

# Quadrees and Meshing

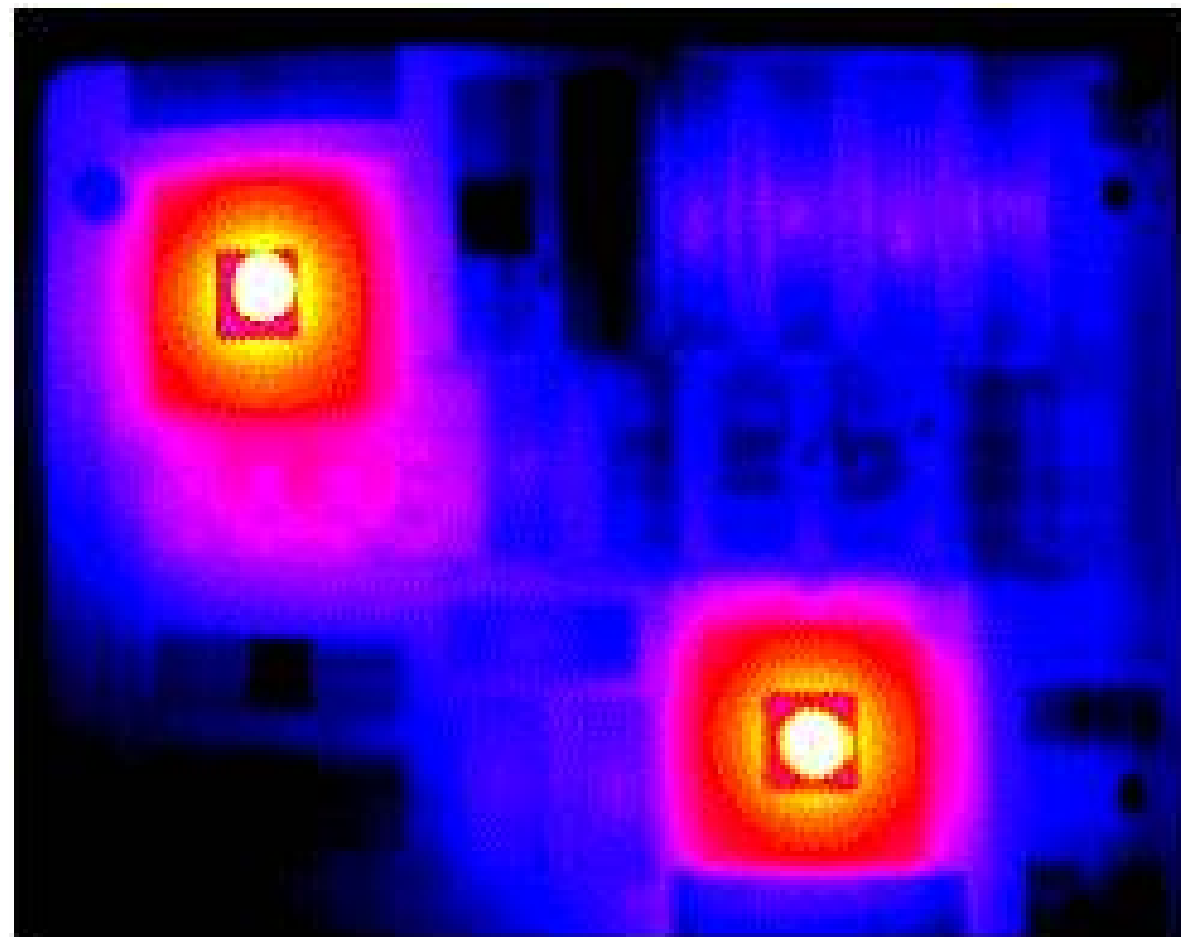
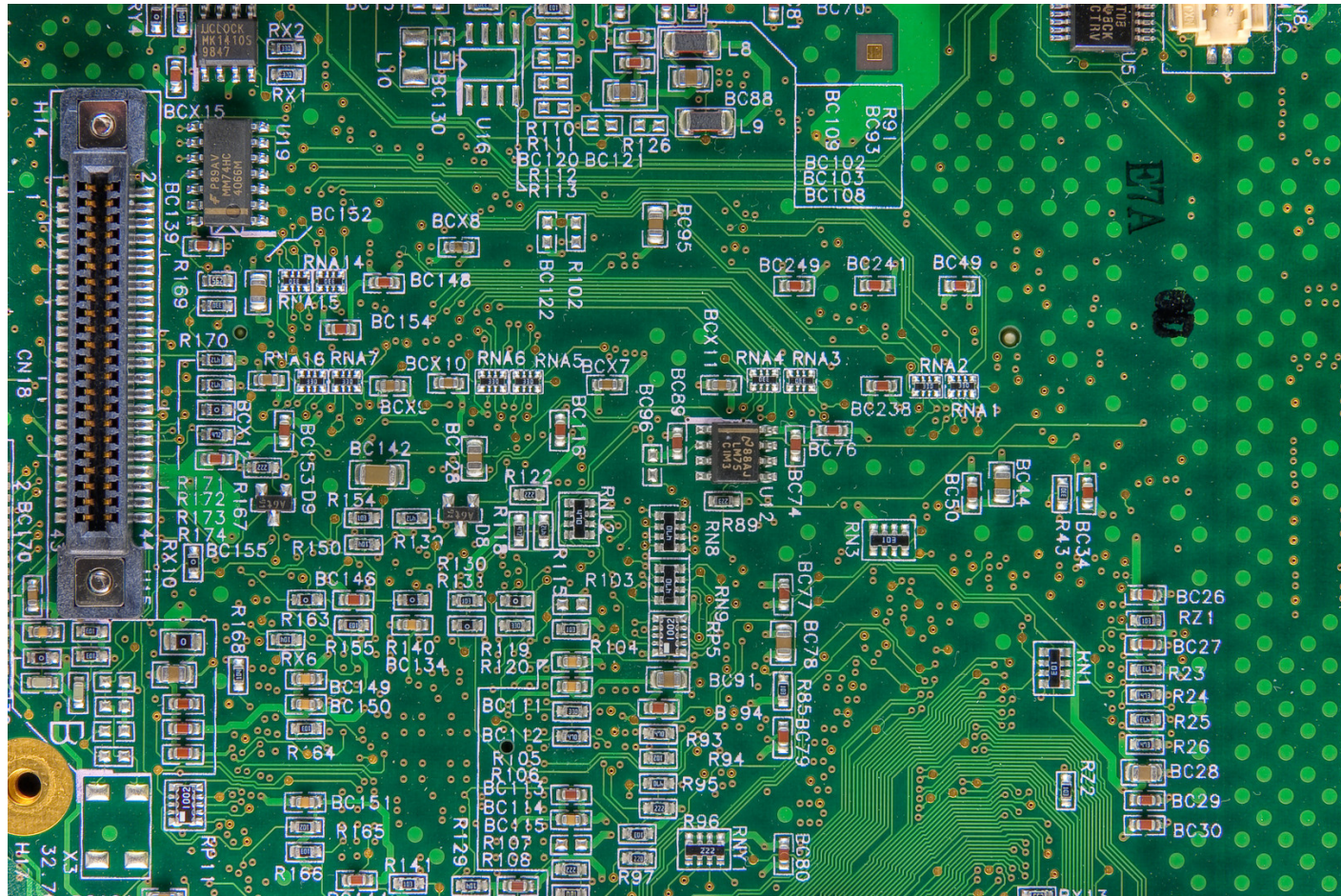
definition & properties

balanced quadrees

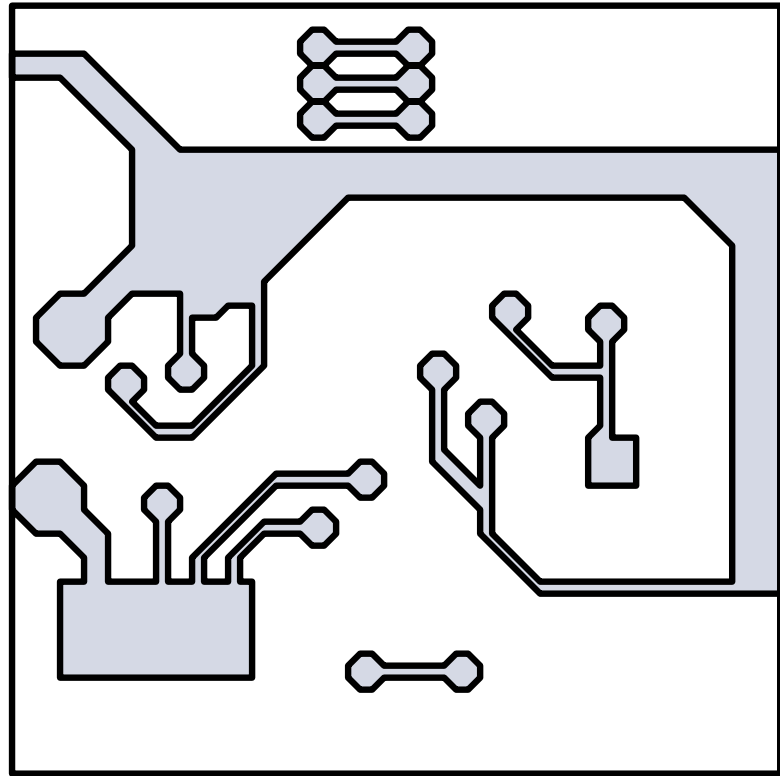
meshing with quadrees

# Motivation: VLSI design

# Simulation of heat emission on printed circuit boards



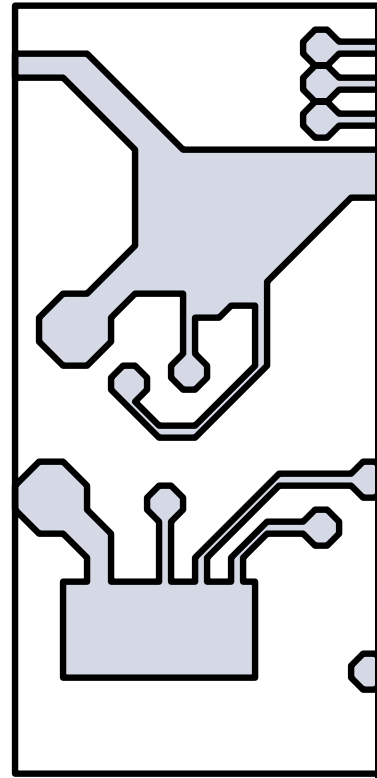
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To simulate heat emission, use finite element method:

- partition board into small homogeneous elements (e.g. triangles) → mesh
- based on heat emission of each element and influence of neighbors numerically approximate the overall heat emission

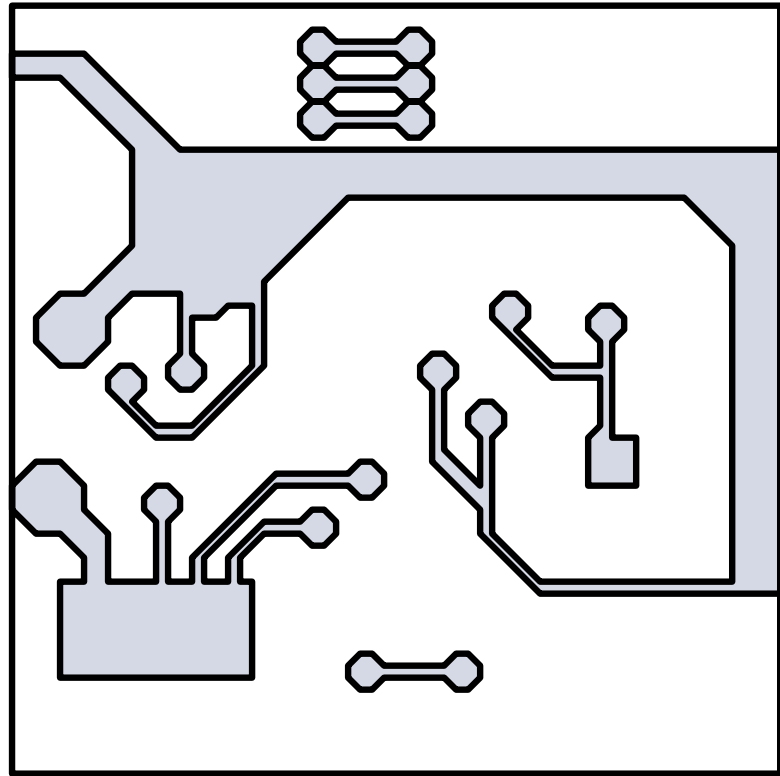
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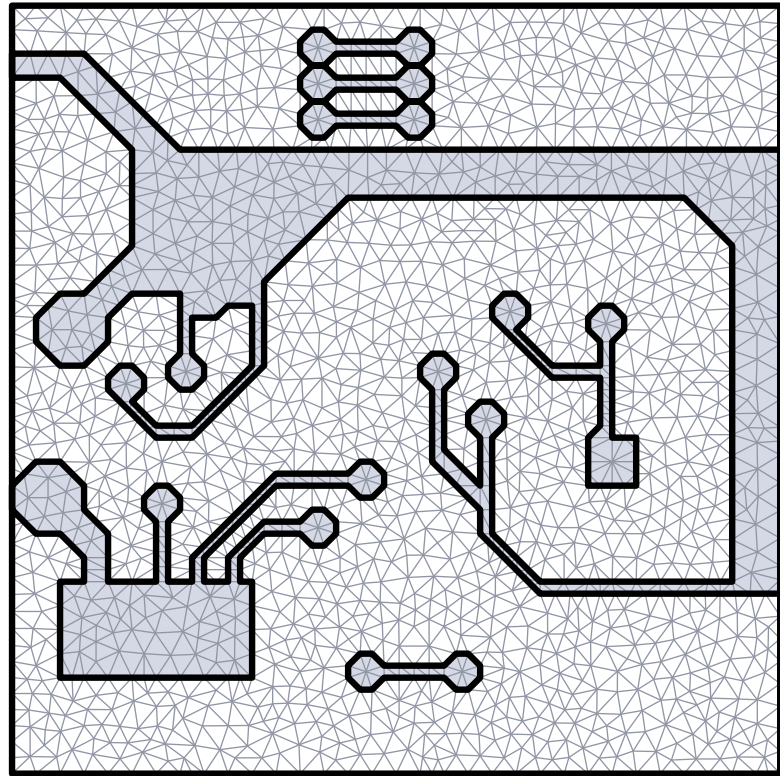


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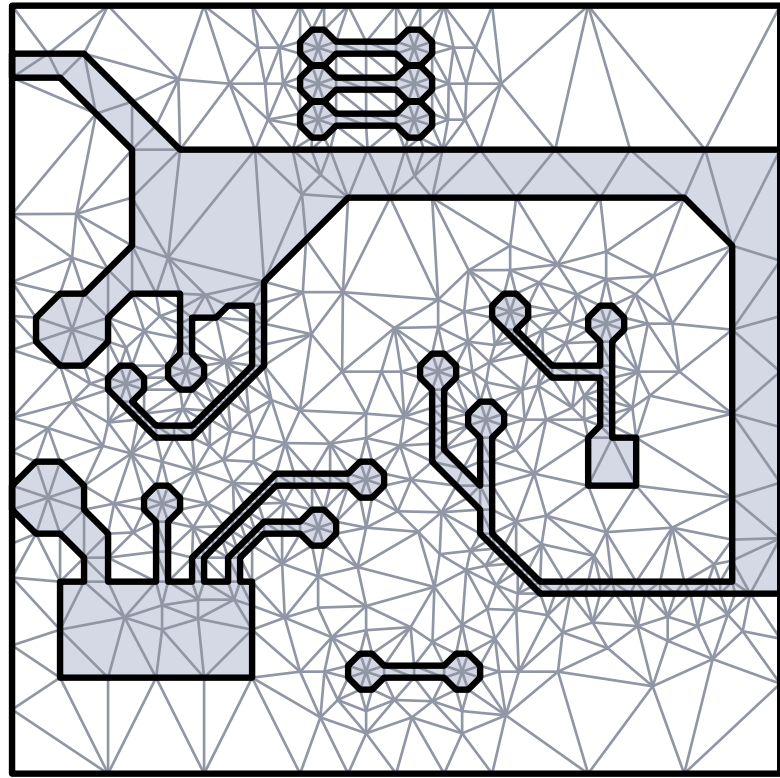


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- finer mesh → better approximation
  - coarser mesh → faster computation
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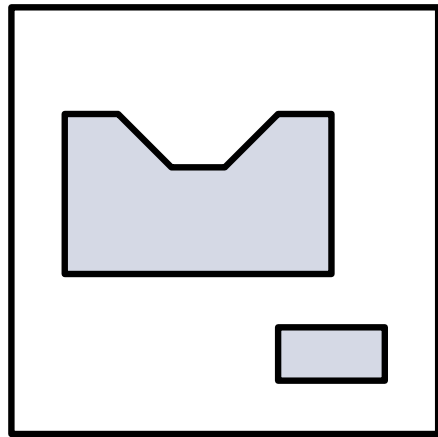
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- goal:
- non-uniform mesh → small at boundaries, larger otherwise
  - well-shaped triangles → not too thin

# Non-uniform meshes

**Given:** octilinear polygons with integer coordinates within a square  $Q = [0, U] \times [0, U]$  with  $U = 2^j$  a power of two.

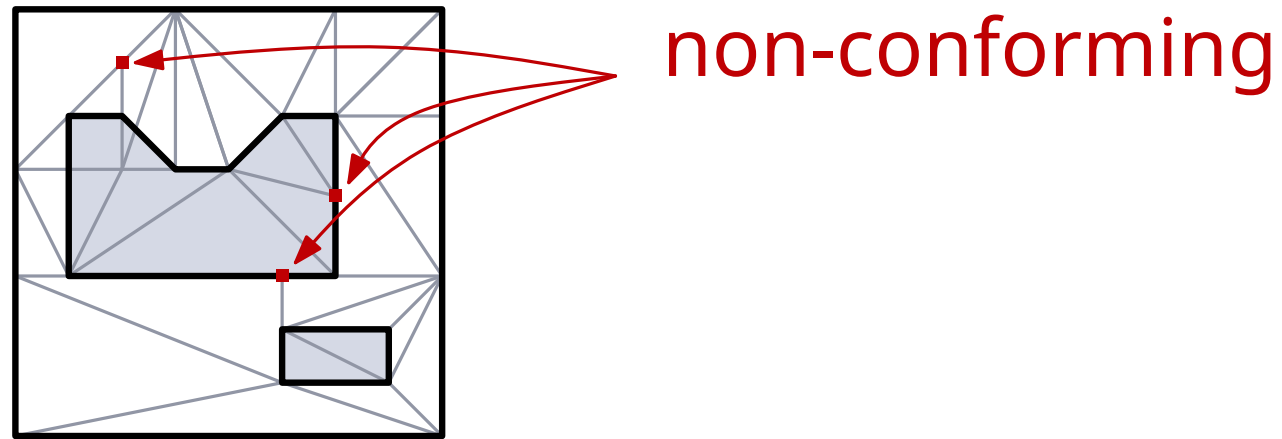


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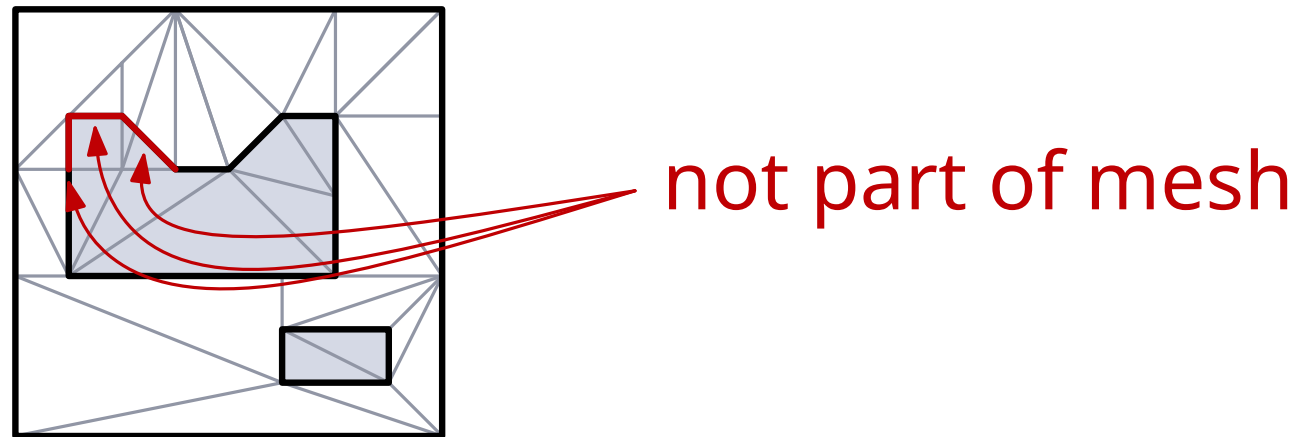


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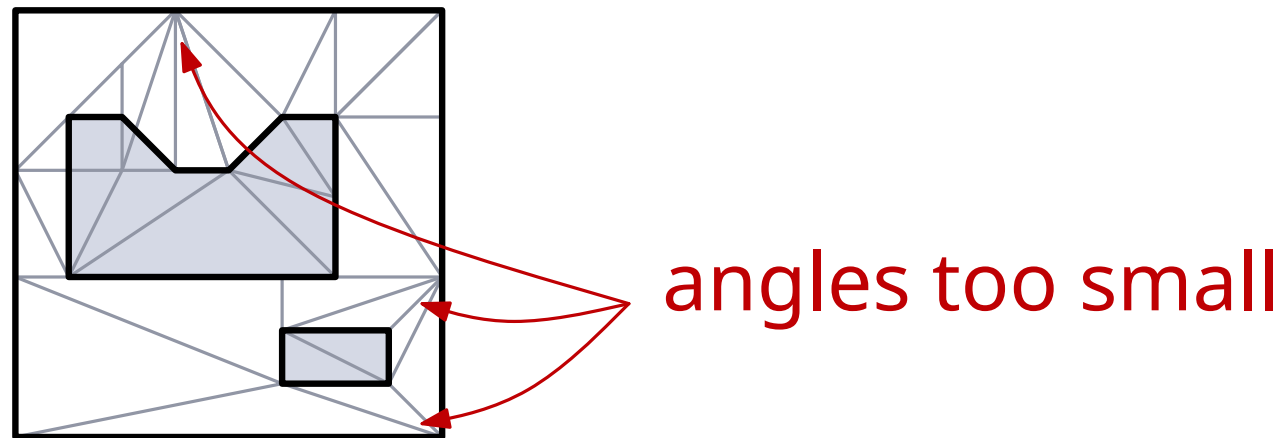


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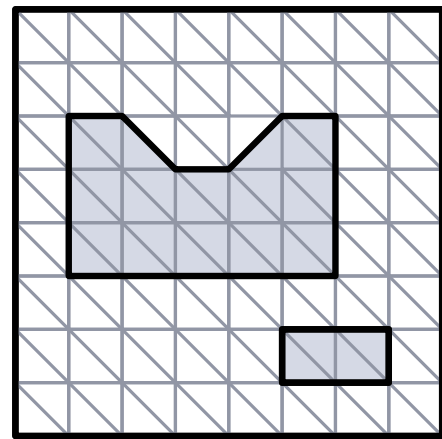


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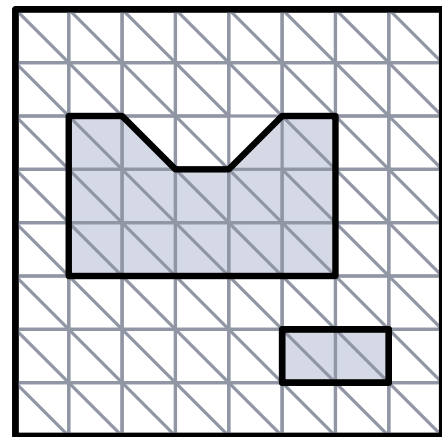
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Do we need Steiner points (i.e. non-input vertices)?

uniform mesh

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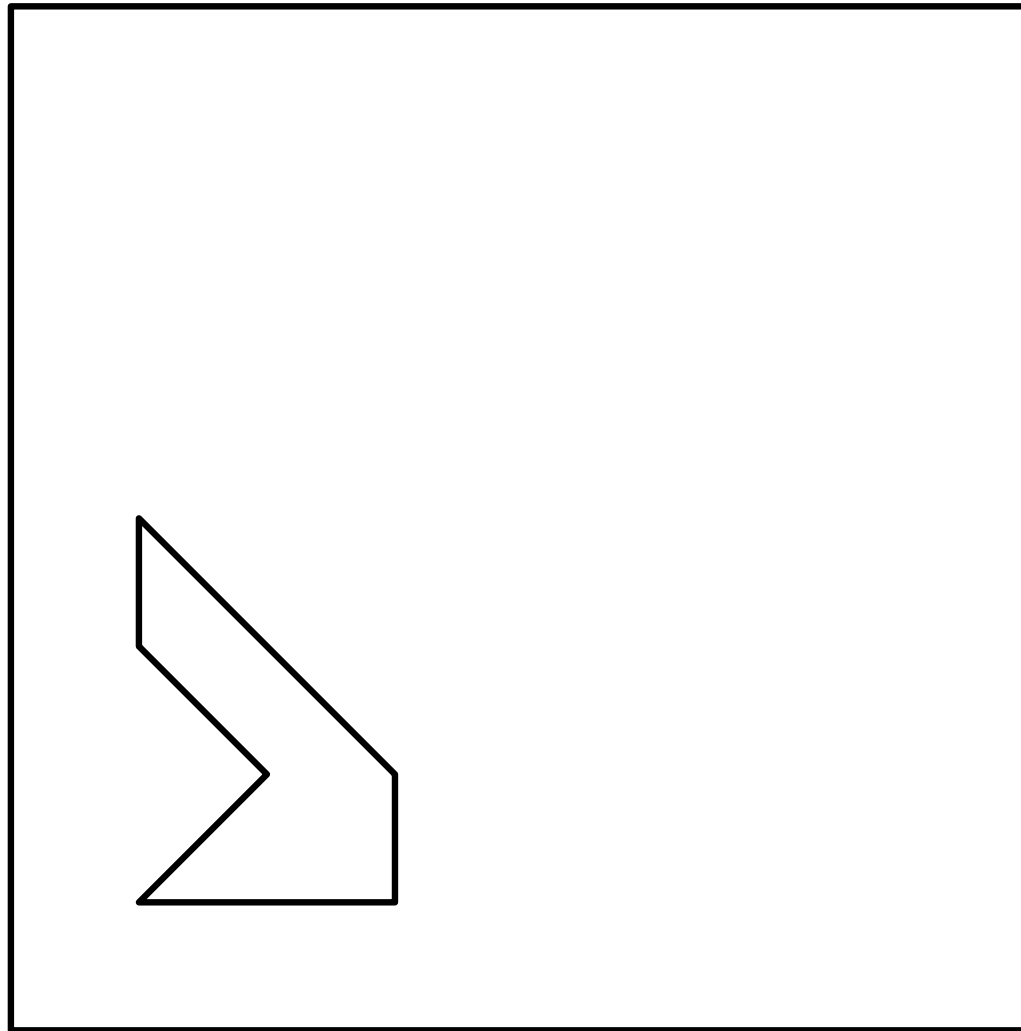
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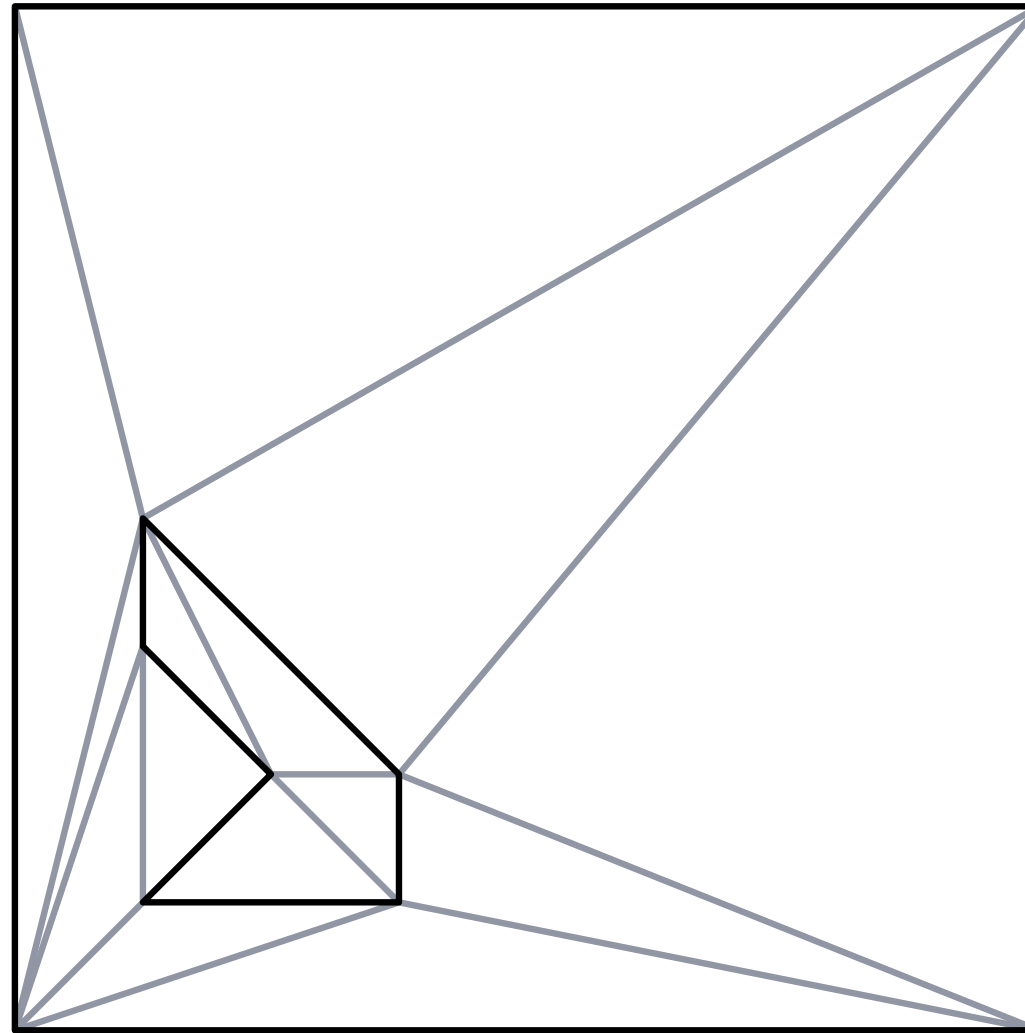
Exercise:



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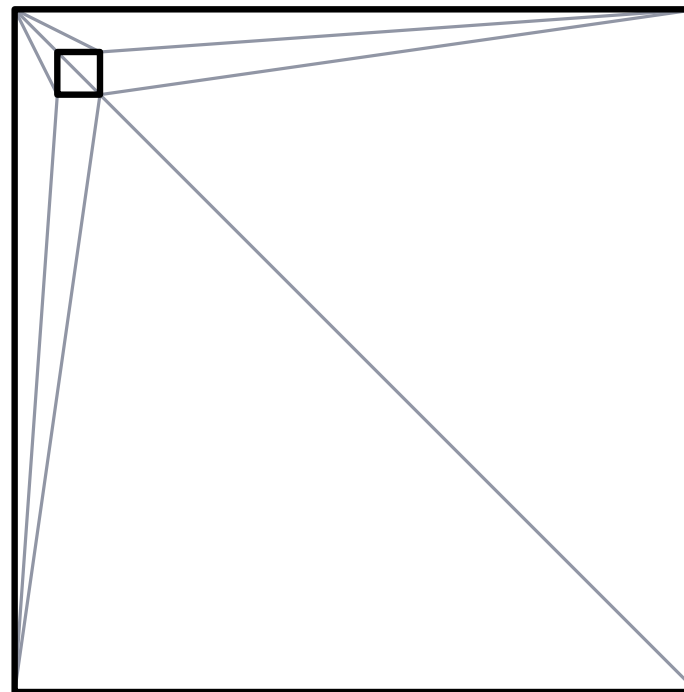
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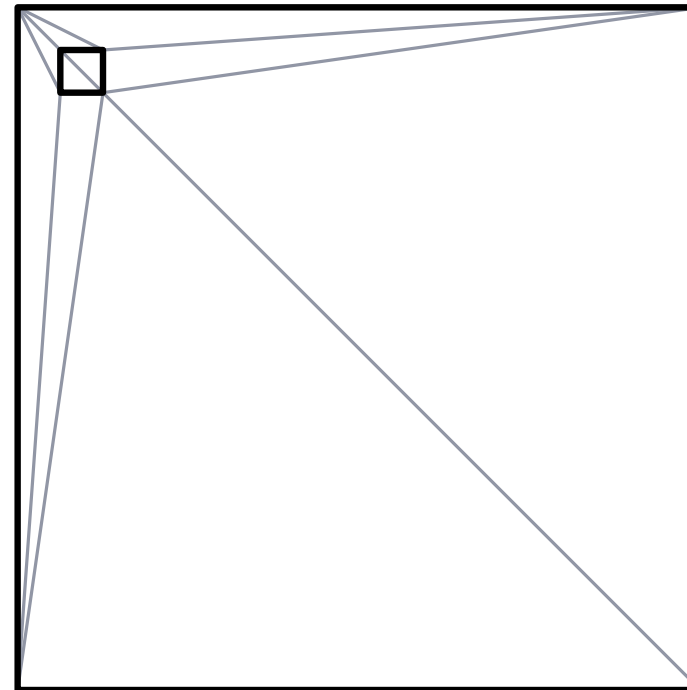
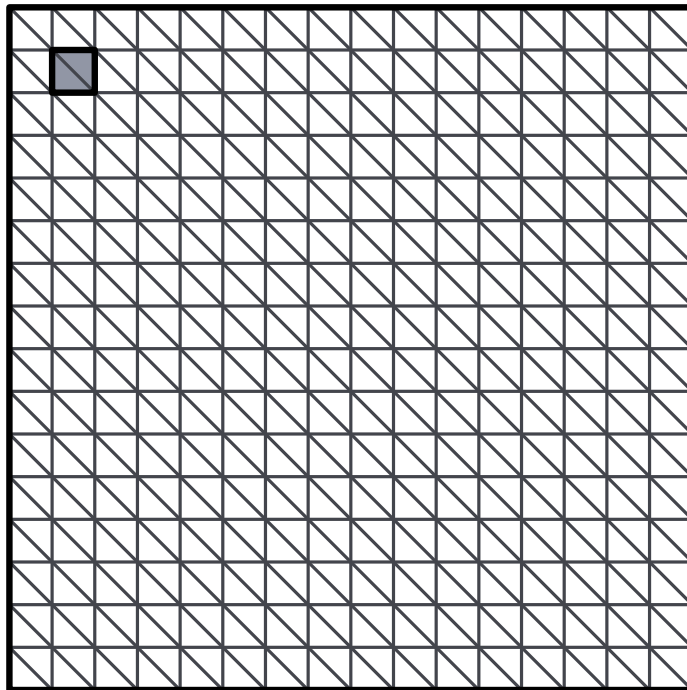
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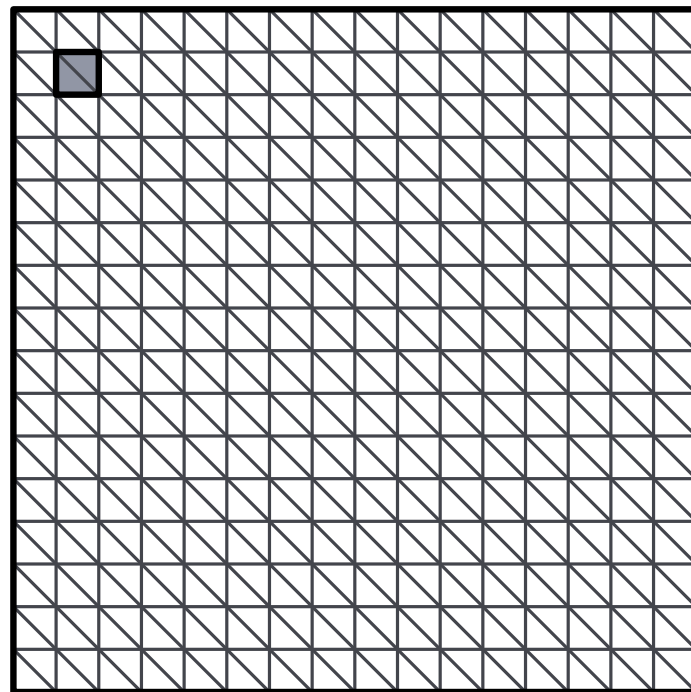




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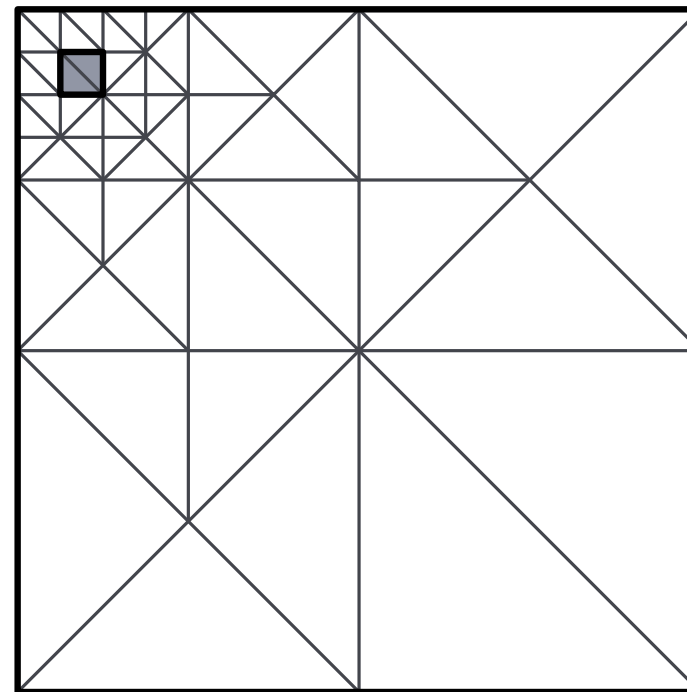
- maximize smallest angle?
- without Steiner points: might have very small angles
- with Steiner points:

well-shaped, but uniform



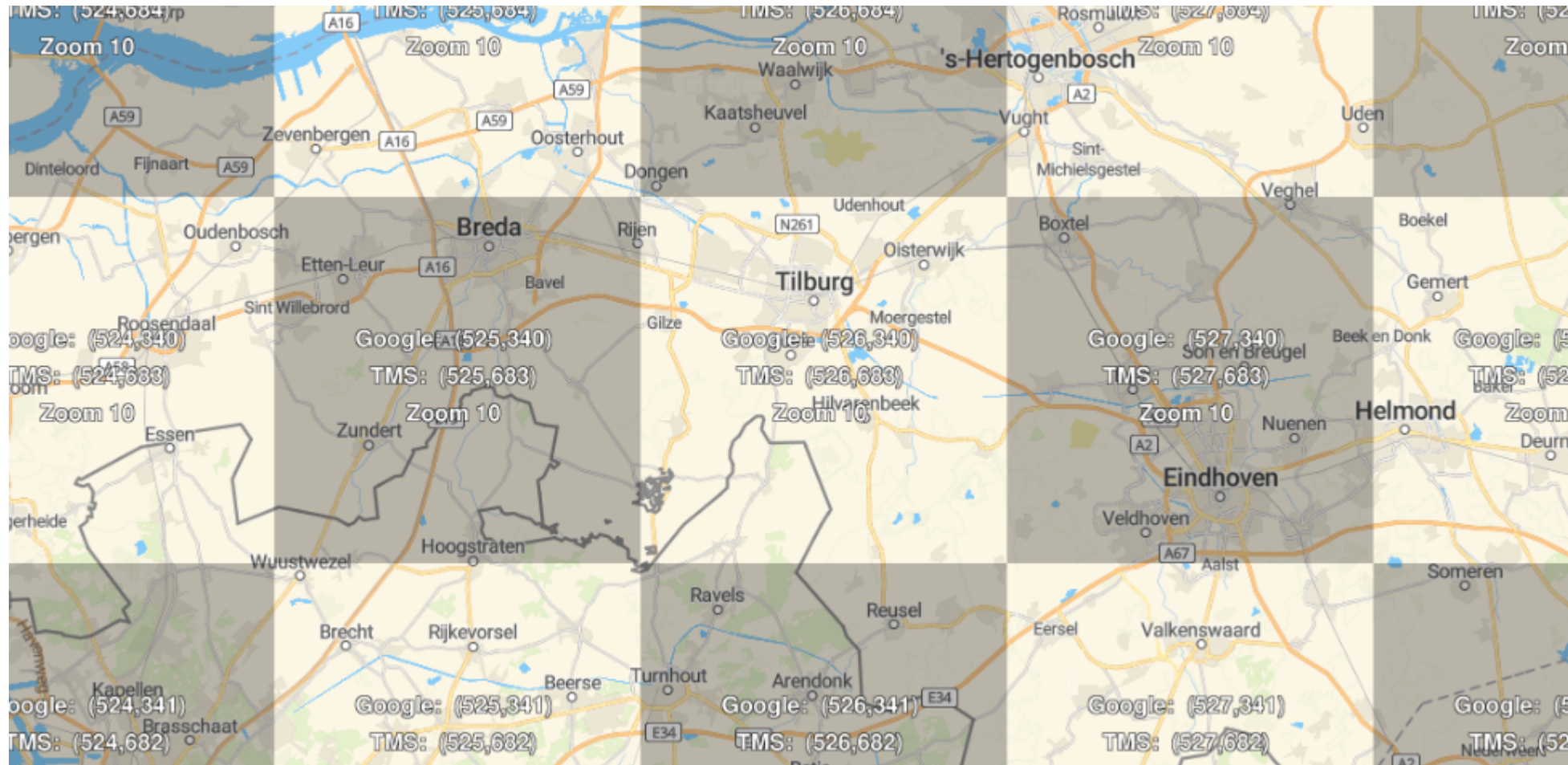
512 triangles

well-shaped, non-uniform



52 triangles

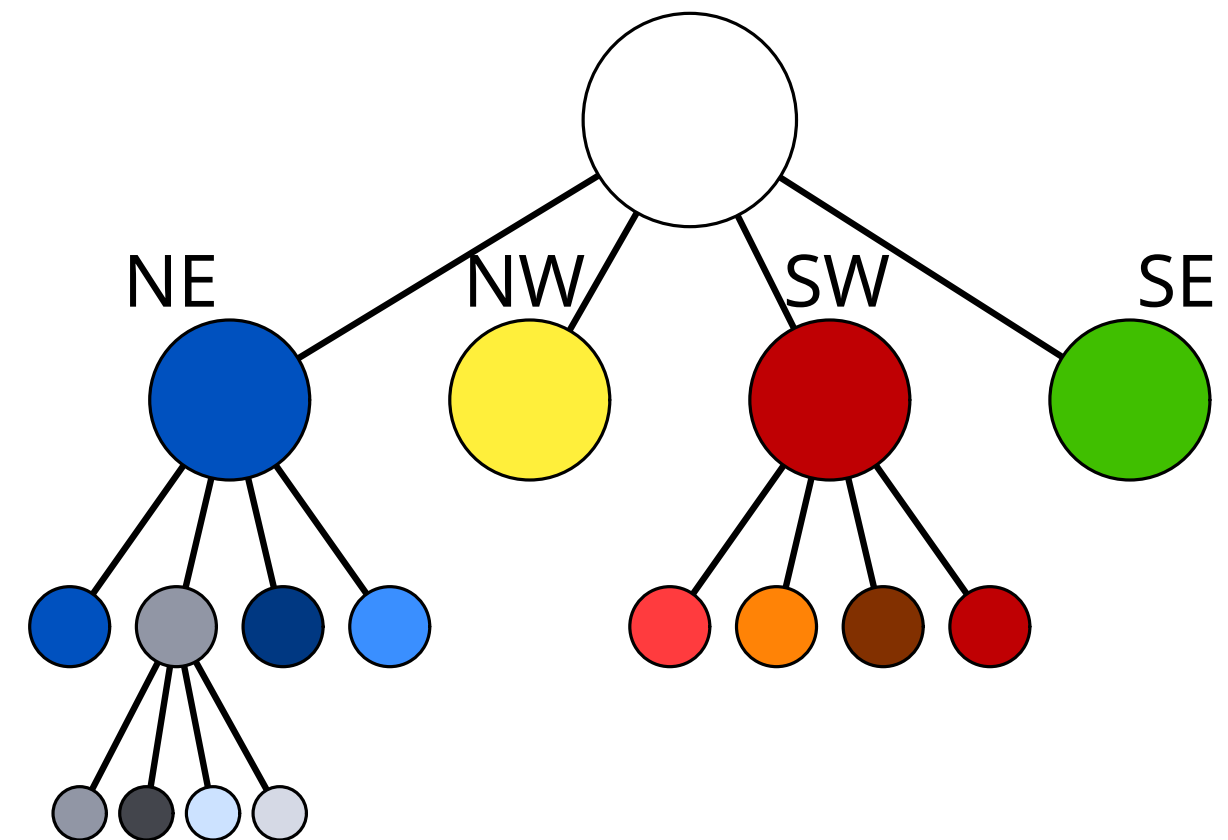
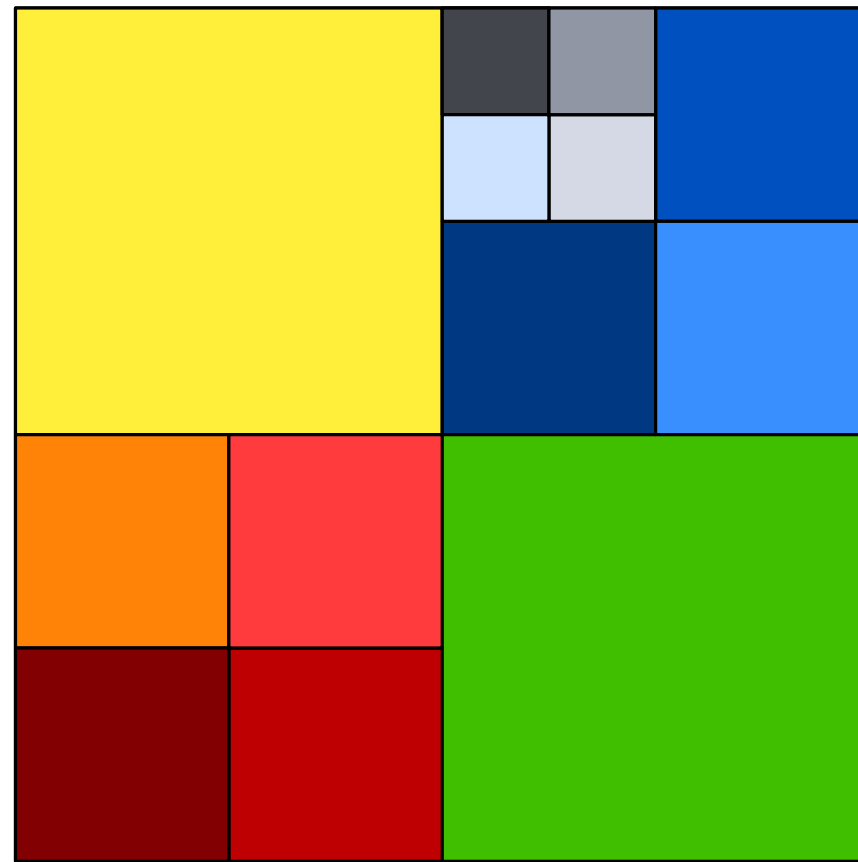
# Quadtrees



<https://google.github.io/closure-library/source/closure/goog/demos/quadtree.html>,  
<http://www.maptiler.org/google-maps-coordinates-tile-bounds-projection>

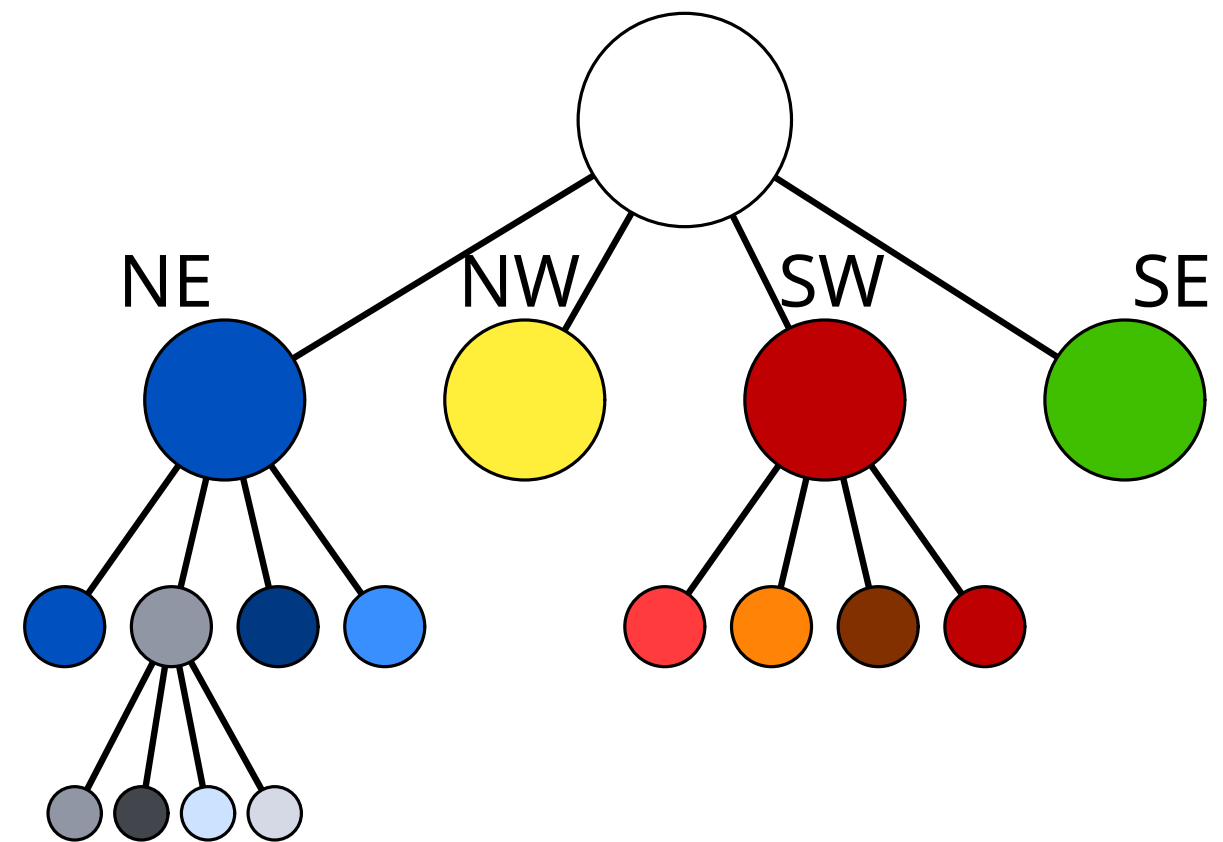
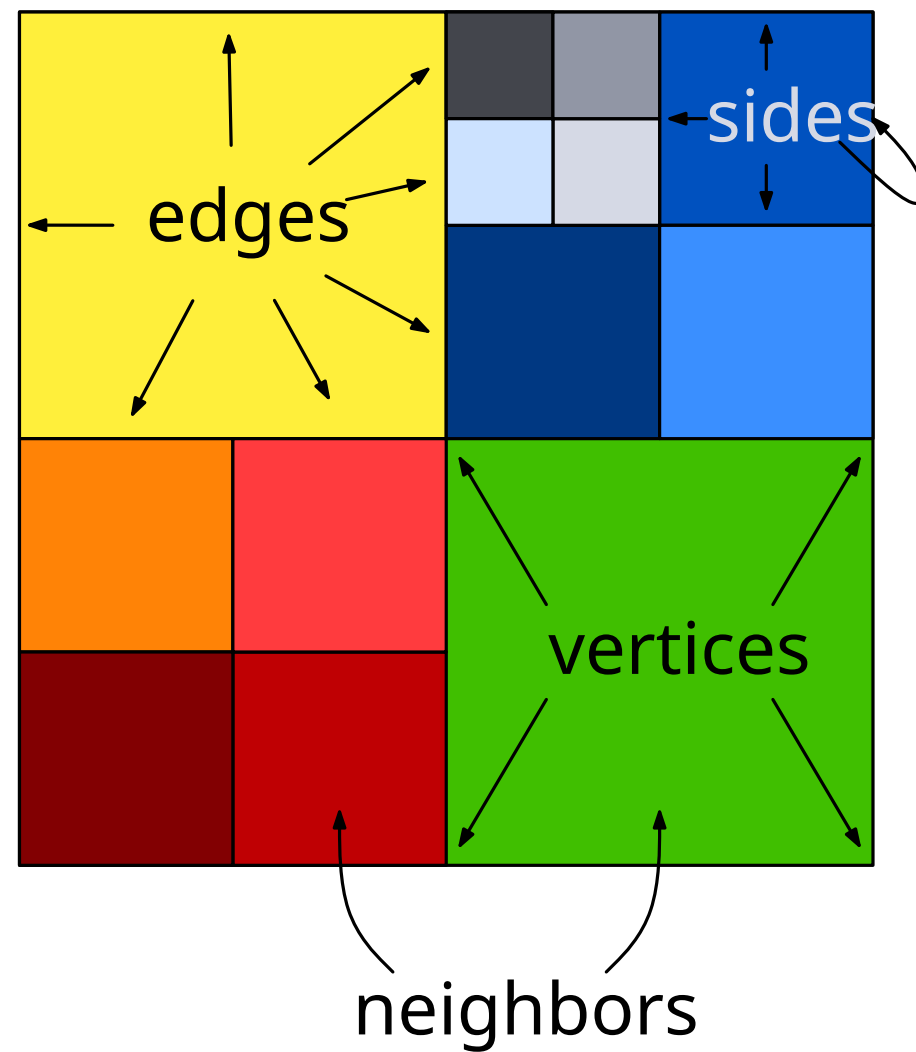
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**Definition:** A **quadtree** is a rooted tree, in which every interior node has 4 children. Every node corresponds to a square, and the squares of children are the quadrants of the parent's square.



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**Definition:** For a point set  $P$  in a square  $Q = [x_Q, x'_Q] \times [y_Q, y'_Q]$  the **quadtree**  $\mathcal{T}(P)$  is:

- if  $|P| \leq 1$ , is a leaf storing  $P$  and  $Q$
- otherwise, is a node storing  $Q$  with four quadrees as children in four quadrants for:

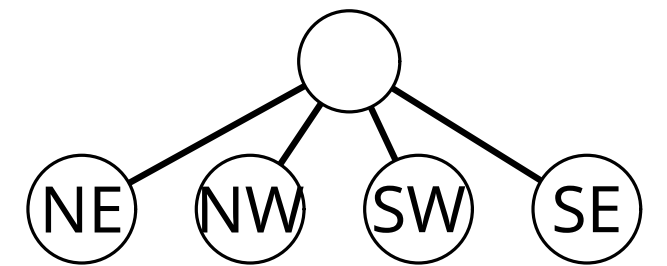
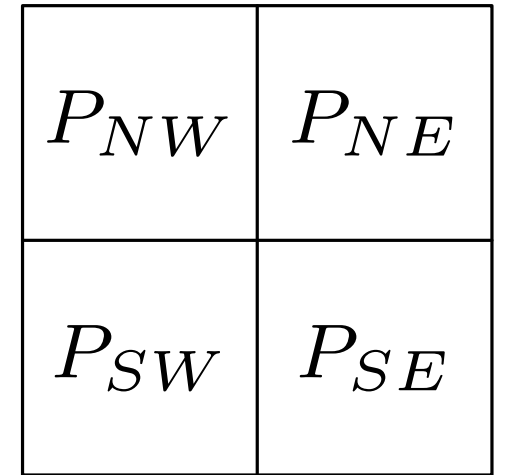
$$P_{NE} := \{p \in P \mid p_x > x_{\text{mid}} \text{ and } p_y > y_{\text{mid}}\},$$

$$P_{NW} := \{p \in P \mid p_x \leq x_{\text{mid}} \text{ and } p_y > y_{\text{mid}}\},$$

$$P_{SW} := \{p \in P \mid p_x \leq x_{\text{mid}} \text{ and } p_y \leq y_{\text{mid}}\},$$

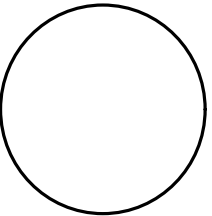
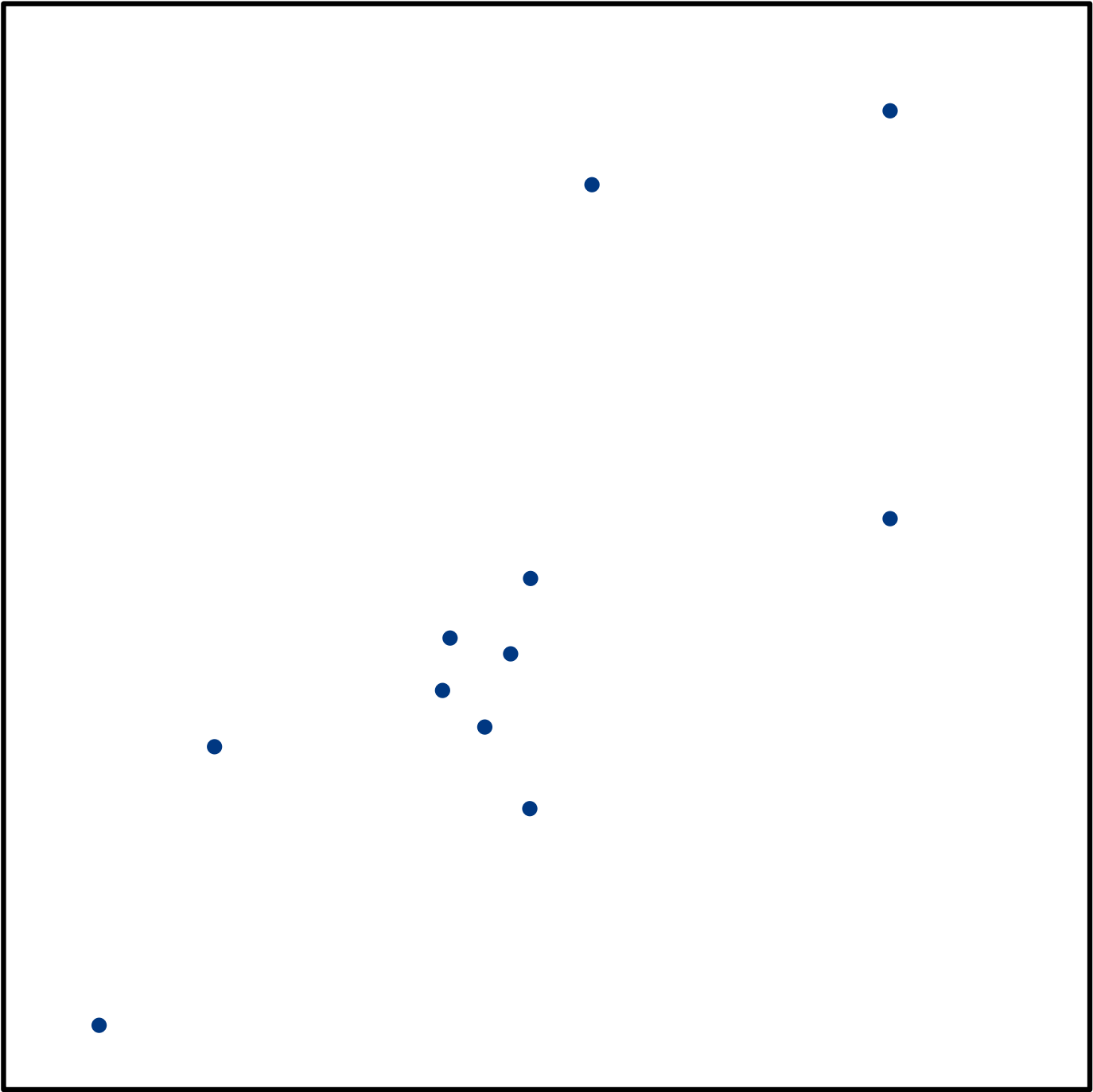
$$P_{SE} := \{p \in P \mid p_x > x_{\text{mid}} \text{ and } p_y \leq y_{\text{mid}}\},$$

where  $x_{\text{mid}} = \frac{x_Q + x'_Q}{2}$  and  $y_{\text{mid}} = \frac{y_Q + y'_Q}{2}$ .

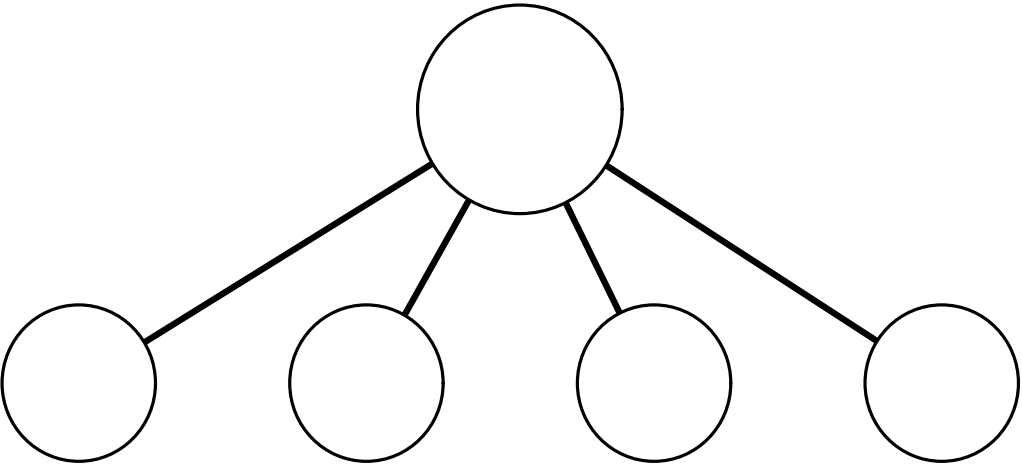
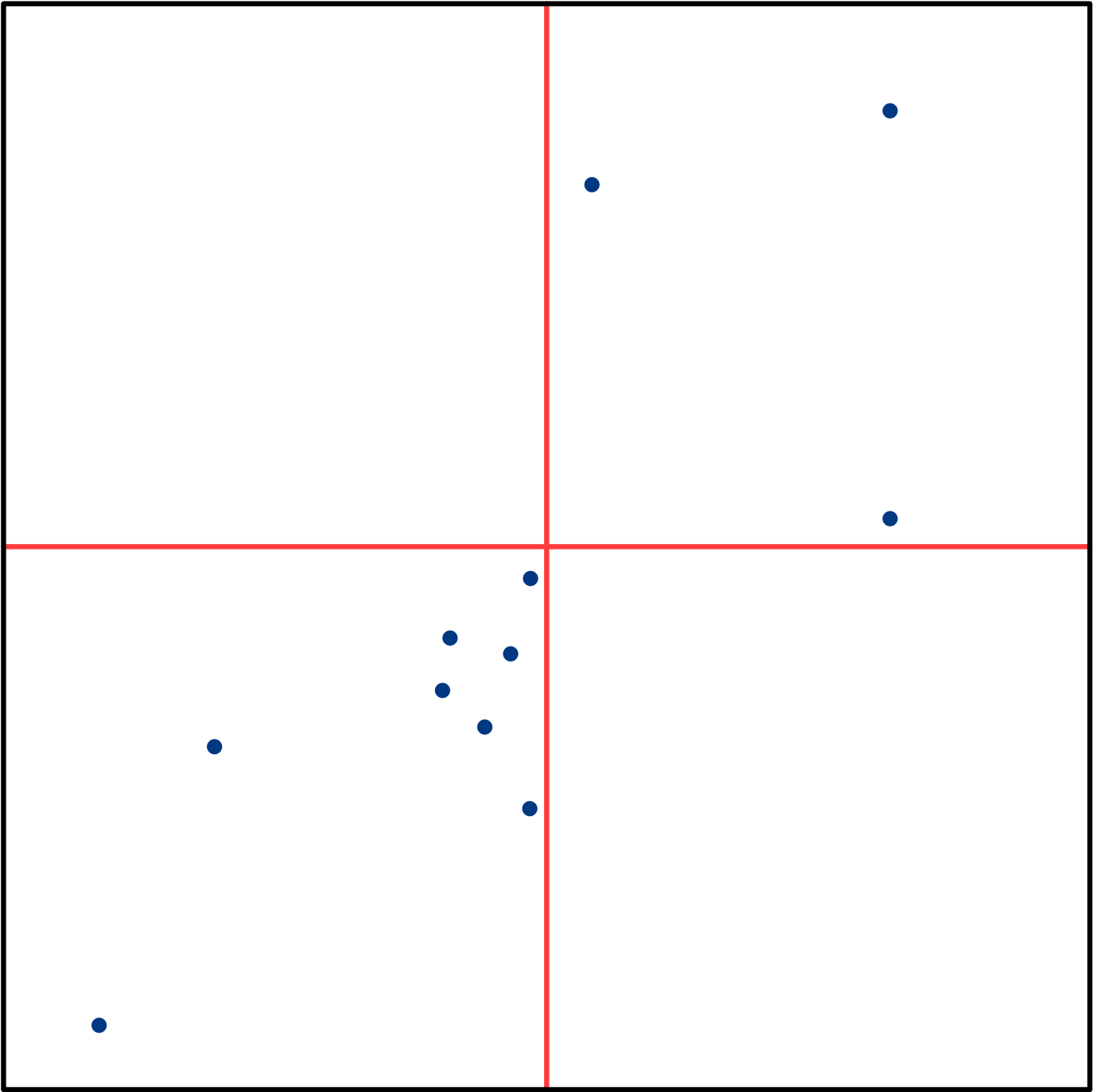




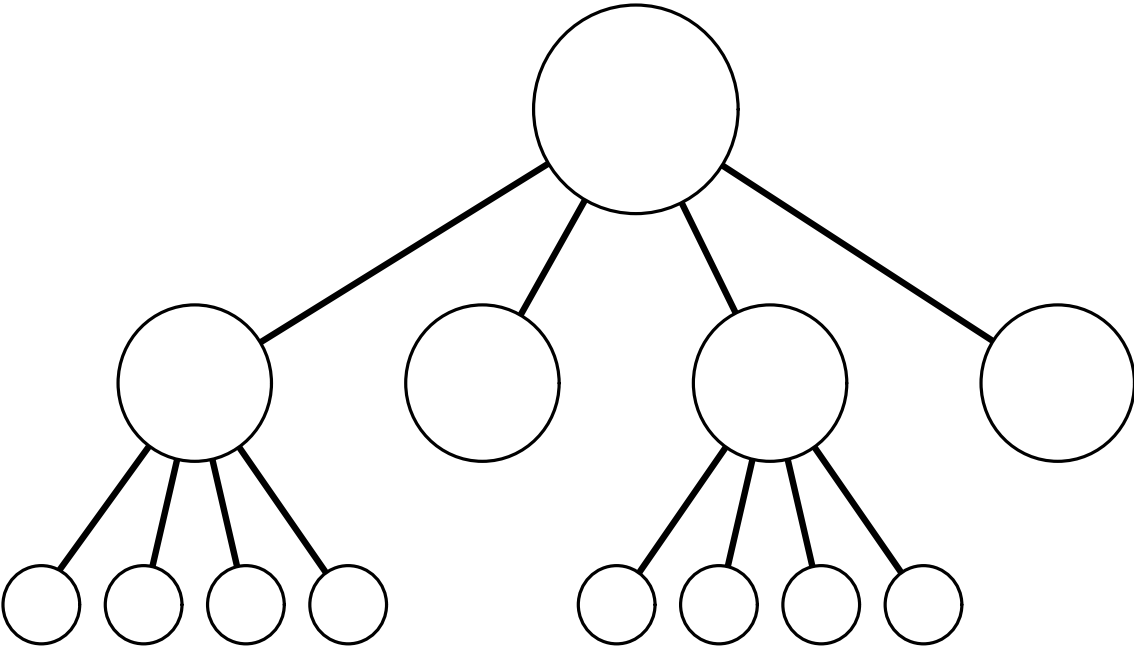
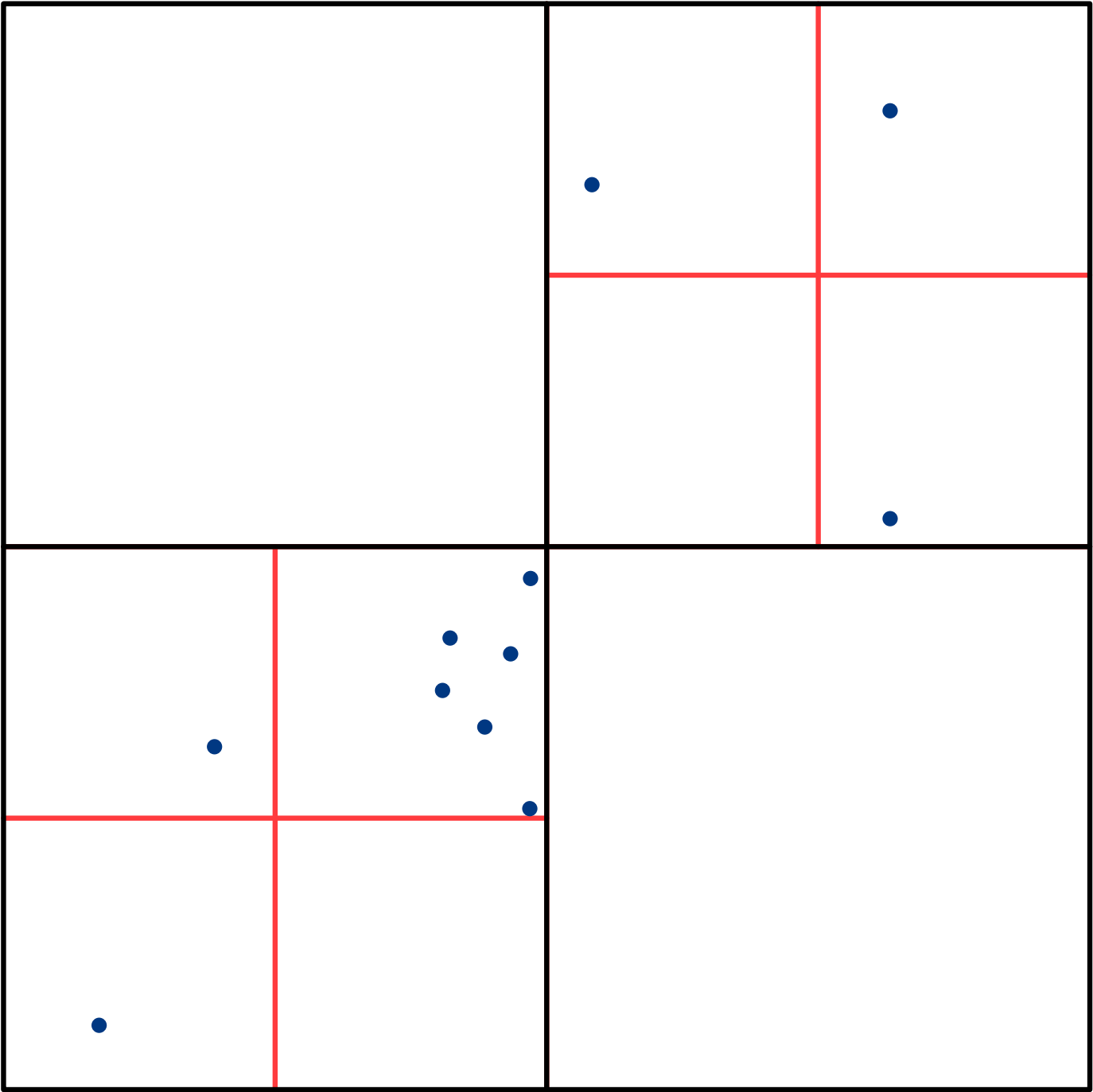
# Example



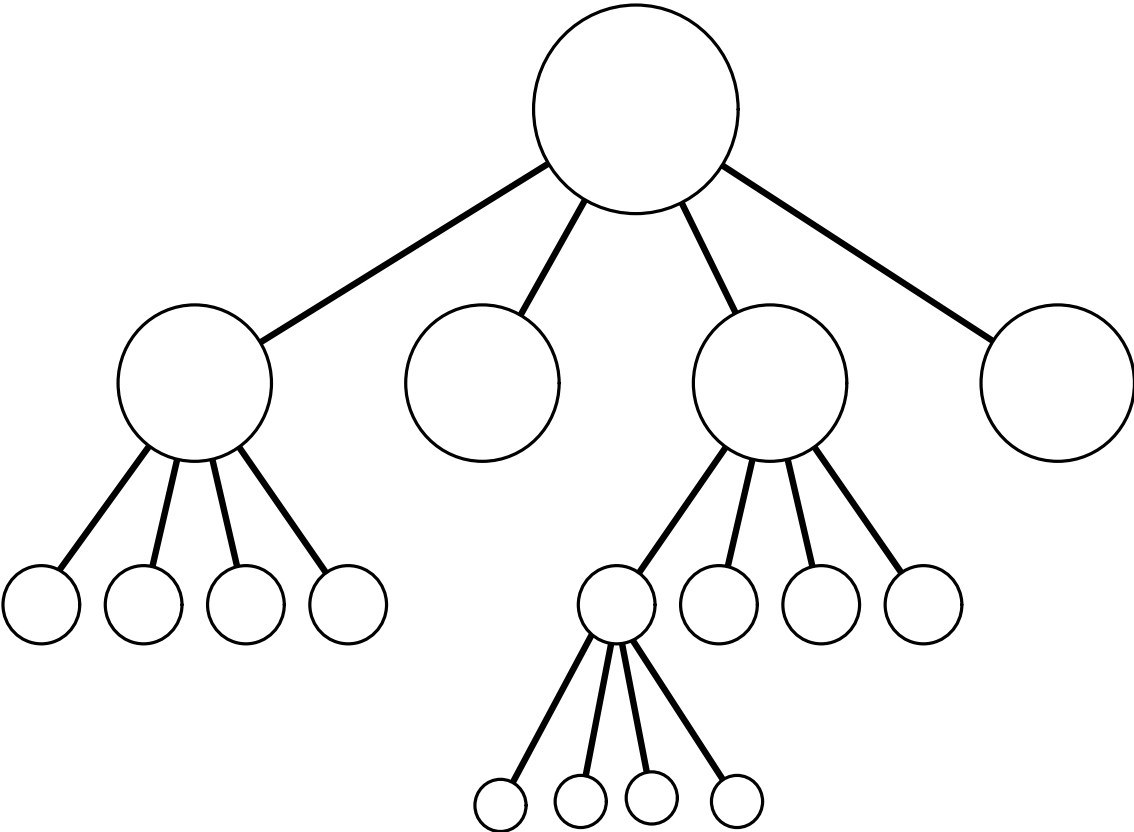
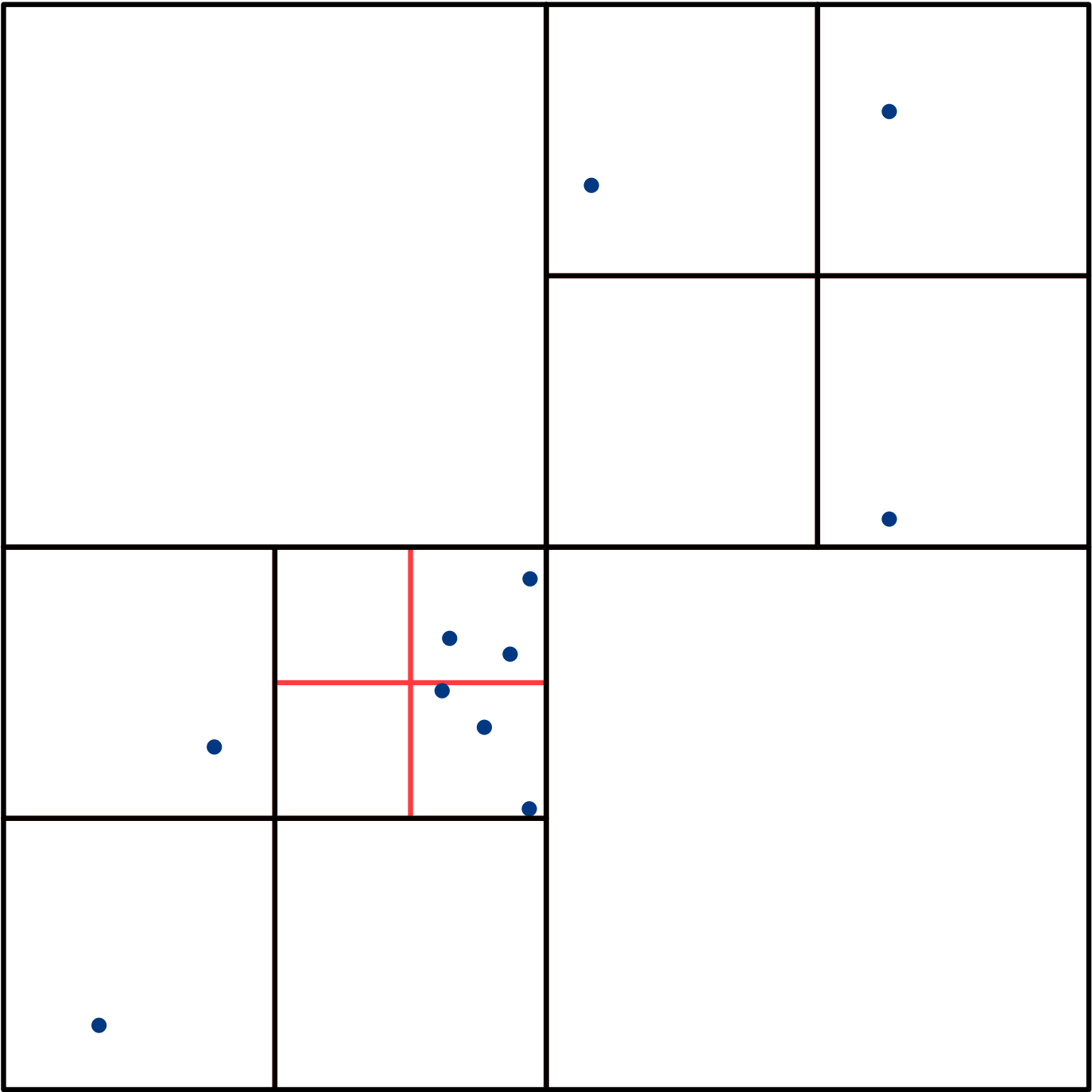
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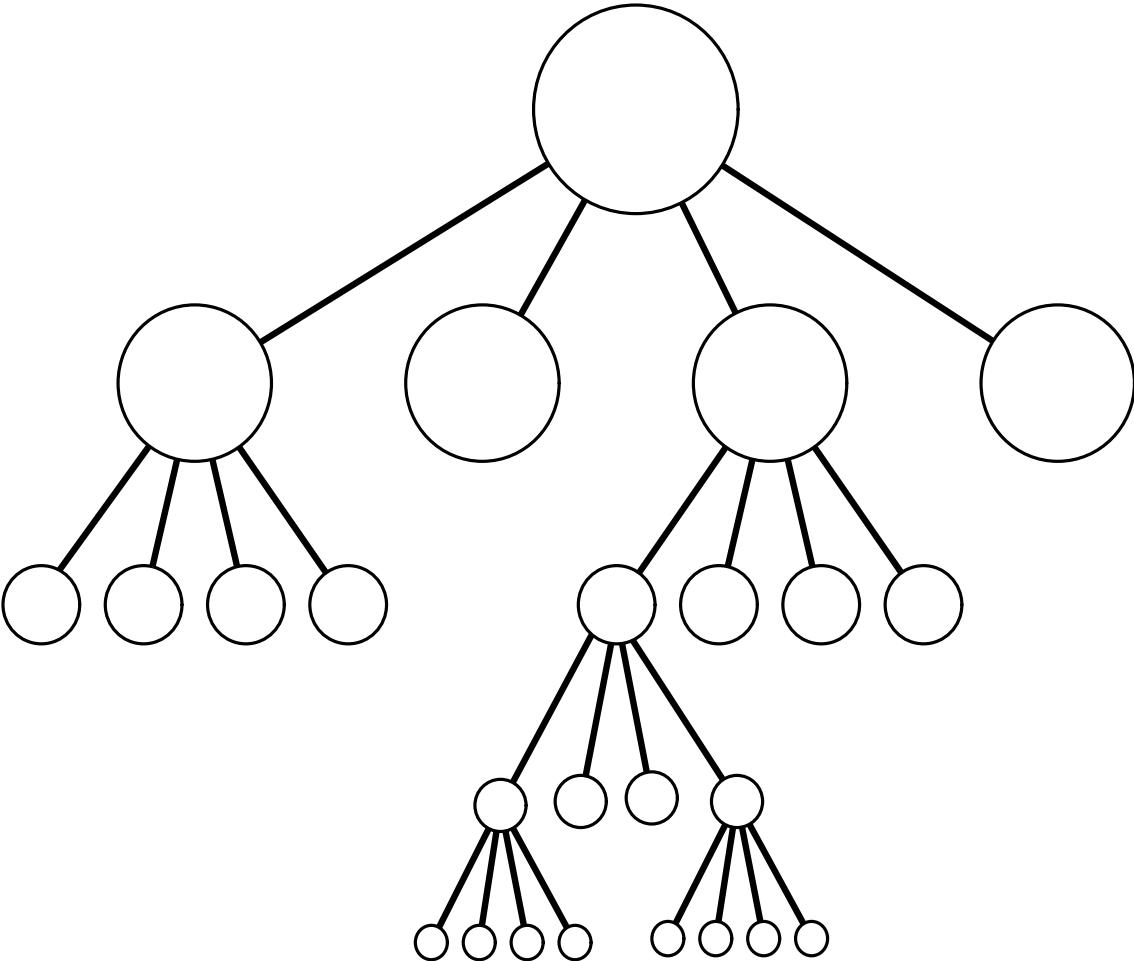
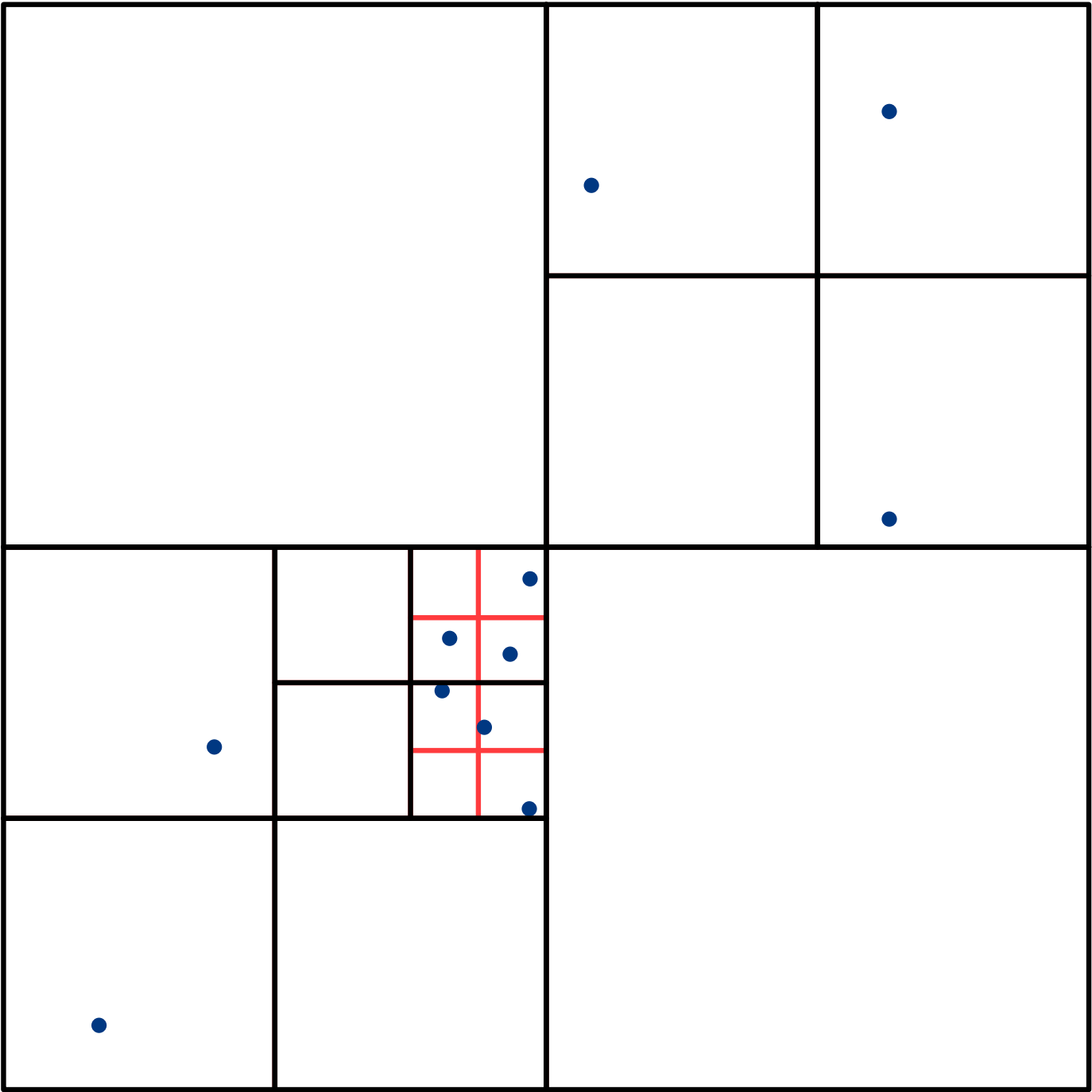
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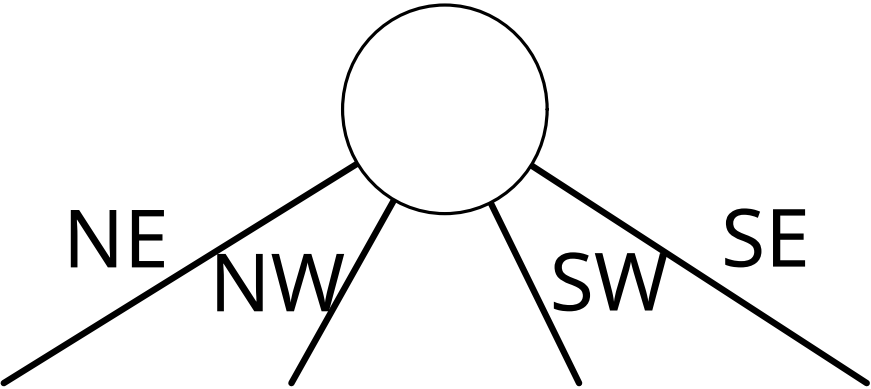
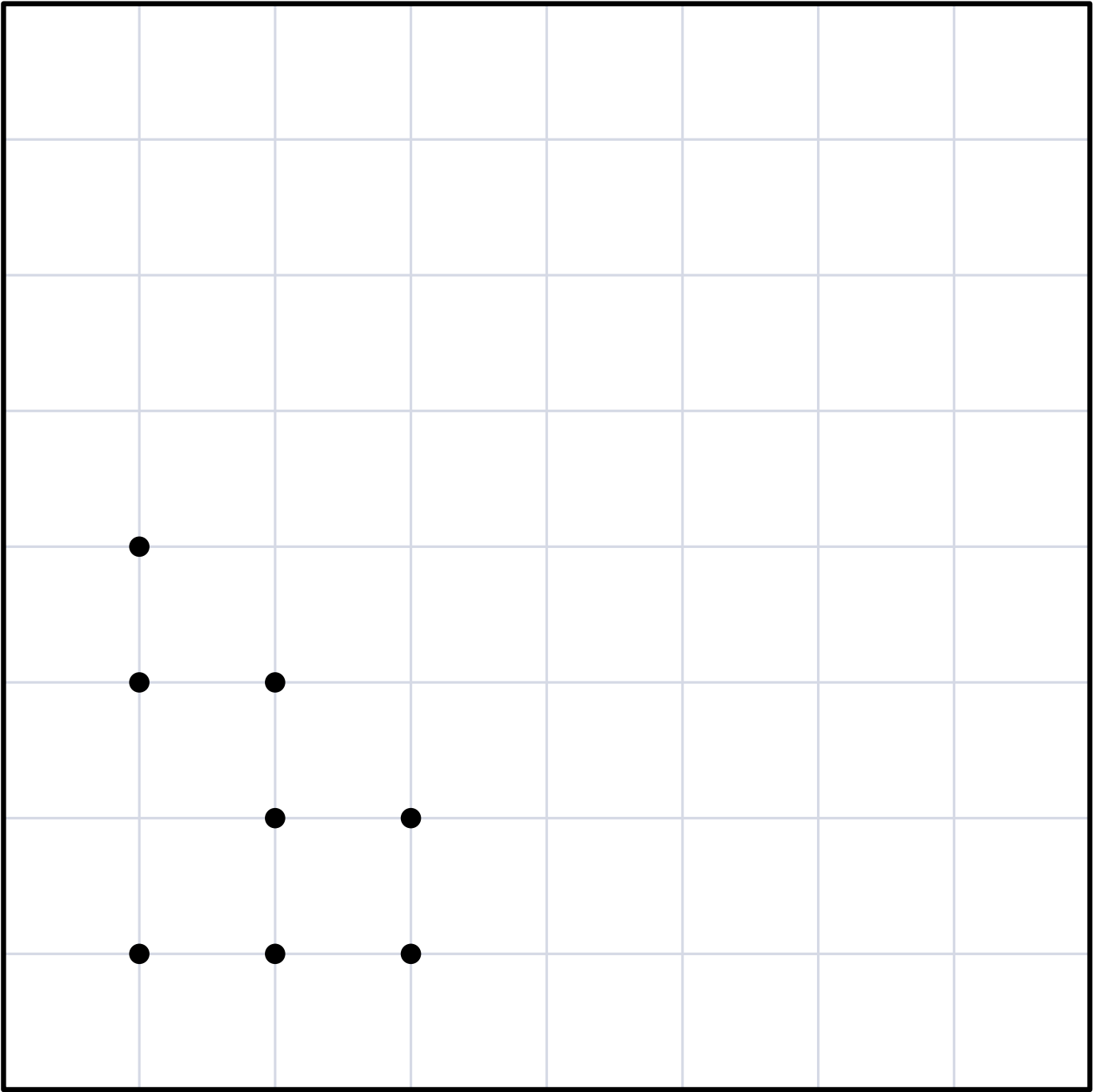
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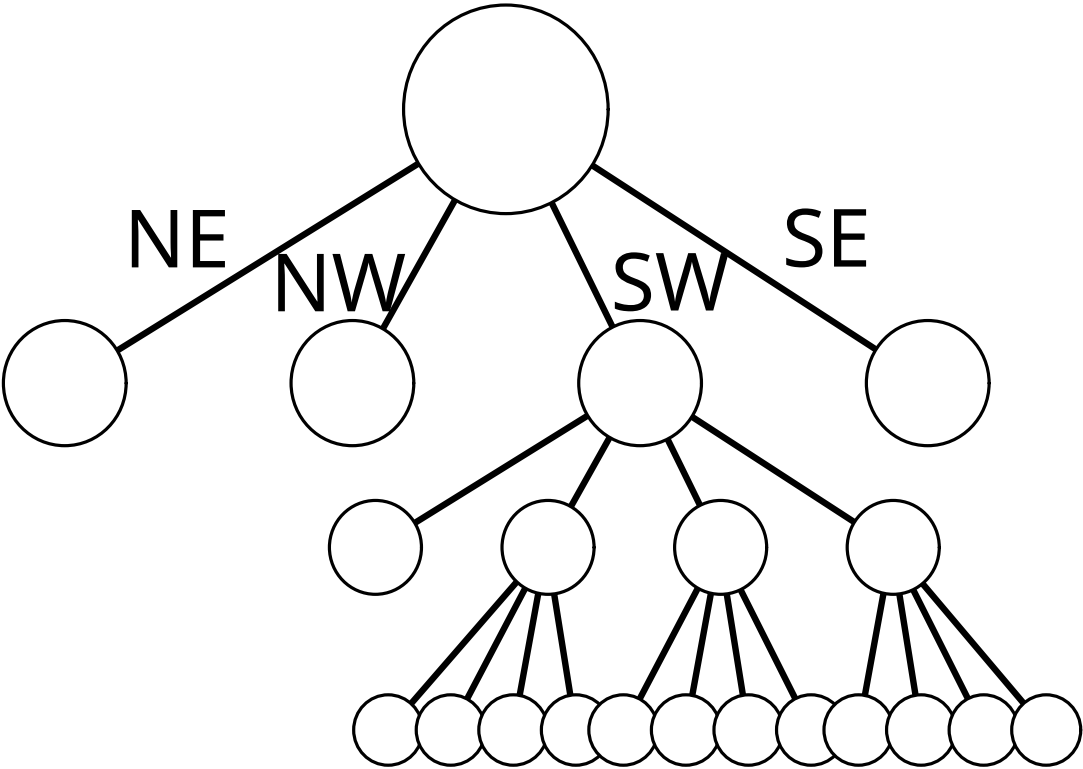
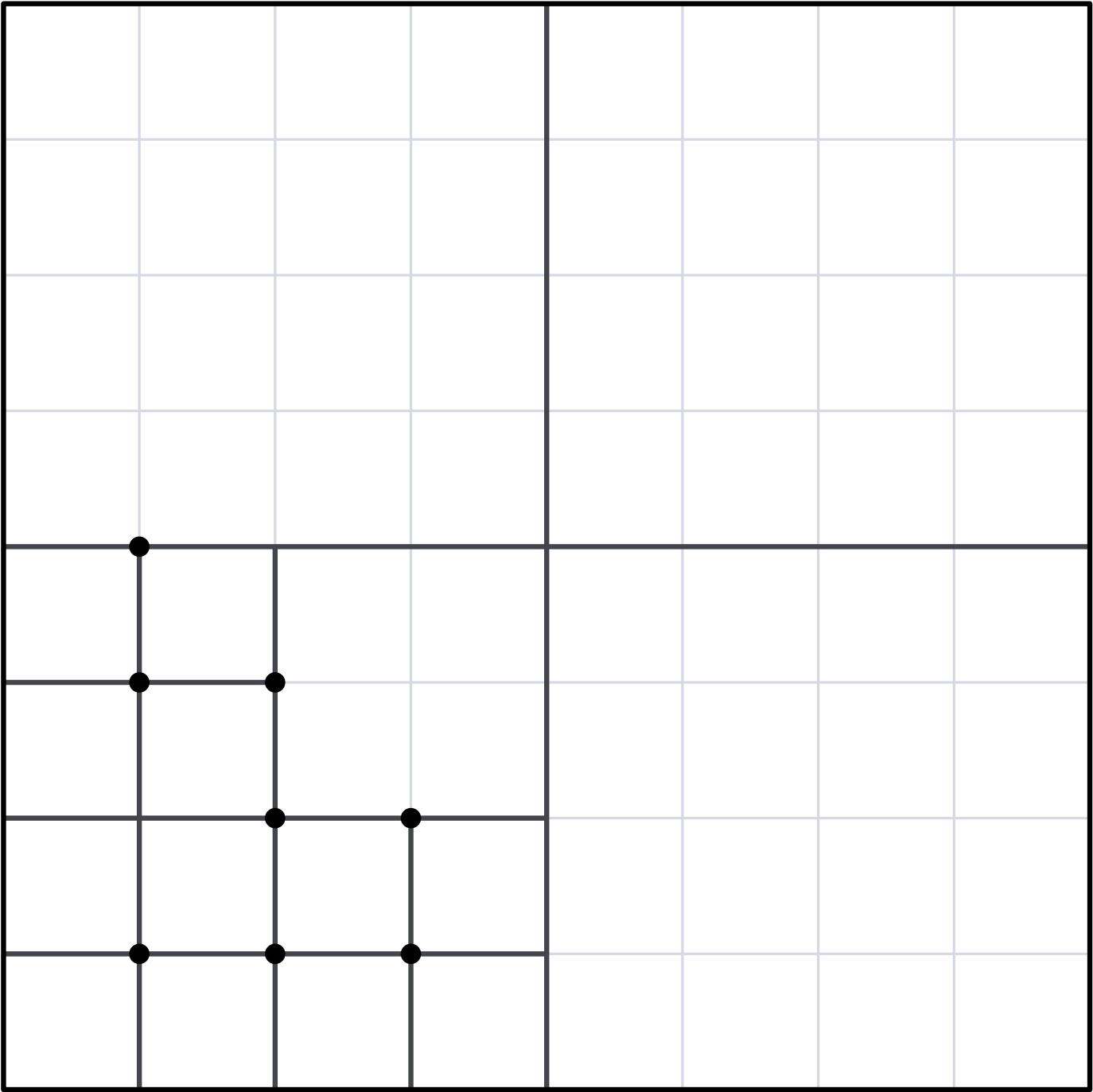
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# Quadtree properties

The recursive definition of a quadtree immediately results in an algorithm

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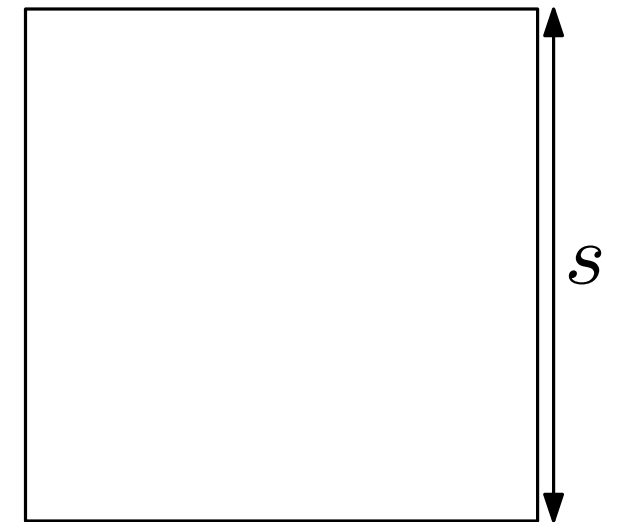
The recursive definition of a quadtree immediately results in an algorithm

**Question:** What is the depth of a quadtree with  $n$  nodes?

# Quadtree properties

The recursive definition of a quadtree immediately results in an algorithm

**Lemma 1:** Let  $c$  be the smallest distance between any two points in a point set  $P$ , and let  $s$  be the side length of the initial (biggest) square. Then the depth of a quadtree for  $P$  is at most  $\log(s/c) + 3/2$ .



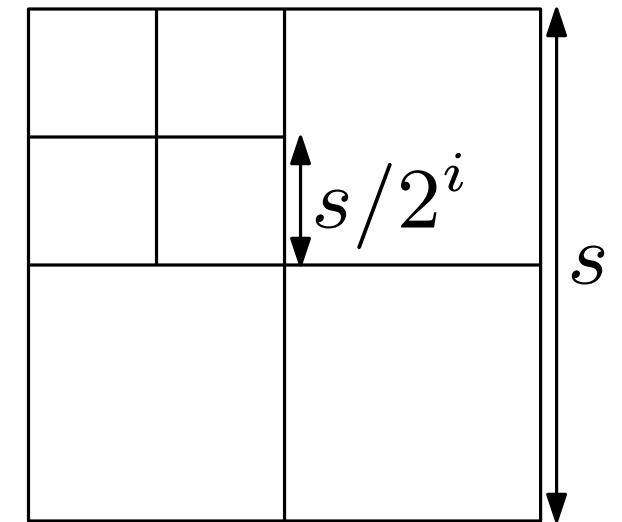
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**Proof:**

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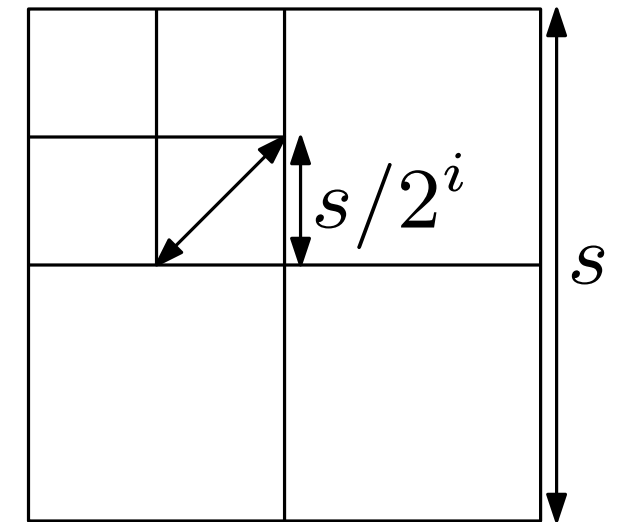
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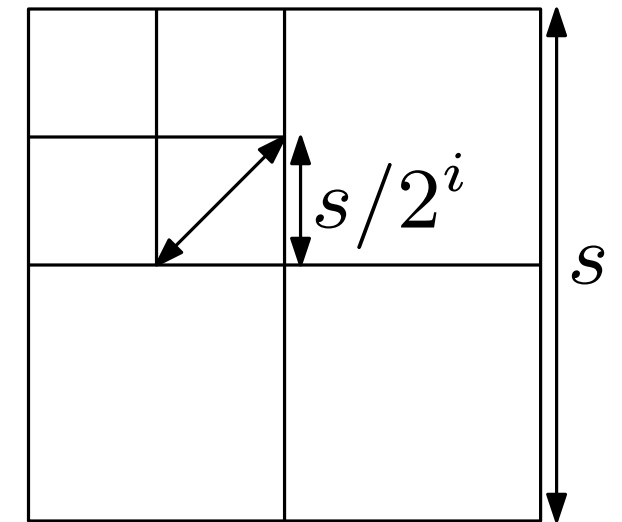
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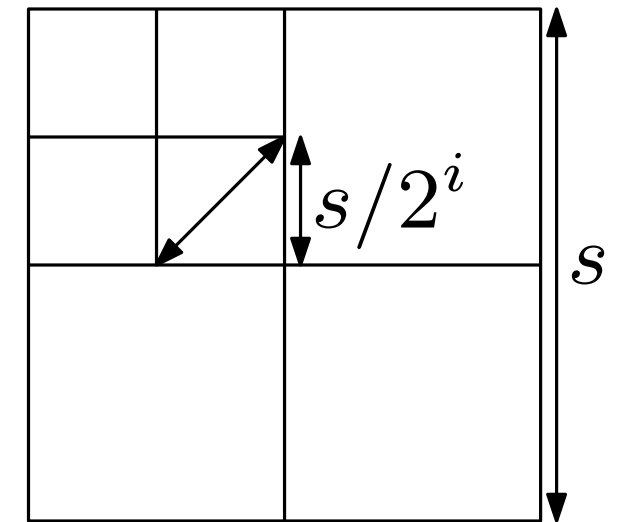
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- $\Rightarrow$  for depth  $d$  overall  $O((d + 1)n)$  nodes.

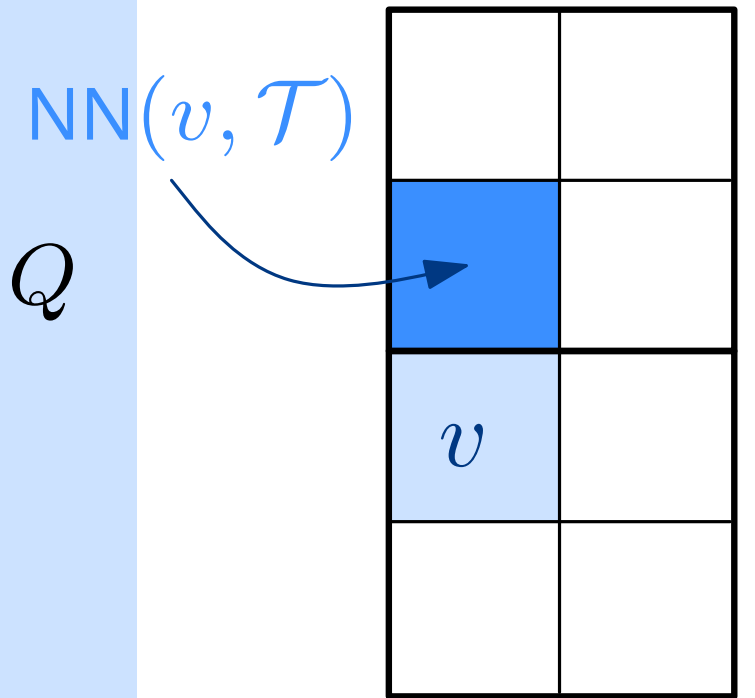
# Finding neighbors

$\text{NORTHNEIGHBOR}(v, \mathcal{T})$

*Input:* node  $v$  in quadtree  $\mathcal{T}$

*Output:* deepest  $v'$  not deeper than  $v$ , with  $v'.Q$  north neighbor of  $v.Q$

- 1: **if**  $v = \text{root}(\mathcal{T})$  **then return** NIL
- 2:  $\pi \leftarrow \text{parent}(v)$
- 3: **if**  $v = \text{SW(SE)-child of } \pi$  **then return** NW(NE)-child of  $\pi$
- 4:  $\mu \leftarrow \text{NORTHNEIGHBOR}(\pi, \mathcal{T})$
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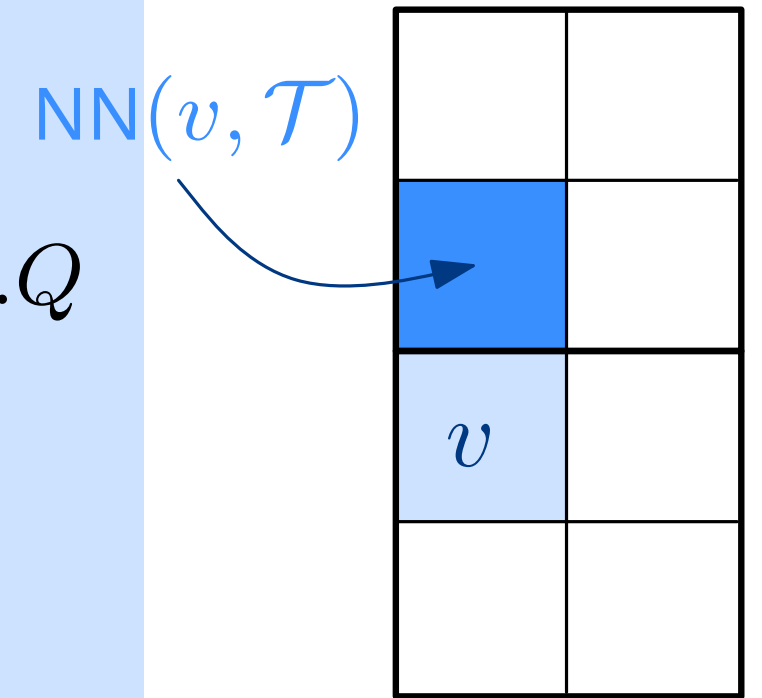
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**Theorem 2:** Let  $\mathcal{T}$  be a quadtree of depth  $d$ . The neighbors of a node  $v$  in any direction can be found in  $O(d + 1)$  time.

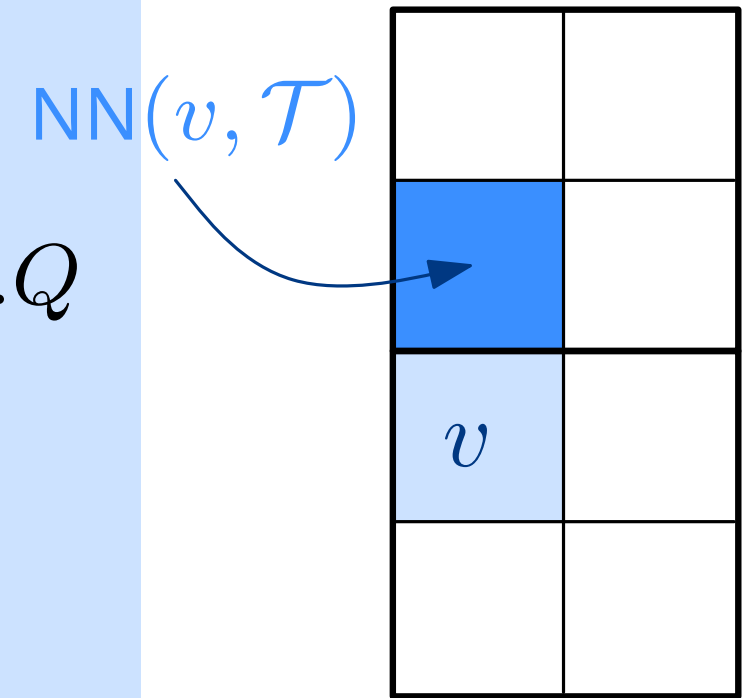
# Finding neighbors

$\text{NORTHNEIGHBOR}(v, \mathcal{T})$

*Input:* node  $v$  in quadtree  $\mathcal{T}$

*Output:* deepest  $v'$  not deeper than  $v$ , with  $v'.Q$  north neighbor of  $v.Q$

- 1: **if**  $v = \text{root}(\mathcal{T})$  **then return** NIL
- 2:  $\pi \leftarrow \text{parent}(v)$
- 3: **if**  $v = \text{SW(SE)-child of } \pi$  **then return** NW(NE)-child of  $\pi$
- 4:  $\mu \leftarrow \text{NORTHNEIGHBOR}(\pi, \mathcal{T})$
- 5: **if**  $\mu = \text{NIL}$  or  $\mu$  is a leaf **then return**  $\mu$
- 6: **if**  $v = \text{NW(NE)-child of } \pi$  **then return** SW(SE)-child of  $\mu$



**Theorem 2:** Let  $\mathcal{T}$  be a quadtree of depth  $d$ . The neighbors of a node  $v$  in any direction can be found in  $O(d + 1)$  time.

**Proof:**

- depth of recursion is  $O(d + 1)$
- cost per recursive step is  $O(1)$

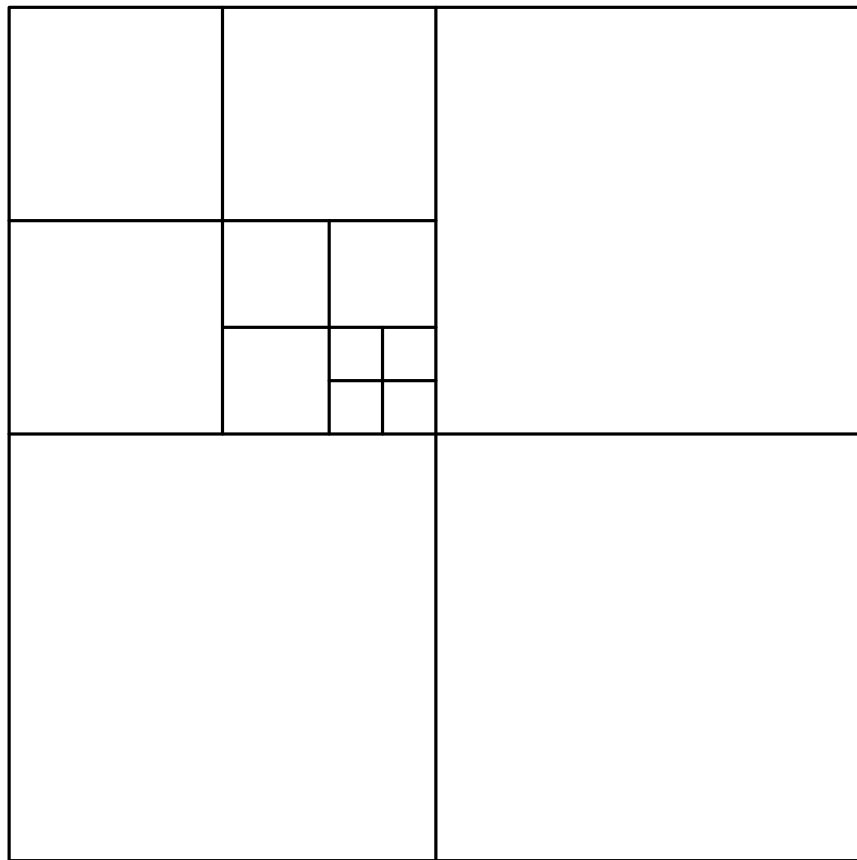


# Balanced quadrees

**Definition:** a quadtree is **balanced** if any two neighboring nodes differ by at most 1 in depth

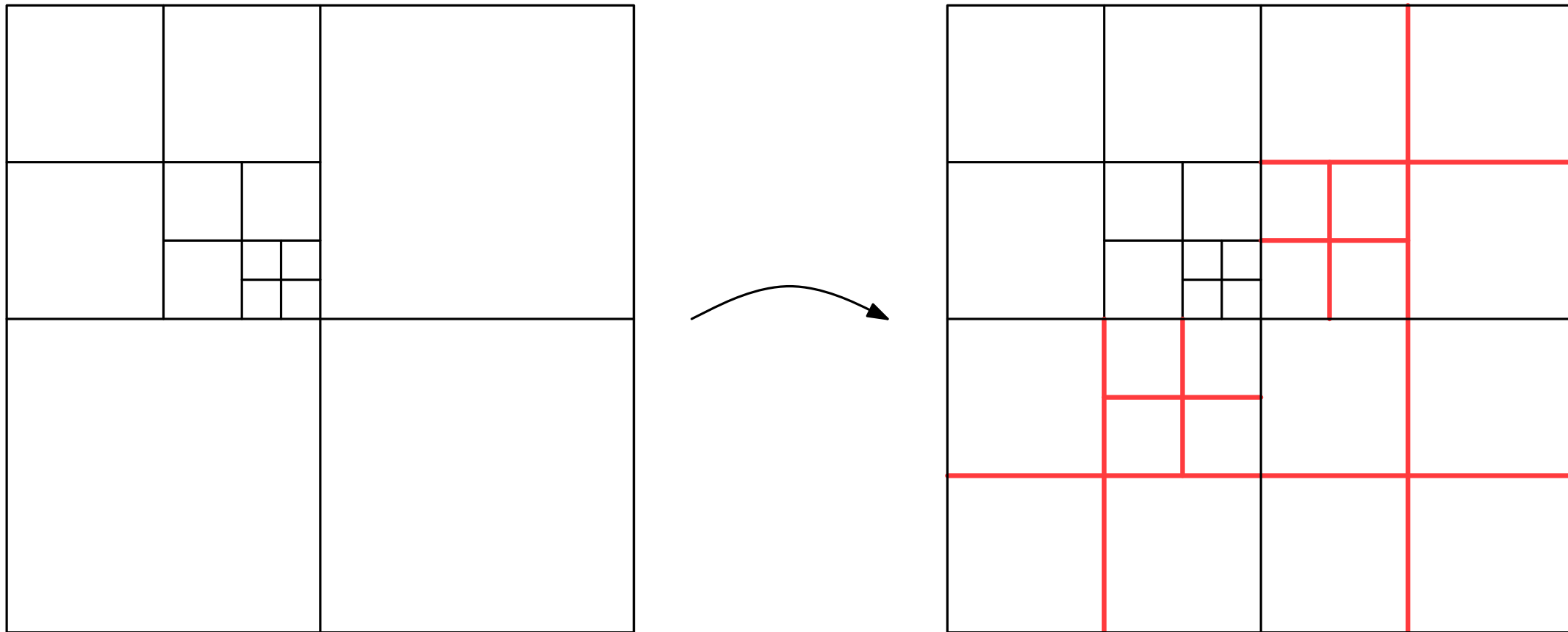
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# Balanced quadrees

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# Balancing quadtrees

BALANCEQUADTREE( $\mathcal{T}$ )

*Input:* Quadtree  $\mathcal{T}$

*Output:* Balanced quadtree  $\mathcal{T}$

1:  $L \leftarrow$  list of all leafs of  $\mathcal{T}$

2: **while**  $L$  is not empty **do**

3:    $\mu \leftarrow$  extract a leaf from  $L$

4:   **if**  $\mu.Q$  is too large **then**

5:     partition  $\mu.Q$  into 4 quadrants and add 4 leaves to  $\mathcal{T}$

6:     insert new leaves into  $L$

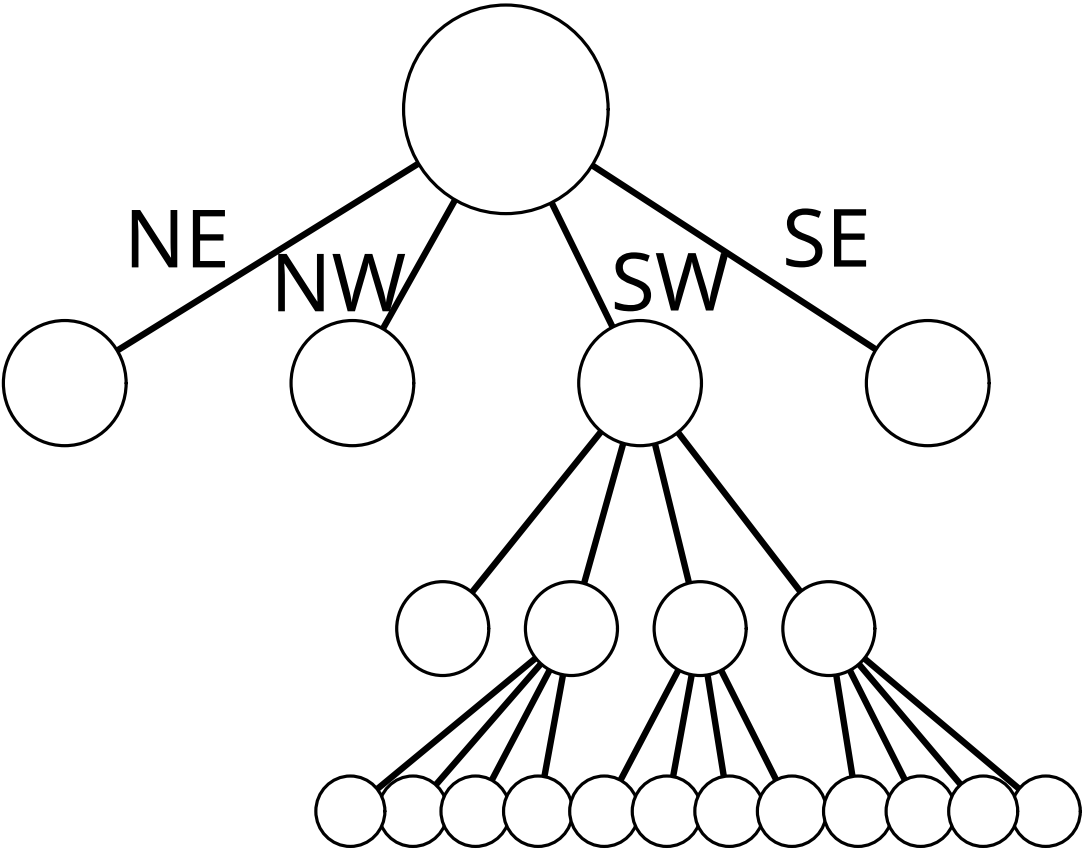
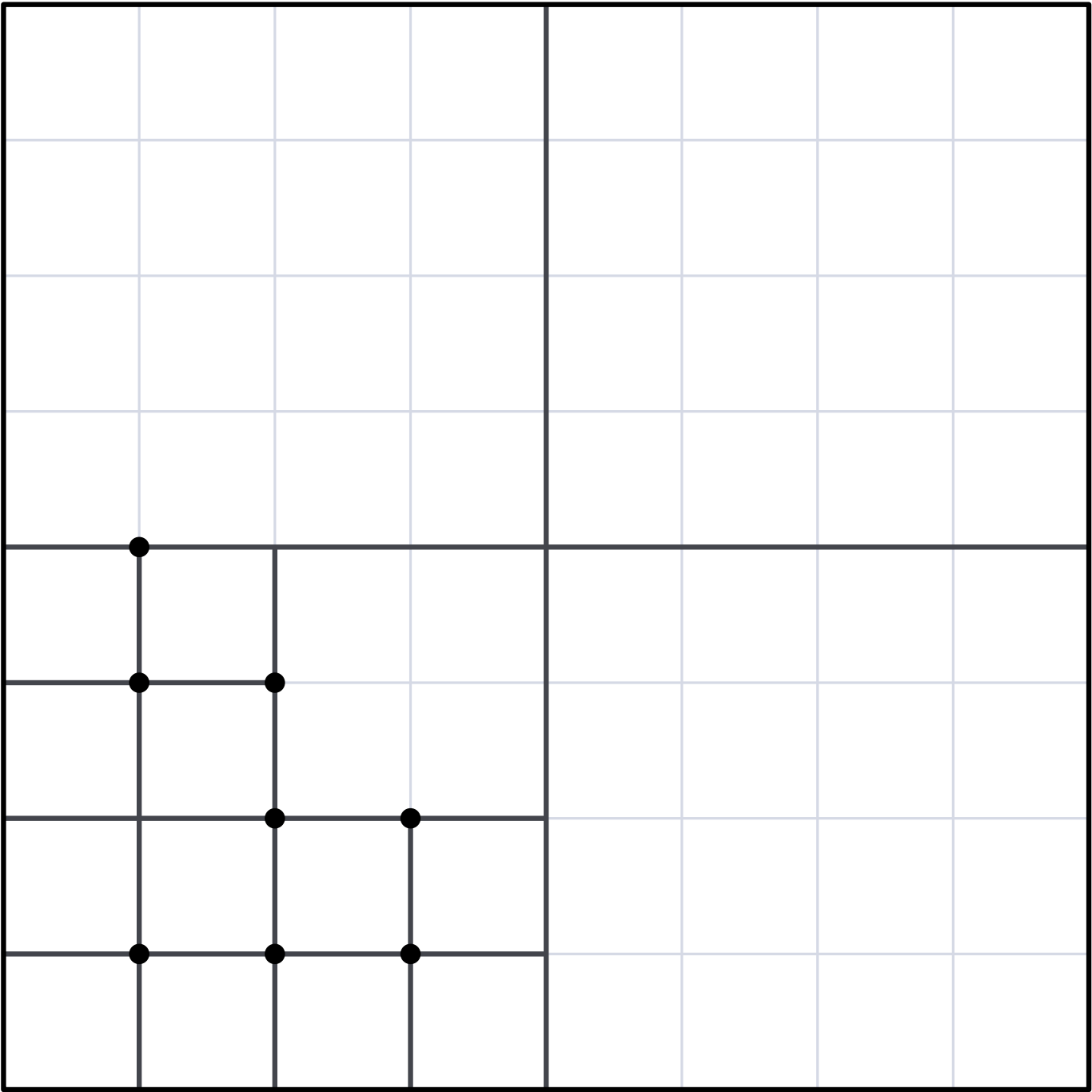
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9: **return**  $\mathcal{T}$

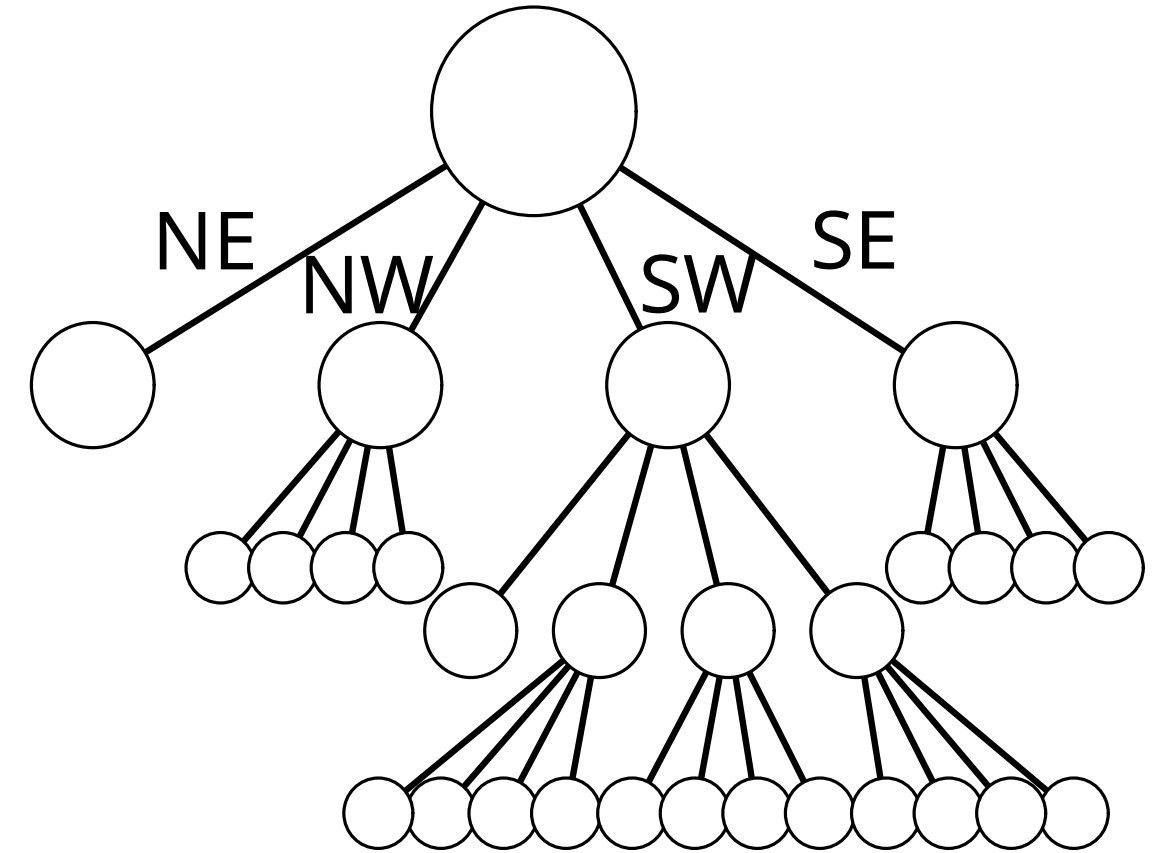
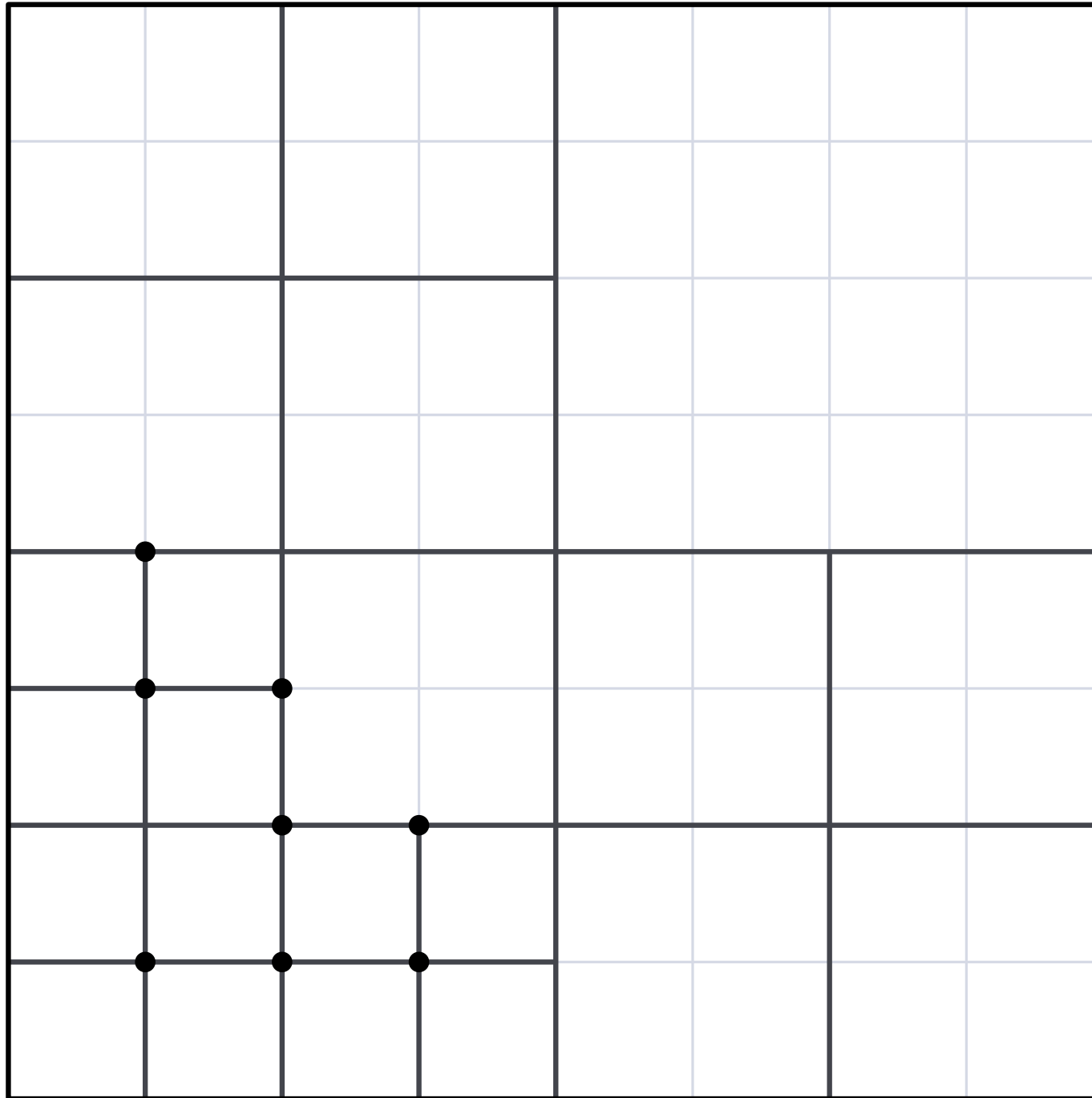
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Exercise:



# Balancing quadtrees

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**Question:** How large can a balanced quadtree get?

# Balancing quadrees

**Theorem 3:** Let  $\mathcal{T}$  be a quadtree with  $m$  nodes. Then the balanced version of  $\mathcal{T}$  has  $O(m)$  nodes and can be constructed in  $O((d + 1)m)$  time.

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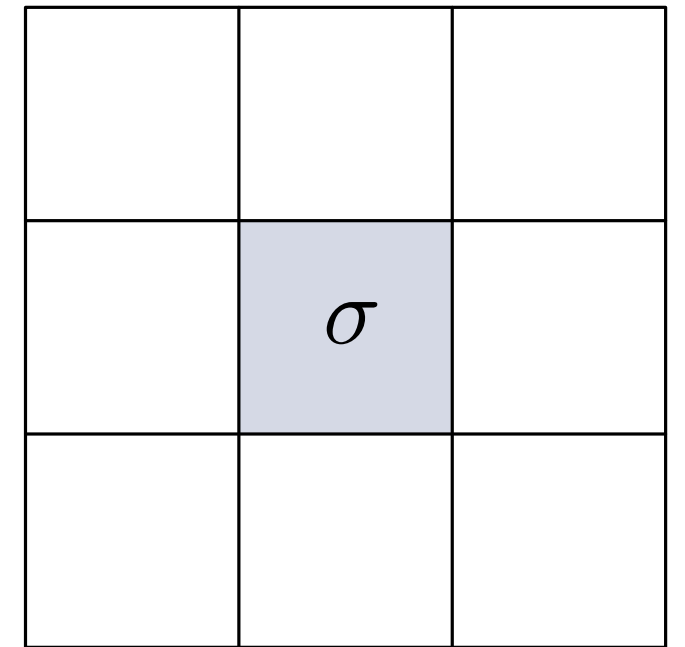
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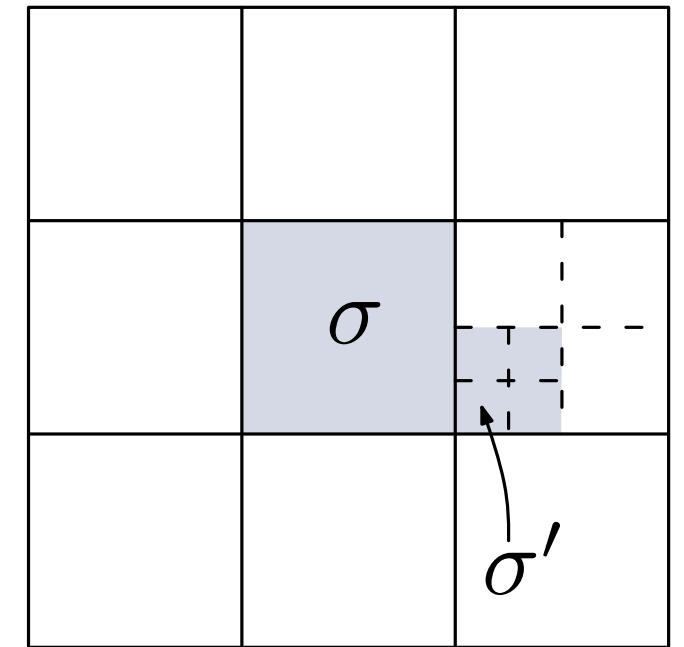
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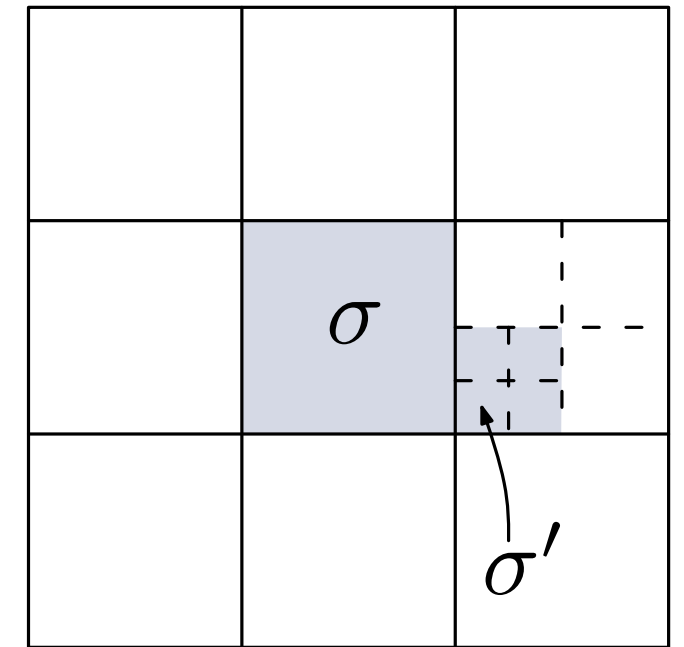
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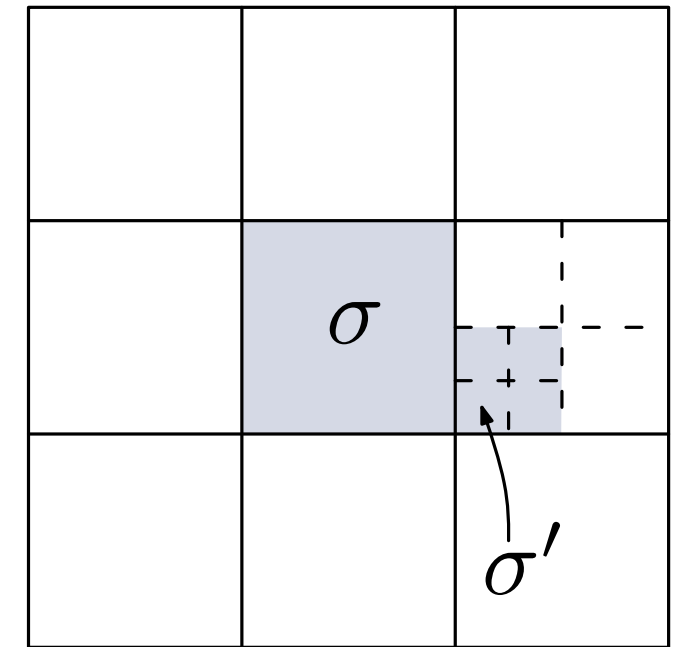
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# Balancing quadrees

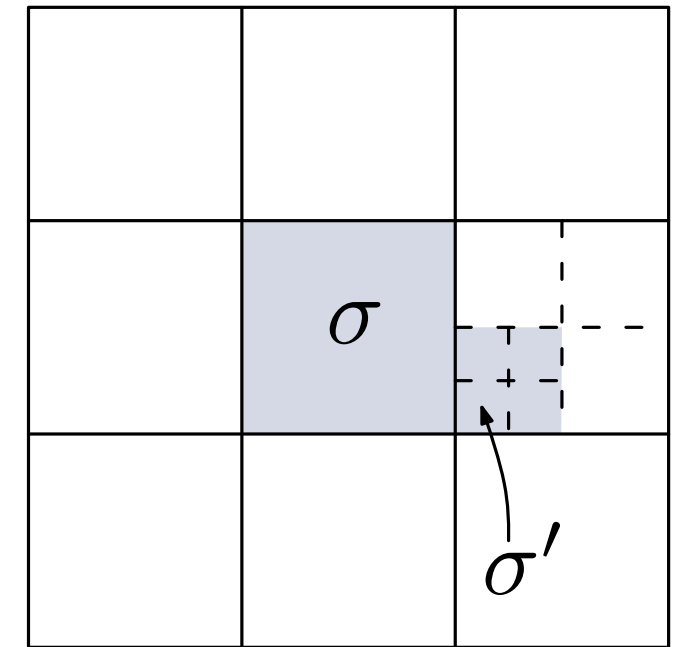
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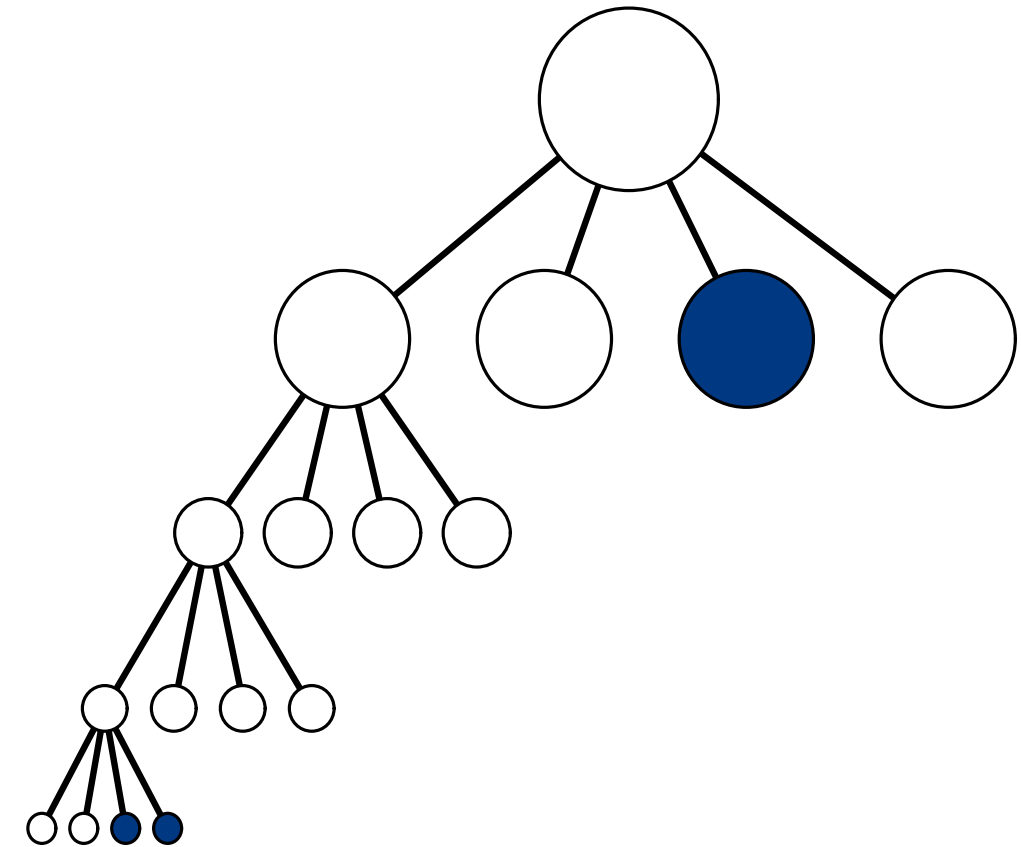
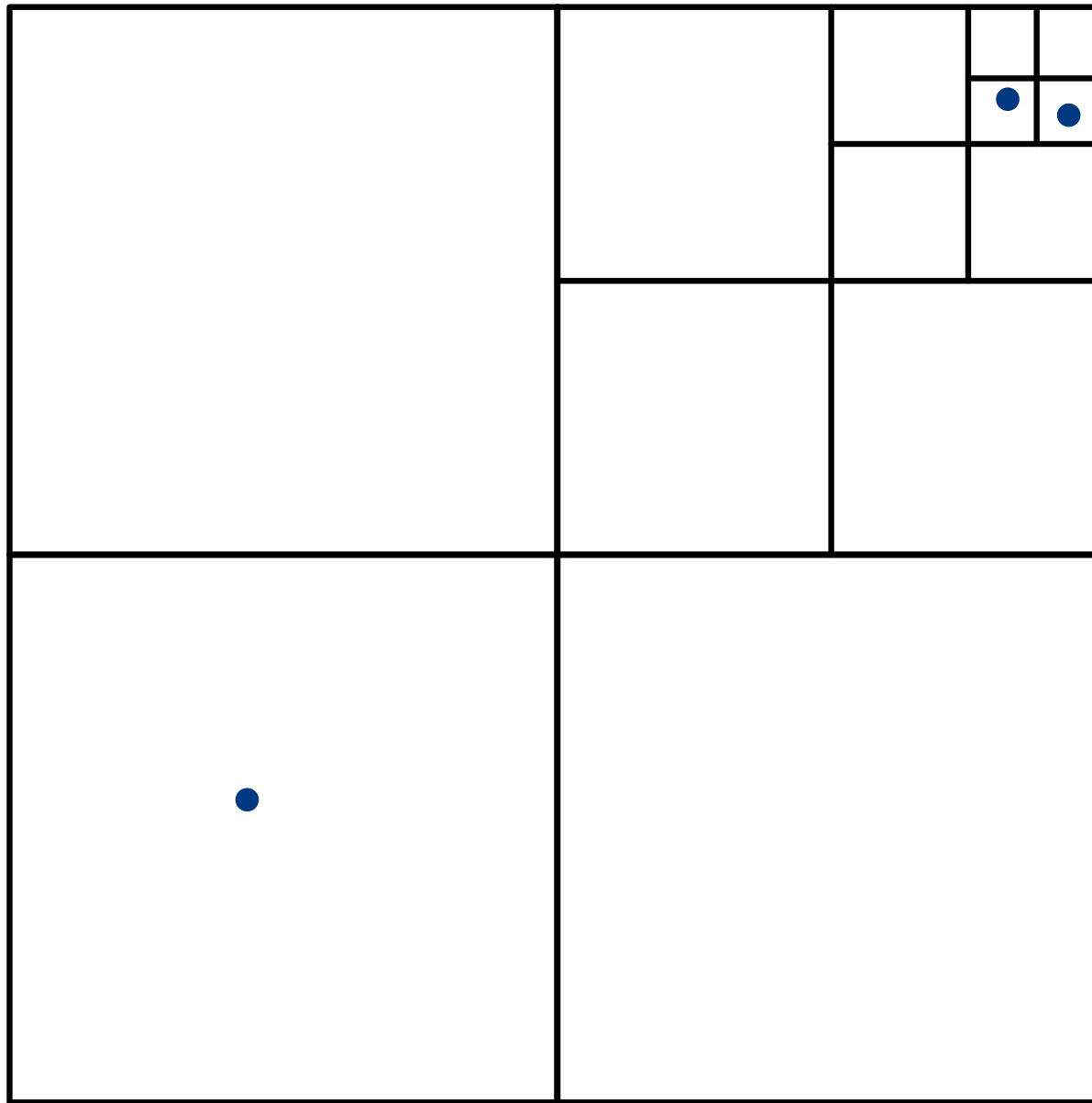
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$\Rightarrow O(m)$  nodes and  $O((d + 1)m)$  time



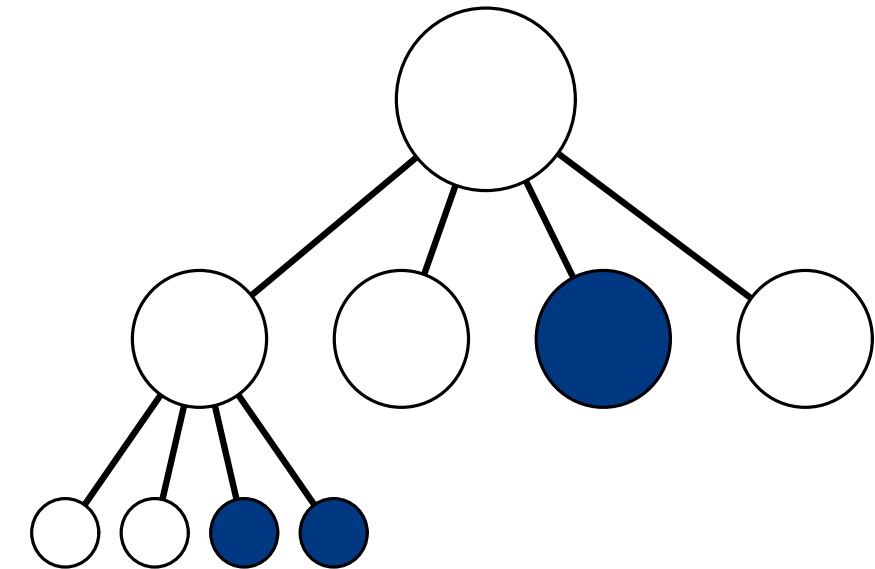
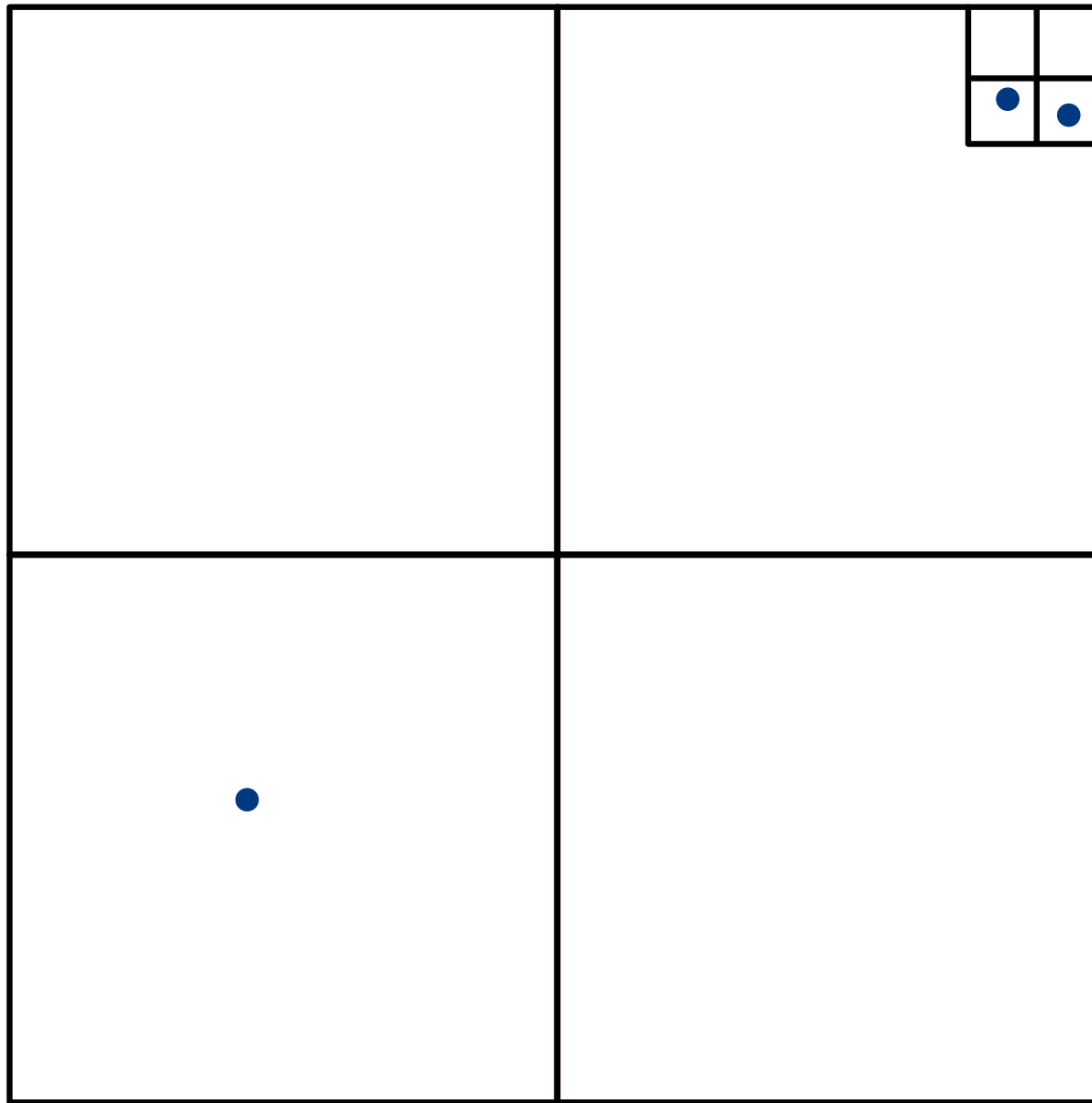


# Compressed quadtrees



Paths of nodes with only one non-empty child can be compressed to an edge

# Compressed quadtrees



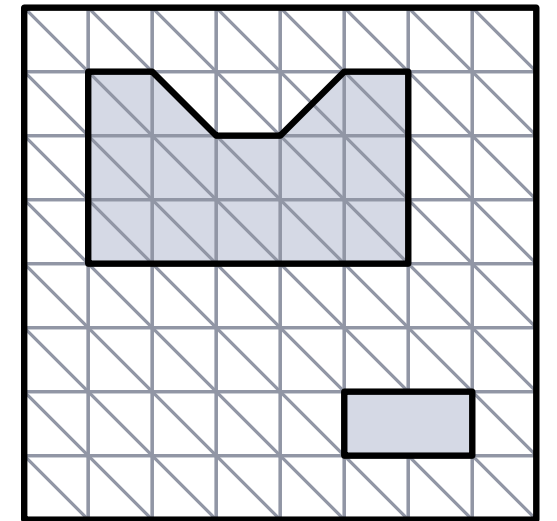
Paths of nodes with only one non-empty child can be compressed to an edge  $\rightarrow$  size  $O(n)$

# Quadtrees and non-uniform meshes

**Given:** **octilinear** polygons with integer coordinates within a square  $Q = [0, U] \times [0, U]$  with  $U = 2^j$  a power of two

**Goal:** triangular mesh of  $Q$  with the following properties

- **conforming**: exactly one triangle on each side of interior edges
- **respect input**: edges of input must be part of union of mesh edges
- **well-shaped**: angles between  $45^\circ$  and  $90^\circ$
- **non-uniform**: fine near boundaries, coarse otherwise



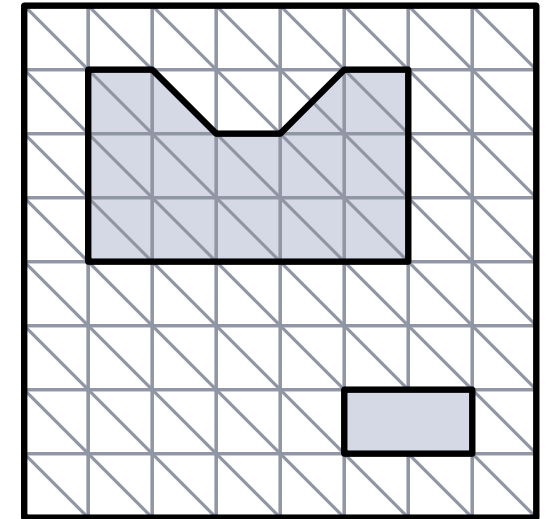
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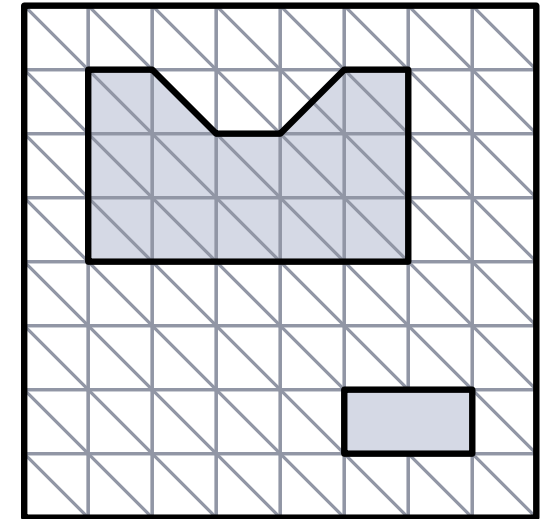
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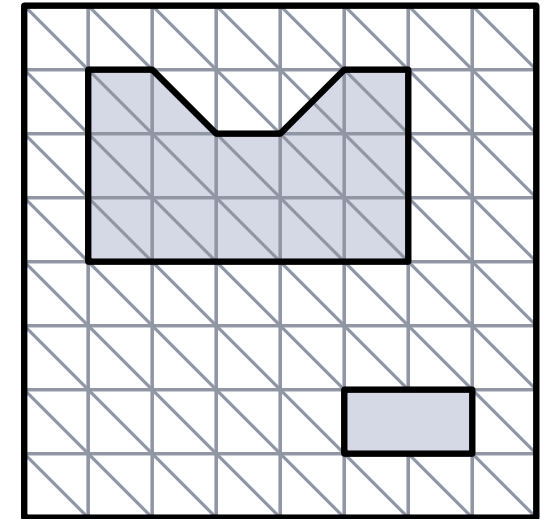


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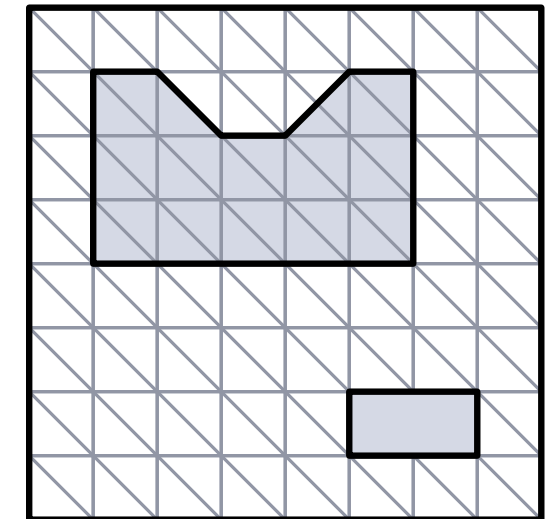
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- **w** intersections also include: and  $90^\circ$
- **n**
  - polygon boundary in square
  - common edge, or even just common point
- polygon boundary in square, coarse otherwise

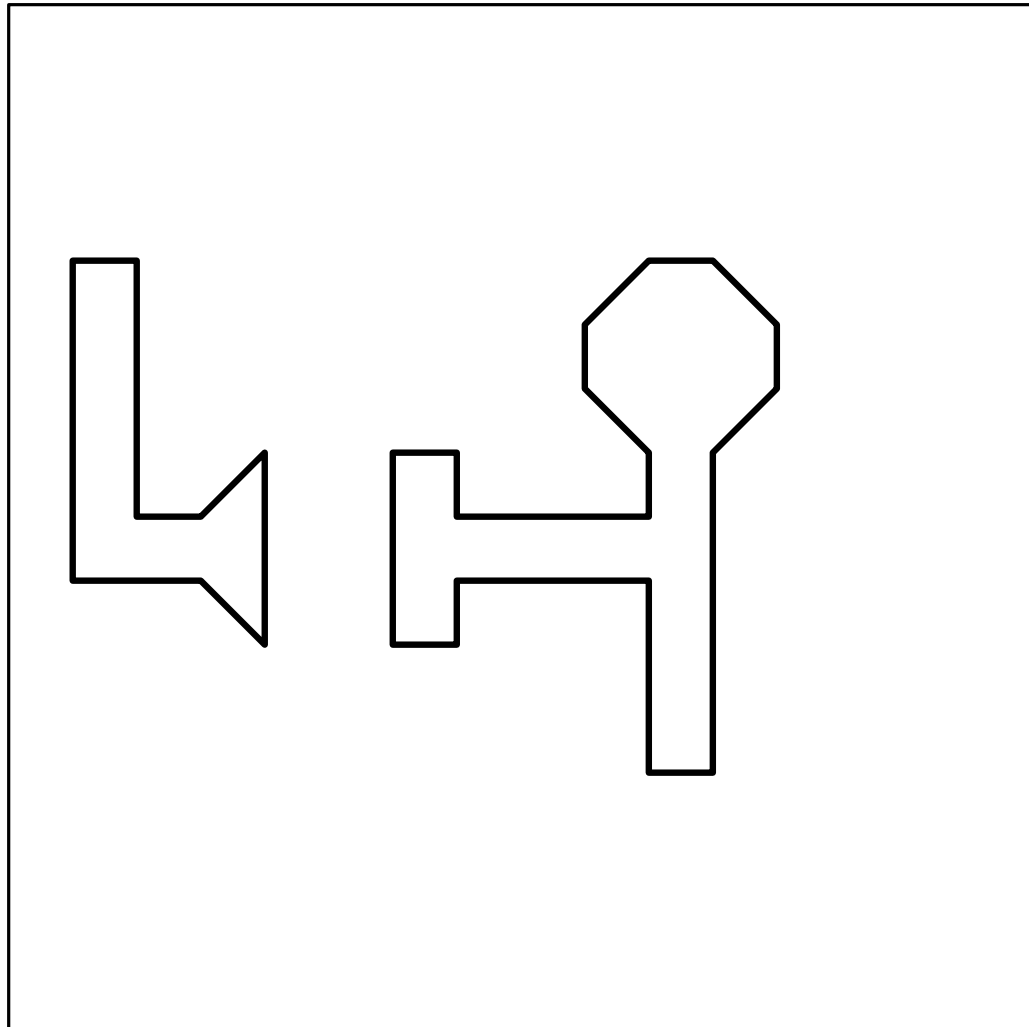
**Idea**

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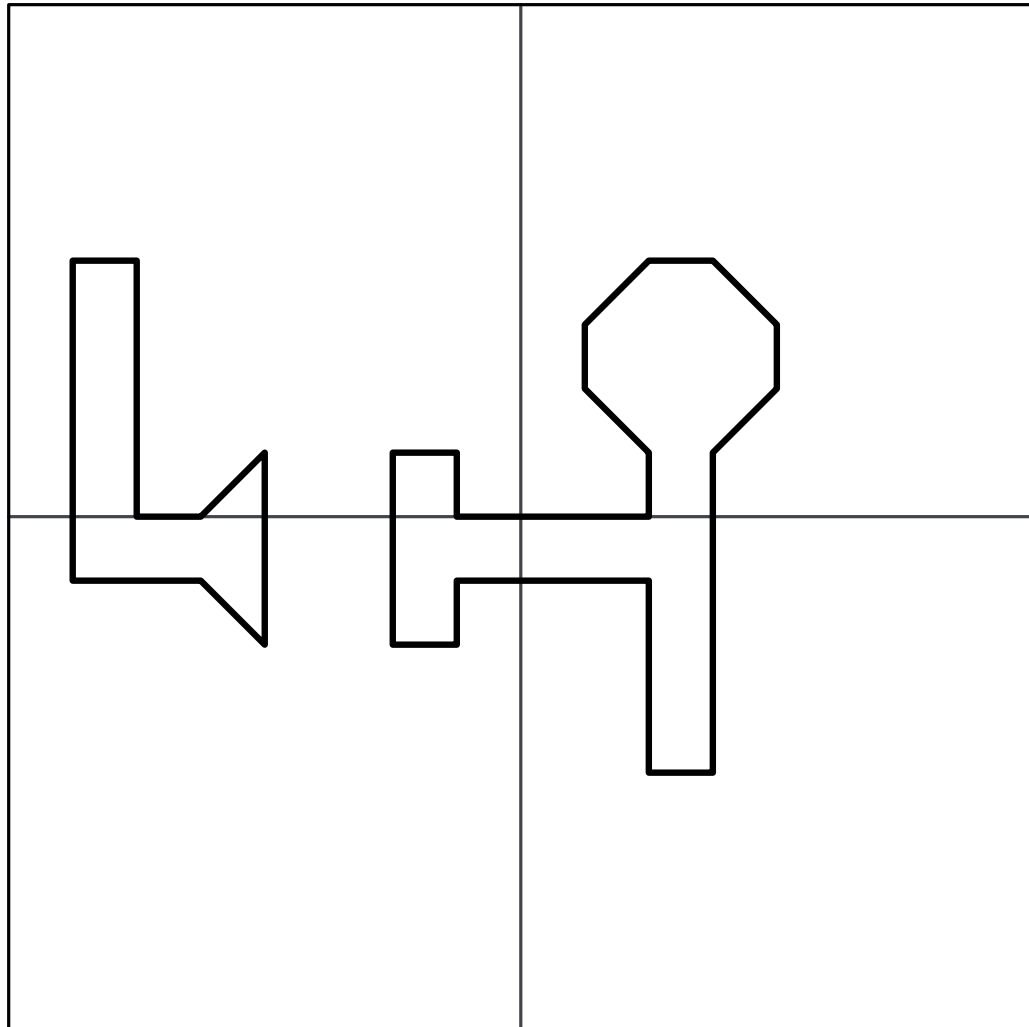


# From quadtrees to meshes

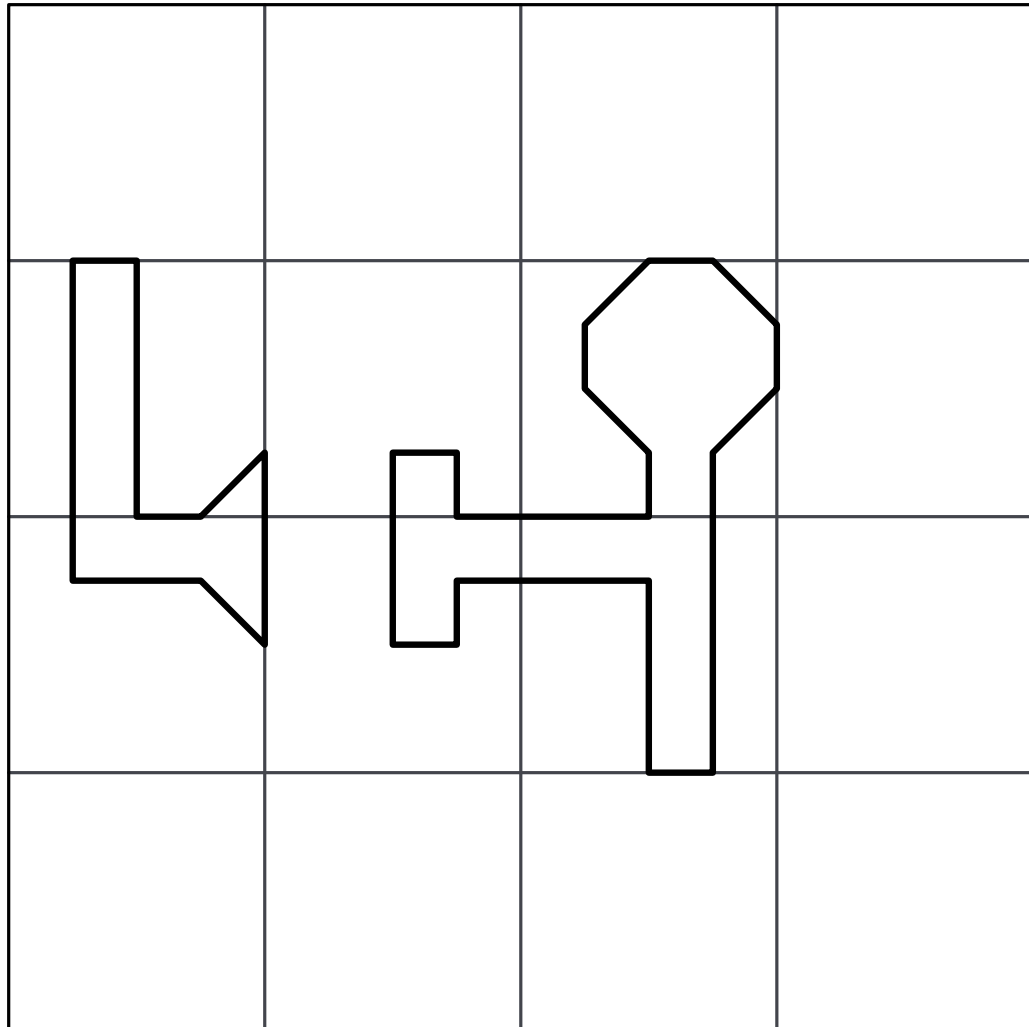




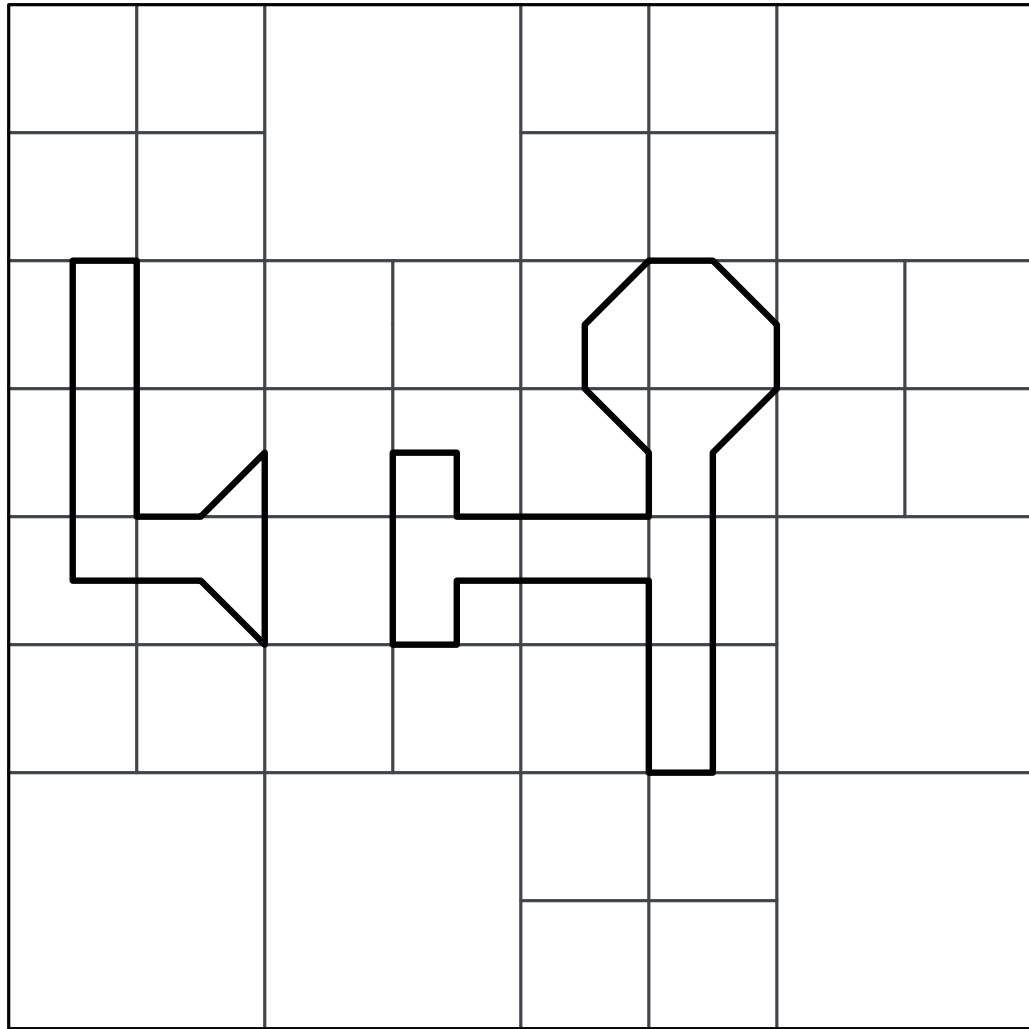
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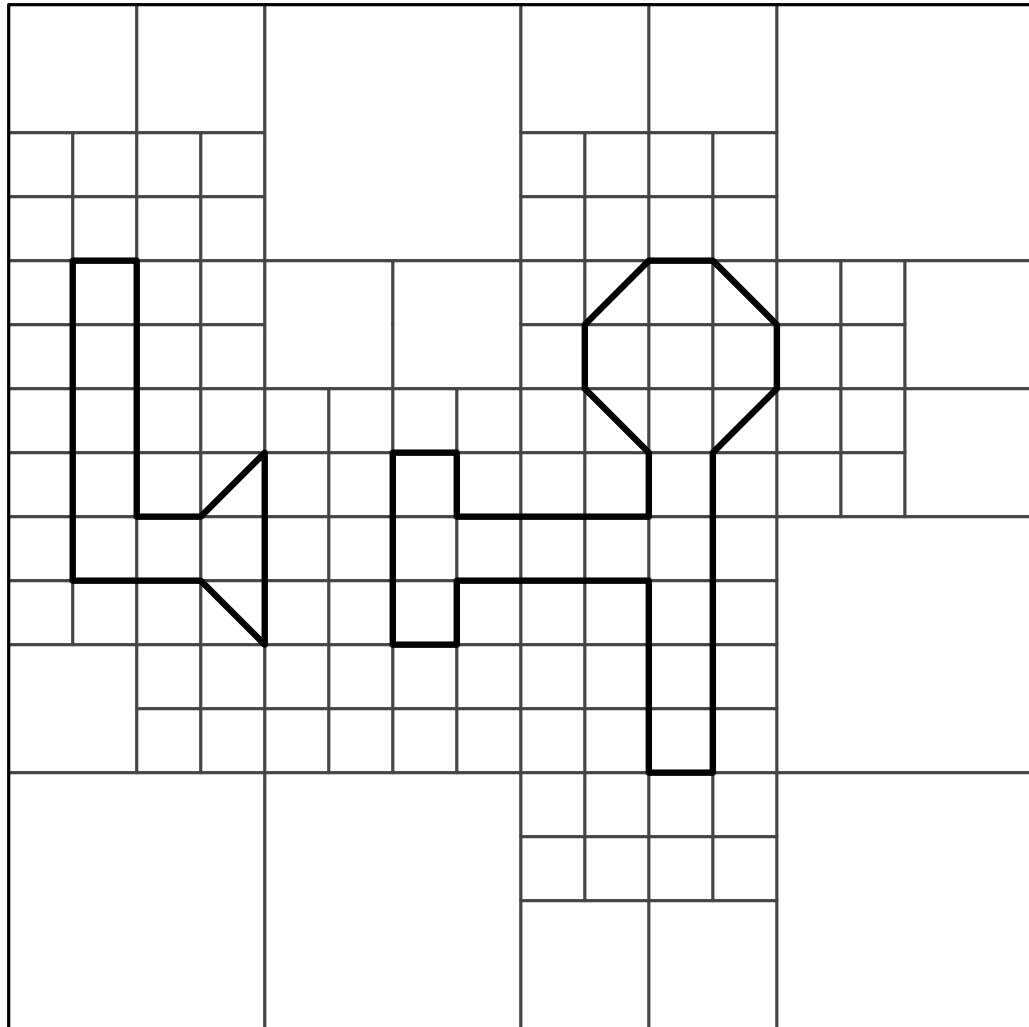
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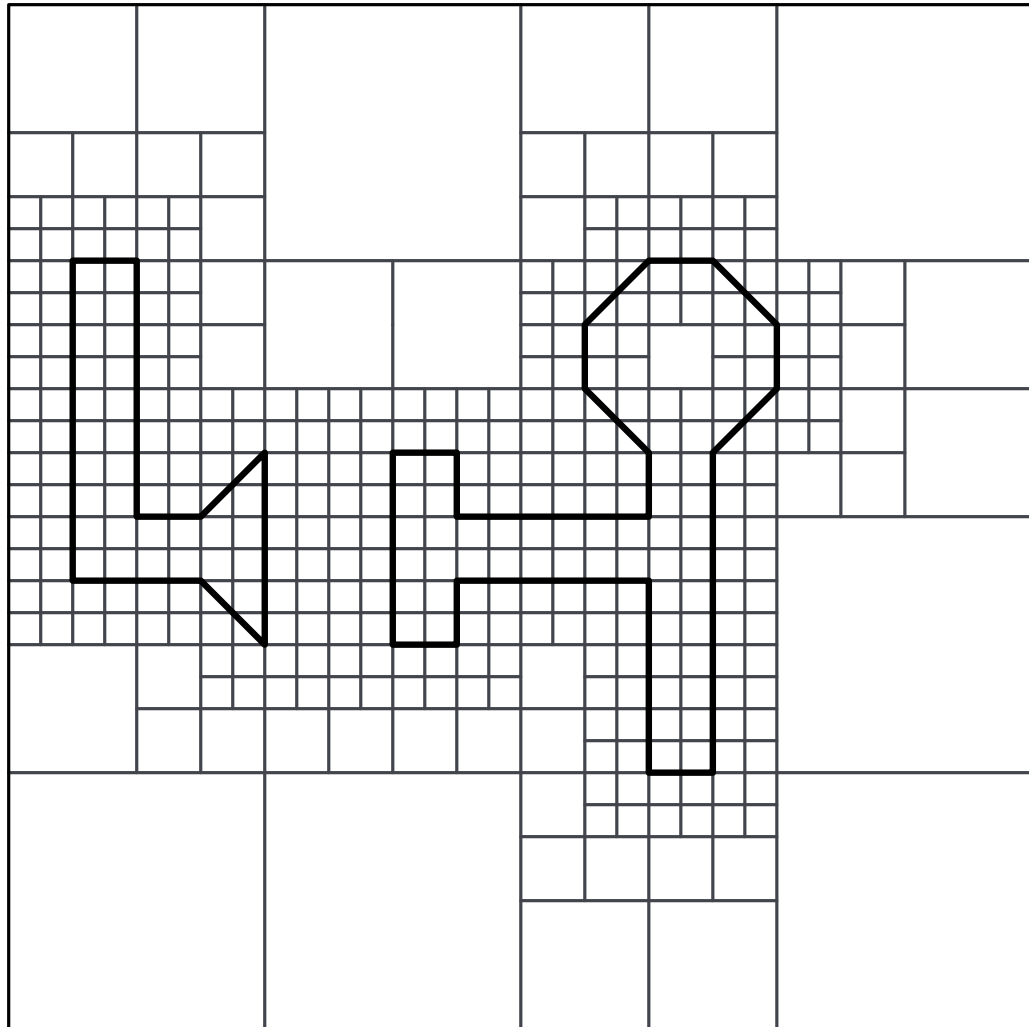
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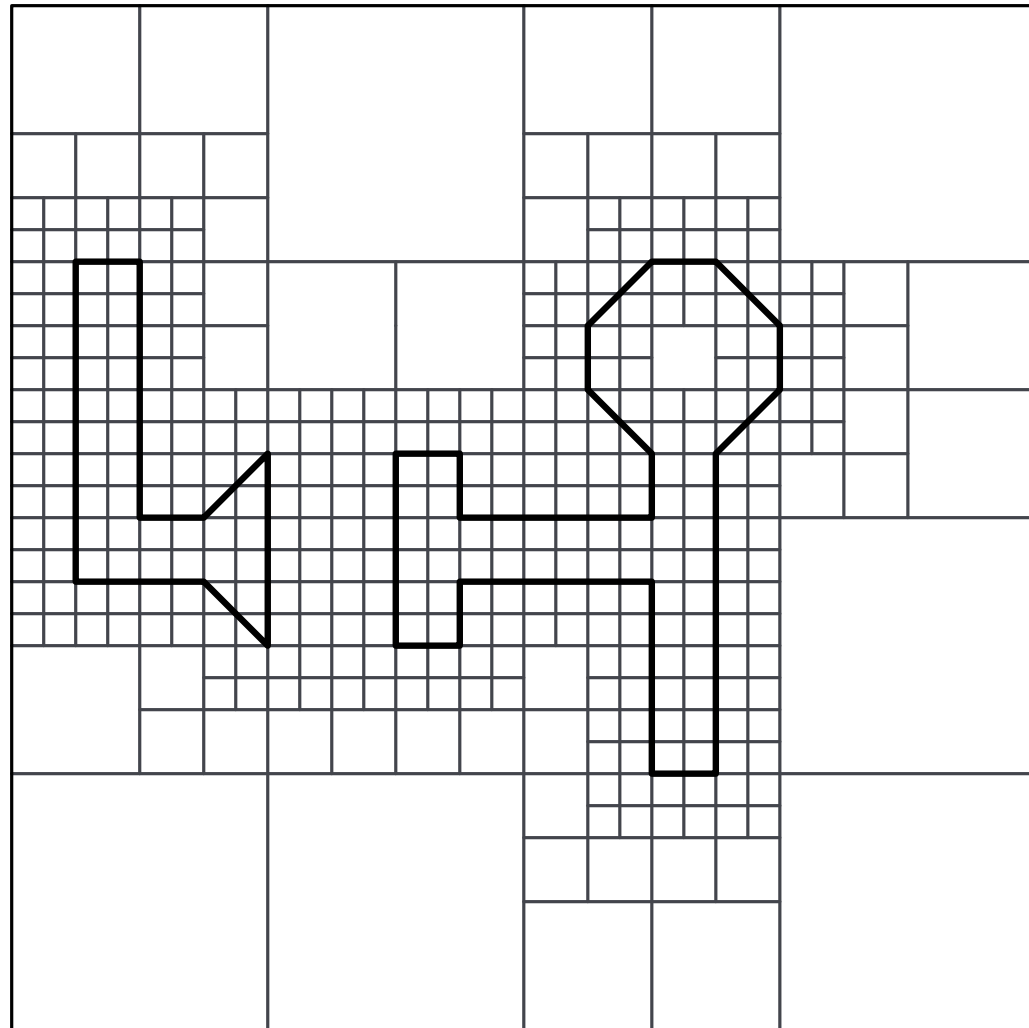
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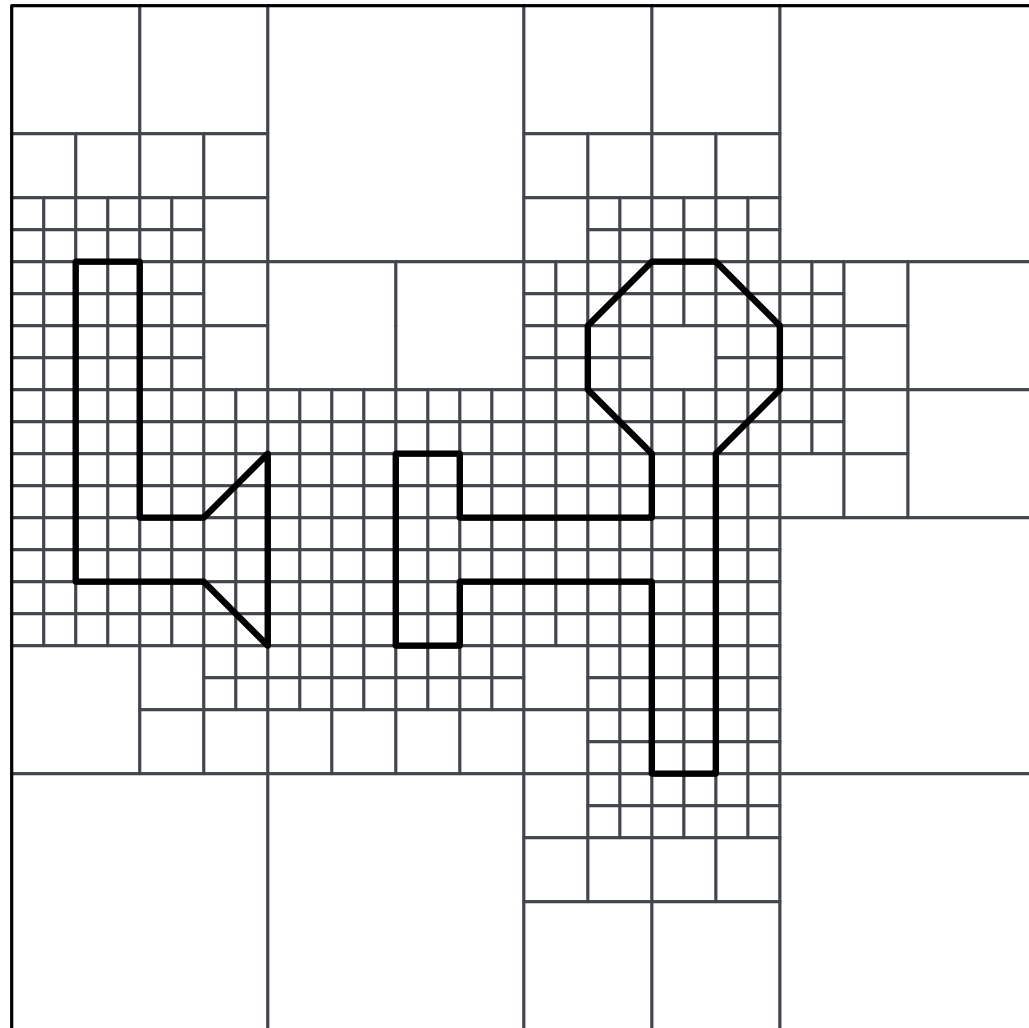


# From quadtrees to meshes



**Observation:** the interior of a square in the quadtree can be intersected only by a diagonal

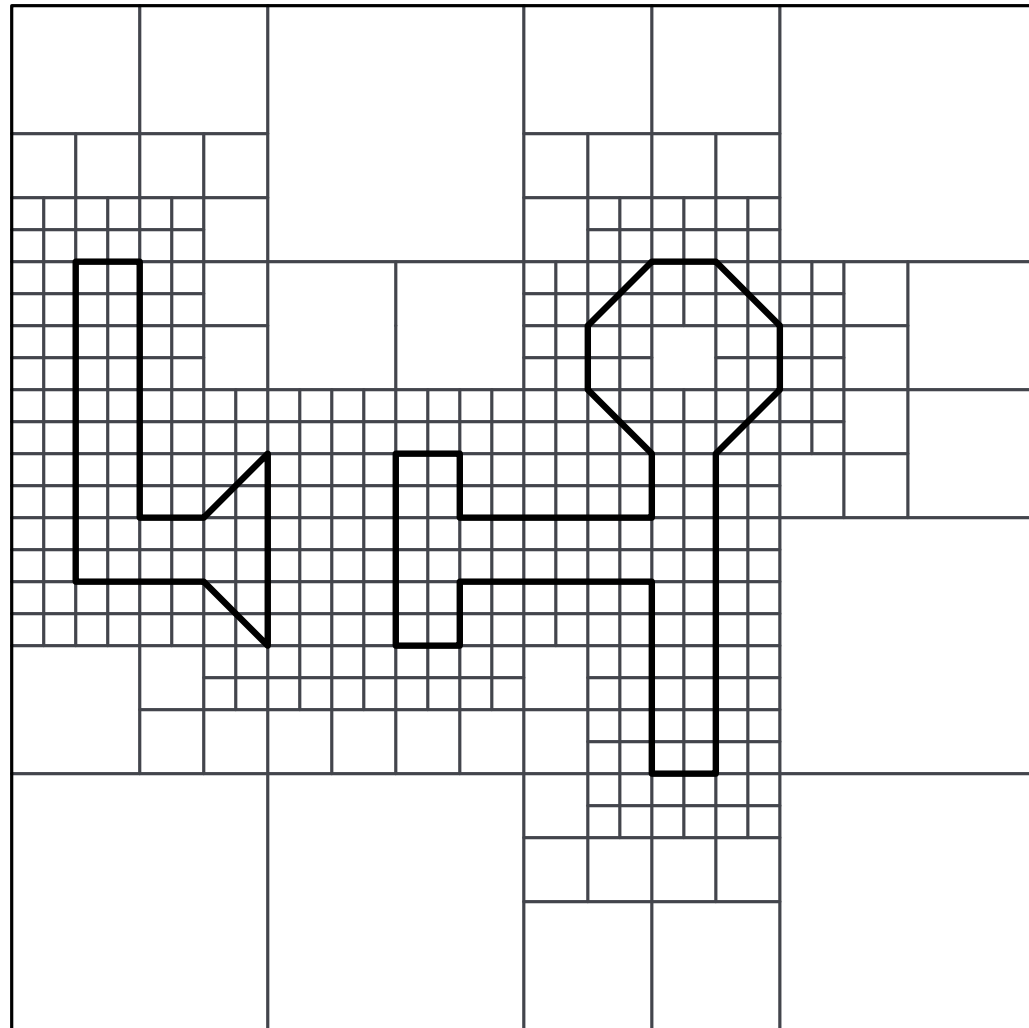
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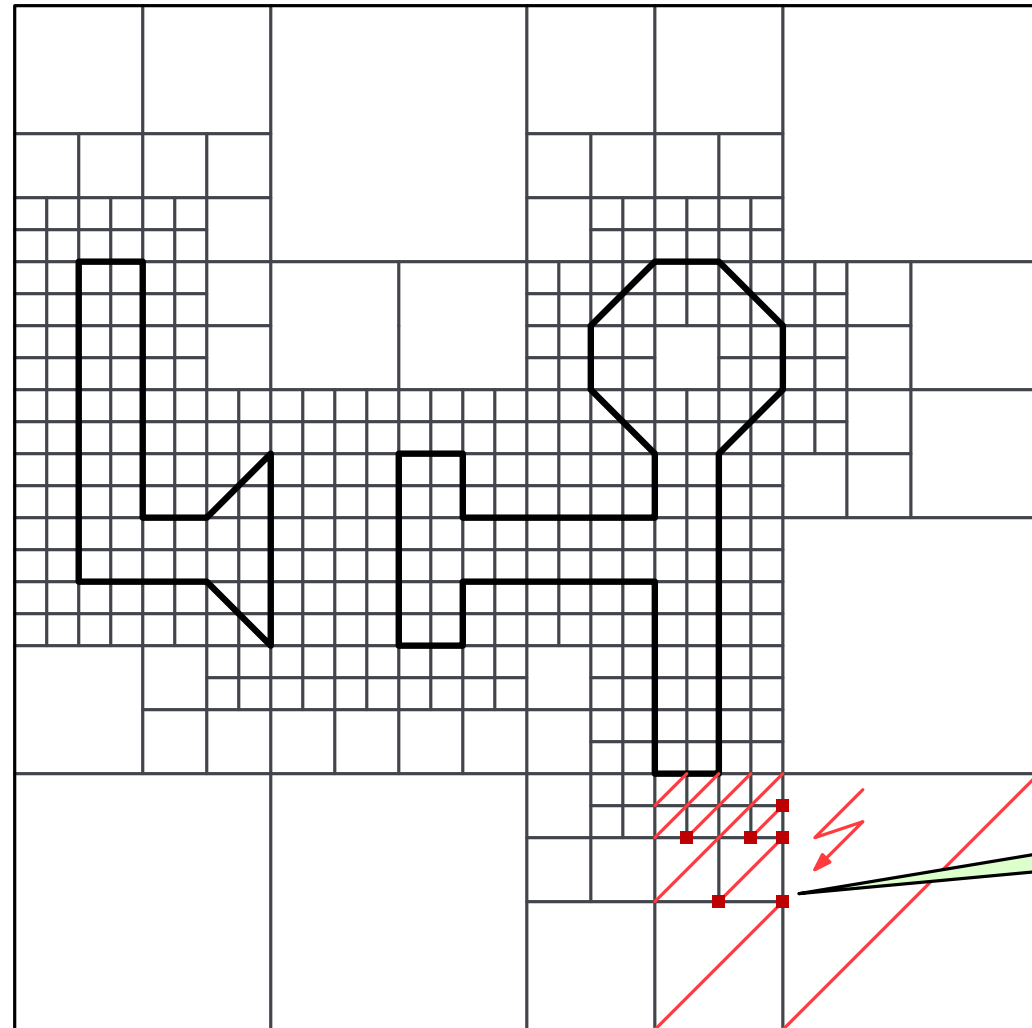
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- Add diagonals for remaining squares?



# From quadtrees to meshes



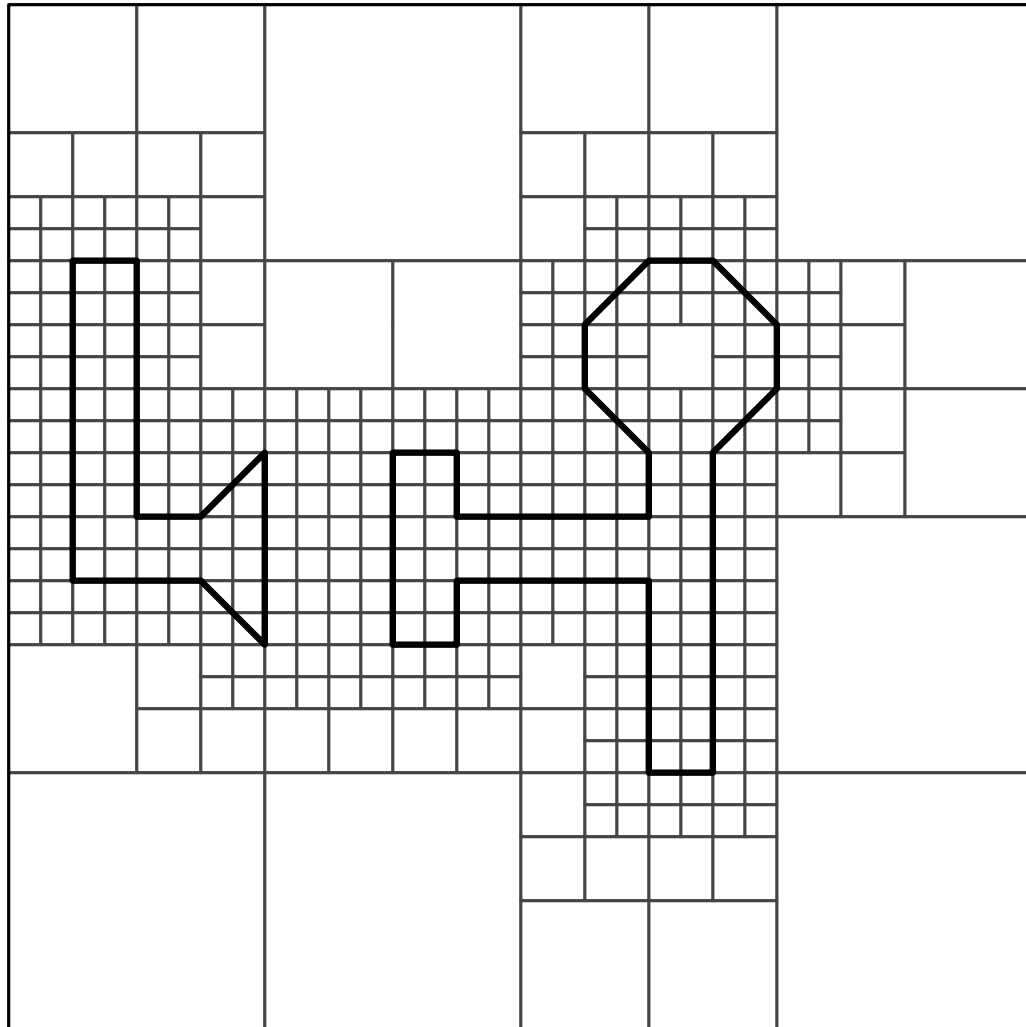
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- Add diagonals for remaining squares? **no!**

non-conforming

# From quadtrees to meshes

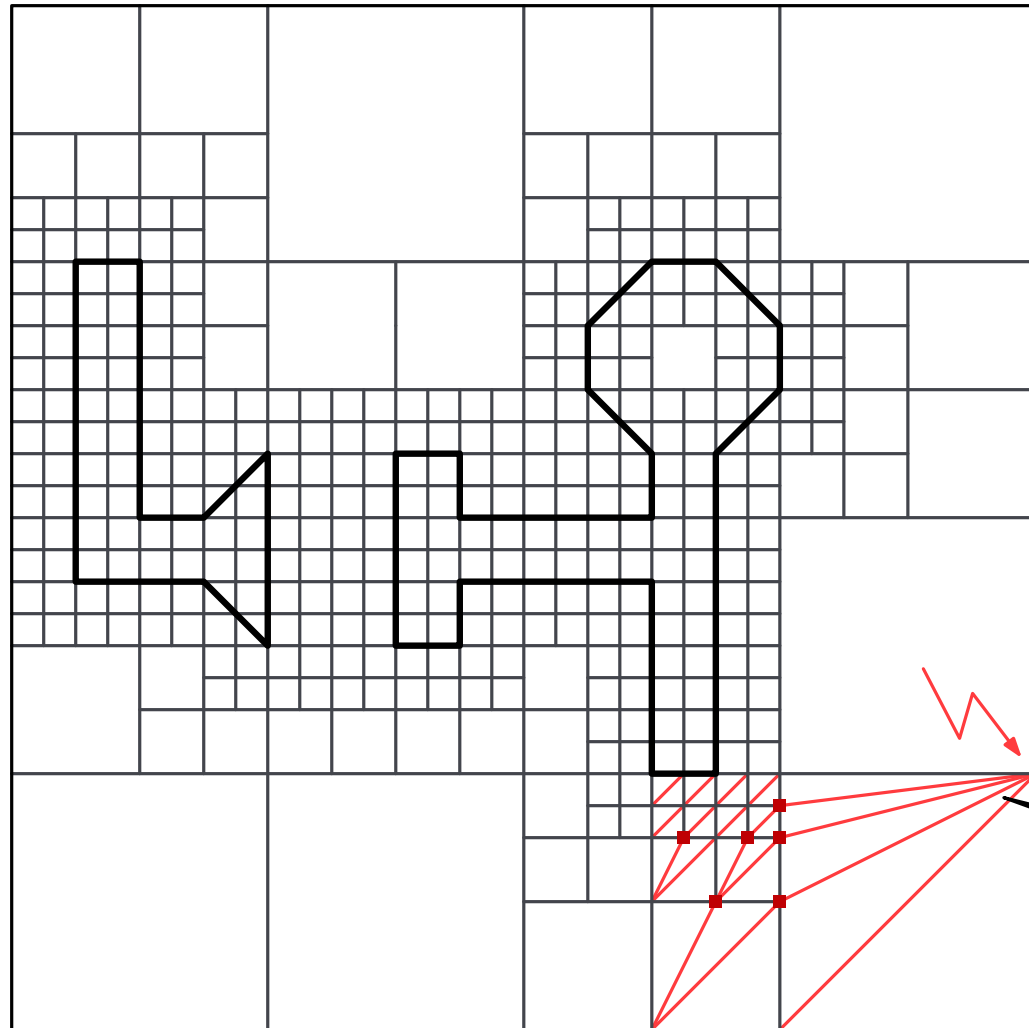


**Observation:** the interior of a square in the quadtree can be intersected only by a diagonal

**Question:** How can we get a valid mesh?

- Add diagonals for remaining squares? **no!**
- Add a Steiner point per cell?

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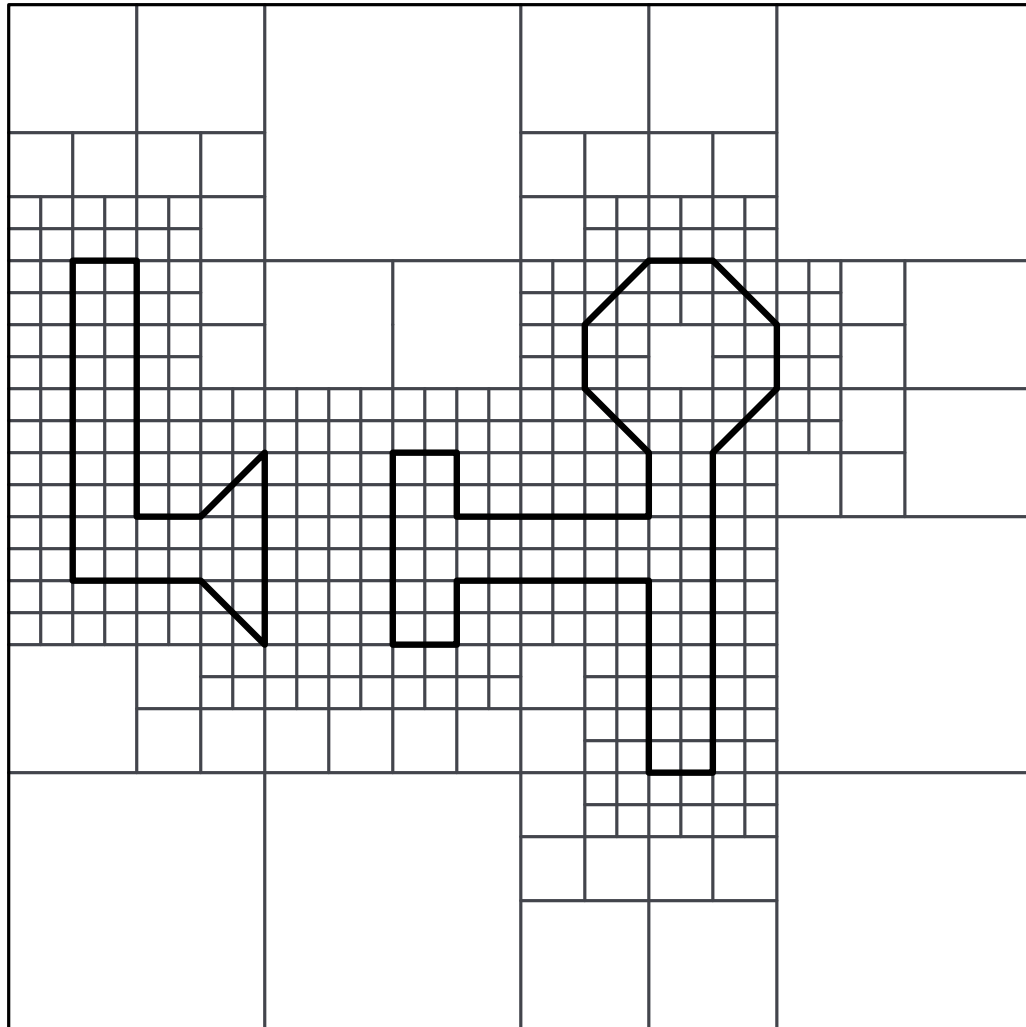
- Add diagonals for remaining squares?
- Add a Steiner point per cell?

no!

no!

angles too small

# From quadtrees to meshes

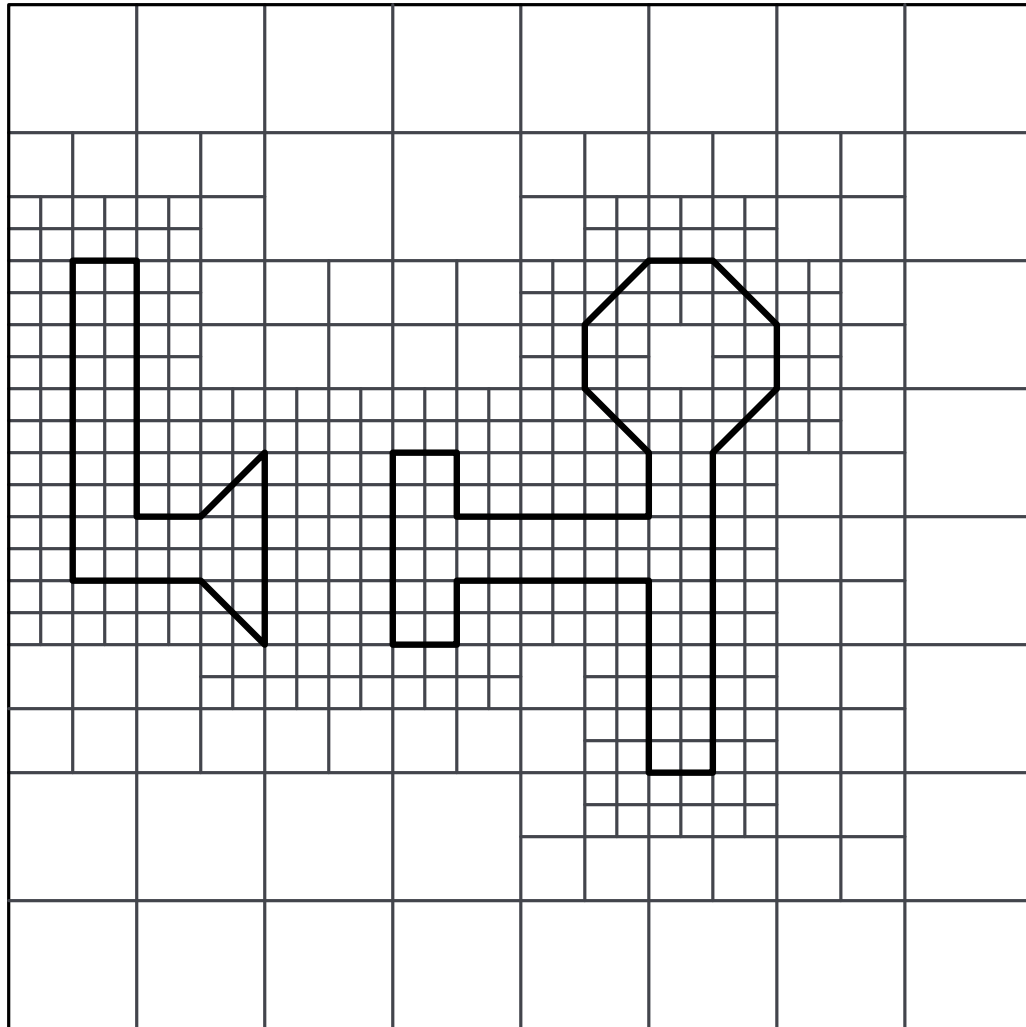


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- Add diagonals for remaining squares? **no!**
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- Balanced quadtree and add Steiner points if necessary!

# From quadtrees to meshes

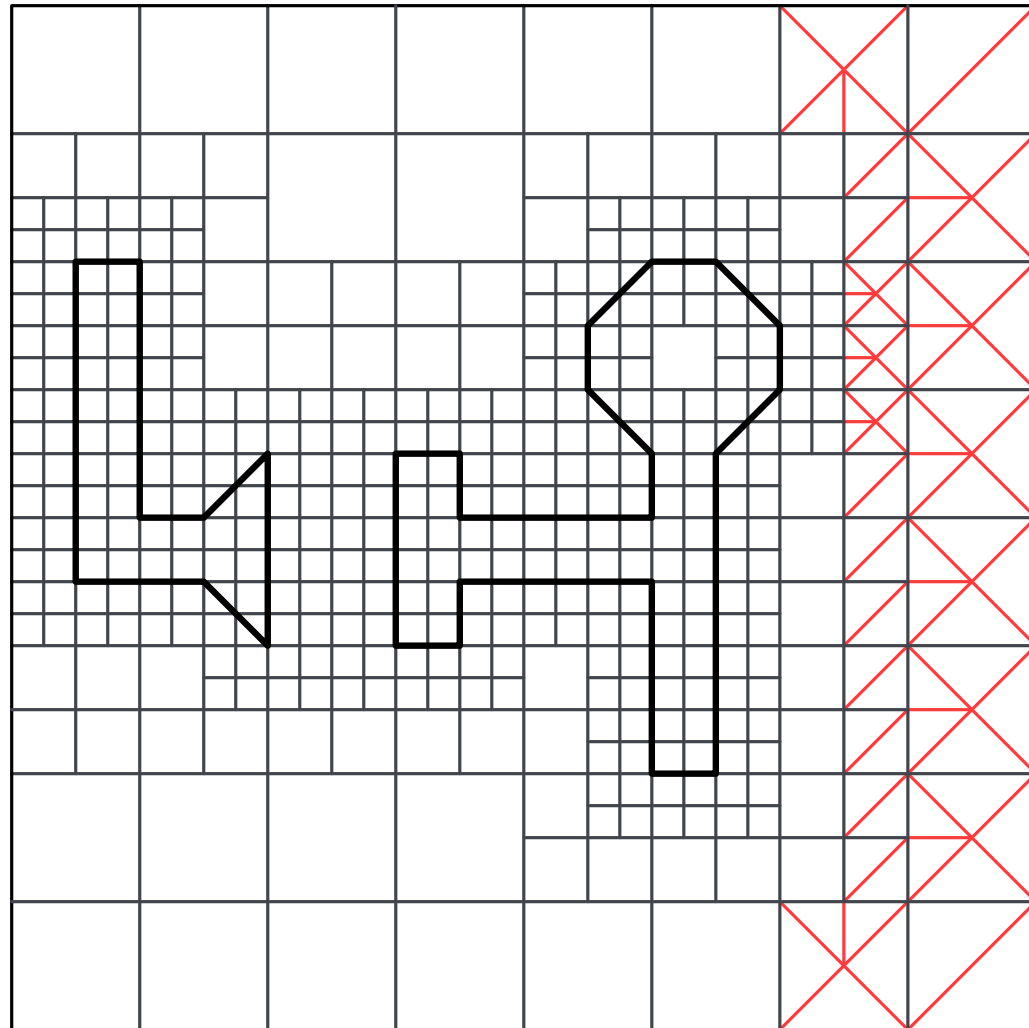


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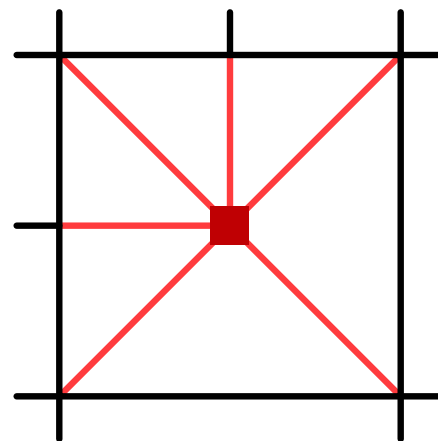
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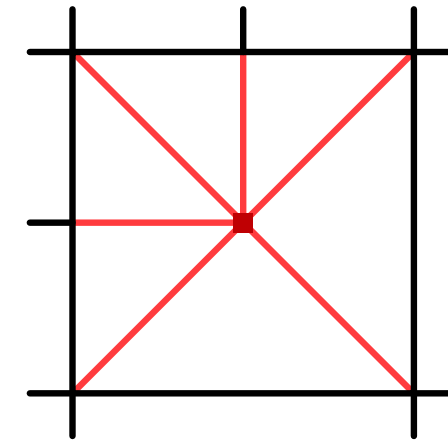
# Triangulating quadtrees

TRIANGULATEQUADTREE( $\mathcal{T}$ )

*Input:* quadtree  $\mathcal{T}$

*Output:* triangulation of  $\mathcal{T}$

```
1:  $\mathcal{D} \leftarrow$  DCEL for partition of  $Q$  by  $\mathcal{T}$ 
2: for each facet  $f$  in  $\mathcal{D}$  do
3:   if  $\text{int}(f)$  is intersected by a polygon then
4:     add corresponding diagonal in  $f$  to  $\mathcal{D}$ 
5:   else
6:     if vertices only add corners of  $f$  then
7:       add a diagonal in  $f$  to  $\mathcal{D}$ 
8:     else
9:       create Steiner point in the middle of  $f$  and
        connect in  $\mathcal{D}$  to all vertices on  $\partial f$ 
10: return  $\mathcal{D}$ 
```



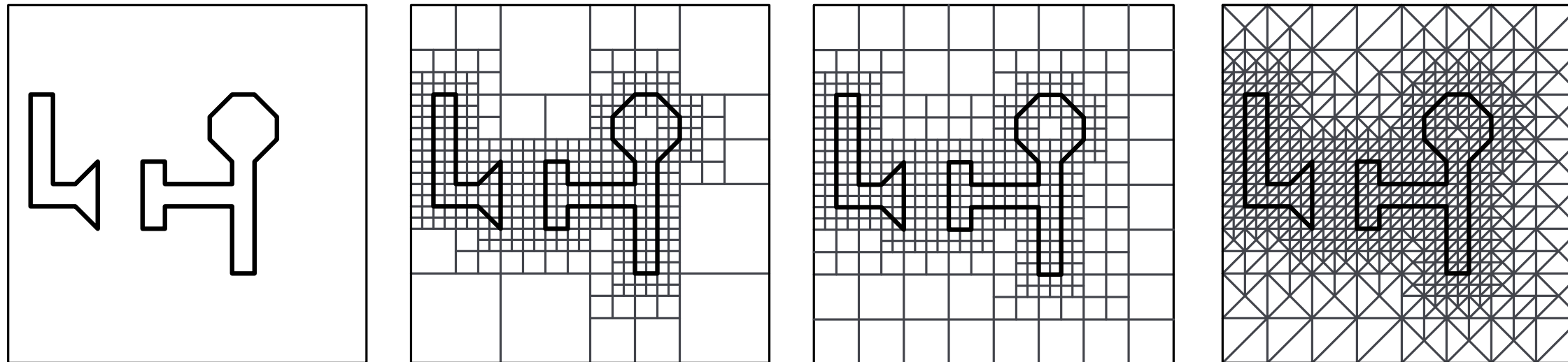
# Algorithm

CREATEMESH( $S$ )

*Input:* set  $S$  of octilinear polygons with integer coordinates in  $Q = [0, 2^j] \times [0, 2^j]$

*Output:* valid, non-uniform triangular mesh  $S$

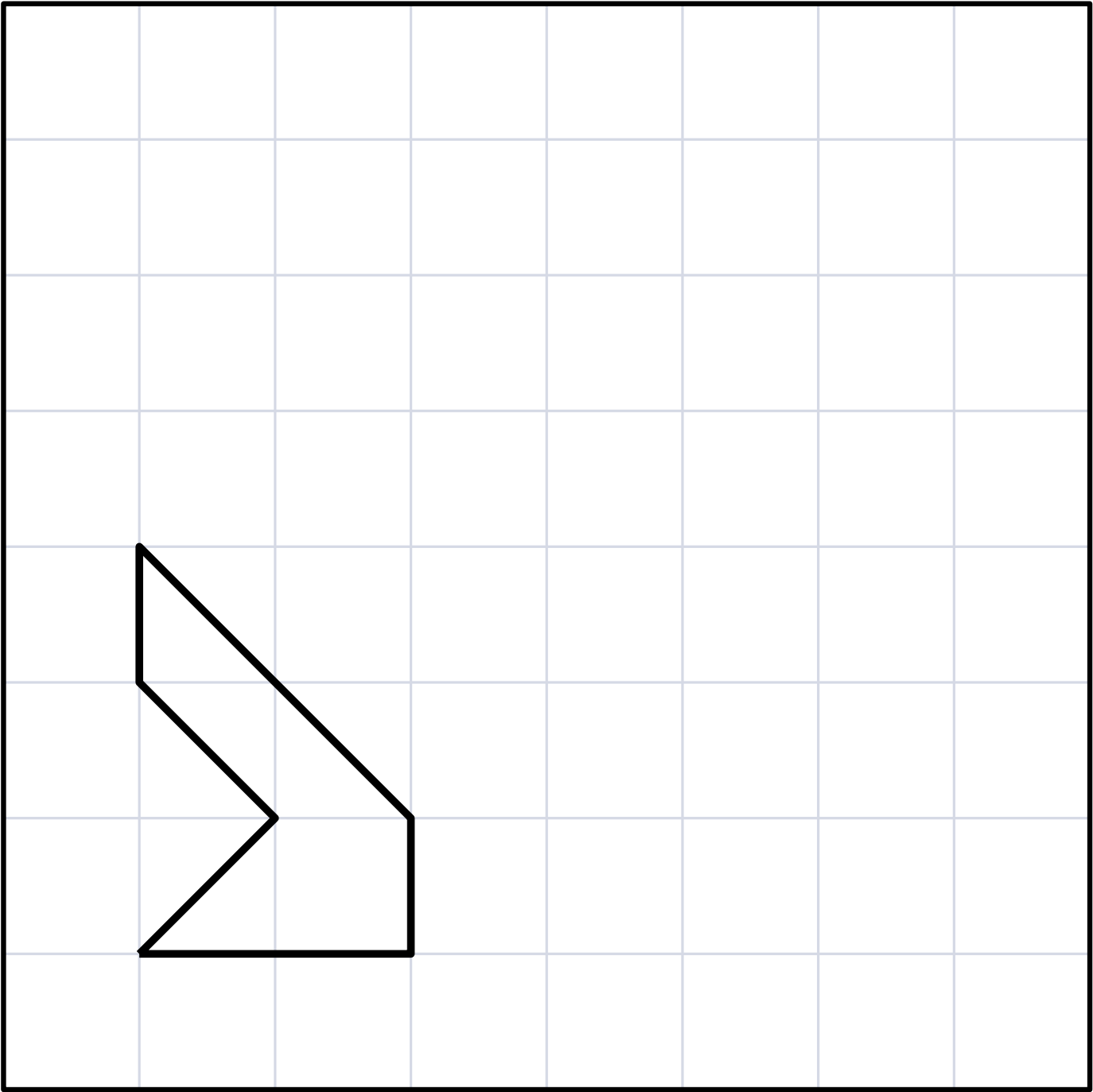
- 1:  $\mathcal{T} \leftarrow \text{CREATEQUADTREE}$
- 2:  $\mathcal{T} \leftarrow \text{BALANCEQUADTREE}(\mathcal{T})$
- 3:  $\mathcal{D} \leftarrow \text{TRIANGULATEQUADTREE}(\mathcal{T})$
- 4: **return**  $\mathcal{D}$





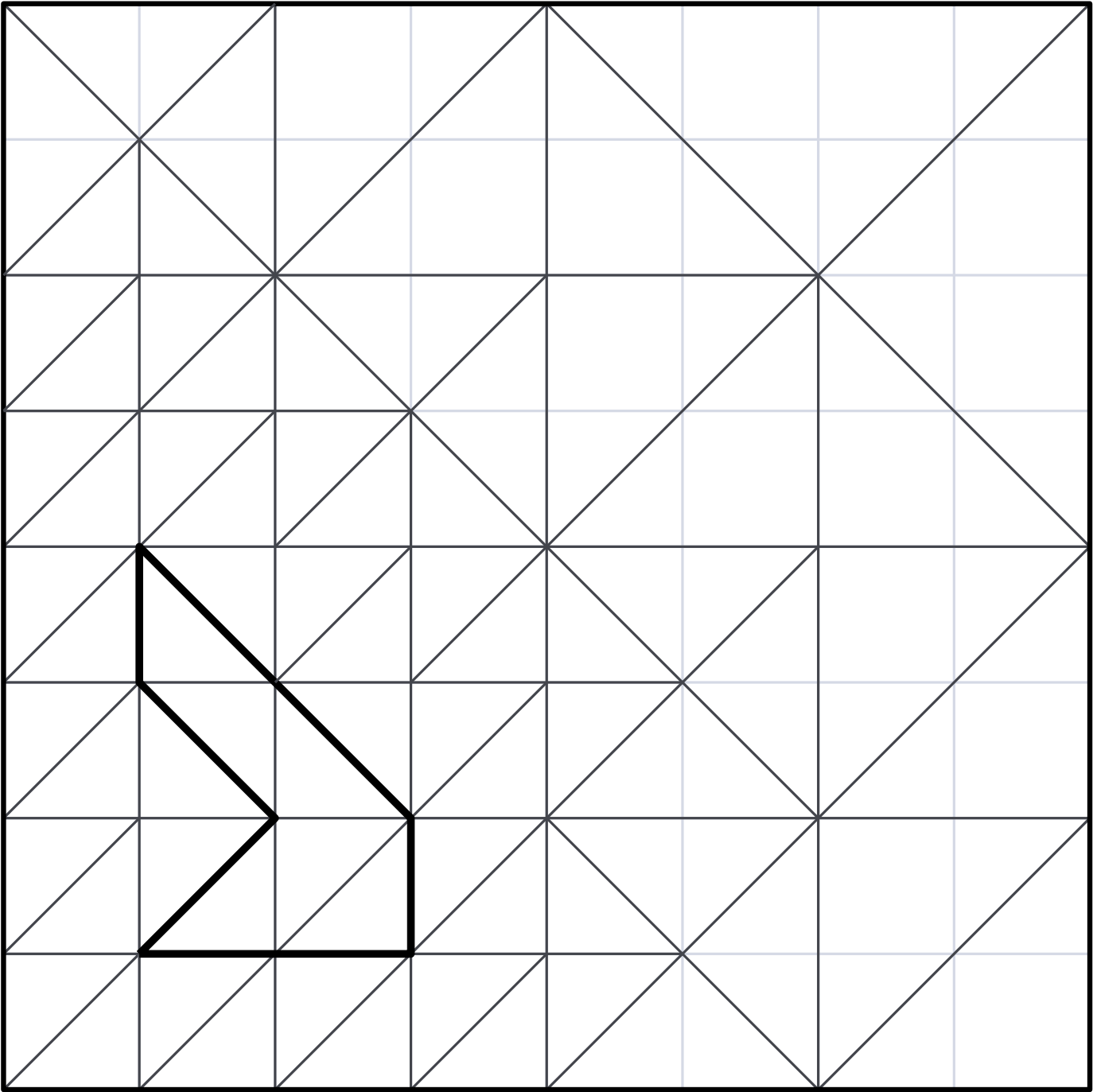
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# Summary

**Theorem 4:** Let  $S$  be a set of disjoint polygonal objects with vertices on a (integer) grid  $[0, U] \times [0, U]$ . Then

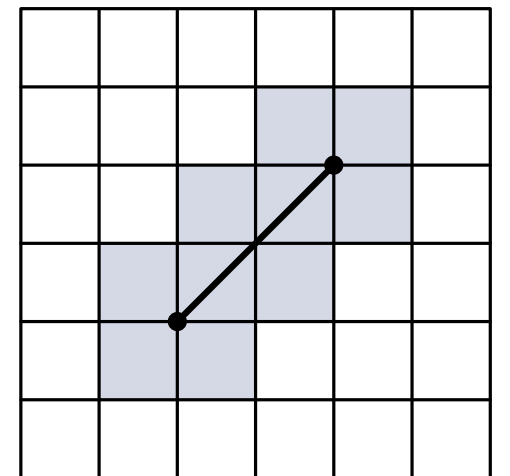
- there exists a non-uniform triangular mesh for  $S$  that is conforming, well-shaped and respects the input
- the number of triangles is  $O(p(S) \log U)$ , where  $p(S)$  is the sum of (lengths of) perimeters of the objects
- the mesh can be constructed in  $O(p(S) \log^2 U)$  time

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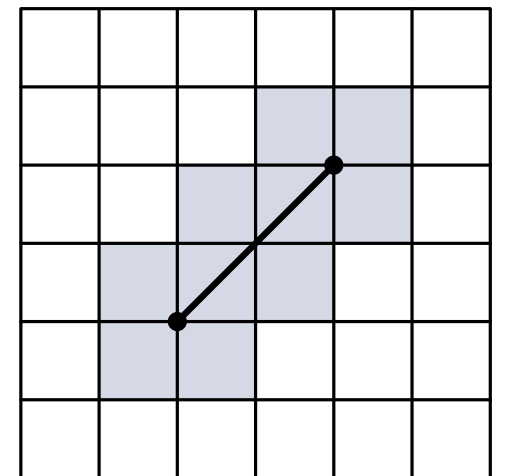
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**construction time:**

1. quadtree: linear in size
2. balancing: extra log-factor (by Thm 3)
3. triangulating: linear in size



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Yes, **skip quadtrees** have complexity  $O(n)$  and we can insert, delete and search in  $O(\log n)$  time in a suitable model of computation

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Directly generalize. In 3D quadtrees  $\rightarrow$  octtrees