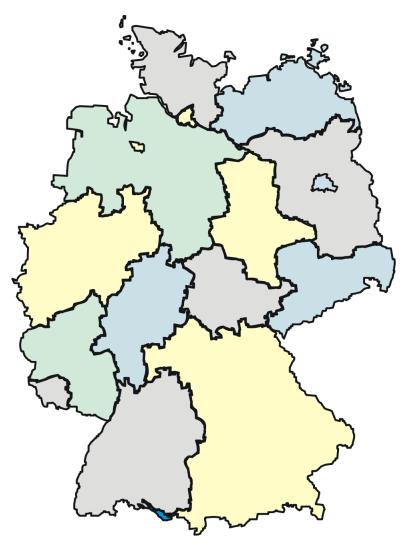


Computational Geometry

Point Localization or Where am I? Lecture #5

Thomas van Dijk

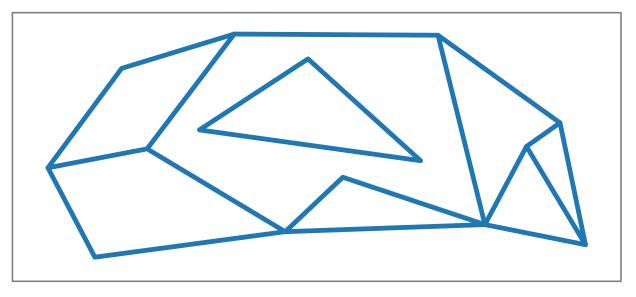
Winter Semester 2019/20

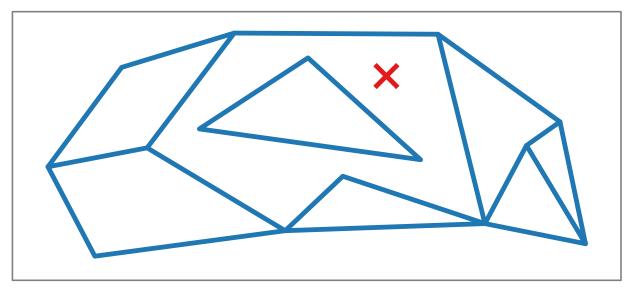


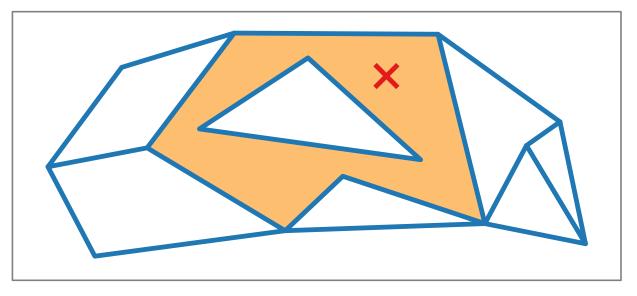
[Stefan-Xp, CC BY-SA 3.0, via wikipedia]

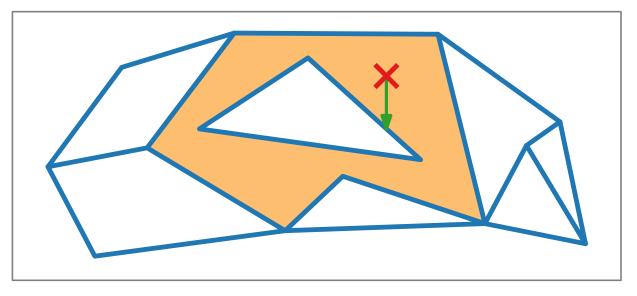


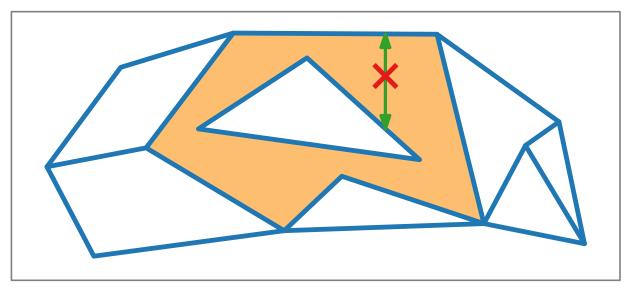
[Stefan-Xp, CC BY-SA 3.0, via wikipedia]

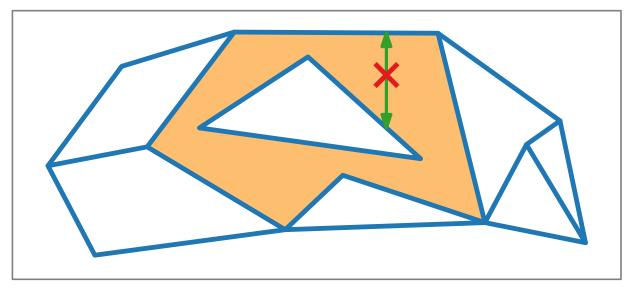


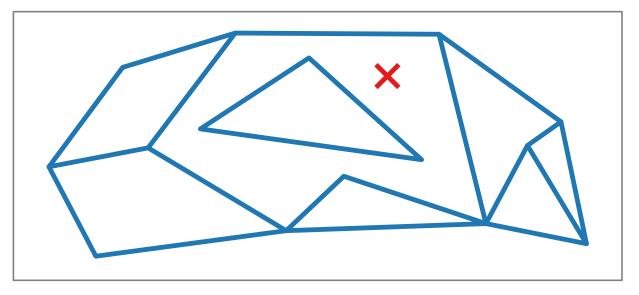




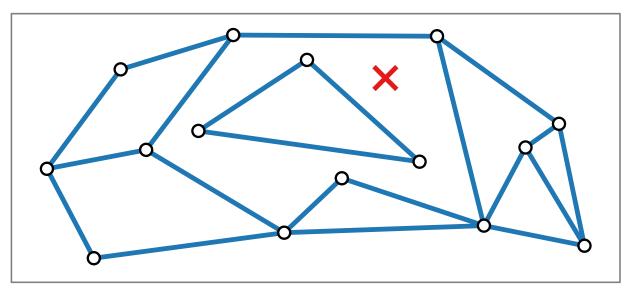




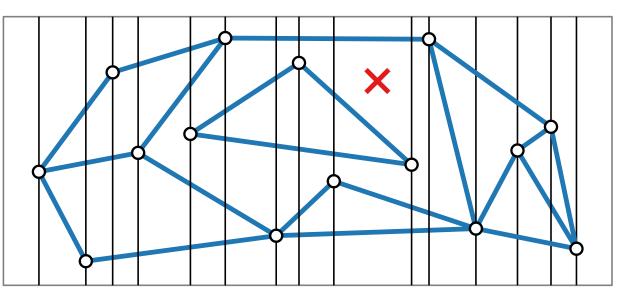




- Task:Given a planar subdivision S with n segments,preprocess S to allow for fast pt. location queries!
- **Solution:** Preproc.: Partition S into slabs induced by vertices.

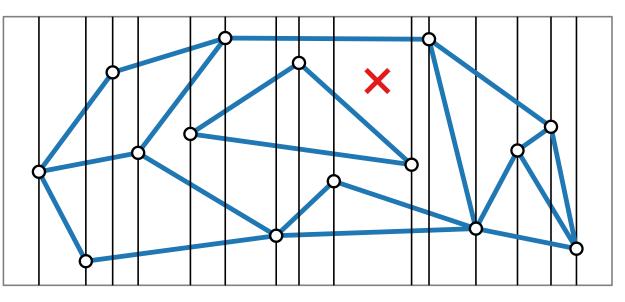


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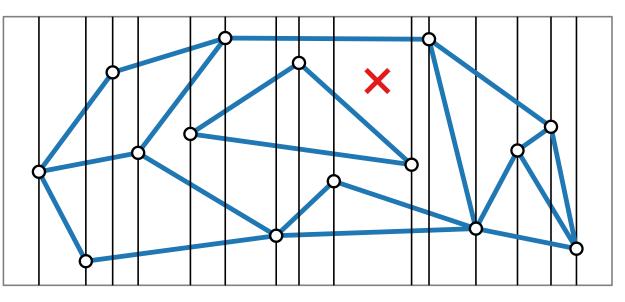


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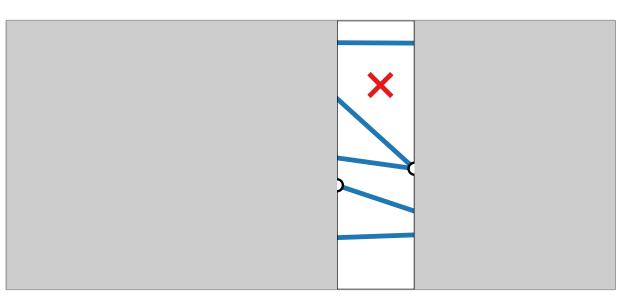


- Task:Given a planar subdivision S with n segments,preprocess S to allow for fast pt. location queries!
- **Solution:** Preproc.: Partition S into slabs induced by vertices. Query:



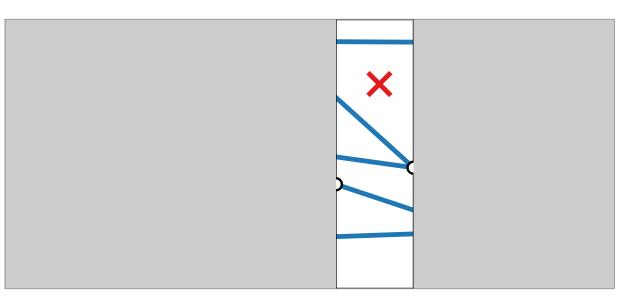
Task:Given a planar subdivision S with n segments,preprocess S to allow for fast pt. location queries!

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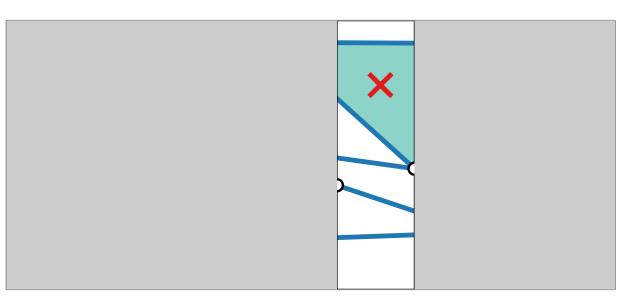
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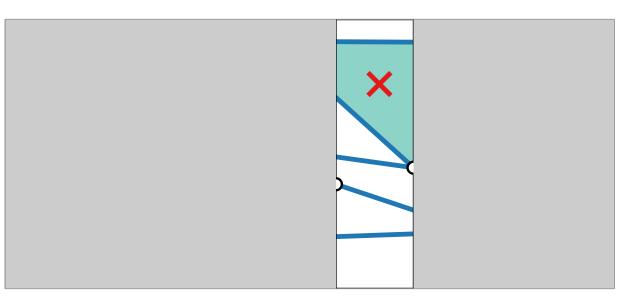
Query: – find correct slab – search in slab



Task:Given a planar subdivision S with n segments,preprocess S to allow for fast pt. location queries!

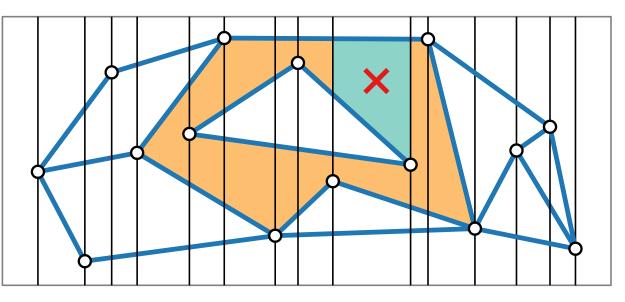
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Task:Given a planar subdivision S with n segments,preprocess S to allow for fast pt. location queries!

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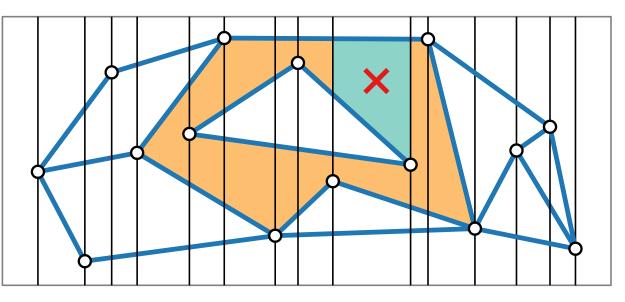


Task:Given a planar subdivision S with n segments,preprocess S to allow for fast pt. location queries!

Solution: Preproc.: Partition S into slabs induced by vertices.

Query: – find correct slab – search in slab } 2 bin. searches!

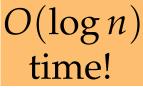




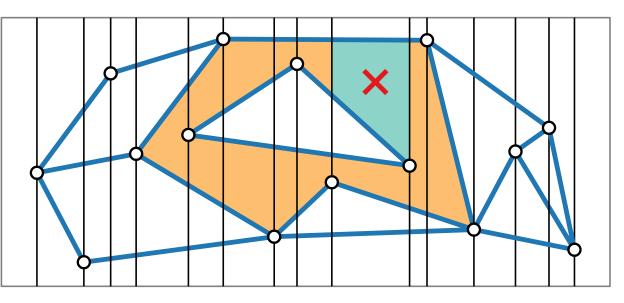
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But:



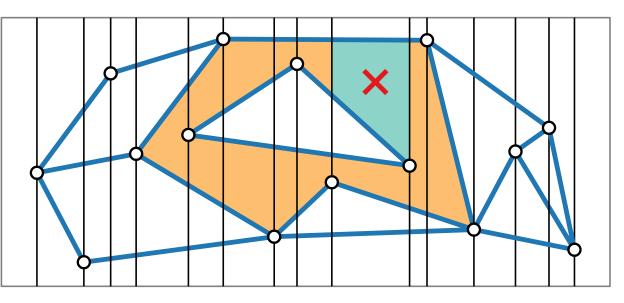
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But: Space?



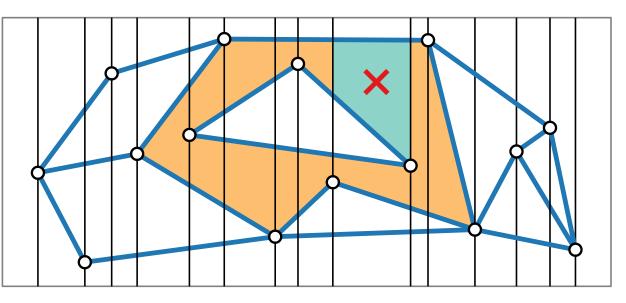
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But: Space? $\Theta(n^2)$



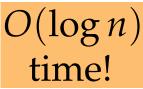


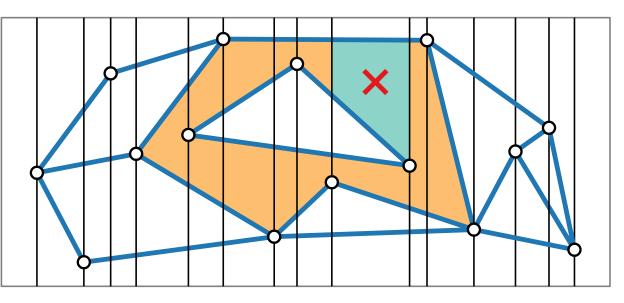
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Query: – find correct slab – search in slab } 2 bin. searches!

But: Space? $\Theta(n^2)$ **Task:** Tight example?



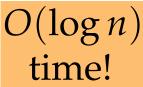


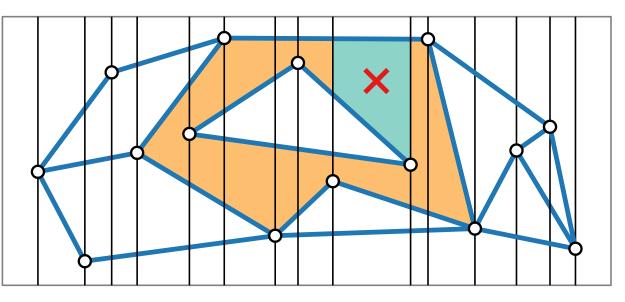
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Solution: Preproc.: Partition S into slabs induced by vertices.

Query: – find correct slab – search in slab } 2 bin. searches!

But: Space? $\Theta(n^2)$ Preproc?



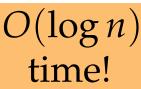


Task: Given a planar subdivision S with *n* segments, preprocess S to allow for fast pt. location queries!

Solution: Preproc.: Partition \mathcal{S} into slabs induced by vertices.

Query: - find correct slab
- search in slab2 bin. searches!Space? $\Theta(n^2)$ Preproc? $O(n^2 \log n)$ $O(\log n)$
time!

But:



Observation: The slab partition of S is a *refinement* S' of S that consists of (possibly degenerate) trapezoids.

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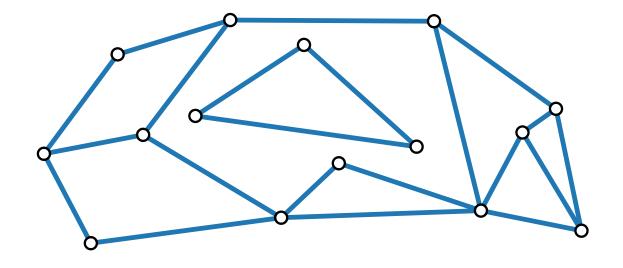
Task:Find "good" refinement of S of low complexity!

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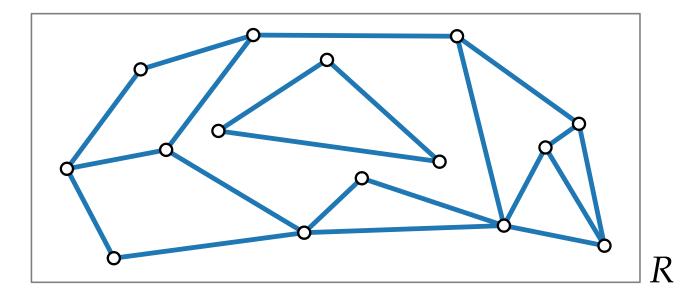
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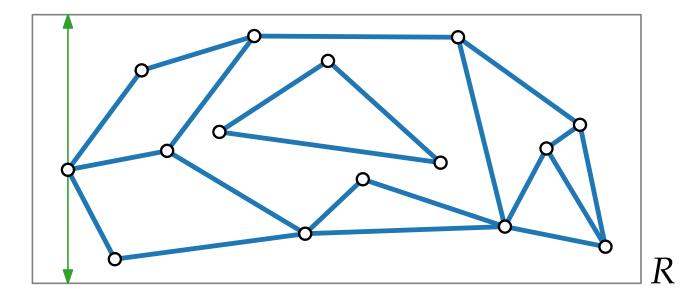
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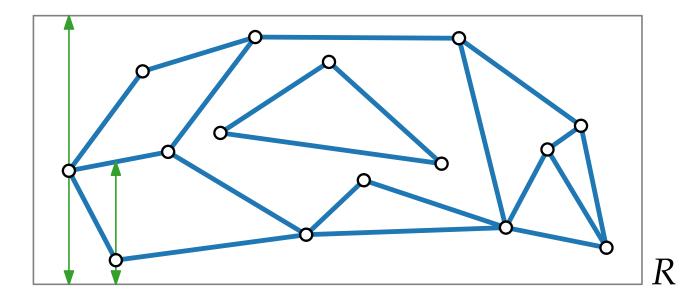
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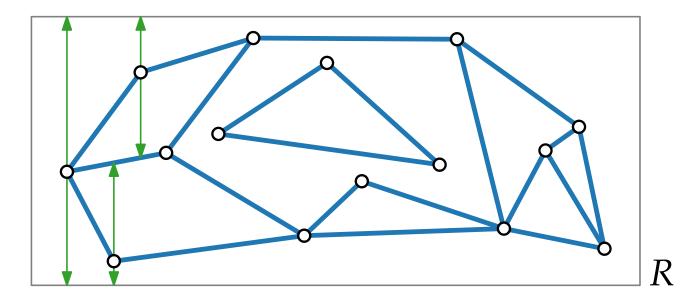
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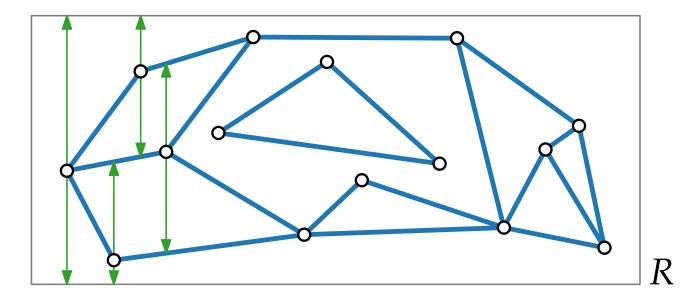
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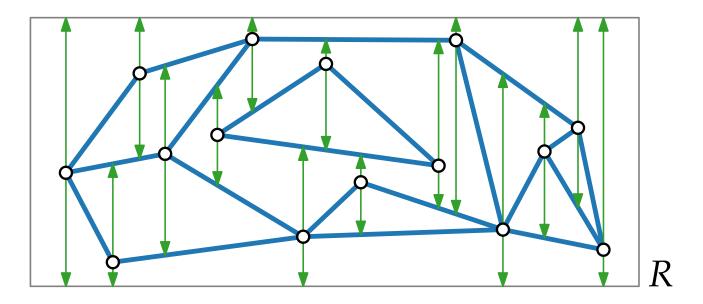
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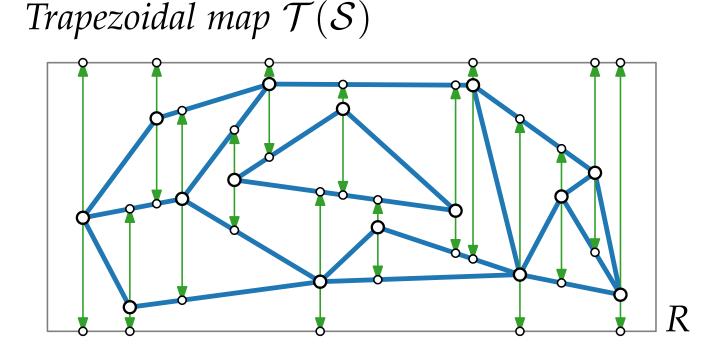
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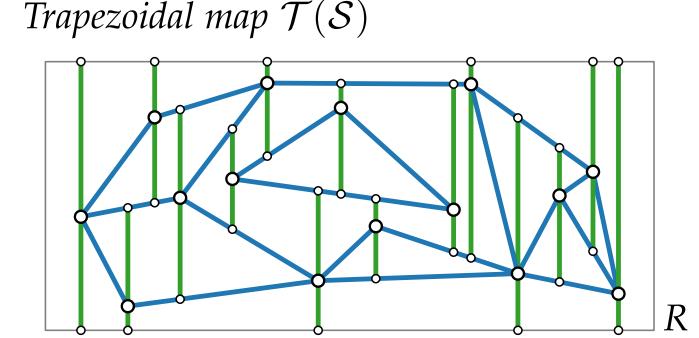


Decreasing the Complexity

Observation: The slab partition of S is a *refinement* S' of S that consists of (possibly degenerate) trapezoids.

Task:Find "good" refinement of S of low complexity!

Solution:

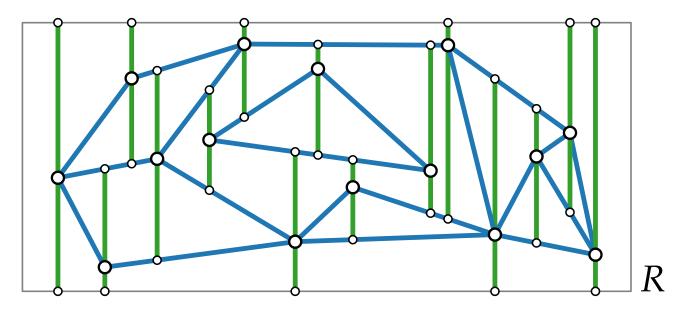


Decreasing the Complexity

Observation: The slab partition of S is a *refinement* S' of S that consists of (possibly degenerate) trapezoids.

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Solution: Trapezoidal map $\mathcal{T}(\mathcal{S})$



Assumption: S is in *general position*, that is, no two vertices have the same *x*-coordinates.

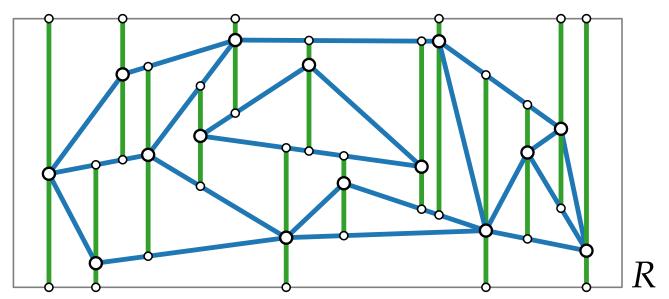
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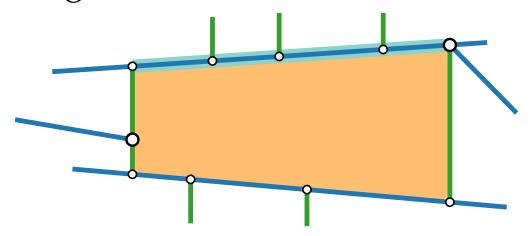
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See Comp. Geom. A&A Ch. 6.3

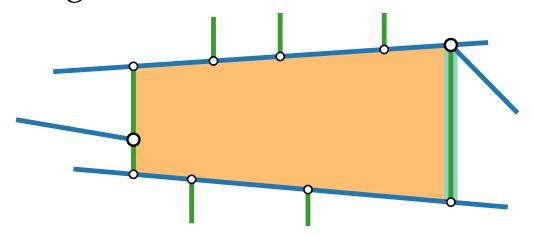


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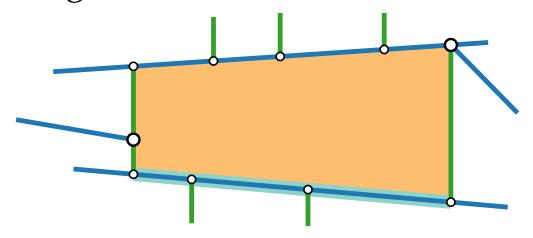
Definition:



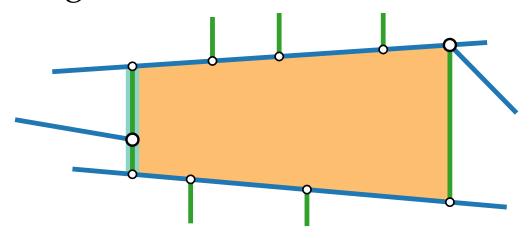
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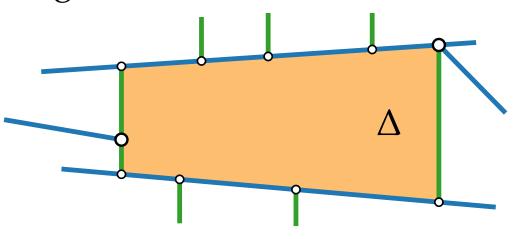


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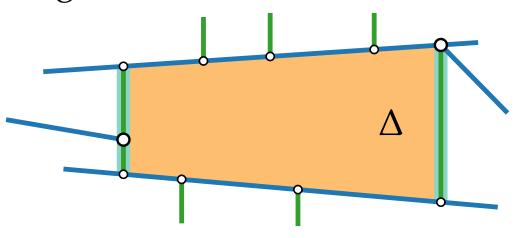
Definition:

A *side* of a face of $\mathcal{T}(S)$ is a segment of max. length contained in the boundary of the face.



Observation: S in gen. pos. \Rightarrow each face Δ of $\mathcal{T}(S)$ has:

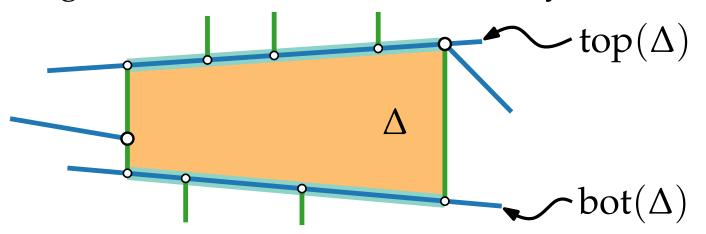
Definition:



Observation: S in gen. pos. \Rightarrow each face Δ of $\mathcal{T}(S)$ has: – one or two vertical sides

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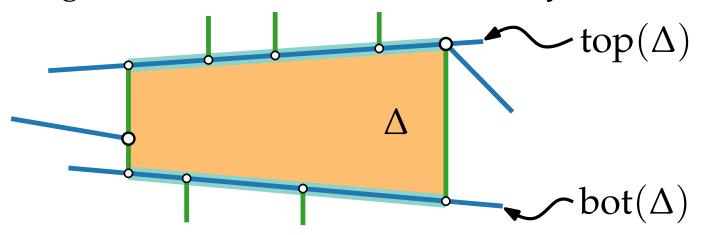
Observation: S in gen. pos. \Rightarrow each face Δ of $\mathcal{T}(S)$ has: – one or two vertical sides – exactly 2 non-vertical sides

Definition:

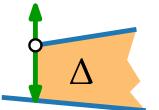
Left side:

A *side* of a face of $\mathcal{T}(S)$ is a segment of max. length contained in the boundary of the face.

4 - 8

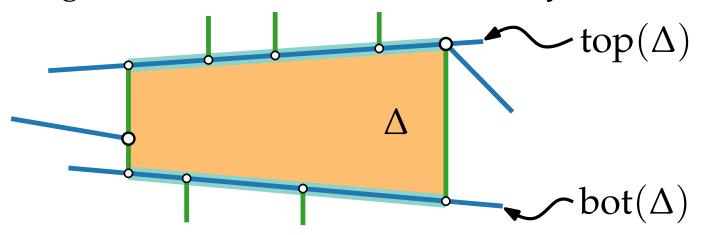


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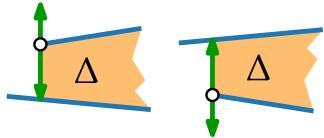


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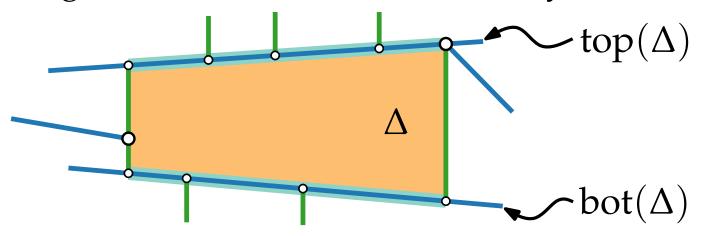


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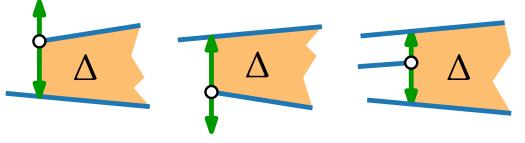


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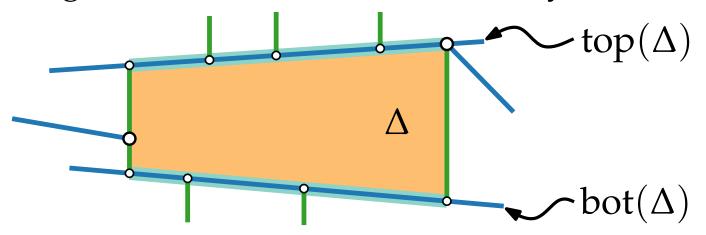


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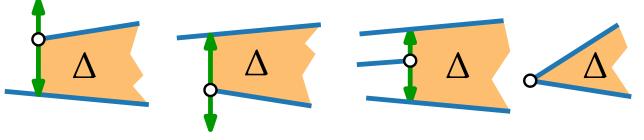


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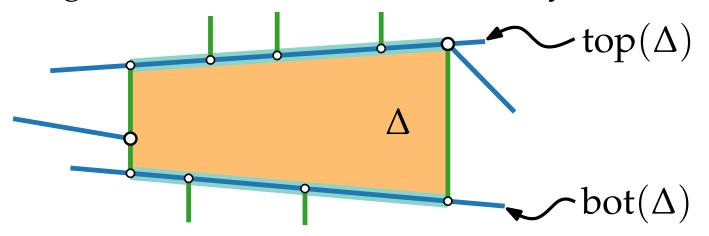


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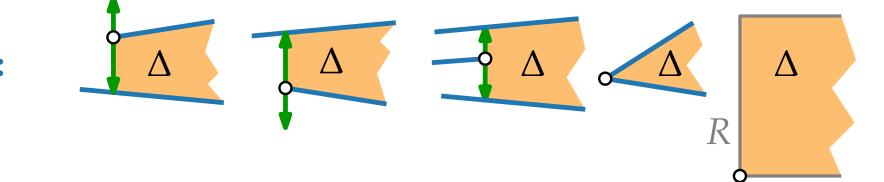


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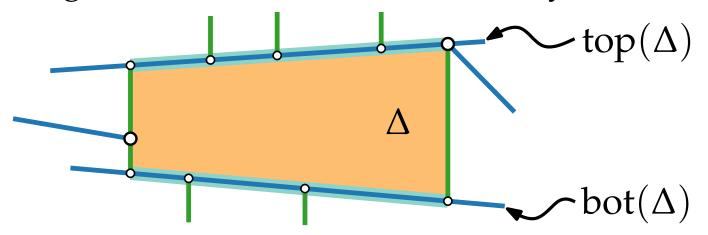


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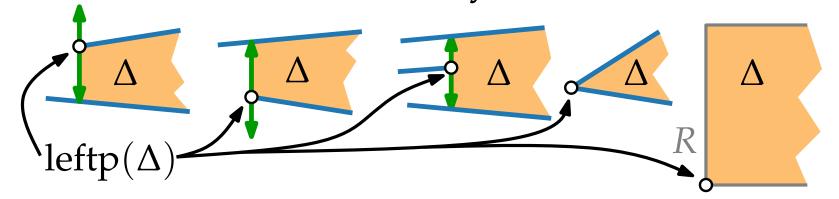


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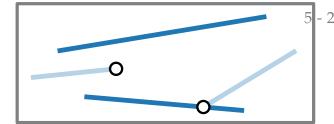


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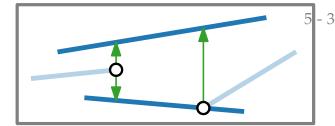
Observe: A face Δ of $\mathcal{T}(\mathcal{S})$ is uniquely defined by $top(\Delta)$, $bot(\Delta)$, $leftp(\Delta)$, and $rightp(\Delta)$.





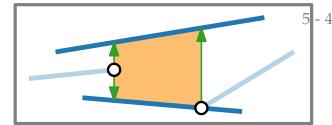
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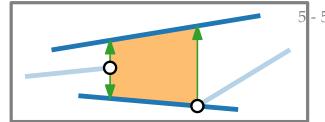
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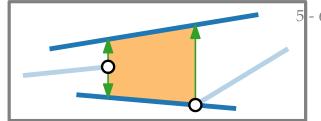
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Lemma.S planar subdivision in gen. pos. with *n* segments $\Rightarrow \mathcal{T}(S)$ has \leq vtc and \leq trapezoids.

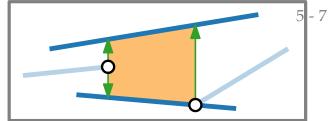


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Lemma. *S* planar subdivision in gen. pos. with *n* segments $\Rightarrow T(S)$ has \leq vtc and \leq trapezoids.

Proof.	The vertices of $\mathcal{T}(S)$ are
--------	--------------------------------------

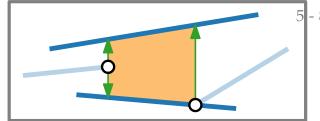
– endpts of segments in \mathcal{S}



Observe: A face Δ of $\mathcal{T}(S)$ is uniquely defined by $top(\Delta)$, $bot(\Delta)$, $leftp(\Delta)$, and $rightp(\Delta)$.

Lemma. *S* planar subdivision in gen. pos. with *n* segments $\Rightarrow T(S)$ has \leq vtc and \leq trapezoids.

- *Proof.* The vertices of $\mathcal{T}(S)$ are
 - endpts of segments in $S \leq 2n$

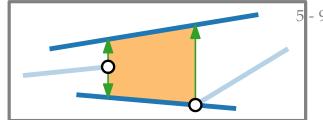


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Proof.

- The vertices of $\mathcal{T}(S)$ are
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 - endpts of vertical extensions



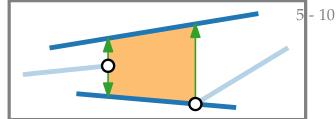
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The vertices of $\mathcal{T}(S)$ are

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- endpts of vertical extensions $\leq 2 \cdot 2n$



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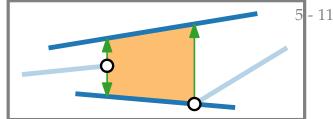
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- vertices of R



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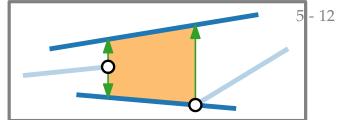
Lemma. *S* planar subdivision in gen. pos. with *n* segments $\Rightarrow T(S)$ has \leq vtc and \leq trapezoids.

Proof.

The vertices of
$$\mathcal{T}(S)$$
 are

- endpts of segments in $S \leq 2n$
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- vertices of R



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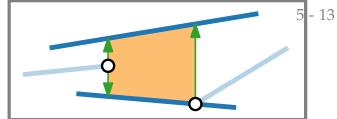
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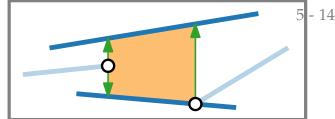
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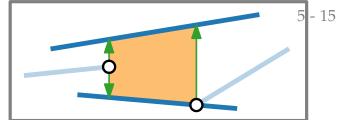
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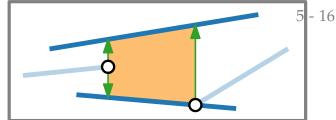
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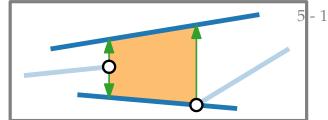
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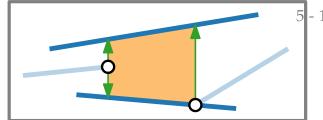
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Approach: Construct trapezoidal map $\mathcal{T}(\mathcal{S})$ and point-location data structure $\mathcal{D}(\mathcal{S})$ for $\mathcal{T}(\mathcal{S})$ incrementally!



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Bound #trapezoids via Euler or directly (segments/leftp).

Approach: Construct trapezoidal map $\mathcal{T}(\mathcal{S})$ and point-location data structure $\mathcal{D}(\mathcal{S})$ for $\mathcal{T}(\mathcal{S})$ incrementally! algorithm-design paradigm!

The 1D Problem

Given a set *S* of *n* real numbers...

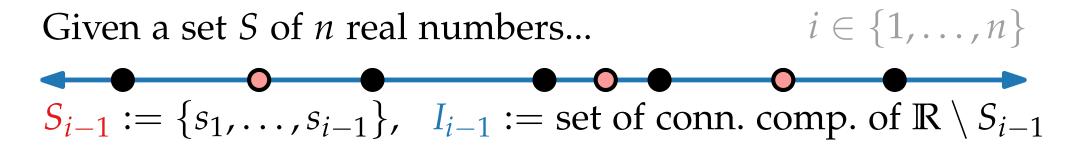
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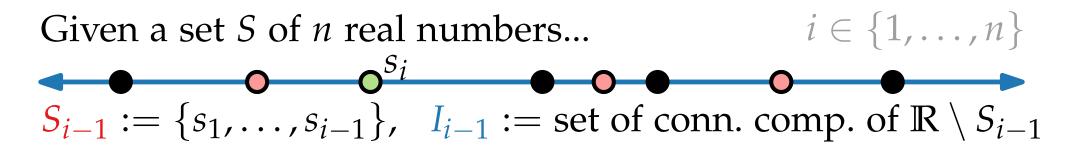


Given a set *S* of *n* real numbers... $i \in \{1, ..., n\}$

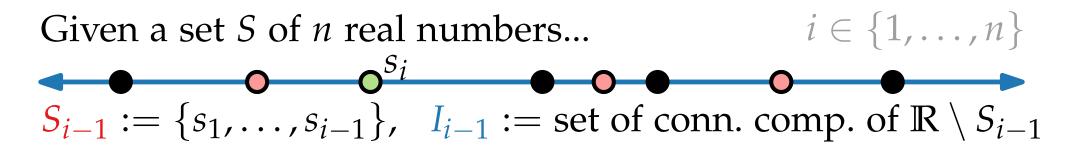
 $S_{i-1} := \{s_1, \ldots, s_{i-1}\}, I_{i-1} := \text{set of conn. comp. of } \mathbb{R} \setminus S_{i-1}$



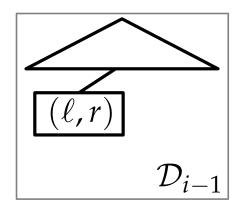
– pick an arbitrary point s_i from $S \setminus S_{i-1}$

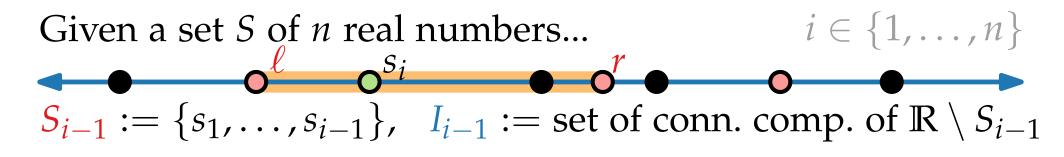


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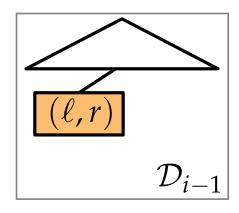


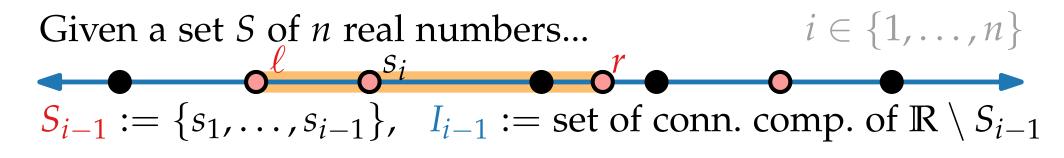
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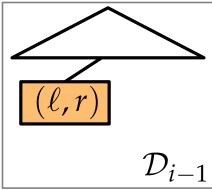


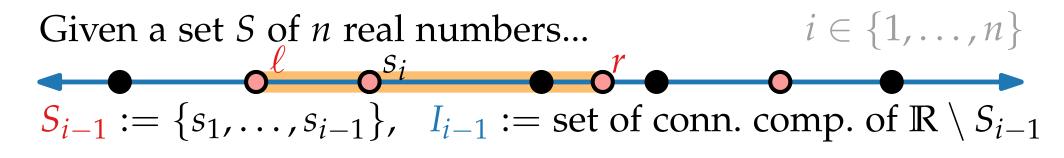
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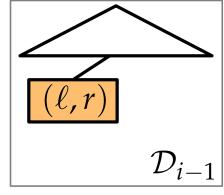


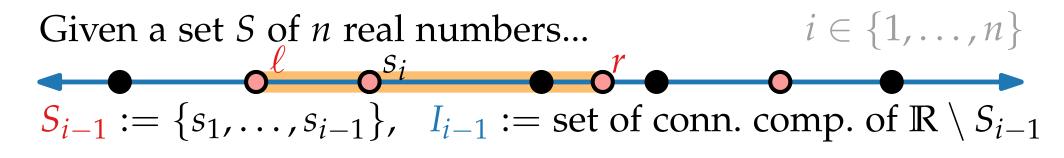
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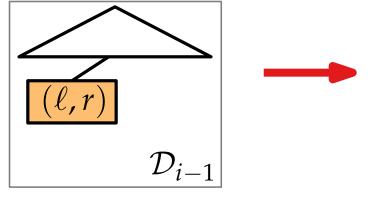


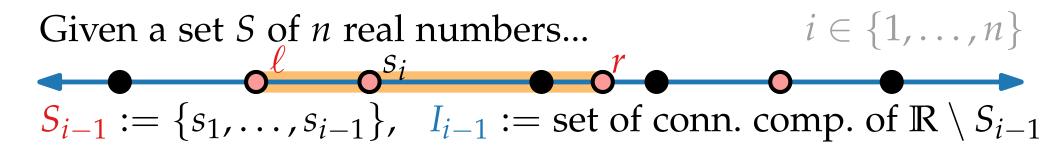
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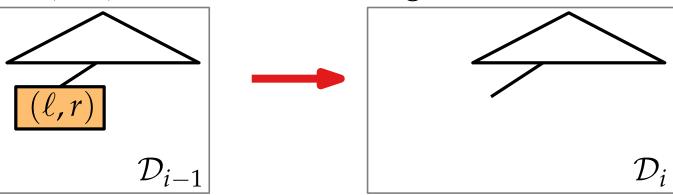


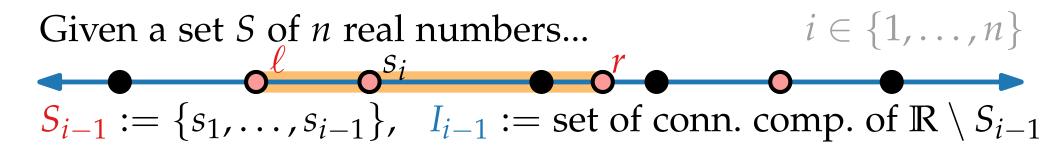
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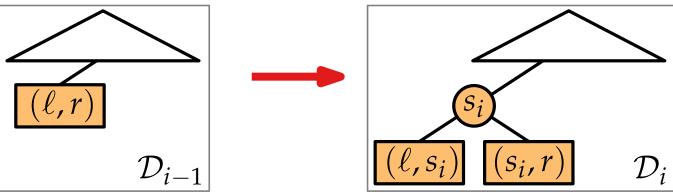


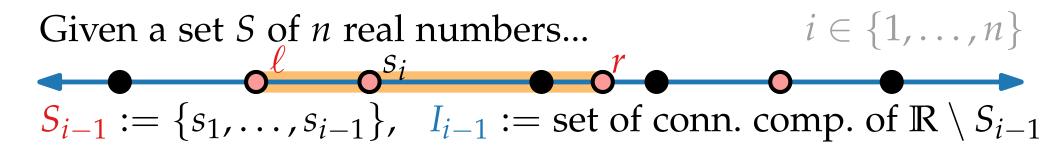
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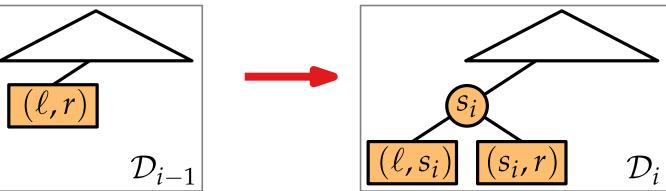


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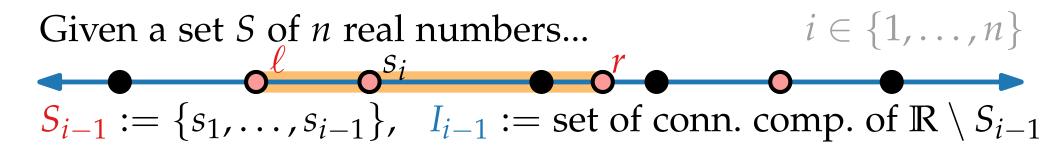




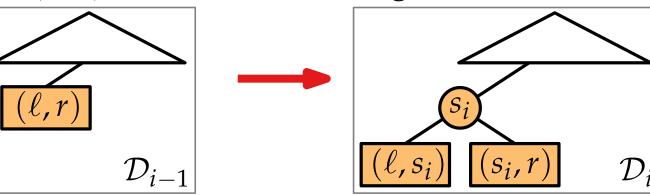
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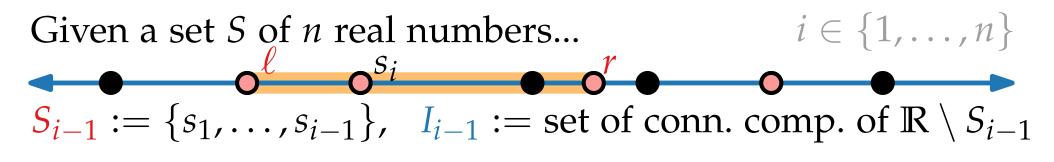


Problem:



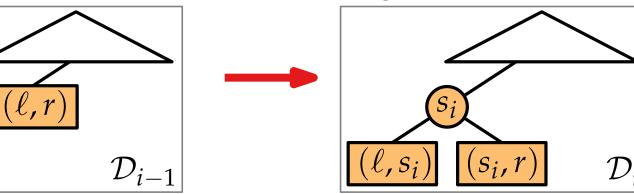
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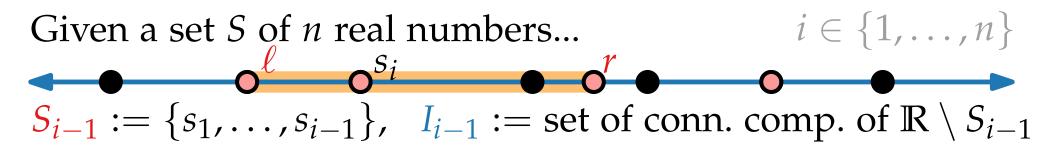




Solution:

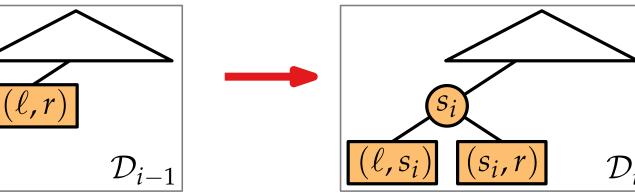
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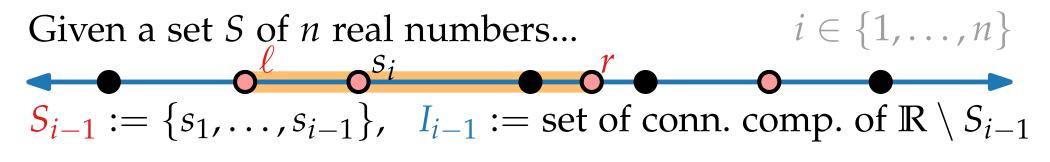




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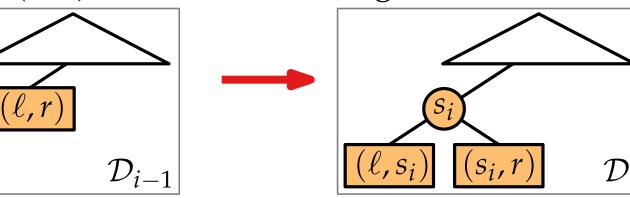
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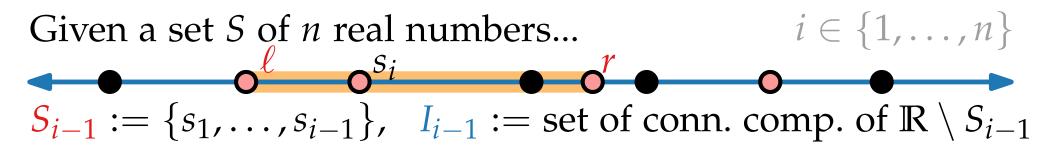




Solution: random!

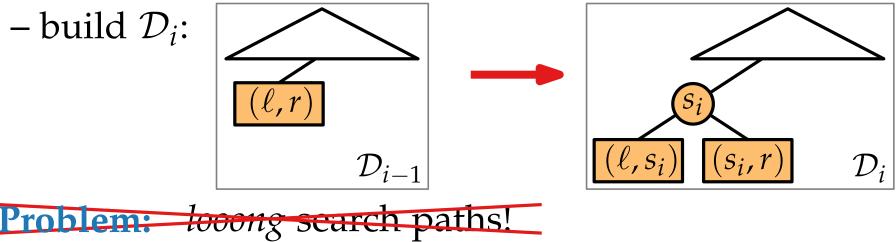
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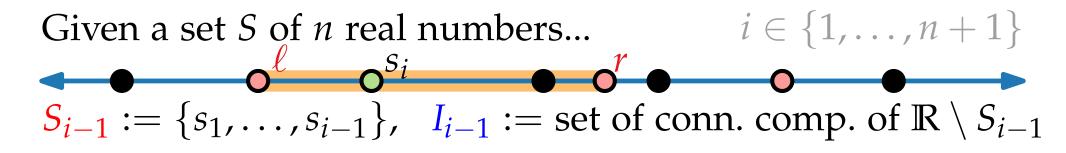




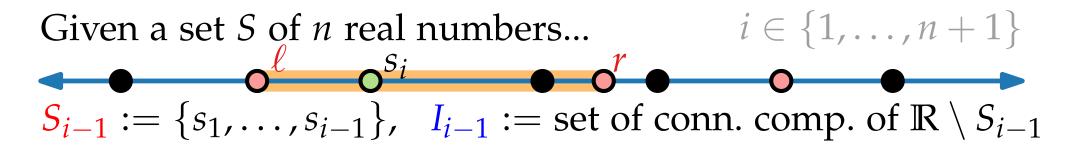
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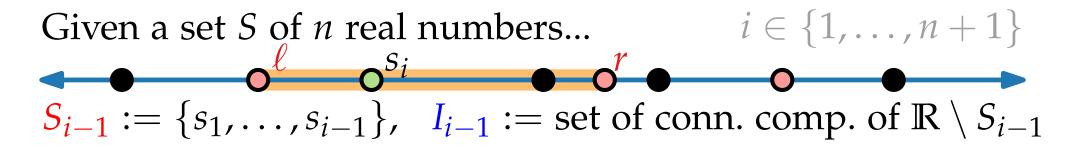


Thm. The randomized-incremental algorithm preproc. a set *S* of *n* reals in $O(n \log n)$ expected time such that a query takes $O(\log n)$ expected time.



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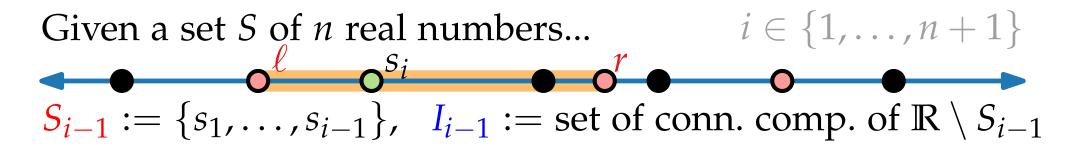
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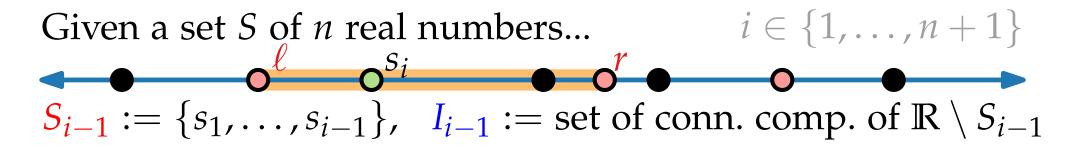
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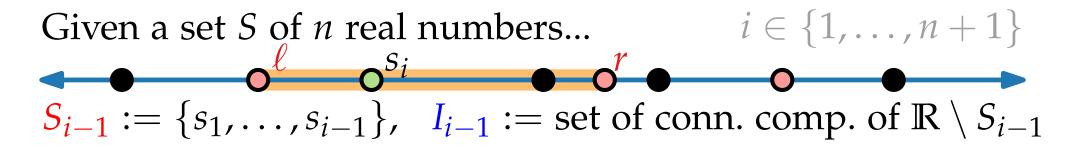
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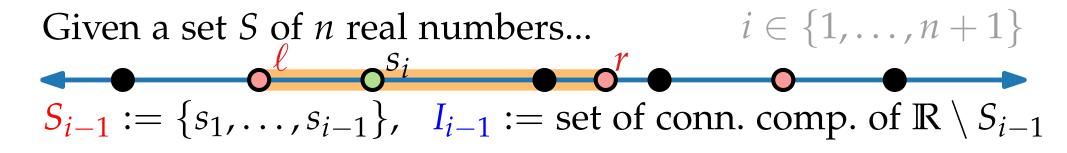
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Consider S_i fixed.

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- we have *i* choices, identically distributed
- at most two of these change the interval

Define random variable $X_i = \begin{cases} 1 & \text{if } I_i(q) \neq I_{i-1}(q), \\ 0 & \text{else.} \end{cases}$

Expected Query Time of \mathcal{D}_n

 $E[X_i] = P[X_i = 1] = \frac{2}{i}$

= probability that $I_i(q) \neq I_{i-1}(q)$, i.e., $s_i \in I_{i-1}(q)$.

Backwards analysis:

Consider S_i fixed.

- If we *remove* a randomly chosen pt from S_i , what's the probability that the interval containing q changes?
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Define random variable $X_i = \begin{cases} 1 & \text{if } I_i(q) \neq I_{i-1}(q), \\ 0 & \text{else.} \end{cases}$

 $E[\text{query time in } \mathcal{D}_n] = E[\text{length search path in } \mathcal{D}_n] = E[\sum_{i=1}^n X_i] = \sum_{i=1}^n E[X_i] = ?$

Expected Query Time of \mathcal{D}_n

- $E[X_i] = P[X_i = 1] = 2/i \blacktriangleleft$
 - = probability that $I_i(q) \neq I_{i-1}(q)$, i.e., $s_i \in I_{i-1}(q)$.

Backwards analysis:

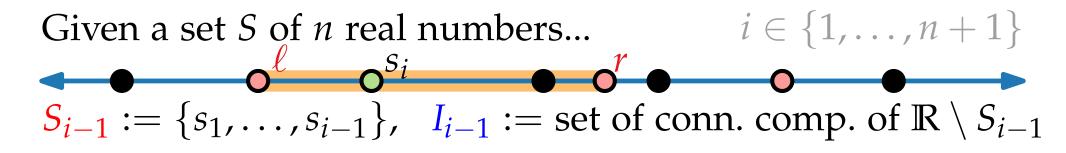
Consider S_i fixed.

- If we *remove* a randomly chosen pt from S_i , what's the probability that the interval containing q changes?
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Define random variable $X_i = \begin{cases} 1 & \text{if } I_i(q) \neq I_{i-1}(q), \\ 0 & \text{else.} \end{cases}$

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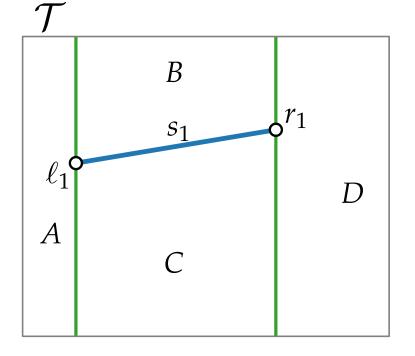
The 1D Result



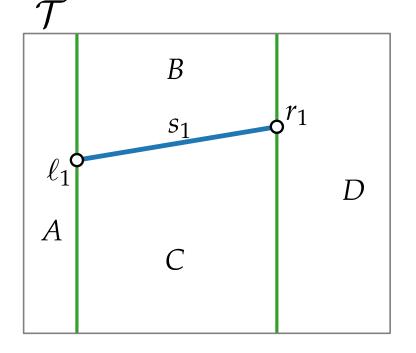
Thm. The randomized-incremental algorithm preproc. a set *S* of *n* reals in $O(n \log n)$ expected time such that a query takes $O(\log n)$ expected time.

trapezoidal map ——

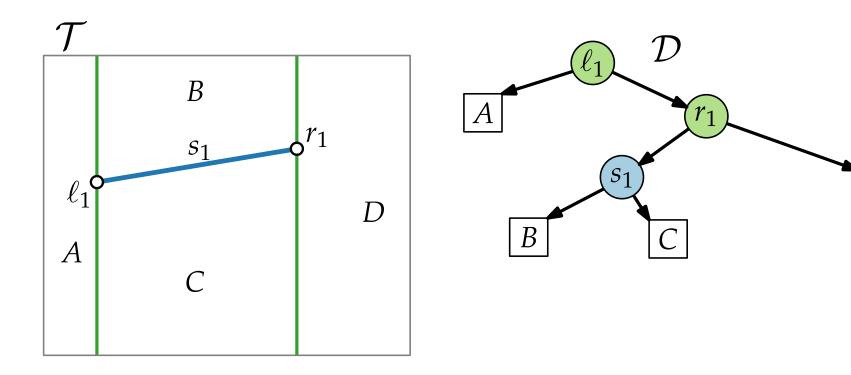
trapezoidal map



point-location data structure (DAG) trapezoidal map 10 - 4

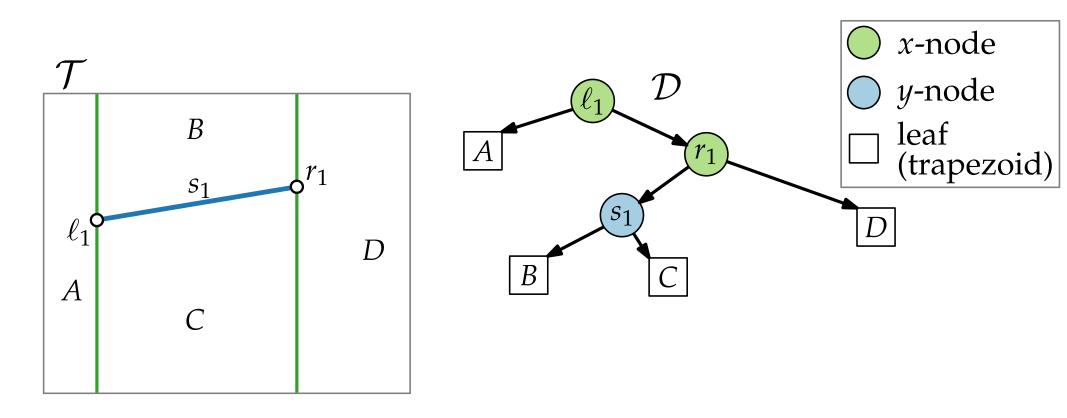


point-location data structure (DAG) trapezoidal map 10 - 5



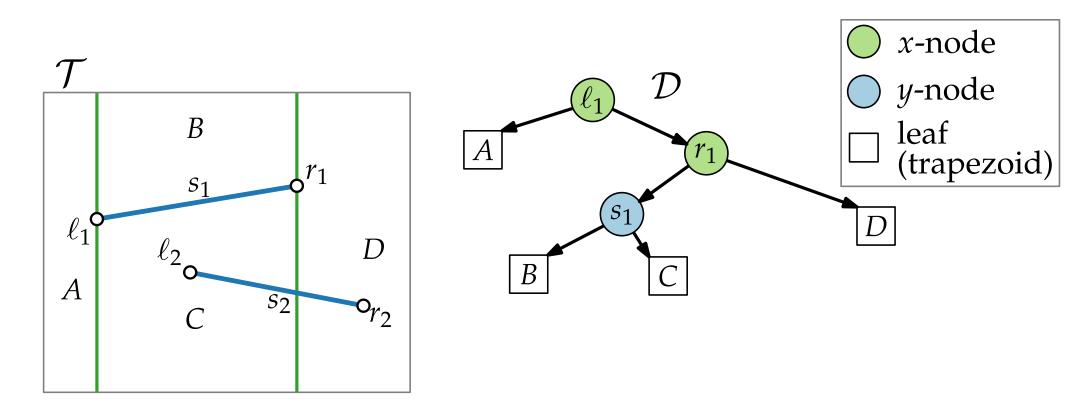
The 2D Problempoint-location data structure (DAG)trapezoidal map_______

Approach: randomized-incremental construction of \mathcal{T} and \mathcal{D}



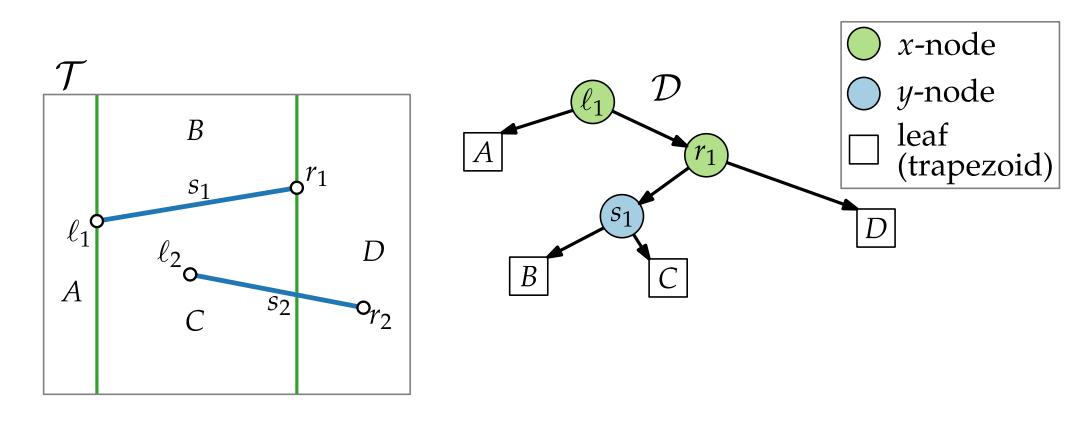
The 2D Problem point-location data structure (DAG) trapezoidal map \

Approach: randomized-incremental construction of \mathcal{T} and \mathcal{D}



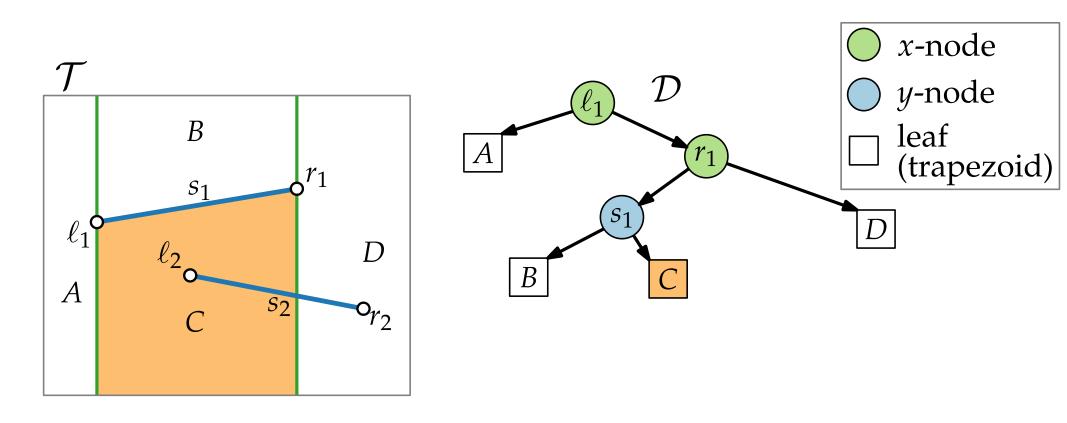
point-location data structure (DAG) trapezoidal map 10 - 8

Approach: randomized-incremental construction of \mathcal{T} and \mathcal{D} – use \mathcal{D} to locate left endpoint of next segment *s*

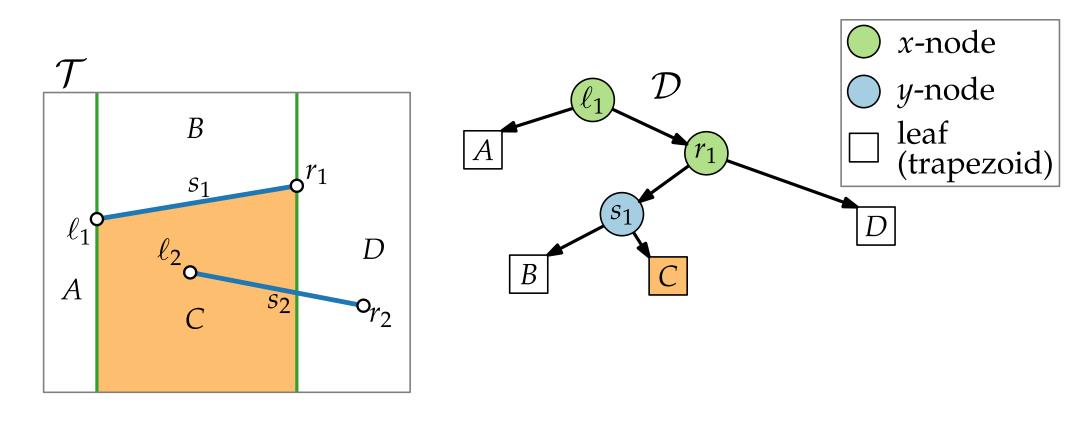


point-location data structure (DAG) trapezoidal map 10 - 9

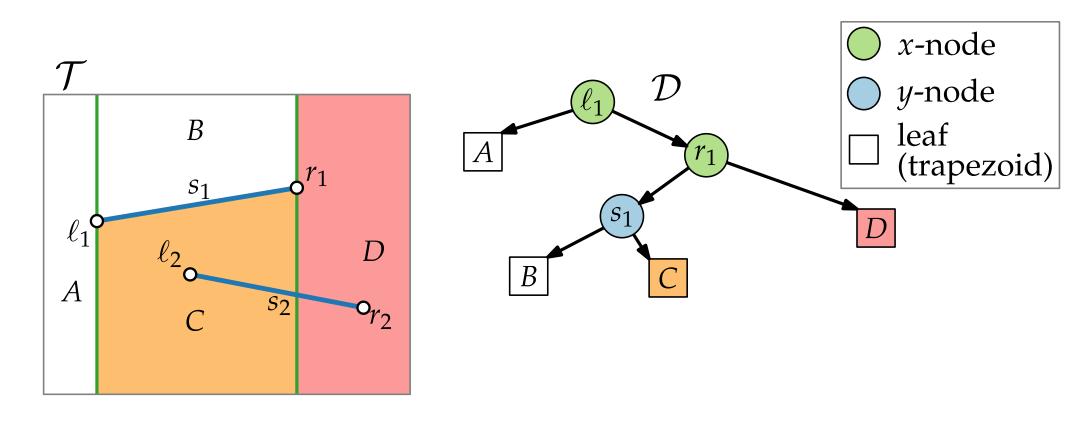
Approach: randomized-incremental construction of \mathcal{T} and \mathcal{D} – use \mathcal{D} to locate left endpoint of next segment *s*



The 2D Problempoint-location data structure (DAG)Image: trapezoidal mapImage: trapezoidal mapApproach:randomized-incremental construction of \mathcal{T} and \mathcal{D} - use \mathcal{D} to locate left endpoint of next segment s- "walk" along s through \mathcal{T}

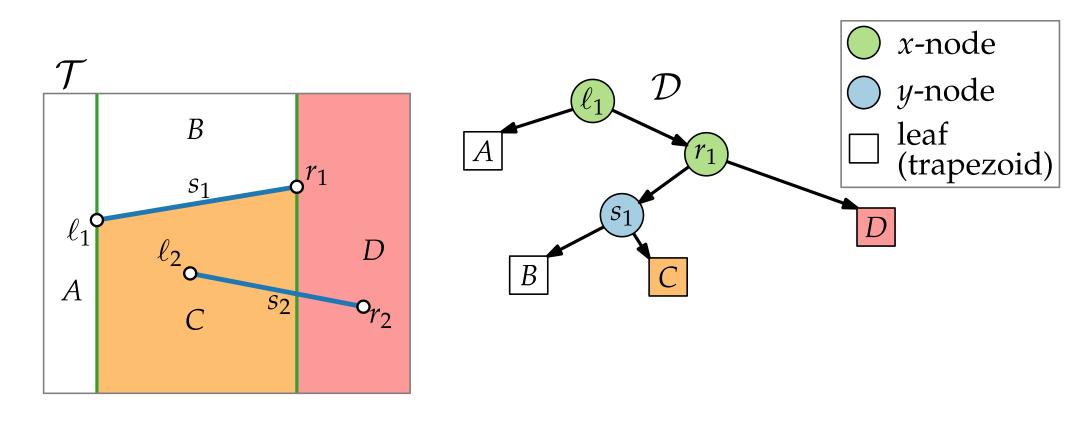


The 2D Problempoint-location data structure (DAG)Image: trapezoidal mapImage: trapezoidal mapApproach:randomized-incremental construction of \mathcal{T} and \mathcal{D} - use \mathcal{D} to locate left endpoint of next segment s- "walk" along s through \mathcal{T}



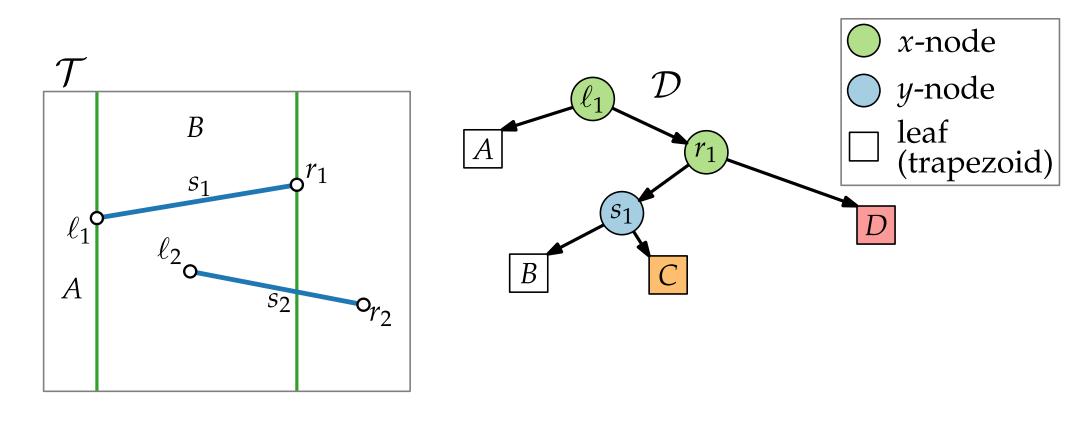
point-location data structure (DAG) trapezoidal map

- use \mathcal{D} to locate left endpoint of next segment *s*
- "walk" along *s* through \mathcal{T}
- destroy all trapezoids of \mathcal{T} intersecting *s*



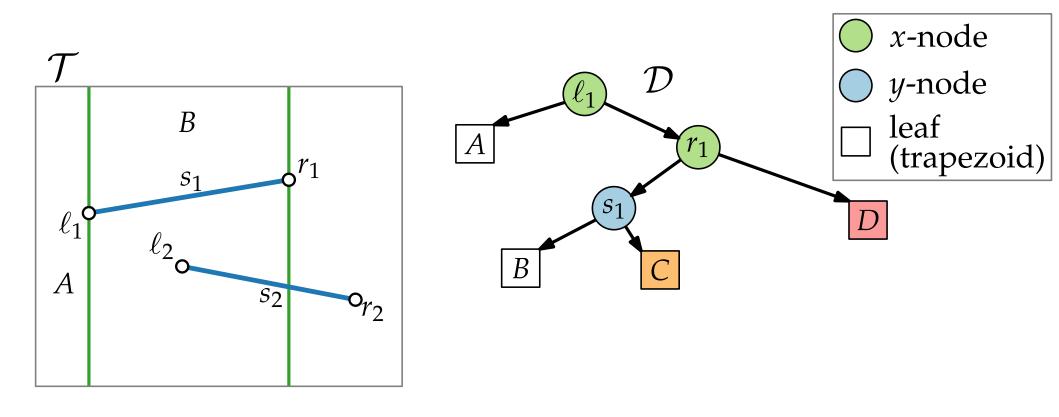
point-location data structure (DAG) trapezoidal map

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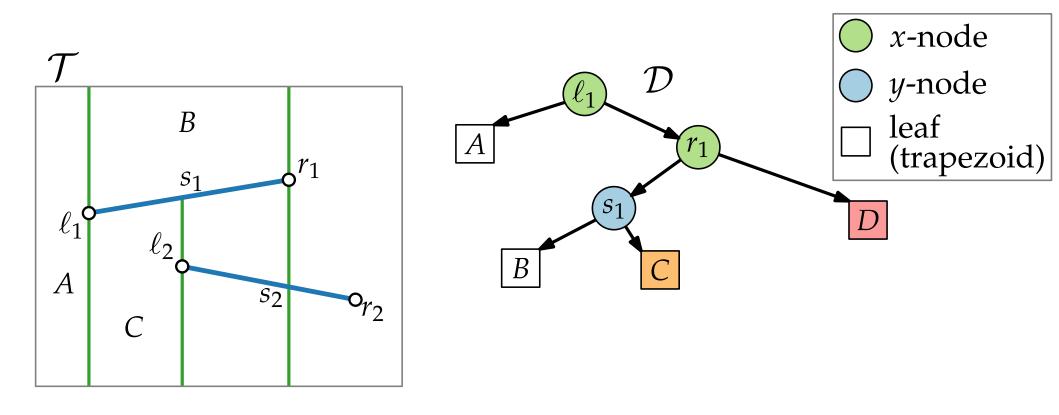
point-location data structure (DAG) trapezoidal map 10 - 14

- use \mathcal{D} to locate left endpoint of next segment *s*
- "walk" along *s* through \mathcal{T}
- destroy all trapezoids of \mathcal{T} intersecting *s*
- construct new trapezoids of \mathcal{T} (adjacent to s)



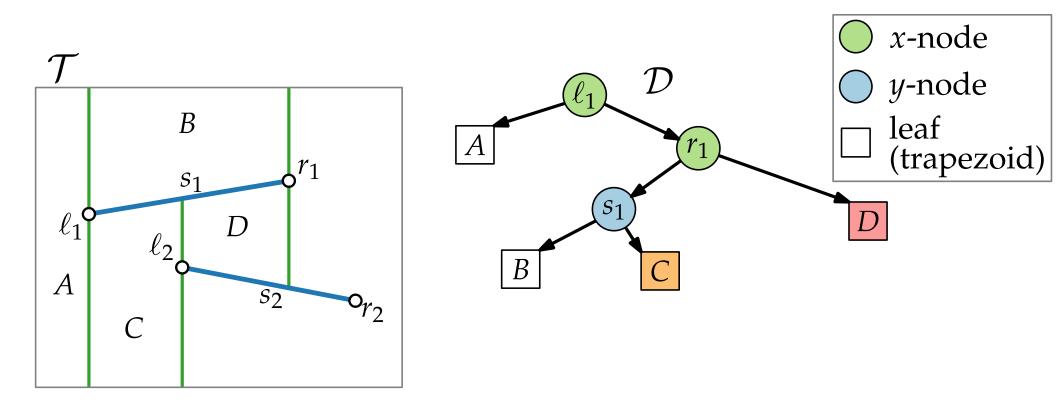
point-location data structure (DAG) trapezoidal map 10 - 15

- use \mathcal{D} to locate left endpoint of next segment *s*
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point-location data structure (DAG) trapezoidal map 10 - 16

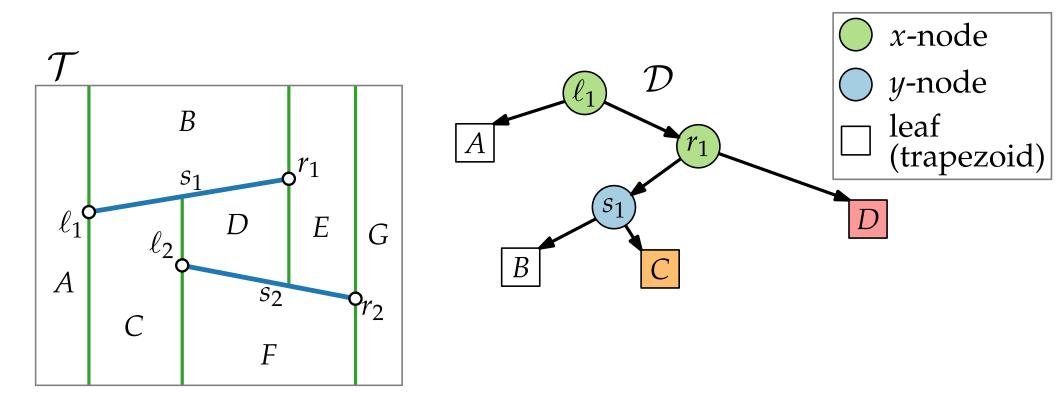
- use \mathcal{D} to locate left endpoint of next segment *s*
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point-location data structure (DAG) trapezoidal map

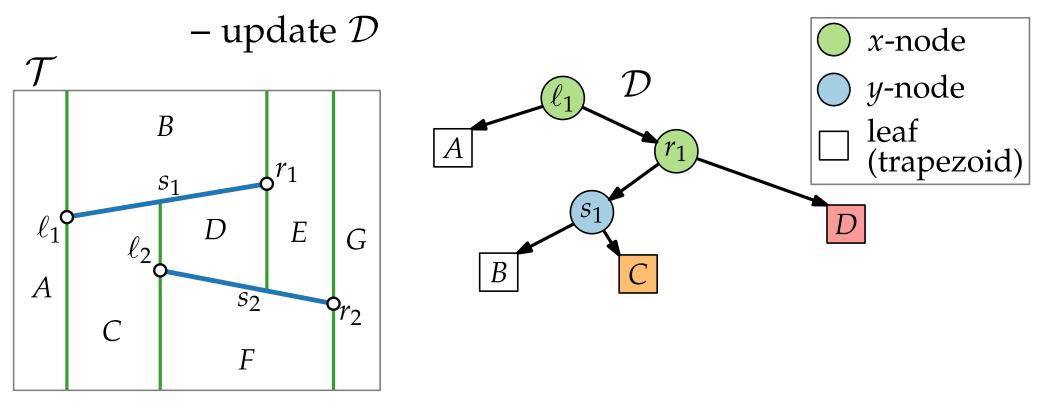
Approach: randomized-incremental construction of \mathcal{T} and \mathcal{D}

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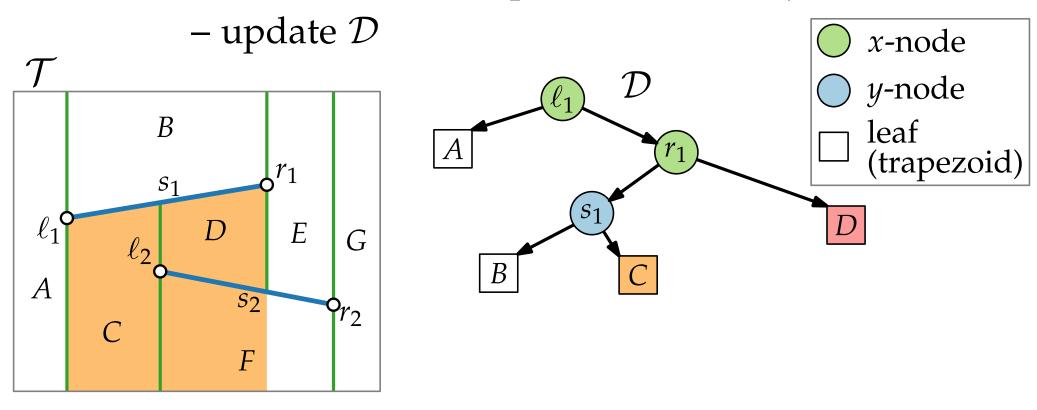
point-location data structure (DAG) trapezoidal map

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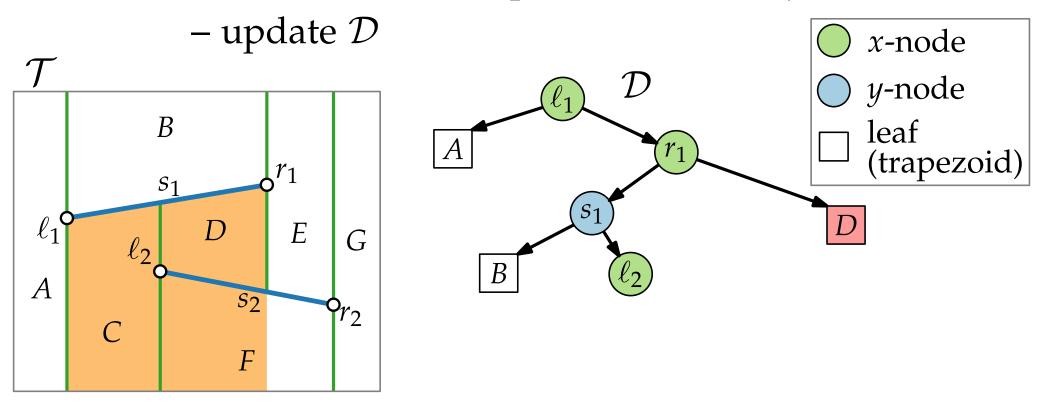
point-location data structure (DAG) trapezoidal map 10 - 19

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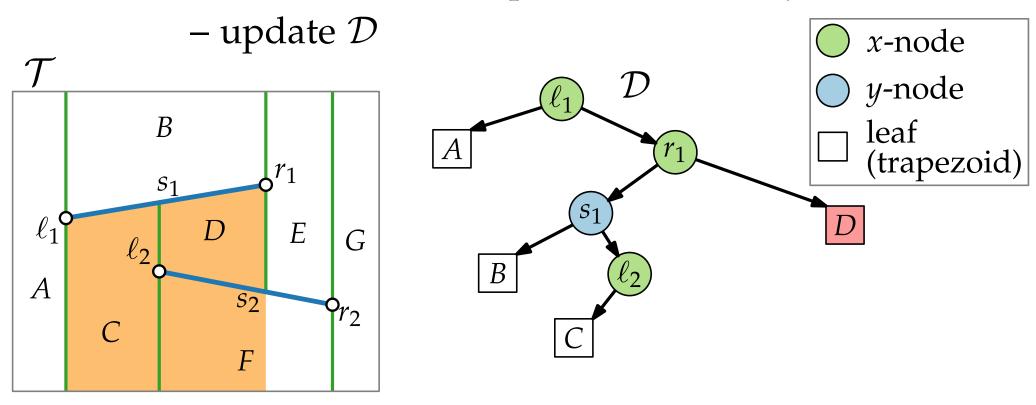
point-location data structure (DAG) trapezoidal map

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point-location data structure (DAG) trapezoidal map

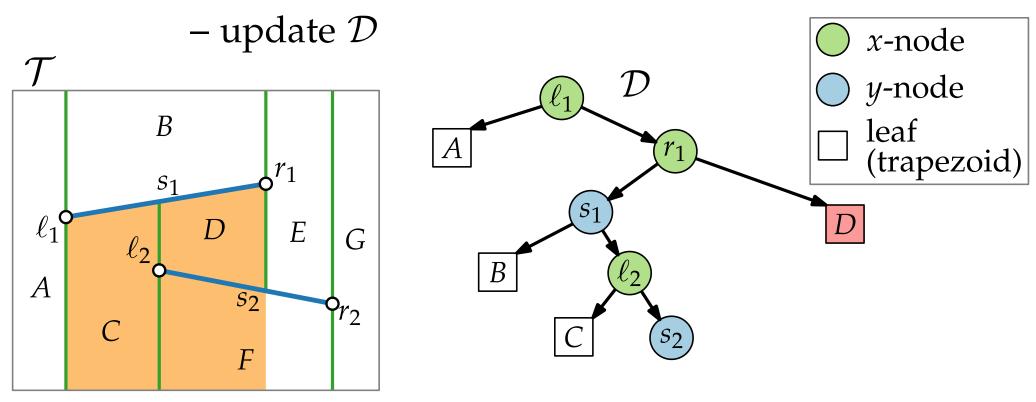
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point-location data structure (DAG) trapezoidal map

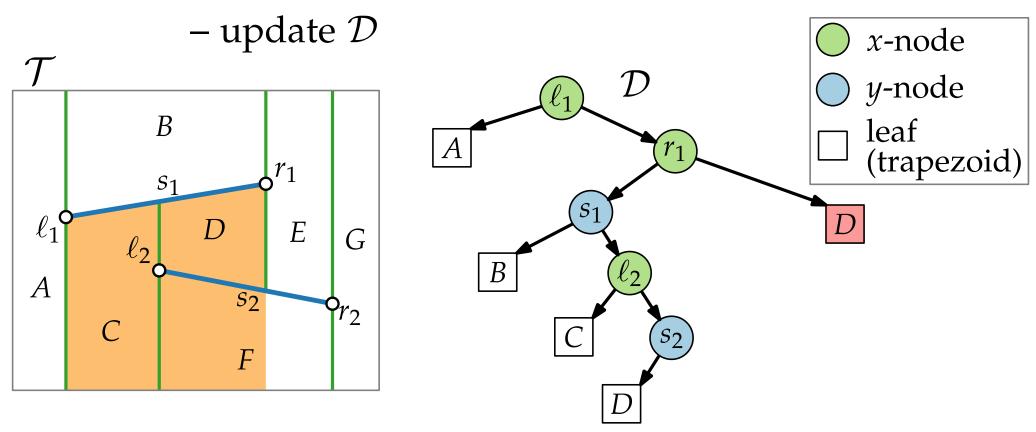
Approach: randomized-incremental construction of \mathcal{T} and \mathcal{D}

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point-location data structure (DAG) trapezoidal map

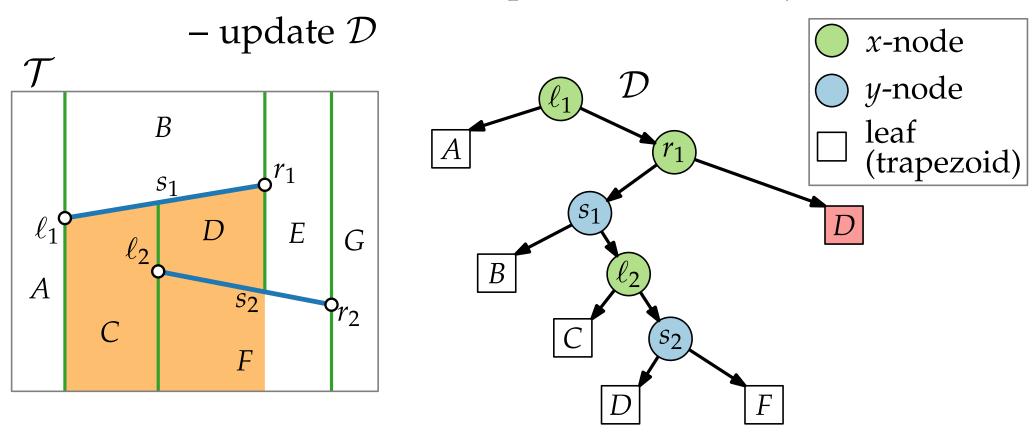
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point-location data structure (DAG) trapezoidal map

Approach: randomized-incremental construction of \mathcal{T} and \mathcal{D}

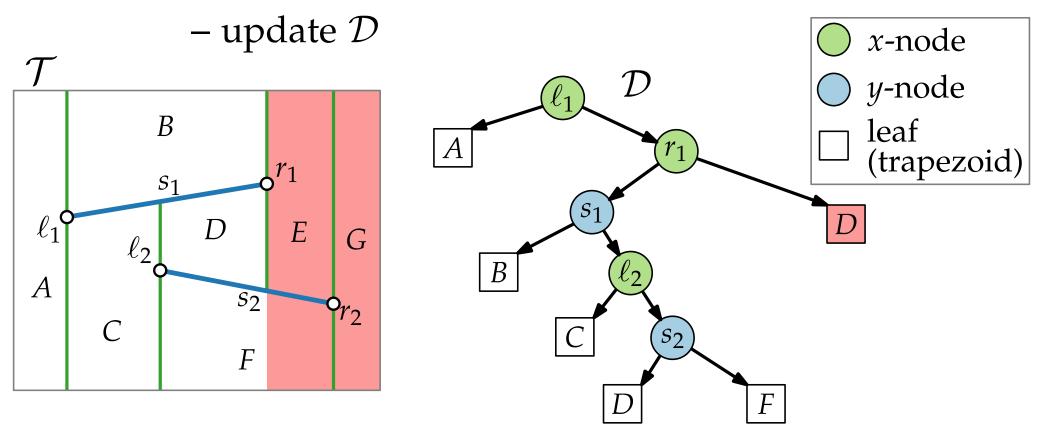
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point-location data structure (DAG) trapezoidal map

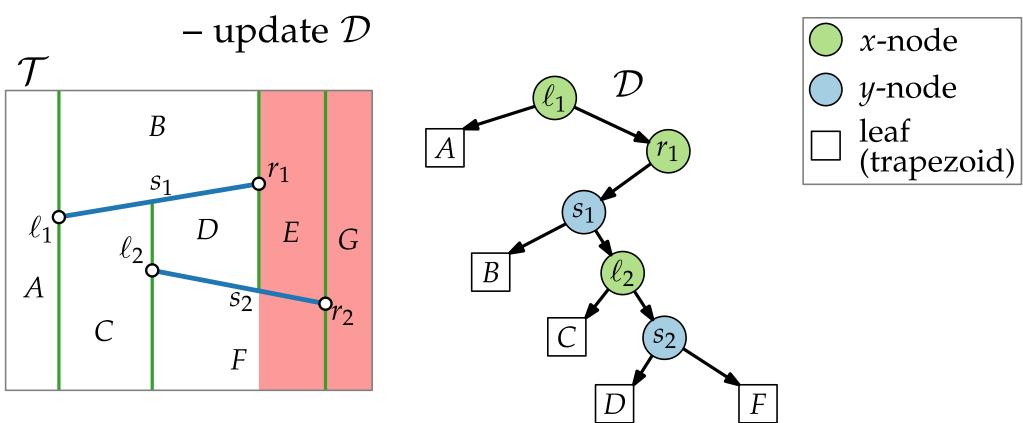
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point-location data structure (DAG) trapezoidal map

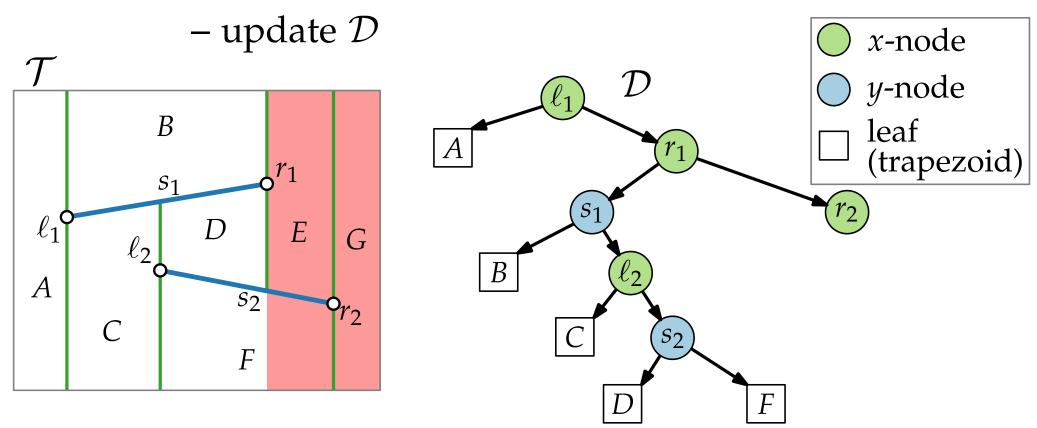
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point-location data structure (DAG) trapezoidal map

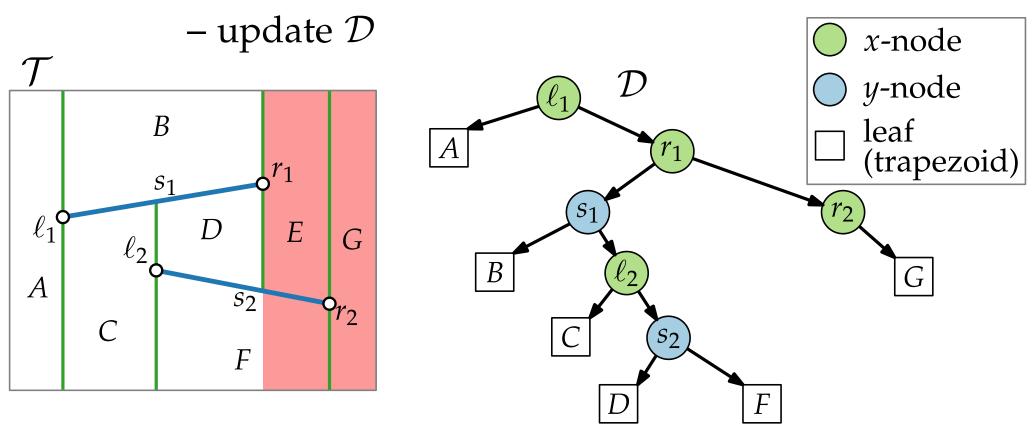
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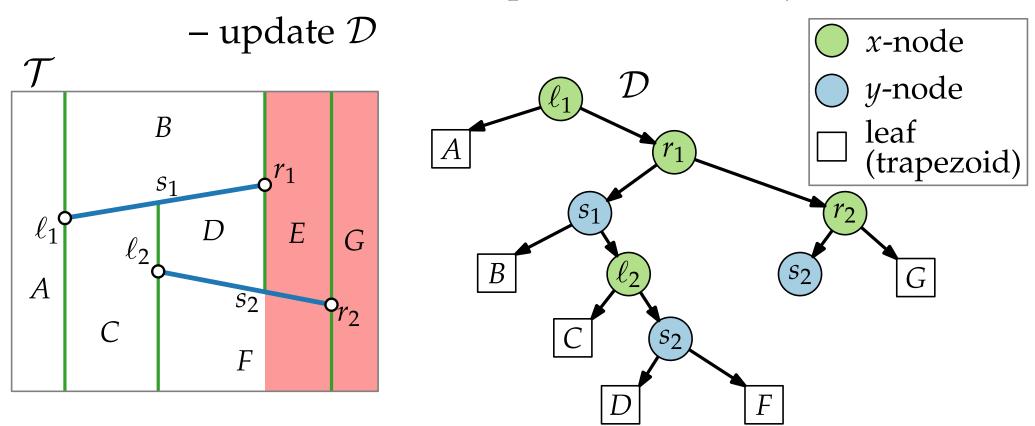
point-location data structure (DAG) trapezoidal map

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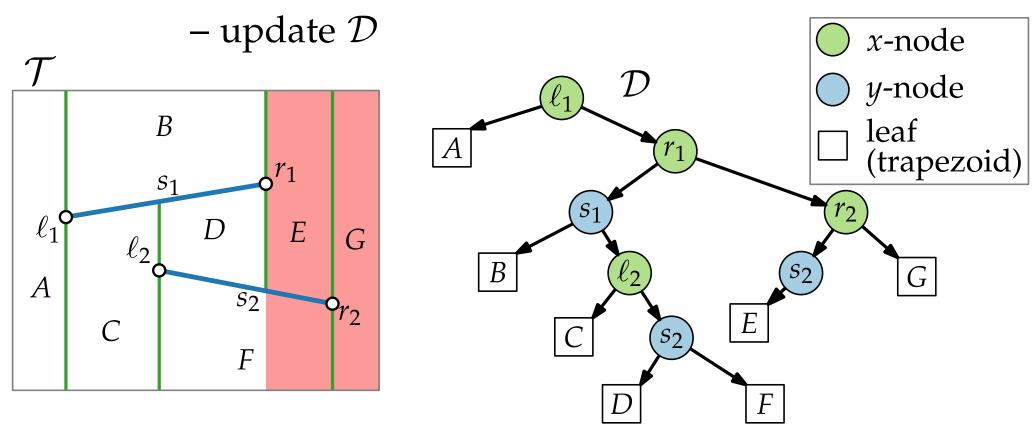
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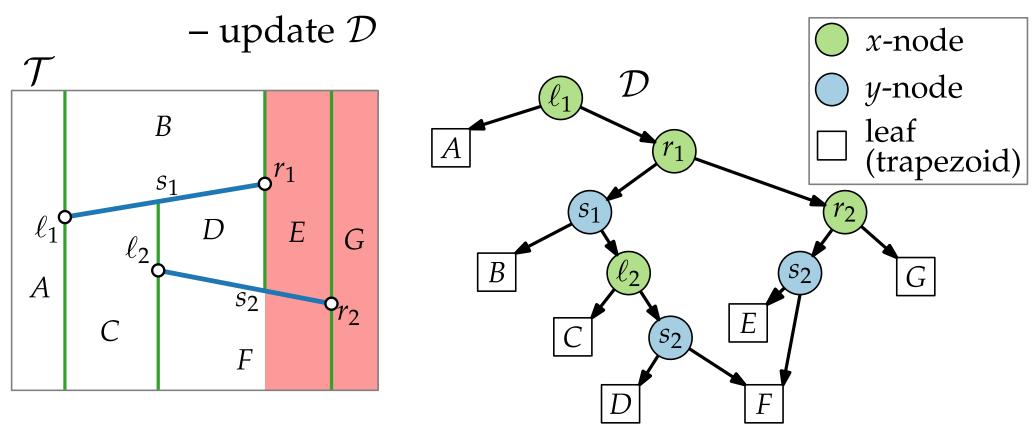
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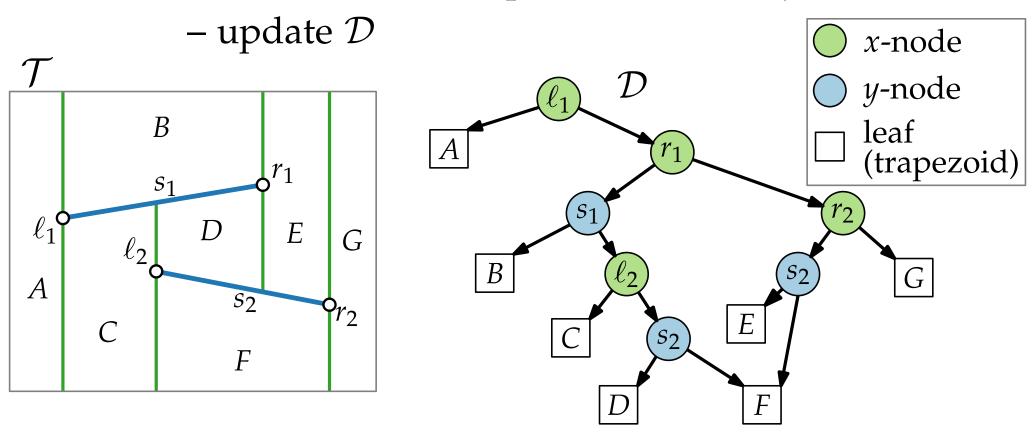
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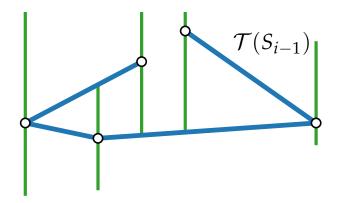


point-location data structure (DAG) trapezoidal map

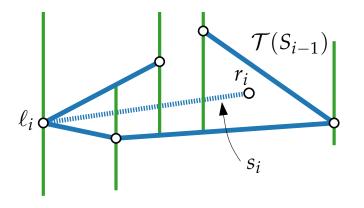
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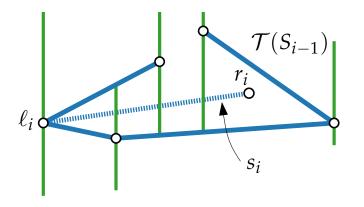
Walking through \mathcal{T} and Updating \mathcal{D}



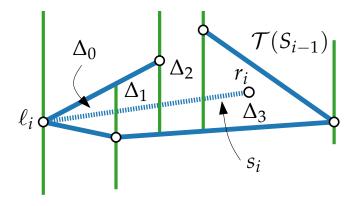
TrapezoidalMap(set *S* of *n* non-crossing segments) $R = BBox(S); \mathcal{T}.init(); \mathcal{D}.init()$ $(s_1, s_2, ..., s_n) = RandomPermutation(S)$ **for** i = 1 **to** *n* **do**



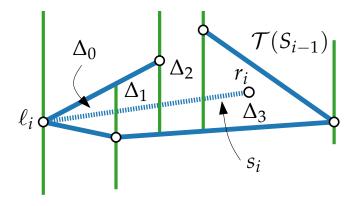
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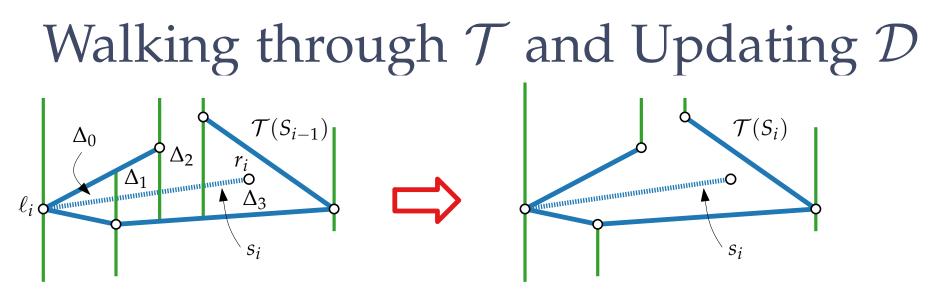
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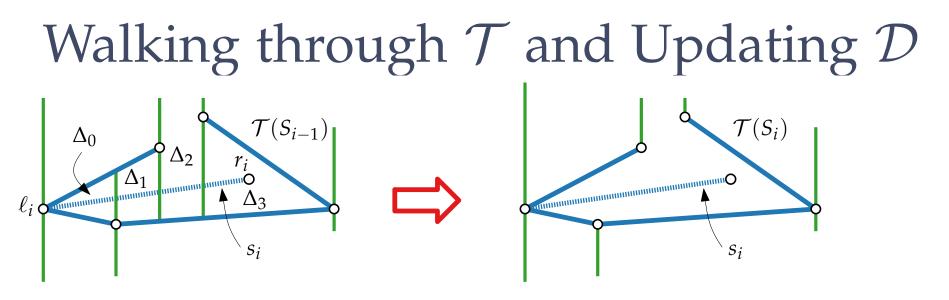
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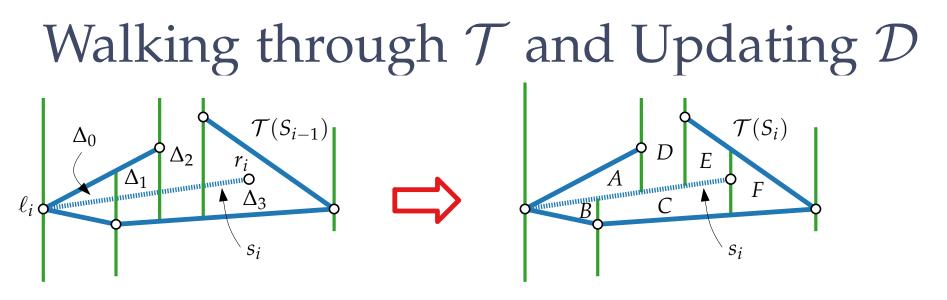
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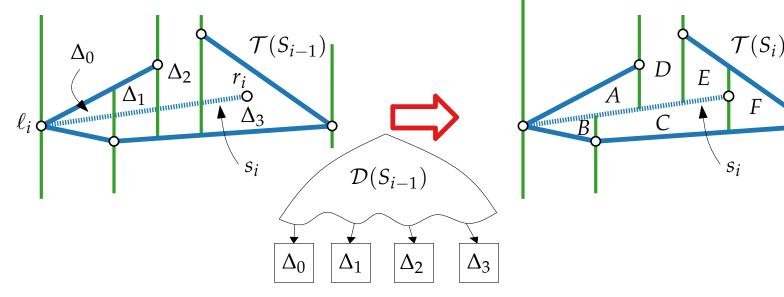
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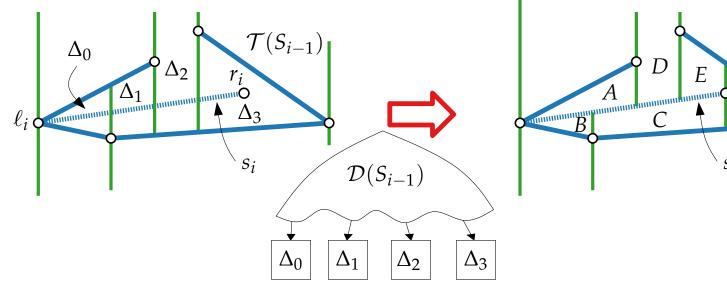
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 $\mathcal{T}(S_i)$

 S_i



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11 - 11 Walking through \mathcal{T} and Updating \mathcal{D} $\mathcal{T}(S_{i-1})$ $\mathcal{T}(S_i)$ Δ_0 D Δ_2 E r_i uuuuuC B - Δ_3 $\mathcal{D}(S_i)$ S_i S_i $\mathcal{D}(S_{i-1})$ $\mathcal{D}(S_{i-1})$ Δ_3 Δ_1 Δ_2 Δ_0

TrapezoidalMap(set *S* of *n* non-crossing segments) $R = BBox(S); \mathcal{T}.init(); \mathcal{D}.init()$ $(s_1, s_2, \dots, s_n) = RandomPermutation(S)$ **for** i = 1 **to** *n* **do** $(\Delta_0, \dots, \Delta_k) = FollowSegment(\mathcal{T}, \mathcal{D}, s_i)$ $\mathcal{T}.remove(\Delta_0, \dots, \Delta_k)$ $\mathcal{T}.add(new trapezoids incident to s_i)$ $\mathcal{D}.remove_leaves(\Delta_0, \dots, \Delta_k)$

 $\mathcal{T}(S_i)$

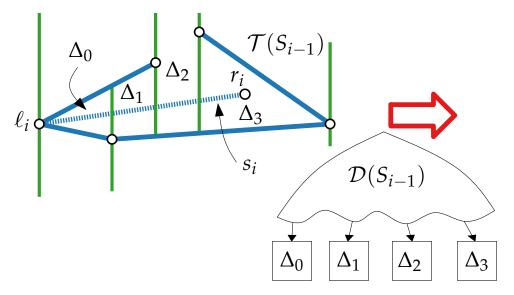
D

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E

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 S_i



TrapezoidalMap(set *S* of *n* non-crossing segments) $R = BBox(S); \mathcal{T}.init(); \mathcal{D}.init()$ $(s_1, s_2, \dots, s_n) = RandomPermutation(S)$ **for** i = 1 **to** *n* **do** $(\Delta_0, \dots, \Delta_k) = FollowSegment(\mathcal{T}, \mathcal{D}, s_i)$ $\mathcal{T}.remove(\Delta_0, \dots, \Delta_k)$ $\mathcal{T}.add(new trapezoids incident to s_i)$ $\mathcal{D}.remove_leaves(\Delta_0, \dots, \Delta_k)$ $\mathcal{D}.add_leaves(new trapezoids incident to s_i)$ $\mathcal{D}(S_i)$

 $\mathcal{D}(S_{i-1})$

Walking through \mathcal{T} and Updating \mathcal{D} $\mathcal{T}(S_{i-1})$ $\mathcal{T}(S_i)$ Δ_0 D Δ_2 E r_i ,Ó uuuuuC B - Δ_3 $\mathcal{D}(S_i)$ S_i S_i $\mathcal{D}(S_{i-1})$ $\mathcal{D}(S_{i-1})$ Δ_3 Δ_1 Δ_0 Δ_2 F В D TrapezoidalMap(set *S* of *n* non-crossing segments) Ε $R = BBox(S); \mathcal{T}.init(); \mathcal{D}.init()$ $(s_1, s_2, \ldots, s_n) =$ RandomPermutation(S)A for i = 1 to n do $(\Delta_0, \ldots, \Delta_k) = \text{FollowSegment}(\mathcal{T}, \mathcal{D}, s_i)$ \mathcal{T} .remove $(\Delta_0, \ldots, \Delta_k)$ \mathcal{T} .add(new trapezoids incident to s_i) \mathcal{D} .remove_leaves $(\Delta_0, \ldots, \Delta_k)$ \mathcal{D} .add_leaves(new trapezoids incident to s_i)

11 - 13

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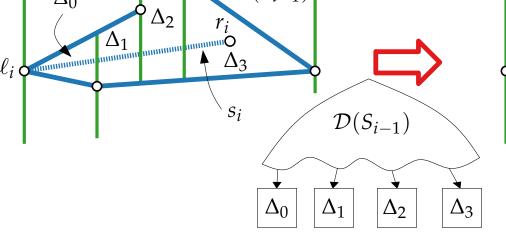
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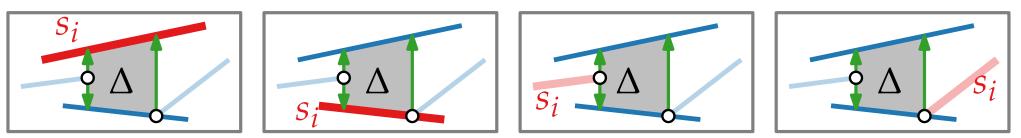
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bound *p_i*. *Backwards analysis!*

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 - i.e., prob. that Δ changes when inserting s_i .
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- **Tool:** Backwards analysis!
- p_i = prob. that Δ changes when s_i is removed

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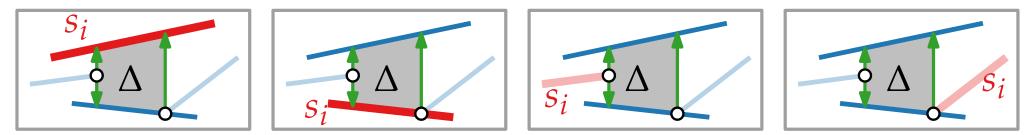
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Four cases:



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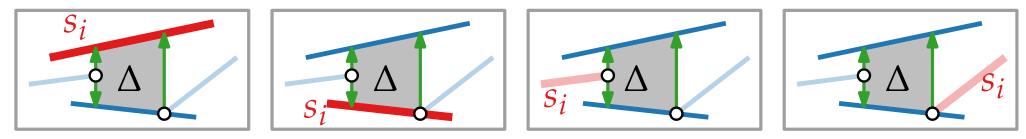
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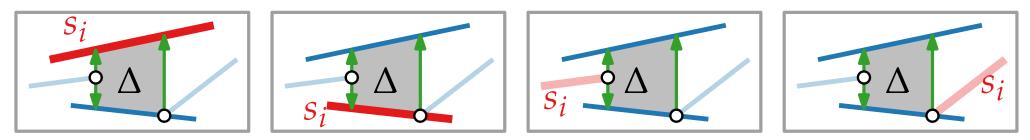
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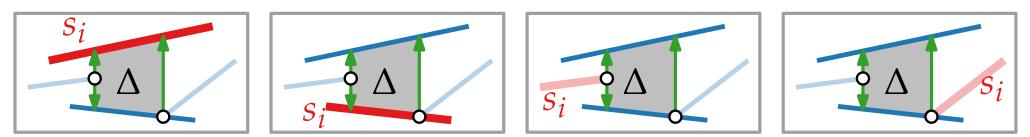
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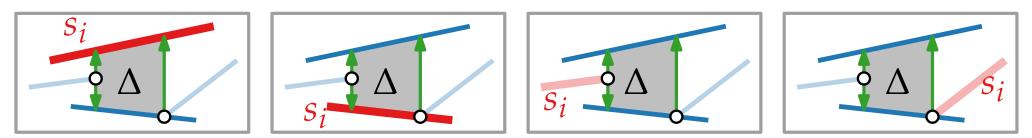
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