
Approximating Largest Convex Hulls for Imprecise Points

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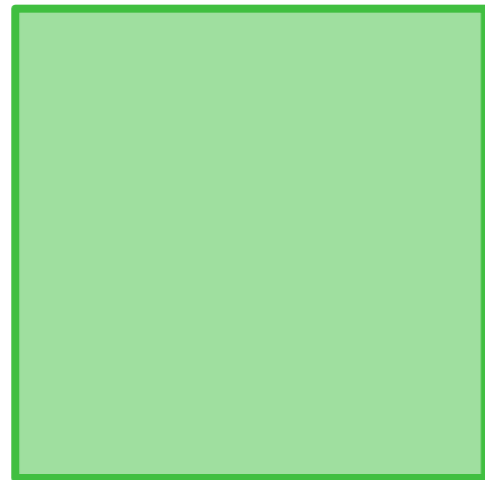
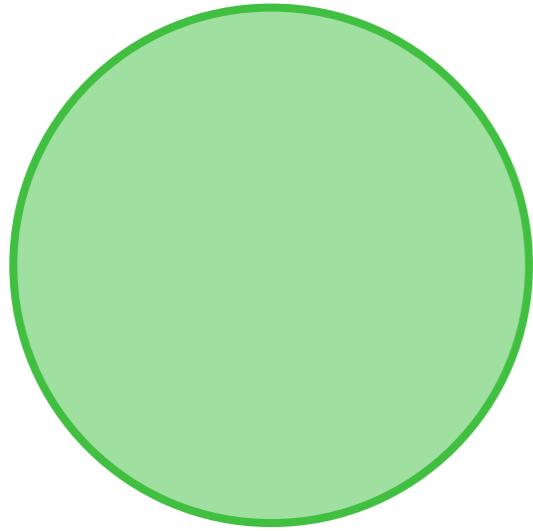
Overview

- Introduction
 - Data Imprecision
 - Convex Hulls
 - Problem Statement
 - Exact Time Bounds
- Approximation
 - Core-Sets
 - Approximation Time Bounds
 - Algorithms
- Concluding remarks

Imprecision

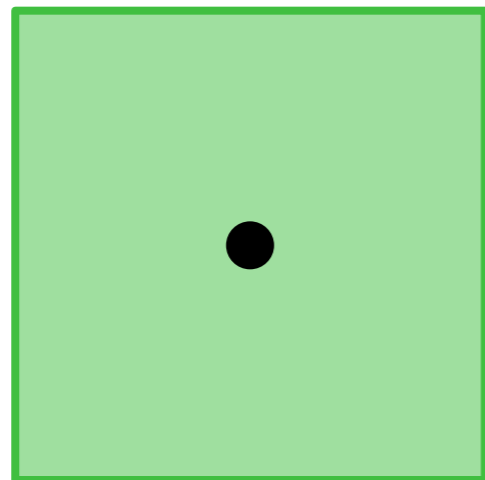
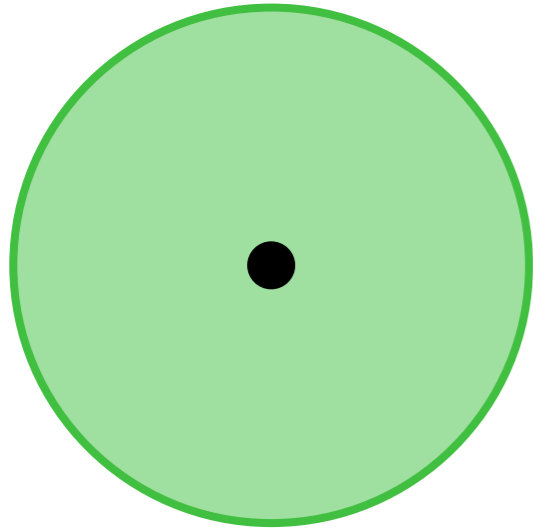
- Traditional algorithms assume exact input
- In practice, input data is often not exact
 - Measured from the real world
 - Stored with limited precision
 - Computed by inexact algorithms
- Output of traditional algorithms is unreliable
- Given exact description of input imprecision, we can exactly predict output imprecision

Imprecise Points



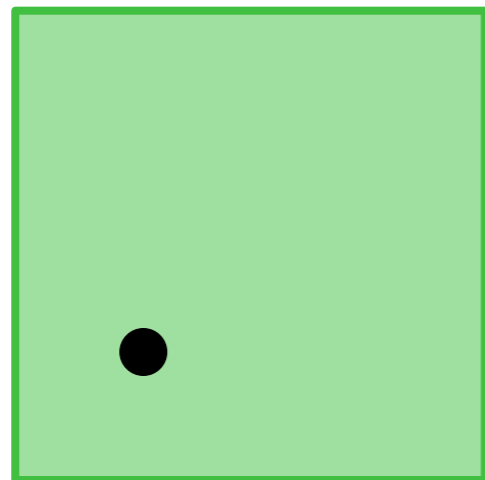
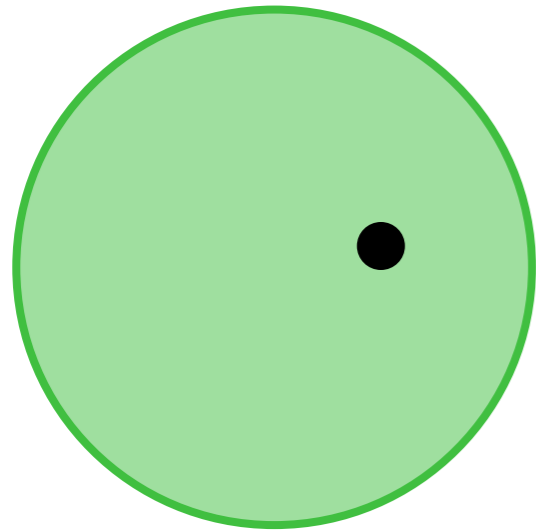
- Unknown location
- Known region of possible locations
- Regions are simple geometric objects
 - Disc
 - Square
 - Rectangle
 - Convex polygon

Imprecise Points



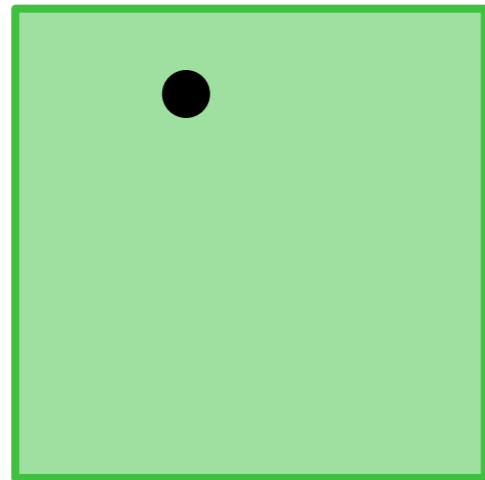
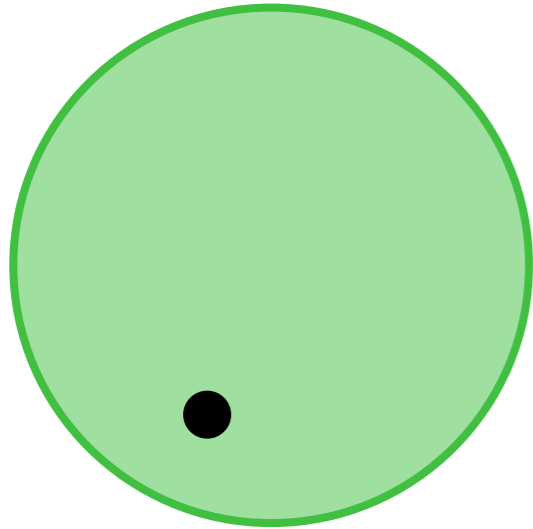
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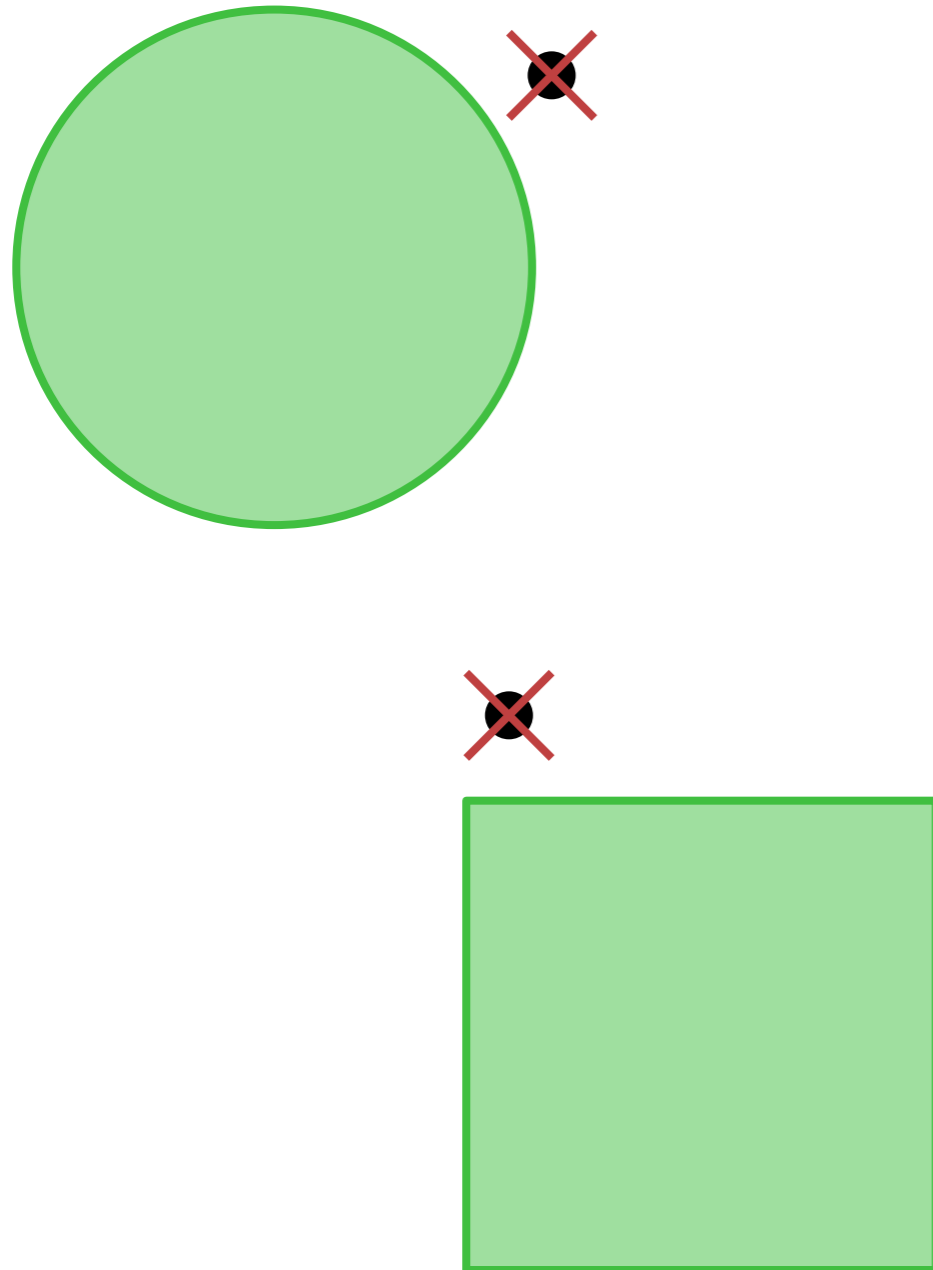
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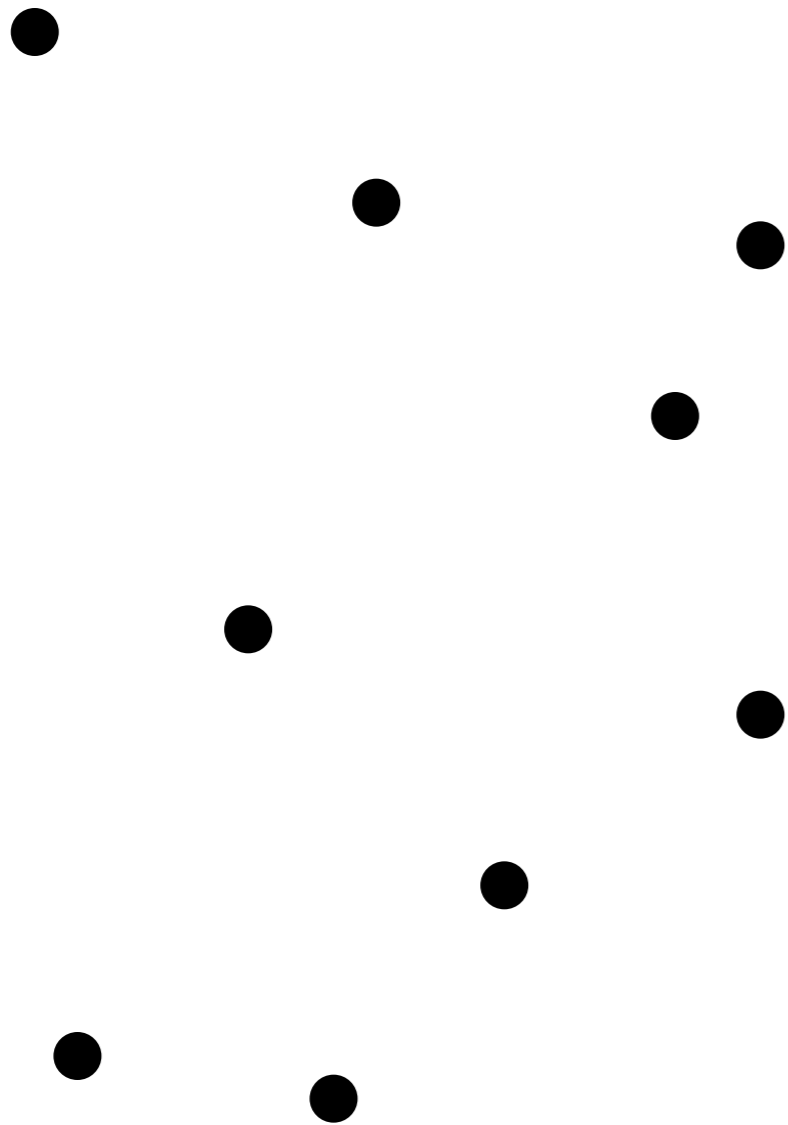
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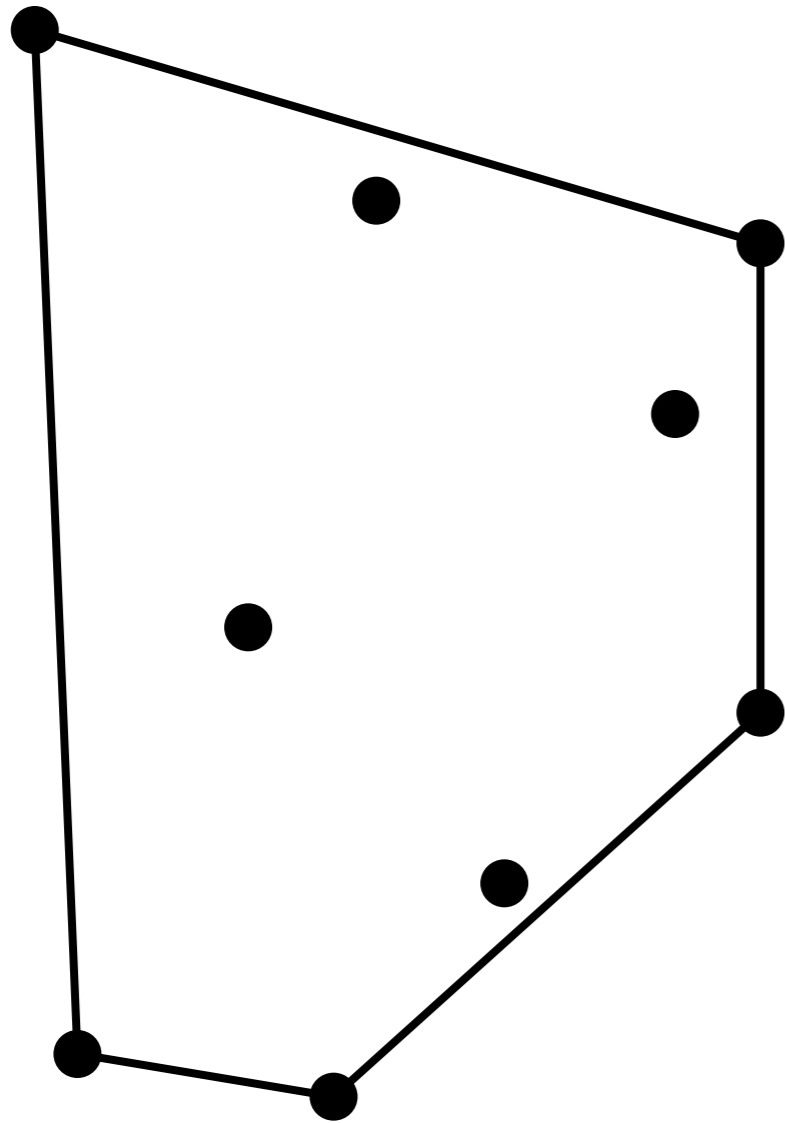
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Convex Hull



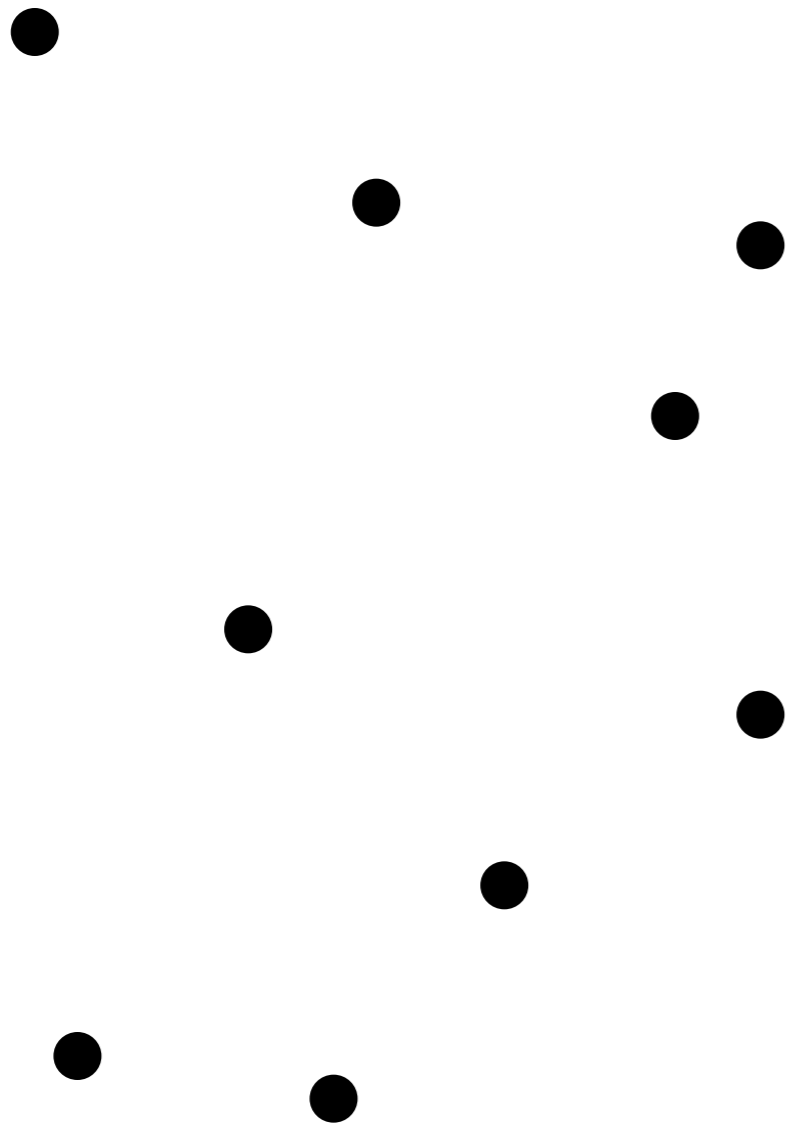
- Given a set P of n points
- Smallest convex set containing P
- Can be computed in $O(n \log n)$ time
- Solved long ago

Convex Hull



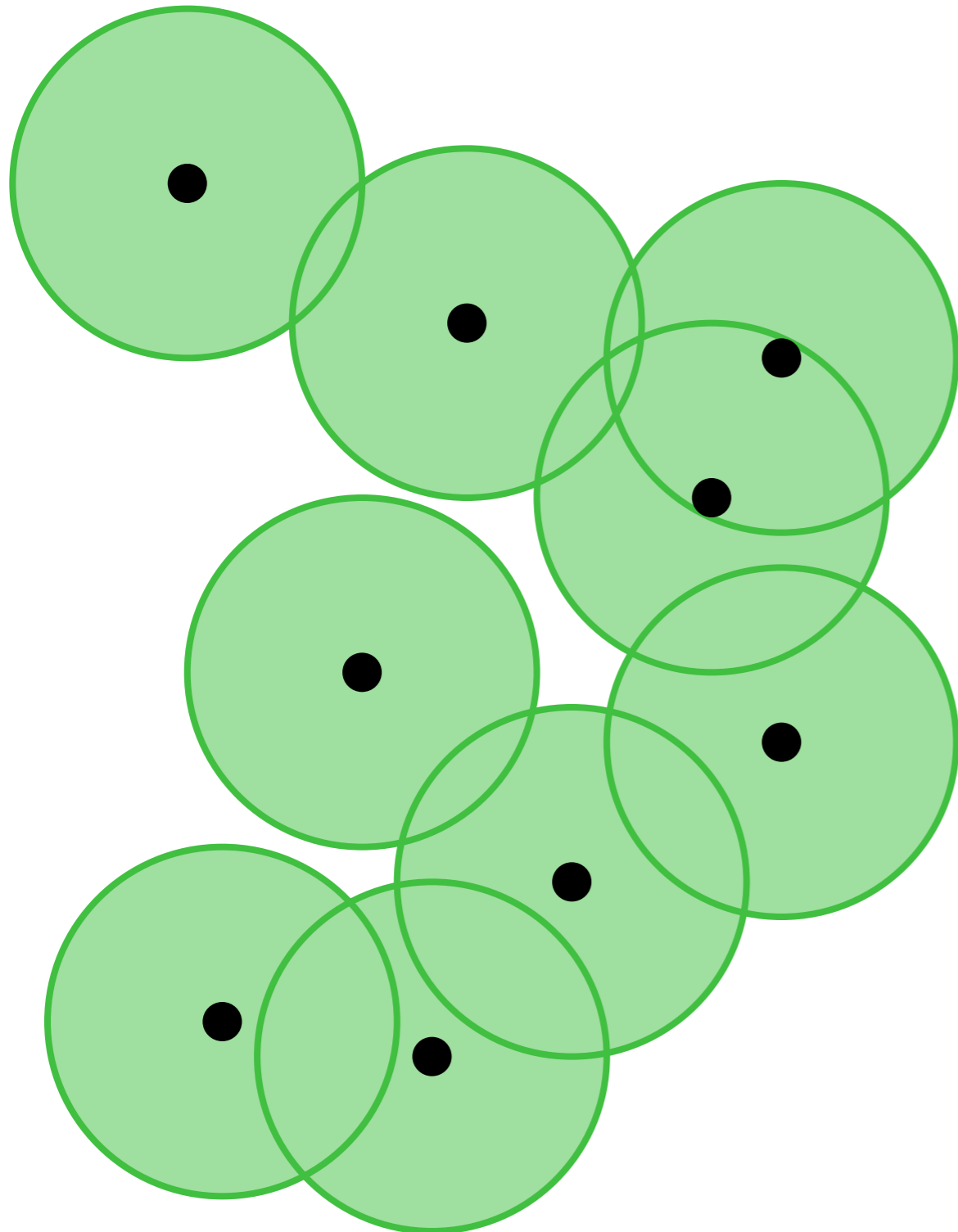
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Imprecise Convex Hull



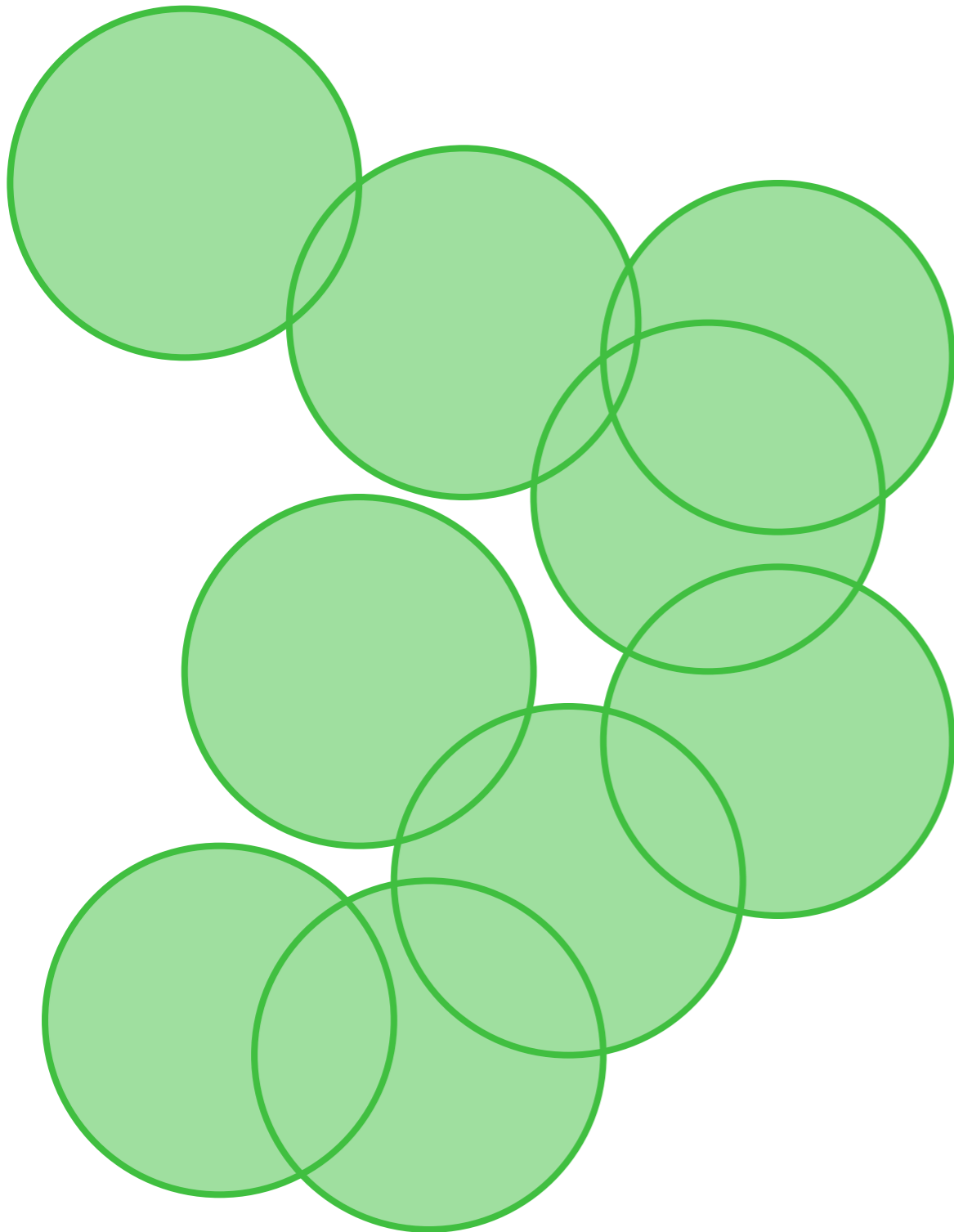
- Given a set \mathcal{L} of n imprecise points
- What is the convex hull?
- Multiple possibilities
- True structure is unknown
- We want to capture the imprecision in the output

Imprecise Convex Hull



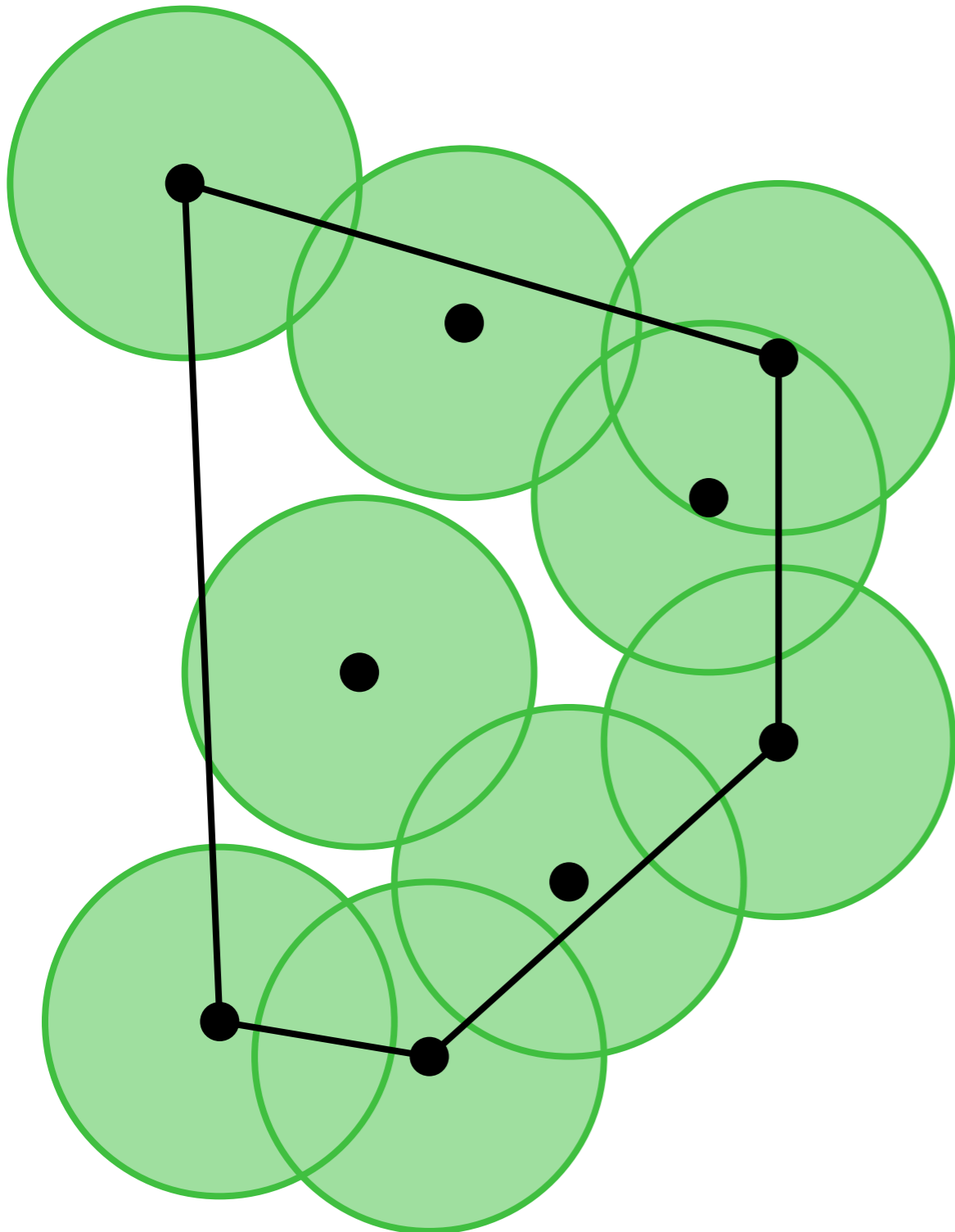
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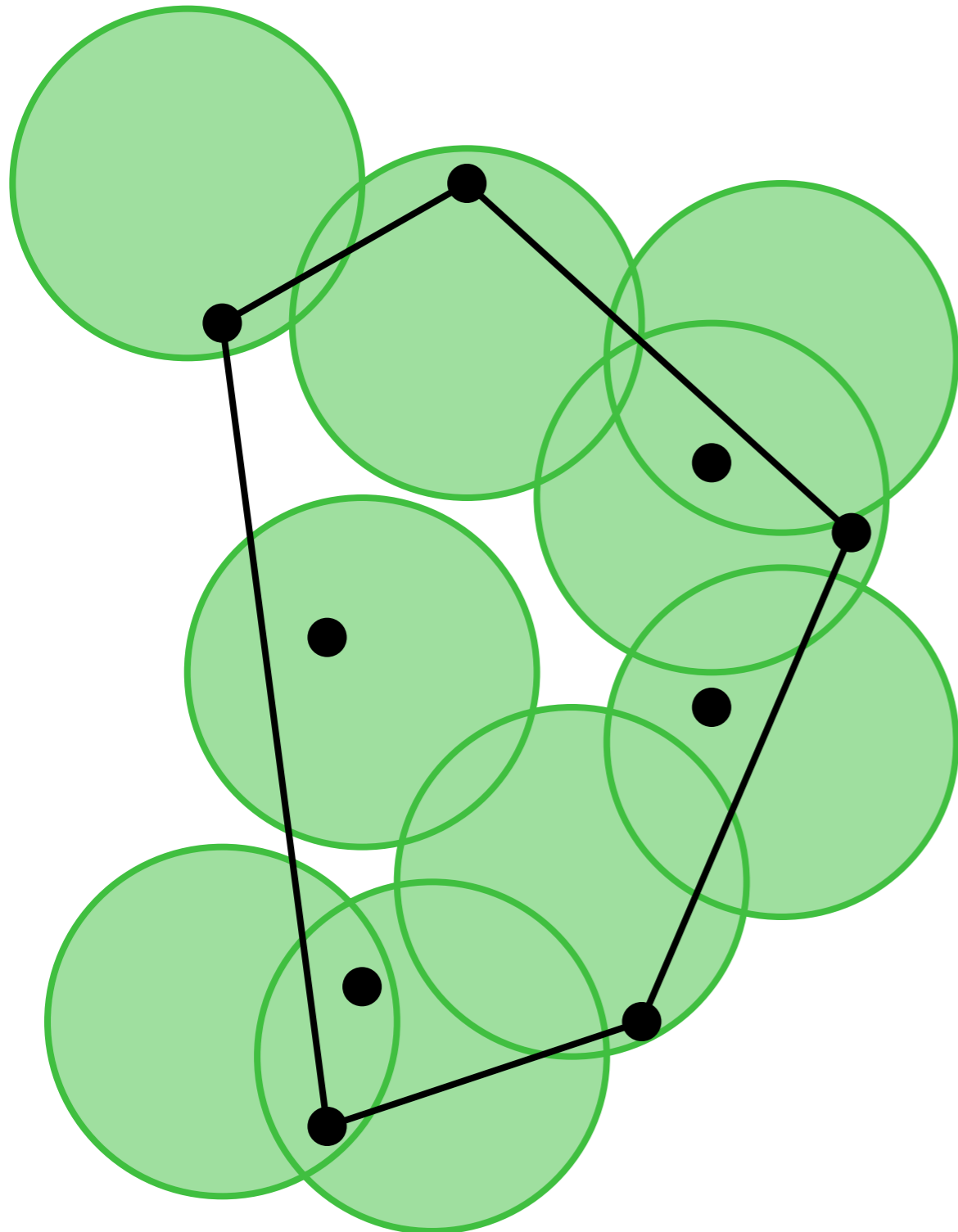
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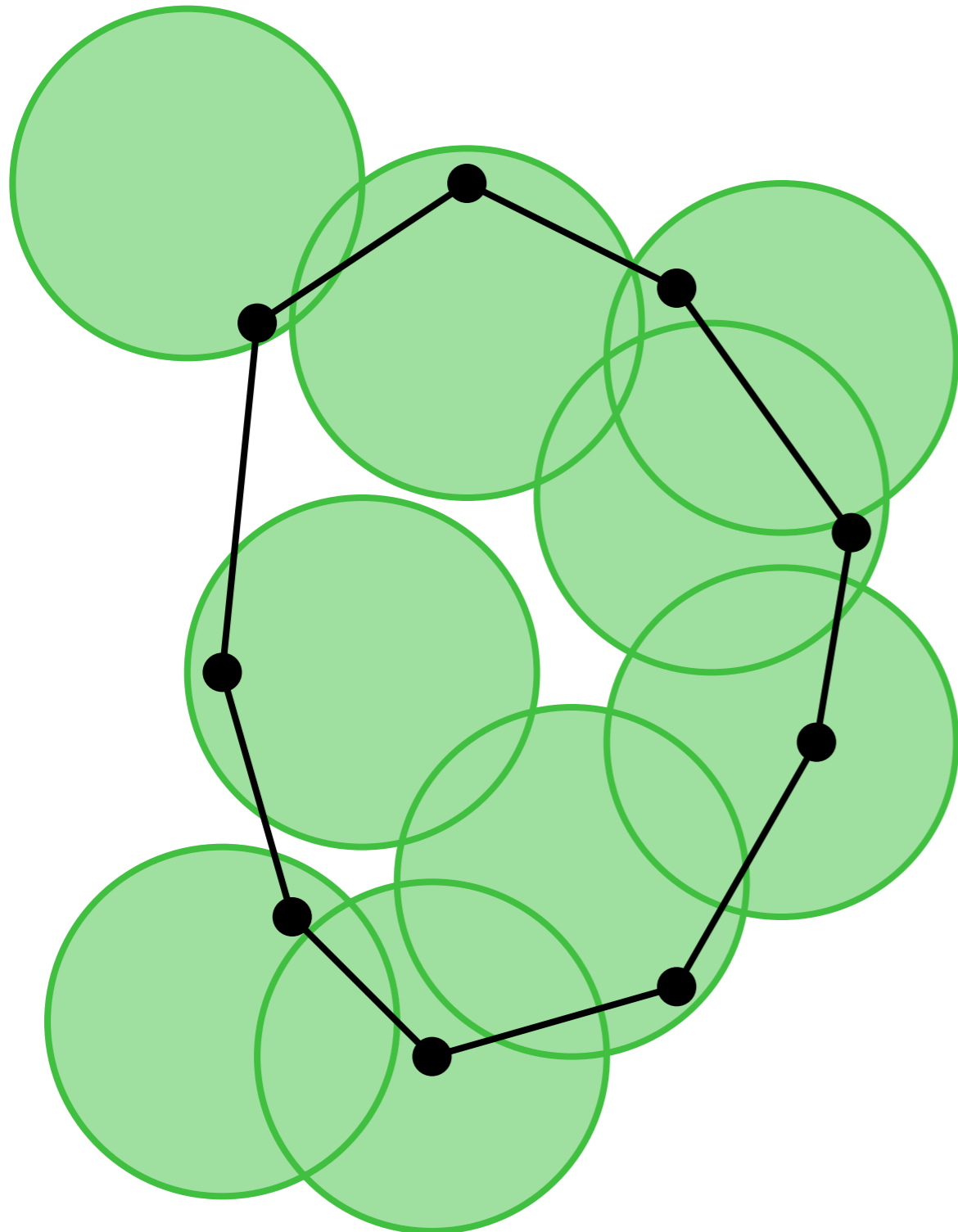
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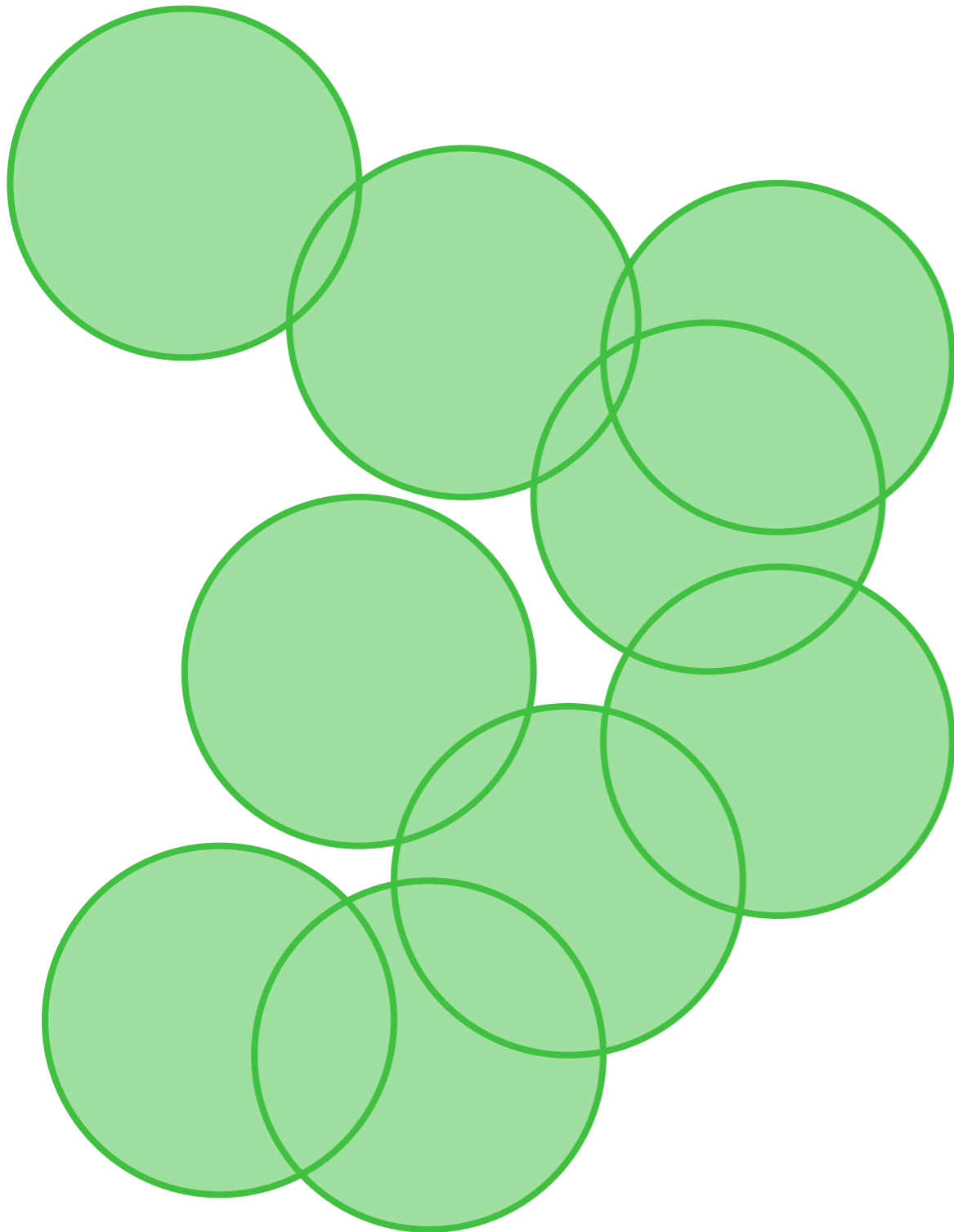
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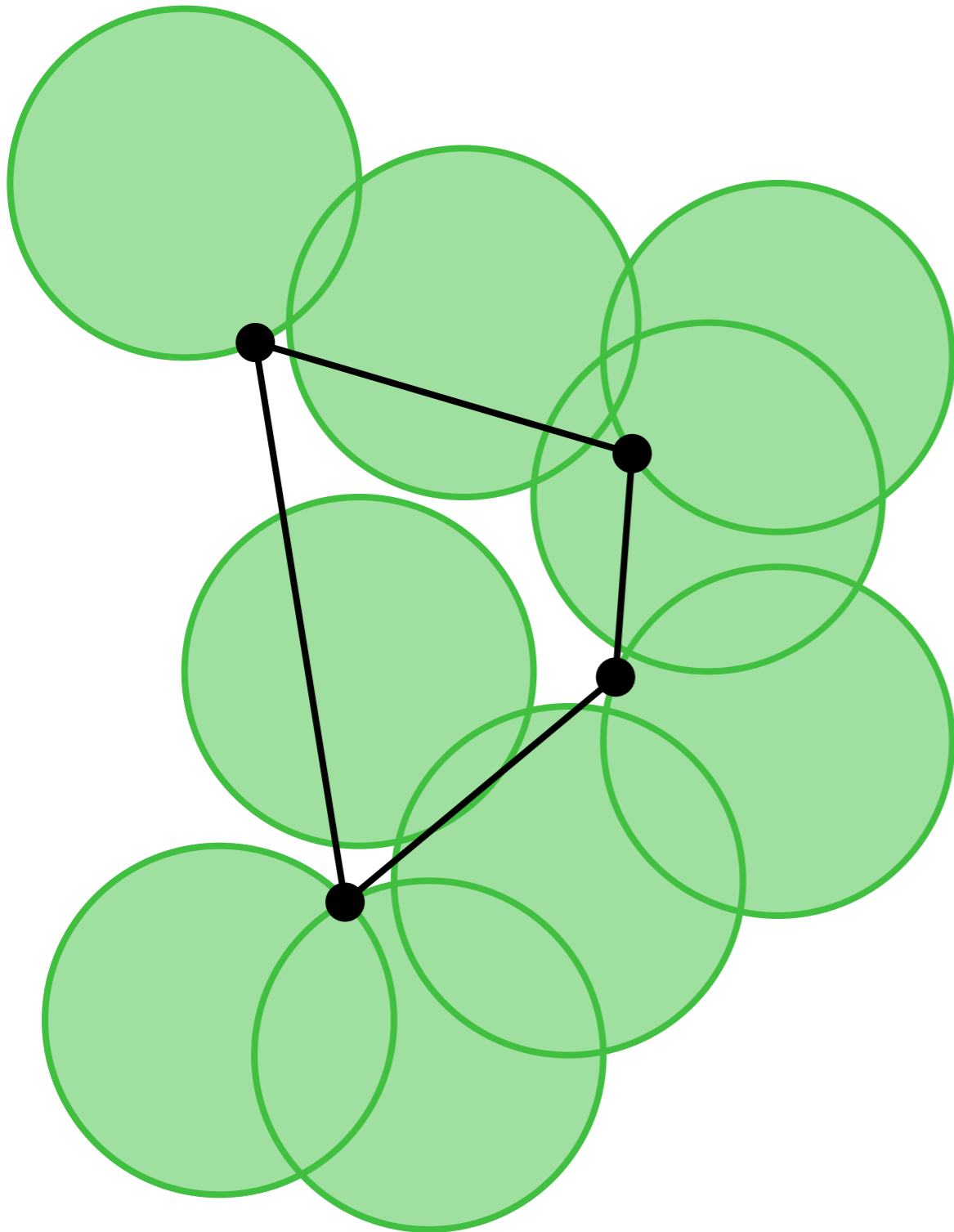
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Bounds on Measures



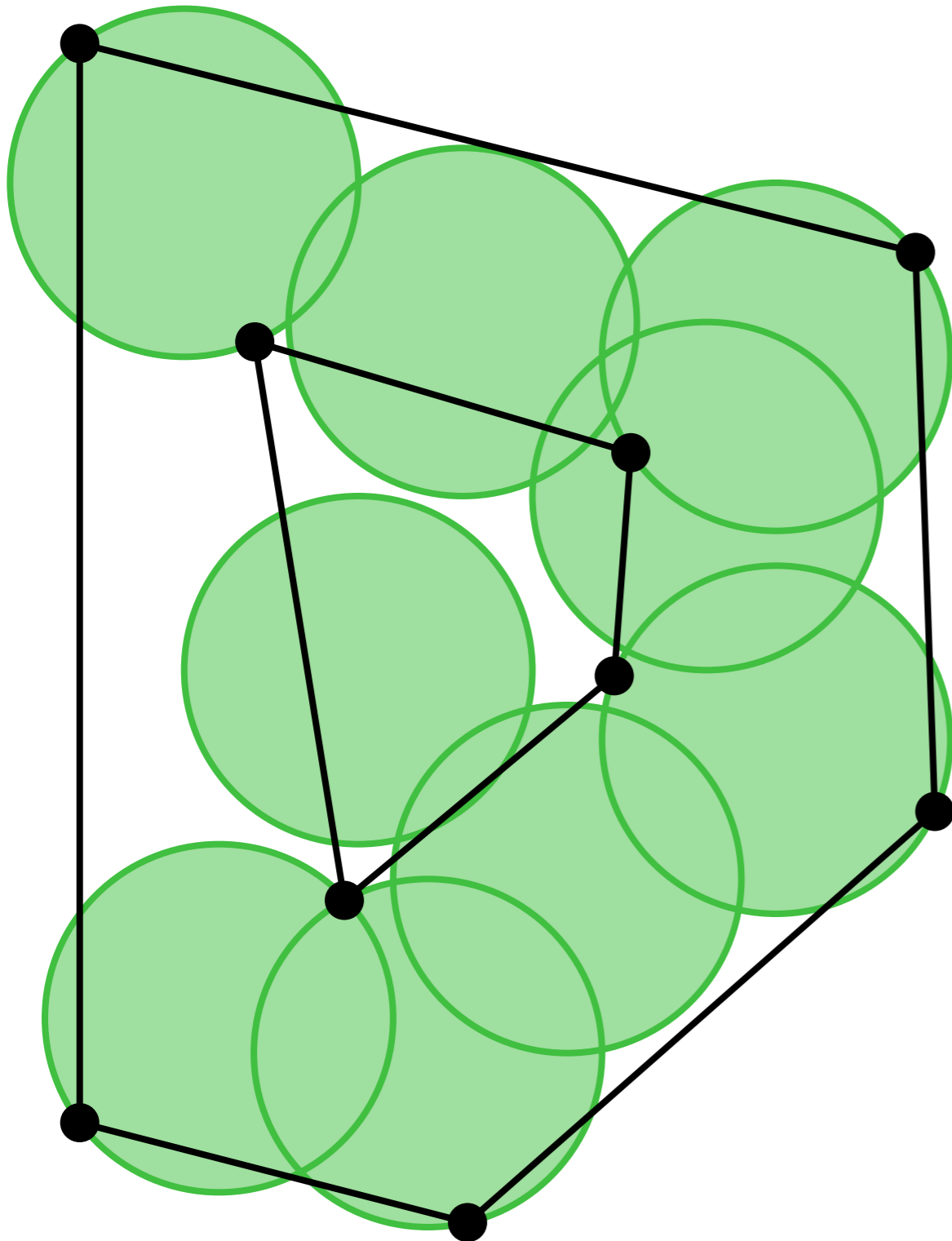
- If we measure the *size* the convex hull ...
 - Area
 - Perimeter
 - Any other measure
- ... we can compute *bounds* on the possible values

Bounds on Measures



- If we measure the *size* the convex hull ...
 - Area
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- ... we can compute *bounds* on the possible values
 - Smallest convex hull

Bounds on Measures



- If we measure the *size* the convex hull ...
 - Area
 - Perimeter
 - Any other measure
- ... we can compute *bounds* on the possible values
 - Smallest convex hull
 - Largest convex hull

Time Bounds for Computing Them

- Area

- Largest area, parallel line segments $O(n^3)$
- Largest area, arbitrary line segments NP-hard
- Largest area, unit squares $O(n^5)$
- Largest area, disjoint squares $O(n^7)$
- Smallest area, parallel line segments $O(n \log n)$
- Smallest area, squares $O(n^2)$

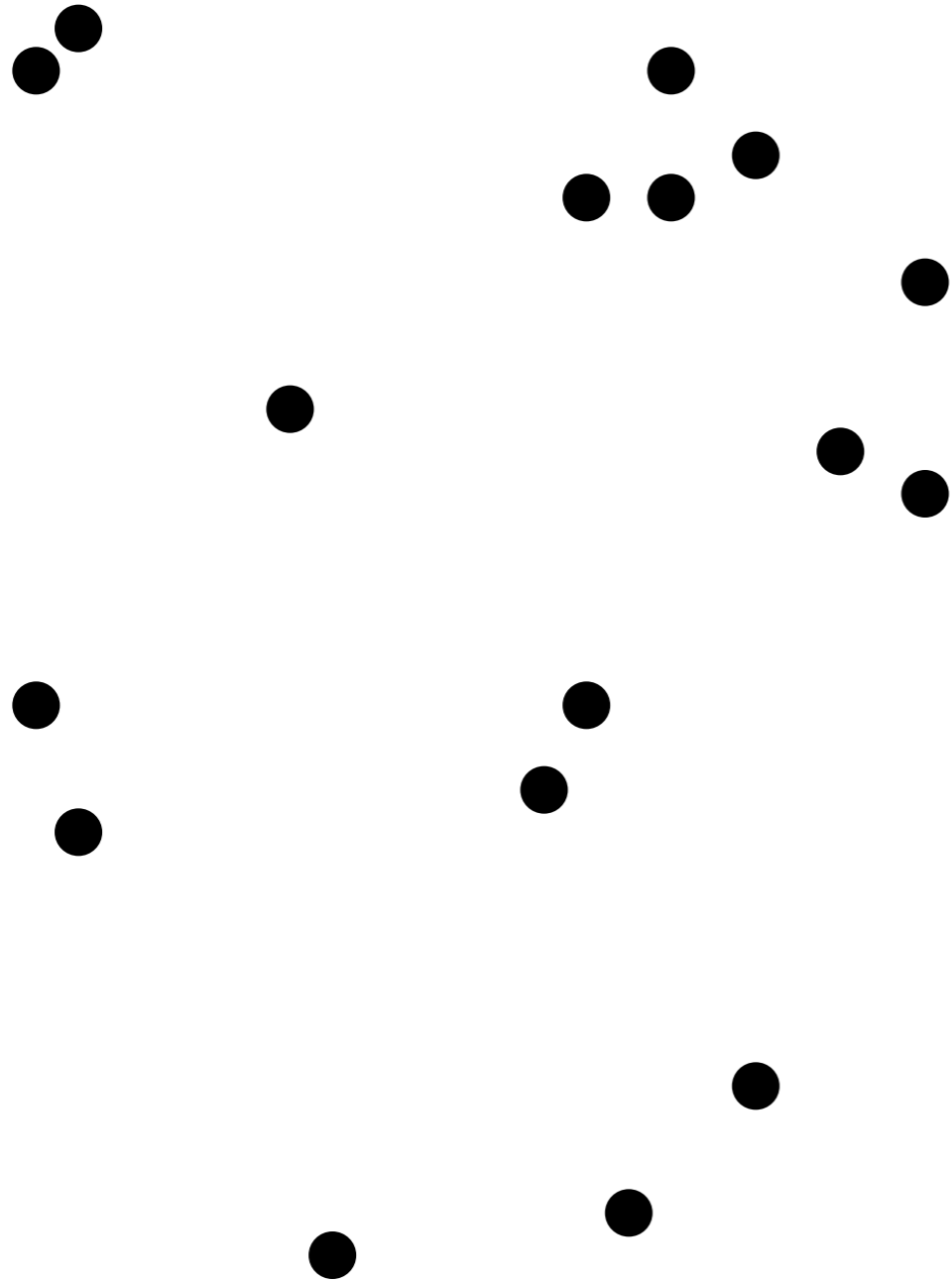
- Perimeter

- Largest perimeter, parallel line segments $O(n^5)$
- Largest perimeter, disjoint squares $O(n^{10})$
- Smallest perimeter, squares $O(n \log n)$

Approximate Largest Convex Hull

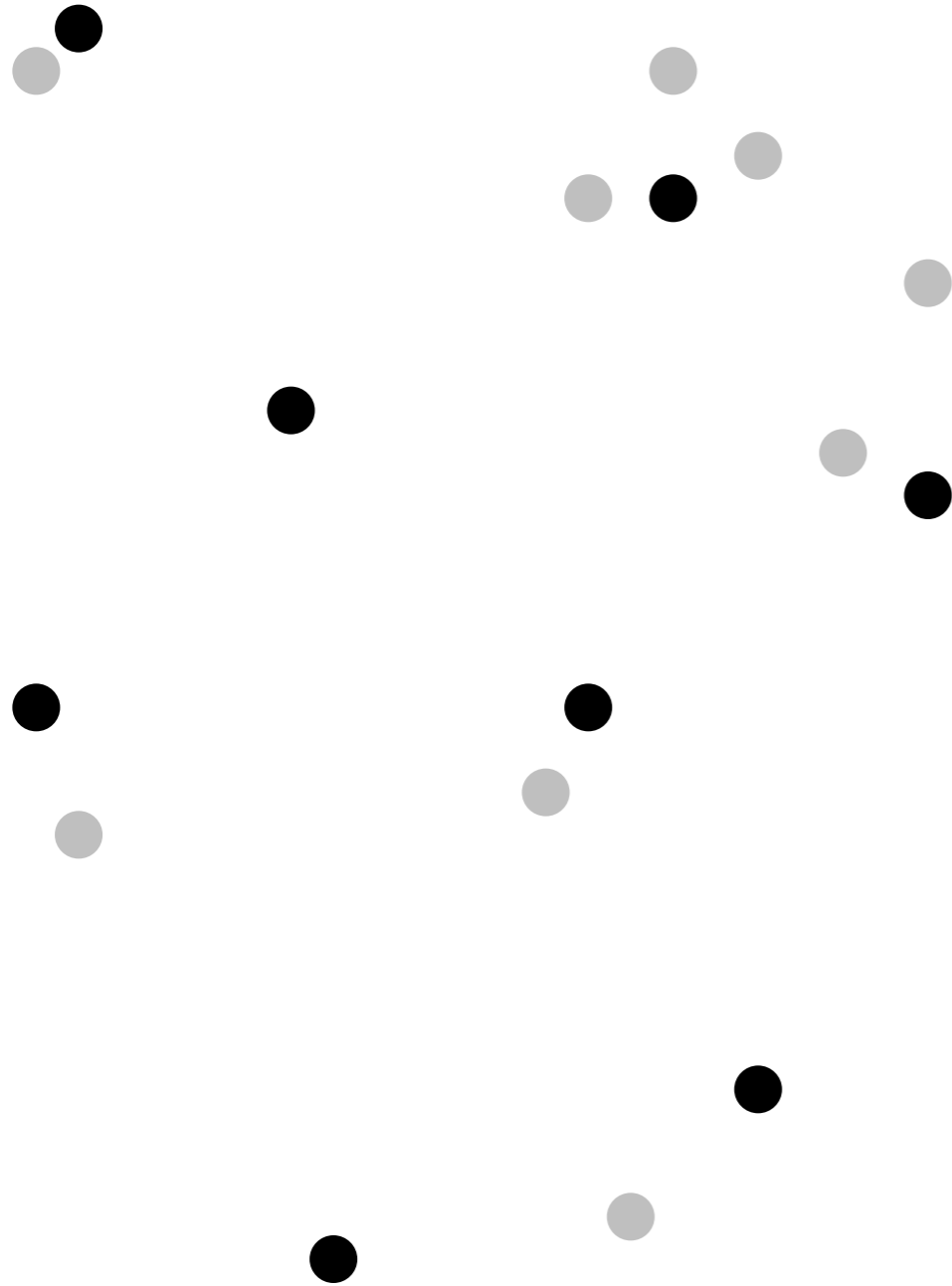
- Computing the largest possible convex hull is hard
- Instead, we will compute the almost-largest convex hull
- A $(1 - \varepsilon)$ -approximation of the convex hull gives only a slightly weaker bound on the real size

Core-Sets



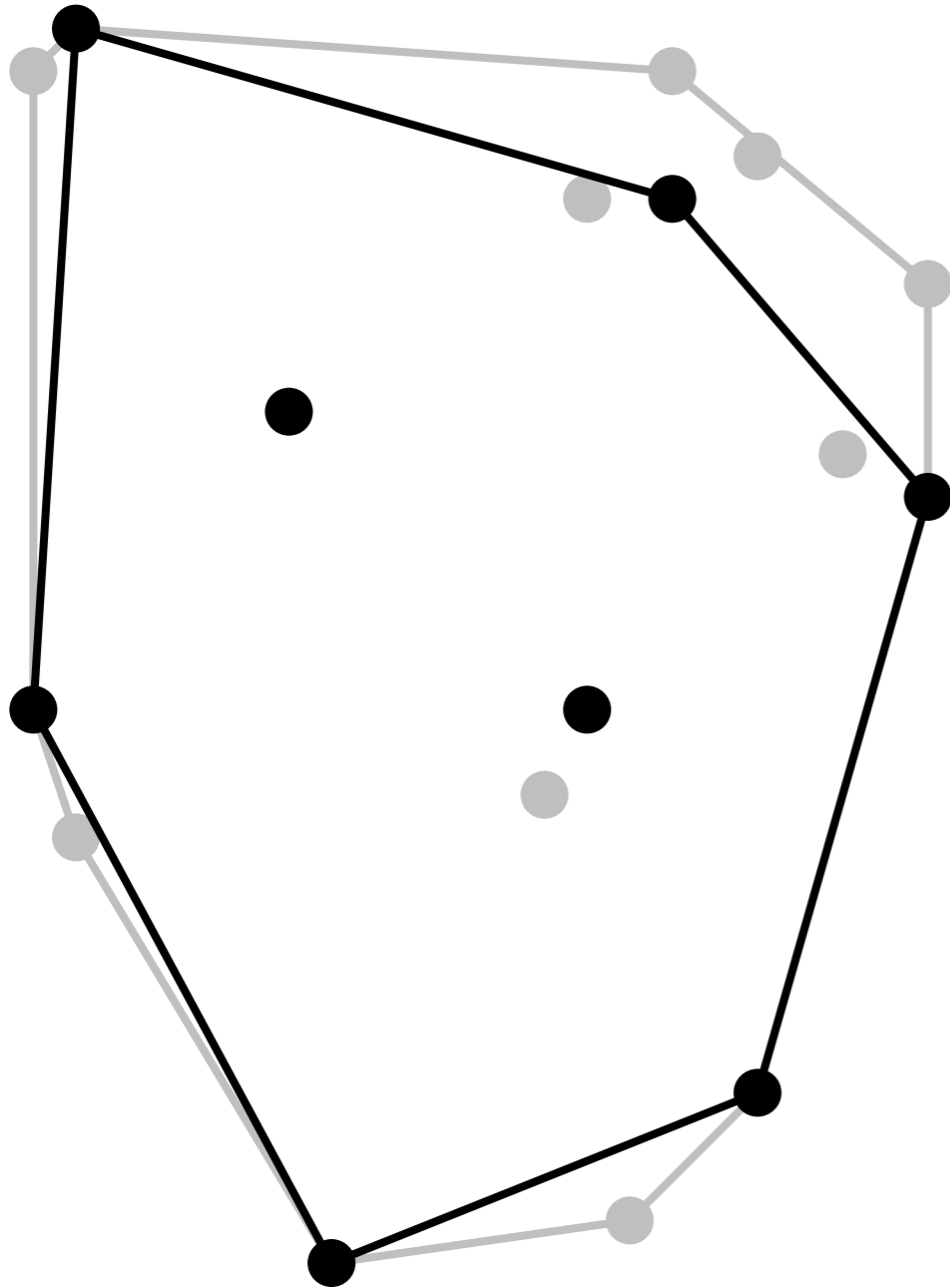
- Let P be a set of n points in \mathbb{R}^2
- Suppose we want to compute $\mu(P)$
- $P' \subset P$ is a *core-set* w.r.t. μ if:
 - $\mu(P') \geq (1 - \varepsilon)\mu(P)$
 - $|P'|$ is constant
 - $|P'|$ does depend on ε
- Compute first P' and then $\mu(P')$

Core-Sets



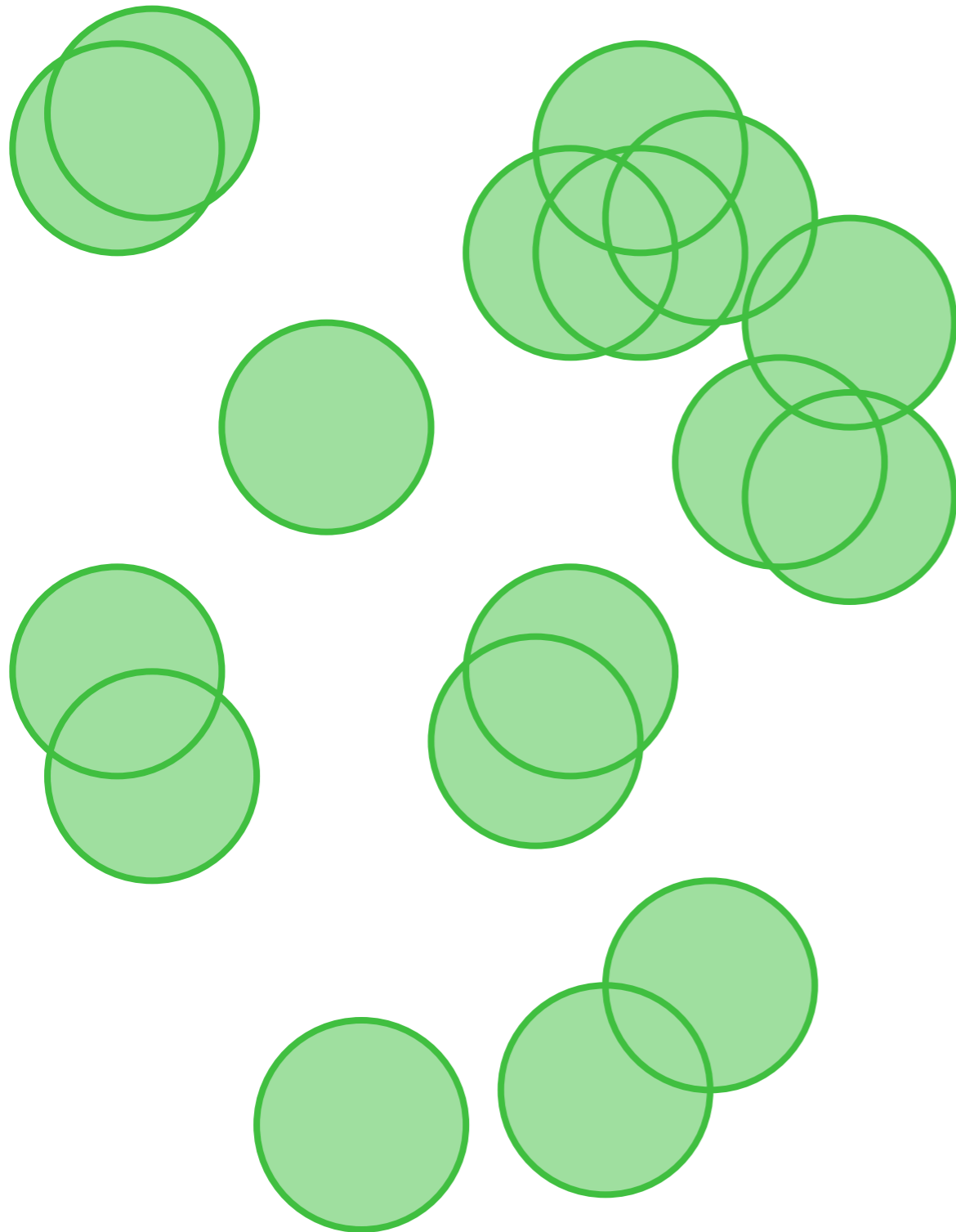
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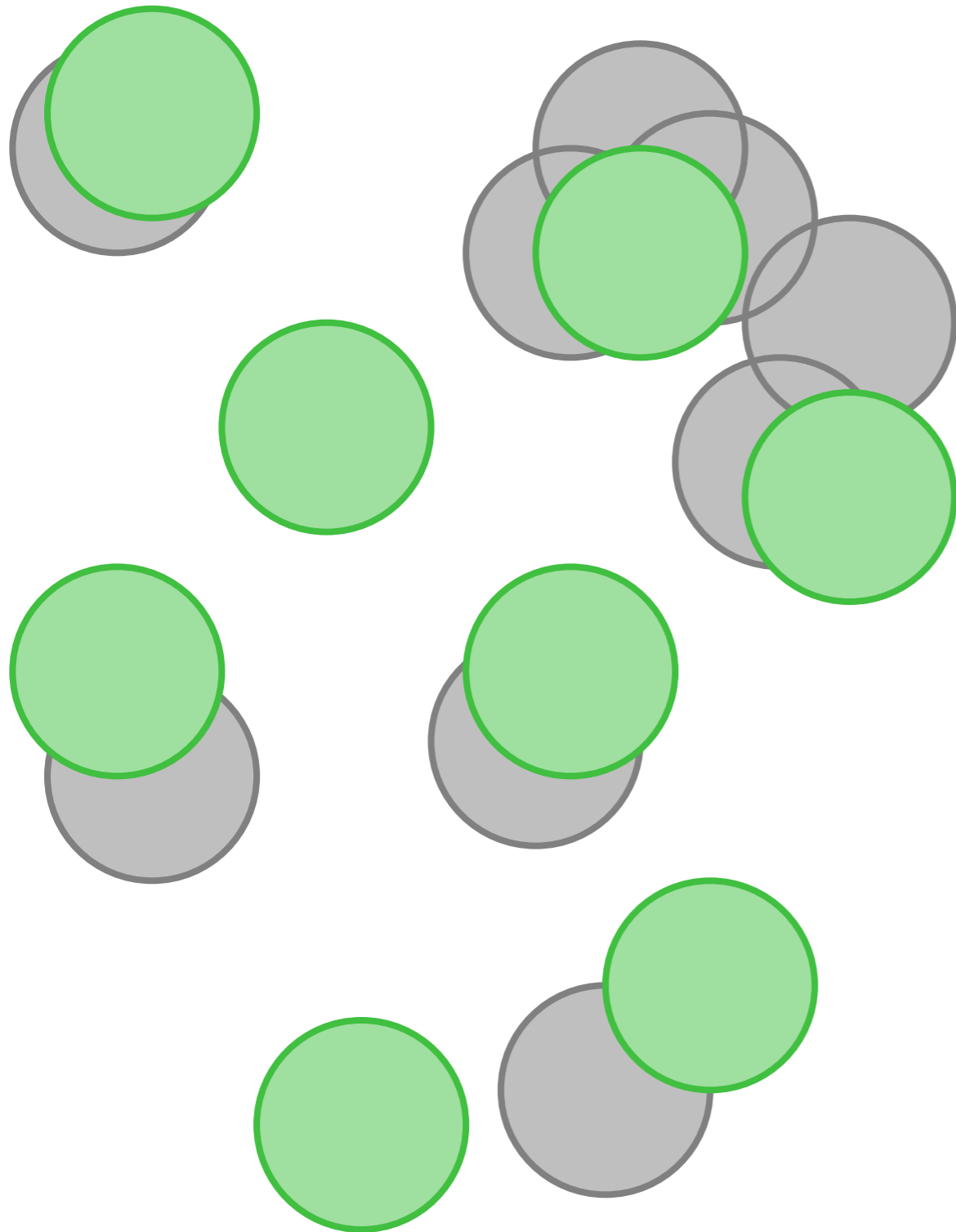
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Imprecise Core-Sets



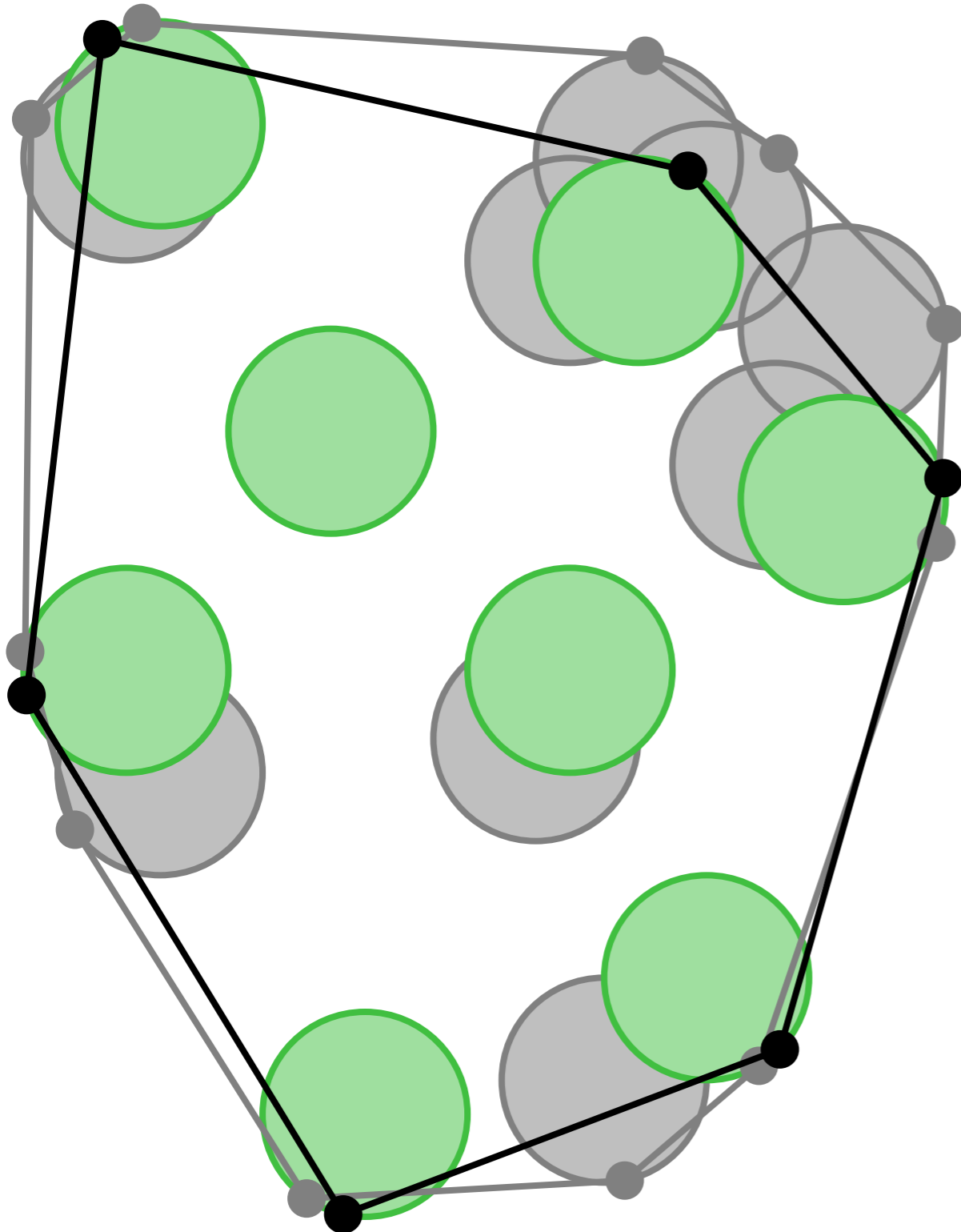
- Let \mathcal{L} be a set of n regions in \mathbb{R}^2
- Suppose we want to compute $\mu(\mathcal{L})$
- $\mathcal{L}' \subset \mathcal{L}$ is a *core-set* w.r.t. μ if:
 - $\mu(\mathcal{L}') \geq (1 - \varepsilon)\mu(\mathcal{L})$
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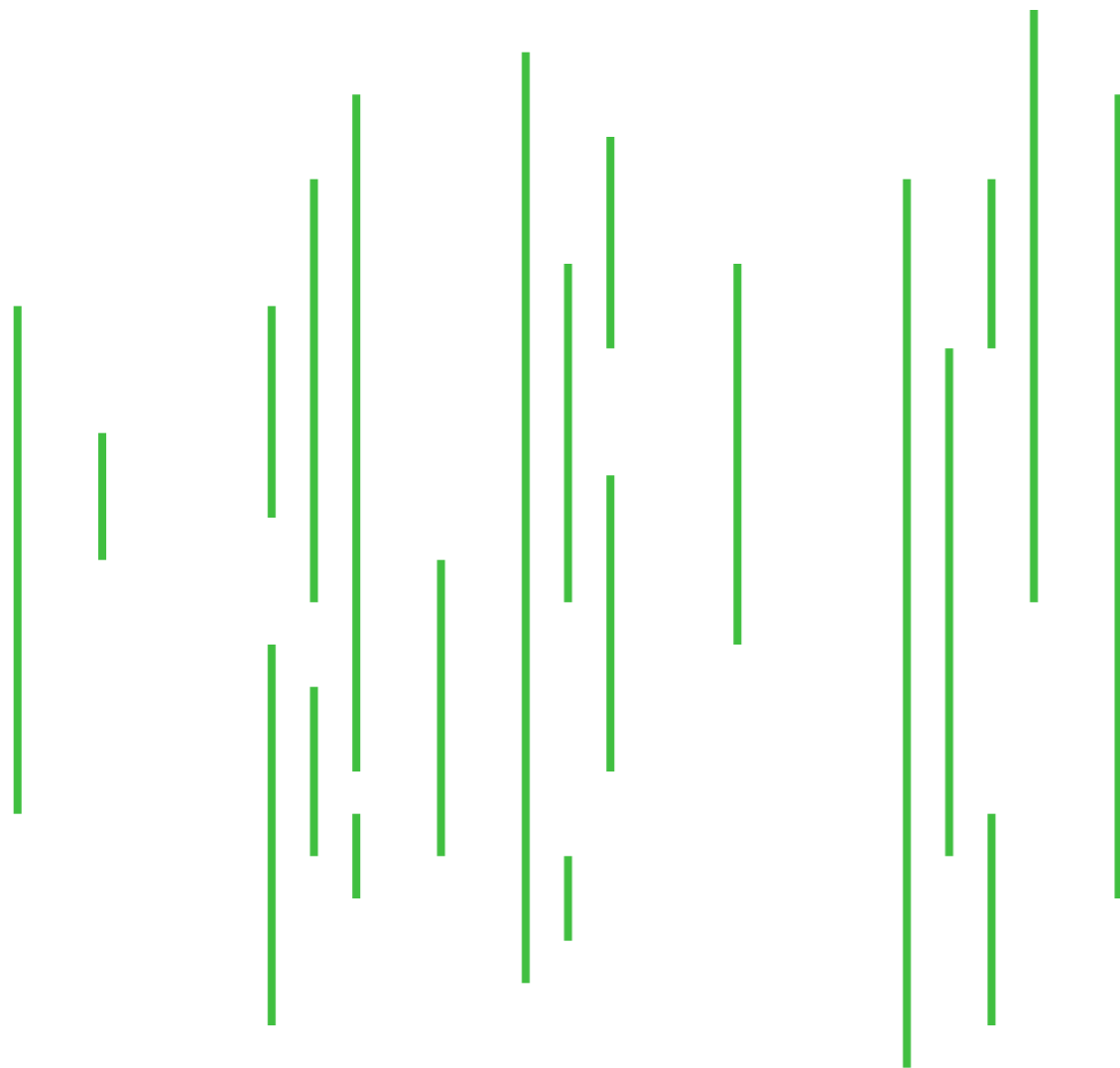


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Results

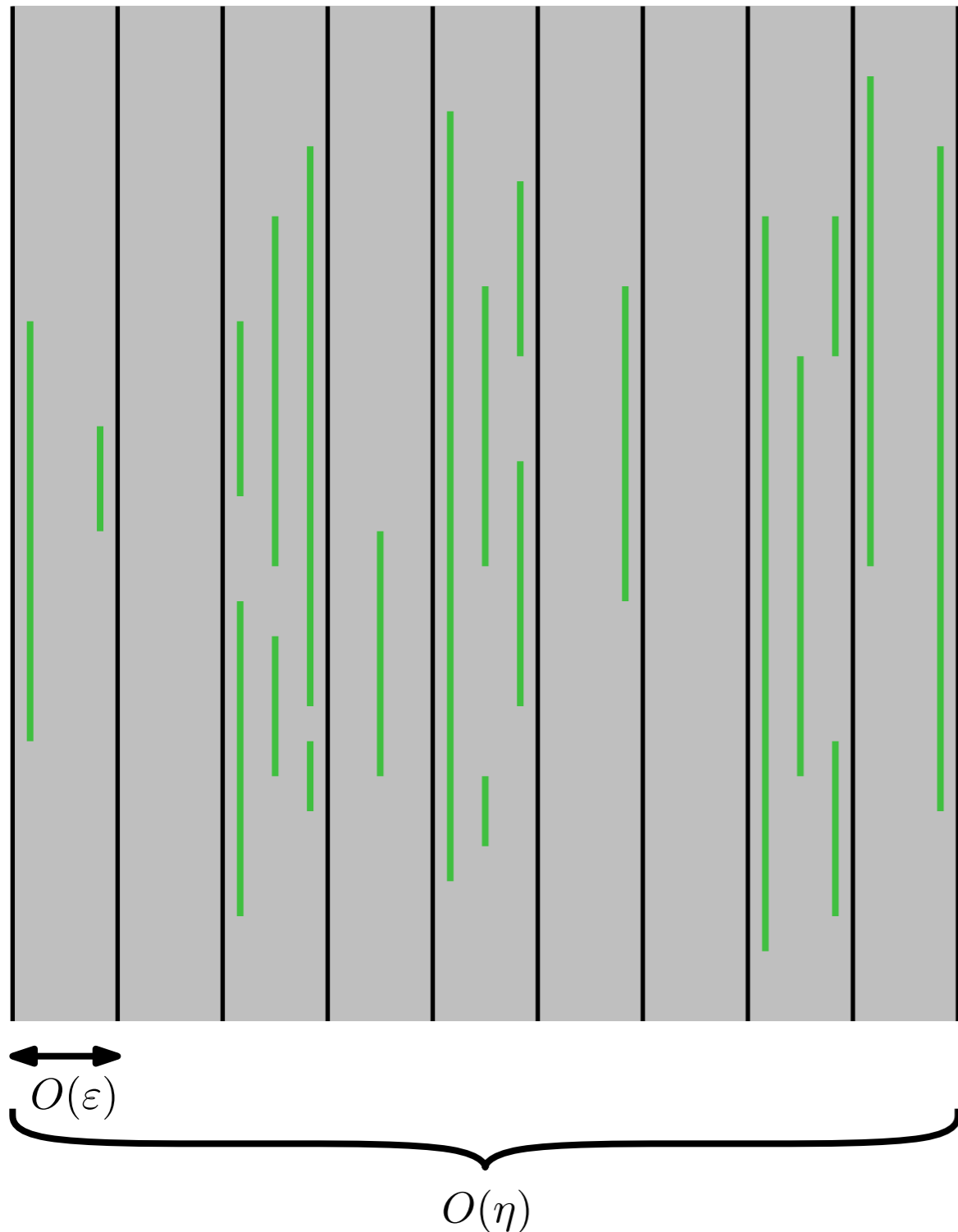
- Line segments, parallel $O(n + \eta^3)$
- Line segments $O(n) + 2^{O(\eta^2)}$
- Squares, disjoint $O(n + \eta^{14})$
- Squares, same size $O(n + \eta^{12})$
- Squares $O(n) + 2^{O(\eta^2)}$
- Regular k -gons, disjoint $O(n) + 2^{O(k \log \eta)}$
- Regular k -gons $O(n) + 2^{O(\eta^2 \log k)}$
- Circles, disjoint $O(n) + 2^{O(\sqrt{\eta} \log \eta)}$
- Circles $O(n) + 2^{O(\eta^2 \log \eta)}$

Vertical Line Segments



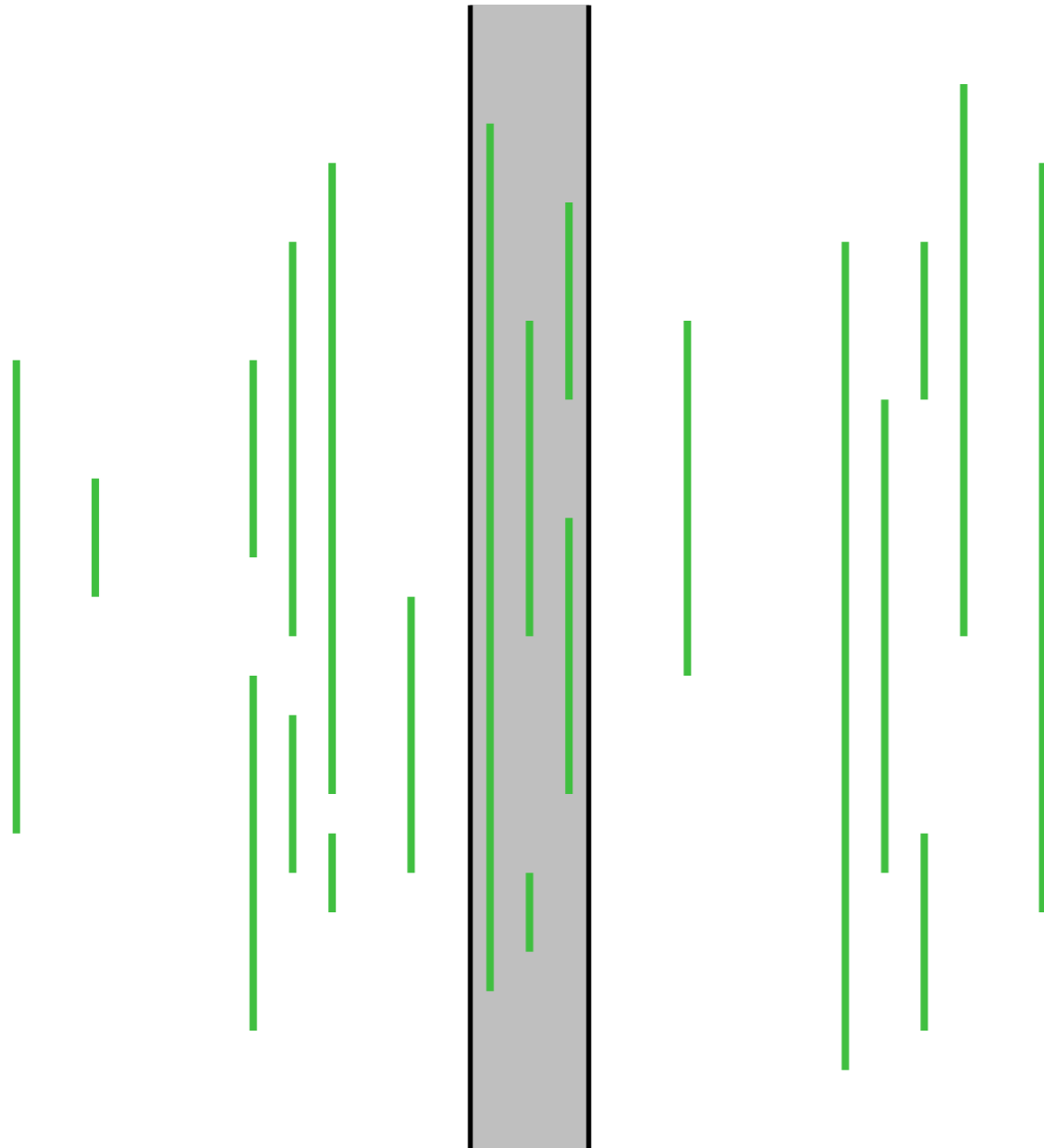
- Given a set \mathcal{L} of line segments
- Divide them into strips of width $O(\epsilon)$
- Take the two topmost and bottommost segments in each strip
- The result is a core-set \mathcal{L}'
- This takes $O(n)$ time

Vertical Line Segments



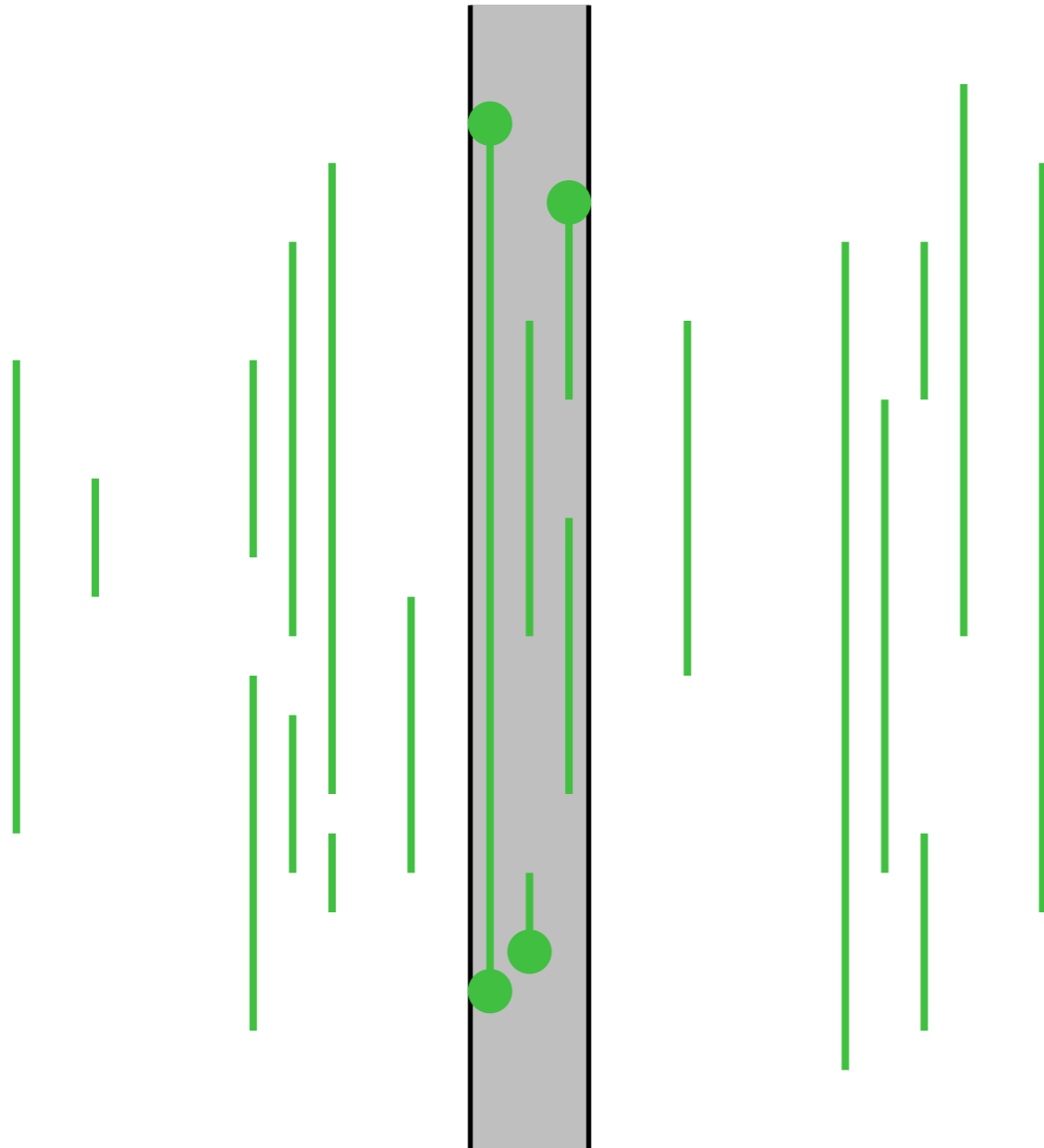
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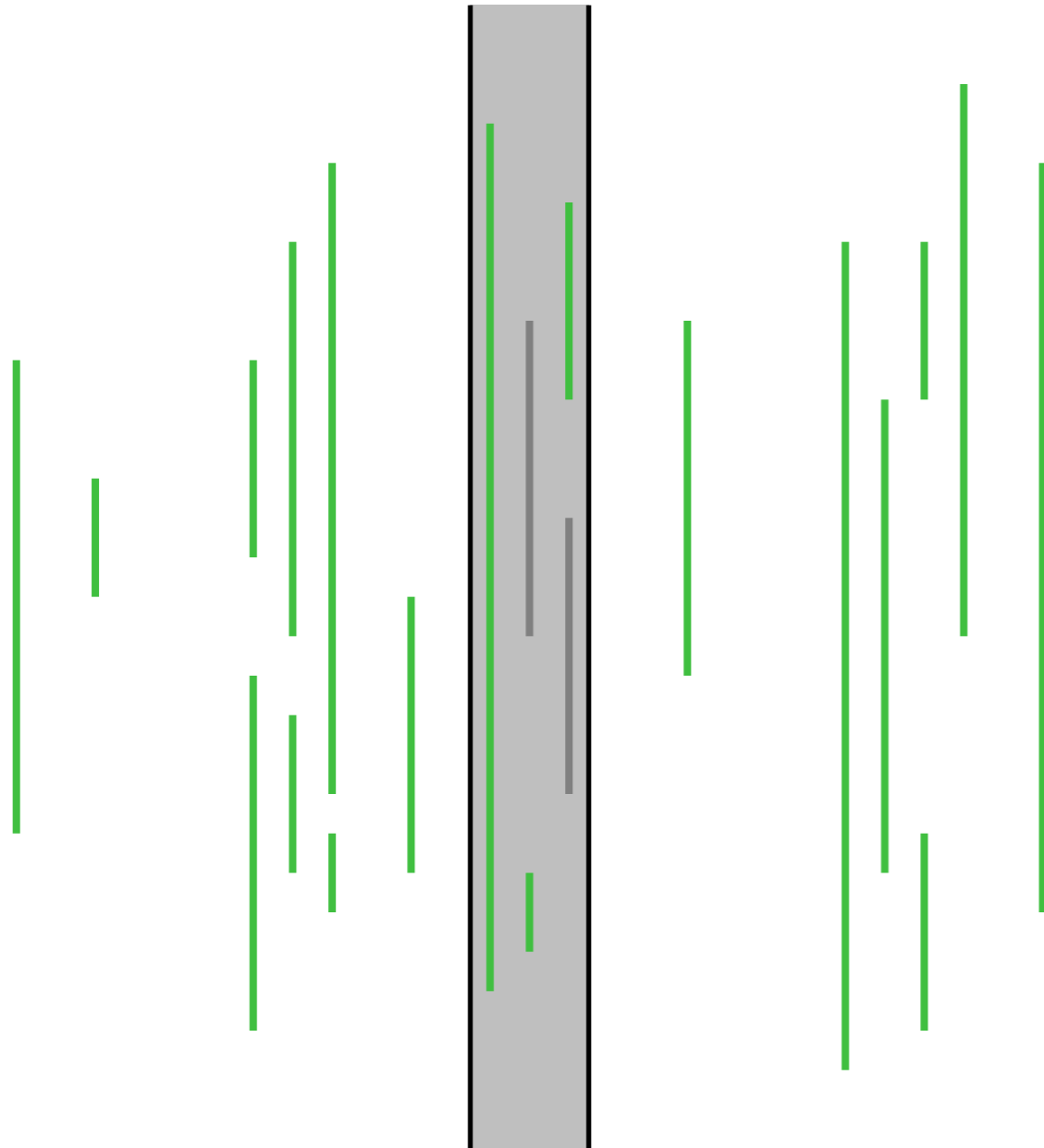
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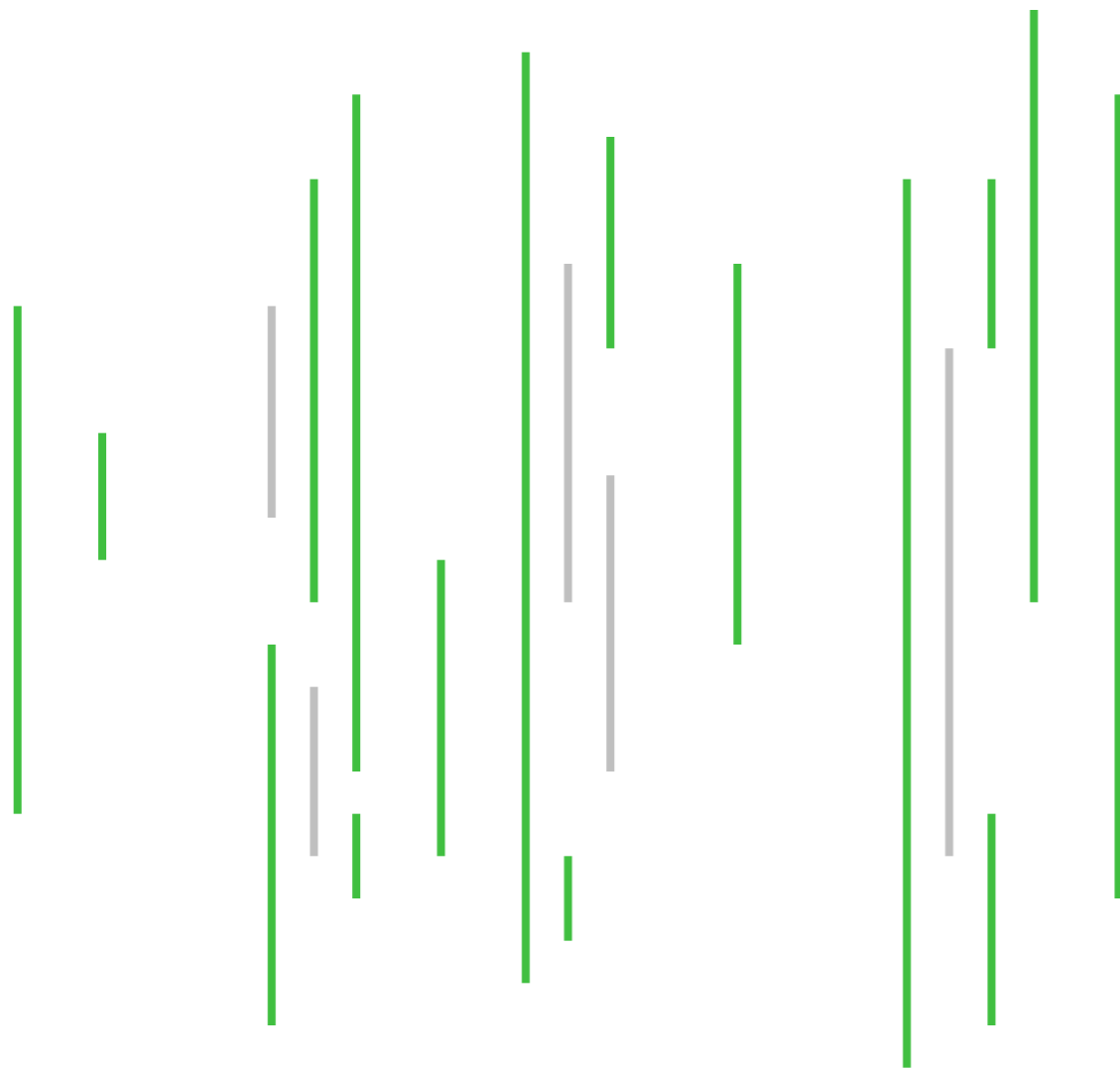
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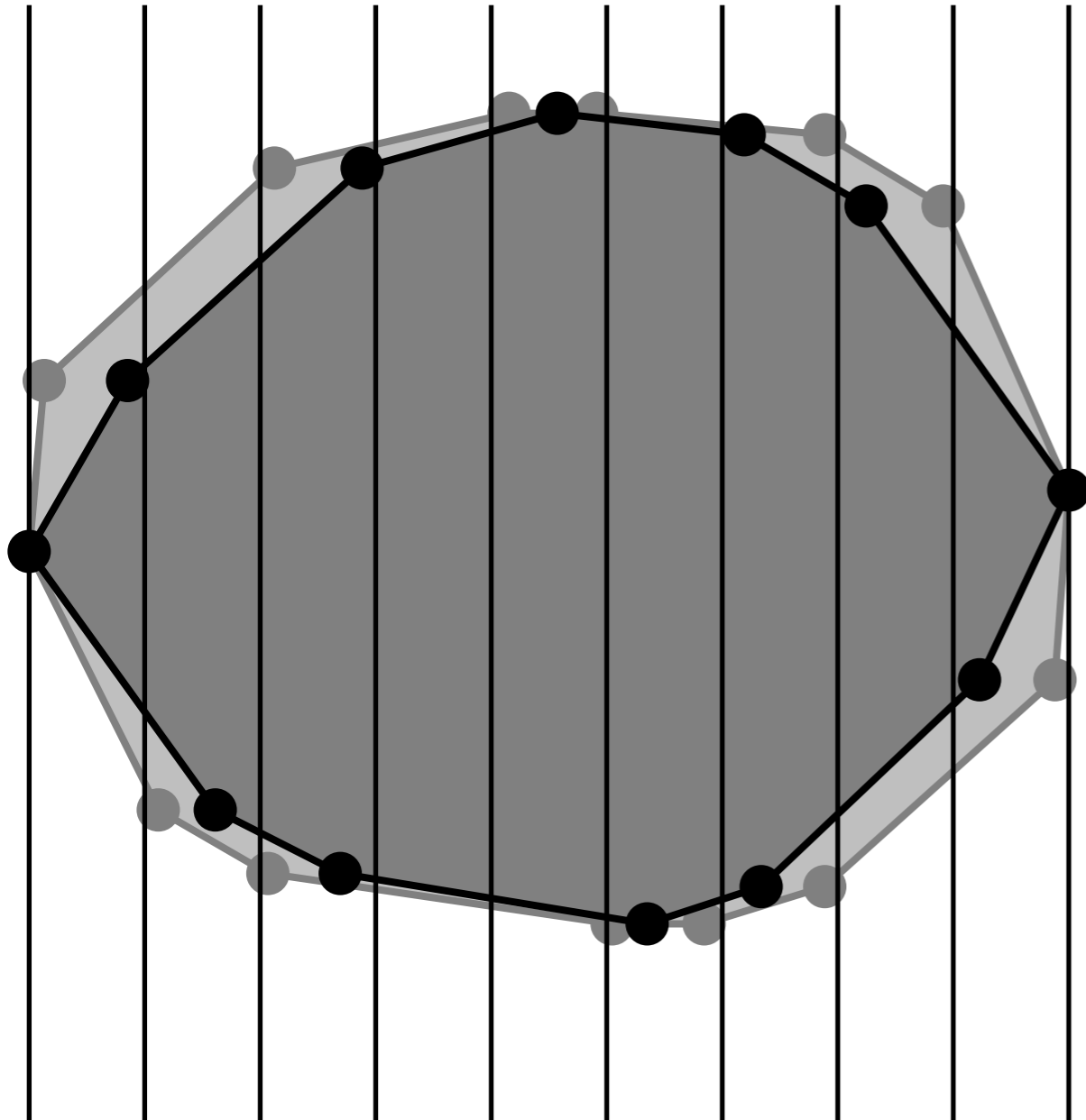
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Why Is This A Core-Set?



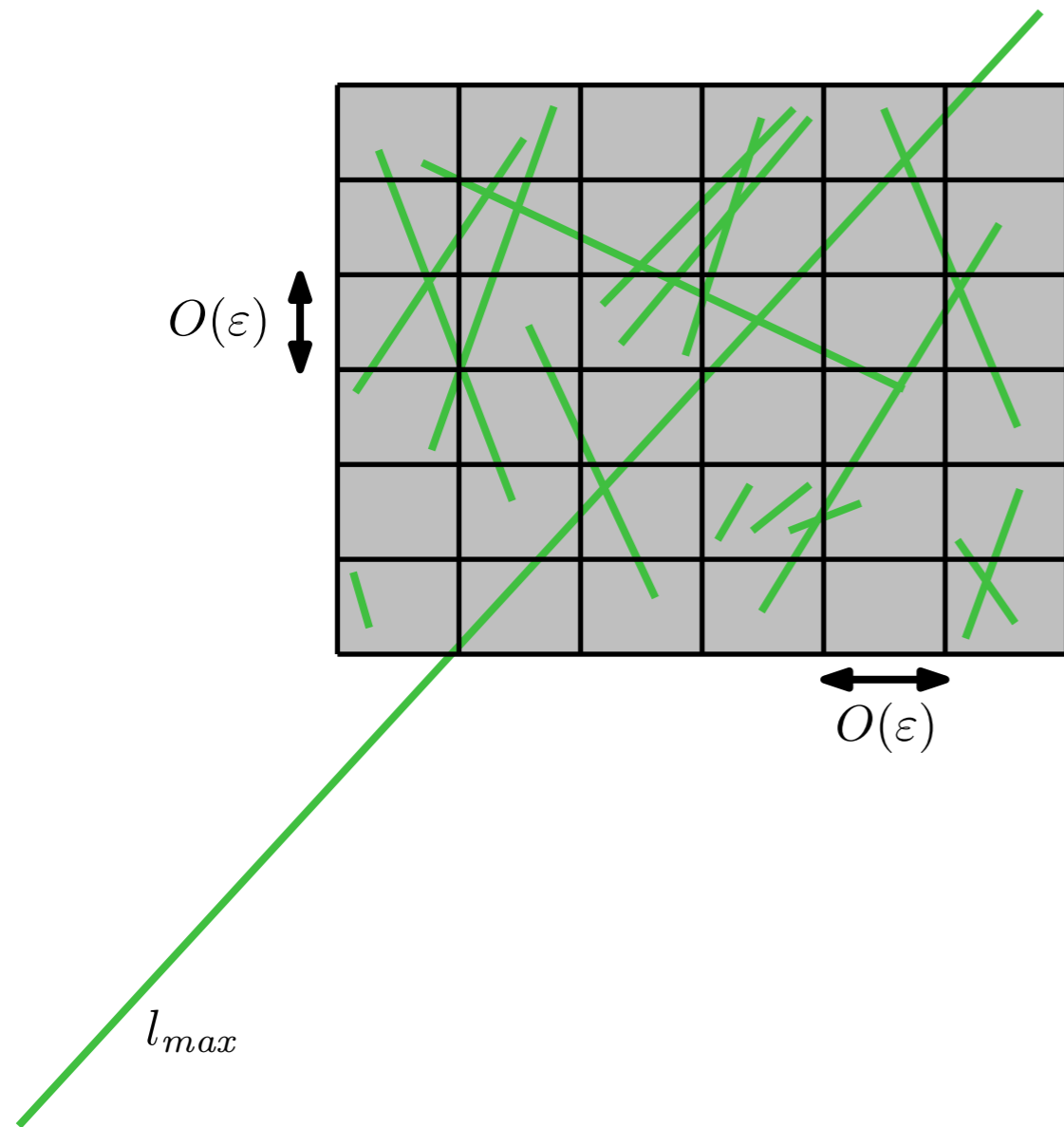
- It has constant size:
 - $O(\eta)$ strips
 - At most four segments per strip
- It approximates the optimal solution:
 - Vertical difference per strip at most 0
 - Horizontal difference per strip at most $O(\epsilon)$
 - At most $O(\epsilon h)$

Arbitrary Line Segments



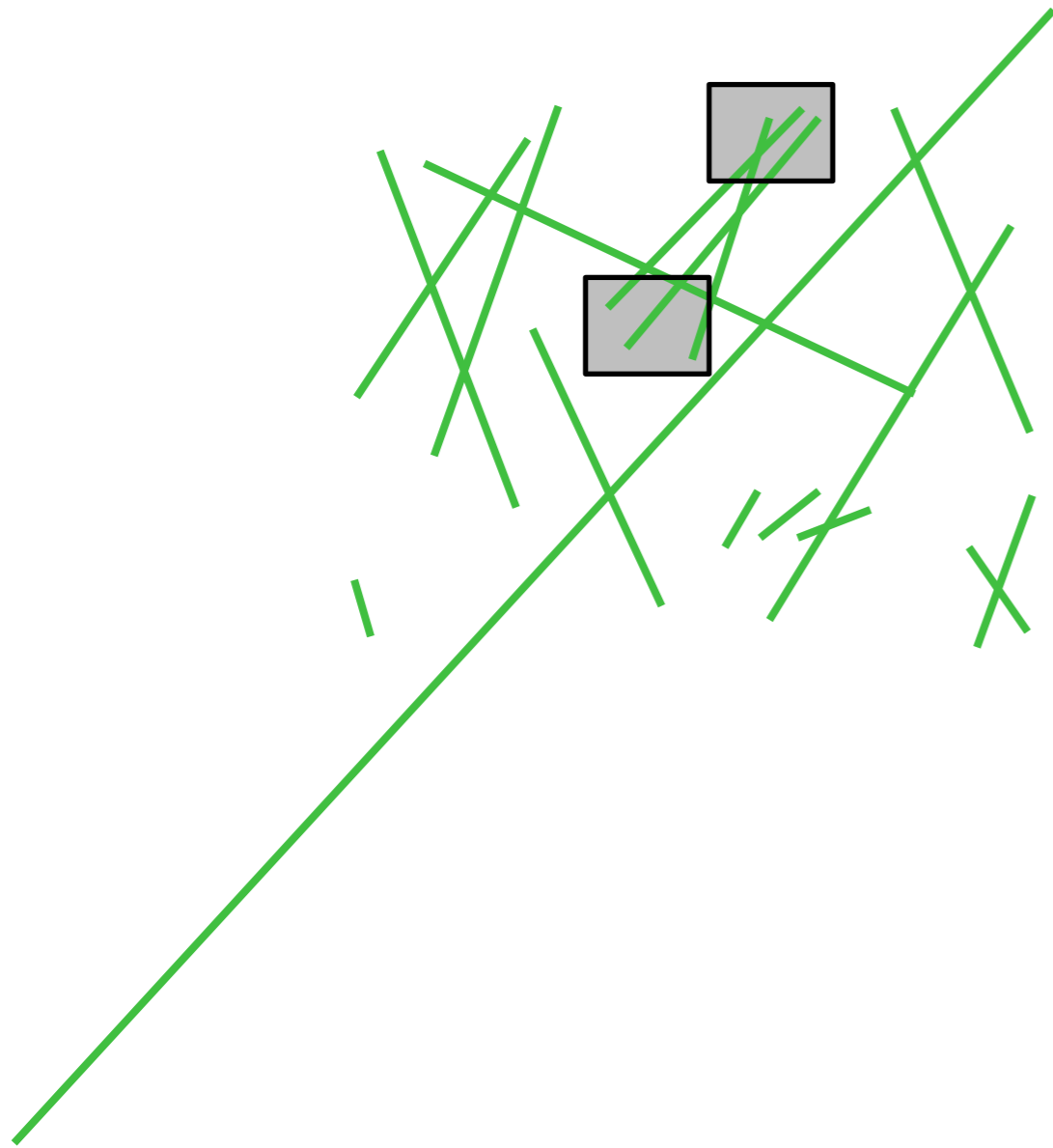
- Given a set \mathcal{L} of line segments
- Put the longest segment l_{max} into \mathcal{L}'
- Divide the remaining segments into cells of size $O(\varepsilon)$ by $O(\varepsilon)$
- For any pair of cells, put at most one segment into \mathcal{L}'

Arbitrary Line Segments



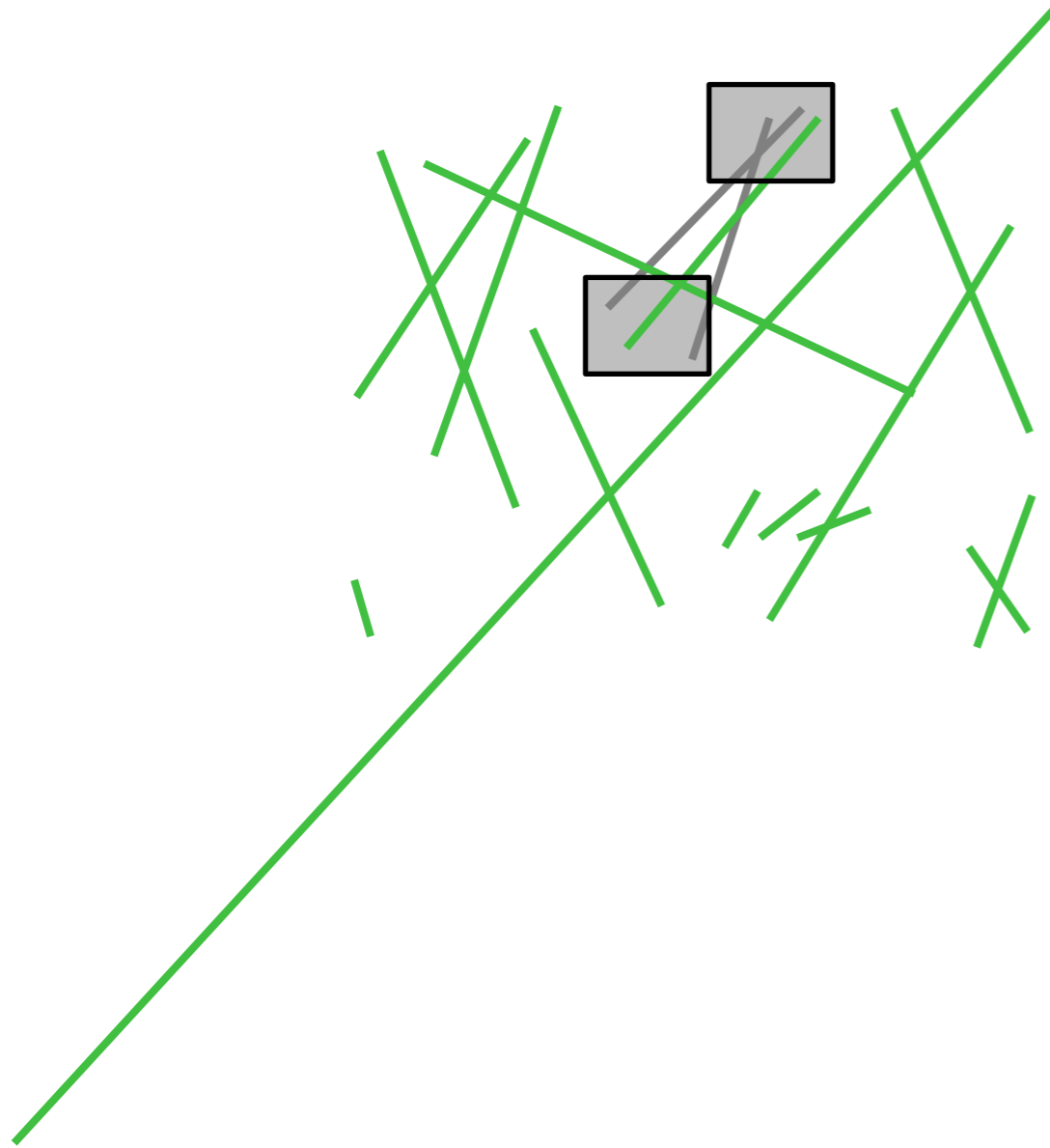
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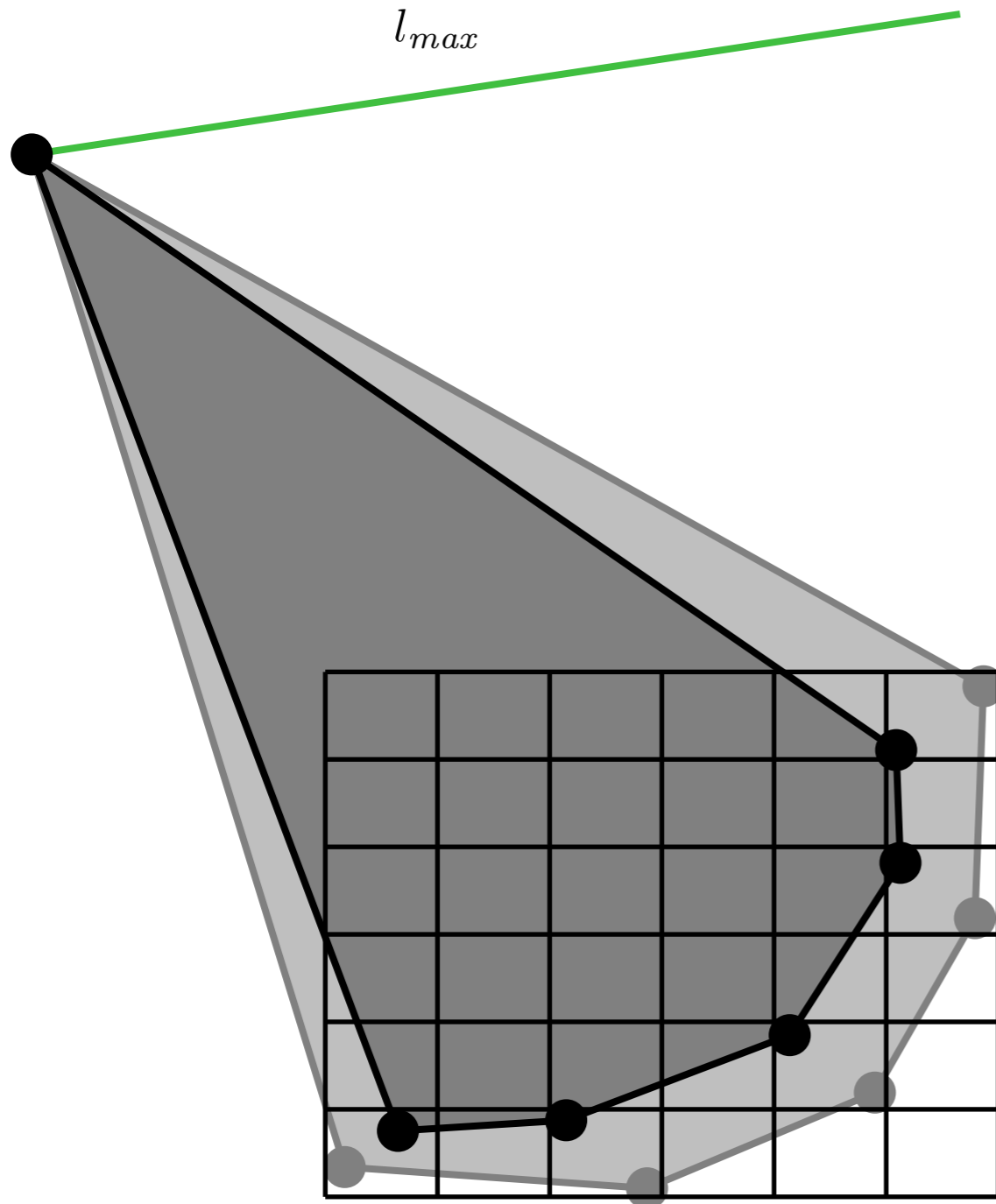
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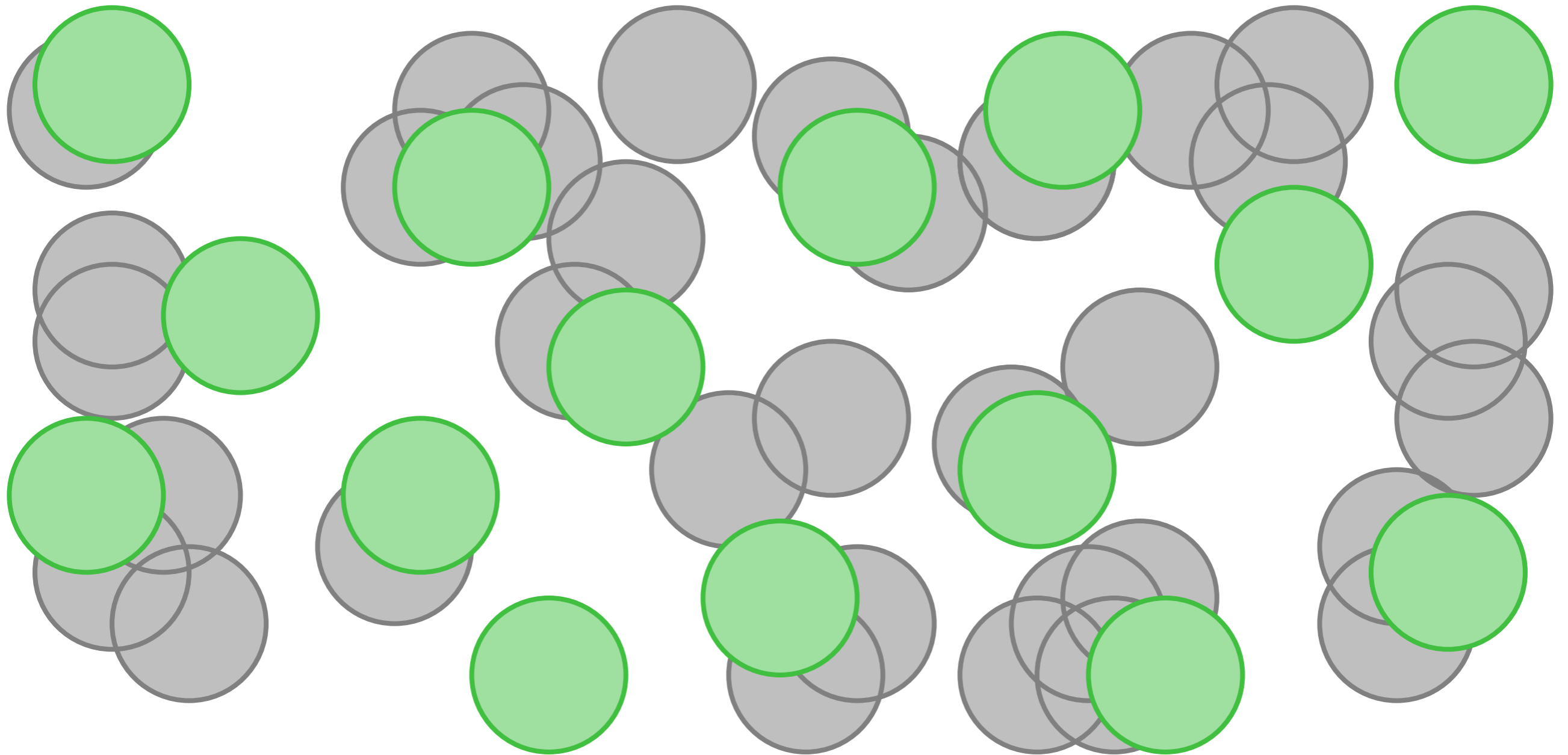
Why Is This A Core-Set?



- It has constant size:
 - $O(\eta^2)$ cells
 - At most one segment for any two cells
- It approximates the optimal solution:
 - Vertical difference per strip at most $O(\varepsilon)$
 - Horizontal difference per strip at most $O(\varepsilon)$

Concluding Remarks

- Data imprecision is a problem in computational geometry
- The largest possible area convex hull cannot be computed exactly efficiently
- Imprecise core-sets yield strongly linear time approximation schemes



Questions?