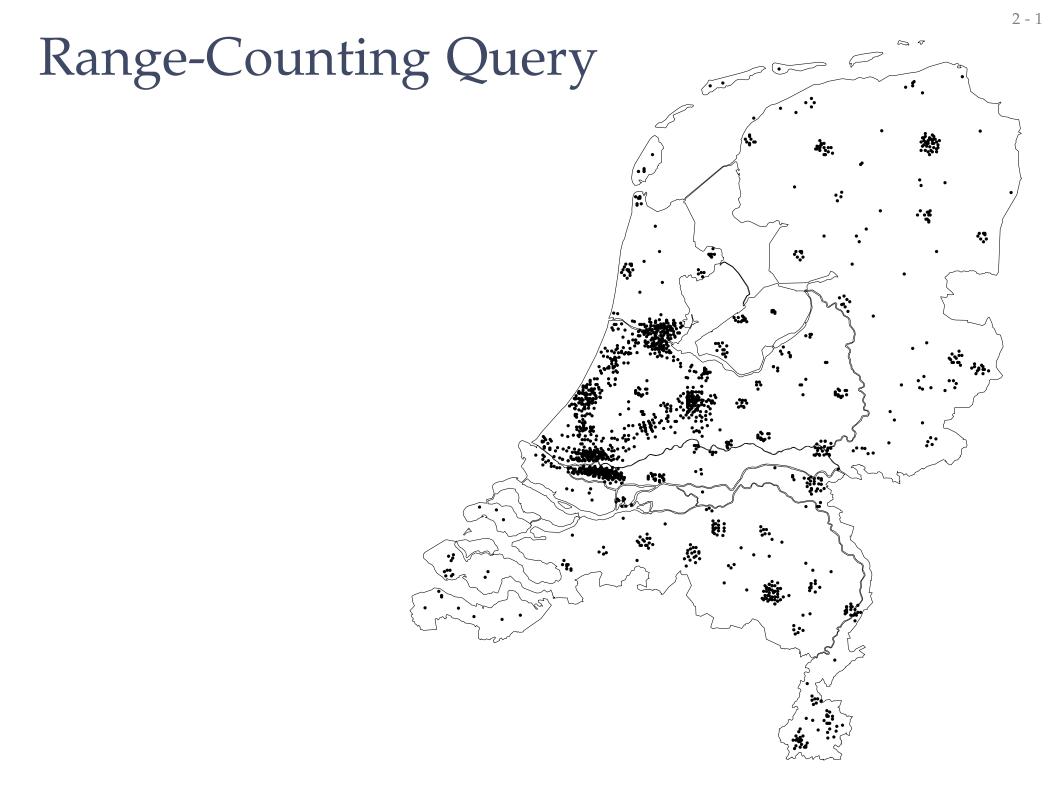
# **Computational Geometry**

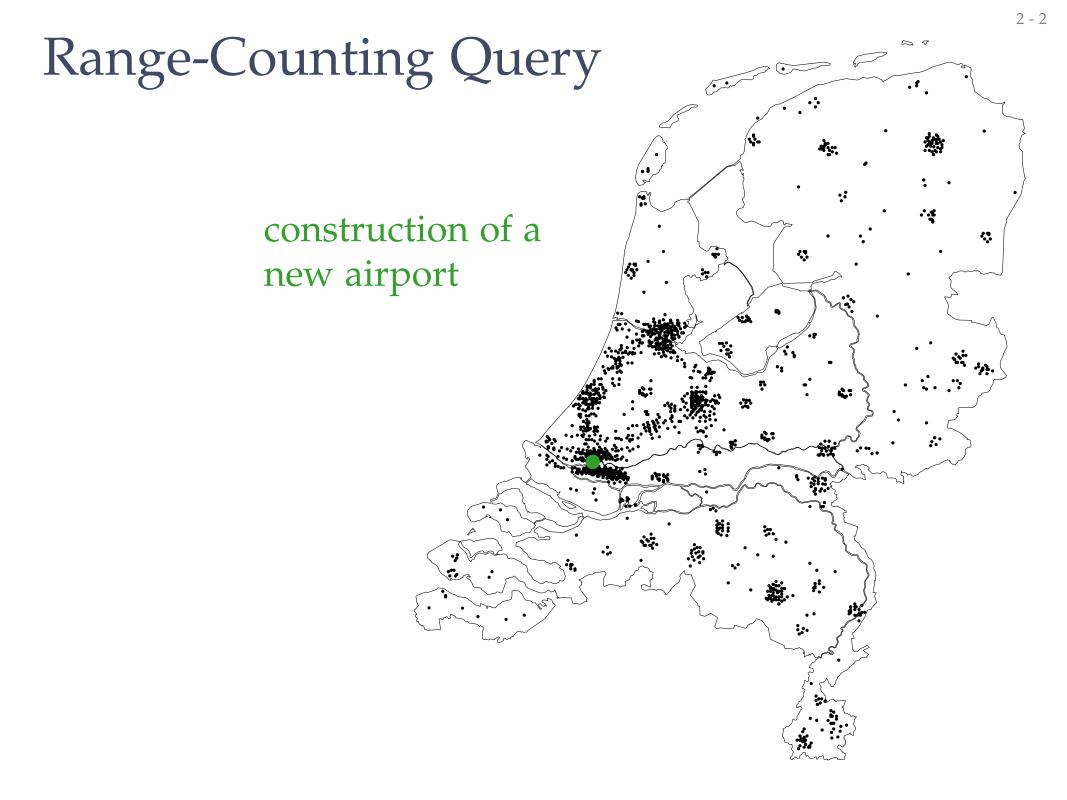
# Lecture 11: Simple Range Searching

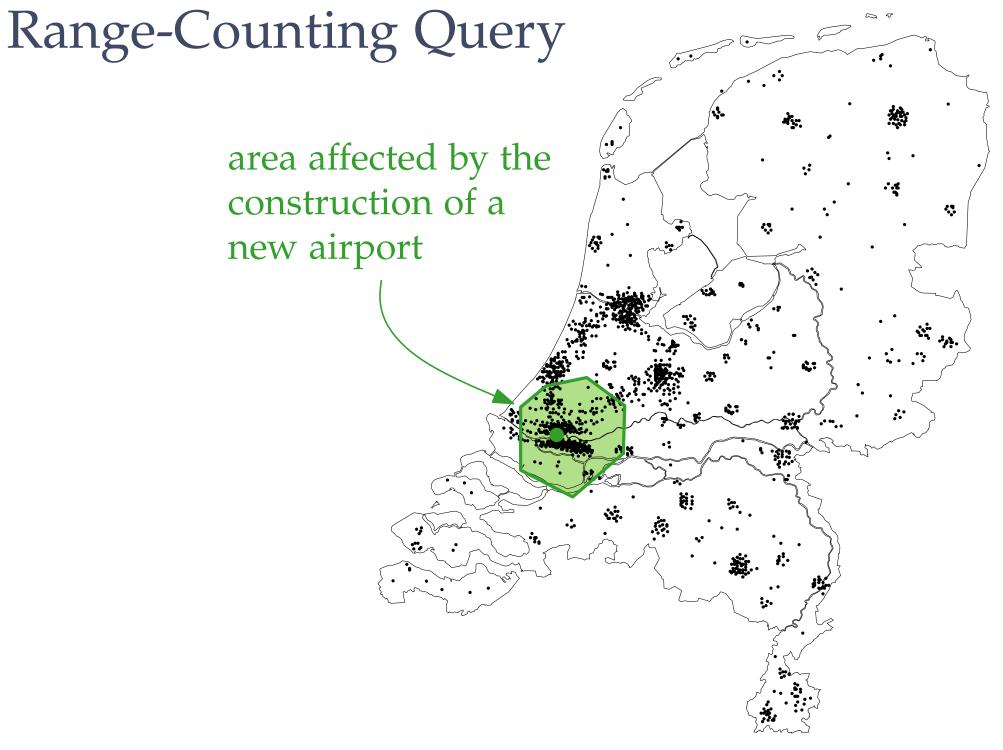
#### Part I: The 1-Dimensional Case

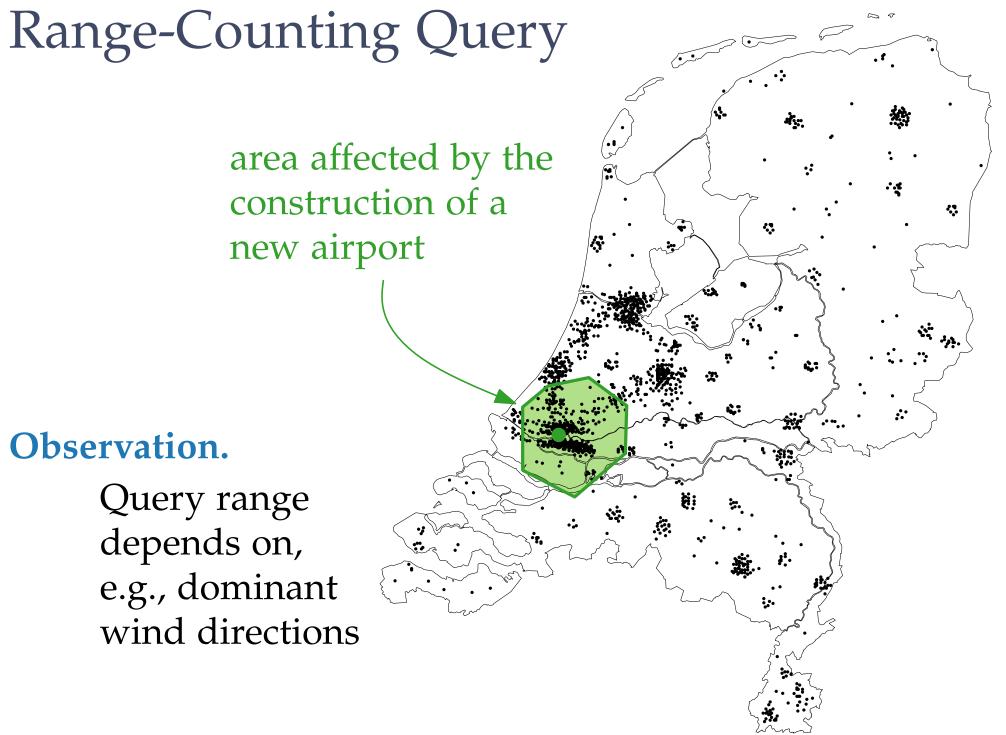
Philipp Kindermann

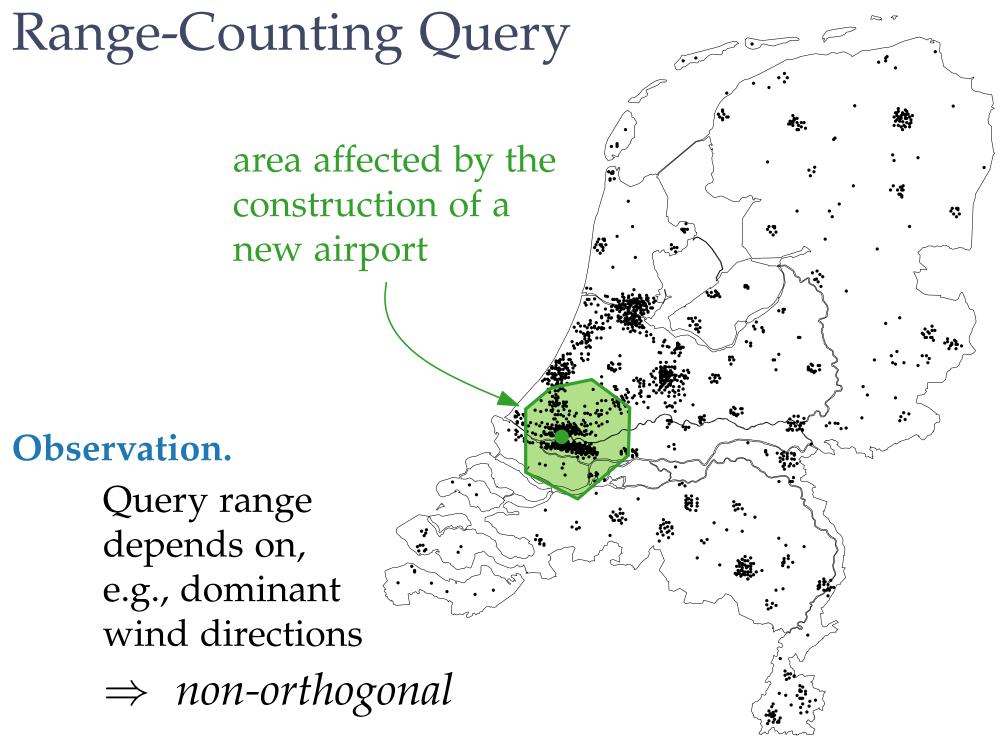
Winter Semester 2020

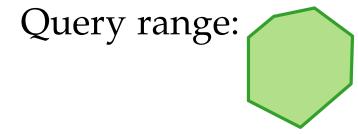


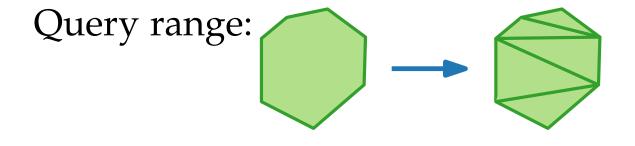


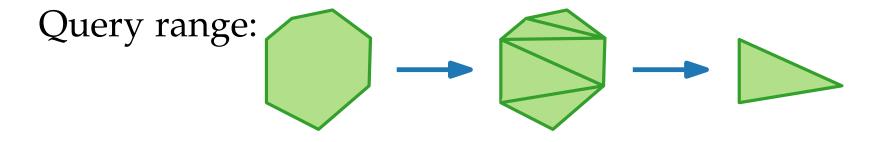


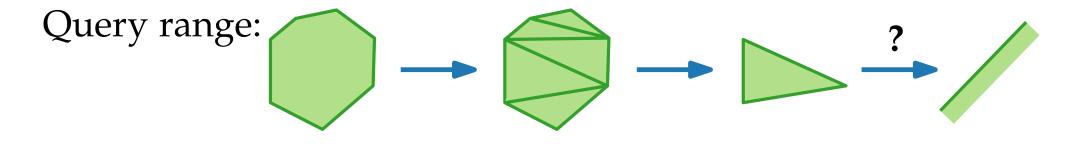




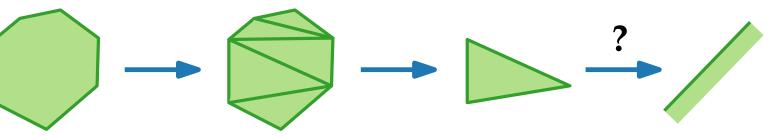








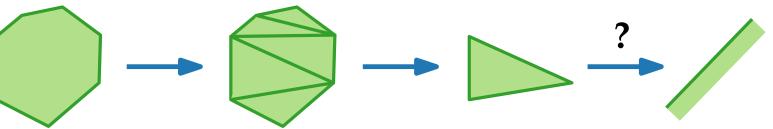
Query range:



Problem.

Given a set *P* of *n* points, preprocess *P* such that *half-space range-counting queries* can be answered quickly.

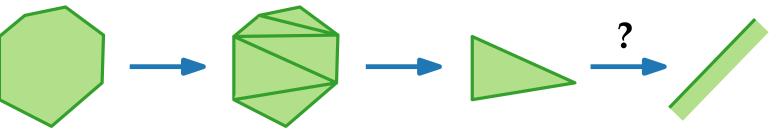
Query range:



**Problem.** Given a set *P* of *n* points, preprocess *P* such that *half-space range-counting queries* can be answered quickly.

Task.Design a data structure for the 1-dim. case:

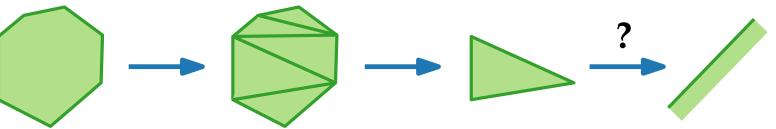
Query range:



- **Problem.** Given a set *P* of *n* points, preprocess *P* such that *half-space range-counting queries* can be answered quickly.
- Task.Design a data structure for the 1-dim. case:

– Given a number *x*, return  $|P \cap [x, \infty)|$ .

Query range:



**Problem.** Given a set *P* of *n* points, preprocess *P* such that *half-space range-counting queries* can be answered quickly.

Task.Design a data structure for the 1-dim. case:

- Given a number *x*, return  $|P \cap [x, \infty)|$ .
- Consider *P* static / dynamic!

#### Task.Design a data structure for the 1-dim. case!

Solution.

#### Task.Design a data structure for the 1-dim. case!

**Solution. use** balanced binary search trees

Task.Design a data structure for the 1-dim. case!

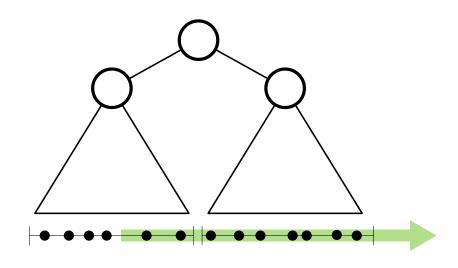
# Solution. use balanced binary search trees augment each node with the number of nodes in its subtree [see Cormen et al., *Introduction to Algorithms*, MIT press, 3rd ed., 2009]

Task.Design a data structure for the 1-dim. case!

#### **Solution. use** balanced binary search trees

augment each node with the number of nodes in its subtree [see Cormen et al.,

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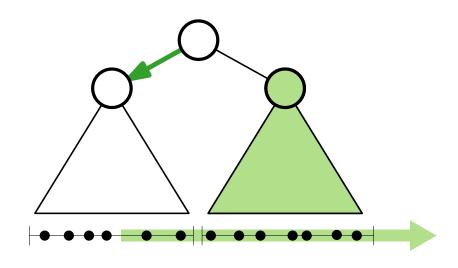


Task.Design a data structure for the 1-dim. case!

#### **Solution. use** balanced binary search trees

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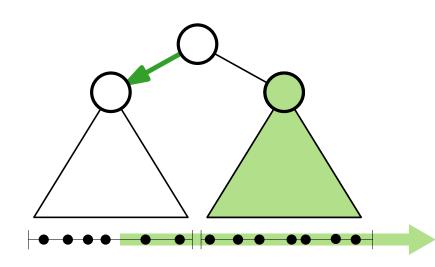
*Introduction to Algorithms,* MIT press, 3rd ed., 2009]

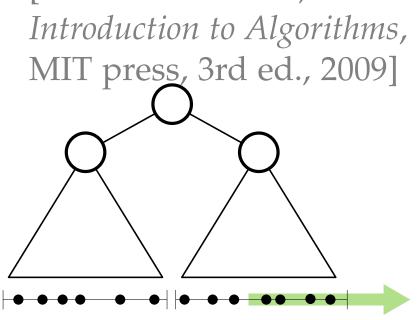


Task.Design a data structure for the 1-dim. case!

#### **Solution. use** balanced binary search trees

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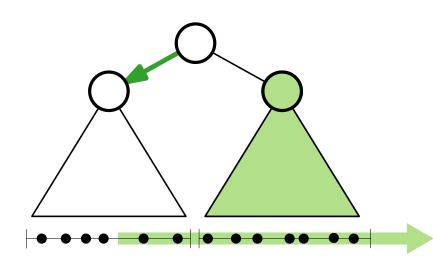


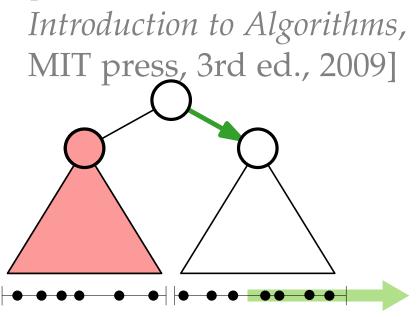


Task.Design a data structure for the 1-dim. case!

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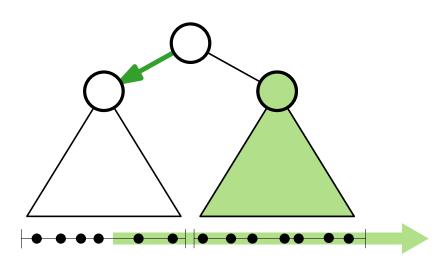


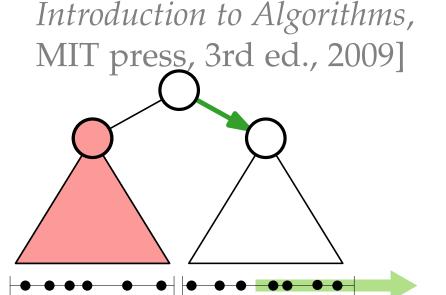


Task.Design a data structure for the 1-dim. case!

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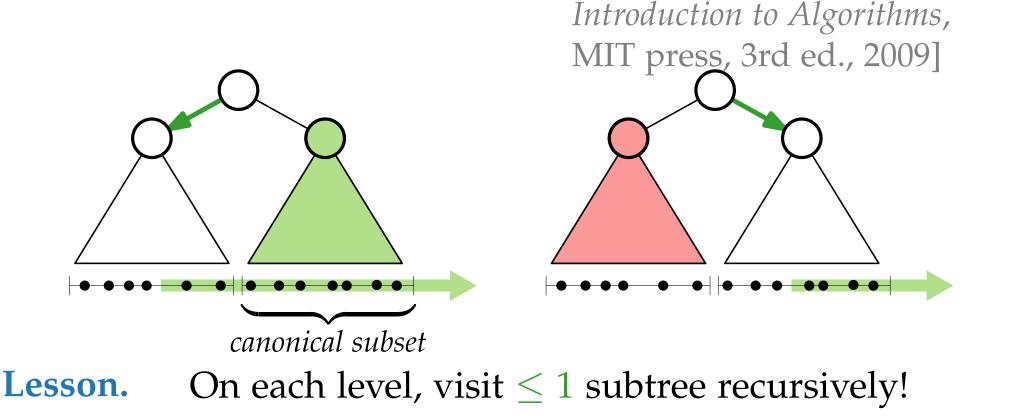


**Lesson.** On each level, visit  $\leq 1$  subtree recursively!

Task.Design a data structure for the 1-dim. case!

**Solution. use** balanced binary search trees

augment each node with the number of nodes in its subtree [see Cormen et al.,



# **Computational Geometry**

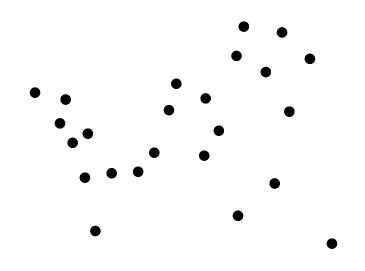
# Lecture 11: Simple Range Searching

#### Part II: Generalizing to 2 Dimensions

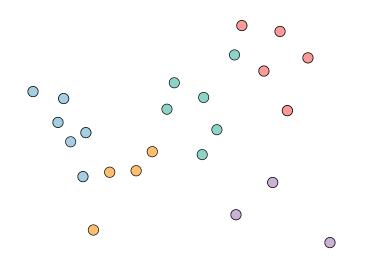
Philipp Kindermann

Winter Semester 2020

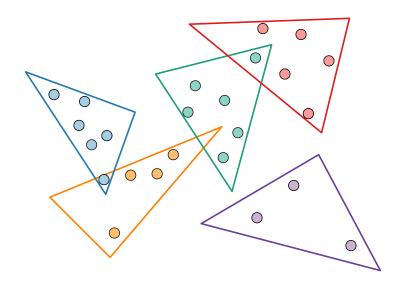
Any ideas?



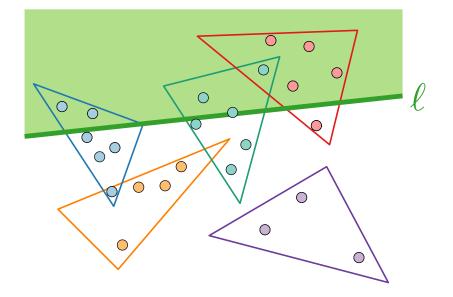
Any ideas?



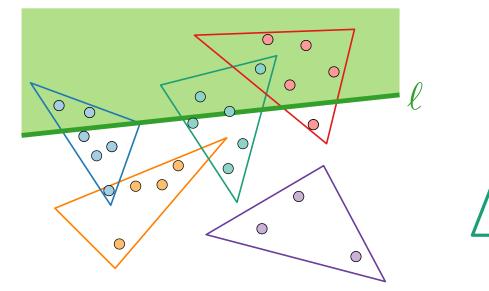
#### Partition the input!

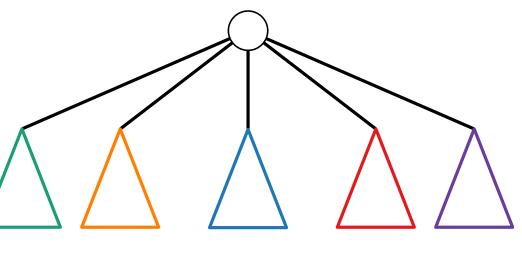


Partition the input! Query...

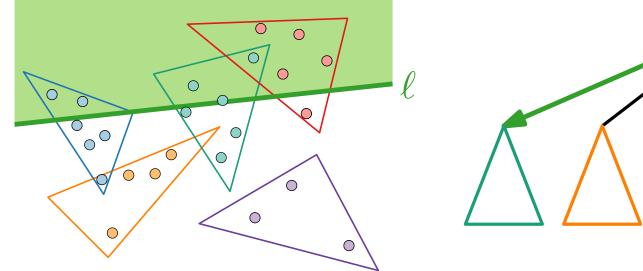


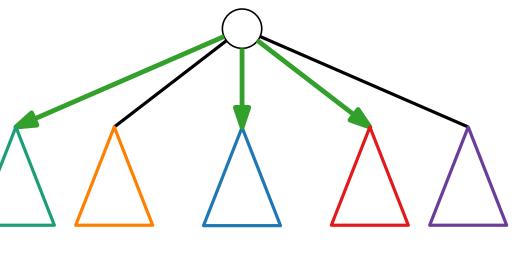
Partition the input! Query... in a *partition tree* 



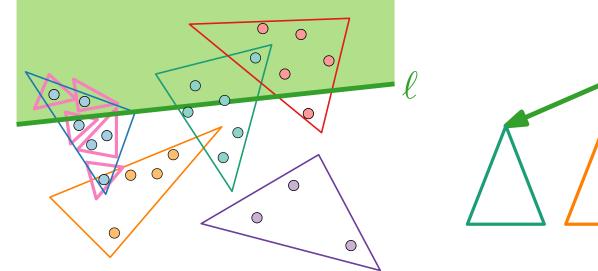


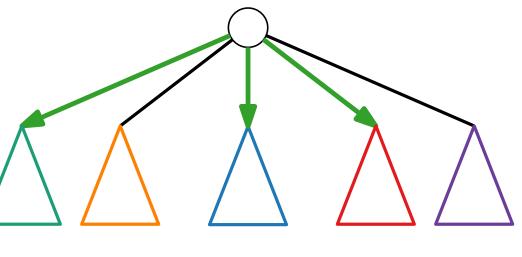
Partition the input! Query... in a *partition tree* 



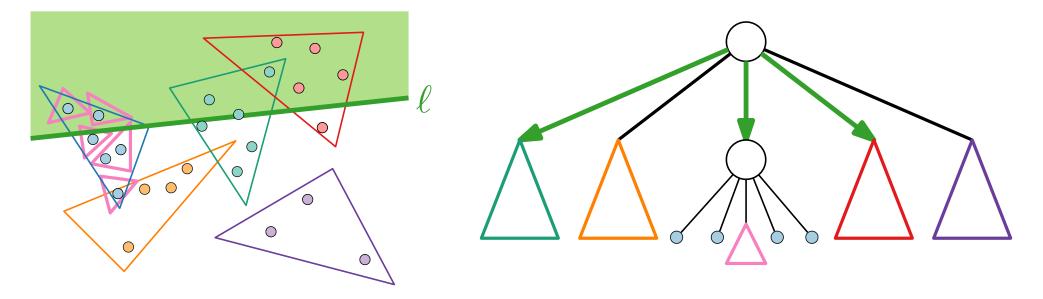


Partition the input! Query... in a *partition tree* 

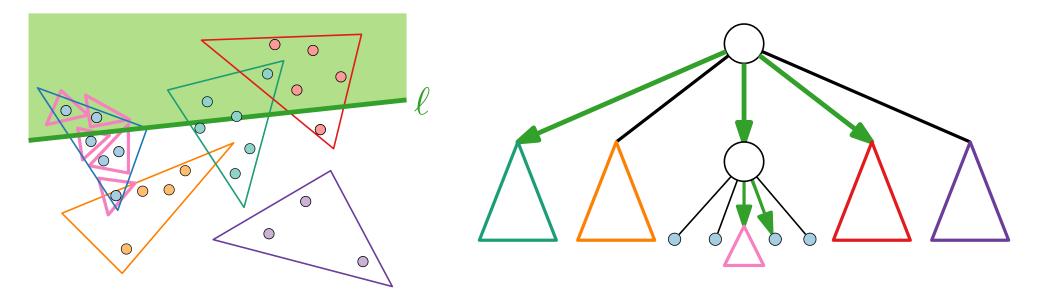




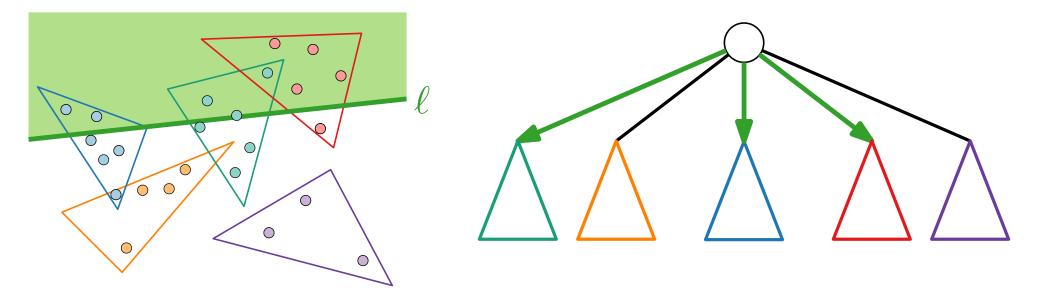
Partition the input! Query... in a *partition tree* ... recursively!



Partition the input! Query... in a *partition tree* ... recursively!

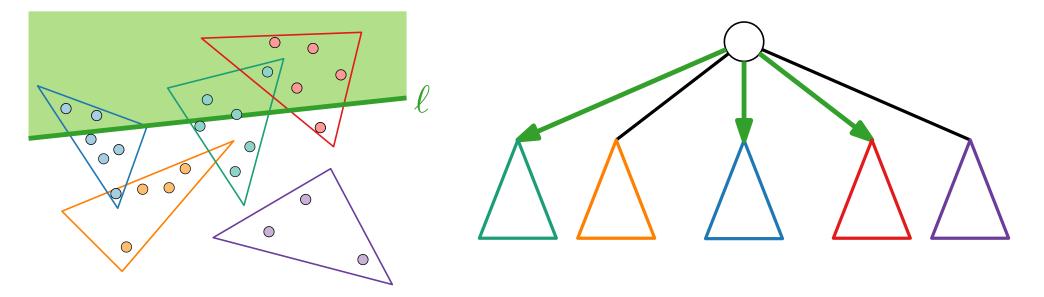


Partition the input! Query... in a *partition tree* ... recursively!



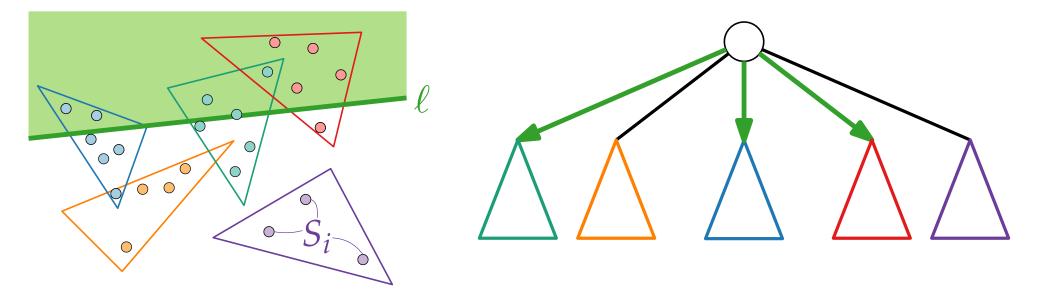
**Definition.**  $\Psi(S) = \{(S_1, t_1), (S_2, t_2), \dots, (S_r, t_r)\}$  is a *simplicial partition* (of size *r*) for *S* if

Partition the input! Query... in a *partition tree* ... recursively!



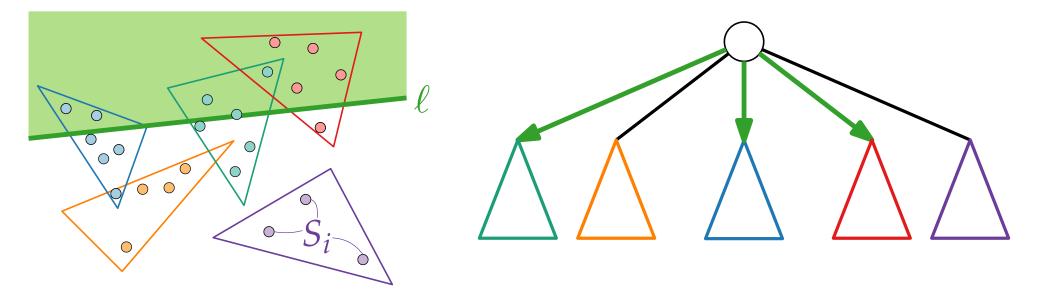
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Partition the input! Query... in a *partition tree* ... recursively!



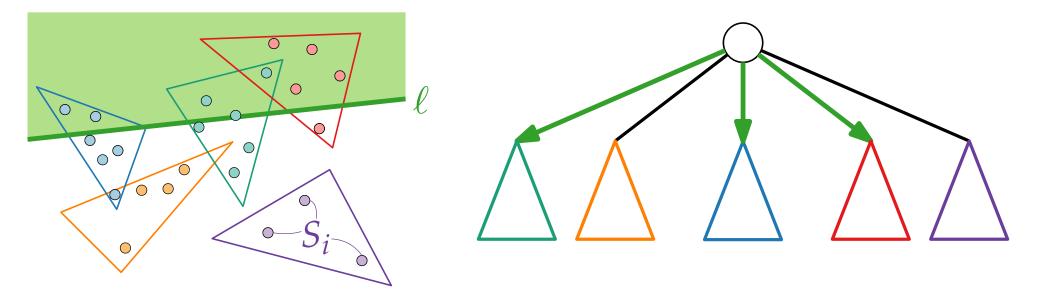
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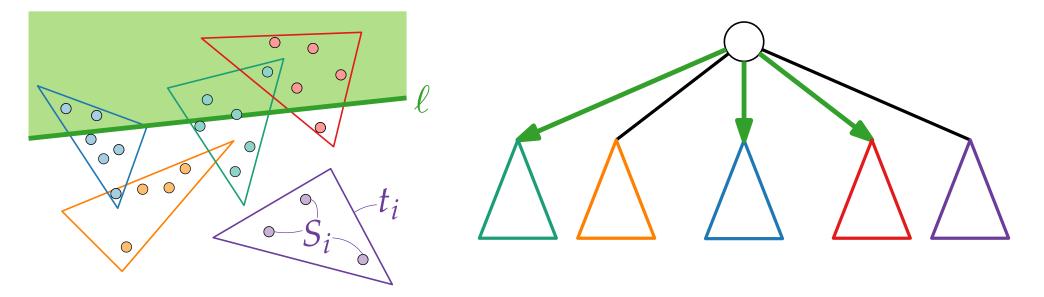
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Partition the input! Query... in a *partition tree* ... recursively!



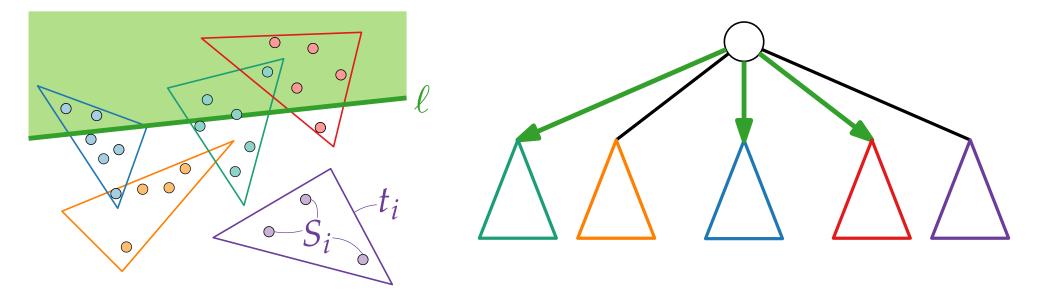
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Partition the input! Query... in a *partition tree* ... recursively!



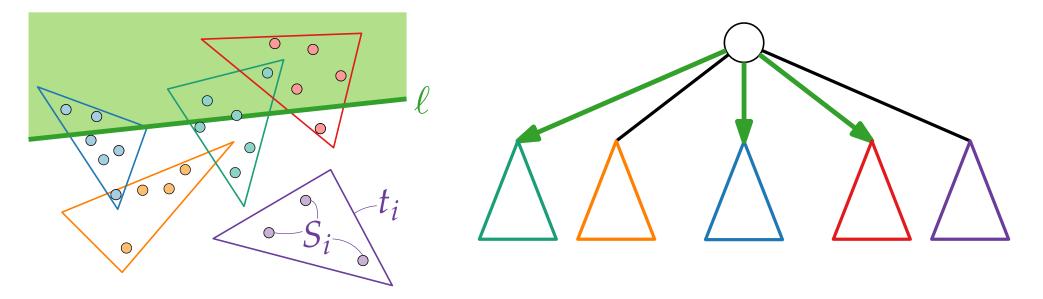
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Partition the input! Query... in a *partition tree* ... recursively!



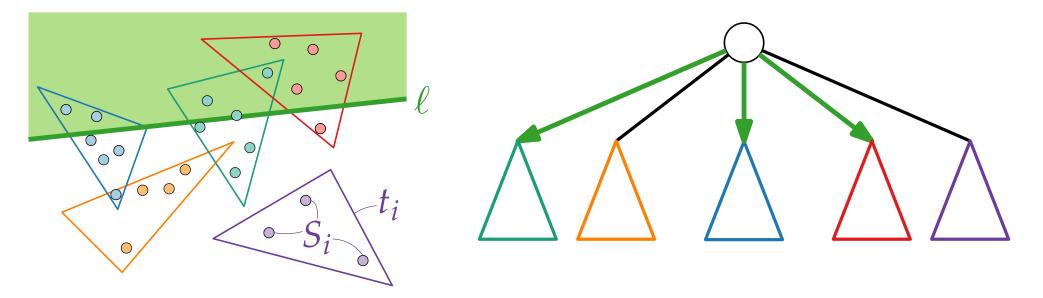
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Partition the input! Query... in a *partition tree* ... recursively!



**Definition.** The *crossing number* of  $\ell$  (w.r.t.  $\Psi(S)$ ) is the number of triangles  $t_1, \ldots, t_r$  crossed by  $\ell$ .

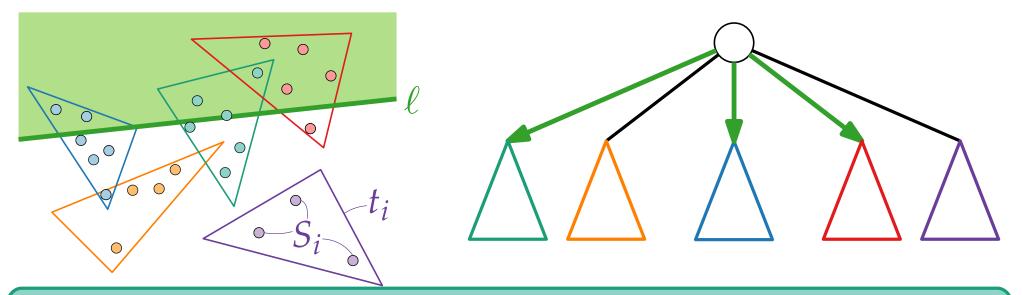
Partition the input! Query... in a *partition tree* ... recursively!



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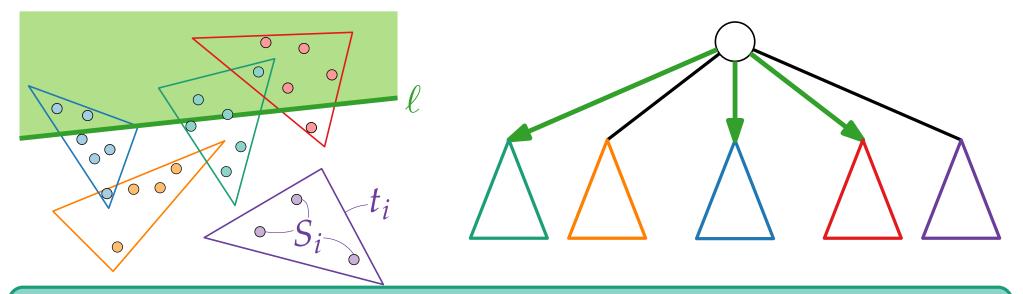
The *crossing number* of  $\Psi(S)$  is the maximum crossing number over all possible lines.

Partition the input! Query... in a *partition tree* ... recursively!



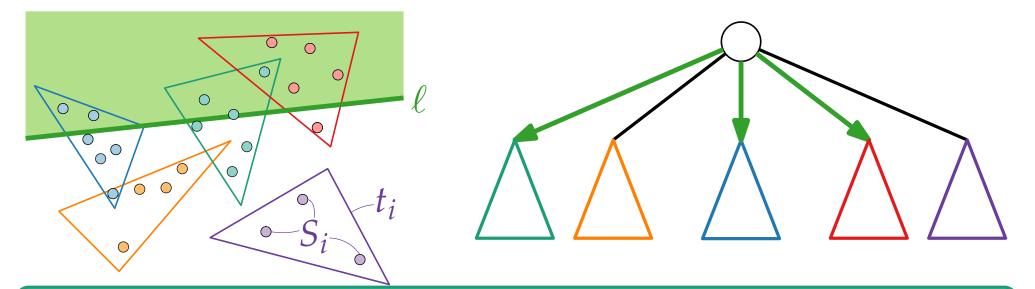
**Theorem.** For any set *S* of *n* pts and any  $1 \le r \le n$ , a fine [Matoušek, simplicial partition of size *r* and crossing DCG 1992] number O() exists.

Partition the input! Query... in a *partition tree* ... recursively!

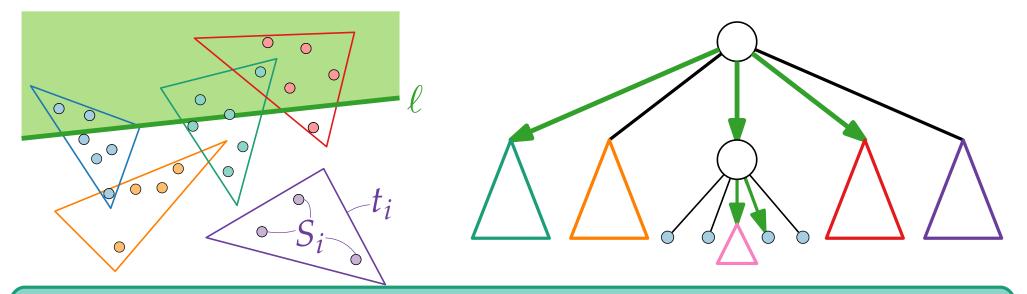


**Theorem.** For any set *S* of *n* pts and any  $1 \le r \le n$ , a fine [Matoušek, simplicial partition of size *r* and crossing DCG 1992] number  $O(\sqrt{r})$  exists.

Partition the input! Query... in a *partition tree* ... recursively!

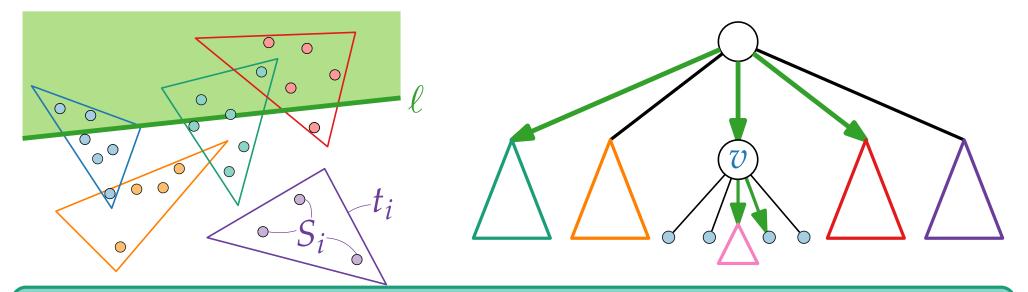


Partition the input! Query... in a *partition tree* ... recursively!

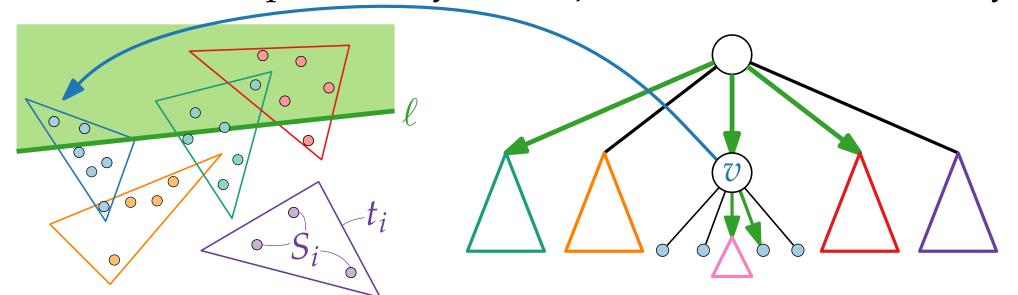


**Theorem.** For any set *S* of *n* pts and any  $1 \le r \le n$ , a fine [Matoušek, simplicial partition of size *r* and crossing DCG 1992] number  $O(\sqrt{r})$  exists. For any  $\varepsilon > 0$ , such a partition can be built in  $O(n^{1+\varepsilon})$  time.

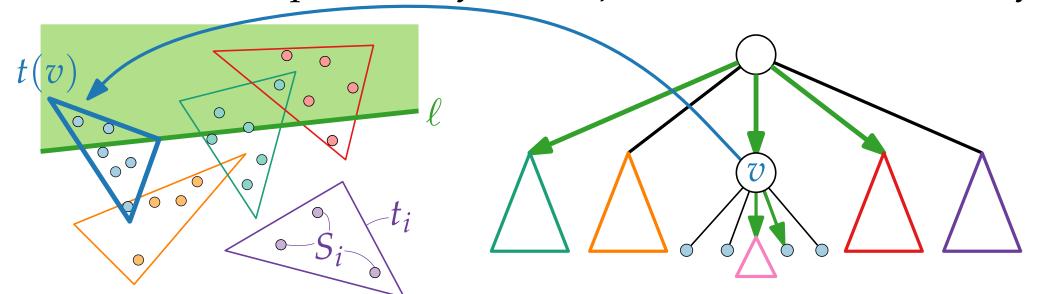
Partition the input! Query... in a *partition tree* ... recursively!



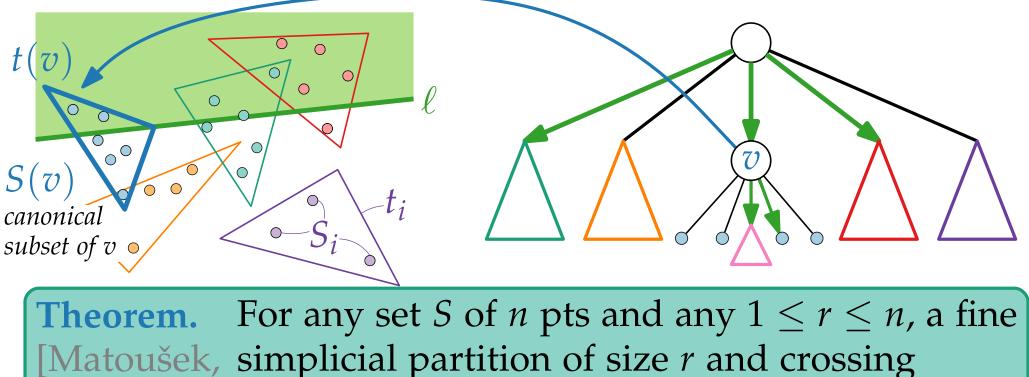
Partition the input! Query... in a *partition tree* ... recursively!



Partition the input! Query... in a *partition tree* ... recursively!

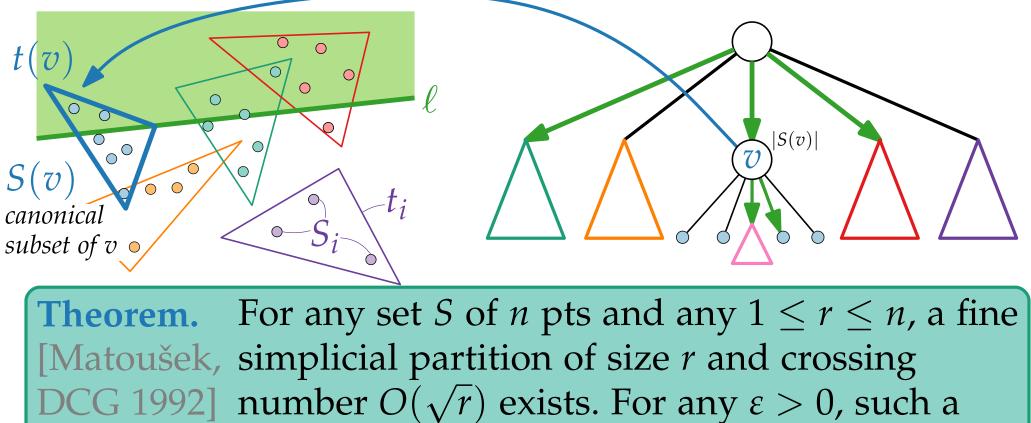


Partition the input! Query... in a *partition tree* ... recursively!



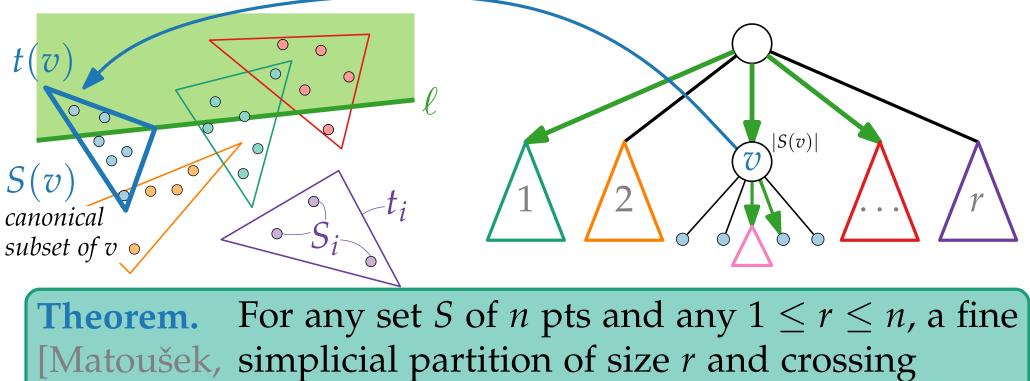
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Partition the input! Query... in a *partition tree* ... recursively!



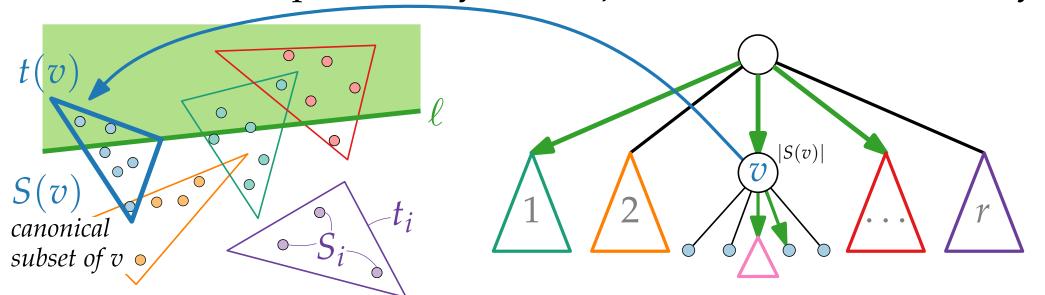
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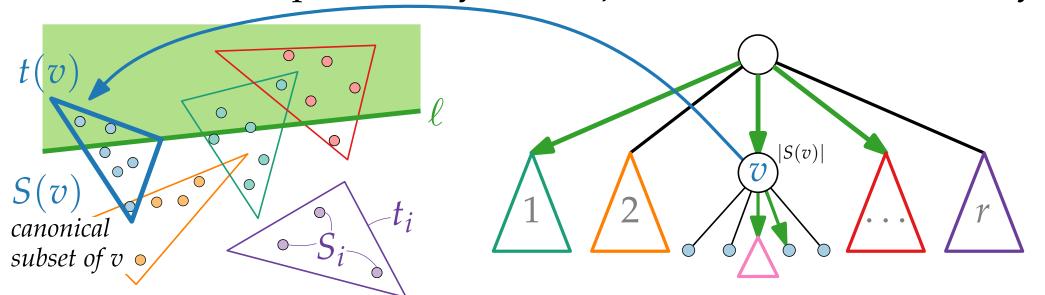


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Lemma.

A partition tree for *S* can be constructed in  $O(n^{1+\varepsilon})$  time. The tree uses O(n) storage.

Partition the input! Query... in a *partition tree* ... recursively!

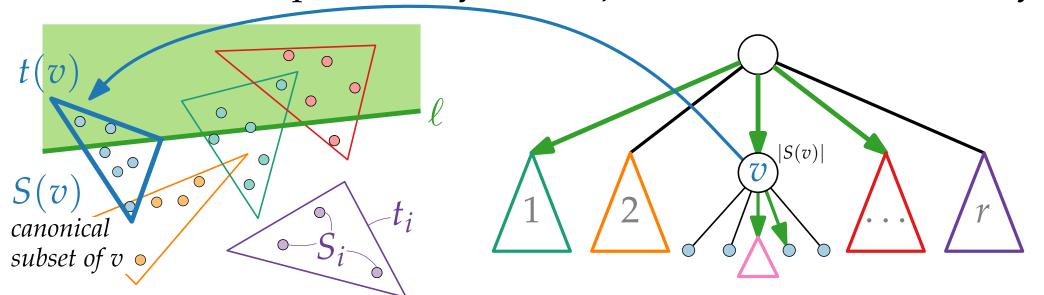


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search tree with *n* leaves

# **Computational Geometry**

### Lecture 11: Simple Range Searching

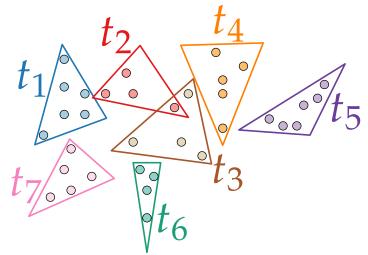
Part III: Query Algorithm

Philipp Kindermann

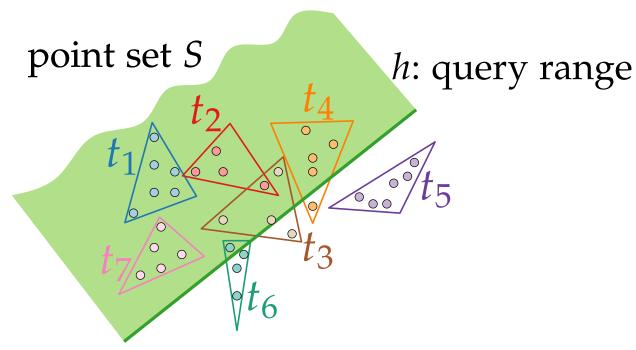
Winter Semester 2020

point set S

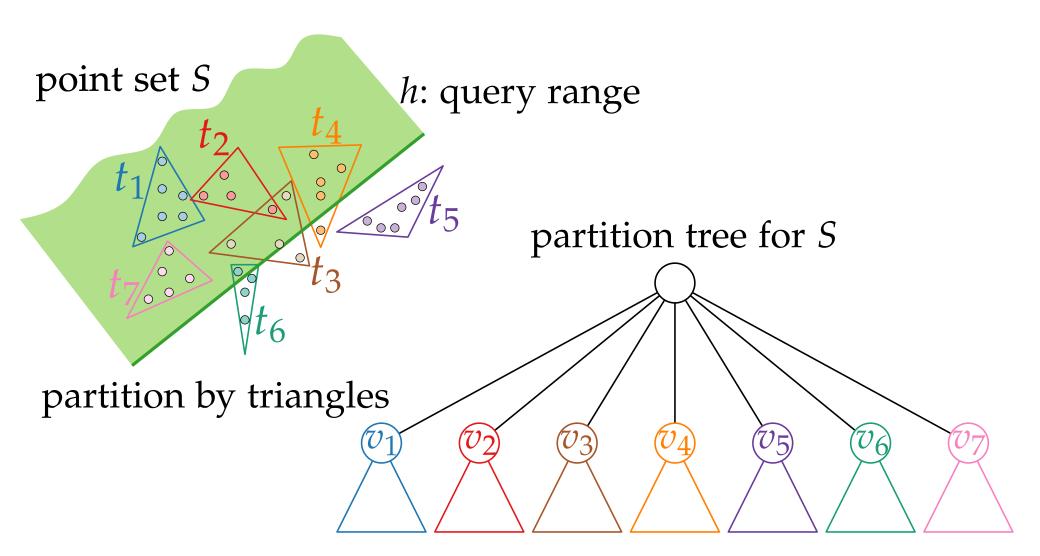
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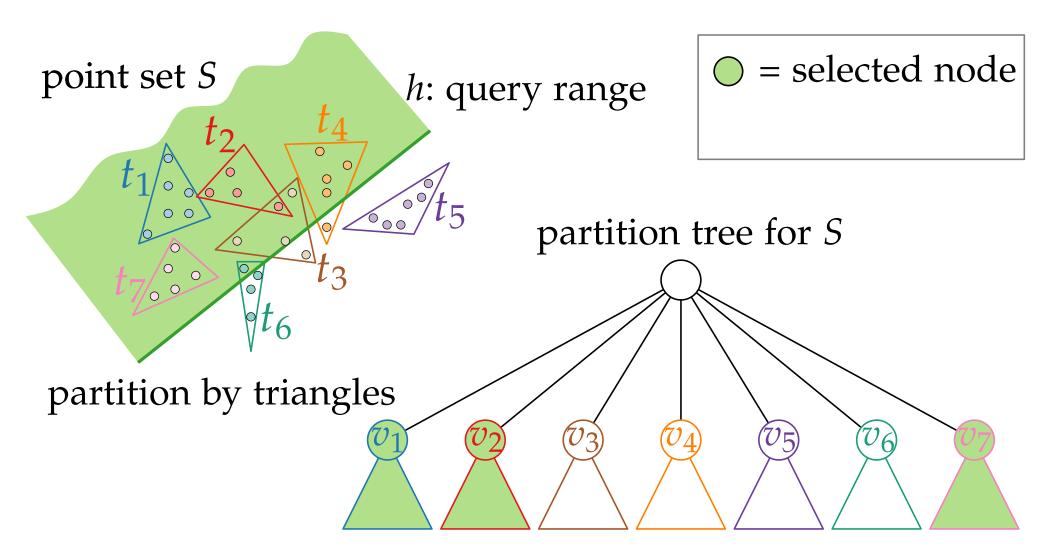


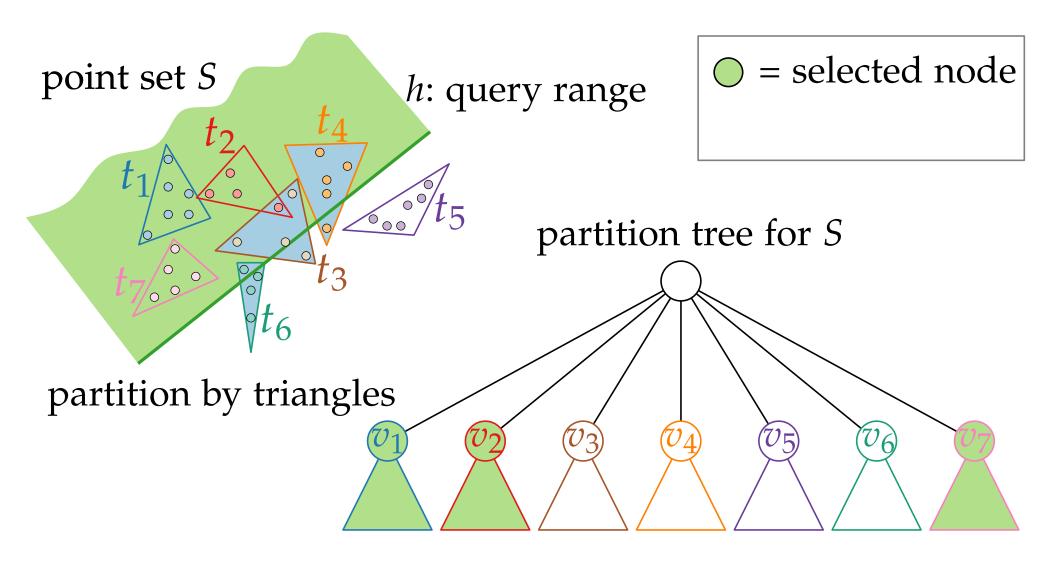
partition by triangles

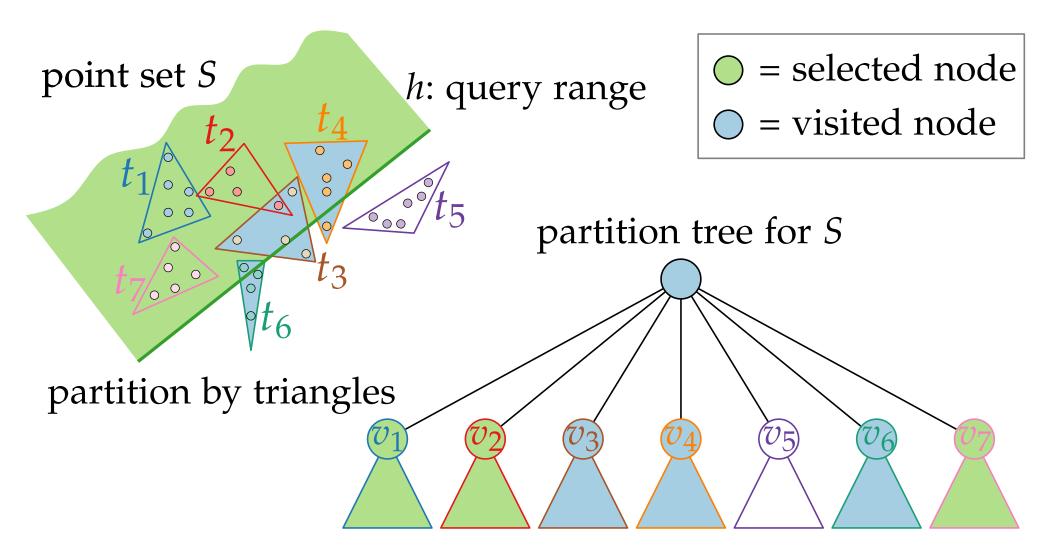


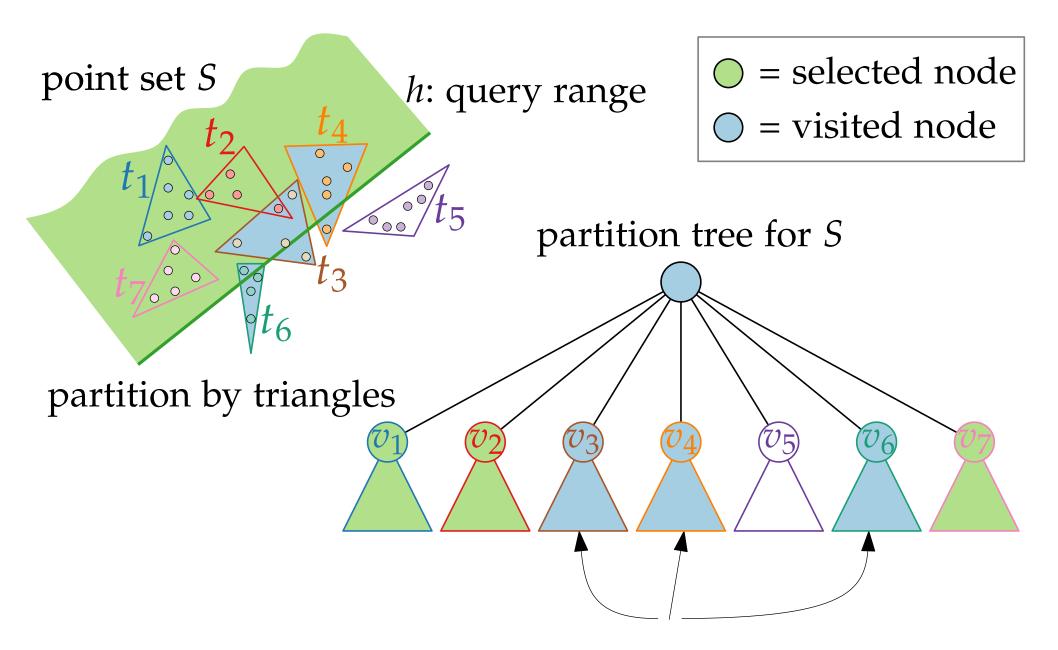
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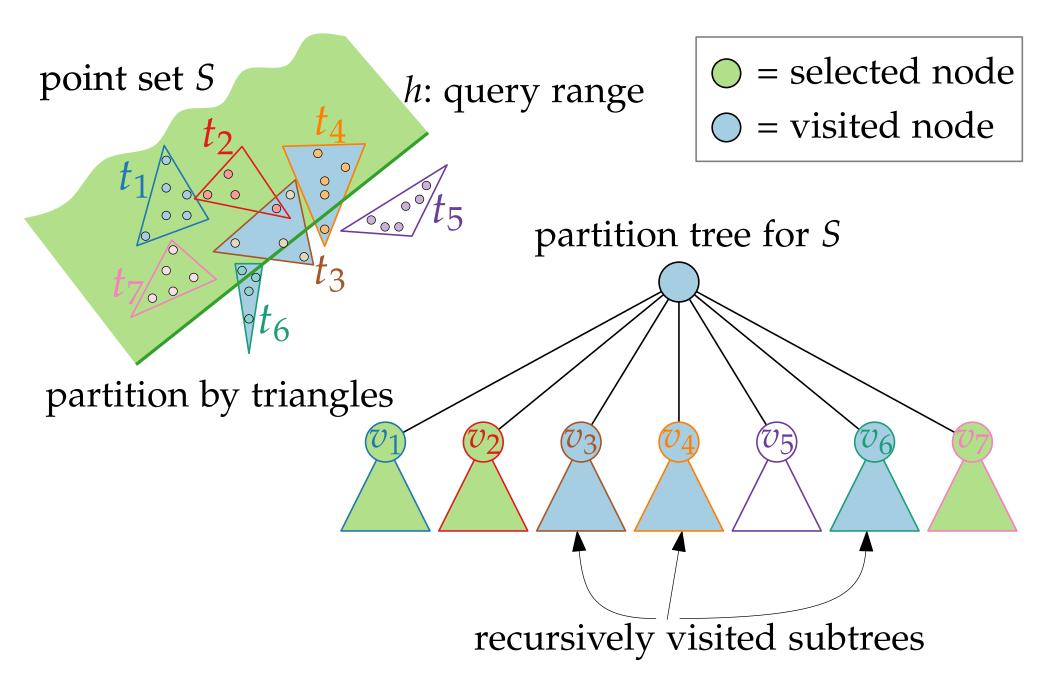






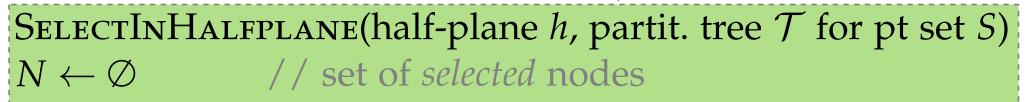






#### SELECTINHALFPLANE(half-plane h, partit. tree $\mathcal{T}$ for pt set S) $N \leftarrow \emptyset$ // set of *selected* nodes

9 - 1



```
if \mathcal{T} = \{\mu\} then
```

else

SELECTINHALFPLANE(half-plane h, partit. tree  $\mathcal{T}$  for pt set S)  $N \leftarrow \emptyset$  // set of *selected* nodes

9 - 3

#### if $\mathcal{T} = \{\mu\}$ then | if point stored at $\mu$ lies in h then | $N \leftarrow \{\mu\}$

else

SELECTINHALFPLANE(half-plane h, partit. tree  $\mathcal{T}$  for pt set S)  $N \leftarrow \emptyset$  // set of *selected* nodes

#### if $\mathcal{T} = \{\mu\}$ then | if point stored at $\mu$ lies in h then | $N \leftarrow \{\mu\}$

#### else

**foreach** child  $\nu$  of the root of  $\mathcal{T}$  **do** 

SELECTINHALFPLANE(half-plane h, partit. tree  $\mathcal{T}$  for pt set S)  $N \leftarrow \emptyset$  // set of *selected* nodes

9 - 5

```
if \mathcal{T} = \{\mu\} then
| if point stored at \mu lies in h then
| N \leftarrow \{\mu\}
```

#### else

```
foreach child \nu of the root of \mathcal{T} do | if t(\nu) \subset h then
```

else

SELECTINHALFPLANE(half-plane h, partit. tree  $\mathcal{T}$  for pt set S)  $N \leftarrow \emptyset$  // set of *selected* nodes

9 - 6

```
if \mathcal{T} = \{\mu\} then
| if point stored at \mu lies in h then
| N \leftarrow \{\mu\}
```

#### else

**foreach** child  $\nu$  of the root of  $\mathcal{T}$  **do if**  $t(\nu) \subset h$  **then**   $\mid N \leftarrow N \cup \{\nu\}$ **else** 

SELECTINHALFPLANE(half-plane h, partit. tree  $\mathcal{T}$  for pt set S)  $N \leftarrow \emptyset$  // set of *selected* nodes

```
if \mathcal{T} = \{\mu\} then
| if point stored at \mu lies in h then
| N \leftarrow \{\mu\}
```

#### else

```
foreach child v of the root of \mathcal{T} do

if t(v) \subset h then

\mid N \leftarrow N \cup \{v\}

else

\mid \mathbf{if} t(v) \cap h \neq \emptyset then
```

# Query Algorithm

```
SELECTINHALFPLANE(half-plane h, partit. tree \mathcal{T} for pt set S)
N \leftarrow \emptyset // set of selected nodes
```

```
if \mathcal{T} = \{\mu\} then
| if point stored at \mu lies in h then
| N \leftarrow \{\mu\}
```

#### else

```
foreach child v of the root of \mathcal{T} do

if t(v) \subset h then

\mid N \leftarrow N \cup \{v\}

else

if t(v) \cap h \neq \emptyset then

\mid N \leftarrow N \cup \text{SelectInHalfPlane}(h, \mathcal{T}_v)
```

**return** *N* // with  $S \cap h = \bigcup_{\nu \in N} S(\nu)$ 

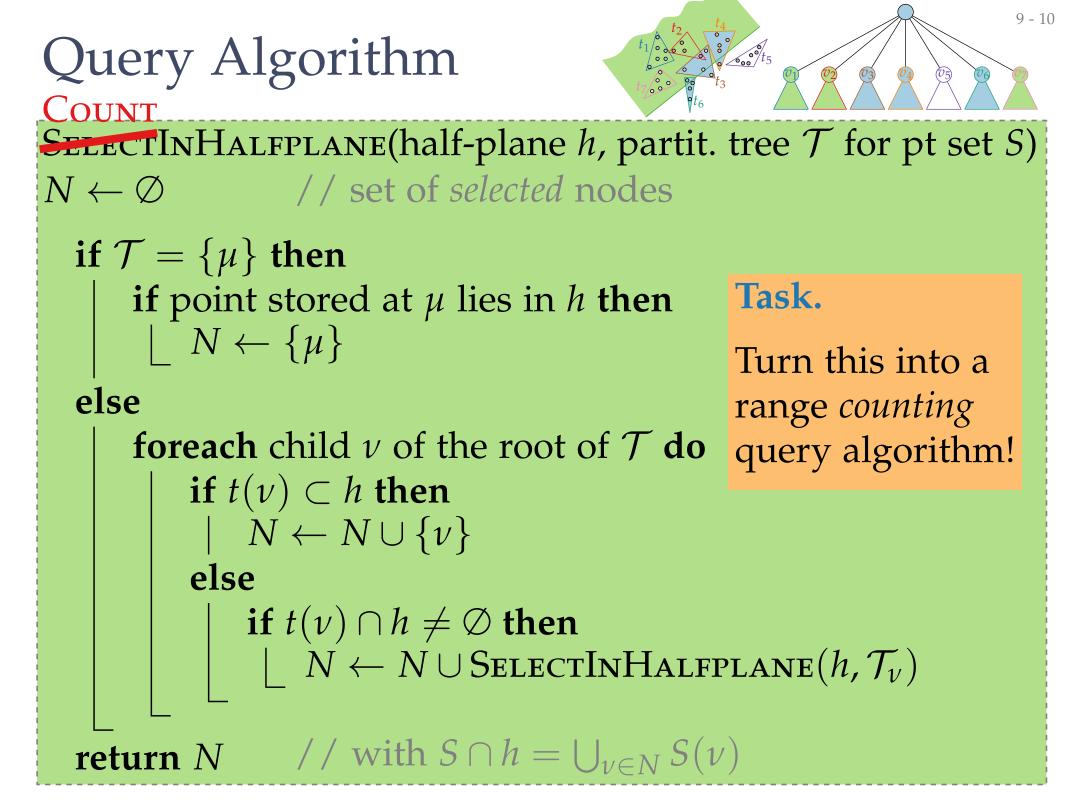
# Query Algorithm

SELECTINHALFPLANE(half-plane h, partit. tree  $\mathcal{T}$  for pt set S)  $N \leftarrow \emptyset$  // set of *selected* nodes

9 - 9

if  $\mathcal{T} = \{\mu\}$  then if point stored at *µ* lies in *h* then Task.  $| N \leftarrow \{\mu\}$ Turn this into a else range counting **foreach** child  $\nu$  of the root of  $\mathcal{T}$  **do** query algorithm! if  $t(\nu) \subset h$  then  $N \leftarrow N \cup \{\nu\}$ else if  $t(\nu) \cap h \neq \emptyset$  then  $| N \leftarrow N \cup \text{SelectInHalfplane}(h, \mathcal{T}_{v}) |$ 

**return** *N* // with  $S \cap h = \bigcup_{\nu \in N} S(\nu)$ 



Query Algorithm Count **SELECTINHALFPLANE**(half-plane h, partit. tree  $\mathcal{T}$  for pt set S) // set of selected nodes  $N \leftarrow \emptyset$ number if  $\mathcal{T} = \{\mu\}$  then Task. if point stored at *µ* lies in *h* then  $| N \leftarrow \{\mu\}$ Turn this into a else range *counting* **foreach** child  $\nu$  of the root of  $\mathcal{T}$  **do** query algorithm! if  $t(\nu) \subset h$  then  $N \leftarrow N \cup \{\nu\}$ else if  $t(\nu) \cap h \neq \emptyset$  then  $| N \leftarrow N \cup \text{SelectInHalfplane}(h, \mathcal{T}_{v}) |$ // with  $S \cap h = \bigcup_{\nu \in N} S(\nu)$ return N

Query Algorithm Count **SELECTINHALFPLANE**(half-plane h, partit. tree  $\mathcal{T}$  for pt set S) // set of selected nodes  $N \leftarrow \not \sim 0$ number if  $\mathcal{T} = \{\mu\}$  then Task. if point stored at *µ* lies in *h* then  $| N \leftarrow \{\mu\}$ Turn this into a else range *counting* **foreach** child  $\nu$  of the root of  $\mathcal{T}$  **do** query algorithm! if  $t(\nu) \subset h$  then  $N \leftarrow N \cup \{\nu\}$ else if  $t(\nu) \cap h \neq \emptyset$  then  $| N \leftarrow N \cup \text{SelectInHalfplane}(h, \mathcal{T}_{v}) |$ // with  $S \cap h = \bigcup_{\nu \in N} S(\nu)$ return N

Query Algorithm Count **SELECTINHALFPLANE**(half-plane h, partit. tree  $\mathcal{T}$  for pt set S) // set of selected nodes  $N \leftarrow \not \sim 0$ number if  $\mathcal{T} = \{\mu\}$  then Task. if point stored at *µ* lies in *h* then  $N \leftarrow \{ N+1 \}$ Turn this into a else range *counting* **foreach** child  $\nu$  of the root of  $\mathcal{T}$  **do** query algorithm! if  $t(\nu) \subset h$  then  $N \leftarrow N \cup \{\nu\}$ else if  $t(\nu) \cap h \neq \emptyset$  then  $| N \leftarrow N \cup \text{SelectInHalfplane}(h, \mathcal{T}_{v}) |$ // with  $S \cap h = \bigcup_{\nu \in N} S(\nu)$ return N

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# **Computational Geometry**

## Lecture 11: Simple Range Searching

#### Part IV: Analysis of the Partition Tree

Philipp Kindermann

Winter Semester 2020

**Lemma.** For any  $\varepsilon > 0$ , there is a partition tree  $\mathcal{T}$  for *S* s.t.:

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**Proof.** Let  $\varepsilon > 0$ .

**Lemma.** For any  $\varepsilon > 0$ , there is a partition tree  $\mathcal{T}$  for S s.t.: for a query half-plane h, SELECTINHALFPLANE selects in  $O(n^{1/2+\varepsilon})$  time a set N of  $O(n^{1/2+\varepsilon})$  nodes of  $\mathcal{T}$ with the property that  $h \cap S = \bigcup_{\nu \in N} S(\nu)$ . **Proof.** Let  $\varepsilon > 0$ .

**Lemma.** For any  $\varepsilon > 0$ , there is a partition tree  $\mathcal{T}$  for S s.t.: for a query half-plane h, SELECTINHALFPLANE selects in  $O(n^{1/2+\varepsilon})$  time a set N of  $O(n^{1/2+\varepsilon})$  nodes of  $\mathcal{T}$ with the property that  $h \cap S = \bigcup_{\nu \in N} S(\nu)$ . **Proof.** Let  $\varepsilon > 0$ .

**Lemma.** For any  $\varepsilon > 0$ , there is a partition tree  $\mathcal{T}$  for S s.t.: for a query half-plane h, SELECTINHALFPLANE selects in  $O(n^{1/2+\varepsilon})$  time a set N of  $O(n^{1/2+\varepsilon})$  nodes of  $\mathcal{T}$ with the property that  $h \cap S = \bigcup_{\nu \in N} S(\nu)$ . **Proof.** Let  $\varepsilon > 0$ . Let  $r = 2(\sqrt{2}c)^{1/\varepsilon}$ .

**Lemma.** For any  $\varepsilon > 0$ , there is a partition tree  $\mathcal{T}$  for S s.t.: for a query half-plane h, SELECTINHALFPLANE selects in  $O(n^{1/2+\varepsilon})$  time a set N of  $O(n^{1/2+\varepsilon})$  nodes of  $\mathcal{T}$ with the property that  $h \cap S = \bigcup_{v \in N} S(v)$ . **Proof.** Let  $\varepsilon > 0$ . Let  $r = 2(\sqrt{2}c)^{1/\varepsilon}$ .  $\Rightarrow Q(n) \leq \begin{cases} 1 & \text{if } n = 1, \\ \text{if } n > 1. \end{cases}$ 

**Lemma.** For any  $\varepsilon > 0$ , there is a partition tree  $\mathcal{T}$  for S s.t.: for a query half-plane h, SELECTINHALFPLANE selects in  $O(n^{1/2+\varepsilon})$  time a set N of  $O(n^{1/2+\varepsilon})$  nodes of  $\mathcal{T}$ with the property that  $h \cap S = \bigcup_{v \in N} S(v)$ . **Proof.** Let  $\varepsilon > 0$ . Let  $r = 2(\sqrt{2}c)^{1/\varepsilon}$ .  $\Rightarrow Q(n) \leq \begin{cases} 1 & \text{if } n = 1, \\ r+ & \text{if } n > 1. \end{cases}$ 

**Lemma.** For any  $\varepsilon > 0$ , there is a partition tree  $\mathcal{T}$  for *S* s.t.: for a query half-plane *h*, SelectInHalfplane selects in  $O(n^{1/2+\varepsilon})$  time a set *N* of  $O(n^{1/2+\varepsilon})$  nodes of  $\mathcal{T}$ with the property that  $h \cap S = \bigcup_{\nu \in N} S(\nu)$ . Let  $\varepsilon > 0$ . Let  $r = 2(\sqrt{2}c)^{1/\varepsilon}$ . Proof.  $\Rightarrow Q(n) \le \begin{cases} 1\\ r + \sum_{v \in C(h)} \end{cases}$ if n = 1, if n > 1. C(h) : all children v of the root s.t. h crosses t(v)

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**Lemma.** For any  $\varepsilon > 0$ , there is a partition tree  $\mathcal{T}$  for *S* s.t.: for a query half-plane *h*, SelectInHalfplane selects in  $O(n^{1/2+\varepsilon})$  time a set *N* of  $O(n^{1/2+\varepsilon})$  nodes of  $\mathcal{T}$ with the property that  $h \cap S = \bigcup_{\nu \in N} S(\nu)$ . Let  $\varepsilon > 0$ . Let  $r = 2(\sqrt{2}c)^{1/\varepsilon}$ . **Proof.**  $\Rightarrow Q(n) \leq \begin{cases} 1 & \sqrt{r} & 2n/r & \text{if } n = 1, \\ r + \sum_{v \in C(h)} Q(|S(v)|) & \text{if } n > 1. \end{cases}$ C(h) : all children v of the root s.t. h crosses t(v) $\Rightarrow Q(n) \leq 2(\sqrt{2}c)^{1/\varepsilon} + c\sqrt{2}(\sqrt{2}c)^{1/\varepsilon}Q(\mathbb{Z}n/\mathbb{Z}(\sqrt{2}c)^{1/\varepsilon})$ for  $d = \sqrt{2}c$ 

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**Corollary.** Half-plane range counting queries can be answered in  $O(n^{1/2+\varepsilon})$  time using O(n) space and  $O(n^{1+\varepsilon})$  prep.

Any ideas?

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**Theorem.** Given a set *S* of *n* pts in the plane, for any  $\varepsilon > 0$ , a triangular range-counting query can be answered in  $O(n^{1/2+\varepsilon})$  time using a partition tree.

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Use cutting trees! (Chapter 16.3 [dBCvKO]) Query time  $O(\log^3 n)$ , prep. & storage  $O(n^{2+\varepsilon})$ .

# **Computational Geometry**

## Lecture 11: Simple Range Searching

#### Part V: Multi-Level Partition Trees

Philipp Kindermann

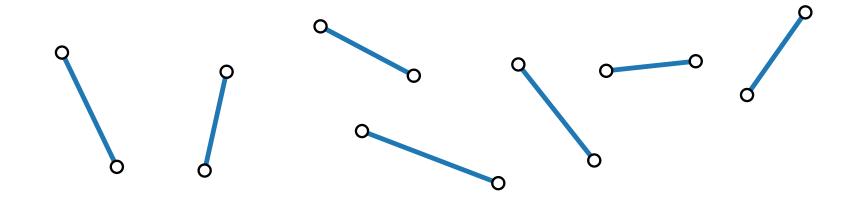
Winter Semester 2020

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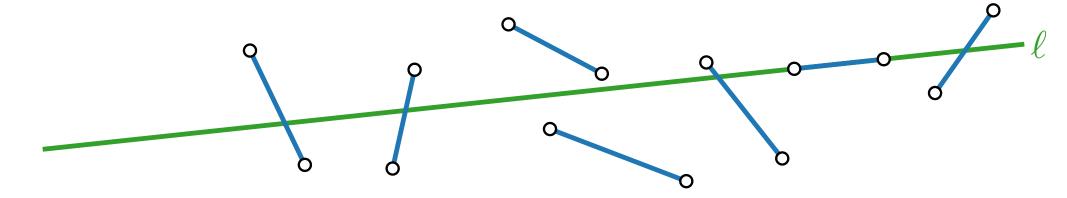
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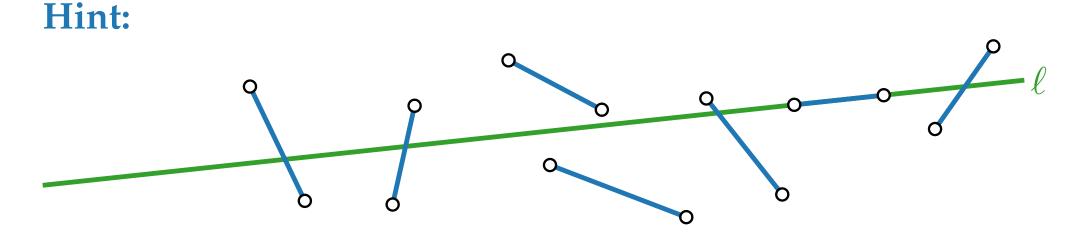
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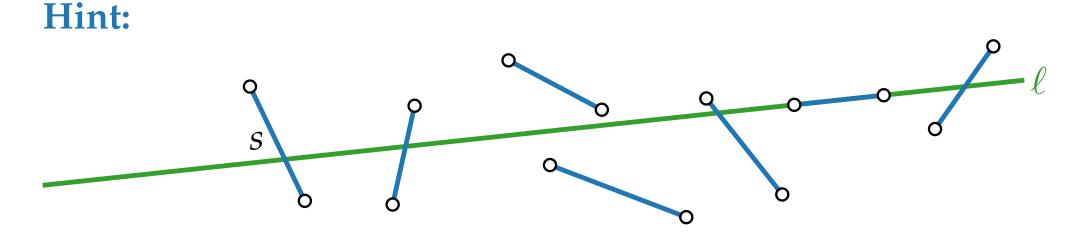
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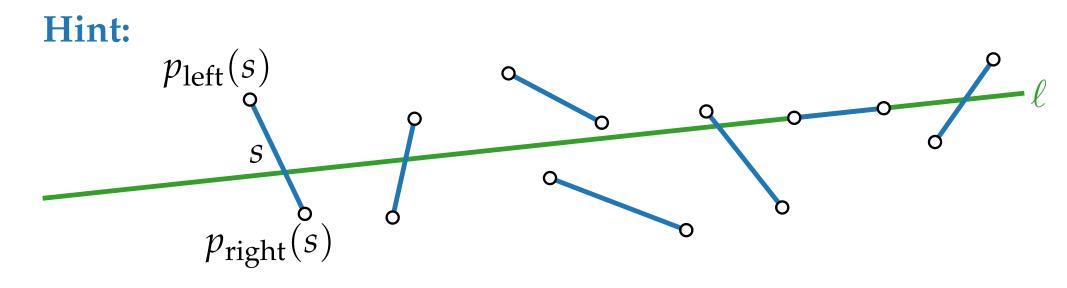
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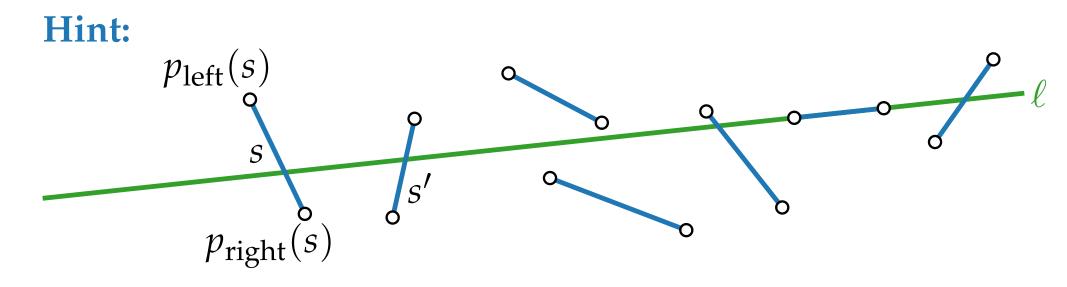
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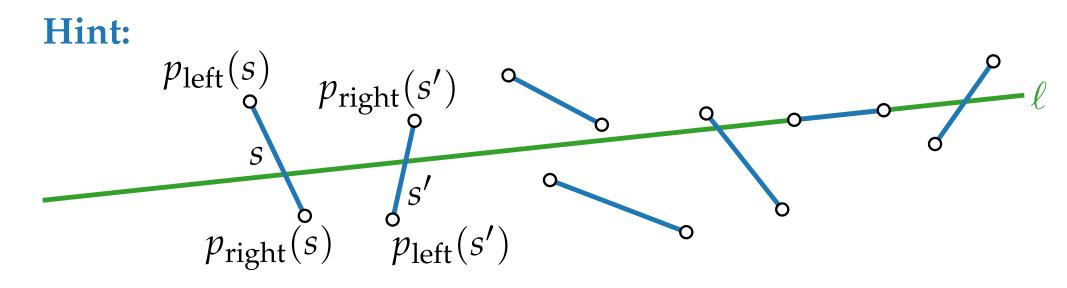
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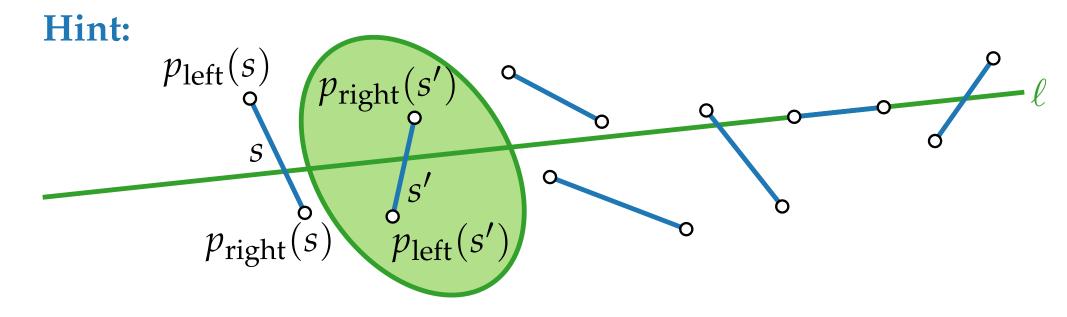
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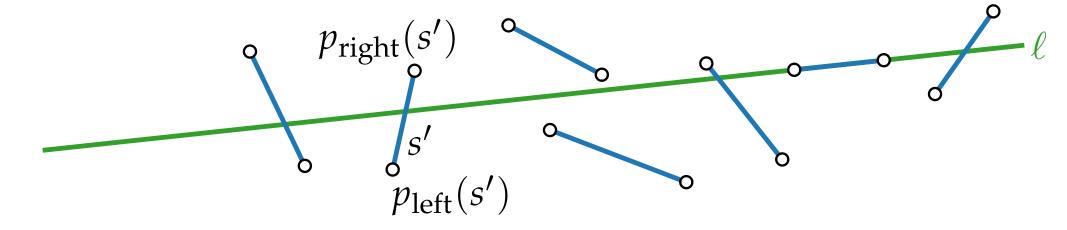
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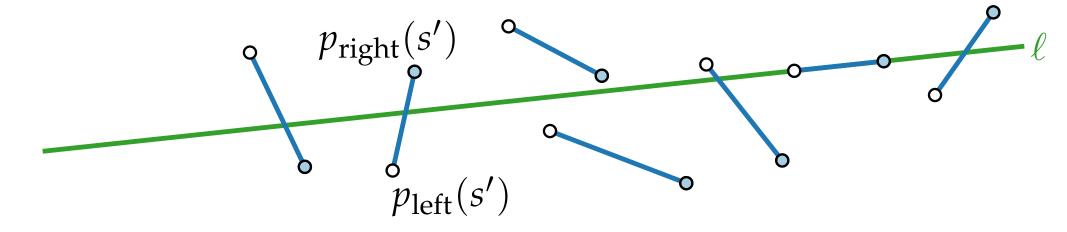
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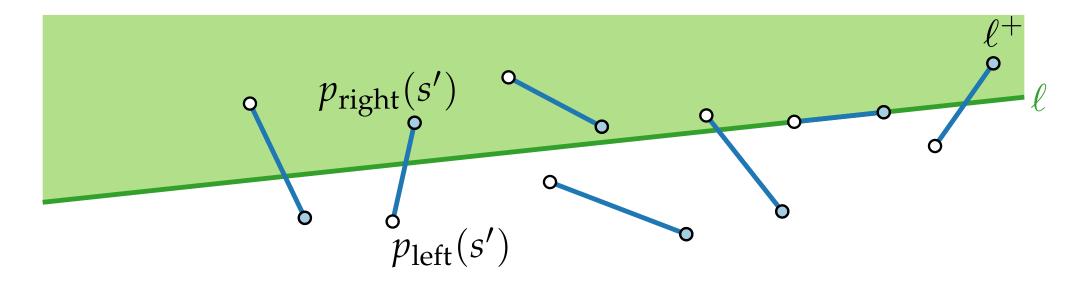
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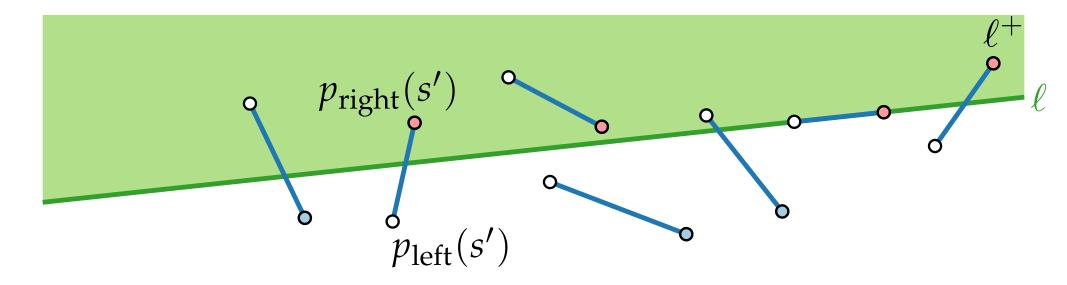
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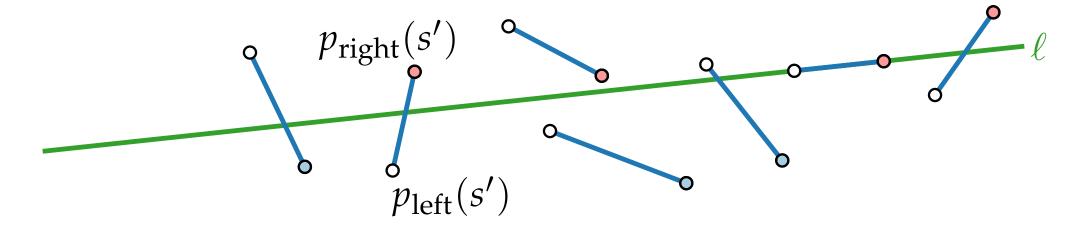
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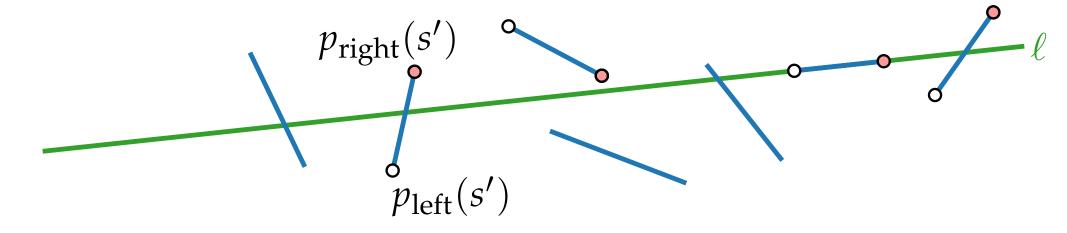
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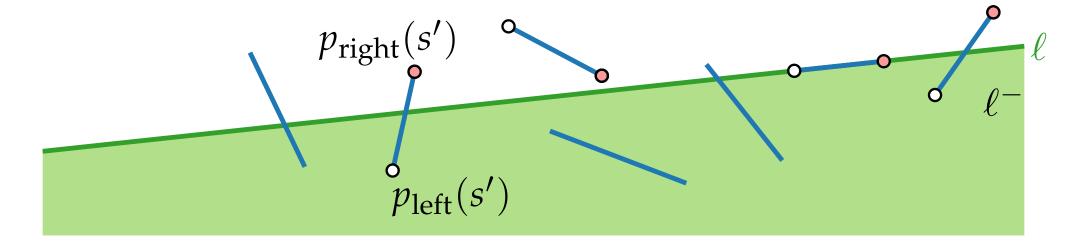
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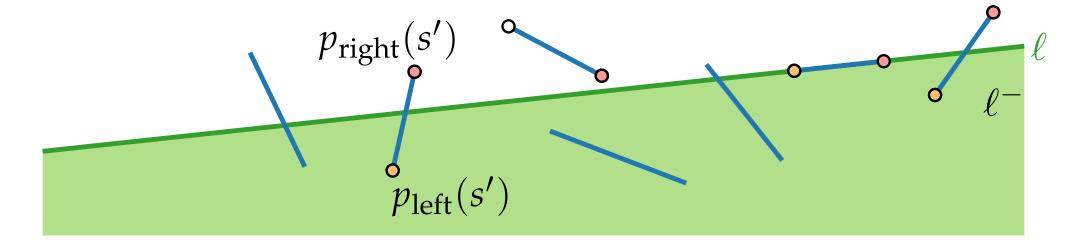
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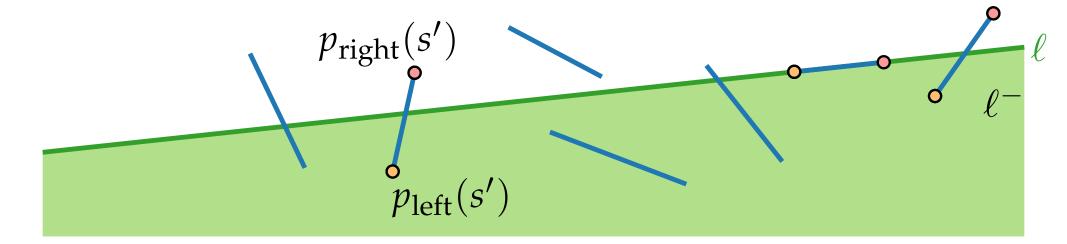
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# Query Algorithm

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**Corollary.** Let *S* be a set of *n* segments in the plane. We can count the number of segments in *S* intersected by a query line in  $O(n^{1/2+ \varepsilon})$  time using  $O(n \log n)$  space and O( ) prep.

**Lemma.** A 2-level partition tree for line-intersection queries among a set of n segments uses  $O(n \log n)$  storage.

**Lemma.** Let *S* be a set of *n* segments in the plane. For any  $\varepsilon > 0$ , there is a 2-level partition tree  $\mathcal{T}$  for *S* s.t.

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**Corollary.** Let *S* be a set of *n* segments in the plane. We can count the number of segments in *S* **in a**  $\delta$ -level intersected by a query line in  $O(n^{1/2+ \varepsilon})$  time **query** using  $O(n \log n)$  space and  $O(n^{1+\varepsilon})$  prep.

**Lemma.** A 2-level partition tree for line-intersection queries among a set of *n* segments uses  $O(n \log n)$  storage.

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**Corollary.** Let *S* be a set of *n* segments in the plane. We can count the number of segments in *S* **in a**  $\delta$ -level intersected by a query line in  $O(n^{1/2+\delta\varepsilon})$  time **query** using  $O(n \log^{\delta-1} n)$  space and  $O(n^{1+\delta\varepsilon})$  prep.