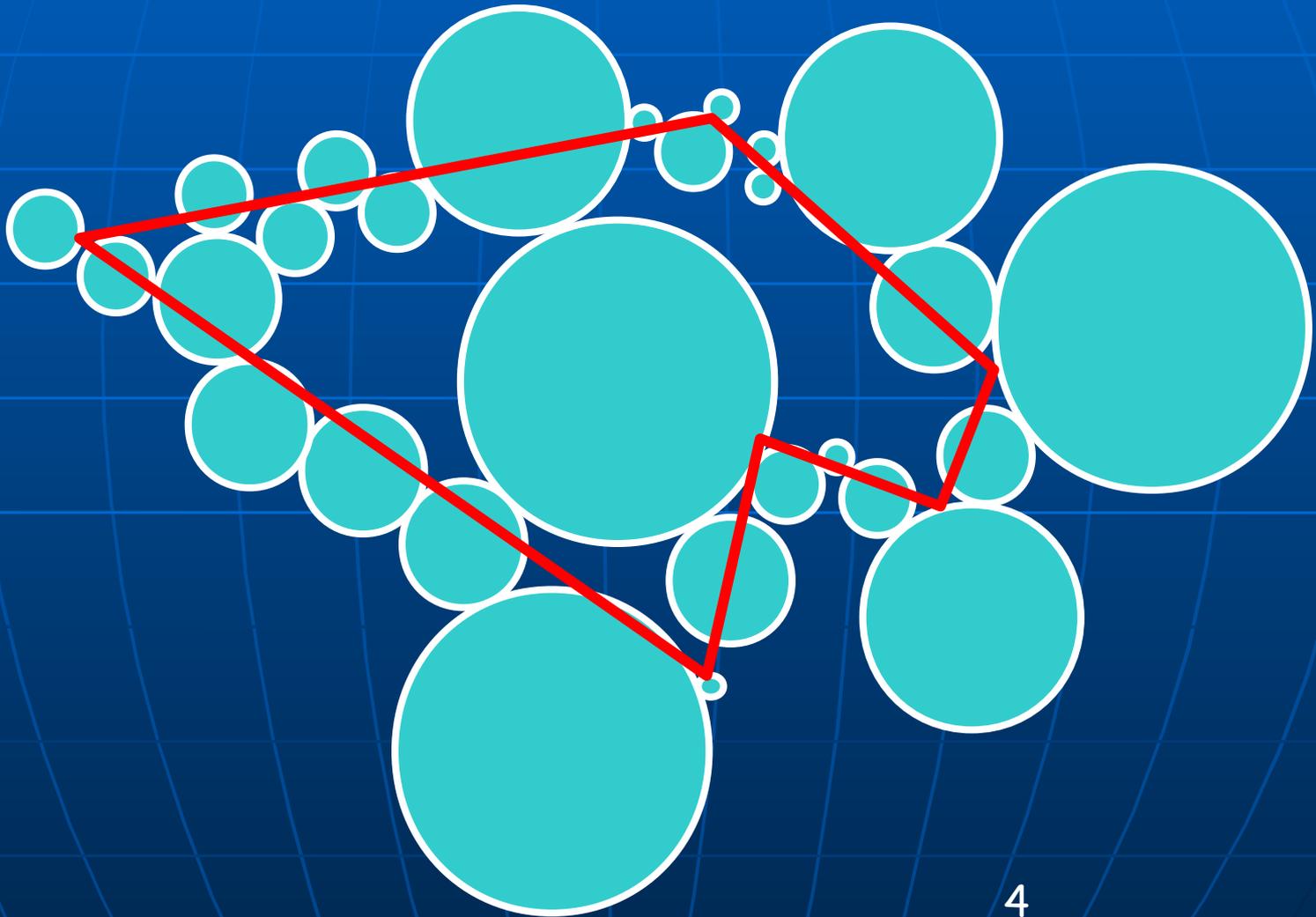
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Find shortest tour to visit a set of neighborhoods  $P_1, P_2, \dots, P_n$

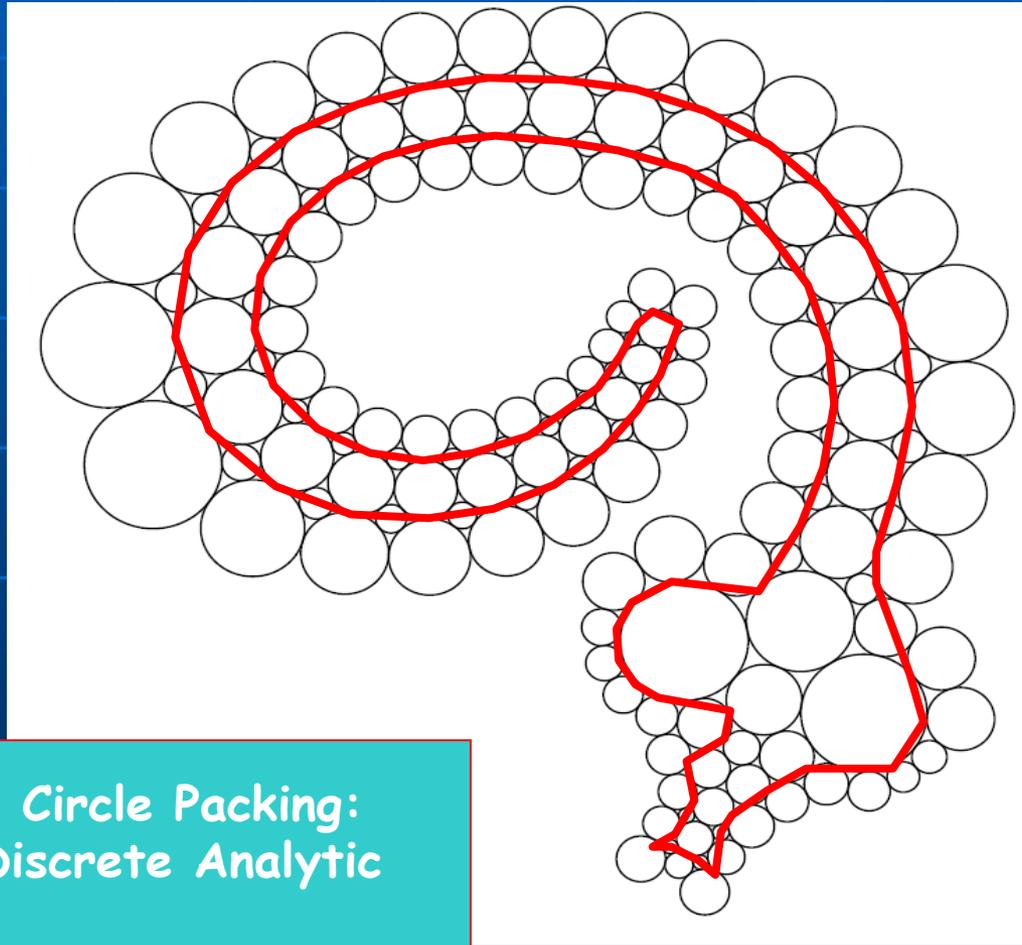
# TSPN for Disk Packing

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# TSPN in a Circle Packing

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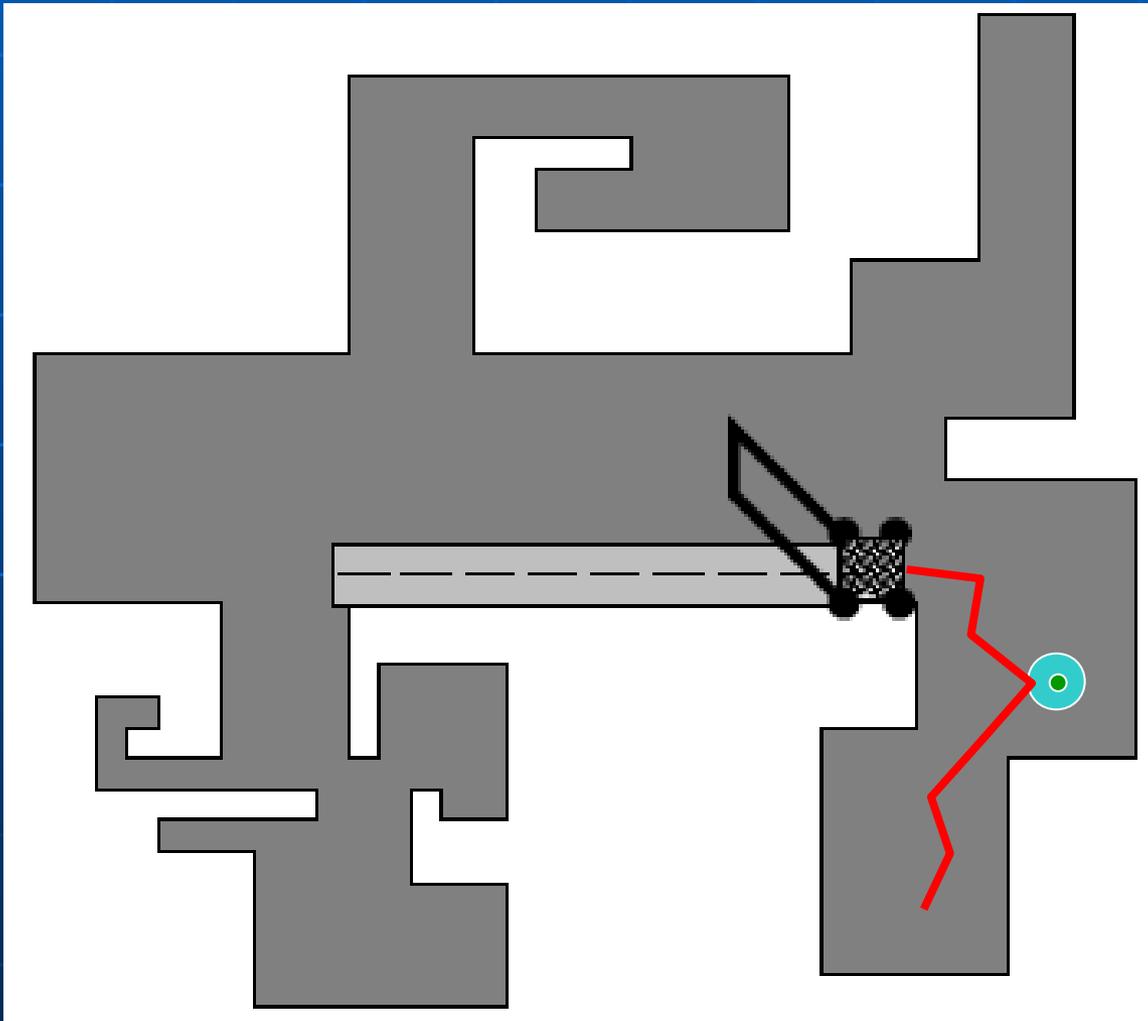


"Introduction to Circle Packing:  
the Theory of Discrete Analytic  
functions"

by Ken Stephenson

# Another (Springtime) Motivation

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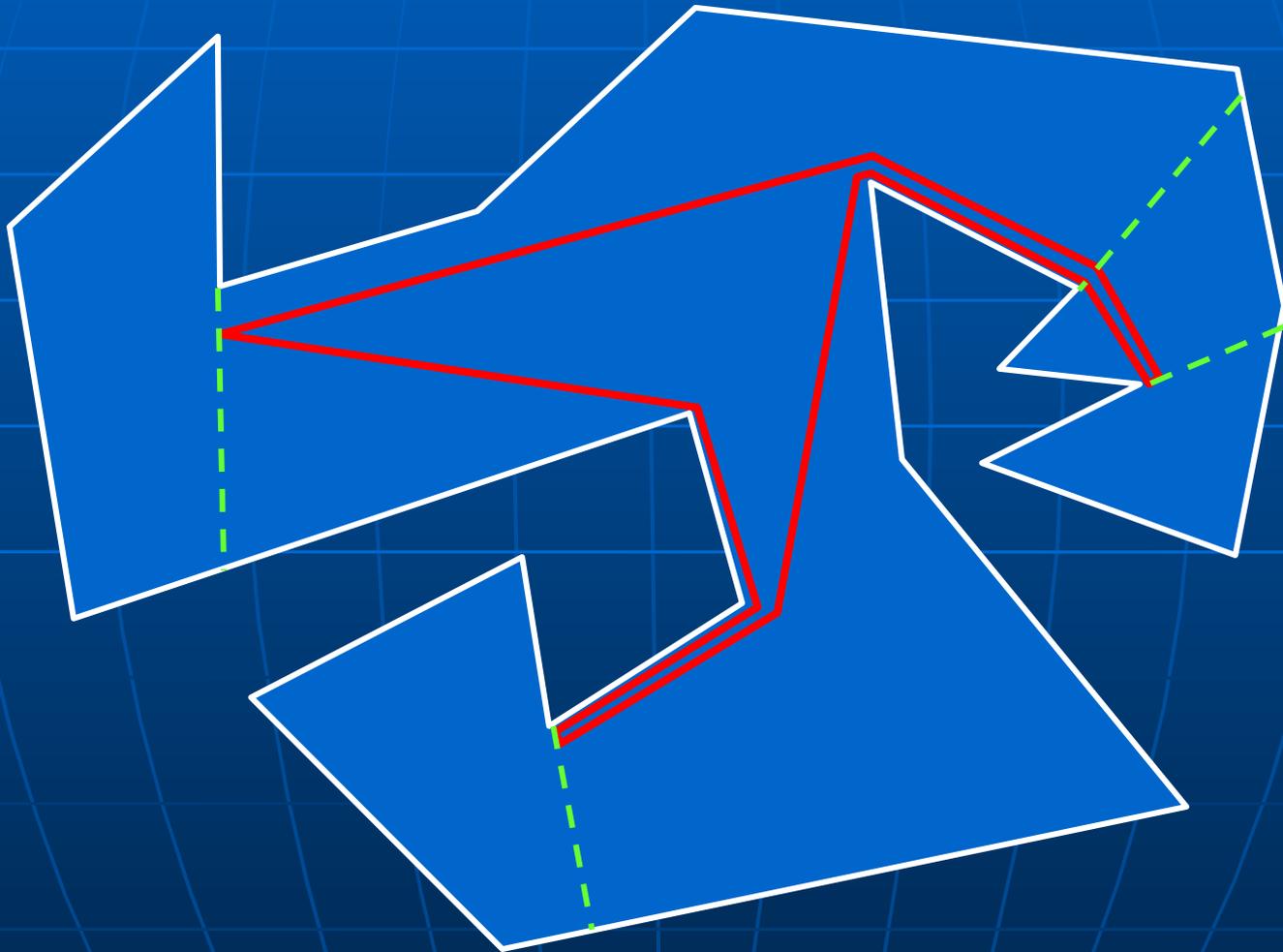


Best method of mowing the lawn?

TSPN: Visit the disk centered at each blade of grass

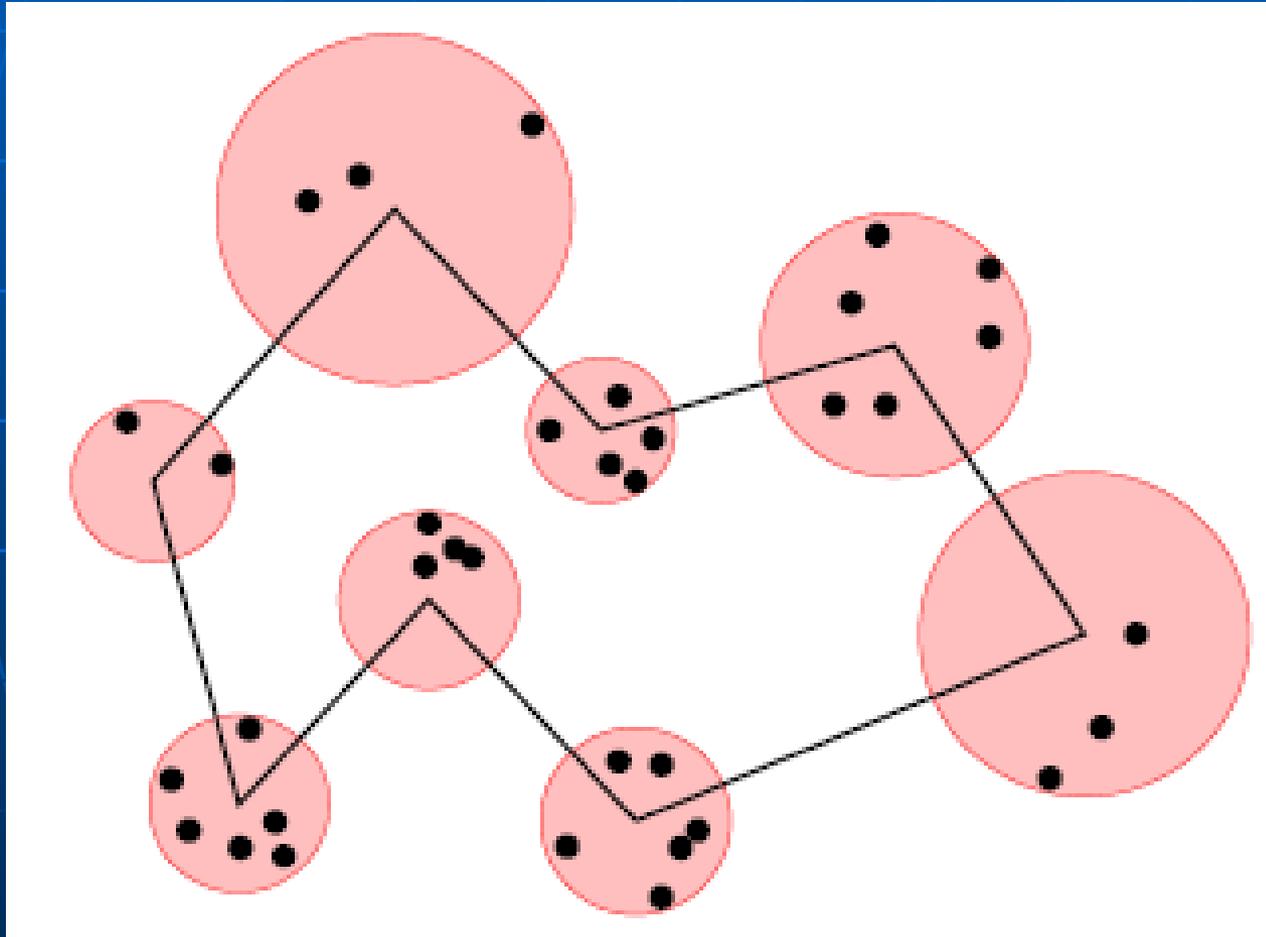
# Watchman Route Problem

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# Sensor Network Application: Cover Tour Problem

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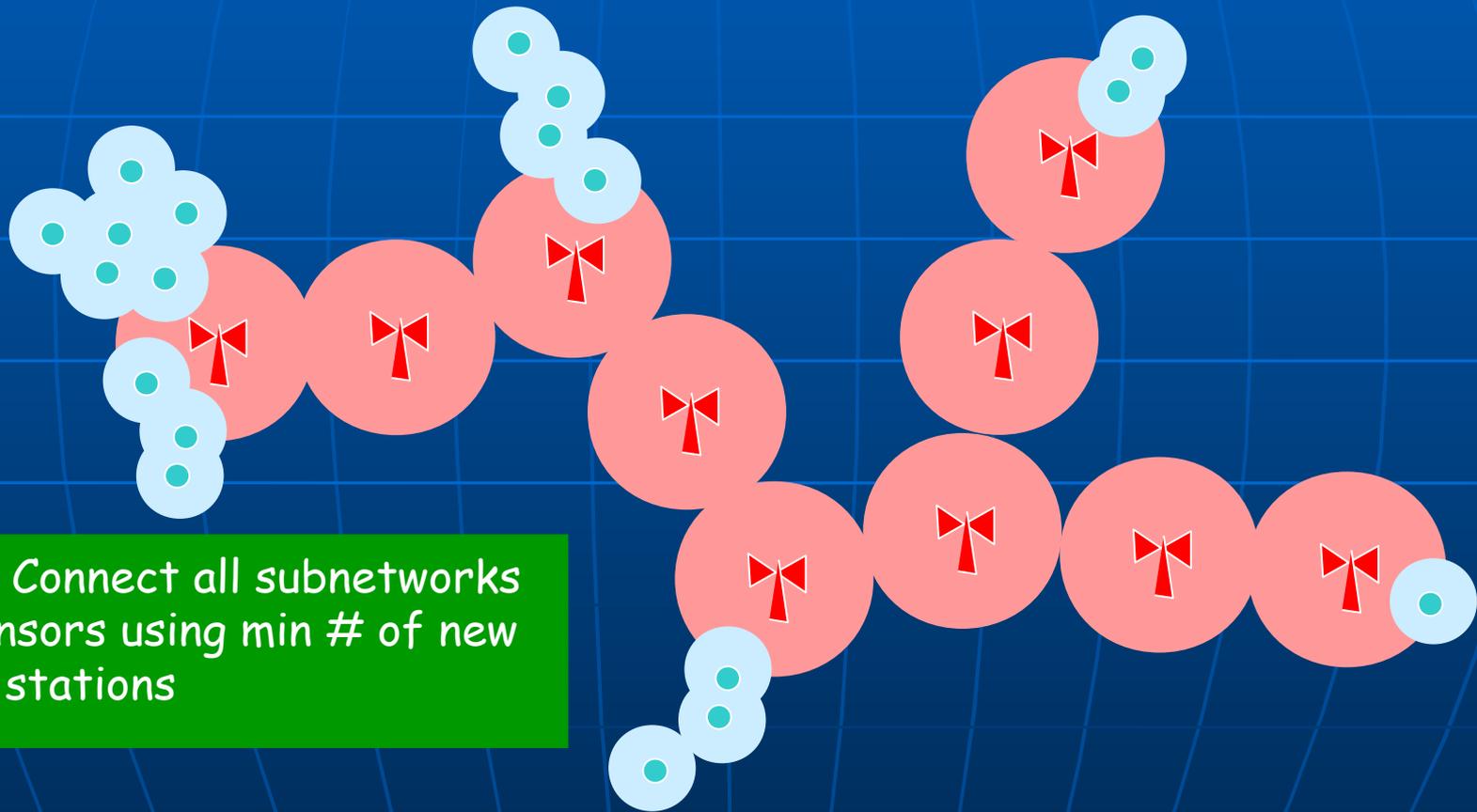


Min: Tour length +  
 $C * (\text{sum of radii})$

Alt, Arkin, Bronnimann, Erickson, Fekete,  
Knauer, Lenchner, Mitchell, Whittlesey, SoCG'06

# Sensor Network Application: Minimizing # Relay Stations

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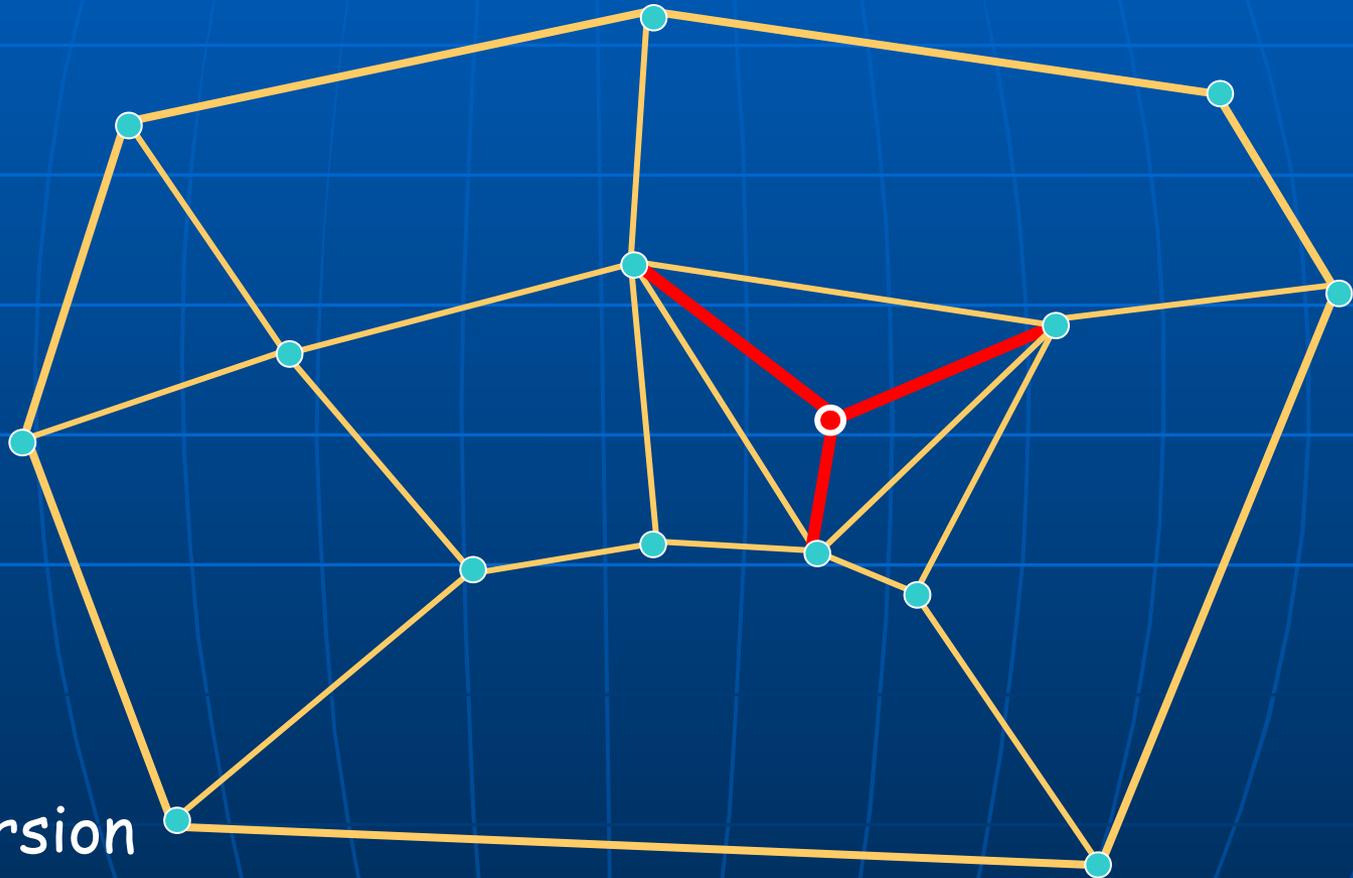
**Goal:** Connect all subnetworks of sensors using min # of new relay stations

New result: PTAS

Efrat, Fekete, Mitchell 2007 9

# Min-Weight Convex Subdivision

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Steiner version

Special Case: Min-weight (Steiner) triangulation

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# Approximation Algorithms

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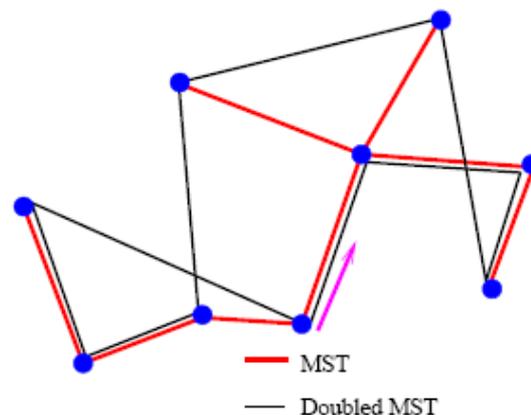
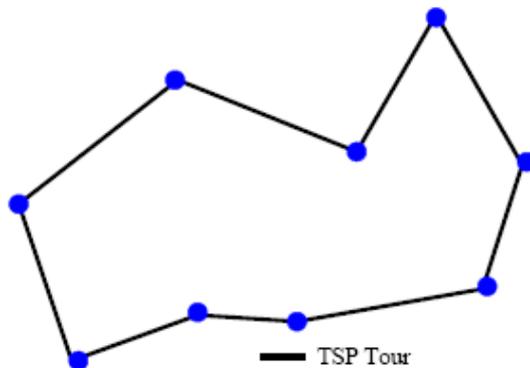
*c*-approximation: cost at most  $c$  times optimal, for a minimization problem ( $c > 1$ )

*Polynomial Time Approximation Scheme (PTAS)*: method giving  $(1 + \epsilon)$ -approx to the optimal (minimum), in time polynomial in  $n$ , for *any* fixed  $\epsilon > 0$ .

Dependence on  $\epsilon$  may be exponential in  $(1/\epsilon)$ ; else **FPTAS**

# Background on TSP

- $S =$  set of  $n$  points in  $\mathbb{R}^d$
- NP-hard
- $n^{O(n^{1-1/d})}$  exact (subexponential) [SmWo98]
- Simple 2-approx: double the MST and shortcut (holds in metric spaces)



- Christofides: 1.5-approx  
(use  $\text{MST} \cup$  min-weight **matching** on odd-degree nodes of MST)

# PTAS for Geometric TSP

- $O(n^{O(1/\epsilon)})$  in  $\mathbb{R}^2$  [Ar96,Mi96]
- $O(n^{O(1)})$  in  $\mathbb{R}^2$  [Mi97]
- $O(n(\log n)^{O(\frac{d}{\epsilon})^{d-1}})$  expected ( $O(n^{d+1}polylog)$  det.) [Ar97]
- $O(n \log n)$  deterministic [RaSm98]  
Idea:  $t$ -spanners and “ $t$ -banyons”
- NP-hard to get  $(1 + \epsilon)$ -approx in  $\mathbb{R}^{O(\log n)}$ , for some  $\epsilon > 0$  [Tr97]
- MAX-SNP-hard in metric spaces  
No  $c$ -approx for  $c < 129/128$  ( $c < 41/40$ , asym.) [PV99]

# TSPN Recent Result [SODA'07]

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- TSPN has a PTAS for regions/neighborhoods that are “fat”, disjoint (or sufficiently disjoint) connected regions in the plane
- Applies also to “MST with neighborhoods”, Steiner MSTN, and many related problems

PTAS = Polynomial-Time Approximation Scheme =  $(1+\epsilon)$ -approx, any  $\epsilon > 0$

# Background on TSPN

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Generalizes 2D Euclidean TSP (thus, NP-hard)

Introduced by [Arkin & Hassin, 1994]

- “obvious” heuristics do not work:
  - TSP approx on centroids (as representative points)
  - Greedy algorithms (Prim- or Kruskal-like)
- $O(1)$ -approx, time  $O(n + k \log k)$ , for “nice” regions:
  - Parallel unit segments
  - Unit disks
  - Translates of a polygon  $P$
- Combination Lemma

# General Connected Regions

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$O(\log k)$ -approx

[Mata & M, SoCG'95]

Use guillotine rectangular subdivisions, DP  
(*non* - disjoint: regions may overlap)

- $O(n^5)$  time

[Mata & M, SoCG'95]

- $O(n^2 \log n)$

[Gudmundsson & Levcopoulos, 1999]

$k = \#$  regions

$n = \#$  vertices of all regions

# $O(1)$ -Approximations

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- Unit disks, parallel unit segments, translates of  $P$   
[Arkin & Hassin, 1993]
- Connected regions of comparable size  
[Dumitrescu & M, SODA'01]
- Disjoint fat regions of *any* size [de Berg, Gudmundsson, Katz, Levcopoulos, Overmars, van der Stappen, ESA'02]
- Discrete point sets within disjoint, fat, *non-convex* regions  
[Elbassioni, Fishkin, Mustafa, Sitters, ICALP'05]
- *Non* - disjoint, convex, fat, comparable size  
[Elbassioni, Fishkin, Sitters, ISAAC'06]

# PTAS: $O(1+\epsilon)$ -Approximations

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- Disjoint (or nearly disjoint) fat regions of comparable size  
[Dumitrescu & M, SODA'01]
- Point clusters within disjoint fat regions of comparable size in  $\mathbb{R}^d$   
[Feremans, Grigoriev, EWCG'05]

New: PTAS for disjoint (or nearly disjoint) fat regions of *arbitrary* sizes.

Def:  $P$  is **fat** if  $\text{area}(P) = \Omega(\text{diam}^2(P))$

Weaker notion than usual "fatness"8

# Related Work: APX-hardness

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- General connected regions (overlapping):

- No  $c$ -approx with  $c < 391/390$ , unless  $P=NP$

[de Berg, Gudmundsson, Katz, Levcopoulos, Overmars, van der Stappen, ESA'02]

(from *MinVertexCover*)

- No  $c$ -approx with  $c < 2$ , unless  $P = TIME(n^{O(\log \log n)})$

[Safra, Schwartz, ESA'03]

(from *Hypergraph VertexCover*)

- Line segments, comparable length

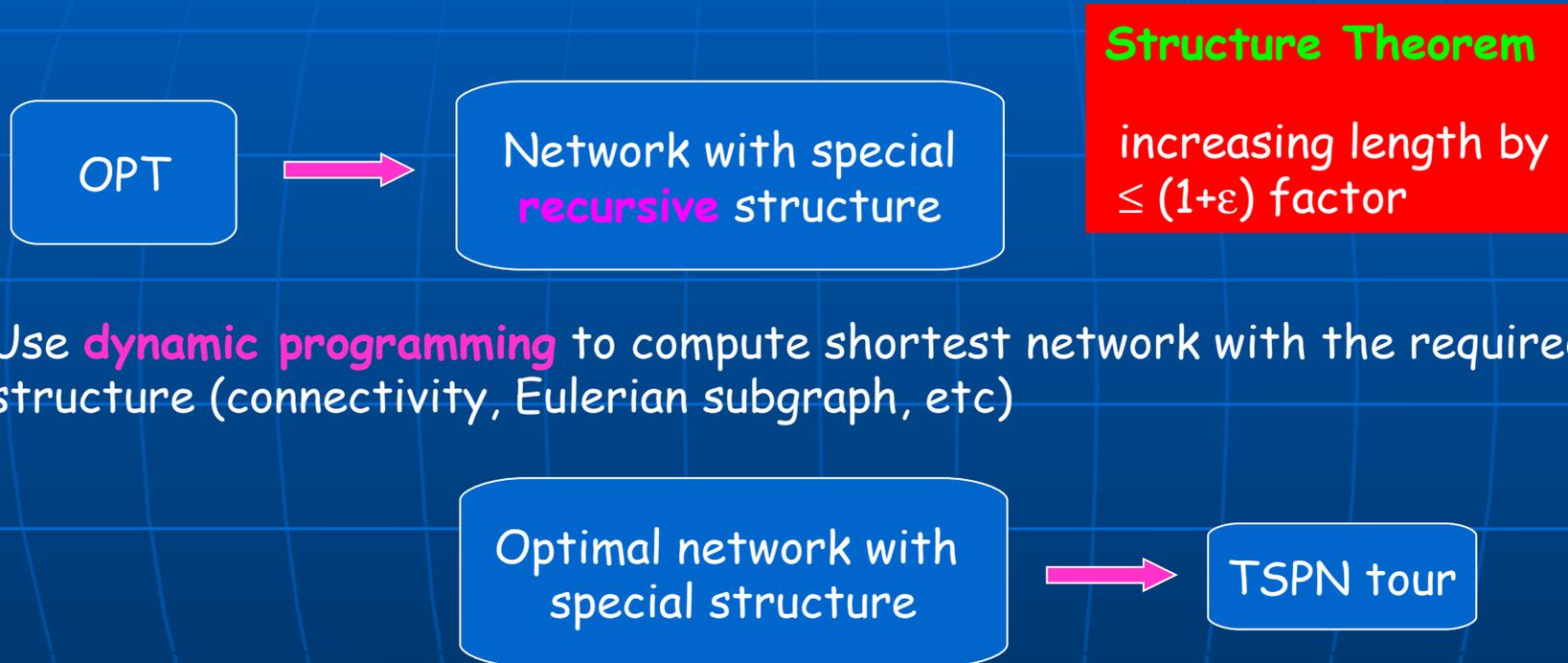
[Elbassioni, Fishkin, Sitters, ISAAC'06]

- Pairs of points (disconnected)  
2004]

[Dror, Orlin,



# Recipe for PTAS



Use **dynamic programming** to compute shortest network with the required structure (connectivity, Eulerian subgraph, etc)

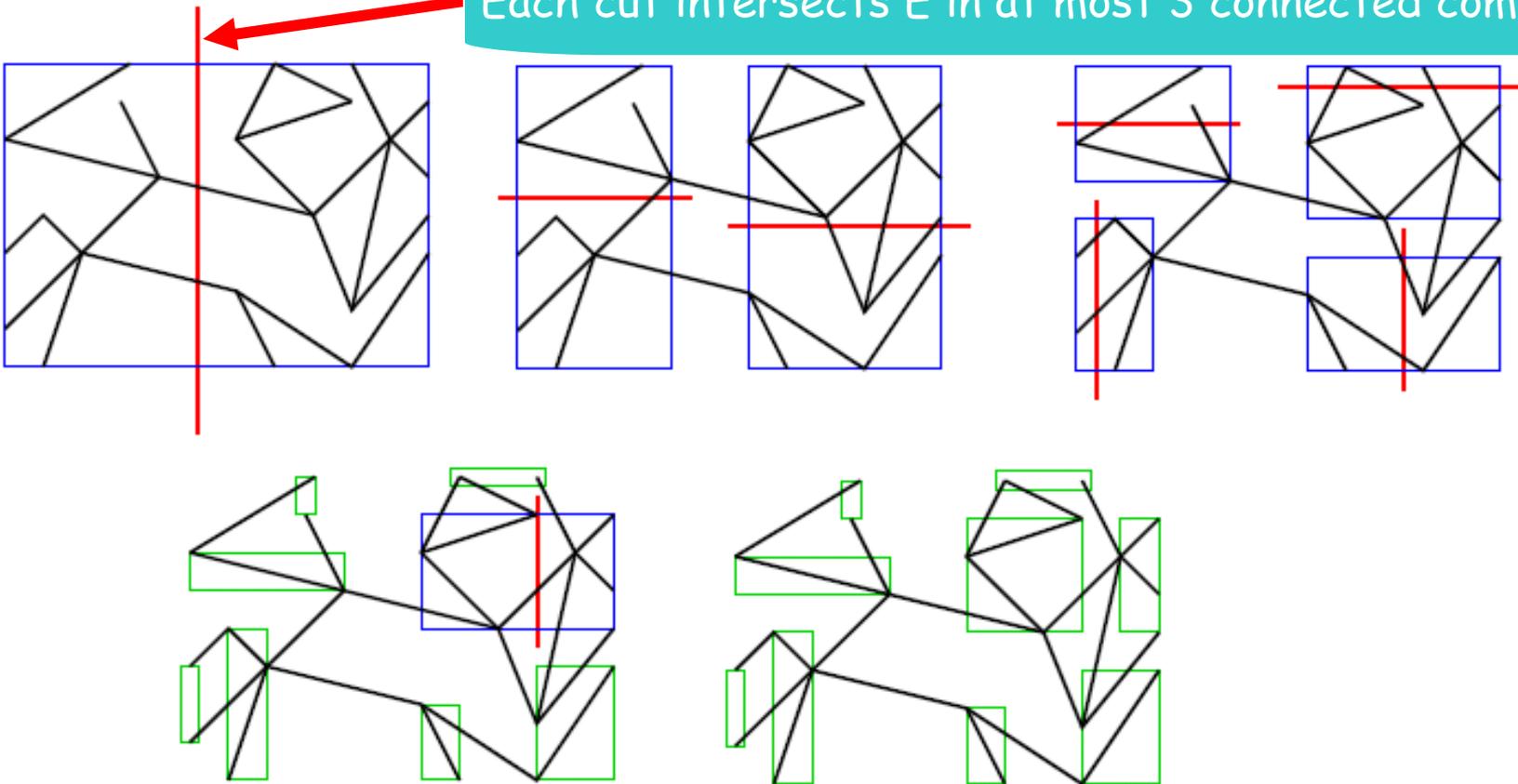
What should the special recursive structure be?

# m-Guillotine Structure

Network edge set  $E$  is  $m$ -guillotine if it can be recursively partitioned by horiz/vertical cuts, each having small ( $O(m)$ ) complexity wrt  $E$

**Example:** 3-guillotine

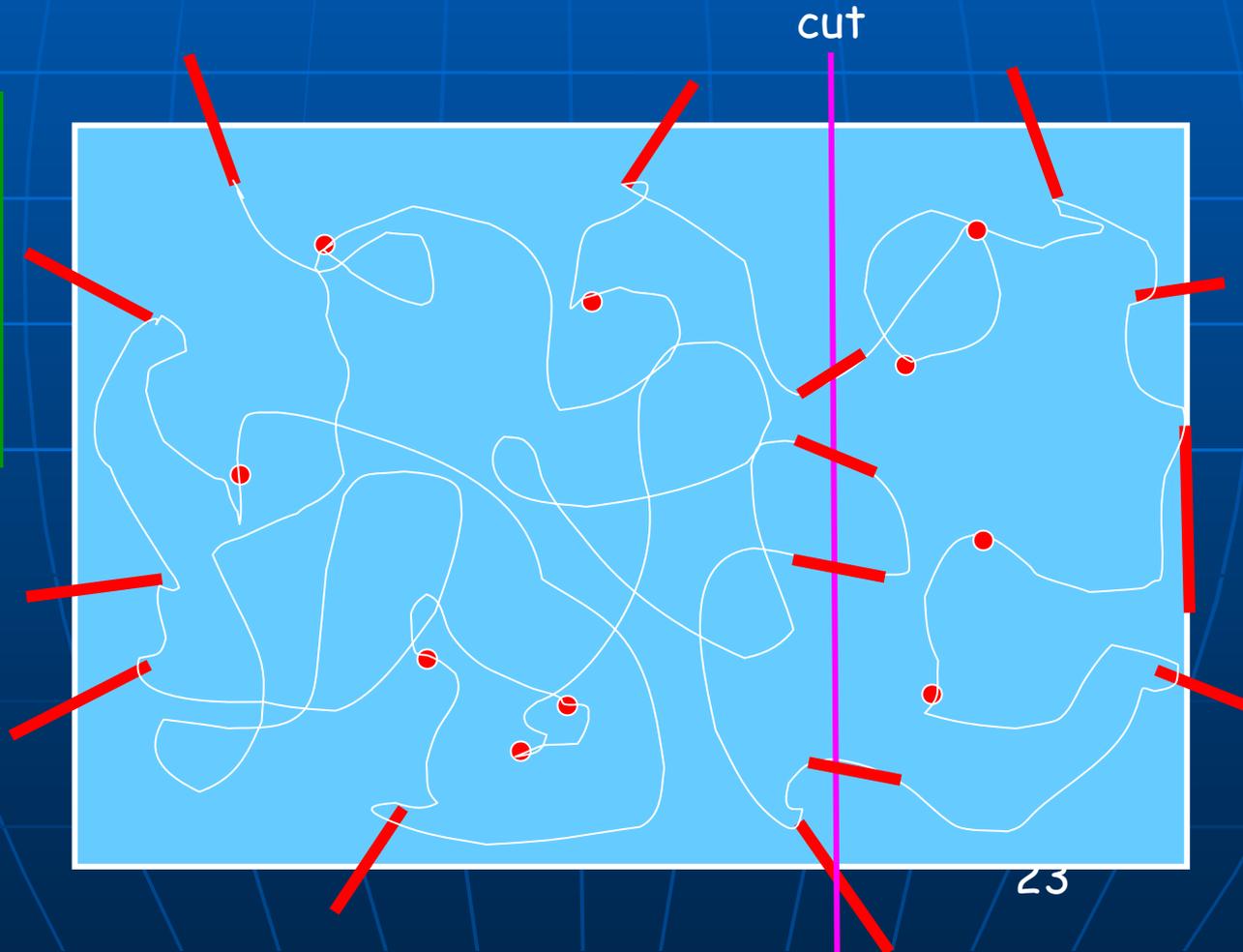
Each cut intersects  $E$  in at most 3 connected components



# Desired Recursive Structure

Rectangular subproblem in dynamic program (recursion)

Constant  
( $O(m)$ )  
information  
flow across  
boundary



# m-Guillotine Structure Theorem

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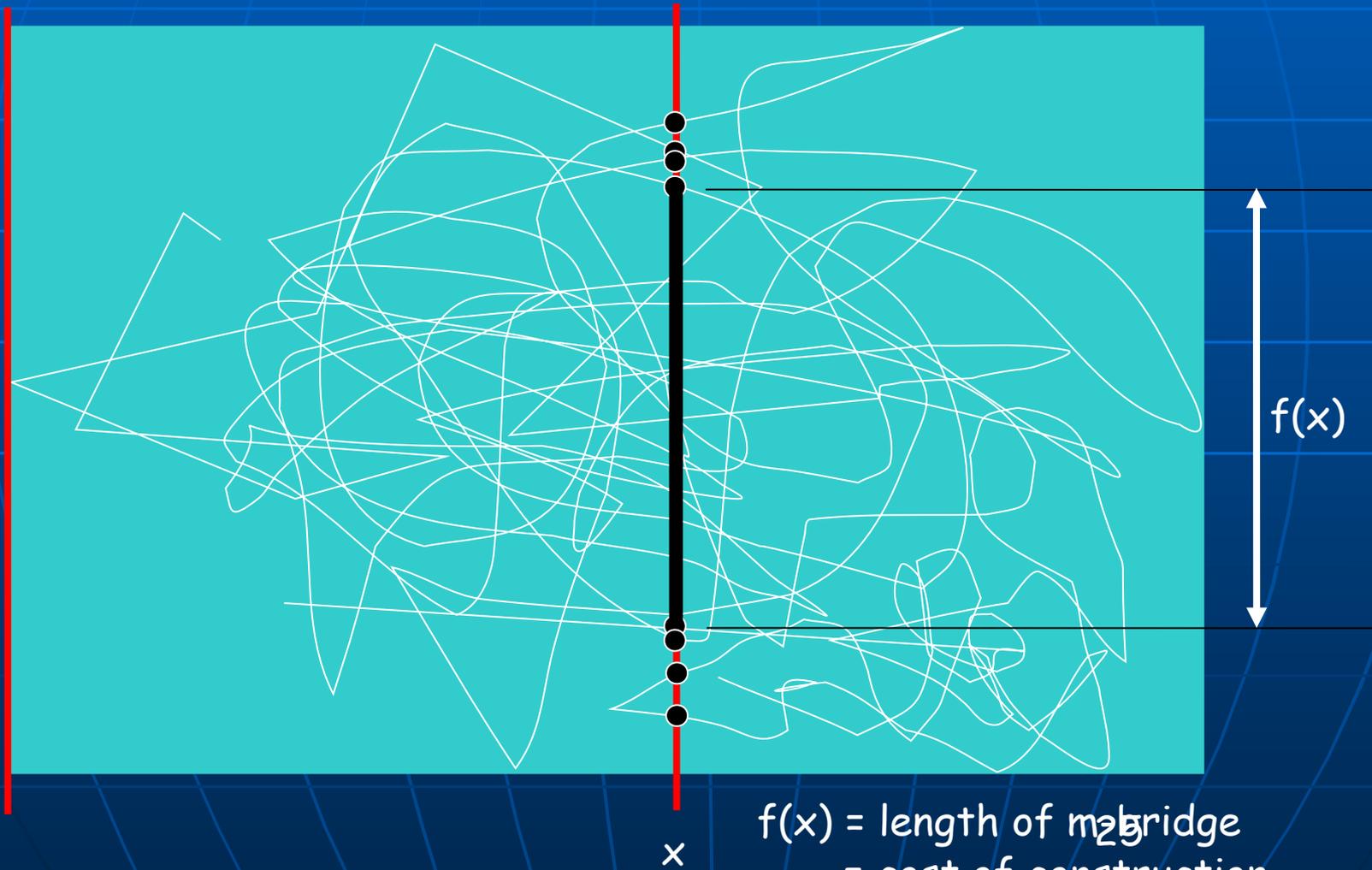
Any set  $E$  of edges of length  $L$  can be made to be  $m$ -guillotine by adding length  $O(L/m)$  to  $E$ , for any positive integer  $m$ .

Proof is based on a simple charging scheme.



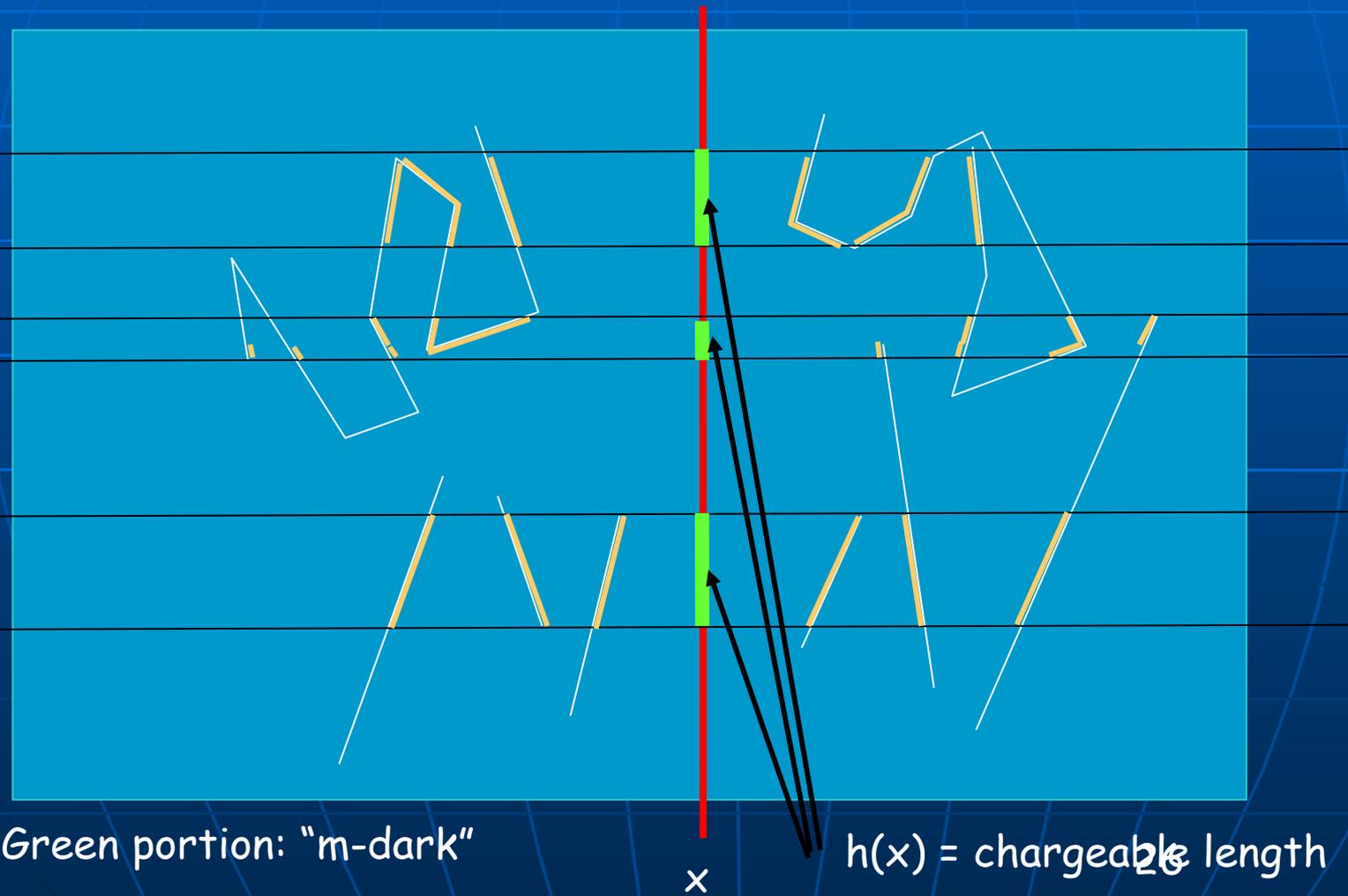
While this “scribble” may not be  $m$ -guillotine, it is “close” in that it can be made  $m$ -guillotine by adding only  $(1/m)$ th of its length

# Possible Vertical Cuts



$f(x)$  = length of bridge  
= cost of construction

# Paying for the Bridge Construction: The Chargeable Length



# Charging Scheme

- Let  $f(x)$  = length of  $m$ -span of vertical line through  $x$   
Let  $g(y)$  = length of  $m$ -span of horizontal line through  $y$

- Then,

$$A_x = \int f(x)dx$$

is simply the area of the “ $m$ -dark” ( RED ) region wrt horiz cuts

Similarly,

$$A_y = \int g(y)dy$$

is the area of the “ $m$ -dark” ( BLUE ) region wrt vertical cuts

- Assume, WLOG, that  $A_x \geq A_y$

- Thus, for  $h(y)$  = length of  $m$ -dark, for horiz line through  $y$ ,

$$A_x = \int h(y)dy \geq \int g(y)dy = A_y > 0$$

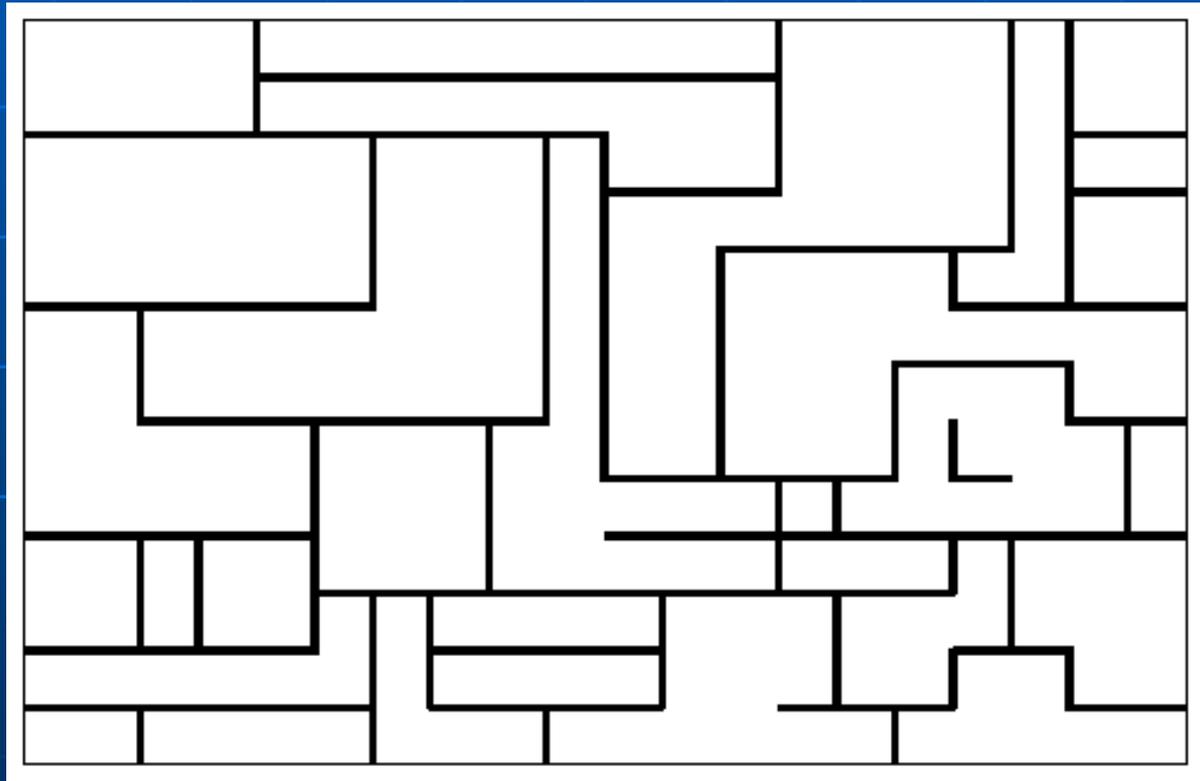
So,  $\exists y^*$  for which  $h(y^*) \geq g(y^*)$ ;

i.e.,  $\exists$  a horiz line through  $y^*$  whose  $m$ -dark portion  $\geq m$ -span.

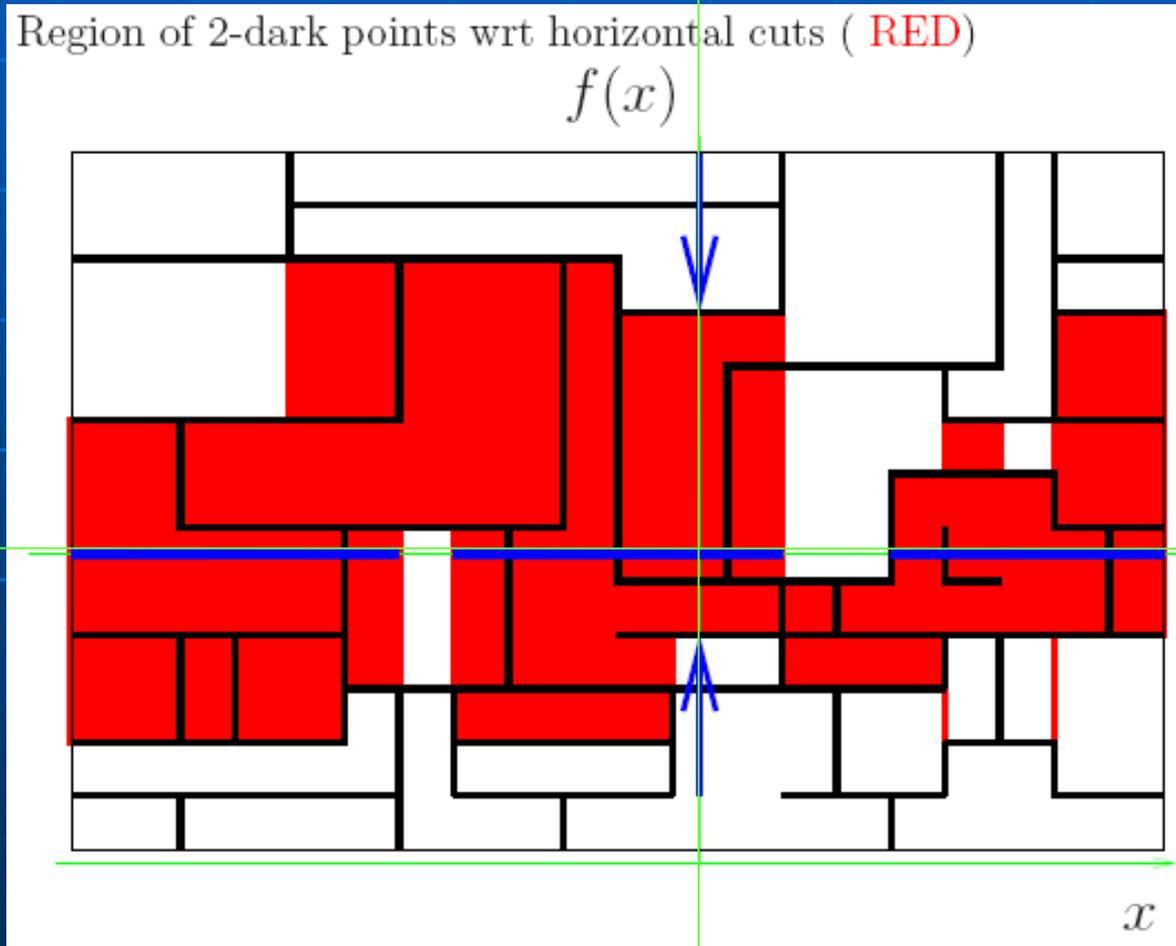
(If  $A_x \leq A_y$ , then  $\exists$  a vertical favorable cut.)

# Charging Scheme

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# Charging Scheme



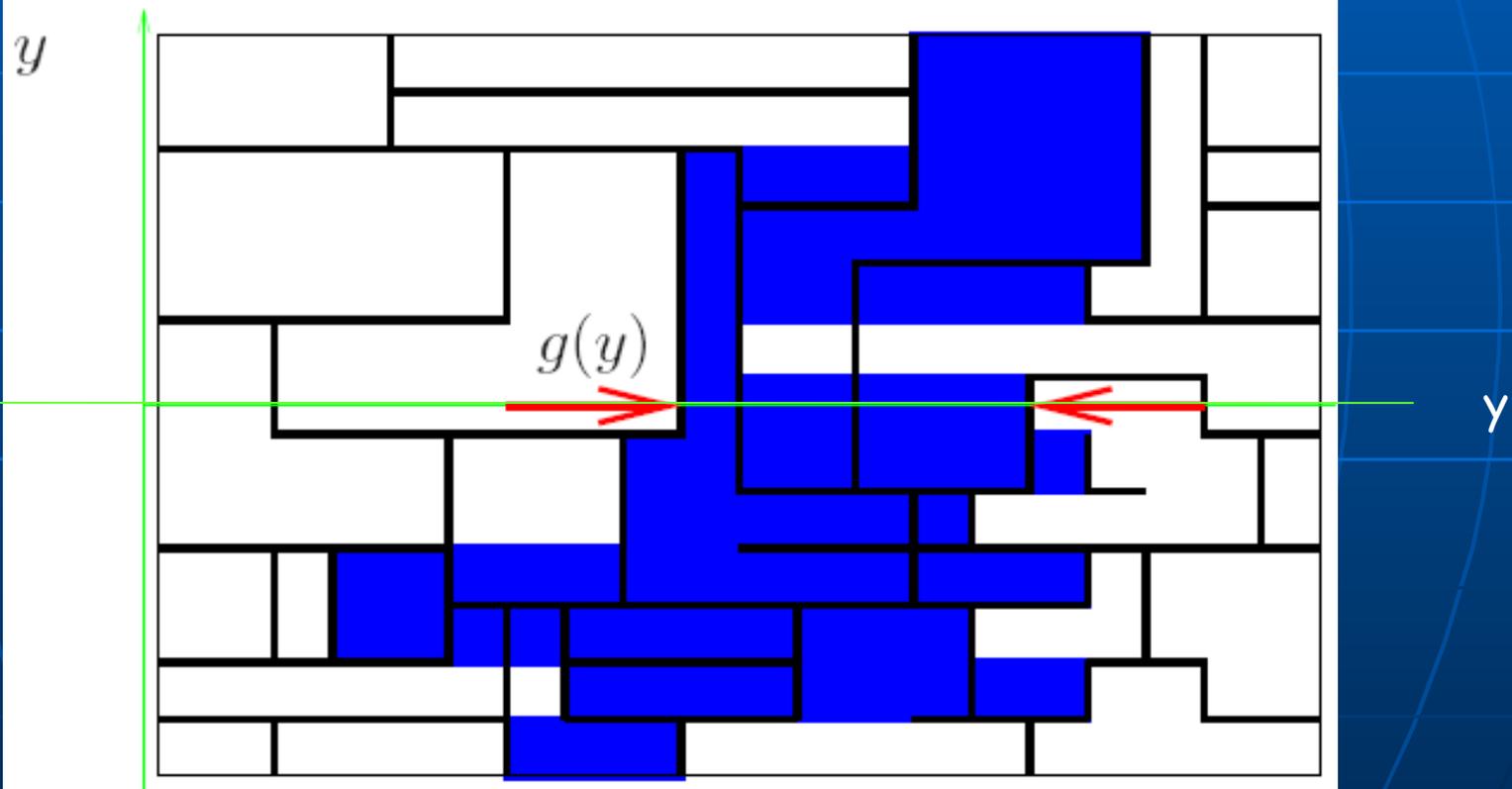
$h(y)$  =  
chargeable  
length of horiz  
cut at  $y$

Red area =  $A_x = \int f(x) dx = \int h(y) dy$

$\times f(x)$  = cost of construction of  
vert cut at  $x$

# Charging Scheme

Region of 2-dark points wrt vertical cuts ( BLUE )



Blue area =  $A_y = \int g(y) dy$

# Charging Scheme

- Let  $f(x)$  = length of  $m$ -span of vertical line through  $x$   
Let  $g(y)$  = length of  $m$ -span of horizontal line through  $y$

- Then,

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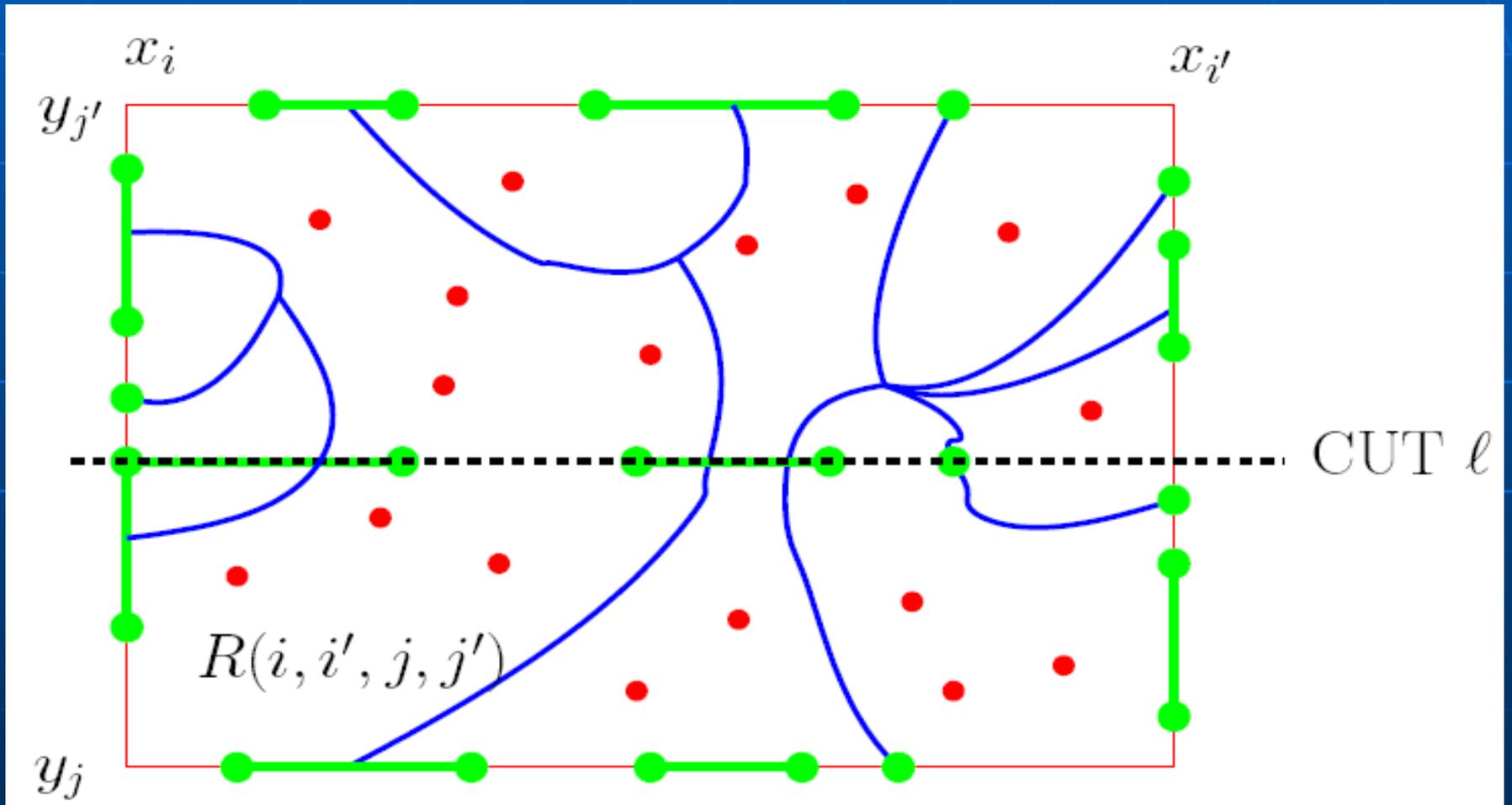
$$A_x = \int h(y)dy \geq \int g(y)dy = A_y > 0$$

So,  $\exists y^*$  for which  $h(y^*) \geq g(y^*)$ ;

i.e.,  $\exists$  a horiz line through  $y^*$  whose  $m$ -dark portion  $\geq m$ -span.

(If  $A_x \leq A_y$ , then  $\exists$  a vertical favorable cut.)

# Subproblem



# Dynamic Program: Min Steiner Tree

Sorted  $x$ -coord:  $x_1 < x_2 < \dots$  (for  $P$ , and grid lines)

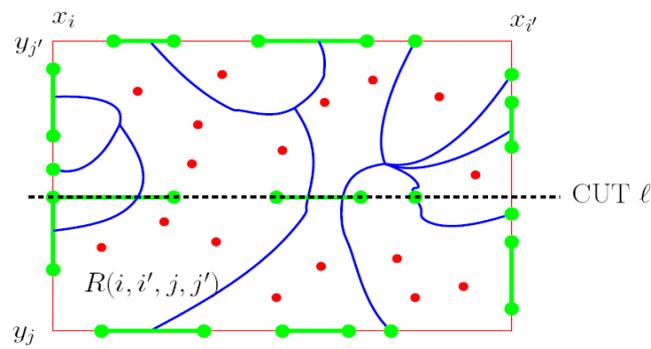
Sorted  $y$ -coord:  $y_1 < y_2 < \dots$

**Subproblem:**  $O(n^4 \cdot (n^{2m})^4) = O(n^{8m+4})$  choices

*Input:*

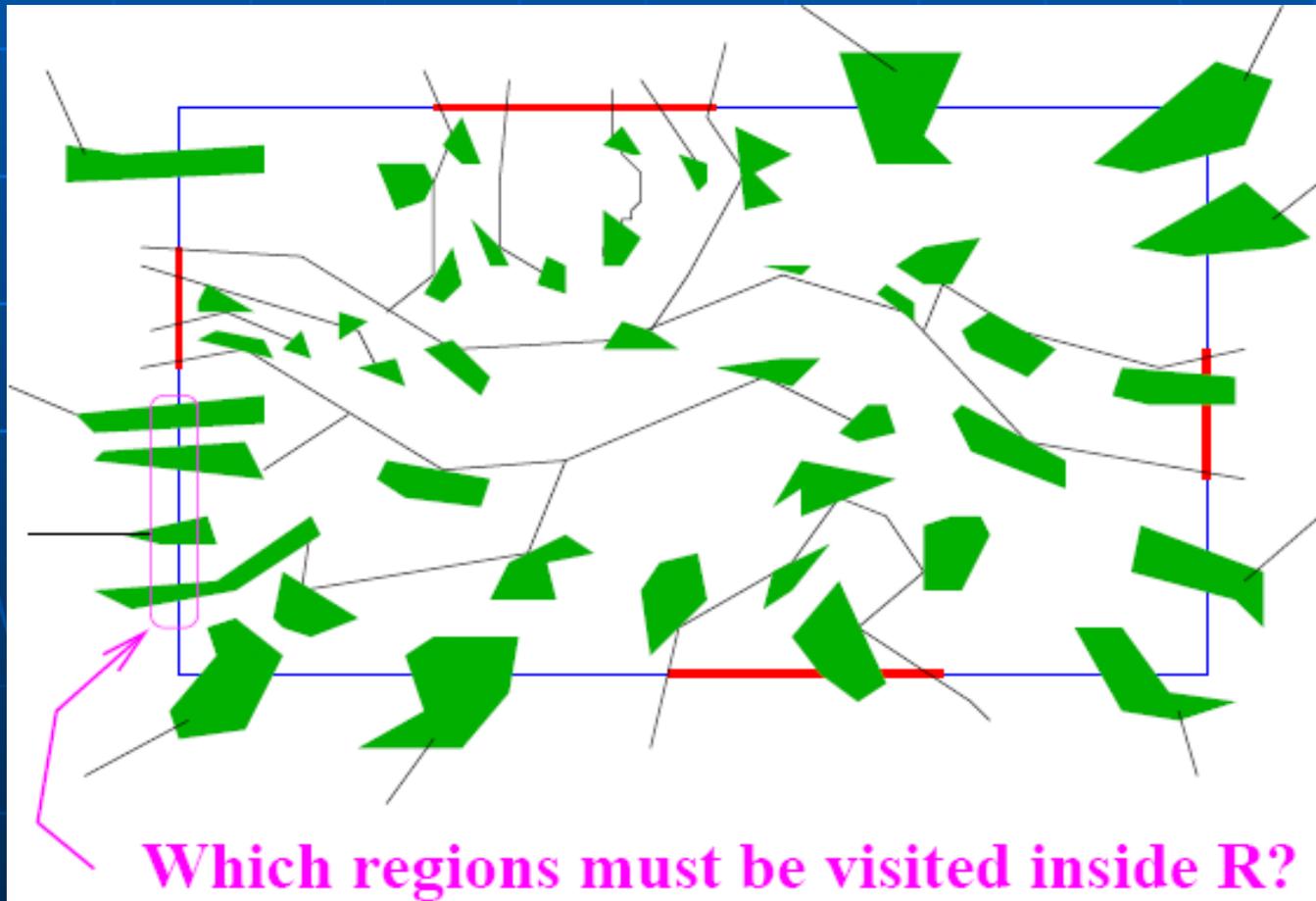
1. a rectangle  $R(i, i', j, j')$ , defined by  $x_i, x_{i'}, y_j, y_{j'}$   $O(n^4)$
2. four sets of “boundary information”,  $\Sigma_l, \Sigma_r, \Sigma_b,$  and  $\Sigma_t$ ,  
determined by  $\leq 2m$  endpoints on each side  $O((n^{2m})^4)$
3. a partition,  $\mathcal{P}$ , of  $\cup_{\alpha} \Sigma_{\alpha}$ , giving required connectivity among  
boundary pieces  $O(1)$

*Objective:* Find min-length  $m$ -guillotine subdivision,  $S_G^*$  (edges  $E_G^*$  interior to  $R(i, i', j, j')$ ), such that  $E_G^*$  covers  $P$  and  $E_G^*$  connects the boundary pieces, according to partition  $\mathcal{P}$ .



# Difficulty in Applying TSP Methods to TSPN / MSTN

Consider a subproblem (rectangle):



# New Structure

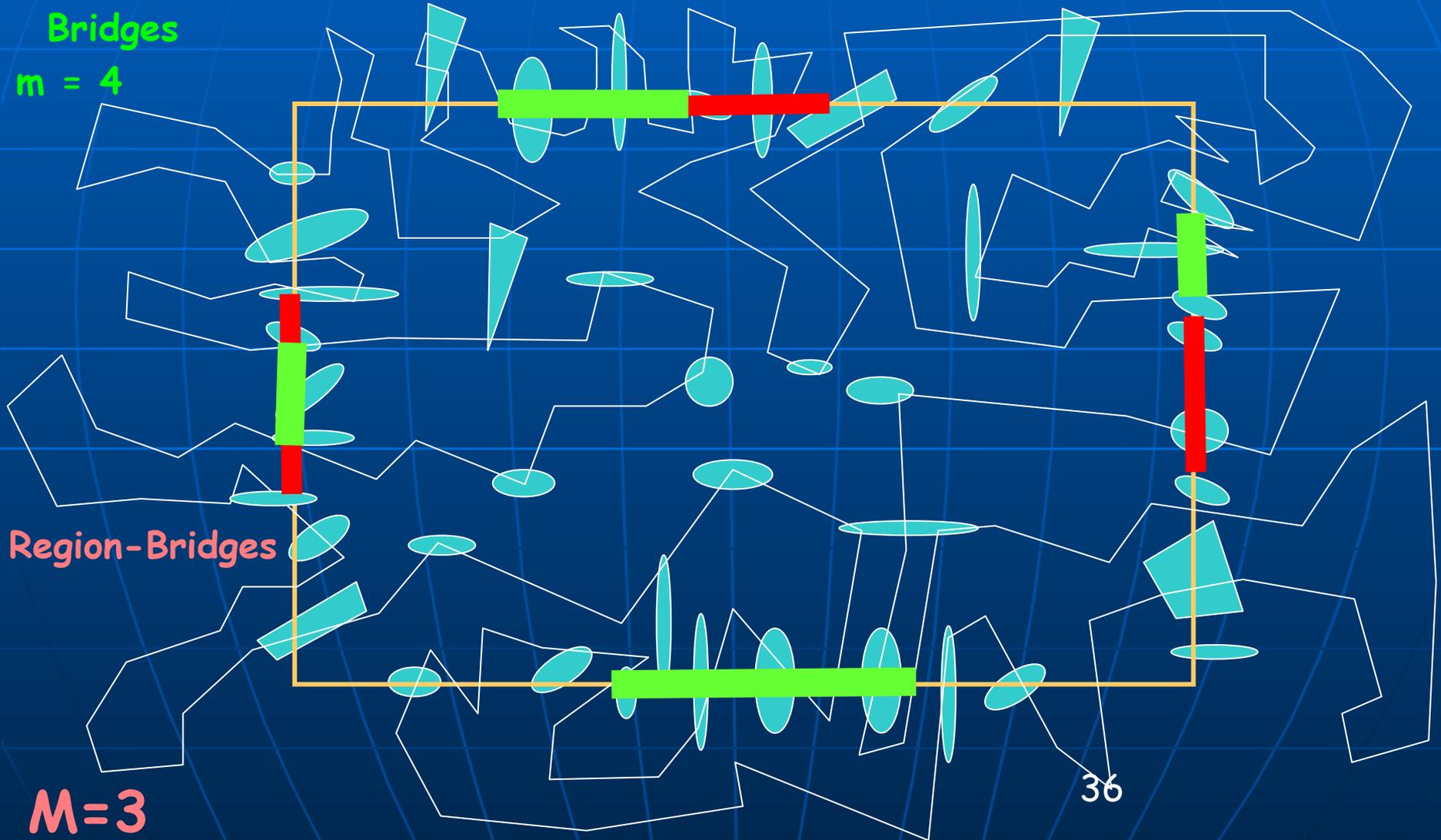
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- Build **region-bridges** in order to encode succinctly which regions are the “responsibility” of a subproblem
- Cannot afford to build **m**-region-bridges for  $m = O(1/\epsilon)$ , constant wrt  $n$ .
- But *can* afford to build **M**-region-bridges, with  $M = O((1/\epsilon)\log n)$  and this is “just right”, since the remaining **M** bridges that are not part of the bridge can be specified in the subproblem:  $2^M = 2^{O(\log n)}$  is **poly(n)**

# Subproblem: A Window into OPT

Bridges

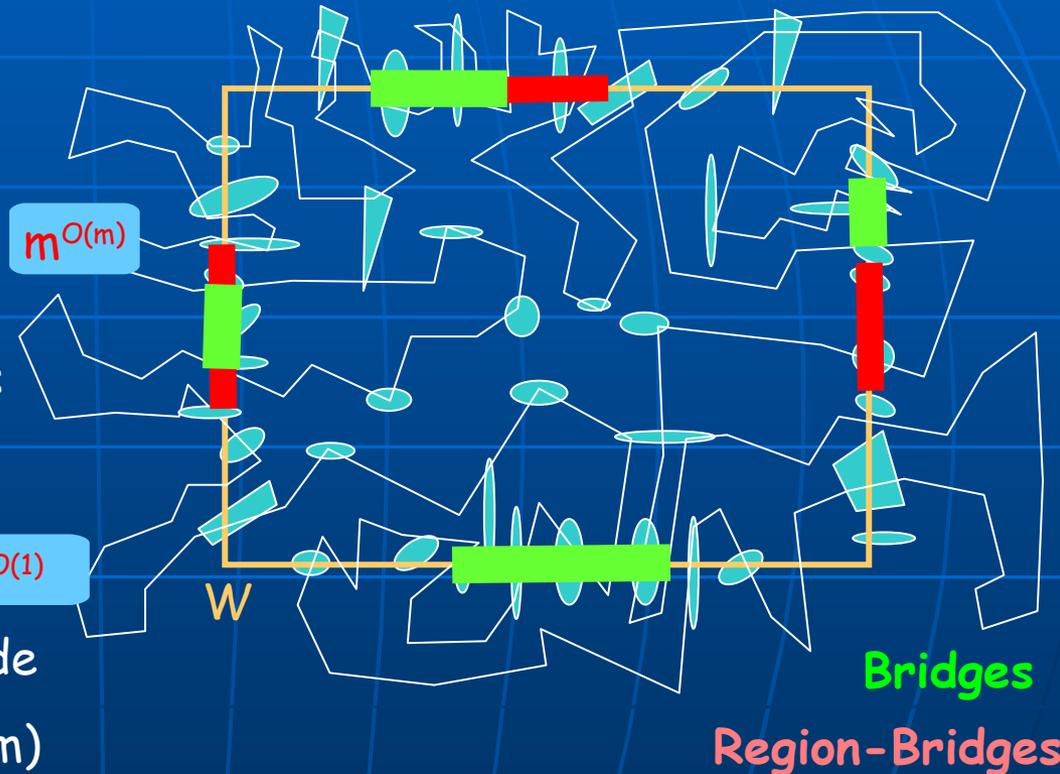
$m = 4$



# Subproblem Optimization

Specification of a subproblem:

1. Window  $W$   $n^4$
2.  $\leq 4$  Bridges,  $\leq 2m$  segs/side of  $W$   $m^{O(m)}$
3.  $\leq 4$  Region-Bridges, one bit per  $\leq 8M$  non-bridged crossing region:  
Is the subproblem responsible to visit?  
 $n^{O(1)} + 2^{O((1/\epsilon)\log n)} = n^{O(m)}$
4. Protruding regions not in  $R_{W_0}$  specified by  $\leq 2$  sequences per side  $n^{O(1)}$
5. Connection pattern among the  $O(m)$  segs crossing into  $W$   $m^{O(m)}$



Total # subproblems =  $n^{O(m)}$

$$m = 1/\epsilon$$

$$M = (1/\epsilon) \log n$$

and  $n^{O(m)}$  choices for the best horiz/vertical cut, in DP optimization

# $(m, M)$ -Guillotine Structure

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**Definition:** Network edge set  $E$  is  $(m, M)$ -guillotine if it can be recursively partitioned by horiz/vertical cuts, each containing the " $m$ -span" (**bridge**) of  $E$  and the " $M$ -region-span" (**region-bridge**) of the set of regions.

# What the DP Computes

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Minimum-length network that is

1.  $(m, M)$ -guillotine wrt window  $W_0$  and regions  $R_{W_0}$
2. Connected
3. Containing an Eulerian spanning subnetwork
4. Spanning (visits all regions)

# Main Idea of PTAS

Use  $m$ -guillotine PTAS method, with new structure to address difficulty with TSPN

OPT



$(m, M)$ -guillotine network  
with special structure

**Structure Theorem**

increasing length by  
 $\leq (1+\epsilon)$  factor

Use **dynamic programming** to compute shortest  $(m, M)$ -guillotine network with the required structure (connectivity, Eulerian subgraph, etc)

Optimal  $(m, M)$ -guillotine  
network with structure



TSPN tour

# New Structure Theorem

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Theorem: Let  $E$  be a connected set of edges of length  $L$ , spanning all regions. Then, for any positive integers  $m$  and  $M$ , there is a superset,  $E'$ , of  $E$ , of length at most  $L + (\text{sqrt}(2)/m) L + (\text{sqrt}(2)/M) \lambda(R_{w_0})$ .

We pick  $M = (1/\varepsilon) \log n$ , and  $m = 1/\varepsilon$

Sum of region diameters

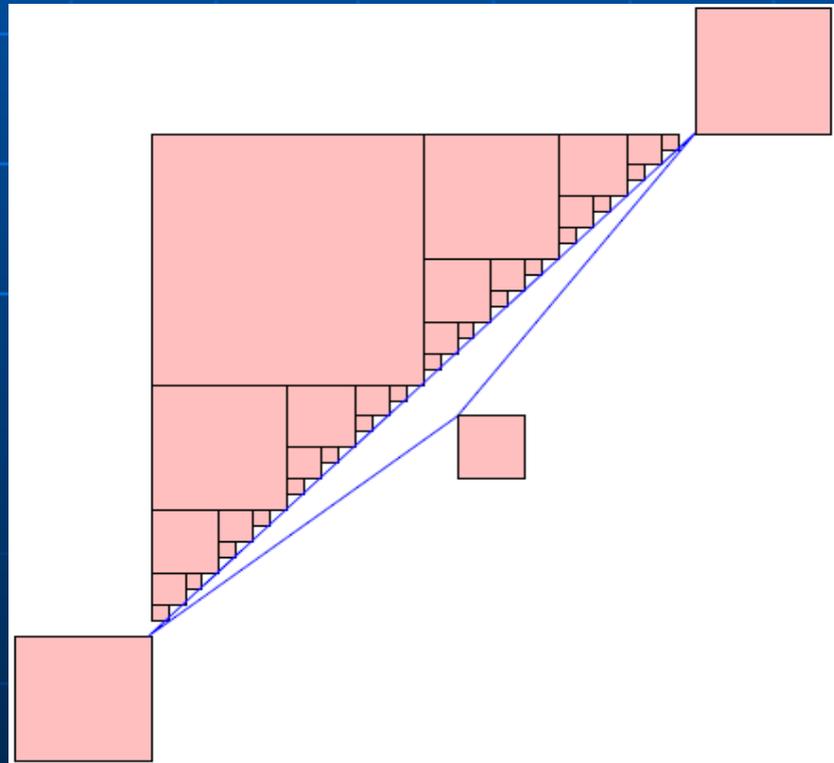
Then, by the Key Lemma, we see that  $T^*$  can be converted to be  $(m, M)$ -guillotine, adding length  $O(T^*/\varepsilon)$

Key Lemma:  $L^* \geq C \lambda(R_{w_0}) / \log n$

# Key Geometric Observation

The sum of the perimeters of a set of  $n$  disjoint fat regions that are visited by a path of length  $L$  is at most  $O(L \log n)$

Uses **PACKING** argument



Ex: Bound is tight

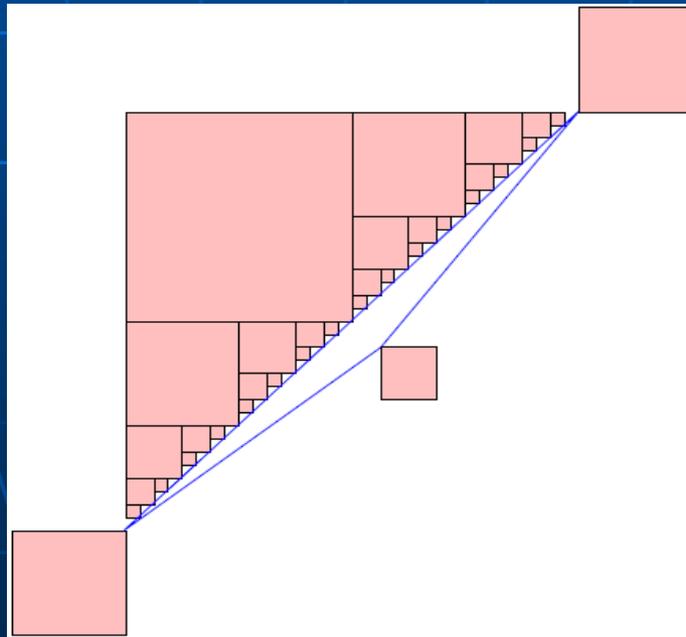
# Key Lemma: Lower Bound on OPT

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Key Lemma:  $L^* \geq C \lambda(R_{w_0}) / \log n$

Relates tour length of OPT,  $L^*$ , to sum of diameters,  $\lambda(R_{w_0})$

Ex: Tight



$$L^* = \Omega(\lambda(R_{w_0}) / \log n)$$

# Proof of Key Lemma

Cluster regions by size (diameter), into  $\log(n/\varepsilon)$  classes

There are  $n_i$  regions with diameter in range  $(d_i/2, d_i)$

Area (packing) argument:

Let  $A_i = \text{area}(\mathcal{T}^* \oplus B(d_i) \cap W_0)$

Minkowski sum with ball of radius  $d_i$

This is where fatness and disjointness are used!

By **fatness**,  $A_i \geq C_0 d_i^2 n_i$ , for some constant  $C_0$

Thus, by **Claim** below,  $C_0 d_i^2 n_i \leq 2d_i L^*$ , or  $L^* \geq (C_0/2) d_i n_i$

Summing on  $i$ , we get  $L^* \geq C \lambda(R_{W_0}) / \log n$

**Claim**:  $A_i \leq 2d_i L^*$



# Proof of Claim

Claim:  $A_i = \text{area}(\mathcal{T}^* \oplus B(d_i)) \cap W_0) \leq 2d_i L^*$

Minkowski sum with ball of radius  $d_i$

Proof:

$$\text{area}(\mathcal{T}^* \oplus B(d_i)) \leq 2d_i L^* + \pi d_i^2$$

That portion within  $W_0$   
does not include (at least)  
the area,  $\pi d_i^2$



# Main Result

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Theorem: TSPN for disjoint fat regions has a PTAS.

PTAS also for the case of nondisjoint regions, if there are disjoint disks  $\beta_1, \dots, \beta_n$ , with  $\beta_i \cap P_i$  and  $\text{diam}(P_i)/\text{diam}(\beta_i) < C$ .

Improve running time to  $O(n^C)$ , with  $C$  independent of  $1/\varepsilon$ : use grid-rounded guillotine subdivisions.

# Generalizations/Extensions

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- Disconnected regions: sets of points/regions that are within a “nice” set of regions
- $k$ -TSPN
- Steiner MST with Neighborhoods
- MST with Neighborhoods (MSTN)
- $k$ -MSTN

# Approximation of 2D TSPN: Connected Regions

Fat Regions

non-Fat Regions

Comparable  
sizes

Disjoint

PTAS

**Newest**

PTAS

$O(1)$

Non-Disjoint

Disjoint

$O(1)$

$O(1)$

APX-hard

Non-Disjoint

Arbitrary  
size

Disjoint

~~$O(1)$~~

**New**

PTAS

**Newest**

$O(1)$ , PTAS?

$O(\log n)$

Non-Disjoint

Disjoint

$O(\log n)$

$O(\log n)$

APX-hard

Non-Disjoint

Conjecture:  
PTAS for all

Conjecture:  
 $O(1)$  for all

# Laundry List of Problems

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## ■ Know PTAS

- TSP, k-TSP, Steiner MST, k-MST
- Red-blue separation
- Min-weight convex subdivision
- TSPN, fat regions
- Orienteering problem
- Lawnmowing problem

## ■ OPEN: PTAS?

- TSPN, disjoint regions in 2D
- Vehicle routing; min-weight cover with k-tours
- Deg-3, deg-4 spanning trees
- Min-weight triangulation
- Watchman route problem
- Min-area triangulated surface; special case: terrain