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Partition Trees

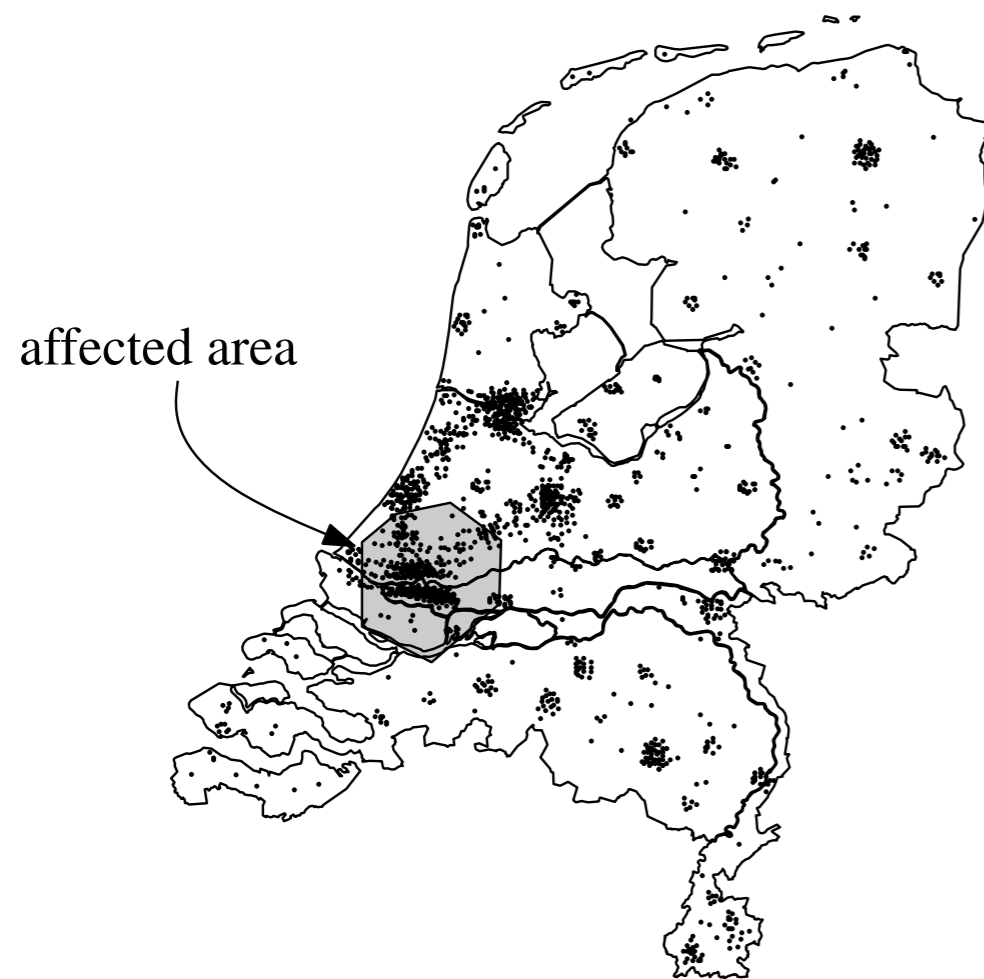
J Pritts 29.11.2012

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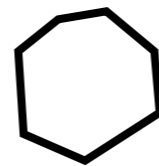
Overview

- Used to quickly $O(\sqrt{n})$ count points in an arbitrary region
- A query range is any subset of the plane that can be approximated by a simple polygon
- Part of the family of geometric range searching algorithms, specifically, it is called a simplex range search (you will see why)

Application



Query range defined by
wind patterns results in a

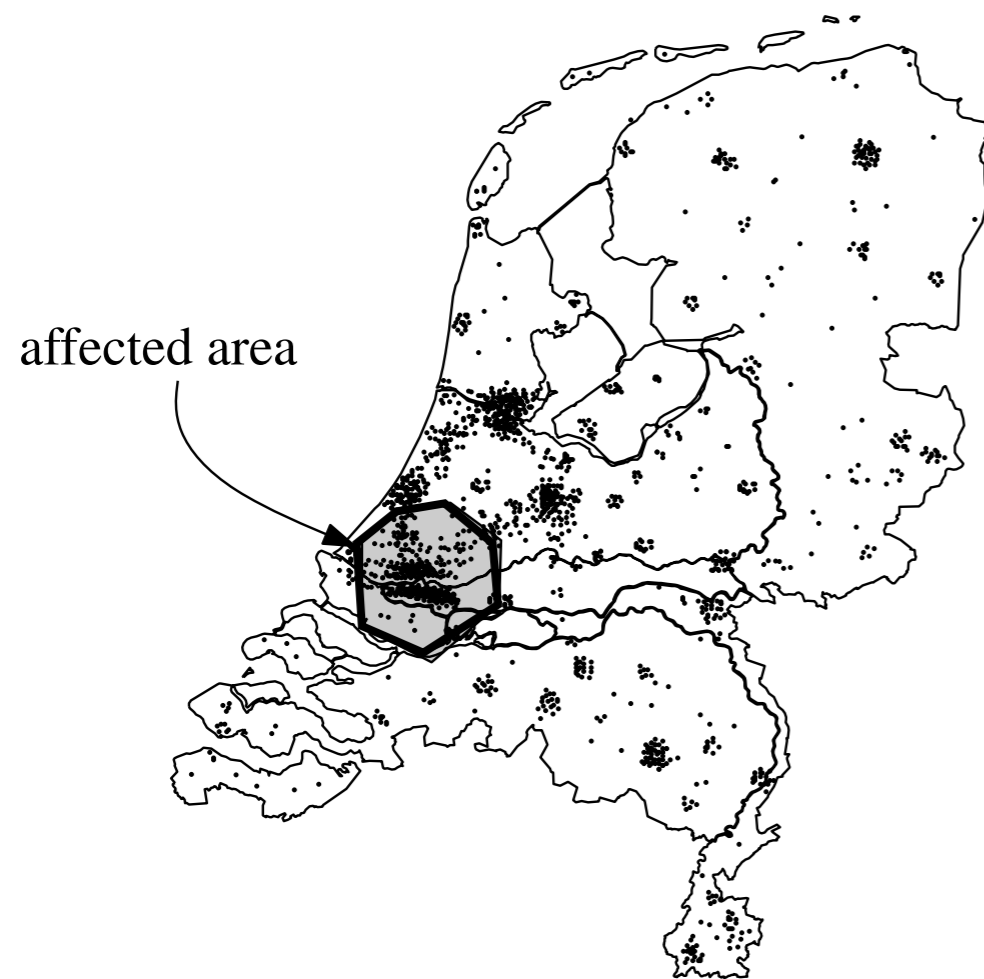


non-orthogonal query

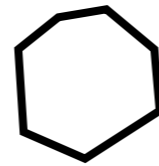
Figure 16.1

Population density of the Netherlands

Application



Query range defined by
wind patterns results in a



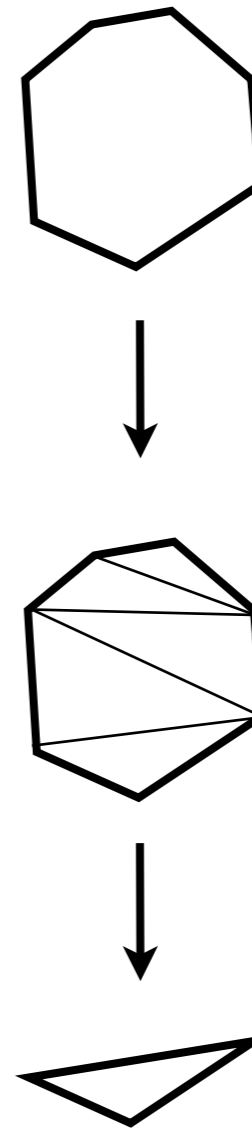
non-orthogonal query

Figure 16.1

Population density of the Netherlands

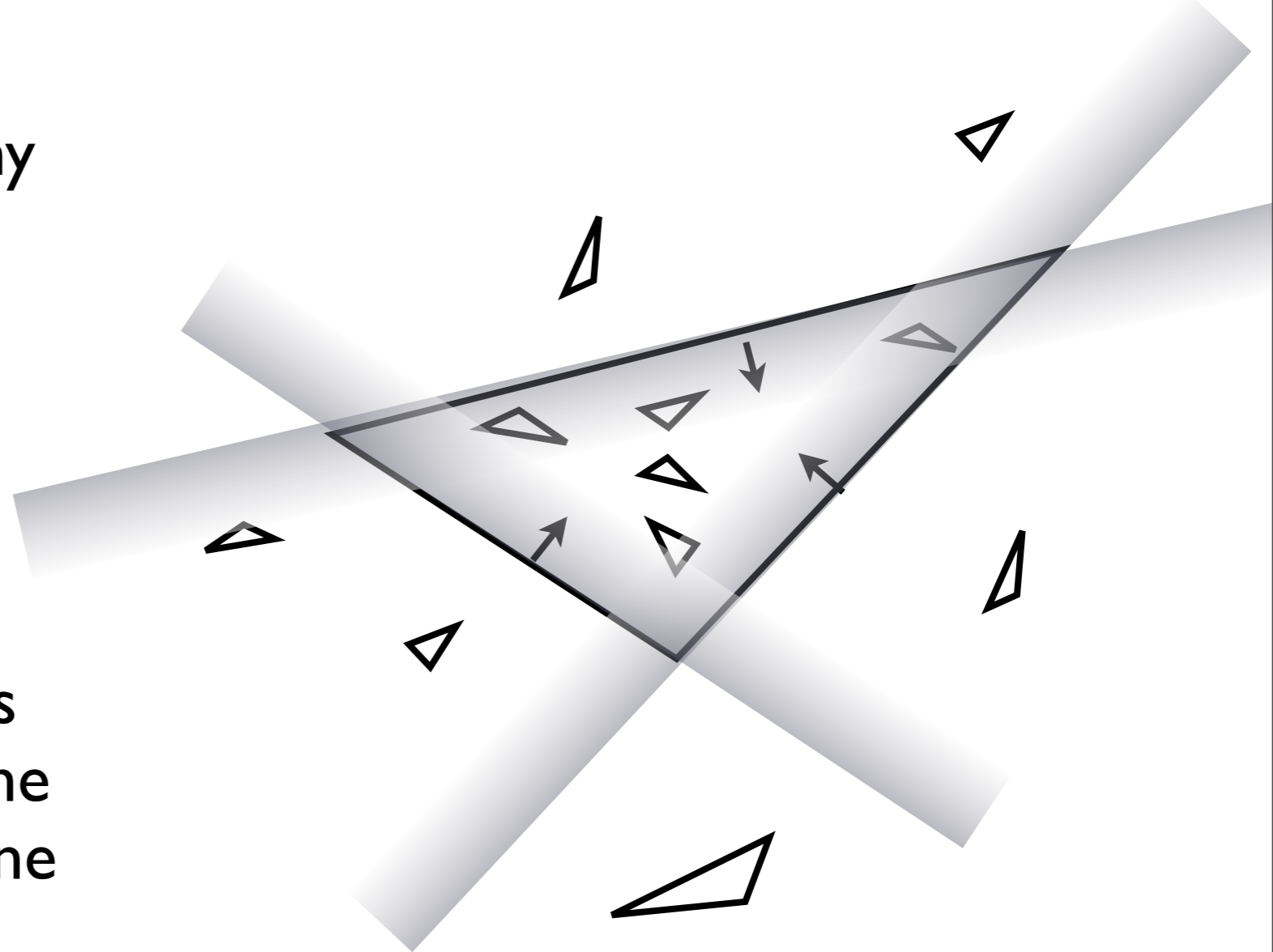
Simplifying the query

- Query regions can be arbitrarily large and complex
- Replace representation of polygon by a union of disjoint closed simplexes (triangles in 2D)
- Range search on query region is sum of range searches on triangles



Counting triangles

- Need to find how many triangles are in the interior of a simplex
- Create three sets corresponding to the three half planes, each containing the triangles which are subsets of the corresponding half-plane

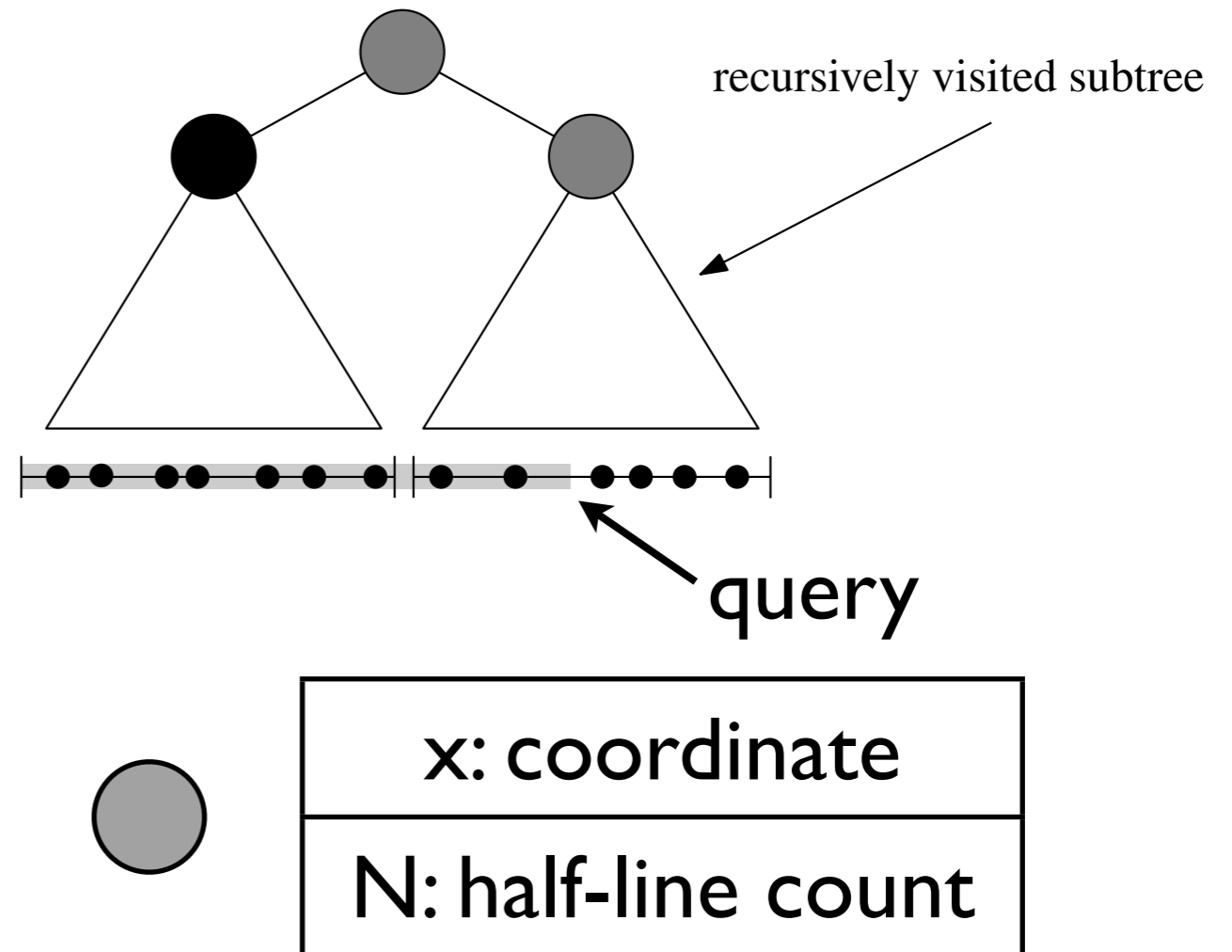


Searching Half Spaces

- Reduced complexity of our 2D range search from counting in simple polygons to counting in half-planes
- How can we quickly count points in half-spaces?
- Counting quickly in half-spaces is the motivation for partition trees

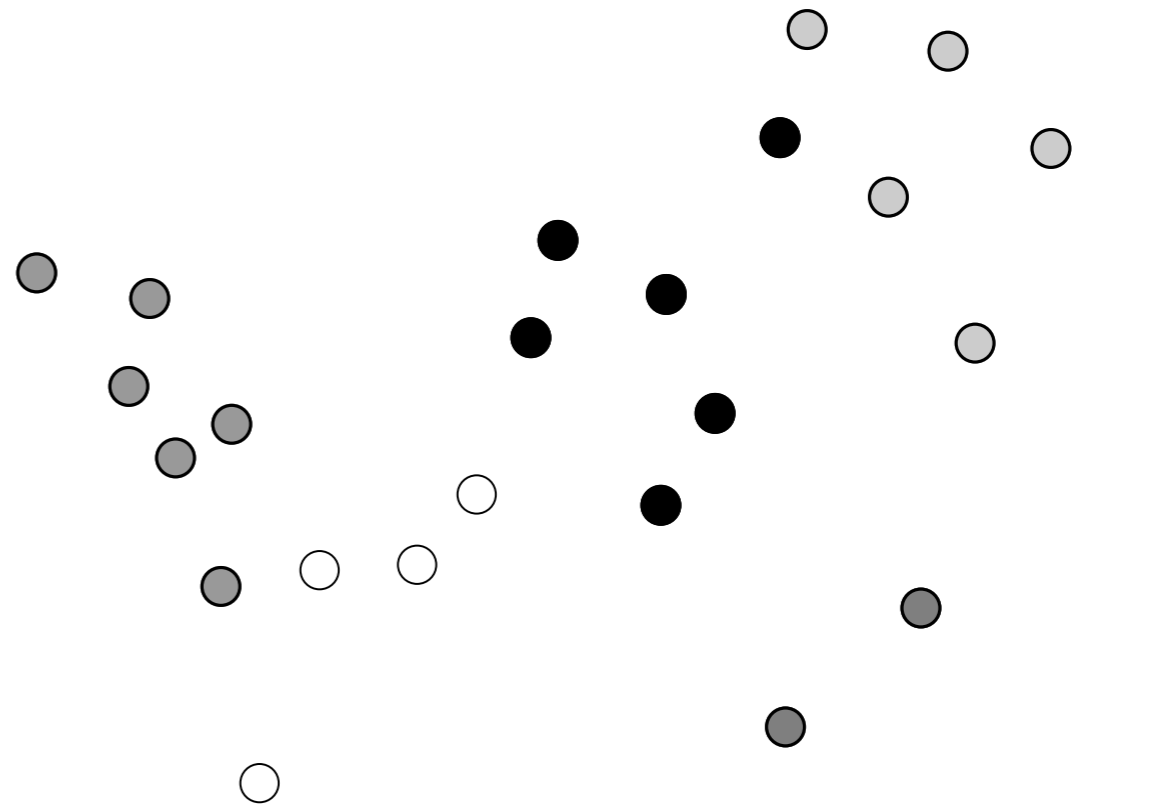
1-dimension

- Used a balanced binary search tree
- Child of root is two half-lines
- each node contains key-value pair (coordinate, count)
- At each level, must recurse on at most one subtree
- results in logarithmic query time



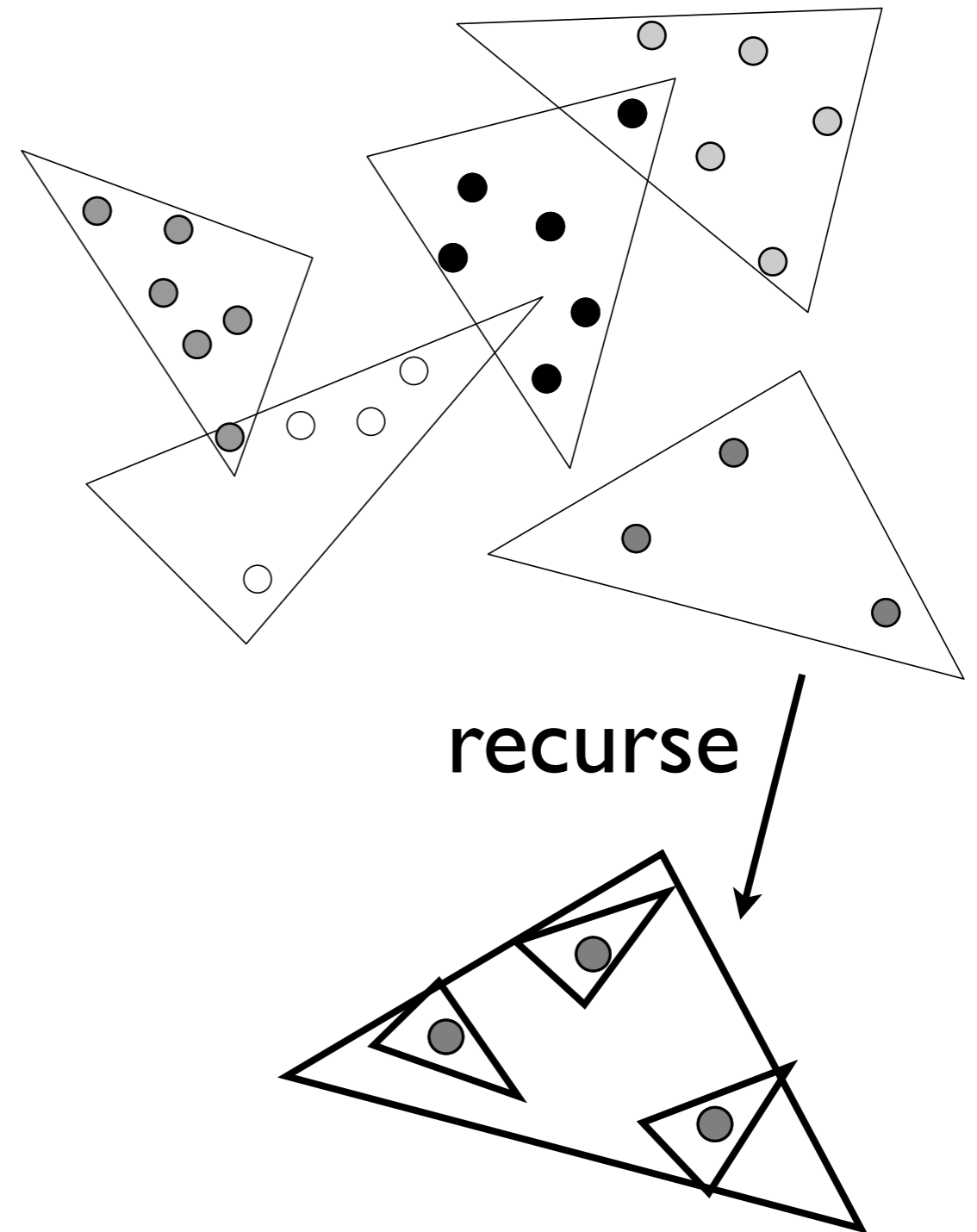
2-dimensions

- Not as easily partitioned as the line
- If root is entire plane, what do children represent?
- Second degree of freedom makes a partitioning scheme non-obvious



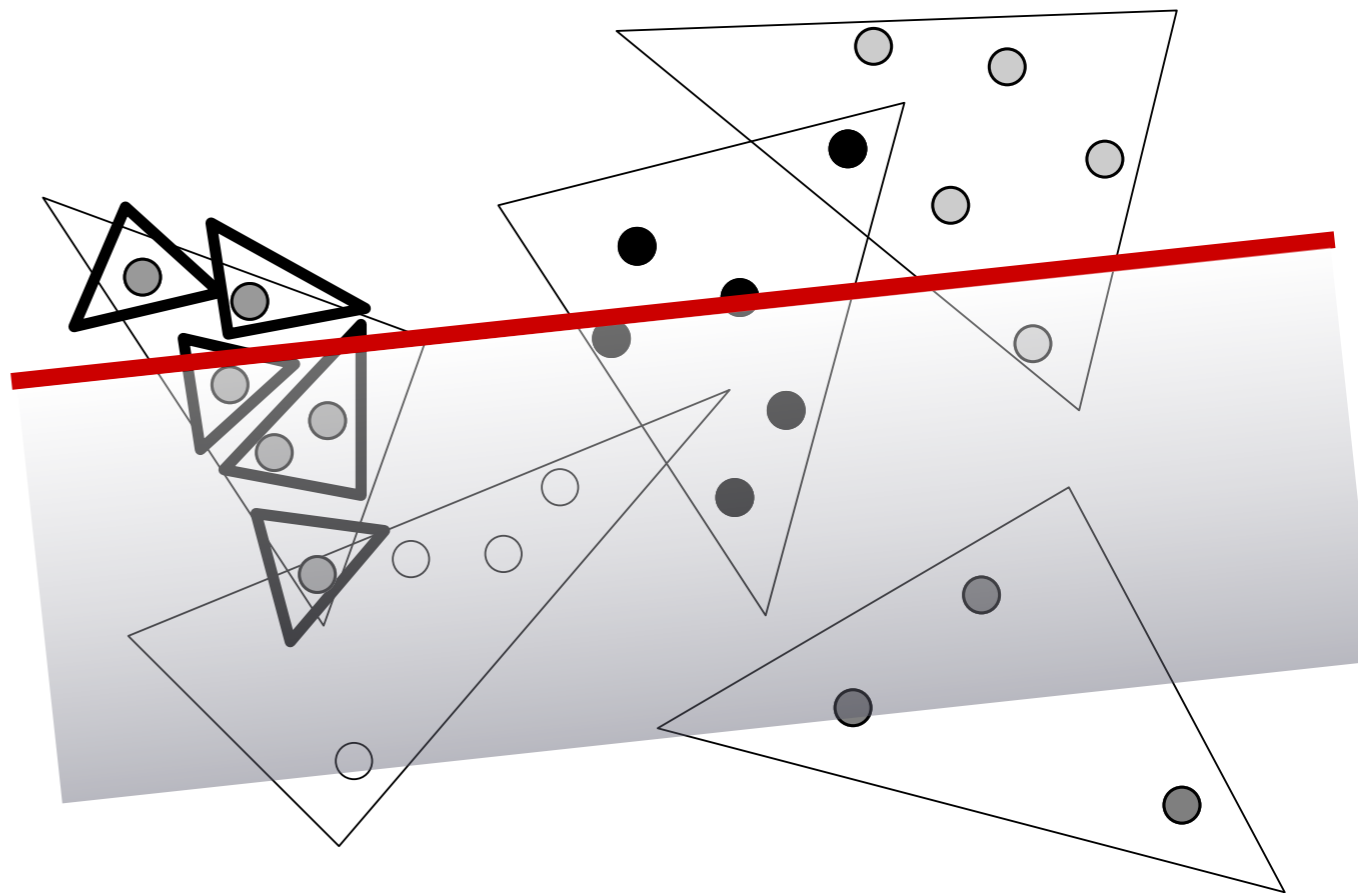
Simplicial-partition

- Divide and conquer
- Partition point set with simplexes
- Simplexes can overlap in space, but each point can only be a member of one class
- Recursively partition simplexes

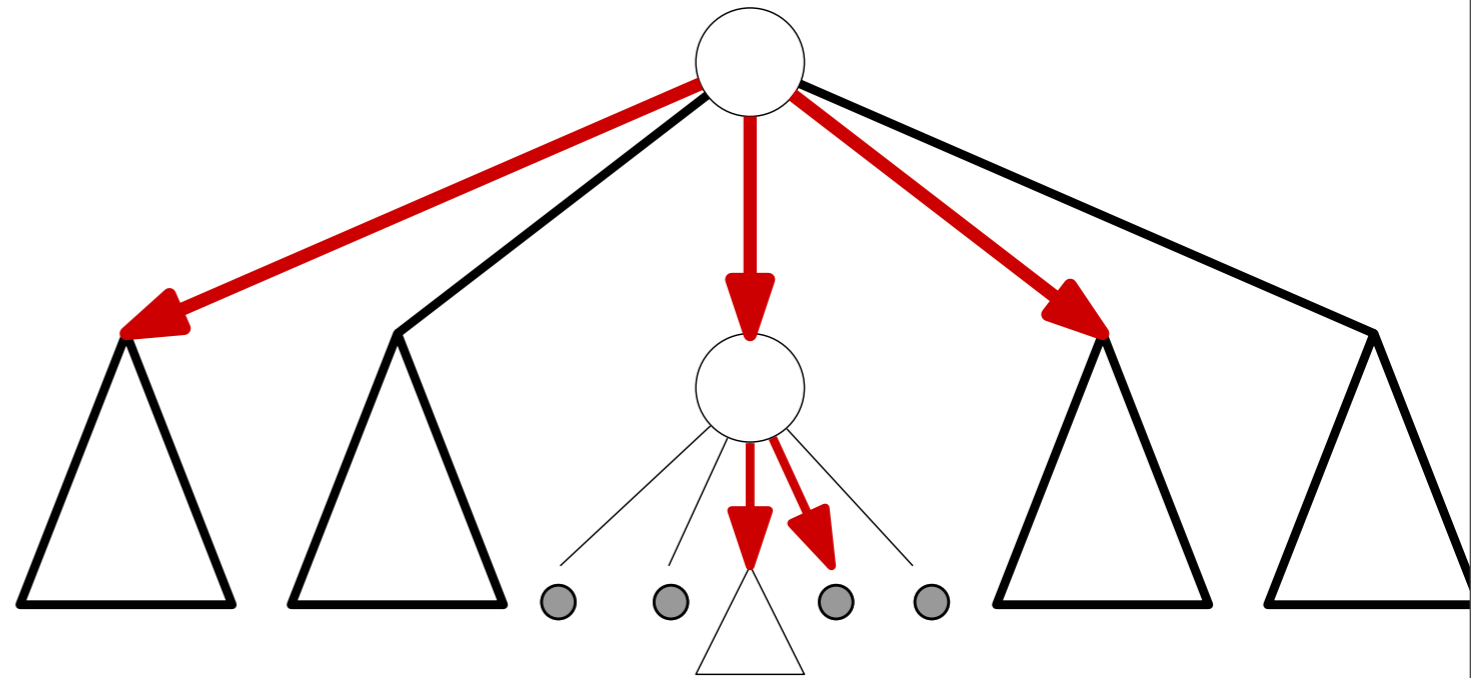
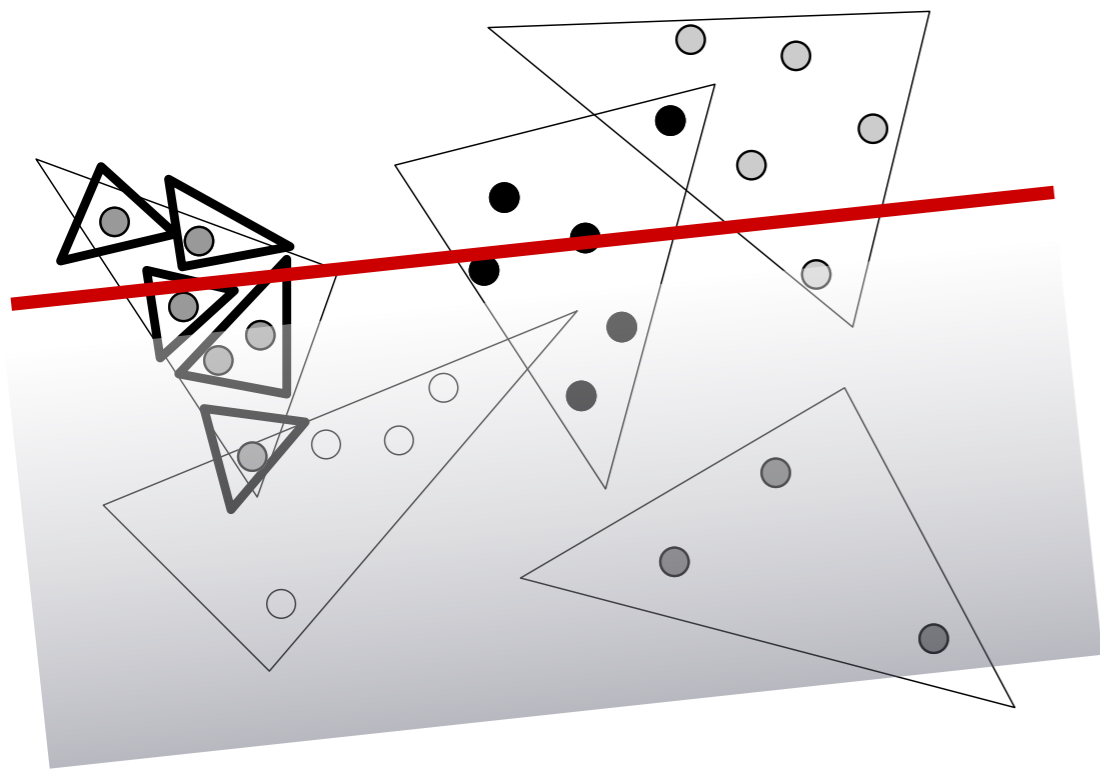


Half-plane counting

- Add points of triangles that are subsets of the half-plane
- If half plane crosses triangle, recurse into triangle and repeat test
- Recurse until all triangles lie on either side of half-plane or contain exactly one point

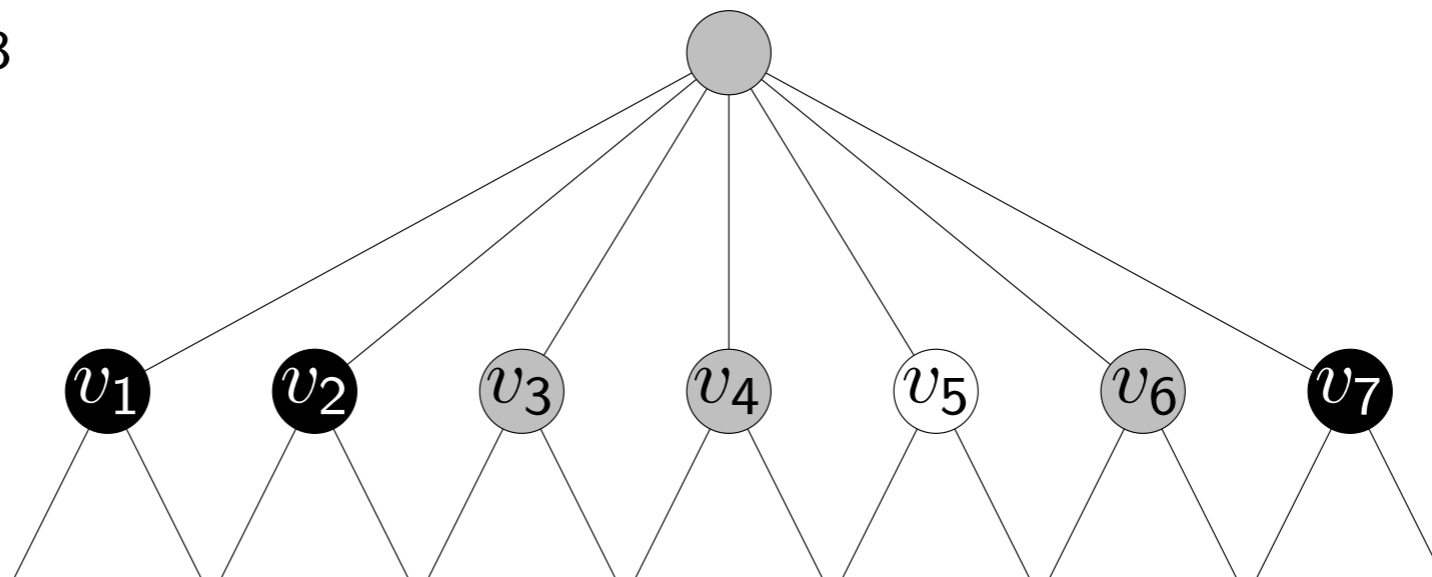
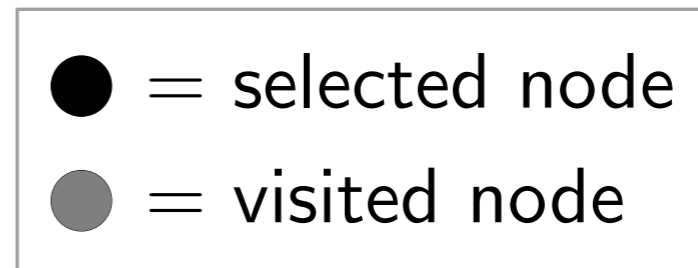
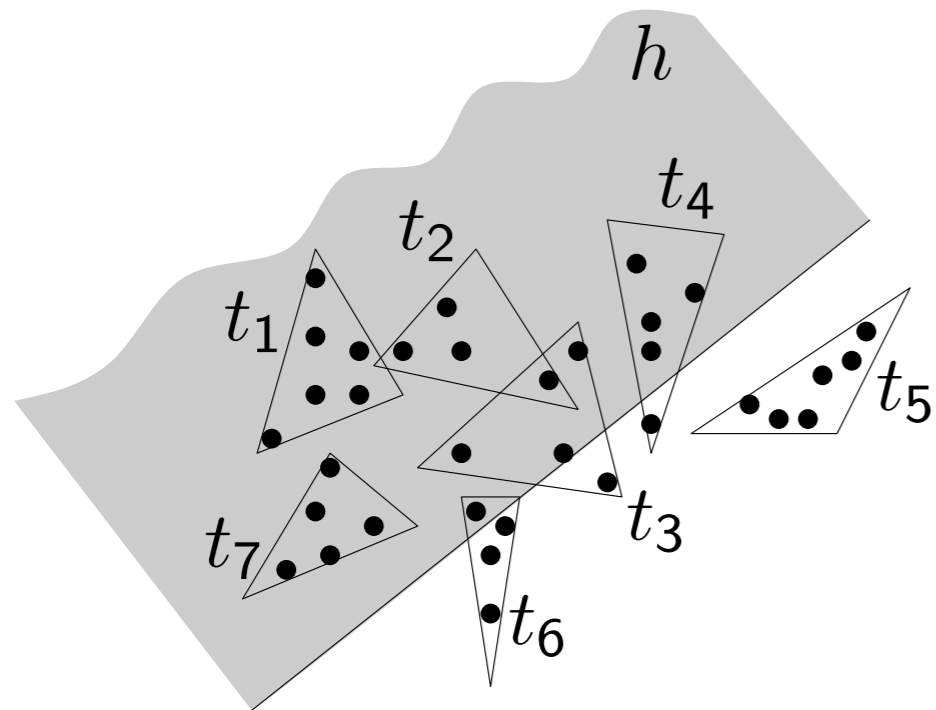


Partition Tree



- Ternary tree where the number of children of any vertex corresponds to the number of simplexes needed to partition point set
- During query, subtrees are traversed if intersected by half plane. If m simplexes are intersected, m subtrees are traversed
- Each vertex of trees stores the simplex vertices and the number of interior points.

Range Query Example



recursively visited subtrees

v_1

S: simplex
N: simplex count

Range Query

SELECTINHALFPLANE(half-plane h , partition tree \mathcal{T})

$N \leftarrow \emptyset$ { set of *selected* nodes }

if $\mathcal{T} = \{\mu\}$ **then**

if point stored at μ lies in h **then**

$N \leftarrow \{\mu\}$

else

for each child ν of the root of \mathcal{T} **do**

if $t(\nu) \subset h$ **then**

$N \leftarrow N \cup \{\nu\}$

else

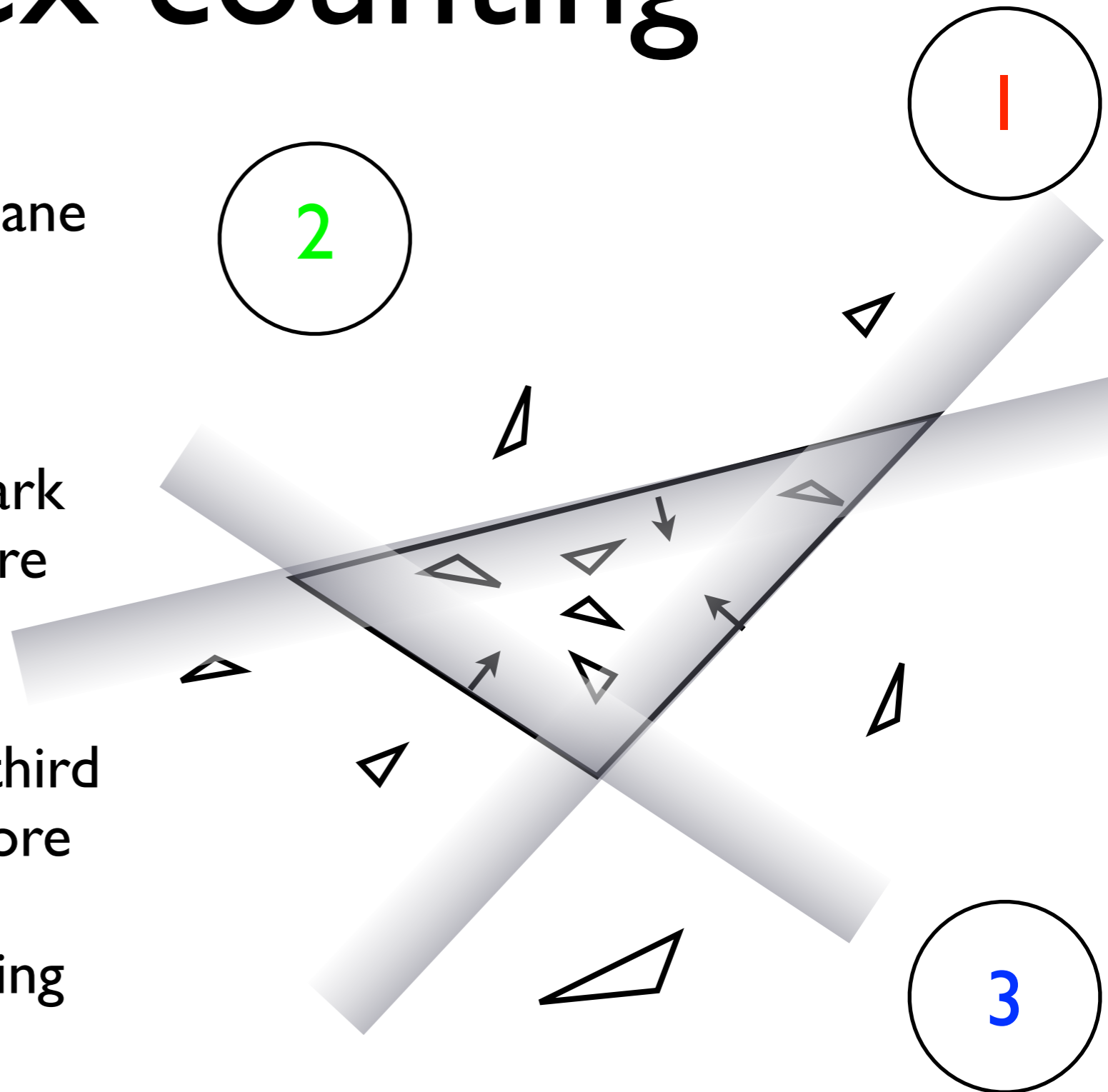
if $t(\nu) \cap h \neq \emptyset$ **then**

$N \leftarrow N \cup \text{SELECTINHALFPLANE}(h, \mathcal{T}_\nu)$

return N

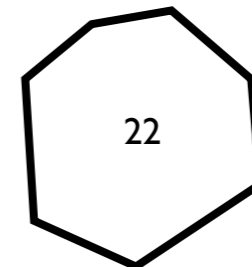
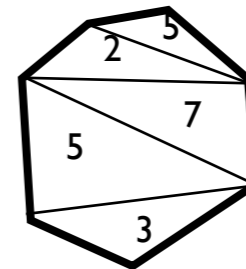
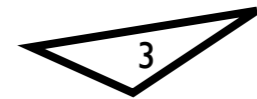
Simplex counting

- We conduct a half plane range query
- As we traverse the partition tree, we mark those vertices that are not in the half-plane
- On the second and third range search, we ignore previously marked vertices when counting



Region range search

- The sum the counts of all triangles is the region range search



Complexity

Half-Plane Query	Space	Construction
$O(\sqrt{n})$	$O(n)$	$O(n)$

Review

- Need to query on complex 2D regions, but that is hard
- Transform problem to sequence half-plane searches
- Bisecting half-spaces works in 1D, but does not generalize
- Need concept of recursive simplicial partition to divide higher dimensional space
- Need of for fast half-plane searching on simplicial partition motivates partition tree data structure

Complexity problem?

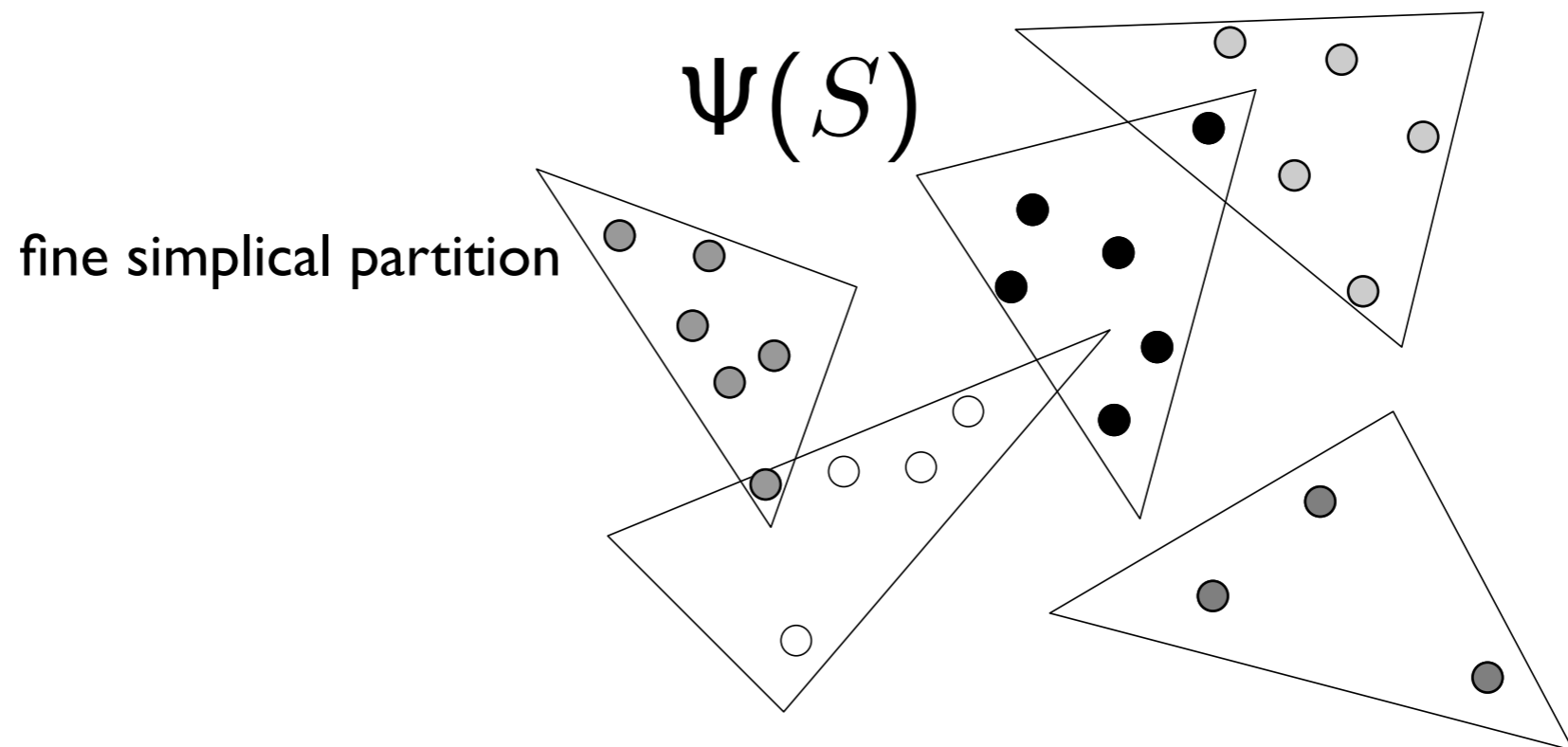
- Number of half-plane crossings is determined by the range query; query complexity is listed as $O(\sqrt{n})$. Why isn't this algorithm output sensitive like Jarvis?

Fine simplicial partitions

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

- S is partitioned by S_1, \dots, S_r and
- for $1 \leq i \leq r$, t_i is a triangle and $S_i \subset t_i$.

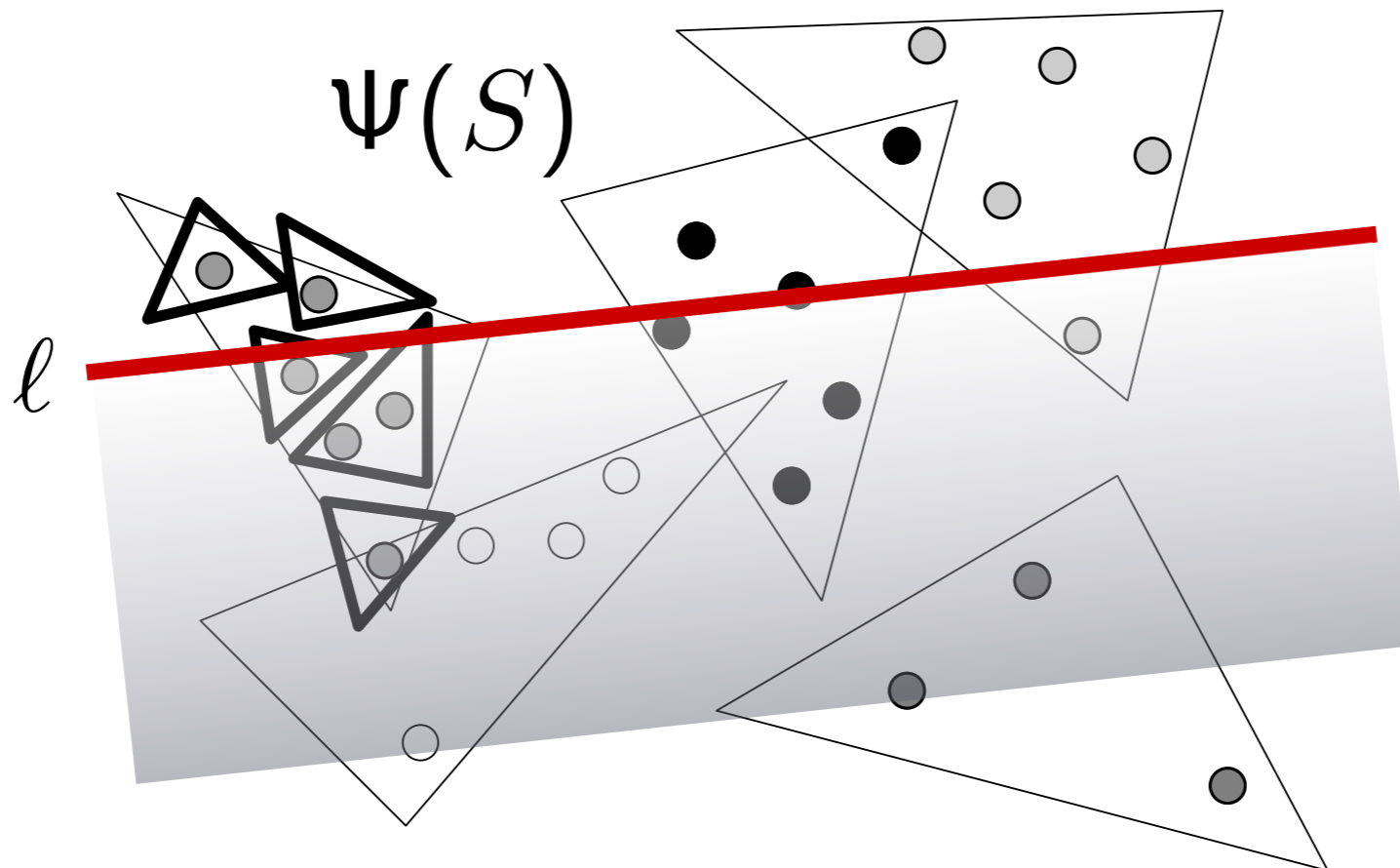
$\Psi(S)$ is *fine* if $|S_i| \leq 2|S|/r$ for every $1 \leq i \leq r$.



Crossing Numbers

The *crossing number* of ℓ (w.r.t. $\Psi(S)$) is the number of triangles t_1, \dots, t_r intersected by ℓ .

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



Fine simplicial construction

For any set S of n pts and any $1 \leq r \leq n$, a fine simplicial partition of size r and crossing number $O(\sqrt{r})$ exists.

For any $\varepsilon > 0$, such a partition can be built in $O(n^{1+\varepsilon})$ time.

Query complexity guarantees

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 $h \cap S = \bigcup_{\nu \in N} S(\nu)$.

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

Partition Tree construction

- Construct a fine simplicial partition
 $\Psi(S) = \{(S_1, t_1), (S_2, t_2), \dots, (S_r, t_r)\}$
- Add r vertices to partition tree with key-value pair (simplex, simplex count)
- Recurse on S_1, \dots, S_r and grow partition tree as in step 2

Fine simplicial construction

- A topic for another presenter. I punt :)
- Two algorithms to construct fine-simplicial construction: randomized and deterministic
- Second algorithm results directly from a inductive proof for the complexity bound of constructing an epsilon-cutting (see Matousek)
- Efficient partition trees formalized in mid 90s

Sources

Matoušek, J. Construction of ε -nets, *Disc. Comput. Geom.* 5 (1990), 427–448.

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Chazelle, B., Sharir, M., Welzl, E. Quasi-optimal upper bounds for simplex range searching and new zone theorems, *Algorithmica* 8 (1992), 407–429.

De Berg, Mark; Cheong, Otfried; Van Kreveld, Marc; Overmars (2008). *Computational Geometry Algorithms and Applications*

Some images adapted from: Alexander Wolff's presentation for Geometric algorithms:
<http://www.win.tue.nl/~awolff/teaching/2009/2IL55/pdf/vl6.pdf>

Questions

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