#### The Rectilinear Marco Polo Problem

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CCCG, 2025



- Point of Interest (POI) X
- X within distance n from origin

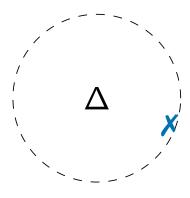


Figure 1: A search area in  $L_2$ .

- Point of Interest (POI) X
- X within distance n from origin
- Probes with radius d, p(x, y, d)

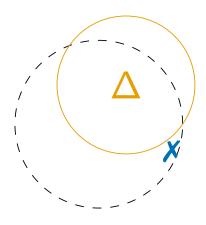


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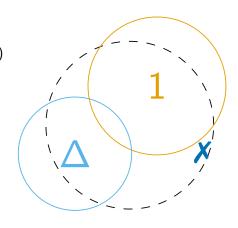


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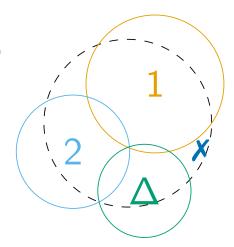


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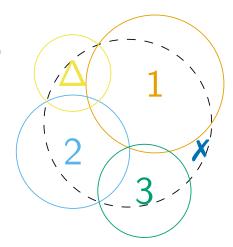


Figure 1: A search area in  $L_2$ .

- Point of Interest (POI) X
- X within distance n from origin
- Probes with radius d, p(x, y, d)
- Probe until 'finding' ✗... √
- ullet 'finding': distance  $\Delta \leftrightarrow {\it X} \le 1$

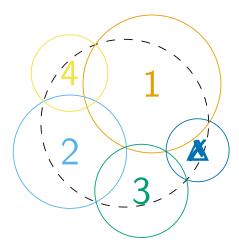


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- Δ must know this!

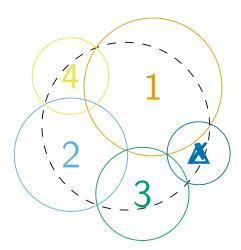


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  - # of POIs present (k)

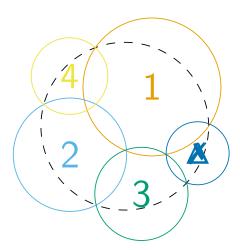


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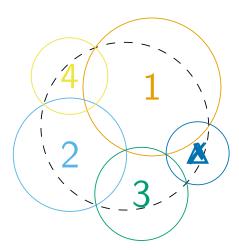


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  - Distance metrics  $(L_1, L_{\infty})$

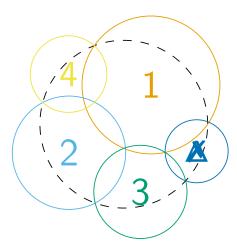


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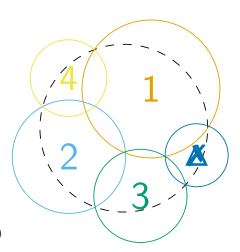


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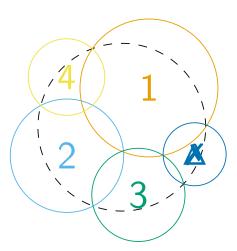


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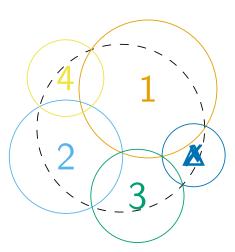


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  - multiple ∆, etc...

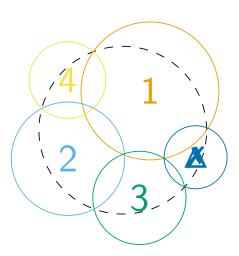


Figure 1: A search area in  $L_2$ .

- Variants:
  - $\checkmark$  # of POIs present (k)
  - find all POIs
  - $\square$  Distance metrics  $(L_1, L_{\infty})$
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  - $\square$  Probe response (T/F, d, i)
  - $\square$   $\Delta$ 's memory if any
  - $\square$  multiple  $\triangle$ , etc...
- Effectiveness metrics:

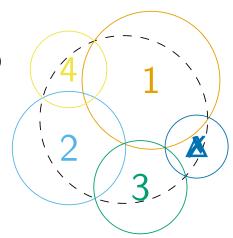


Figure 2: A search area in  $L_2$ .

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  - $\square$   $\Delta$ 's memory if any
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- Effectiveness metrics:
  - $\square$  # of probes, P(n)

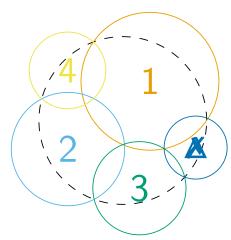


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  - $\square$  Distance traveled by  $\triangle$ , D(n)

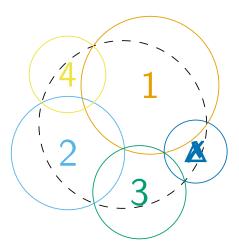


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  - $\checkmark$  # of POI responses, R(n)

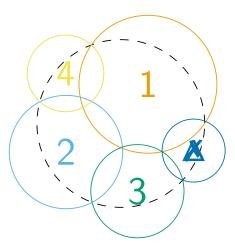


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  - $\checkmark$  # of POI responses, R(n)
  - Input sensitivity?

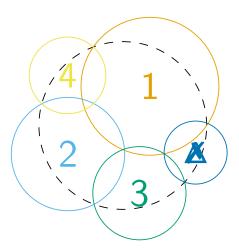


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      - ✓ TSP tour length, OPT

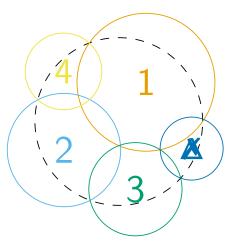


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      - $\square$  Dist. to nearest POI,  $\delta_{\min}$

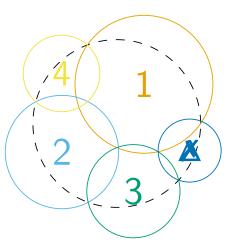


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Simplicity / practicality

 $\square$  Dist. to nearest POI,  $\delta_{\min}$ 

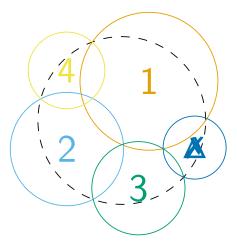


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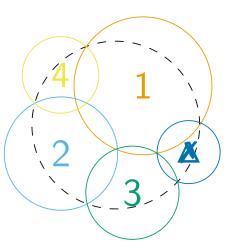


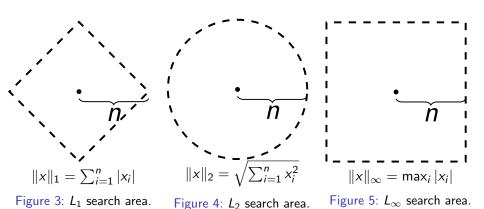
Figure 2: A search area in  $L_2$ .

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Simplicity / practicality

## Rectilinear Distances

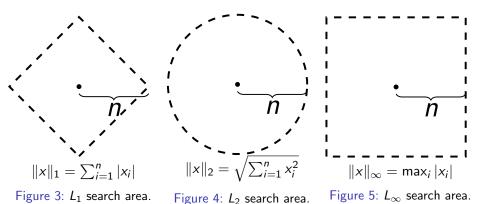
• 1D: All identical



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## Rectilinear Distances

- 1D: All identical
- 2D:  $L_1$  and  $L_{\infty}$  geometrically similar



## Rectilinear Distances

- 1D: All identical
- 2D:  $L_1$  and  $L_{\infty}$  geometrically similar
- $\geq 3D$ : All different

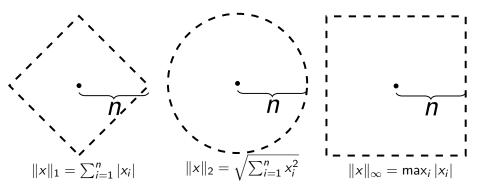


Figure 3:  $L_1$  search area.

Figure 4:  $L_2$  search area.

Figure 5:  $L_{\infty}$  search area.

• Consider a  $2 \times 2$  lattice

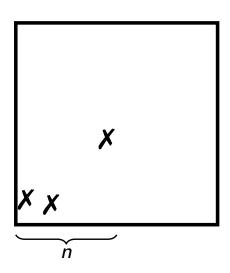


Figure 6: Quadrant Search

- Consider a  $2 \times 2$  lattice
- Probe each quadrant.

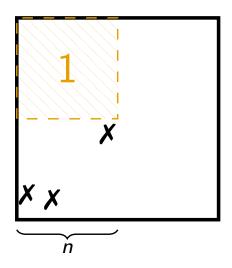


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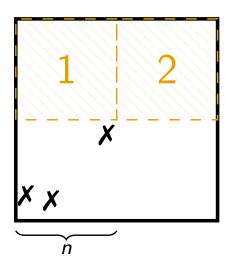


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- Consider a  $2 \times 2$  lattice
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- If 3 fail, POI/s must be in final

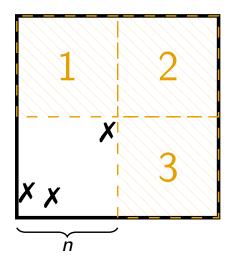


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- Consider a 2 × 2 lattice
- Probe each quadrant...
- If 3 fail, POI/s must be in final
- Continue recursively!

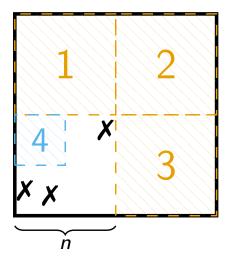


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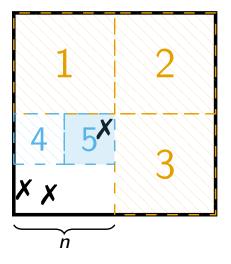


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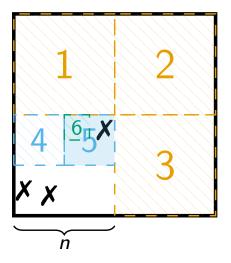


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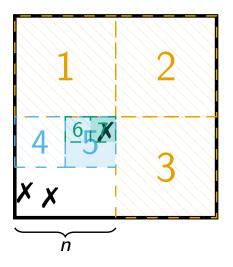


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- Consider a 2 × 2 lattice
- Probe each quadrant...
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- Continue recursively!
- After 3 probes... distance halved!

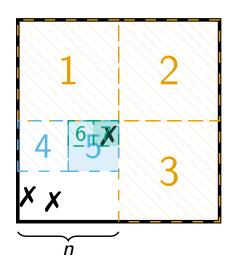


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- Consider a 2 × 2 lattice
- Probe each quadrant...
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- Continue recursively!
- After 3 probes... distance halved!
- $P(n) \leq 3\lceil \log n \rceil$

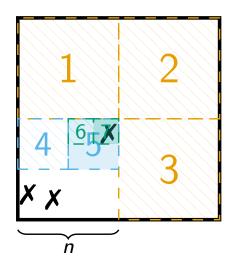


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- Total responses?

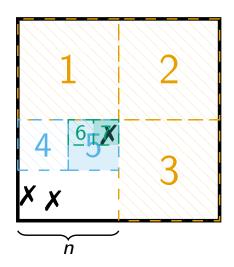


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- Total responses?
- At most one per layer...

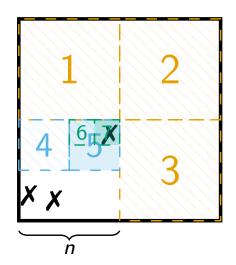


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- Continue recursively!
- After 3 probes... distance halved!
- $P(n) \leq 3\lceil \log n \rceil$
- Total responses?
- At most one per layer...
- $R(n) \leq \lceil \log n \rceil$

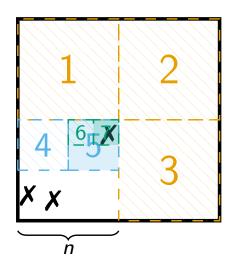


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- Continue recursively!
- After 3 probes... distance halved!
- $P(n) \leq 3\lceil \log n \rceil$
- Total responses?
- At most one per layer...
- $R(n) \leq \lceil \log n \rceil$
- Distance traveled?

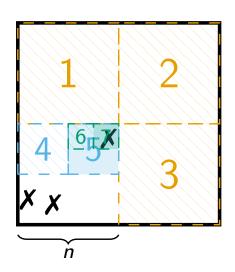


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- Consider a 2 × 2 lattice
- Probe each quadrant...
- If 3 fail, POI/s must be in final
- Continue recursively!
- After 3 probes... distance halved!
- $P(n) \leq 3\lceil \log n \rceil$
- Total responses?
- At most one per layer...
- $R(n) \leq \lceil \log n \rceil$
- Distance traveled?
- $D(n) \leq 6n$

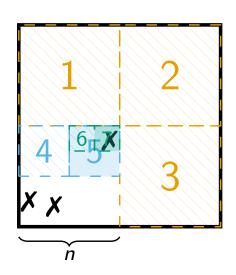


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- Optimal is  $2\lceil \log n \rceil$ !

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- Optimal is  $2\lceil \log n \rceil$ !

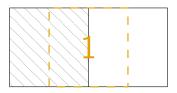
- Quadrant:  $P(n) \le 3\lceil \log n \rceil$  can we do better?
- Optimal is  $2\lceil \log n \rceil$ !
- Consider a  $2n \times n$  '2-domino' configuration



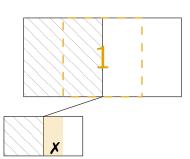
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
- Optimal is  $2\lceil \log n \rceil$ !
- Consider a  $2n \times n$  '2-domino' configuration
- One side known to be empty, other known to contain POI/s



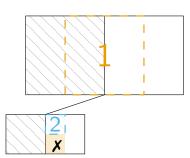
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
- Optimal is  $2\lceil \log n \rceil$ !
- Consider a  $2n \times n$  '2-domino' configuration
- One side known to be empty, other known to contain POI/s
- Probe center



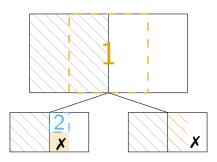
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
- Optimal is  $2\lceil \log n \rceil$ !
- Consider a  $2n \times n$  '2-domino' configuration
- One side known to be empty, other known to contain POI/s
- Probe center
- Probe remaining quadrant
  - If 1st probe succeeded...



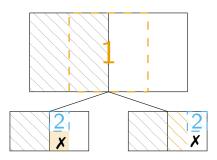
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
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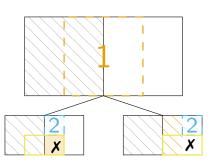
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
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- Probe remaining quadrant
  - If 1st probe succeeded...
  - If 1st probe failed...



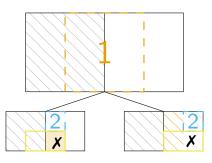
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
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- Probe remaining quadrant
  - If 1st probe succeeded...
  - If 1st probe failed...



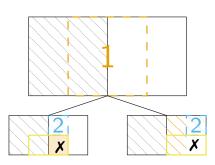
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
- Optimal is  $2\lceil \log n \rceil$ !
- Consider a  $2n \times n$  '2-domino' configuration
- One side known to be empty, other known to contain POI/s
- Probe center
- Probe remaining quadrant
  - If 1st probe succeeded...
  - If 1st probe failed...
  - Either way...  $n \times n/2$  'domino'



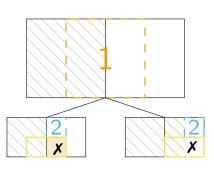
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
- Optimal is  $2\lceil \log n \rceil$ !
- Consider a  $2n \times n$  '2-domino' configuration
- One side known to be empty, other known to contain POI/s
- Probe center
- Probe remaining quadrant
  - If 1st probe succeeded...
  - If 1st probe failed...
  - Either way...  $n \times n/2$  'domino'
  - ullet Two probes o halve dimensions



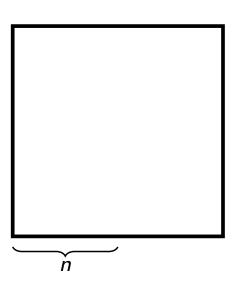
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
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- One side known to be empty, other known to contain POI/s
- Probe center
- Probe remaining quadrant
  - If 1st probe succeeded...
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  - Either way...  $n \times n/2$  'domino'
- ullet Two probes o halve dimensions
- $P(n) = 2\lceil \log n \rceil$



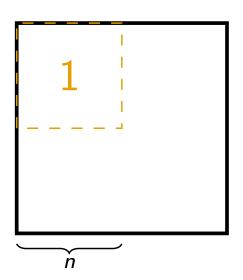
- Quadrant:  $P(n) \leq 3\lceil \log n \rceil$  can we do better?
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- Either way...  $n \times n/2$  'domino'
- ullet Two probes o halve dimensions
- $P(n) = 2\lceil \log n \rceil$
- How to reach domino?



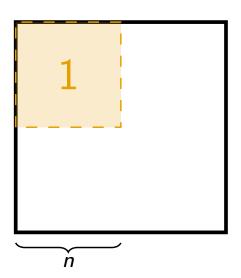
• How to reach domino?



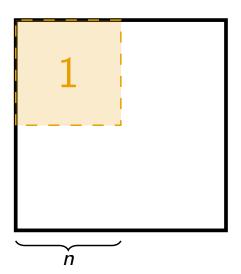
- How to reach domino?
- Start quadrant search...



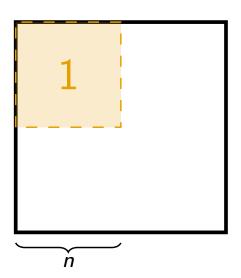
- How to reach domino?
- Start quadrant search...
- If first probe succeeds...



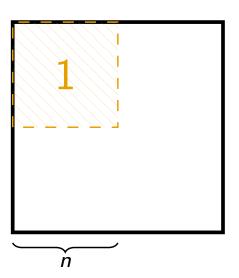
- How to reach domino?
- Start quadrant search...
- If first probe succeeds...
- Reduce area by factor of 4!



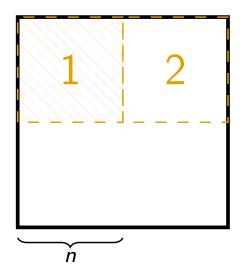
- How to reach domino?
- Start quadrant search...
- If first probe succeeds...
- Reduce area by factor of 4!
- Just recurse and ②



- How to reach domino?
- Start quadrant search...
- If first probe succeeds...
- Reduce area by factor of 4!
- Just recurse and <sup>©</sup>
- If first probe fails...

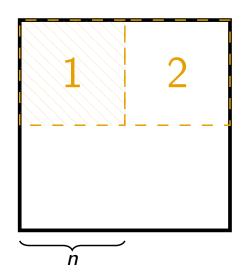


- How to reach domino?
- Start quadrant search...
- If first probe succeeds...
- Reduce area by factor of 4!
- Just recurse and <sup>©</sup>
- If first probe fails...
- 2-domino guaranteed!

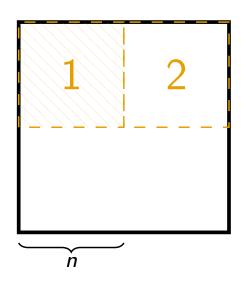


CCCG, 2025

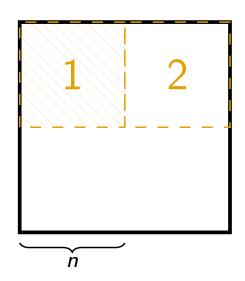
- How to reach domino?
- Start quadrant search...
- If first probe succeeds...
- Reduce area by factor of 4!
- Just recurse and ©
- If first probe fails...
- 2-domino guaranteed!
- $P(n) \leq 2\lceil \log n \rceil + 1$



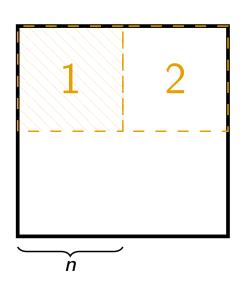
- How to reach domino?
- Start quadrant search...
- If first probe succeeds...
- Reduce area by factor of 4!
- Just recurse and ©
- If first probe fails...
- 2-domino guaranteed!
- $P(n) \leq 2\lceil \log n \rceil + 1 \checkmark$



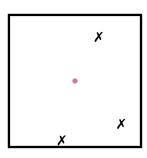
- How to reach domino?
- Start quadrant search...
- If first probe succeeds...
- Reduce area by factor of 4!
- Just recurse and <sup>(2)</sup>
- If first probe fails...
- 2-domino guaranteed!
- $P(n) \leq \frac{2}{\log n} + 1 \checkmark$
- $P(n) = \frac{2}{\log n} 1$



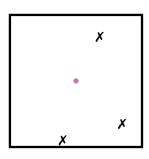
- How to reach domino?
- Start quadrant search...
- If first probe succeeds...
- Reduce area by factor of 4!
- Just recurse and <sup>②</sup>
- If first probe fails...
- 2-domino guaranteed!
- $P(n) \leq \frac{2}{\log n} + 1 \checkmark$
- $R(n) = 2\lceil \log n \rceil 1$
- D(n) < 6n



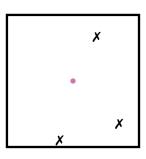
• Recall:  $D(n) \in \mathcal{O}(n)$ 



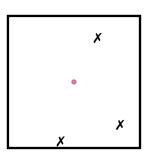
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby?



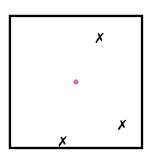
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$



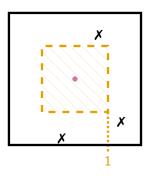
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$
- Nearest POI at distance  $\delta_{\min}$



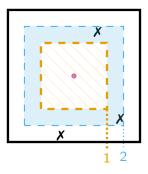
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$
- Nearest POI at distance  $\delta_{\min}$
- Can we do  $\mathcal{O}(\delta_{\min})$ ?



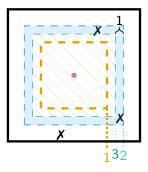
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$
- Nearest POI at distance  $\delta_{\min}$
- Can we do  $\mathcal{O}(\delta_{\min})$ ?
- Perform binary search.



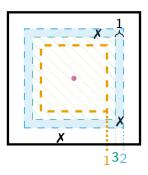
- Recall:  $D(n) \in \mathcal{O}(n)$
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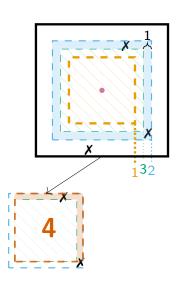
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$
- Nearest POI at distance  $\delta_{\min}$
- Can we do  $\mathcal{O}(\delta_{\min})$ ?
- Perform binary search...
- Stop when width-1 shell\*



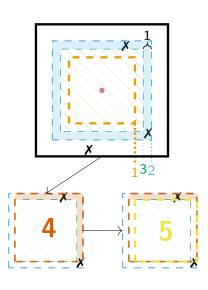
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$
- Nearest POI at distance  $\delta_{\min}$
- Can we do  $\mathcal{O}(\delta_{\min})$ ?
- Perform binary search...
- Stop when width-1 shell\*
- $\lceil \log n \rceil$  probes, 0 distance



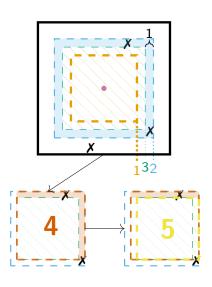
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$
- Nearest POI at distance  $\delta_{\min}$
- Can we do  $\mathcal{O}(\delta_{\min})$ ?
- Perform binary search...
- Stop when width-1 shell\*
- $\lceil \log n \rceil$  probes, 0 distance
- Determine edge containing POI.



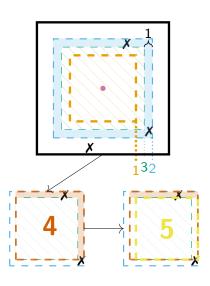
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$
- Nearest POI at distance  $\delta_{\min}$
- Can we do  $\mathcal{O}(\delta_{\min})$ ?
- Perform binary search...
- Stop when width-1 shell\*
- $\lceil \log n \rceil$  probes, 0 distance
- Determine edge containing POI...
- 2 probes



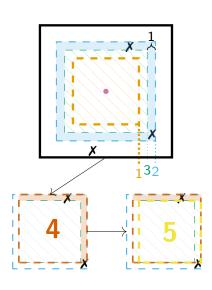
- Recall:  $D(n) \in \mathcal{O}(n)$
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- Can we do  $\mathcal{O}(\delta_{\min})$ ?
- Perform binary search...
- Stop when width-1 shell\*
- $\lceil \log n \rceil$  probes, 0 distance
- Determine edge containing POI..
- 2 probes near origin!



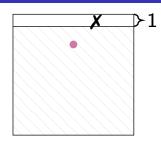
- Recall:  $D(n) \in \mathcal{O}(n)$
- If POI is nearby? still  $\mathcal{O}(n)$
- Nearest POI at distance  $\delta_{\min}$
- Can we do  $\mathcal{O}(\delta_{\min})$ ?
- Perform binary search...
- Stop when width-1 shell\*
- $\lceil \log n \rceil$  probes, 0 distance
- Determine edge containing POI...
- 2 probes near origin!
- $\mathcal{O}(1)$  distance



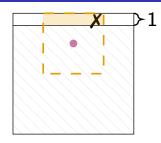
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- Perform binary search...
- Stop when width-1 shell\*
- $\lceil \log n \rceil$  probes, 0 distance
- Determine edge containing POI...
- 2 probes near origin!
- $\mathcal{O}(1)$  distance
- What now?



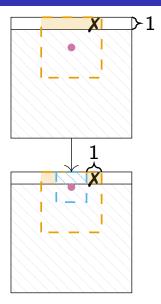
• What now?



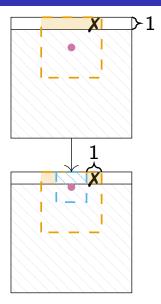
- What now?
- Another binary search!



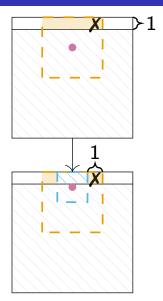
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes



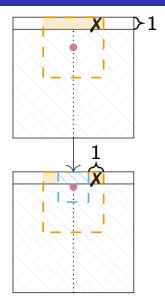
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance?



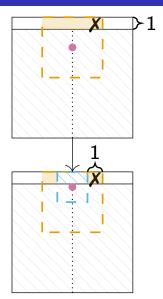
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!



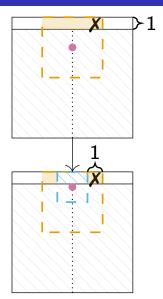
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!
- Always moves along axis...



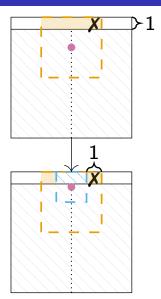
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$



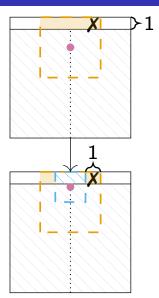
- What now?
- Another binary search!
- At most [log n] probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\min}/4$



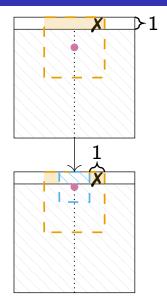
- What now?
- Another binary search!
- At most [log n] probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\min}/4 \rightarrow \Sigma... \leq \delta_{\min}$



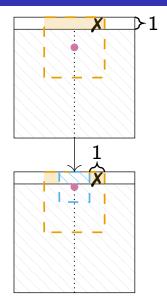
- What now?
- Another binary search!
- At most [log n] probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\mathsf{min}}/4 \to \Sigma ... \leq \delta_{\mathsf{min}}$
- 2 remaining  $1 \times 1$  regions



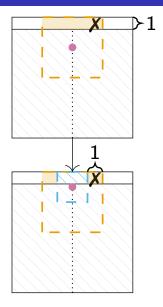
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\mathsf{min}}/4 \to \Sigma ... \leq \delta_{\mathsf{min}}$
- ullet 2 remaining  $1 \times 1$  regions
- 1 more probe,  $\mathcal{O}(1)$  distance



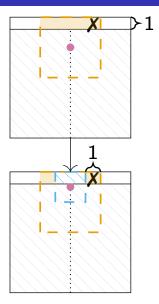
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\min}/4 \rightarrow \Sigma... \leq \delta_{\min}$
- ullet 2 remaining  $1 \times 1$  regions
- 1 more probe,  $\mathcal{O}(1)$  distance
- $\leq \delta_{\min}$  distance to reach POI...



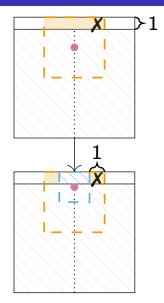
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\mathsf{min}}/4 \to \Sigma ... \leq \delta_{\mathsf{min}}$
- ullet 2 remaining  $1 \times 1$  regions
- 1 more probe,  $\mathcal{O}(1)$  distance
- $\leq \delta_{\min}$  distance to reach POI...
- $D(n) \leq \frac{2\delta_{\min}}{2\delta_{\min}} + \mathcal{O}(1)$



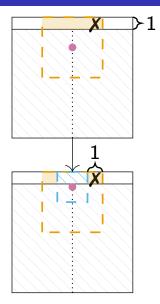
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\mathsf{min}}/4 \to \Sigma ... \leq \delta_{\mathsf{min}}$
- ullet 2 remaining  $1 \times 1$  regions
- 1 more probe,  $\mathcal{O}(1)$  distance
- $\leq \delta_{\min}$  distance to reach POI...
- $D(n) \leq 2\delta_{\min} + \mathcal{O}(1)$   $\checkmark$



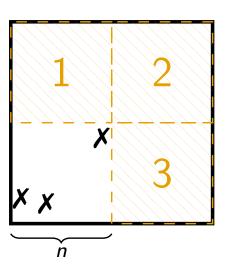
- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\mathsf{min}}/4 \to \Sigma ... \leq \delta_{\mathsf{min}}$
- ullet 2 remaining  $1 \times 1$  regions
- 1 more probe,  $\mathcal{O}(1)$  distance
- $\leq \delta_{\min}$  distance to reach POI...
- $D(n) \leq \frac{2\delta_{\min}}{2\delta_{\min}} + \mathcal{O}(1)$
- $P(n) \leq 2\lceil \log n \rceil + 1$



- What now?
- Another binary search!
- At most  $\lceil \log n \rceil$  probes
- Distance? not stationary!
- Always moves along axis...
- First probe,  $\leq \delta_{\min}/2$
- Second,  $\leq \delta_{\mathsf{min}}/4 \to \Sigma ... \leq \delta_{\mathsf{min}}$
- ullet 2 remaining  $1 \times 1$  regions
- 1 more probe,  $\mathcal{O}(1)$  distance
- $\leq \delta_{min}$  distance to reach POI...
- $D(n) \leq 2\delta_{\min} + \mathcal{O}(1)$
- $P(n) \leq 2\lceil \log n \rceil + 1 \checkmark$

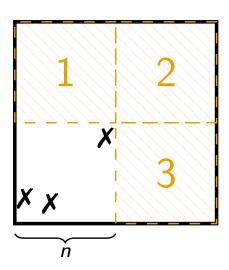


• Is 2D the limit?

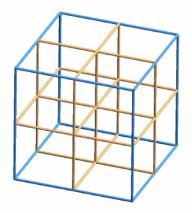


• Is 2D the limit?

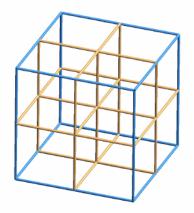
• Recall: Quadrant algorithm



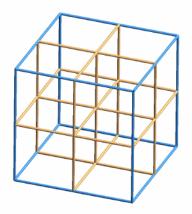
- Is 2D the limit?
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- Octant algorithm?



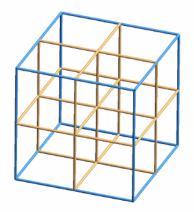
- Is 2D the limit?
- Recall: Quadrant algorithm
- Octant algorithm?
- $P(n) \leq \frac{7}{\log n}$



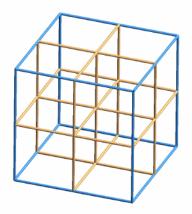
- Is 2D the limit?
- Recall: Quadrant algorithm
- Octant algorithm?
- $P(n) \leq 7 \lceil \log n \rceil$
- # responses?



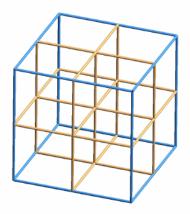
- Is 2D the limit?
- Recall: Quadrant algorithm
- Octant algorithm?
- $P(n) \leq 7 \lceil \log n \rceil$
- # responses? still [log n]!



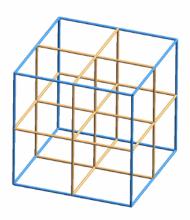
- Is 2D the limit?
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- $P(n) \leq 7 \lceil \log n \rceil$
- # responses? still [log n]!
- Further?



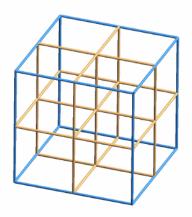
- Is 2D the limit?
- Recall: Quadrant algorithm
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- $P(n) \leq 7 \lceil \log n \rceil$
- # responses? still [log n]!
- Further?
- kD hypercube  $\rightarrow 2^k$  'orthants'



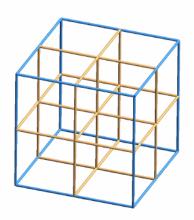
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- $P(n) \leq (2^k 1) \lceil \log n \rceil$



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- Terrible distance  $> 2^k n$

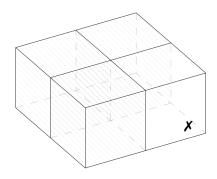


- Is 2D the limit?
- Recall: Quadrant algorithm
- Octant algorithm?
- $P(n) \leq 7 \lceil \log n \rceil$
- # responses? still [log n]!
- Further?
- kD hypercube  $\rightarrow 2^k$  'orthants'
- Orthant algorithm
- $P(n) \leq (2^k 1) \lceil \log n \rceil$
- Terrible distance  $> 2^k n$
- Excellent responses,  $\leq \lceil \log n \rceil$

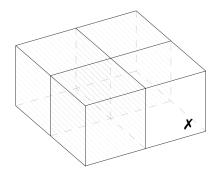


• How about 3D domino?

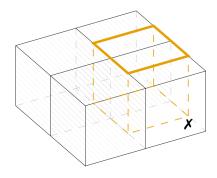
- How about 3D domino?
- Consider  $2n \times 2n \times n$  '4-domino'



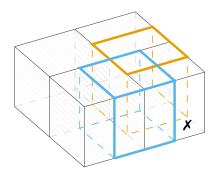
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- 3 empty, 1 contains POI/s



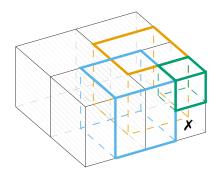
- How about 3D domino?
- Consider  $2n \times 2n \times n$  '4-domino'
- 3 empty, 1 contains POI/s
- After 3 probes.



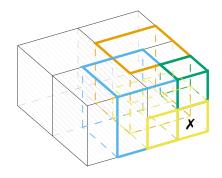
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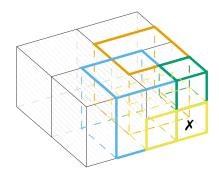
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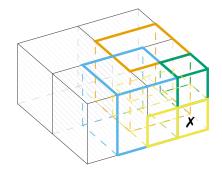
- How about 3D domino?
- Consider  $2n \times 2n \times n$  '4-domino'
- 3 empty, 1 contains POI/s
- After 3 probes...
- 1/8 volume



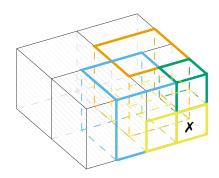
- How about 3D domino?
- Consider  $2n \times 2n \times n$  '4-domino'
- 3 empty, 1 contains POI/s
- After 3 probes...
- 1/8 volume
- Probes halve volume



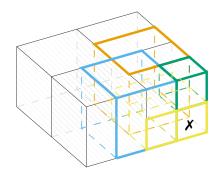
- How about 3D domino?
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- After 3 probes...
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- Probes halve volume optimal



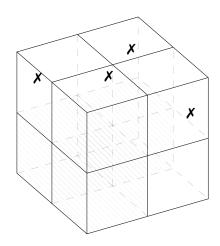
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- Probes halve volume optimal
- $P(n) = 3\lceil \log n \rceil$



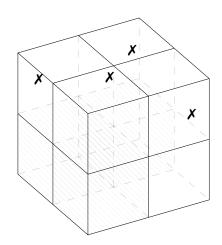
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- Probes halve volume optimal
- $P(n) = 3\lceil \log n \rceil$
- How to reach 4-domino?



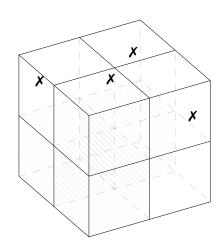
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- 1/8 volume
- Probes halve volume optimal
- $P(n) = 3\lceil \log n \rceil$
- How to reach 4-domino?
- May take more than 4 probes...



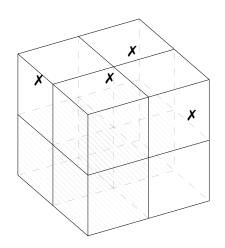
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- How to reach 4-domino?
- May take more than 4 probes. . .
- If 4th probe always succeeds. . .



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- $P(n) = 3\lceil \log n \rceil$
- How to reach 4-domino?
- May take more than 4 probes. . .
- If 4th probe always succeeds. . .
- $P(n) \leq 4\lceil \log n \rceil$



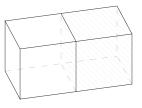
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- Probes halve volume optimal
- $P(n) = 3\lceil \log n \rceil$
- How to reach 4-domino?
- May take more than 4 probes. . .
- If 4th probe always succeeds...
- $P(n) \leq 4\lceil \log n \rceil$  not optimal!



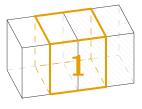
• Idea: Intermediate configuration

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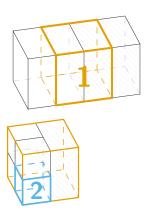
• 3D 2-domino:  $2n \times n \times n$ 



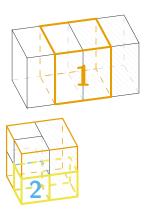
- Idea: Intermediate configuration
- 3D 2-domino:  $2n \times n \times n$
- Probe center



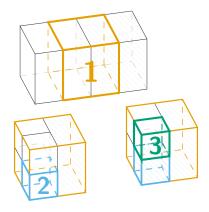
- Idea: Intermediate configuration
- 3D 2-domino:  $2n \times n \times n$
- Probe center
- Probe remaining 'quadrant'



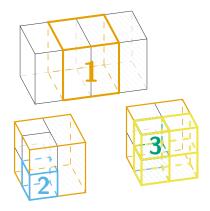
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  - If success...2-domino!



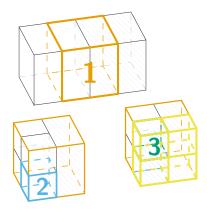
- Idea: Intermediate configuration
- 3D 2-domino:  $2n \times n \times n$
- Probe center
- Probe remaining 'quadrant'
  - If success...2-domino!
  - **1** Otherwise, more probes...



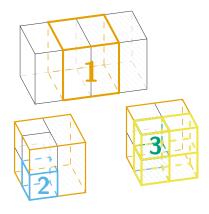
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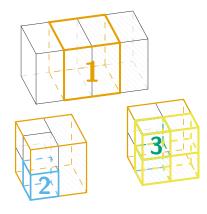
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  - Octants → 2-domino → 4-domino



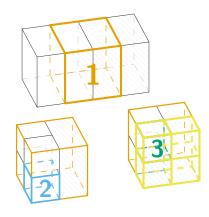
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- $P(n) \leq 3\lceil \log n \rceil + 4$



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- Great but...

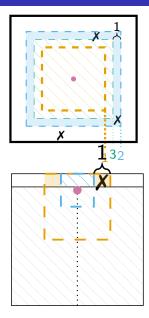


- Idea: Intermediate configuration
- 3D 2-domino:  $2n \times n \times n$
- Probe center
- Probe remaining 'quadrant'
  - If success...2-domino!
  - Otherwise, more probes... but 4-domino guaranteed!
  - Octants  $\rightarrow$  2-domino  $\rightarrow$  4-domino
- $P(n) \leq 3\lceil \log n \rceil + 4$
- Great but...
- Doesn't generalize further 🕃

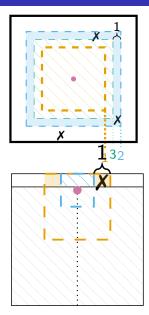


Good general algorithm?

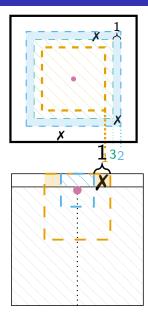
- Good general algorithm?
- Recall CBS—



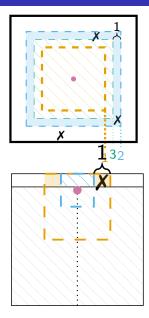
- Good general algorithm?
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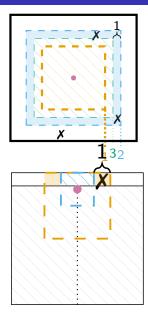
- Good general algorithm?
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- Binary search per dimension...
- Generalize to kD?



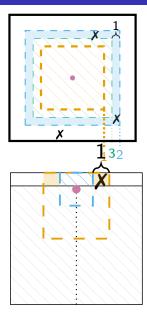
- Good general algorithm?
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- Generalize to kD? yes!



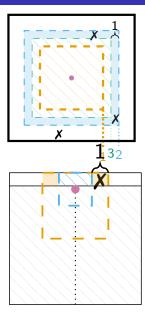
- Good general algorithm?
- Recall CBS—
- Binary search per dimension...
- Generalize to kD? yes!
- Generalized CBS
- $P(n) \leq \frac{k}{\log n} + g(k)$



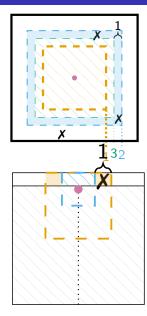
- Good general algorithm?
- Recall CBS—
- Binary search per dimension...
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- Generalized CBS
- $P(n) \leq k \lceil \log n \rceil + g(k)$
- $D(n) \leq k\delta_{\min} + g(k)$



- Good general algorithm?
- Recall CBS—
- Binary search per dimension...
- Generalize to kD? yes!
- Generalized CBS
- $P(n) \leq k \lceil \log n \rceil + g(k)$
- $D(n) \leq k\delta_{\min} + g(k)$
- How?



- Good general algorithm?
- Recall CBS—
- Binary search per dimension...
- Generalize to kD? yes!
- Generalized CBS
- $P(n) \leq k \lceil \log n \rceil + g(k)$
- $D(n) \leq k\delta_{\min} + g(k)$
- How?
- Read the full paper :P



# Rectilinear Strategies: Comparing # Probes

	C	Orthant	Algorit	hm	Ger	neralize	d CBS /	Algorithm
k	$\sigma$	Avg	Max	Bound	$\sigma$	Avg	Max	Bound
1D	0.00	0.95	0.95	1.00	0.00	0.95	1.00	1.00
2D	0.18	2.14	2.85	3.00	0.03	1.93	2.00	2.15/2.25
3D	0.46	4.16	6.35	7.00	0.07	2.96	3.10	3.40/4.10
4D	0.98	8.02	13.2	15.0	0.10	4.00	4.25	4.75/7.75
5D	2.00	15.6	26.1	31.0	0.14	5.06	5.40	6.20/16.8
6D	4.02	30.9	50.6	63.0	0.17	6.15	6.65	7.75/42.0
7D	8.05	61.3	103	127	0.21	7.26	7.95	9.40/116
8D	16.1	122	209	255	0.25	8.40	9.30	11.2/336

	Domino Algorithms						
k	$\sigma$	Avg	Max	Bound			
2D	0.04	1.92	1.95	2.05			
3D	0.11	2.92	3.05	3.20			

# Rectilinear Strategies: Comparing Distance Traveled

	С	)rthant	Algorith	m	Gene	ralized (	CBS Alg	gorithm
k	$\sigma$	Avg	Max	Bound	$\sigma$	Avg	Max	Bound
1D	$\sim 10^4$	27.8	$\sim 10^7$	$\sim 10^6$	0.00	1.00	1.00	1.00
2D	17.1	8.00	$\sim 10^4$	$\sim 10^6$	0.29	1.50	2.00	2.00
3D	8.14	12.0	$\sim 10^3$	$\sim 10^7$	0.41	2.00	3.00	3.00
4D	10.4	21.3	$\sim 10^3$	$\sim 10^7$	0.50	2.50	3.99	4.00
5D	16.7	40.0	$\sim 10^3$	$\sim 10^7$	0.58	3.00	4.97	5.00
6D	29.7	76.8	$\sim 10^3$	$\sim 10^8$	0.65	3.50	5.94	6.00
7D	55.2	149	$\sim 10^3$	$\sim 10^8$	0.71	4.00	6.86	7.00
8D	105	293	$\sim 10^3$	$\sim 10^8$	0.76	4.50	7.76	8.00

	Domino Algorithms						
k	$\sigma$	Avg	Max	Bound			
2D	17.2	7.68	$\sim 10^4$	$\sim 10^6$			
3D	7.17	11.0	$\sim 10^3$	$\sim 10^7$			

# Rectilinear Strategies: Comparing # Responses

	Orthant Algorithm				Generalized CBS Algorithm			
k	$\sigma$	Avg	Max	Bound	$\sigma$	Avg	Max	Bound
1D	0.11	0.47	0.95	1.00	0.11	0.47	0.95	1.05
2D	0.09	0.71	0.95	1.00	0.15	0.94	1.75	2.10
3D	0.07	0.83	0.95	1.00	0.18	1.42	2.45	3.15
4D	0.05	0.89	0.95	1.00	0.21	1.88	3.00	4.20
5D	0.04	0.92	0.95	1.00	0.23	2.33	3.50	5.25
6D	0.03	0.94	0.95	1.00	0.25	2.78	4.20	6.30
7D	0.02	0.94	0.95	1.00	0.27	3.22	4.65	7.35
8D	0.01	0.95	0.95	1.00	0.28	3.65	5.25	8.40

	Domino Algorithms						
k	$\sigma$	Avg	Max	Bound			
2D	0.15	0.93	1.70	2.05			
3D	0.18	1.39	2.35	3.20			

#### Open Problems

- 2D rectilinear algs. work under both  $L_1$  and  $L_{\infty}$  norms Confession: Only  $L_{\infty}$  works for higher dimensions Can we adapt general algs. for  $L_1$ ?
- g(k) constant in generalized CBS algorithm pretty large (3<sup>k</sup>) Under reasonable assumptions can reduce to  $k^2$ Can we do better?
- Distance traveled of  $\delta_{\min}$  instead of  $k\delta_{\min}$ ?
- Mix & match distance metrics
- Other norms?