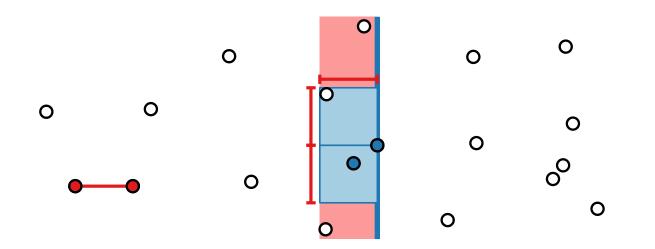


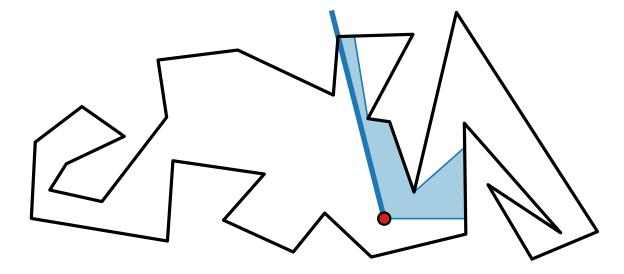
Advanced Algorithms

Computational Geometry

Sweep-Line Algorithms

Johannes Zink · WS23/24



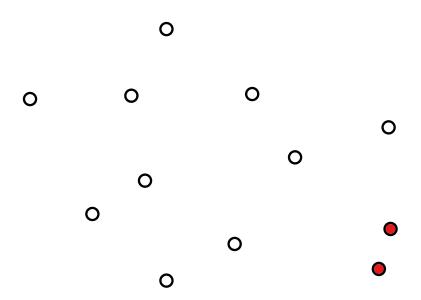


Computational geometry is about algorithmic problems that involve geometric objects such as points, line segments, lines, polygons, circles, planes, polyhedra, ...

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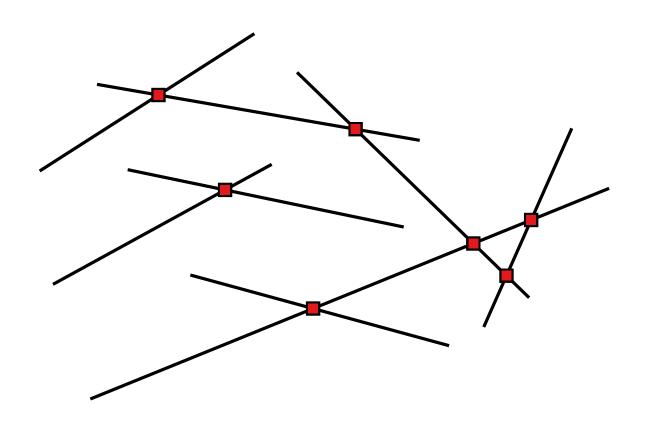
Some problems:

CLOSEST PAIR



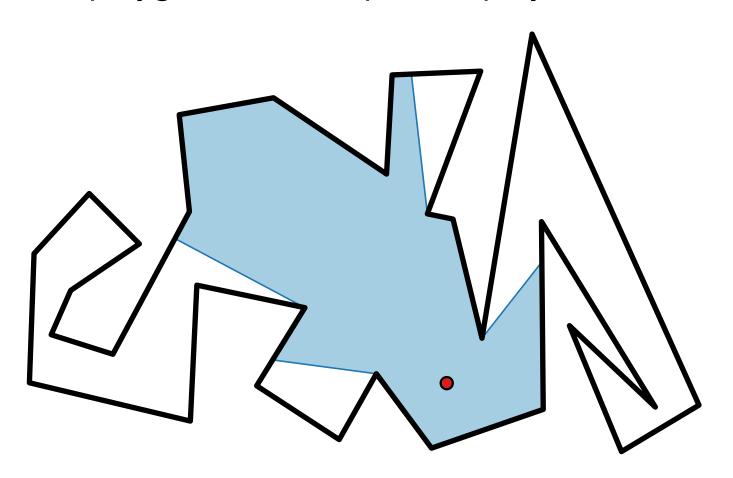
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- CLOSEST PAIR
- LINE SEGMENT INTERSECTION



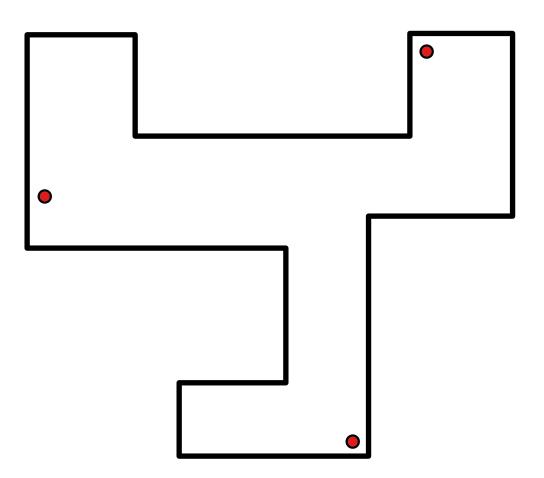
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- CLOSEST PAIR
- LINE SEGMENT INTERSECTION
- Determining visibility



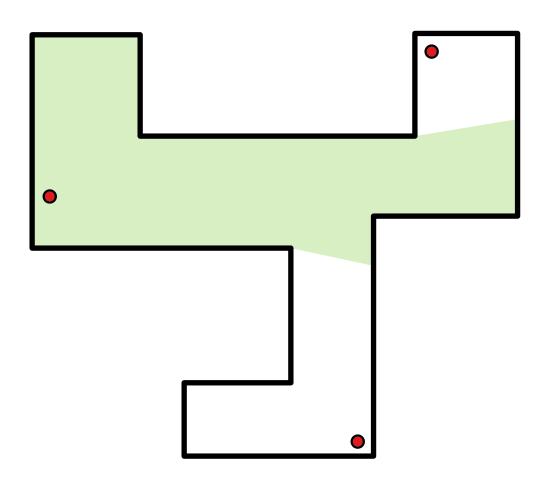
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- CLOSEST PAIR
- LINE SEGMENT INTERSECTION
- Determining visibility
- Guarding an art gallery



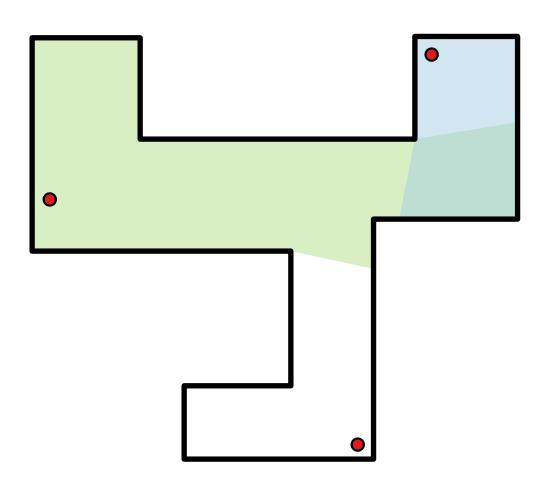
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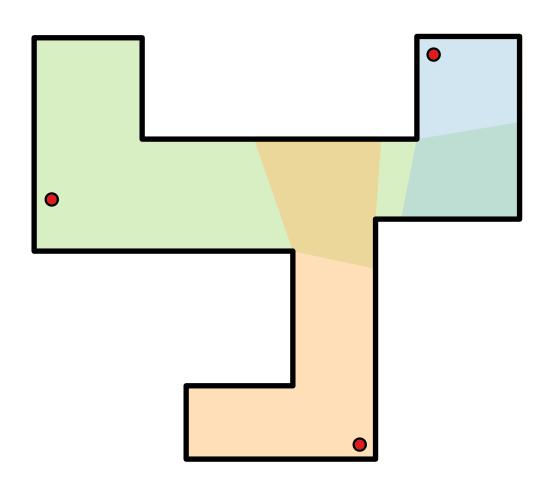
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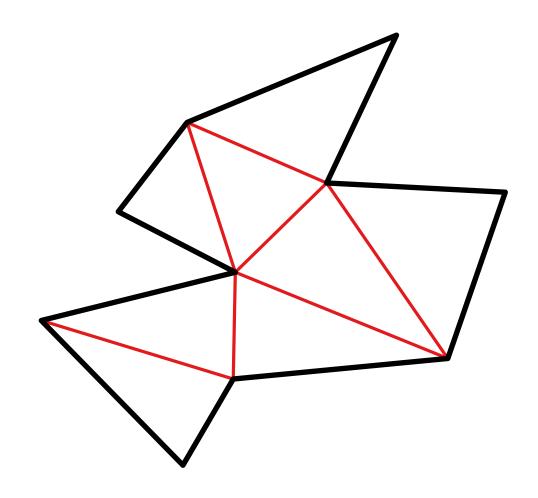
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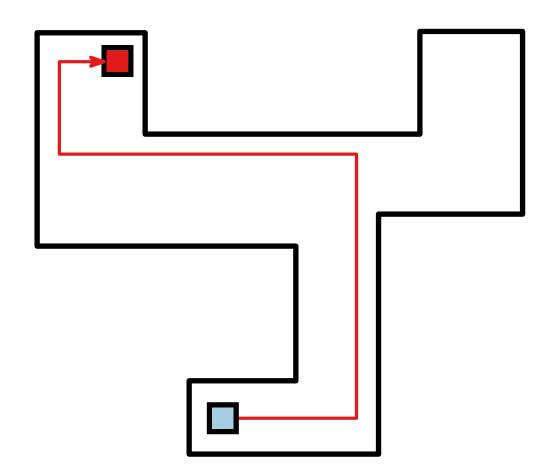
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- Guarding an art gallery
- Triangulating a polygon



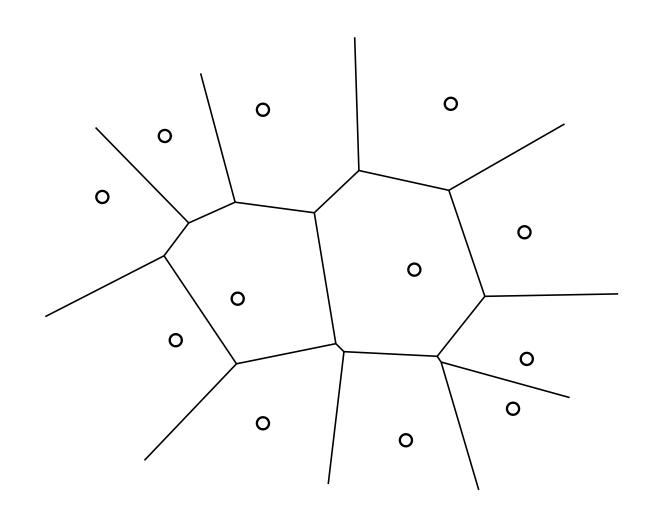
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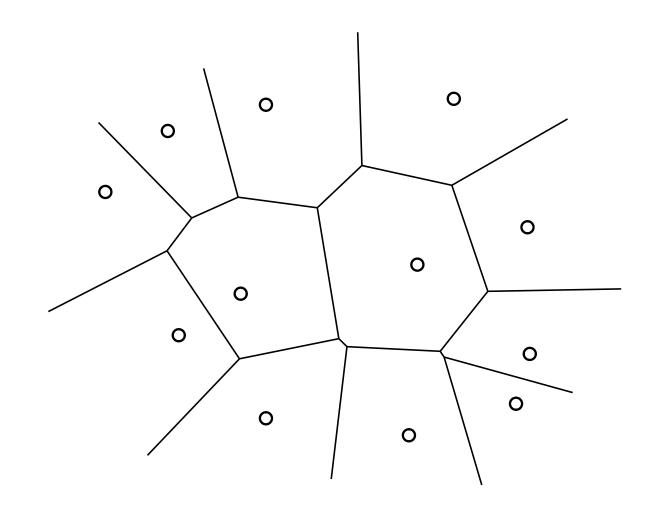
- CLOSEST PAIR
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- Finding the closest post office



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Some problems:

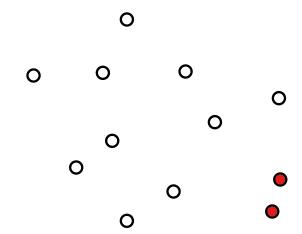
- CLOSEST PAIR
- LINE SEGMENT INTERSECTION
- Determining visibility
- Guarding an art gallery
- Triangulating a polygon
- Motion planning
- Finding the closest post office
- and many more.



We offer an entire course on computational geometry in the winter term!

Given: (multi-)set of points $P \subseteq \mathbb{R}^2$.

Task: Find a pair of distinct elements p_a , $p_b \in P$ such that the Euclidean distance $||p_a - p_b||$ is minimum.



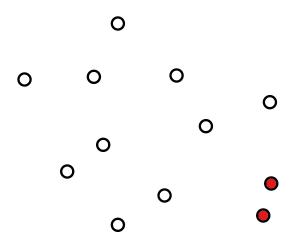
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Deterministic algorithms:

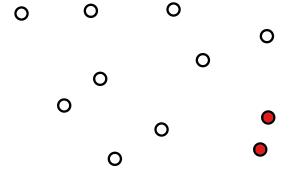
Brute-force

$$\mathcal{O}(n^2)$$



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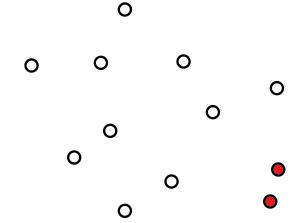
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Divide and conquer (recall from ADS) $O(n \log n)$ (optimal)

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Randomized algorithm:

Randomized incremental construction

$$\mathcal{O}(n)$$

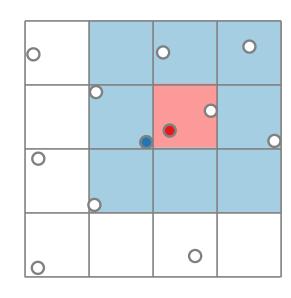
(expected runtime)

later in this course!

A Randomized Incremental Algorithm for CLOSEST PAIR

Define $P_i = \{p_1, p_2, \dots, p_i\}$ and let δ_i be the dist

Idea: $\delta_2 = ||p_1, p_2||$. Compute $\delta_3, \delta_4, \ldots$



(simple) exercise

Define $P_i = \{p_1, p_2, \ldots, p_i\}$ and let δ_i be the district p_i osest pair in p_i . **dea:** $\delta_2 = ||p_1, p_2||$. Compute $\delta_3, \delta_4, \ldots$ also the points iteratively.

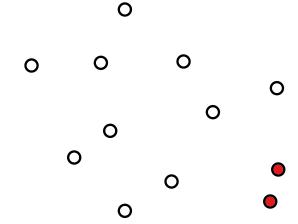
Suppose we have already determined in p_i or one of the adjace contains at most p_i or one of the adjace contains at most p_i or one of the determined in p_i time assuming the flace. The commattees of the cell of p_i can be determined in $\mathcal{O}(1)$ time assuming the floor

function can be computed in $\mathcal{O}(1)$ time.

 \Rightarrow The test $\delta_i < \delta_{i-1}$ can be performed in $\mathcal{O}(1)$ time assuming P_{i-1} is stored in a suitable dictionary for the nonempty cells (implementable via dynamic perfect hashing).

Given: (multi-)set of points $P \subseteq \mathbb{R}^2$.

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Deterministic algorithms:

Brute-force

$$\mathcal{O}(n^2)$$

Divide and conquer (recall from ADS) $O(n \log n)$ (optimal)

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Randomized incremental construction

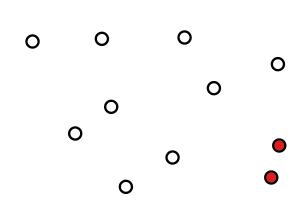
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(expected runtime)

later in this course!

Given: (multi-)set of points $P \subseteq \mathbb{R}^2$.

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0

Deterministic algorithms:

Brute-force

 $\mathcal{O}(n^2)$

Divide and conquer (recall from ADS) $O(n \log n)$ (optimal)

Sweep line

 $\mathcal{O}(n \log n)$ (optimal) now!

Randomized algorithm:

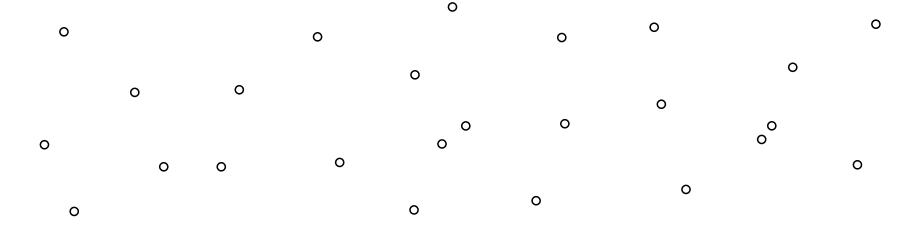
Randomized incremental construction

 $\mathcal{O}(n)$

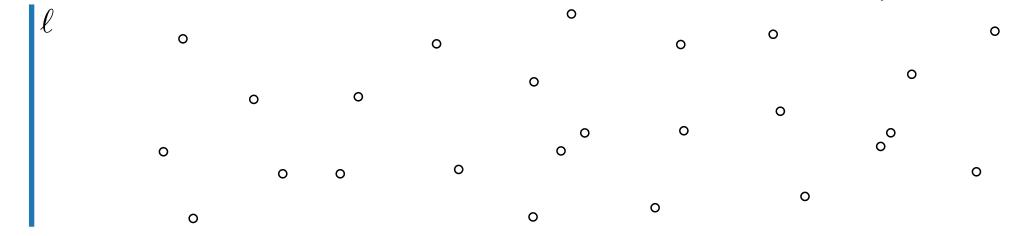
(expected runtime)

later in this course!

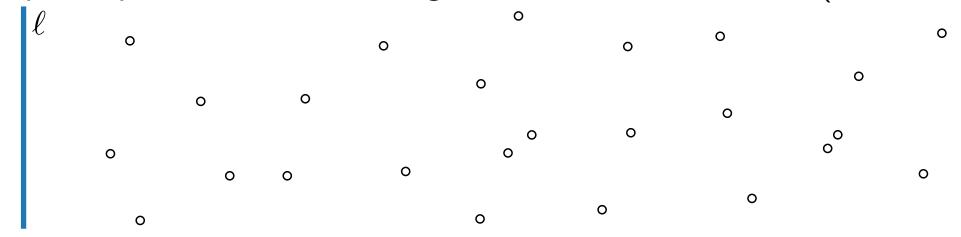
Assumption: The points in P have pairwise distinct x-coordinates.



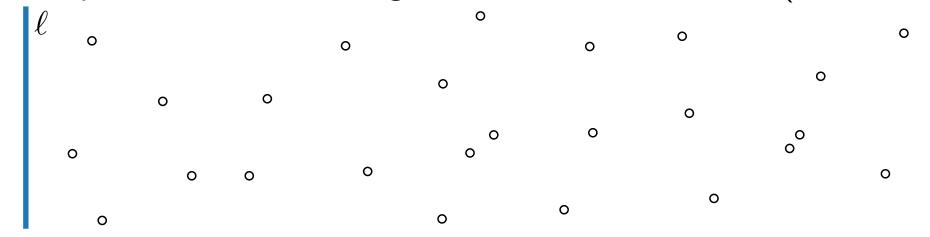
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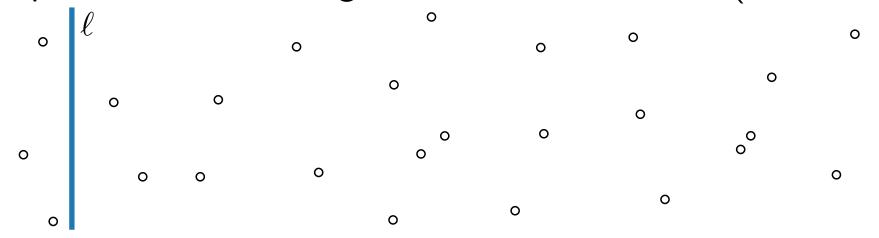
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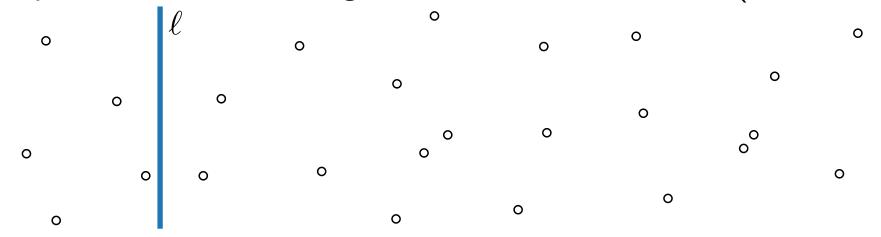
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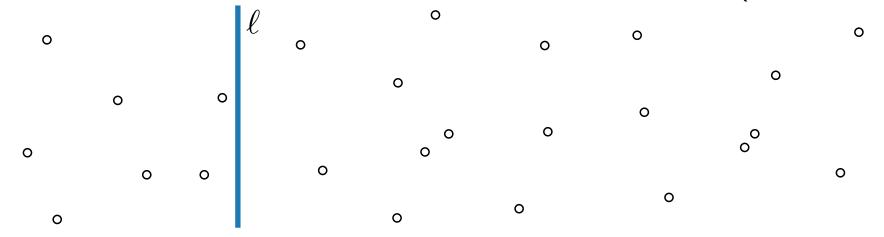
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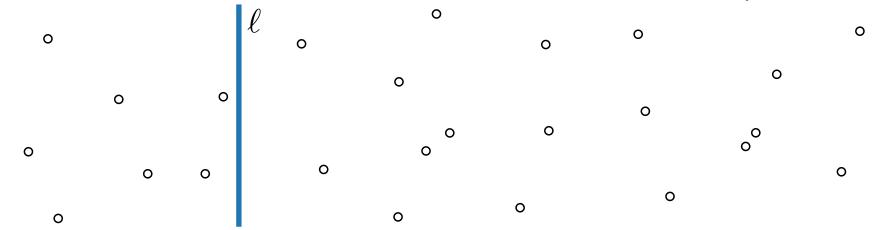


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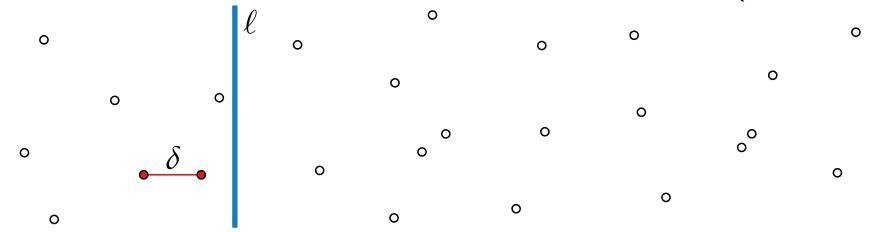
Idea: Sweep the plane from left to right with a vertical line ℓ (the sweep line).



Invariant: a closest pair of the points to the left of ℓ and its distance δ is already known.

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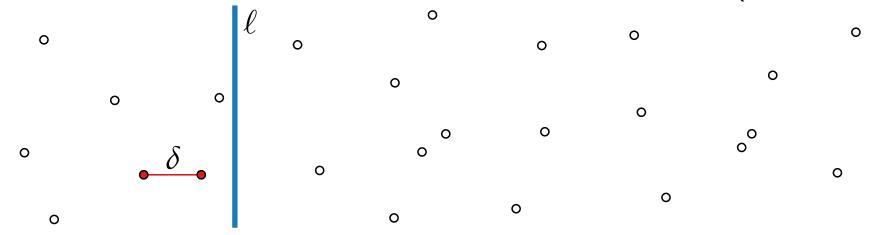
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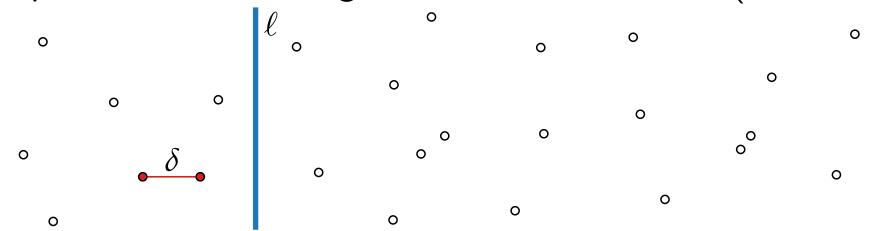


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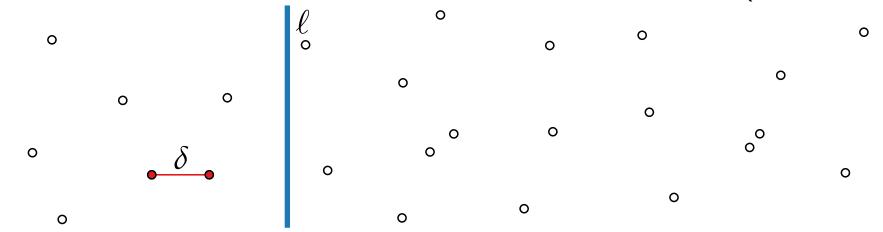


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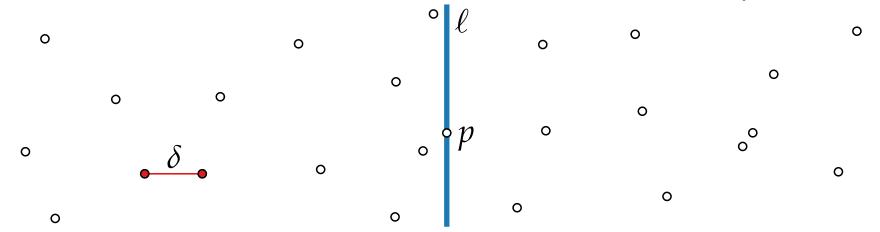


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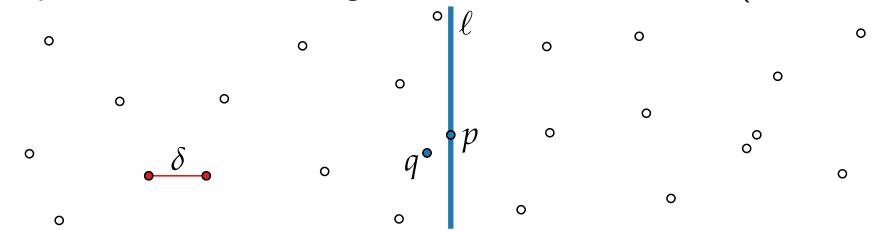


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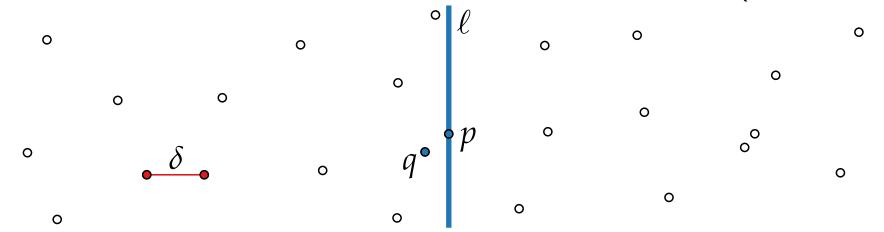
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Observations:

- lacksquare This partial solution can only change when ℓ sweeps a point p of P.
- \blacksquare Each new closest pair consists of p and a point q

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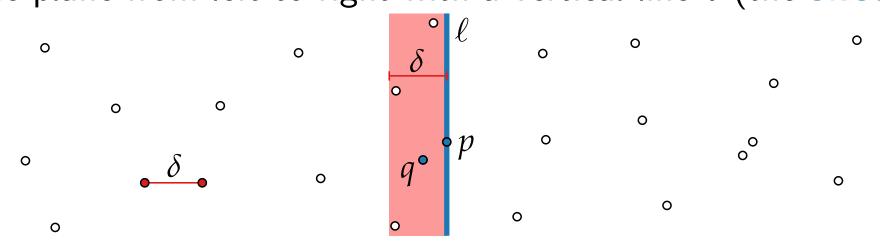
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What do we know about the location of q?

Assumption: The points in P have pairwise distinct x-coordinates.

Idea: Sweep the plane from left to right with a vertical line ℓ (the sweep line).



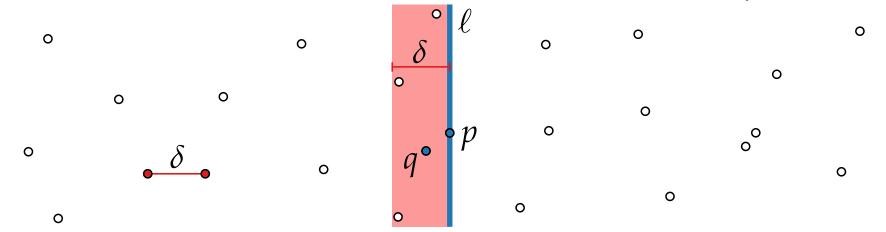
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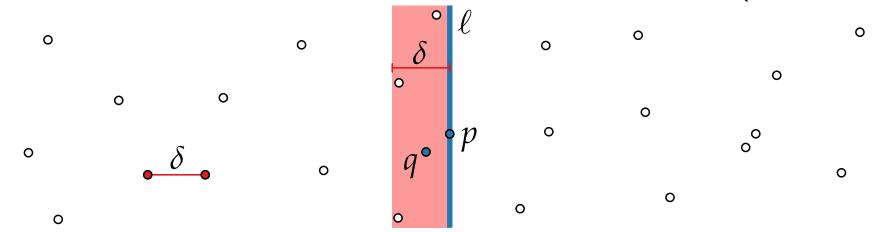
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How many points can be in this vertical slab?

Assumption: The points in P have pairwise distinct x-coordinates.

Idea: Sweep the plane from left to right with a vertical line ℓ (the sweep line).



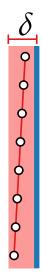
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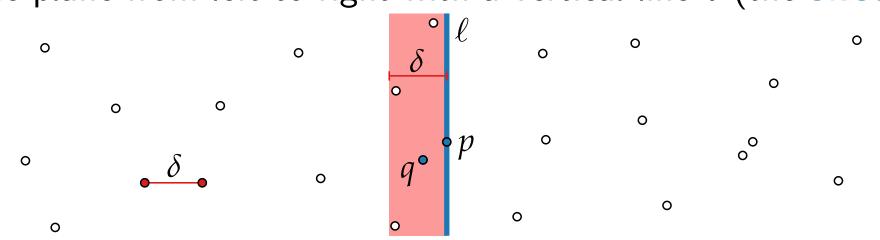
How many points can be in this vertical slab?

All of them!



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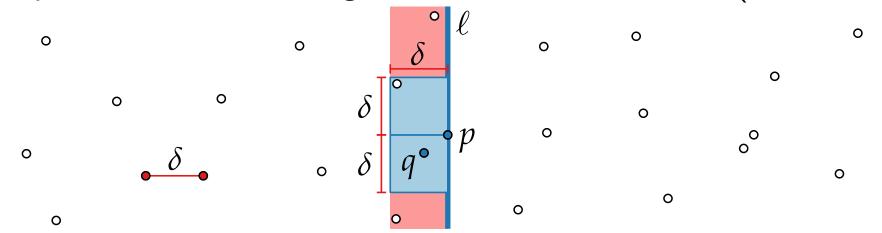
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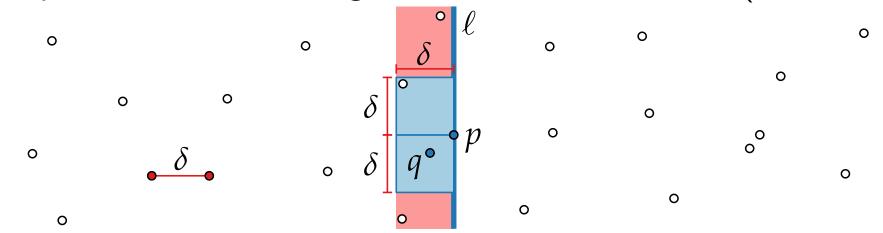
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Observations:

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- Each new closest pair consists of p and a point q with distance $< \delta$ to ℓ .
- lacksquare q needs to be located in a $\delta imes 2\delta$ rectangle R to the left of p.

Assumption: The points in P have pairwise distinct x-coordinates.

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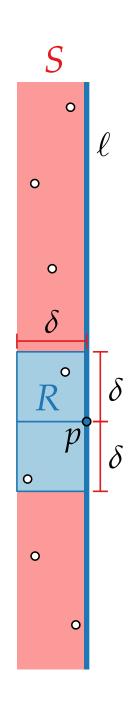


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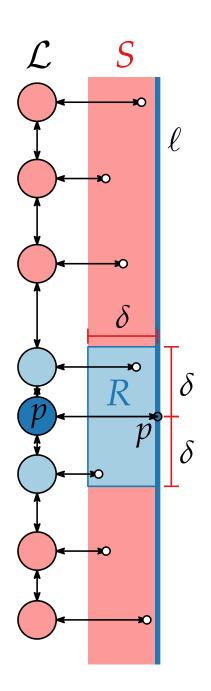
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- lacksquare R contains $\mathcal{O}(1)$ points of $P\setminus\{p\}$ since their pairwise distance is $\geq \delta$. $\binom{\mathsf{packing}}{\mathsf{argument}}$

Let S denote the vertical slab of width δ to the left of ℓ .

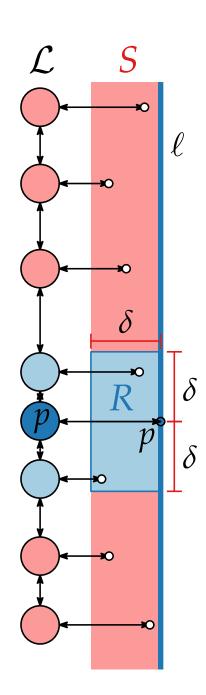


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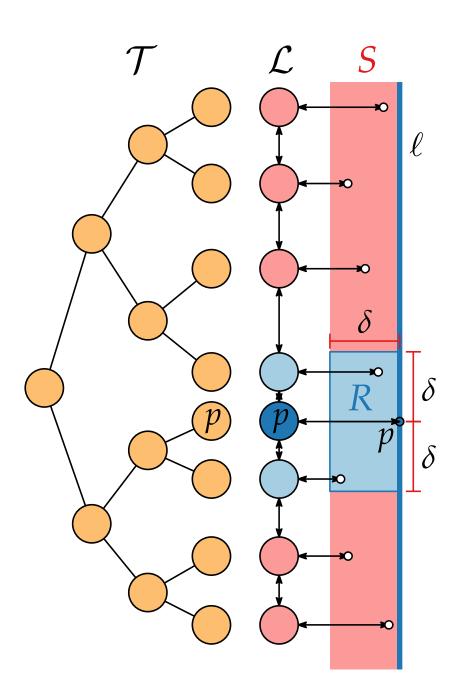
 \Rightarrow Given a pointer to p, we can determine the points in R by searching the interval $[y(p) - \delta, y(p) + \delta]$. This takes $\mathcal{O}(1)$ time since R contains $\mathcal{O}(1)$ points.



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To ensure that \mathcal{L} can be updated efficiently, we additionally store the points $P \cap S$ in a **balanced binary** search tree \mathcal{T} using the y-coordinates as keys.

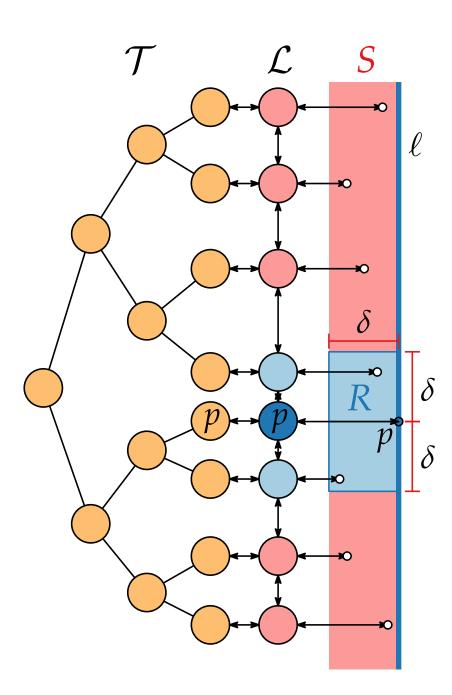


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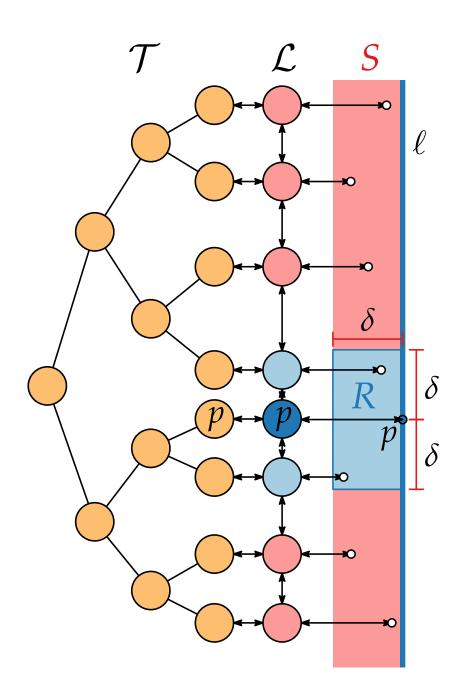
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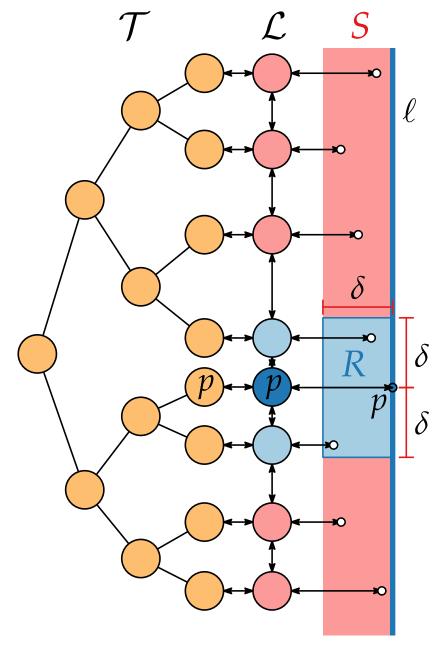
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Invariant 2: when we reach a point p, \mathcal{T} and \mathcal{L} contain exactly the points in $P \cap S$.

```
p_1, p_2, \ldots, p_n = \text{points of } P \text{ sorted according to their x-coordinates}
P_{\min} = \text{nil} // current closest pair
\delta = \infty // distance of current closest pair
k=1 // index of the left-most point in {\cal L} and {\cal T}
initialize \mathcal{L} and \mathcal{T} with p_1
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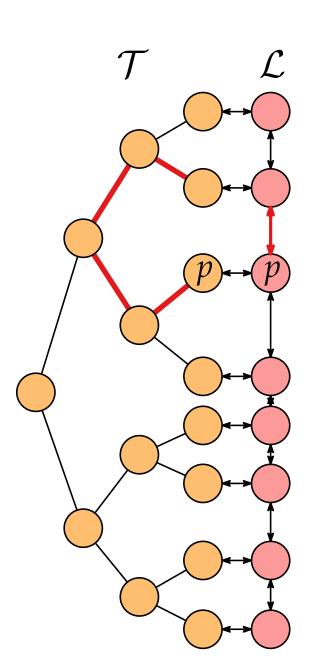
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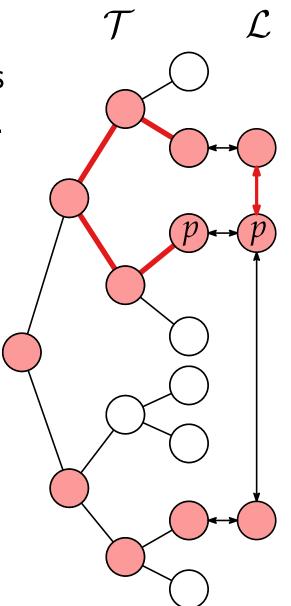
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The list \mathcal{L} is actually not necessary: given a point p in \mathcal{T} , its neighbors in the ordering can be determined in $\mathcal{O}(\log n)$ time.



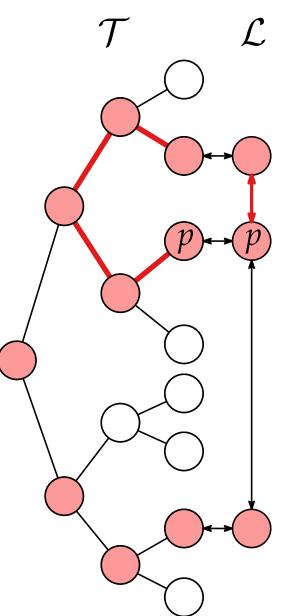
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- We assumed that the points in P have pairwise distinct x-coordinates. This situation can be established by rotating P or tilting ℓ slightly.
 - Simply, visit the points in lexicographical order!



Summary and Discussion

The sweep line approach is an important design paradigm (like divide and conquer, prune and search, dynamic programming, greedy, . . .) in computational geometry.

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The sweep line approach is an important design paradigm (like divide and conquer, prune and search, dynamic programming, greedy, . . .) in computational geometry.

Main idea: Sweep the plane with a line ℓ while maintaining two invariants:

- \blacksquare A partial solution for the input to the left of ℓ is known.
- The part of the input to the left of ℓ that is still relevant for updating the partial solution is encoded in a suitable data structure (sweep line status).

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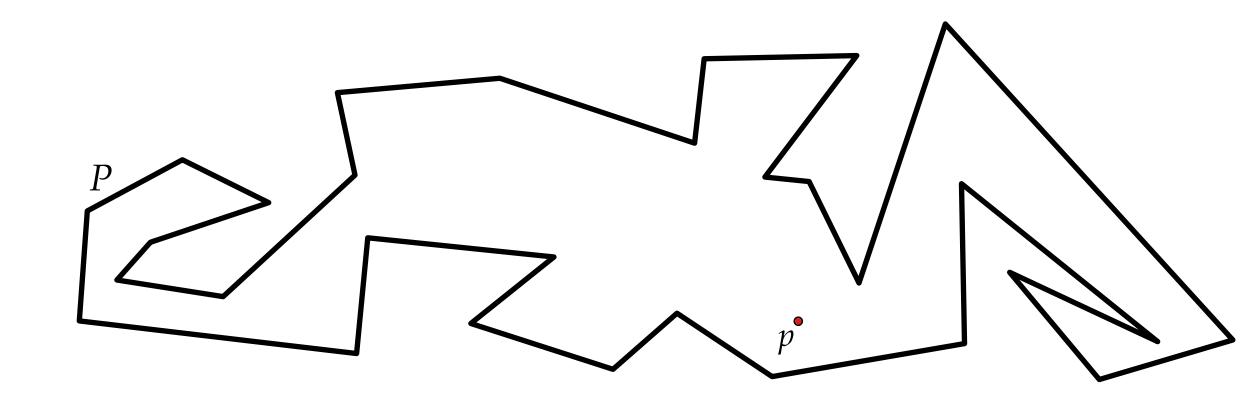
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The sweep line paradigm is **powerful** and leads to **simple** algorithms for many problems: computing Voronoi diagrams, crossings in an arrangement of line segments, intersection/union of two polygons, decompositions of polygons, certain triangulations, visibility polygons, . . .

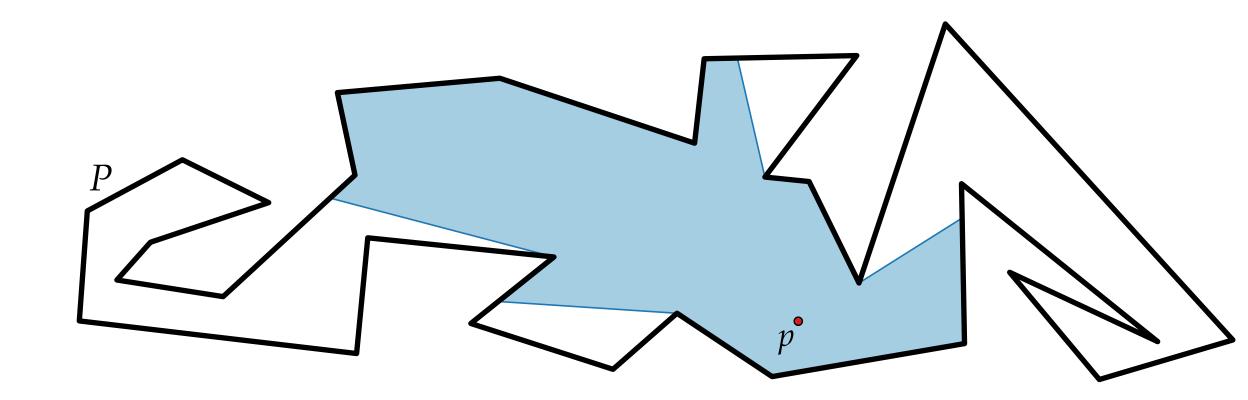
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Given: A polygon P with n corners and a point p in its interior.



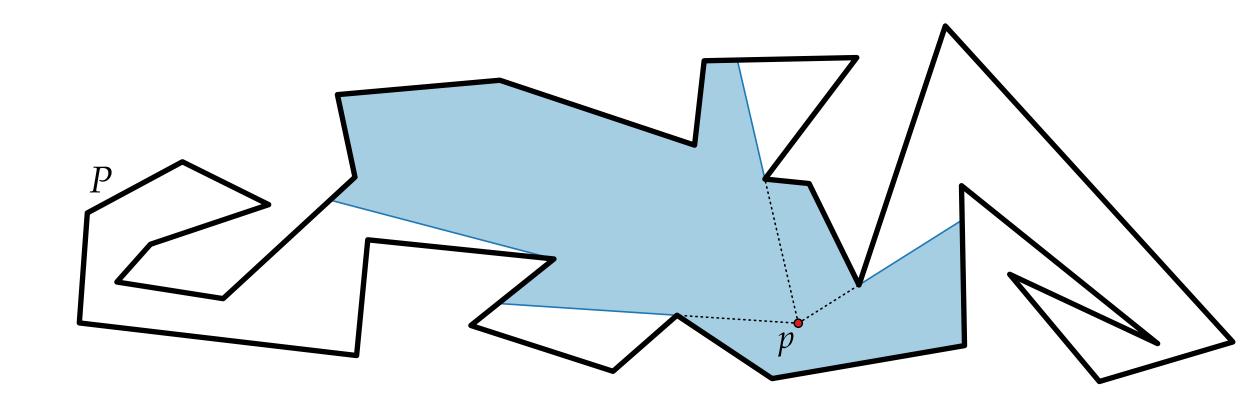
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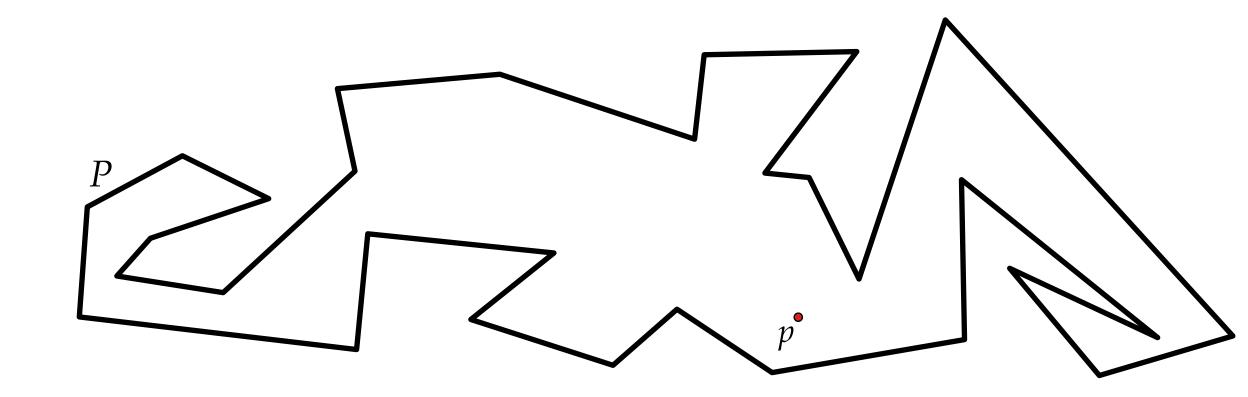
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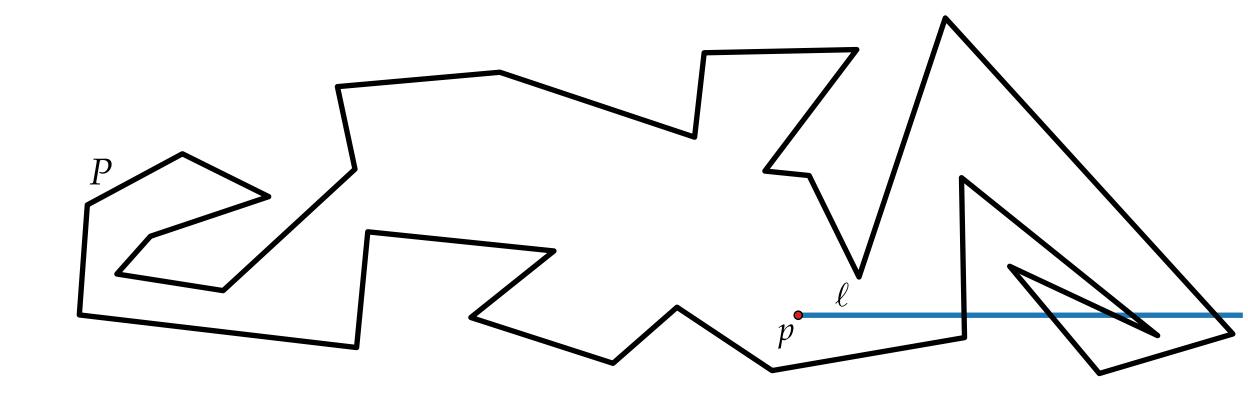
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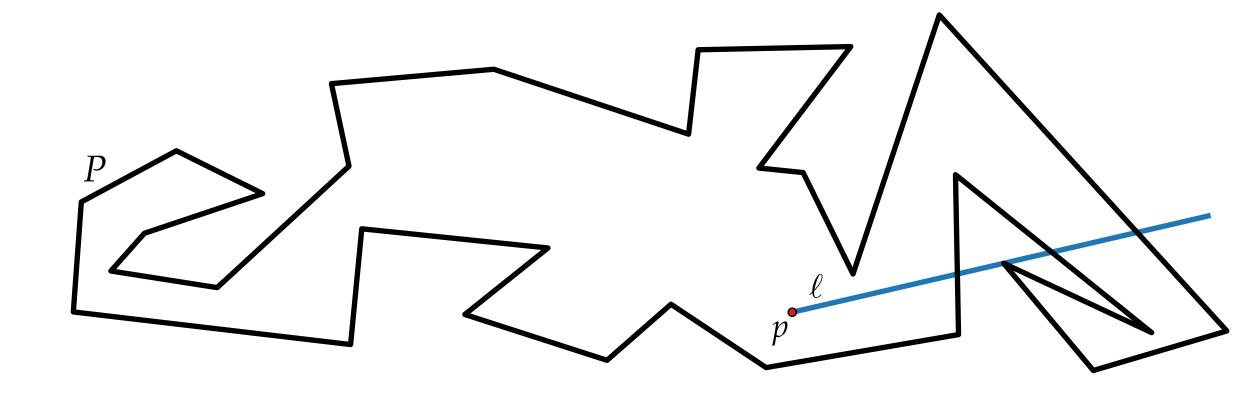
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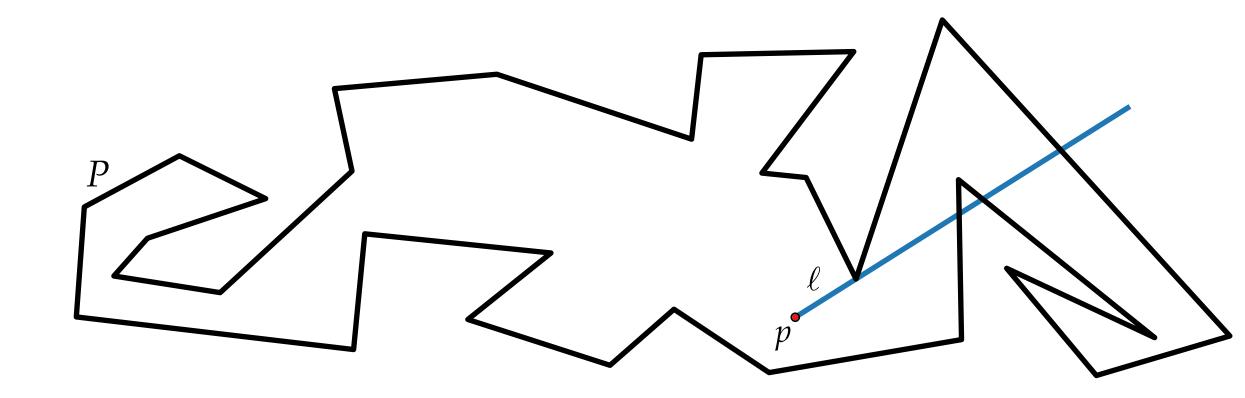
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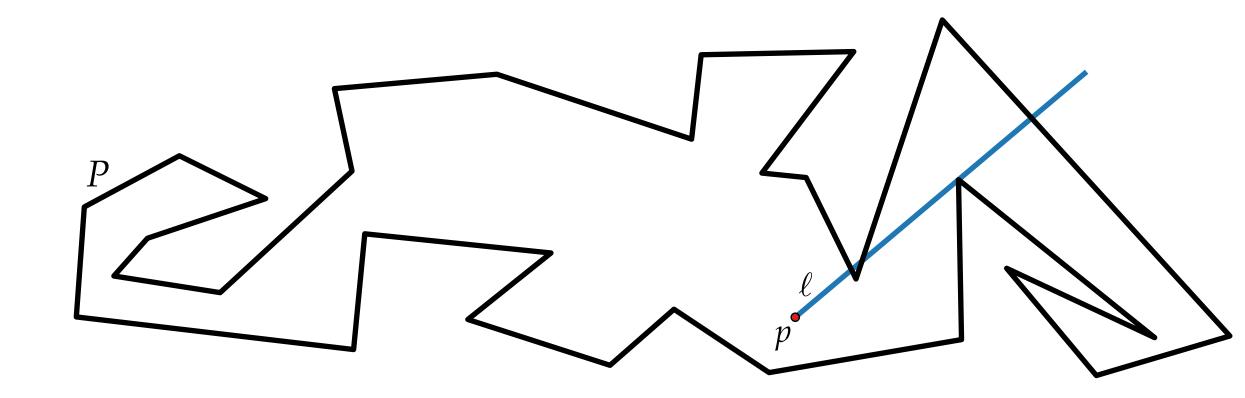
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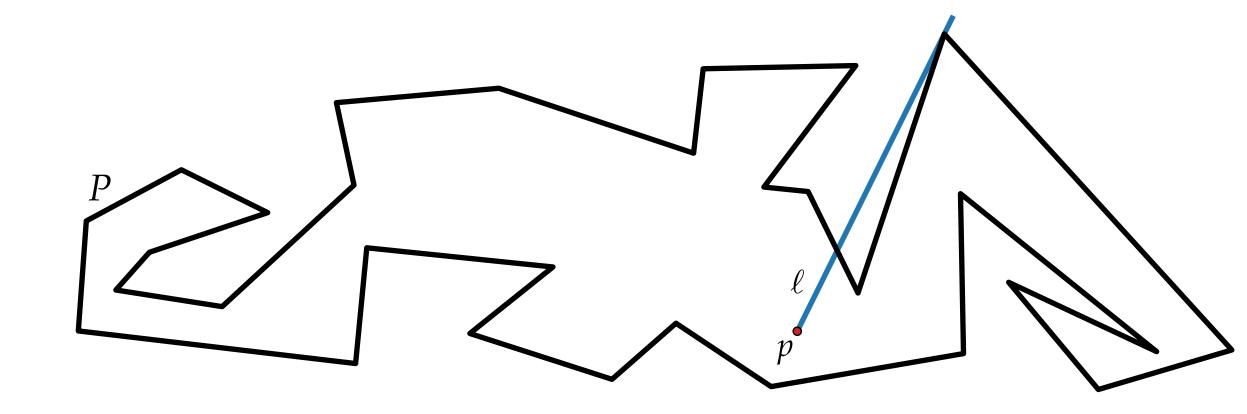
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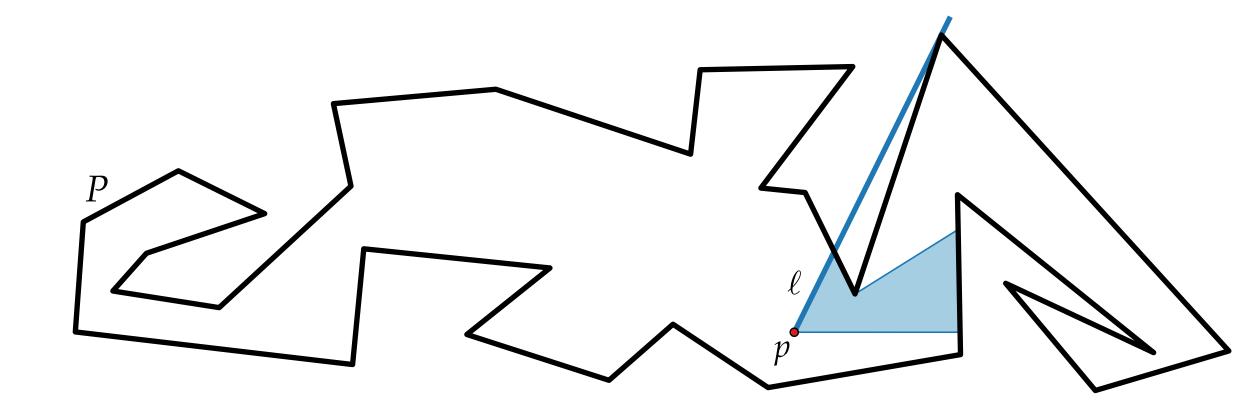
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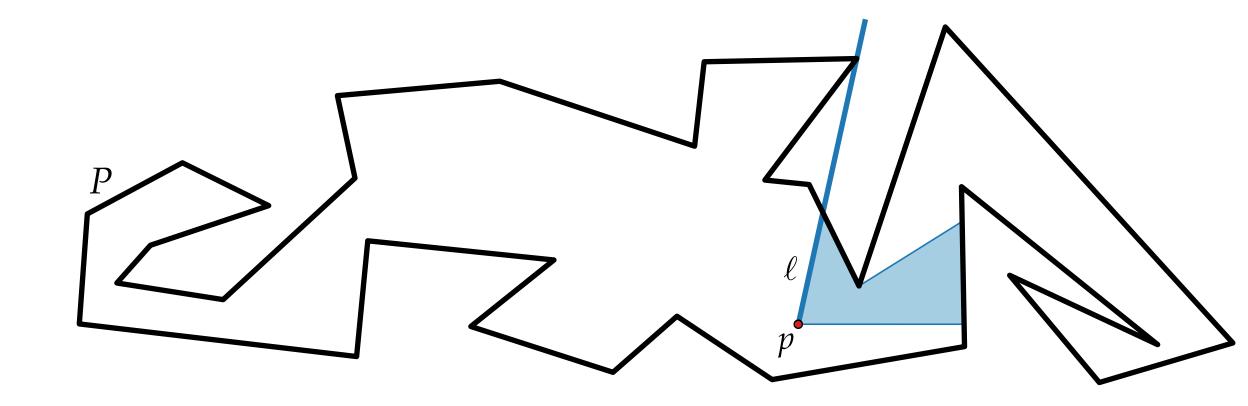
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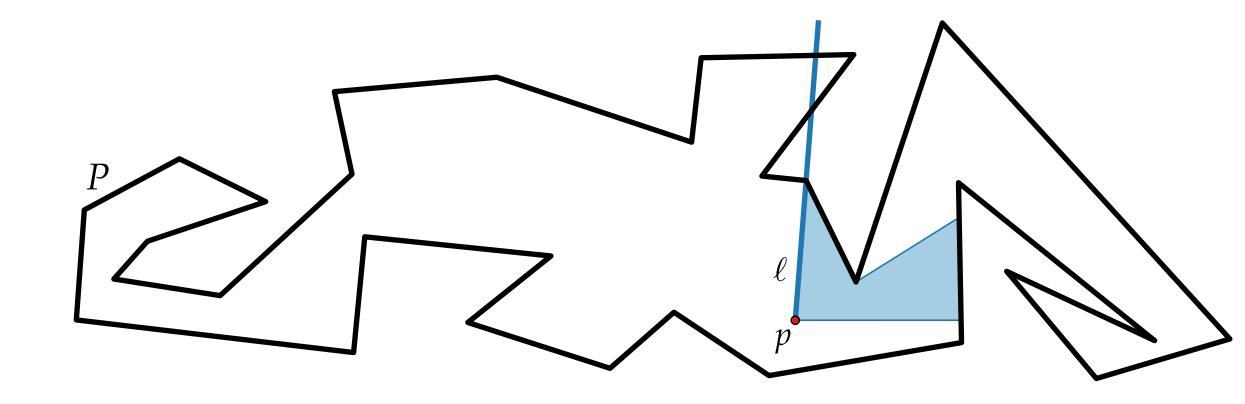
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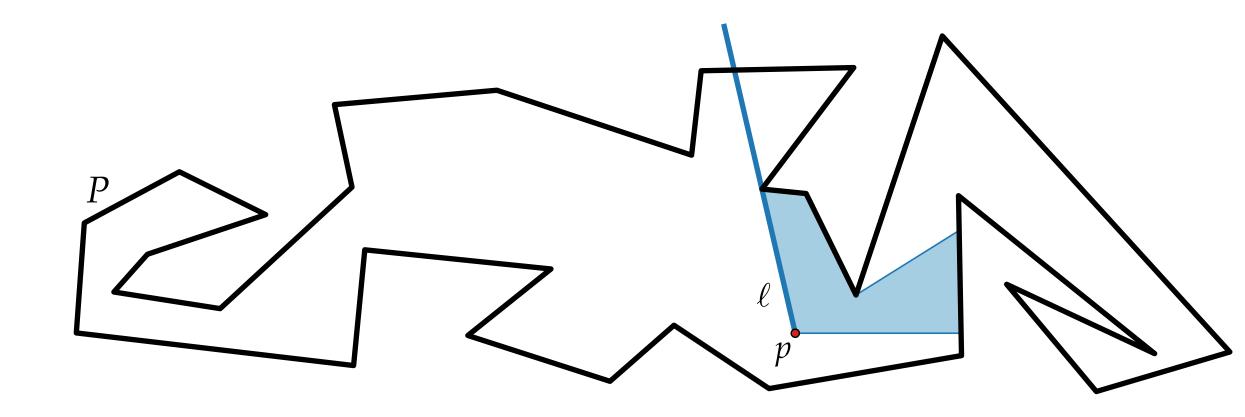
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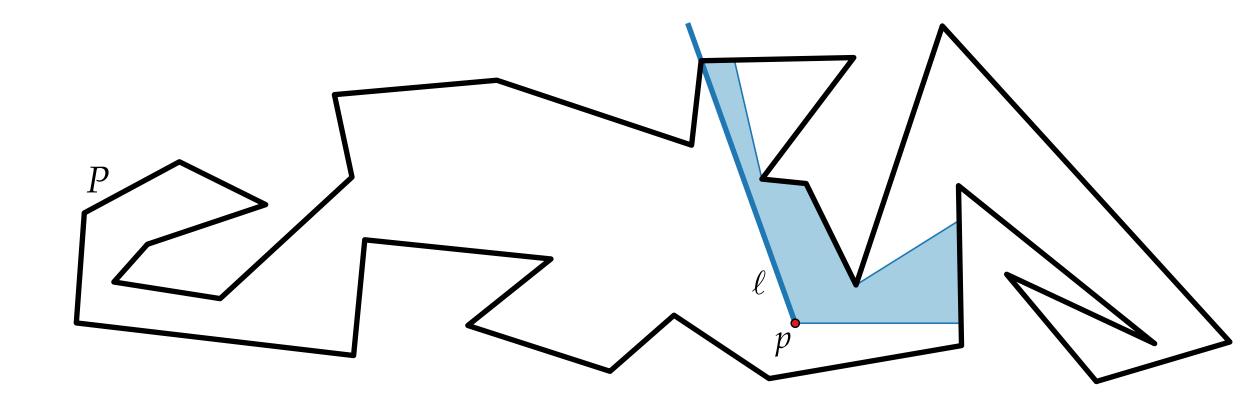
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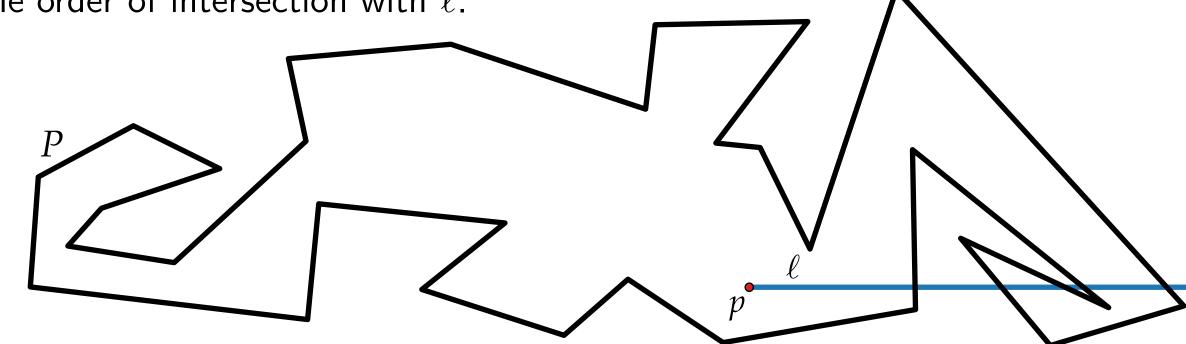


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Idea: Sweep a ray ℓ radially around p.

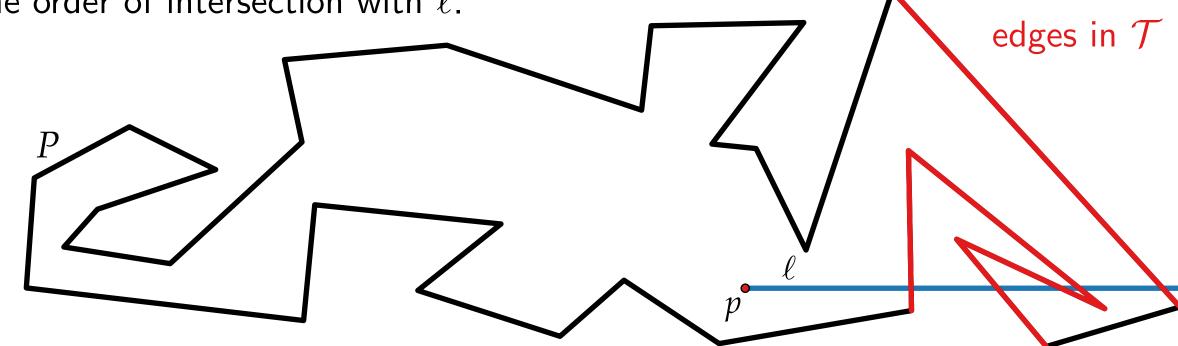


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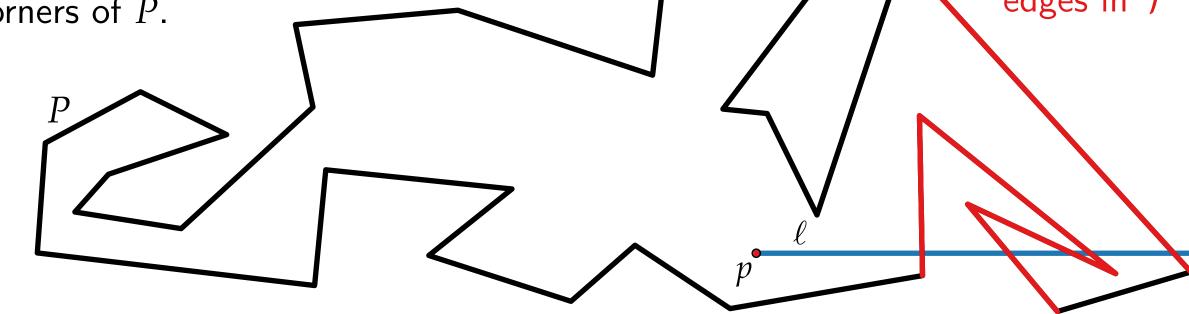


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Sweep line status: Edges of P intersected by ℓ are stored in a balanced binary search tree $\mathcal T$ in the order of intersection with ℓ .

Events: Corners of P.

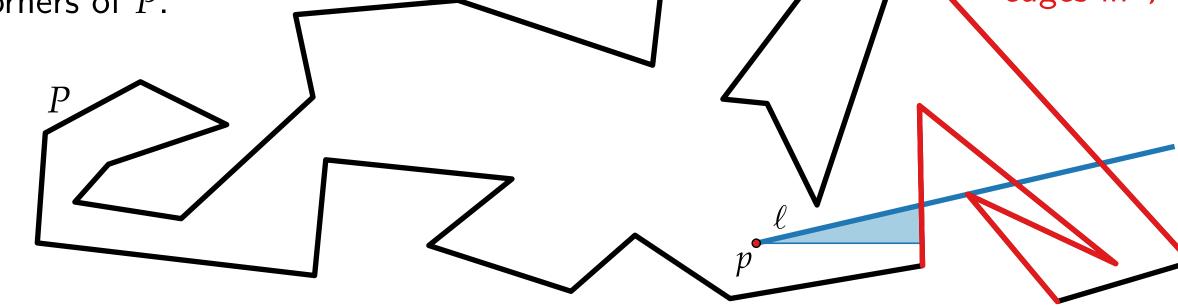
extend the partial solution along the closest edge in $\mathcal T$

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delete

Outlook: Computing Visibility Polygons

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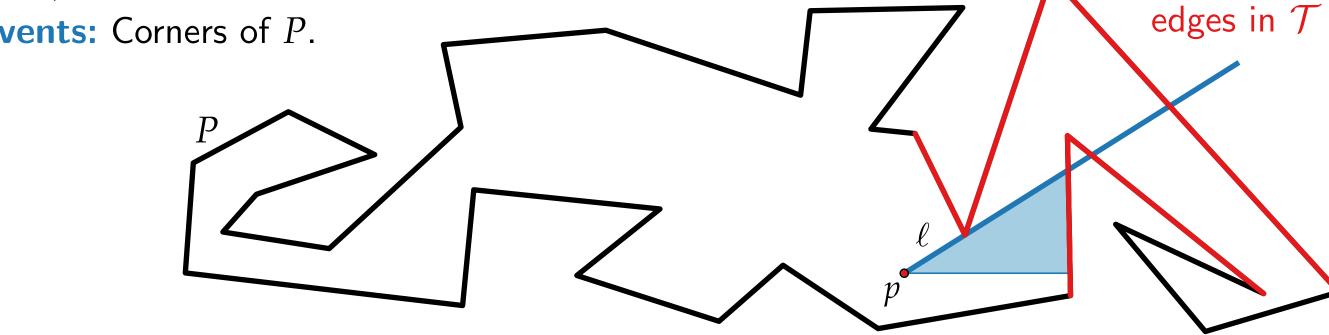
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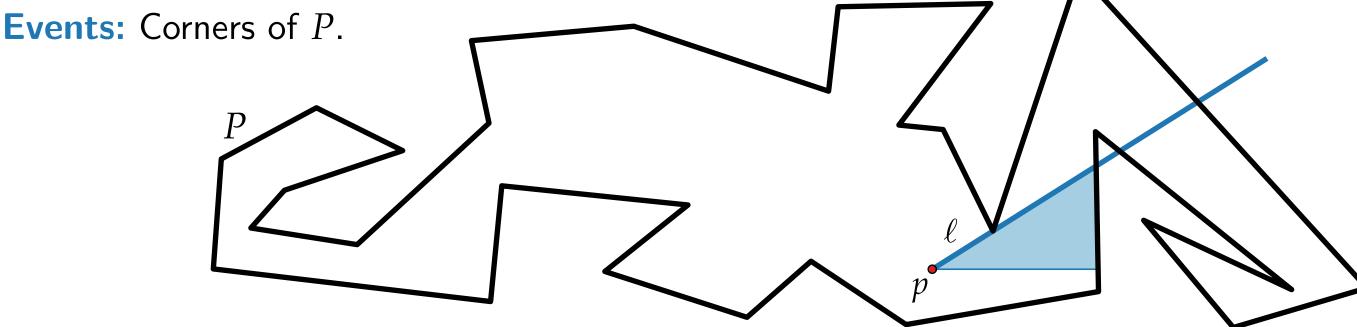


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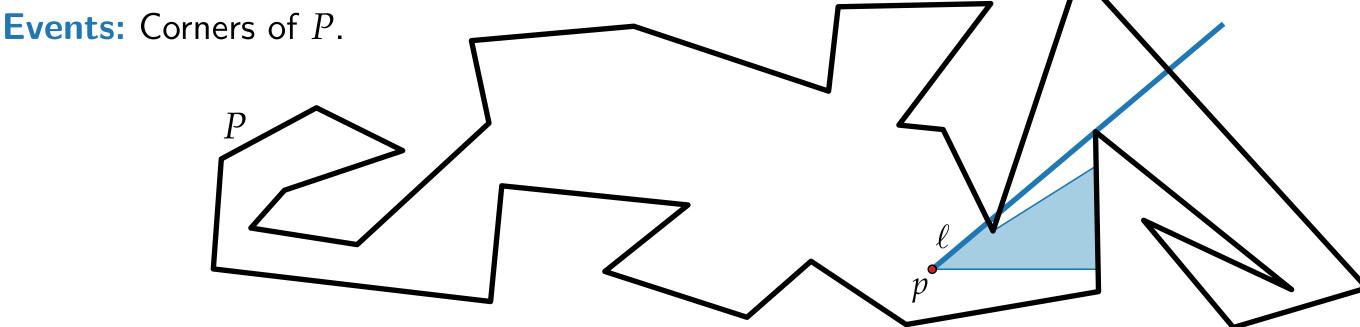


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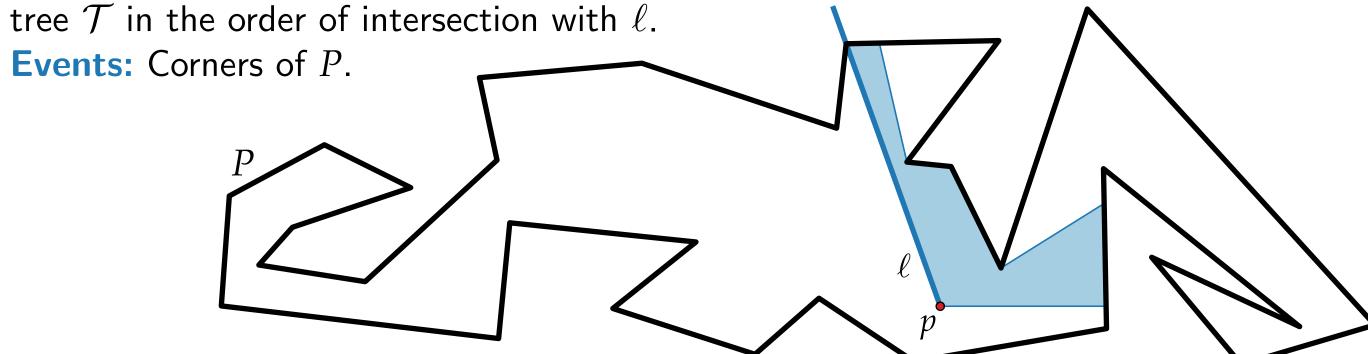
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Total runtime: $\mathcal{O}(n \log n)$



Literature

Rolf Klein. Algorithmische Geometrie: Grundlagen, Methoden, Anwendungen. Springer Verlag 2005.