

#### WINDOWING

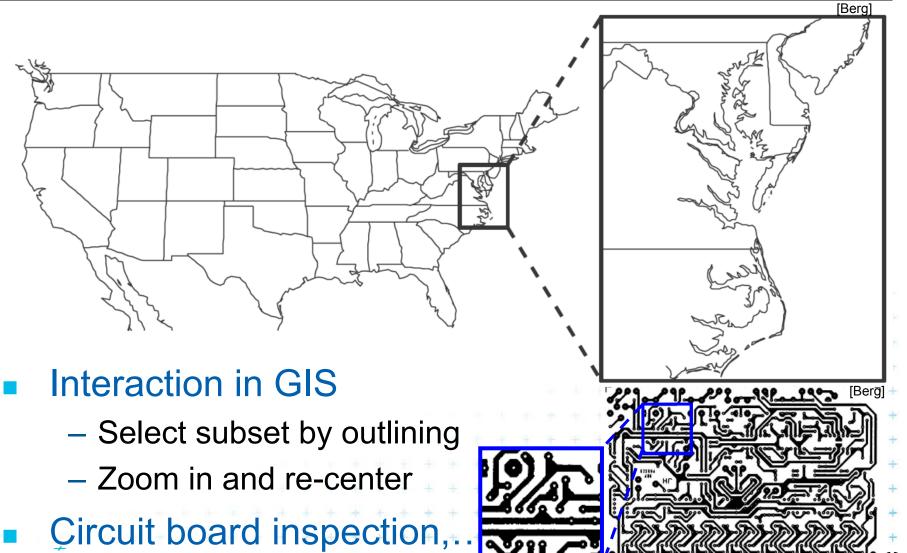
#### PETR FELKEL

FEL CTU PRAGUE felkel@fel.cvut.cz https://cw.felk.cvut.cz/doku.php/courses/a4m39vg/start

Based on [Berg], [Mount]

Version from 15.12.2016

### Windowing queries - examples



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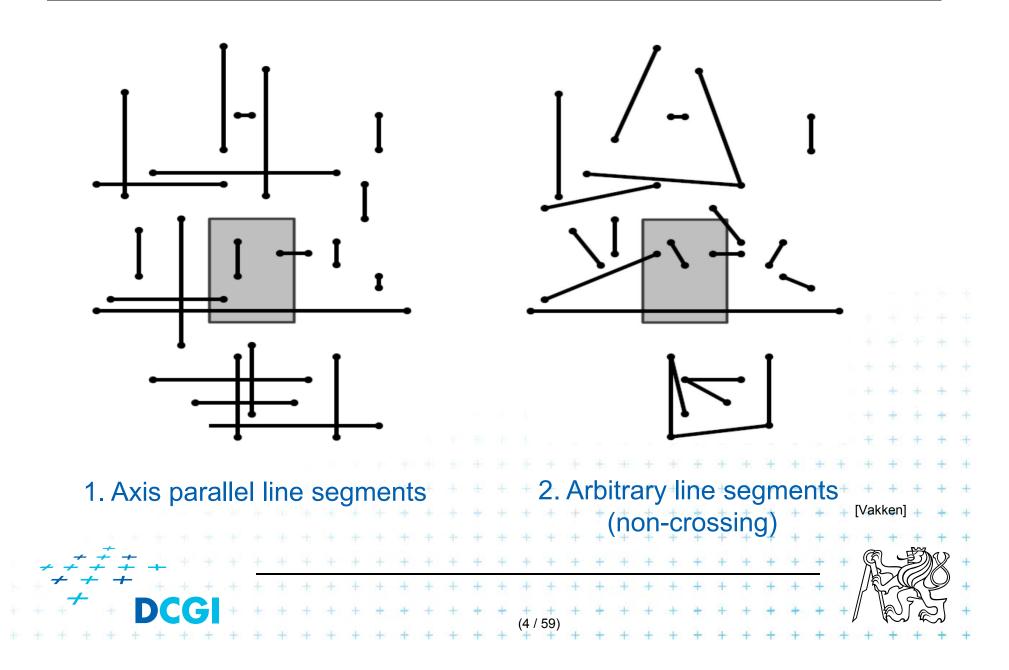
# Windowing versus range queries

- Range queries (see range trees in Lecture 03)
  - Points
  - Often in higher dimensions
- Windowing queries
  - Line segments, curves, ...
  - Usually in low dimension (2D, 3D)
- The goal for both: Preprocess the data into a data structure

   so that the objects intersected by the query rectangle can be reported efficiently

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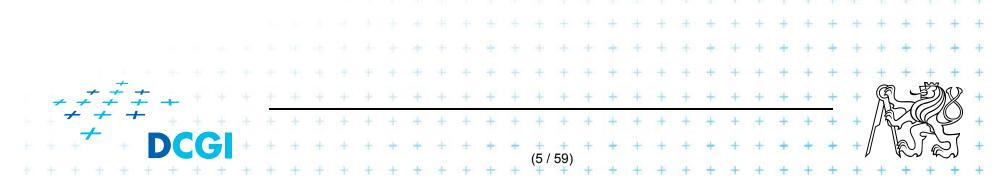
#### Windowing queries on line segments



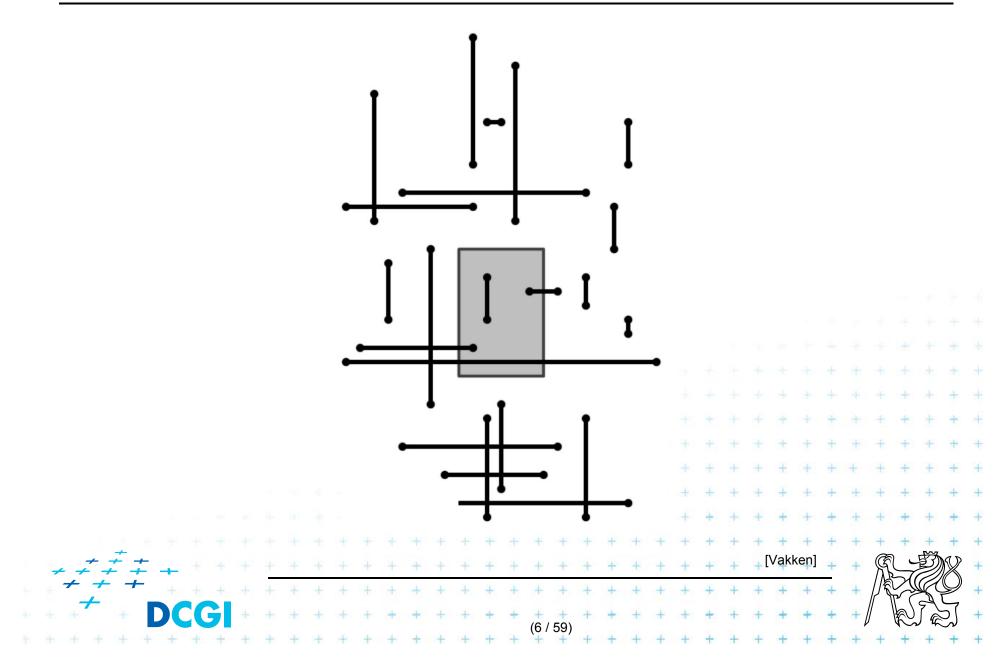
# **Talk overview**

1. Windowing of axis parallel line segments in 2D

- 3 variants of *interval tree* IT in x-direction
- Differ in storage of segment end points  $M_L$  and  $M_R$
- i. Line stabbing (standard *IT* with sorted lists) lecture 9 intersections
- ii. Line segment stabbing (*IT* with *range trees*)
- iii. Line segment stabbing (IT with priority search trees)
- 2. Windowing of line segments in general position
  - segment tree



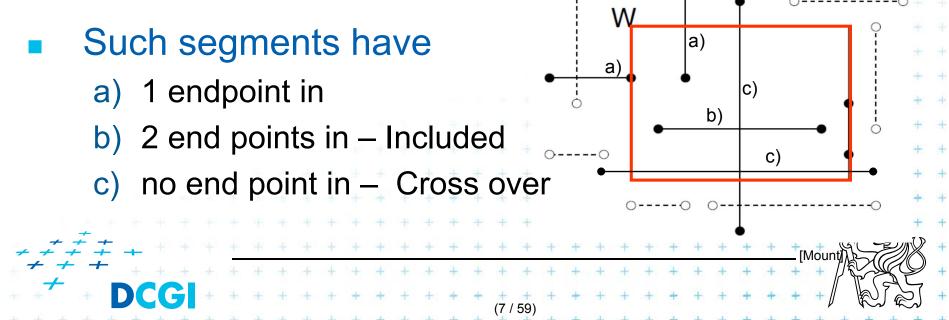
## **1. Windowing of axis parallel line segments**



# **1. Windowing of axis parallel line segments**

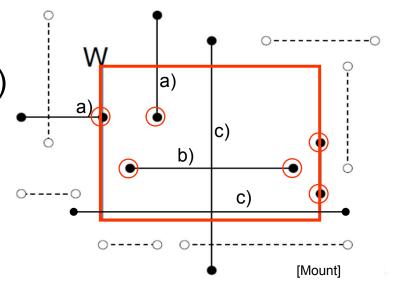
#### Window query

- Given
  - a set of orthogonal line segments S (preprocessed),
  - and orthogonal query rectangle  $W = [x : x'] \times [y : y']$
- Count or report all the line segments of S that intersect W



# Line segments with 1 or 2 points inside

- a) 1 point inside
  - Use a range tree (Lesson 3)
  - O(*n* log *n*) storage
  - $O(\log^2 n + k)$  query time or
  - O(log n + k) with fractional cascading



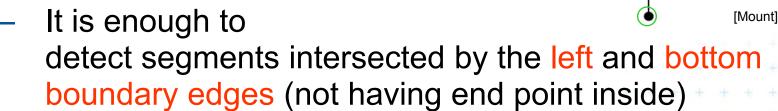
- b) 2 points inside as a) 1 point inside
  - Avoid reporting twice
    - 1. Mark segment when reported (clear after the query)
    - 2. When end point found, check the other end-point. Report only the leftmost or bottom endpoint



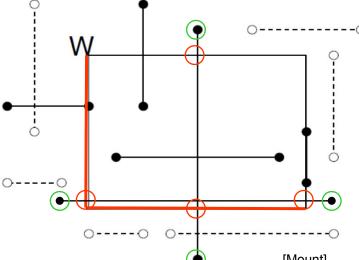
# Line segments that cross over the window

#### c) No points inside

- Such segments not detected using end-point range tree
- Cross the boundary twice or contain one boundary edge
  - contain one boundary edge

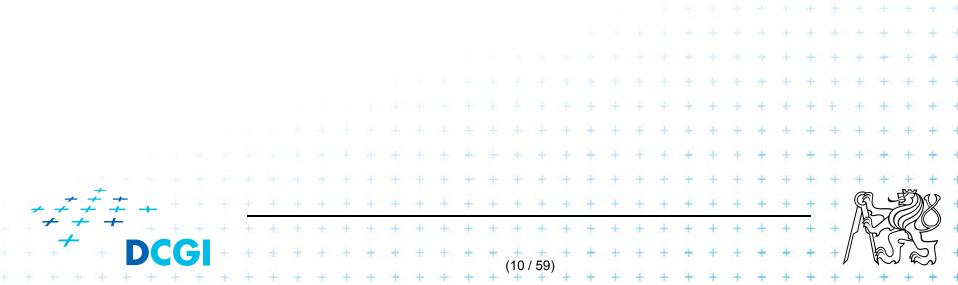


- For left boundary: Report the segments intersecting vertical query *line segment* (1/ii.)
- Let's discuss vertical query line first (1/i.)
  - Bottom boundary is rotated 90°

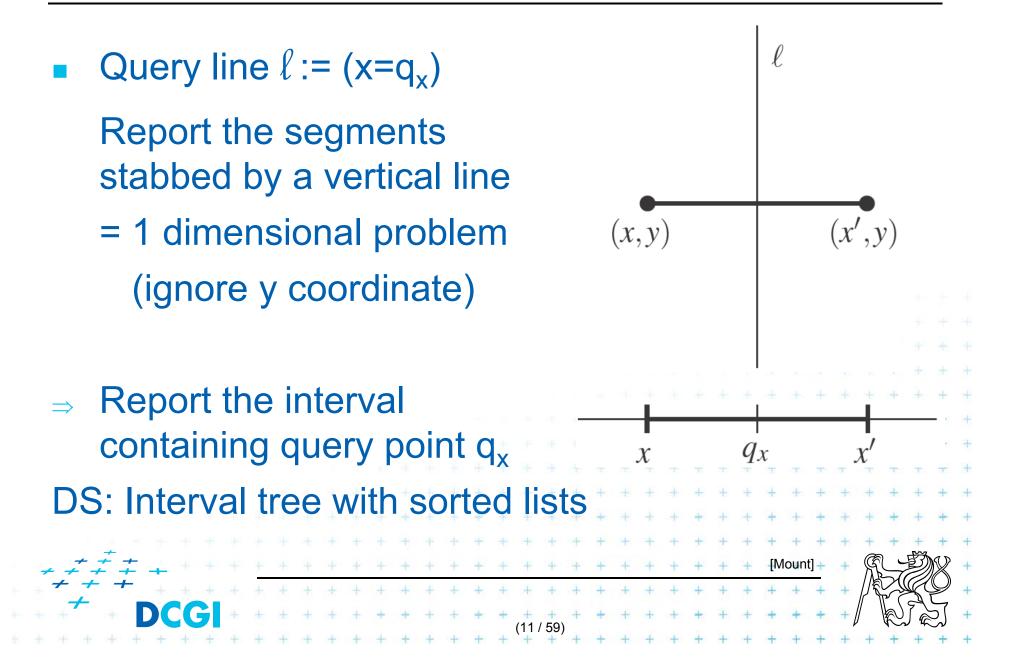


# **Talk overview**

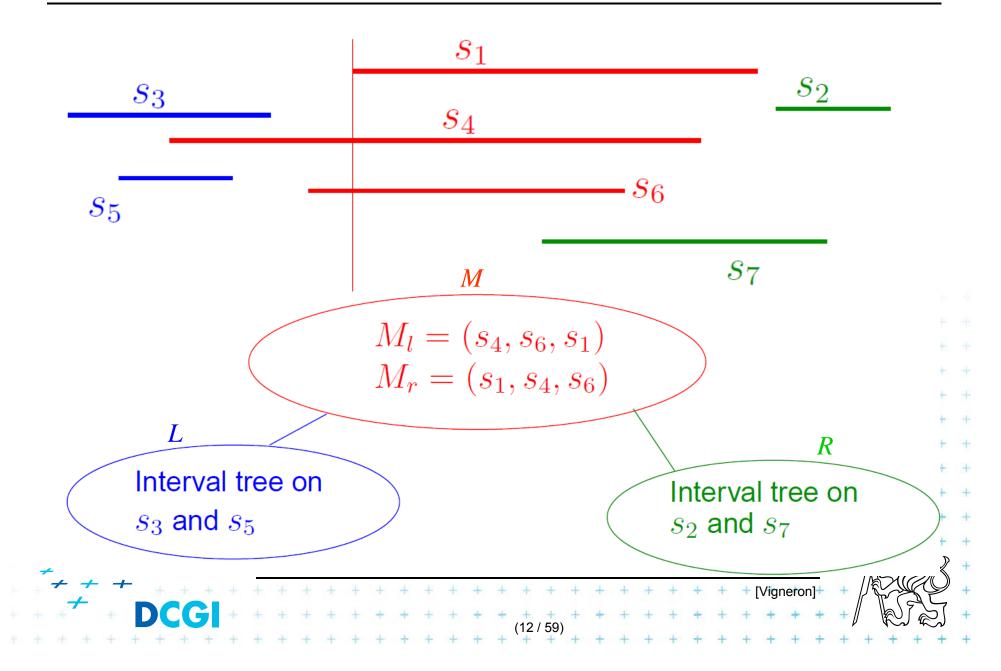
- 1. Windowing of axis parallel line segments in 2D (variants of *interval tree IT*)
  - Line stabbing (standard *IT* with sorted lists)
  - ii. Line segment stabbing (*IT* with *range trees*)
  - iii. Line segment stabbing (*IT* with *priority search trees*)
- 2. Windowing of line segments in general position
  - segment tree



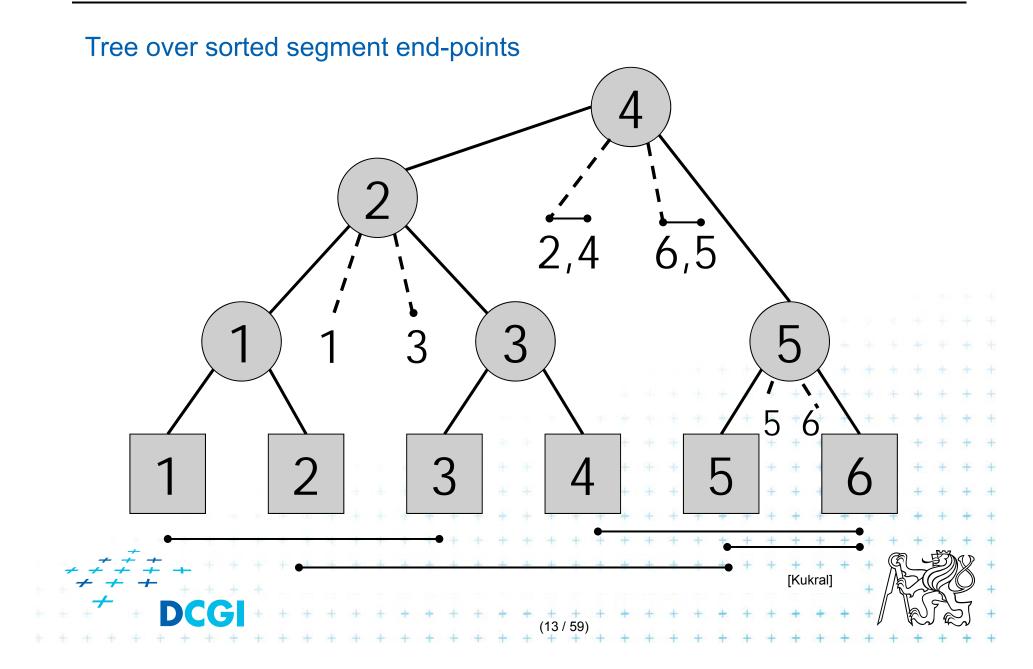
# i. Segment intersected by vertical line – 1D



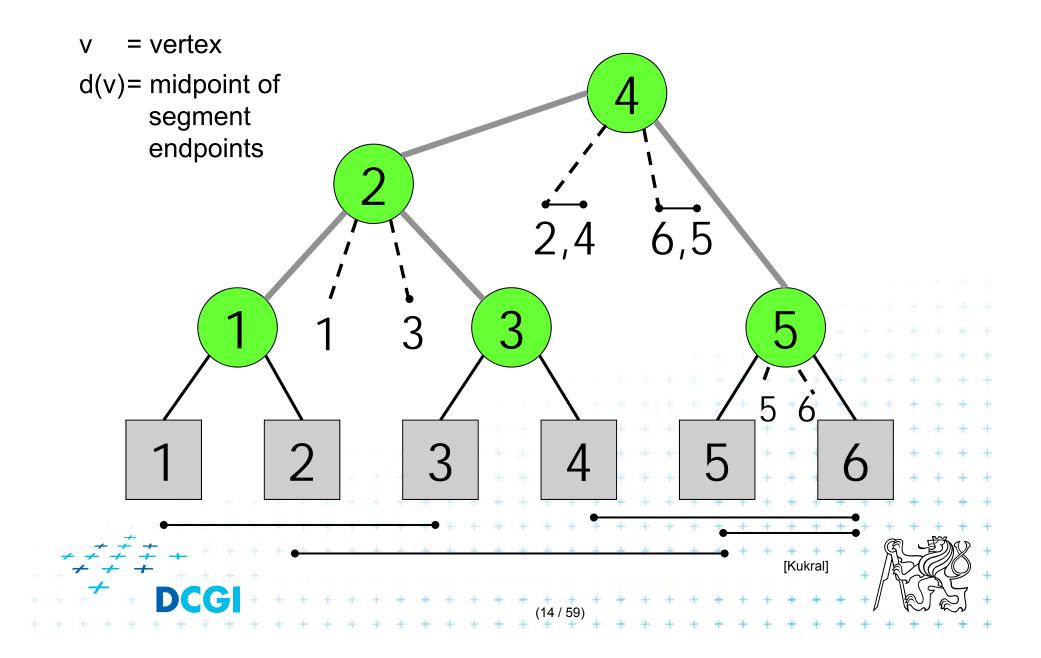
### **Interval tree principle**



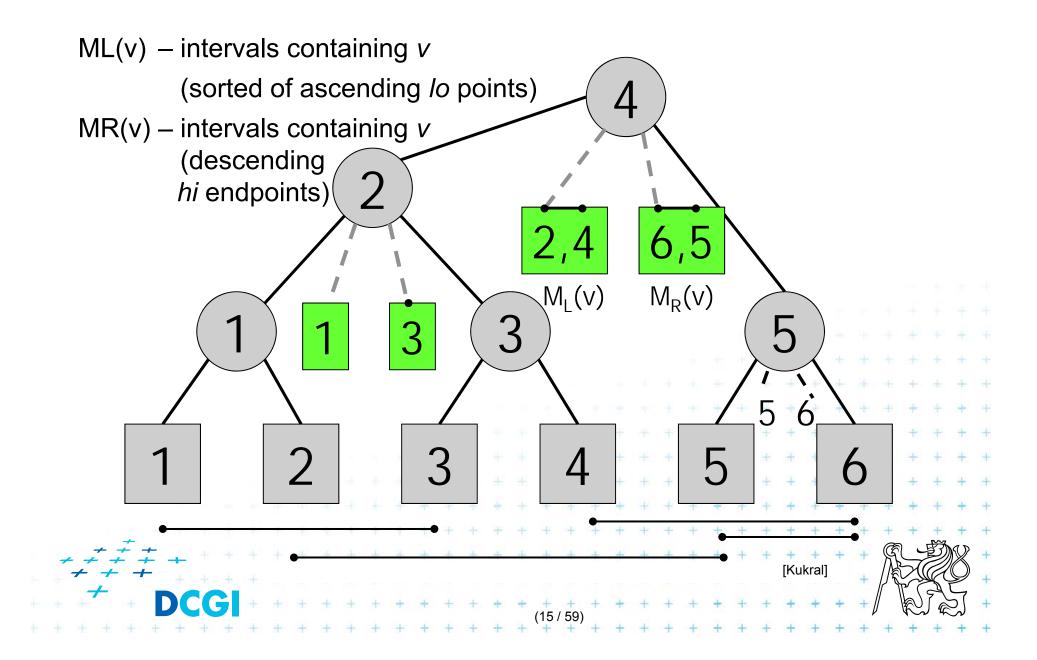
#### Static interval tree [Edelsbrunner80]



#### **Primary structure – static tree for endpoints**



#### Secondary lists – sorted segments in M



## **Interval tree construction**

Merged procedures from in lecture 09

- PrimaryTree(S) on slide 33
- InsertInterval (*b*, *e*, *T*) on slide 35

ConstructIntervalTree(S) // Intervals all activ	e – no active lists
Input: Set S of intervals on the real line – on x-axis	
Output: The root of an interval tree for S	
1. if $( S  == 0)$ return null	// no more intervals
2. else	
3. xMed = median endpoint of intervals in S	// median endpoint
4. L = { [xlo, xhi] in S   xhi < xMed }	// left of median
5. R = { [xlo, xhi] in S   xlo > xMed }	<pre>// right of median</pre>
6M = { [xlo, xhi] in S   xlo <= xMed <= xhi }	// contains median
7. $(\longrightarrow ML = sort M in increasing order of xlo$	// sort M
8. $\rightarrow$ MR = sort M in decreasing order of xhi	+ + + + + + + + + + +
9. t = new IntTreeNode(xMed, ML, MR)	// this node + + + + + +
10. t.left = ConstructIntervalTree(L)	// left subtree
11. t.right = ConstructIntervalTree(R)	// right subtree + + + +
12. return t	+ + + + + + + + + + +
*****	* * * * * * * * * * * * *
+ + + + + + + + + + + + + + + + + + +	+ + + [Mount] + + (C)
+ + + + + + + + + + + + + + + + + + + +	
+ + ' + <b>DCGI</b> + + + + + + + + + + + + + + + + + + +	

# Line stabbing query for an interval tree

```
Less effective variant of QueryInterval (b, e, T)
Stab(t, xq)
                                                     on slide 34 in lecture 09
         IntTreeNode t, Scalar xq
Input:
                                                     with merged parts: fork and search right
Output: prints the intersected intervals
    if (t == null) return
                                                       // no leaf: fell out of the tree
    if (xq < t.xMed)
2.
                                                       // left of median?
       for (i = 0; i < t.ML.length; i++)
3.
                                                       // traverse ML
               if (t.ML[i].lo \le xq) print(t.ML[i])
4.
                                                       // ..report if in range
5.
               else break
                                                       // ..else done
6.
       stab(t.left, xq)
                                                       // recurse on left
    else // (xq \geq t.xMed)
                                                       // right of or equal to median
7.
       for (i = 0; i < t.MR.length; i++) {
8.
                                                       // traverse MR + + +
               if (t.MR[i].hi \ge xq) print(t.MR[i]) // ..report if in range
9.
                                                      // ..else done
10.
               else break
       stab(t.right, xq)
                                                      // recurse on right
11.
    Note: Small inefficiency for xq == t.xMed – recurse on right
                                                                      [Mount]
                                       + + + + +
```

# **Complexity of line stabbing via interval tree**

- Construction  $O(n \log n)$  time
  - Each step divides at maximum into two halves or less (minus elements of M) => tree of height  $h = O(\log n)$
  - If presorted endpoints in three lists L,R, and M then median in O(1) and copy to new L,R,M in O(n)]
- Vertical line stabbing query  $O(k + \log n)$  time
  - One node processed in O(1 + k'), k'reported intervals
  - v visited nodes in O(v + k), k total reported intervals
  - $v = h = \text{tree height} = O(\log n)$   $k = \Sigma k'$
- Storage O(n)

   Tree has O(n) nodes, each segment stored twice
   Image: A store and points)
   Image: DCGI
   (18/59)

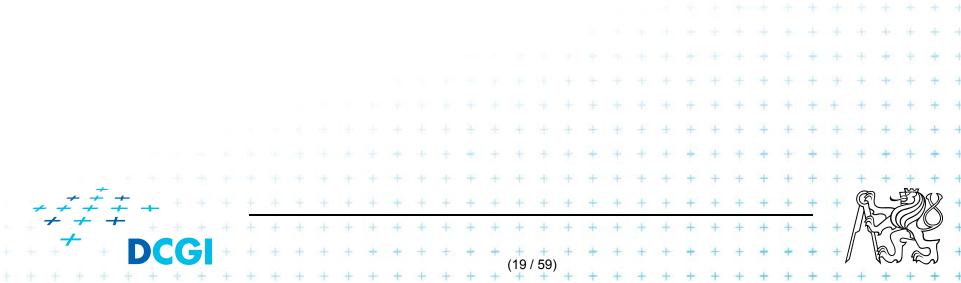
# **Talk overview**

- 1. Windowing of axis parallel line segments in 2D (variants of *interval tree IT*)
  - i. Line stabbing (standard *IT* with sorted lists)

ii. Line segment stabbing (*IT* with *range trees*)

- iii. Line segment stabbing (*IT* with *priority search trees*)
- 2. Windowing of line segments in general position

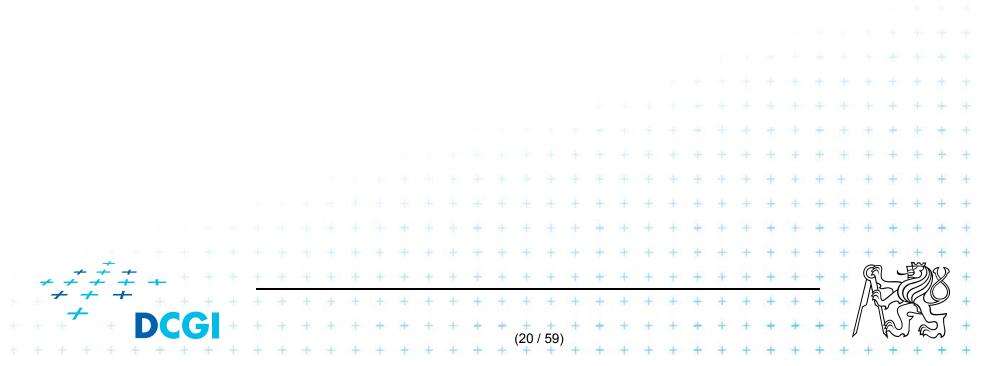
segment tree



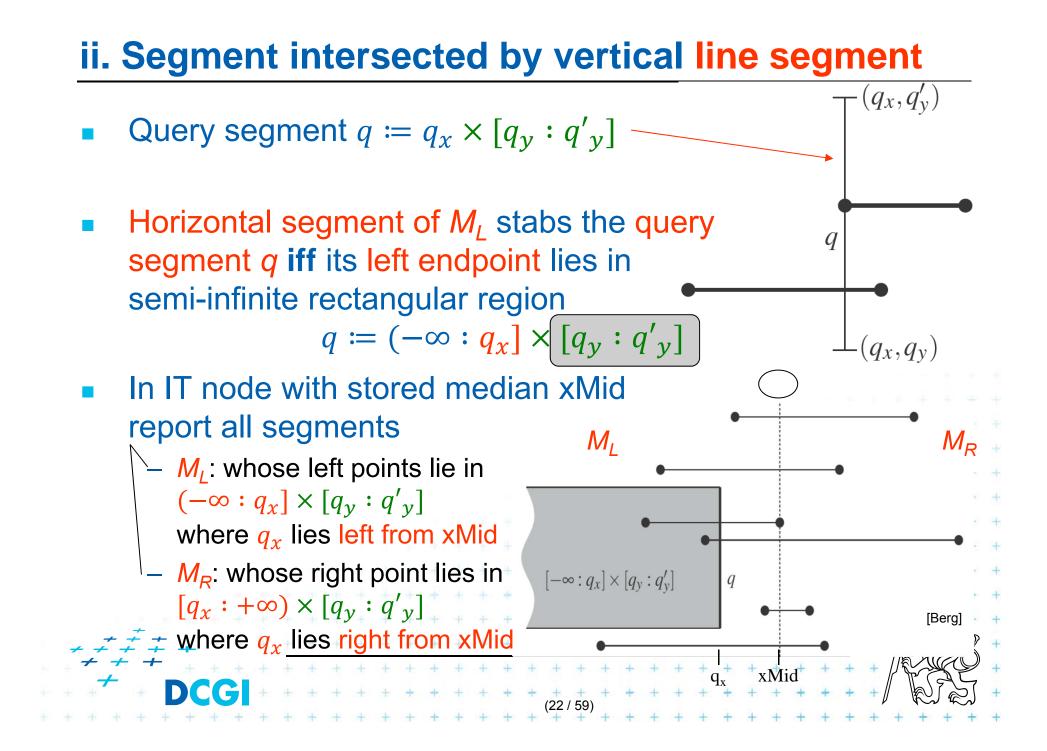
Line segment stabbing (*IT* with *range trees*)

Enhance 1D interval trees to 2D

- Change 1D test  $q_x \in \langle x, x' \rangle$ done by interval tree with sorted lists M<sub>L</sub> and M<sub>R</sub> into 2D test  $q_x \in (-\infty : q_x]$
- $\begin{array}{ll} \text{ and change lines} & q_x \times [-\infty : \infty] & (\text{no y-test}) \\ \text{ to segments} & q_x \times [q_y : q'_y] & (\text{additional y-test}) \end{array}$

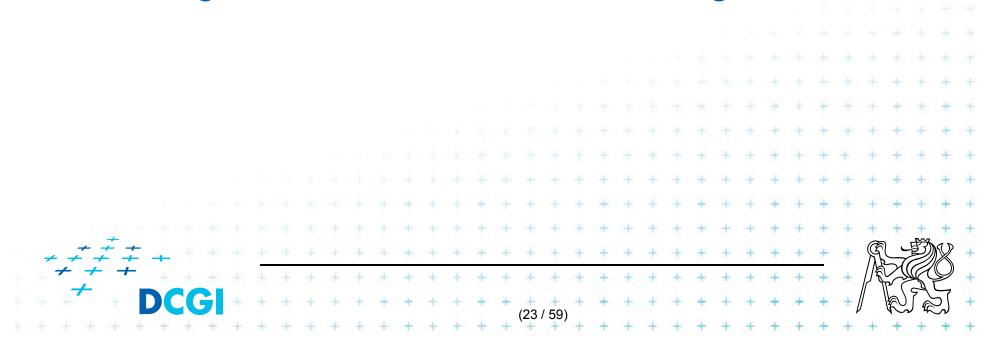


#### i. Segment intersected by vertical line - 2D Query line $l \coloneqq q_x \times [-\infty : \infty]$ Horizontal segment of *M* stabs the query line *l* iff its left endpoint lies in halph-space $q \coloneqq (-\infty : q_{\chi}] \times [-\infty : \infty]$ In IT node with stored median xMid report all segments from M $- M_1$ : whose left point lies in $(-\infty : q_x]$ if $\ell$ lies left from xMid $M_{R}$ : whose right point lies in $[q_{\chi}:+\infty)$ Inspired by [Berg] if *l* lies right from xMid

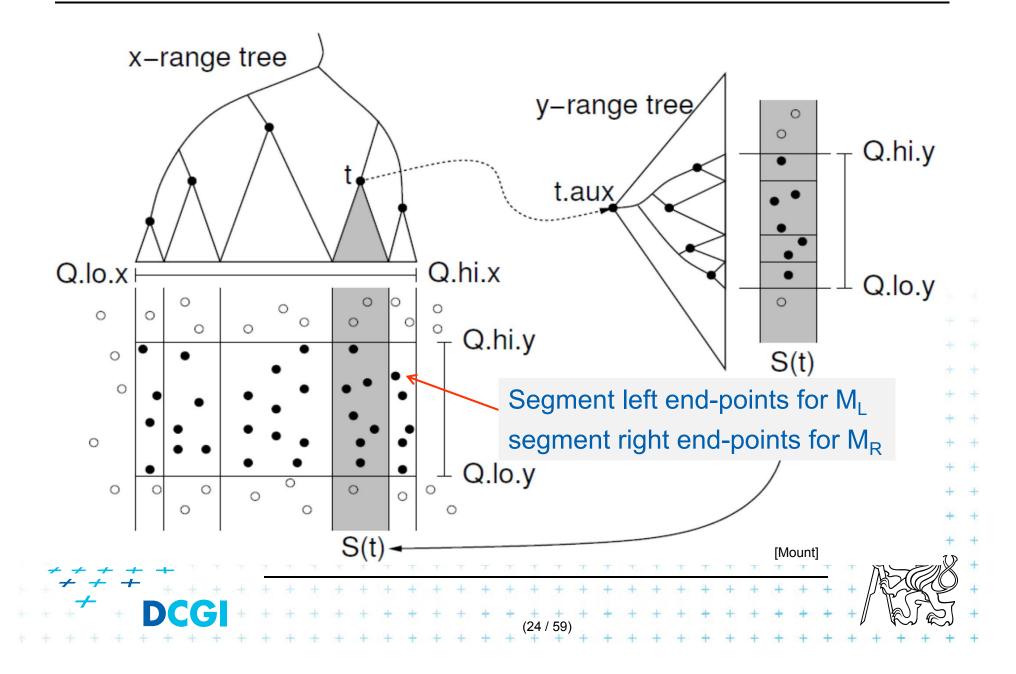


#### **Data structure for endpoints**

- Storage of M<sub>L</sub> and M<sub>R</sub>
  - 1D Sorted lists not enough for line segments
  - Use two 2D range trees
- Instead O(n) sequential search in M<sub>L</sub> and M<sub>R</sub> perform O(log n) search in range tree with fractional cascading



#### **2D range tree** (without fractional cascading-more in Lecture 3)



# **Complexity of line segment stabbing**

- Construction O(n log n) time
  - Each step divides at maximum into two halves L,R
     or less (minus elements of M) => tree height O(log n)
  - If the range trees are efficiently build in O(n) after points sorted
- Vertical line segment stab. q.  $O(k + \log^2 n)$  time <sup>2D range tree search with Fractional Cascading</sup>
  - One node processed in O(log n + k'), k'=reported inter.
  - v-visited nodes in O( $\gamma \log n + k$ ), k=total reported inter.
  - -v = interval tree height = O(log n)
  - $-O(k + \log^2 n)$  time range tree with fractional cascading
  - $-O(k + \log^3 n)$  time range tree without fractional casc.

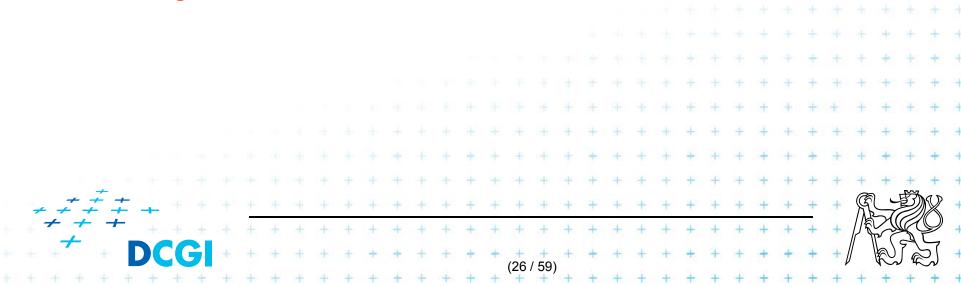
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2. Windowing of line segments in general position

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- Priority search trees in case c) on slide 9
  - Exploit the fact that query rectangle in range queries is unbounded (in x direction)
  - Can be used as secondary data structures for both left and right endpoints (ML and MR) of segments in nodes of interval tree – one for ML, one for MR
  - Improve the storage to O(n) for horizontal segment intersection with window edge (Range tree has O(n log n))
- For cases a) and b) O(n log n) remains

we need range trees for windowing segment endpoints



#### **Rectangular range queries variants**

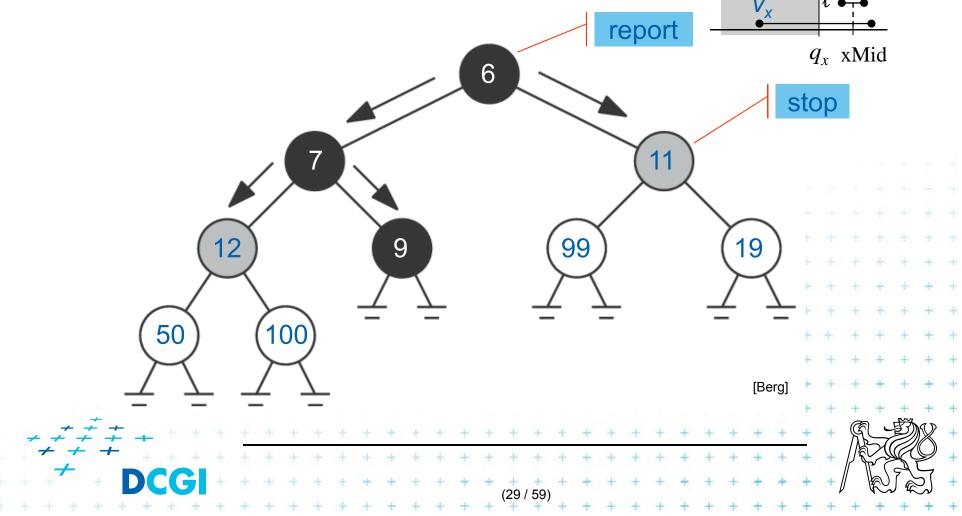
- Let  $P = \{ p_1, p_2, \dots, p_n \}$  is set of points in plane
- Goal: rectangular range queries of the form  $(-\infty : q_x] \times [q_y; q'_y]$
- In 1D: search for nodes v with  $v_x \in (-\infty; q_x]$ 
  - range tree  $O(\log n + k)$  time
  - ordered listO(1 + k) time<br/>(start in the leftmost, stop on v with  $v_x > q_x$ )- use heapO(1 + k) time !

(traverse all children, stop when  $v_x > q_x$ )

■ In 2D – use heap for points with  $x \in (-\infty : q_x]$ + integrate information about y-coordinate  $\neq \neq \neq \neq +$ DCGI

## Heap for 1D unbounded range queries

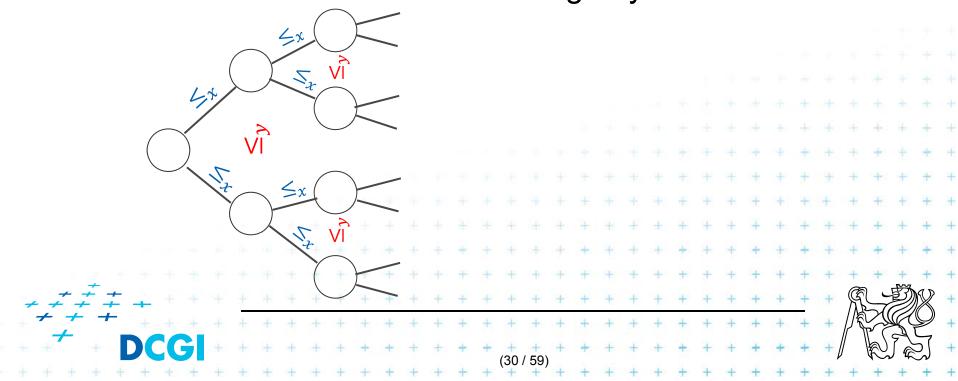
- Traverse all children, stop when  $v_x > q_x$
- Example: Query (–∞:10]



# **Principle of priority search tree**

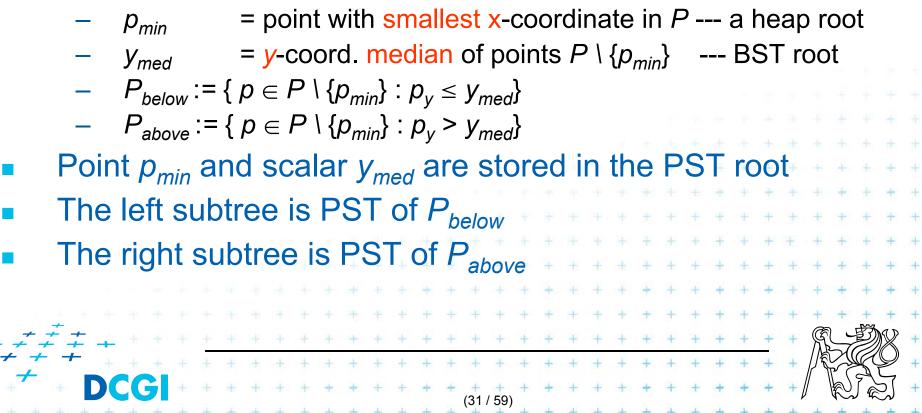
Heap

- relation between parent and its child nodes
- no relation between the child nodes themselves
- Priority search tree
  - relate the child nodes according to y

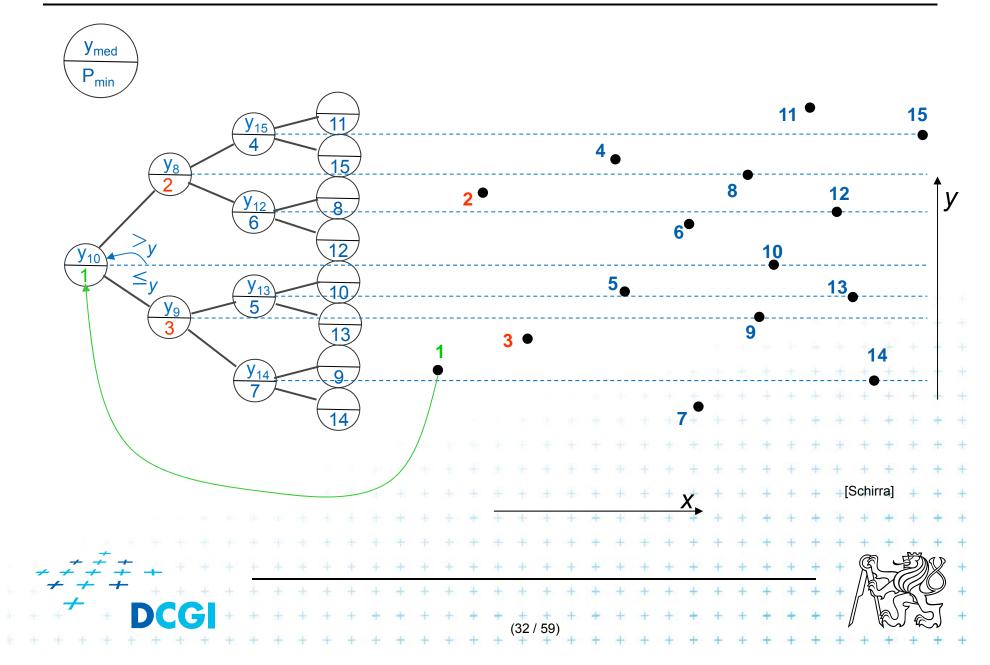


# **Priority search tree (PST)**

- Heap in 2D can incorporate info about both x, y
  - BST on y-coordinate (horizontal slabs) ~ range tree
  - Heap on x-coordinate (minimum x from slab along x)
- If P is empty, PST is empty leaf
- else



## **Priority search tree construction example**



## **Priority search tree construction**

```
PrioritySearchTree(P)
Input: set P of points in plane
Output: priority search tree T
1. if P=\phi then PST is an empty leaf
2.
    else
3.
              = point with smallest x-coordinate in P
                                                        // heap on x root
       p<sub>min</sub>
              = y-coord. median of points P \setminus \{p_{min}\}
                                                         // BST on y root
4.
       Y<sub>med</sub>
       Split points P \setminus \{p_{min}\} into two subsets – according to y_{med}
5.
6.
              P_{below} := \{ p \in P \setminus \{p_{min}\} : p_v \leq y_{med} \}
7.
              P_{above} := \{ p \in P \setminus \{p_{min}\} : p_v > y_{med} \}
                                                         Notation in alg:
       T = \text{newTreeNode}()
8.
                                                      ... p(v)
       T.p = p_{min} // point [ x, y ]
9.
10.
    T.y = y_{mid} // skalar
                                11.T.left = PrioritySearchTree(P_{below})\dots Ic(v)12.T.rigft = PrioritySearchTree(P_{above})\dots rc(v)
13. O(n \log n), but O(n) if presorted on y-coordinate and bottom up
```

# **Query Priority Search Tree**

QueryPrioritySearchTree( $T, (-\infty : q_x] \times [q_v; q'_v]$ ) A priority search tree and a range, unbounded to the left Input: Output: All points lying in the range

- 1. Search with  $q_y$  and  $q'_y$  in T // BST on y-coordinate select y range Let  $v_{split}$  be the node where the two search paths split (split node)
- 2. for each node v on the search path of  $q_v$  or  $q'_v$  // points along the paths
- if  $p(v) \in (-\infty; q_x] \times [q_v; q'_v]$  then report p(v) // starting in tree root 3.
- for each node v on the path of  $q_v$  in the left subtree of  $v_{split}$  // inner trees 4.

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- if the search path goes left at v 5.
- ReportInSubtree( $rc(v), q_x$ ) // report right subtree 6.
- for each node v on the path of  $q'_v$  in right subtree of  $v_{split}$ 7.
- if the search path goes right at v 8. 9.
  - ReportInSubtree( $lc(v), q_x$ ) // rep. left subtree

# **Reporting of subtrees between the paths**

#### **ReportInSubtree**( $v, q_x$ )

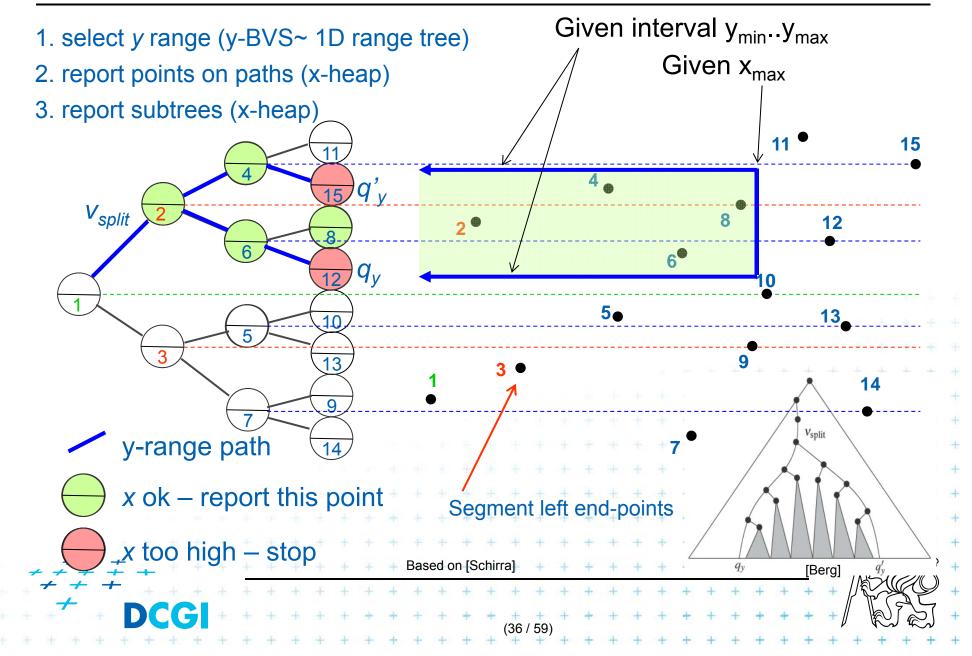
*Input:* The root *v* of a subtree of a priority search tree and a value  $q_x$ . *Output:* All points in the subtree with *x*-coordinate at most  $q_x$ .

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- 1. if v is not a leaf and  $x(p(v)) \le q_x$
- 2. Report p(v).
- 3. ReportInSubtree( $lc(v), q_x$ )
- 4. ReportInSubtree( $rc(v), q_x$ )

 $// X \in (-\infty; q_x]$  -- heap condition

#### **Priority search tree query**



## **Priority search tree complexity**

For set of *n* points in the plane

- Build O(n log n)
- Storage O(n)
- Query  $O(k + \log n)$ 
  - points in query range  $(-\infty : q_x] \times [q_y; q'_y])$
  - k is number of reported points

 Use Priority search tree as associated data structure for interval trees for storage of M (one for M<sub>L</sub>, one for M<sub>R</sub>)

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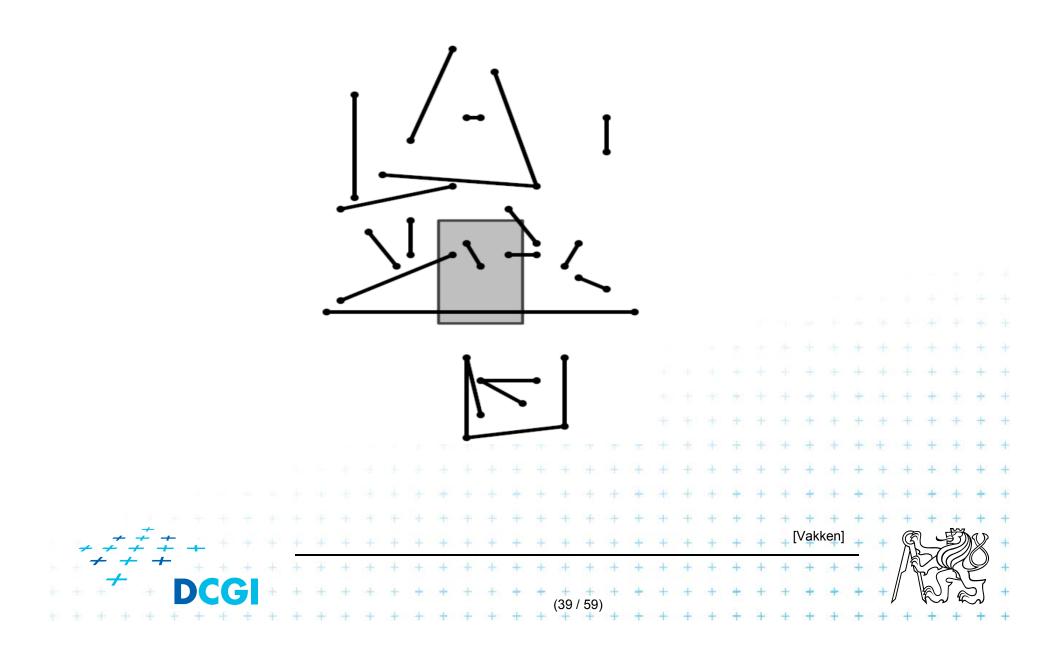
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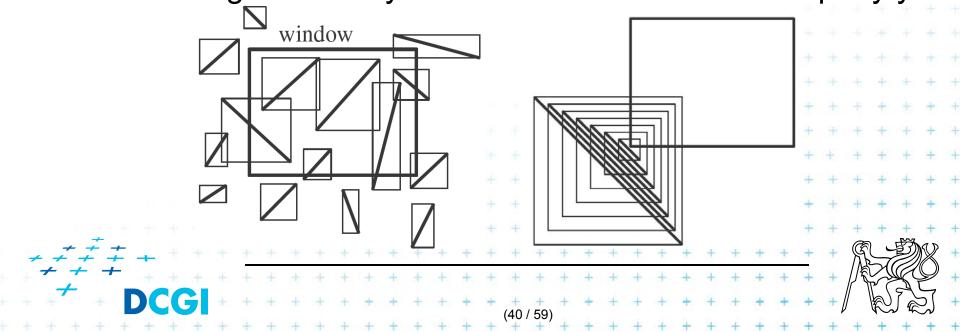
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#### 2. Windowing of line segments in general position



#### Windowing of arbitrary oriented line segments

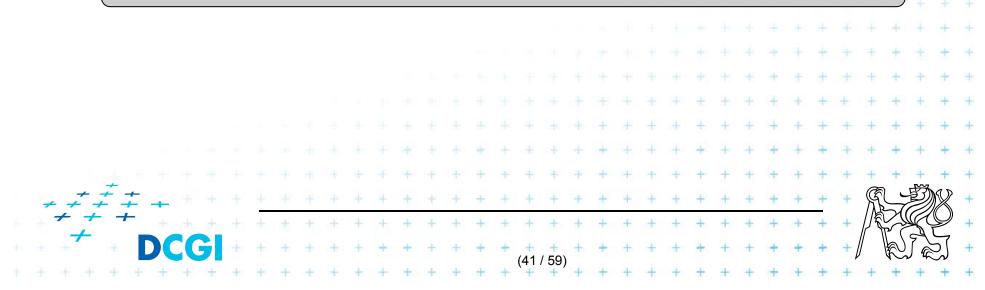
- Two cases of intersection
  - a,b) Endpoint inside the query window => range tree
  - c) Segment intersects side of query window => ???
- Intersection with BBOX (segment bounding box)?
  - Intersection with 4n sides
  - But segments may not intersect the window -> query y



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– segment tree



#### Exploits locus approach

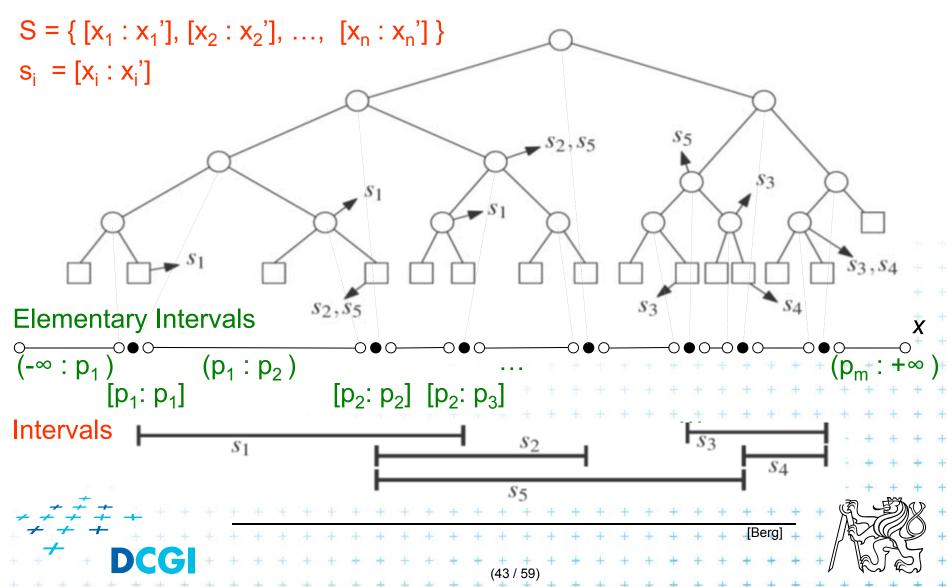
- Partition parameter space into regions of same answer
- Localization of such region = knowing the answer
- For given set S of *n* intervals (segments) on real line
  - Finds *m* elementary intervals (induced by interval end-points)

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- Stores intervals s<sub>i</sub> with the elementary intervals
- Reports the intervals  $s_i$  containing query point  $q_x$ .

## **Segment tree example**

Intervals



# **Segment tree definition**

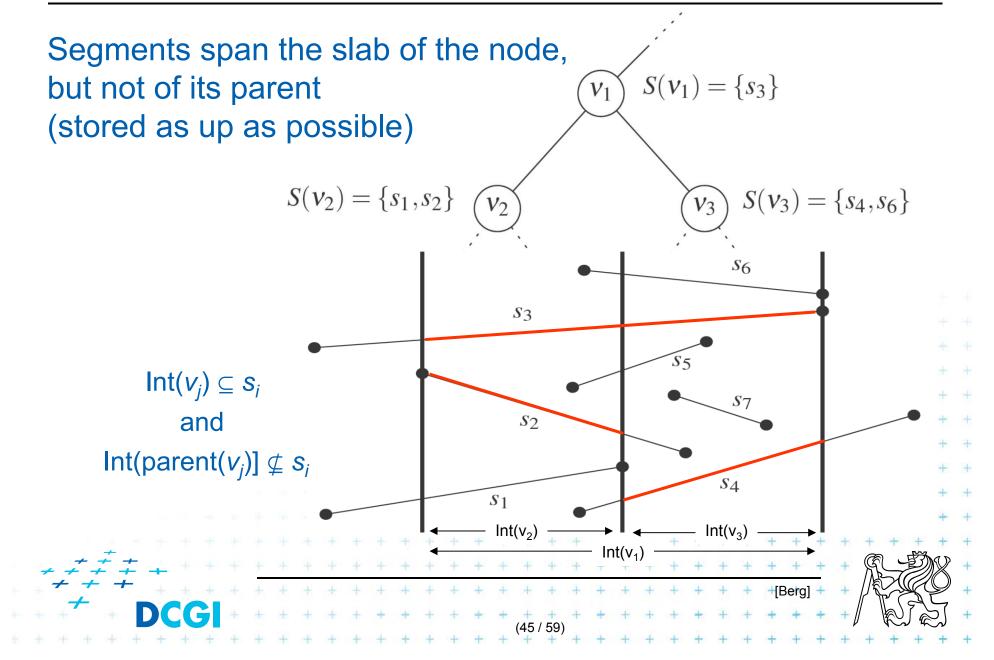
#### Segment tree

- Skeleton is a balanced binary tree T
- Leaves ~ elementary intervals Int(v)
- Internal nodes v
  - ~ union of elementary intervals of its children
    - Store: 1. interval Int(v) = union of elementary intervals
      - of its children segments s<sub>i</sub>
      - 2. canonical set S(v) of intervals  $[x : x'] \in S$
    - Holds  $Int(v) \subseteq [x : x']$  and  $Int(parent(v)] \not\subseteq [x : x']$ (node interval is not larger than the segment)
    - Intervals [x : x'] are stored as high as possible, such that

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Int(v) is completely contained in the segment

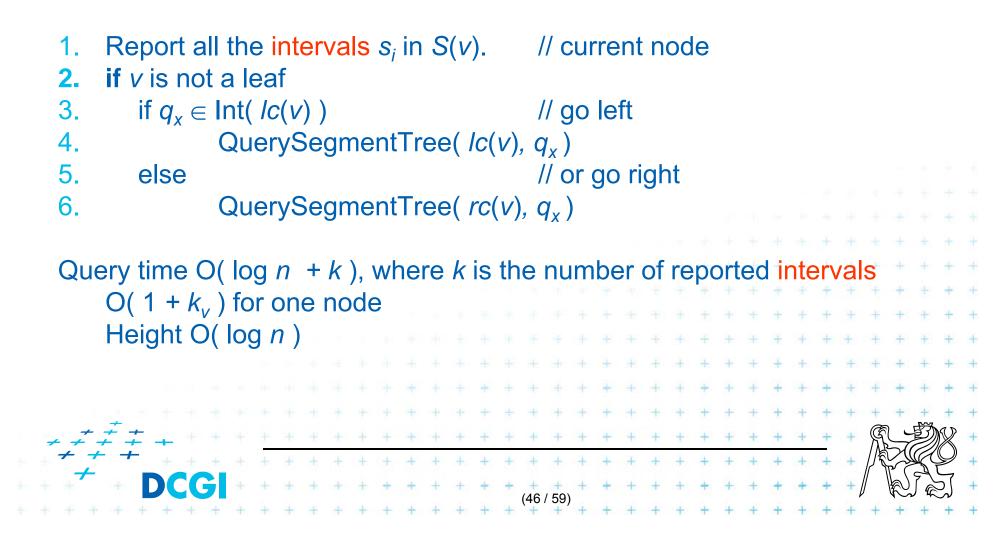
### **Segments span the slab**



## **Query segment tree – stabbing query**

QuerySegmentTree(v,  $q_x$ ) Input: The root of a (subtree of a) segment tree and a query point  $q_x$ 

*Output:* All intervals in the tree containing  $q_x$ .



## **Segment tree construction**

ConstructSegmentTree(*S*) Input: Set of intervals *S* - segments Output: segment tree

- Sort endpoints of segments in S -> get elemetary intervals ...O(n log n)
- 2. Construct a binary search tree *T* on elementary intervals  $\dots O(n)$  (bottom up) and determine the interval Int(v) it represents
- 3. Compute the canonical subsets for the nodes (lists of their segments):
- 4. v = root(T)5. for all segments  $s_i = [x : x'] \in S$ 6. InsertSegmentTree(v, [x : x']) 6. v = root(T)

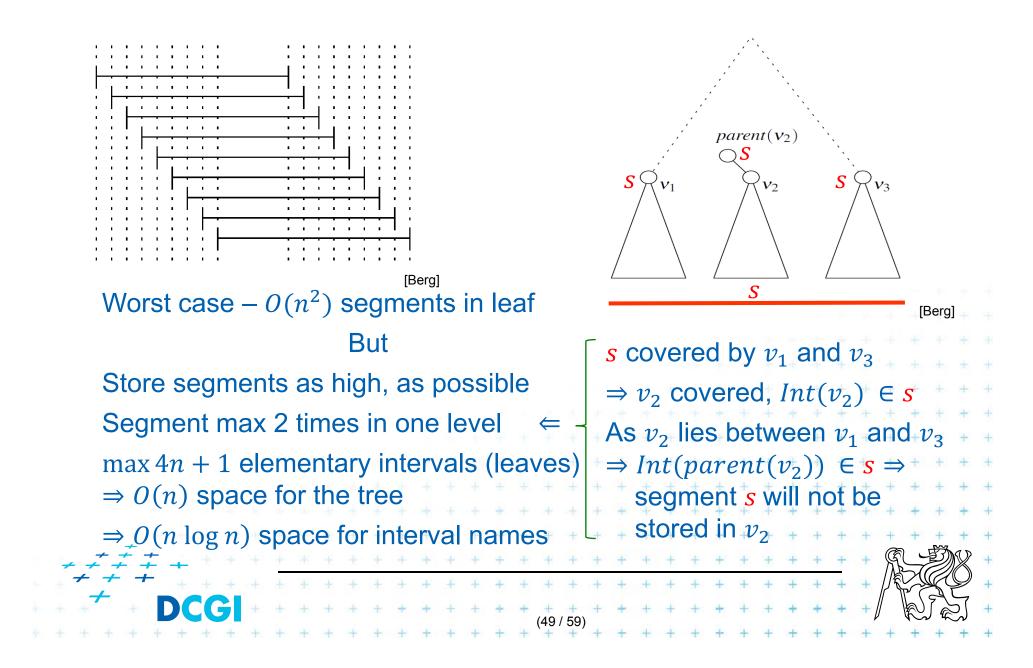
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#### **Segment tree construction – interval insertion**

```
InsertSegmentTree(v, [x : x'])
Input:
        The root of (a subtree of) a segment tree and an interval.
Output: The interval will be stored in the subtree.
    if Int(v) \subseteq [x : x']
                                          // Int(v) contains s_i = [x : x']
       store [ x : x' ] at v
2
    else if Int(lc(v)) \cap [x : x'] \neq \phi
3.
           InsertSegmentTree(lc(v), [x : x'])
4.
         if Int(rc(v)) \cap [x : x'] \neq \phi
5.
           InsertSegmentTree(rc(v), [x : x'])
6.
One interval is stored at most twice in one level =>
    Single interval insert O(\log n), insert n intervals O(2n \log n)
    Construction total O(n \log n)
Storage O(n \log n)
    Tree height O(\log n), name stored max 2x in one level
    Storage total O(n \log n) – see next slide
                 + + + + + + + + + + +
```

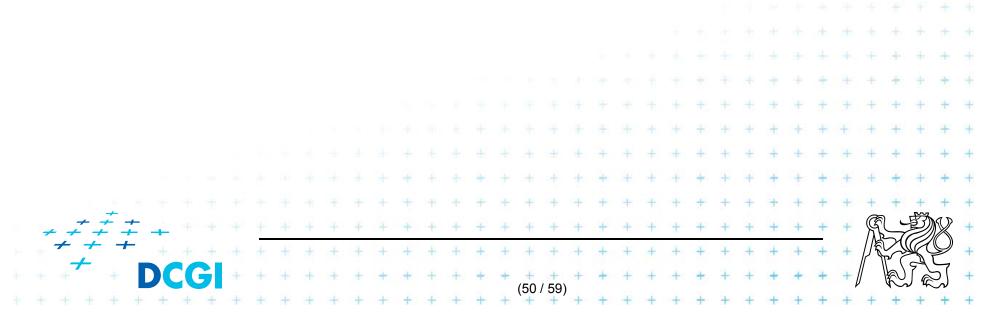
## **Space complexity - notes**



# **Segment tree complexity**

A segment tree for set *S* of *n* intervals in the plane,

- Build O(n log n)
- Storage O(n log n)
- Query  $O(k + \log n)$ 
  - Report all intervals that contain a query point
  - k is number of reported intervals



## **Segment tree versus Interval tree**

#### Segment tree

- $O(n \log n)$  storage x O(n) of Interval tree
- But returns exactly the intersected segments s<sub>i</sub>, interval tree must search the lists ML and/or MR

#### Good for

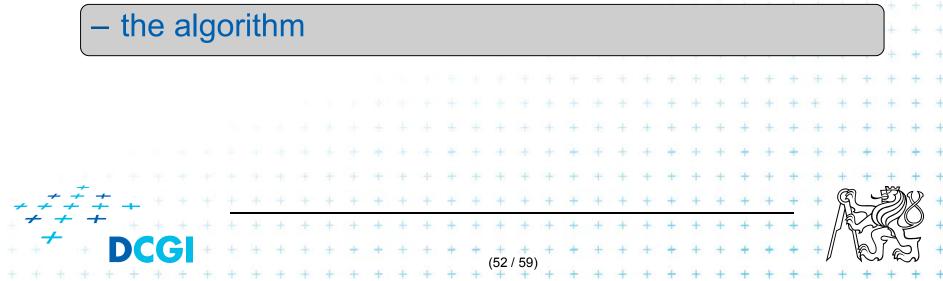
- 1. extensions (allows different structuring of intervals)
- 2. stabbing counting queries
  - store number of intersected intervals in nodes
  - -O(n) storage and  $O(\log n)$  query time = optimal
- 3. higher dimensions multilevel segment trees

(Interval and priority search trees do not exist in ^dims)

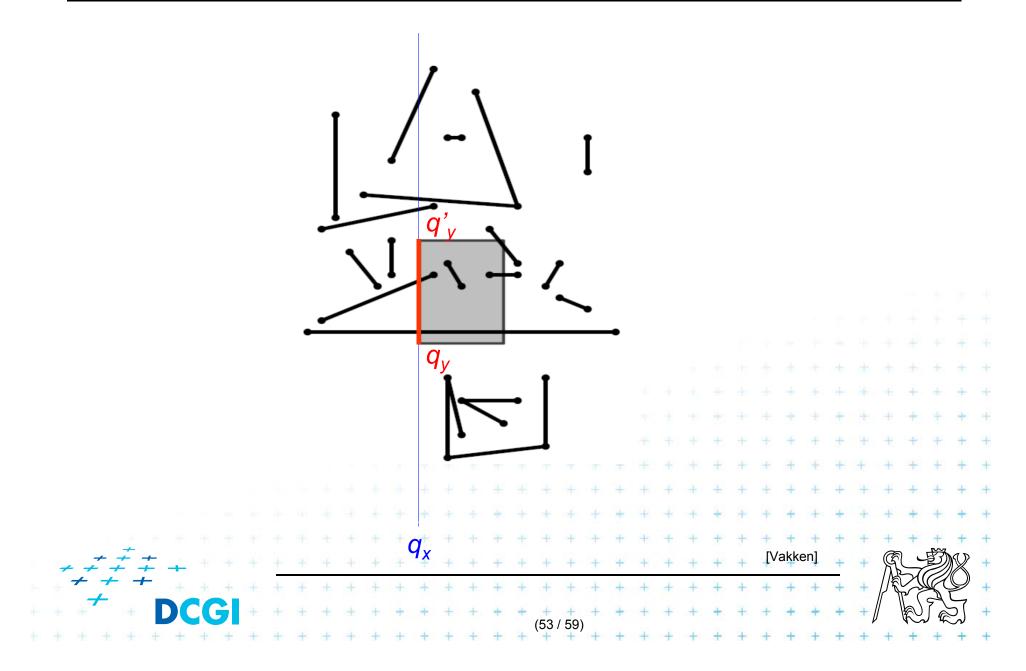
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# **Talk overview**

- 1. Windowing of axis parallel line segments in 2D (variants of *interval tree IT*)
  - i. Line stabbing (standard *IT* with sorted lists)
  - ii. Line segment stabbing (*IT* with *range trees*)
  - iii. Line segment stabbing (*IT* with *priority search trees*)
- 2. Windowing of line segments in general position
  - segment tree

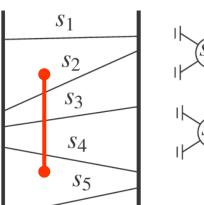


#### 2. Windowing of line segments in general position



#### Windowing of arbitrary oriented line segments

- Let S be a set of arbitrarily oriented line segments in the plane.
- Report the segments intersecting a vertical query segment q := q<sub>x</sub> × [q<sub>y</sub> : q'<sub>y</sub>]
- Segment tree T on x intervals of segments in S
  - node v of T corresponds to vertical slab  $Int(v) \times (-\infty : \infty)$
  - segments span the slab of the node, but not of its parent
  - segments do not intersect
    - => segments in the slab (node) can be vertically ordered BST



[Bera]

#### **Segments between vertical segment endpoints**

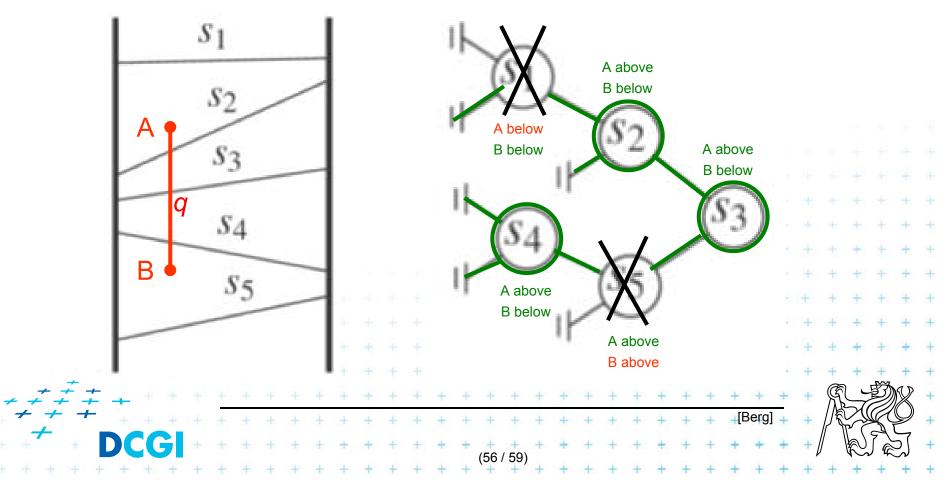
- Segments (in the slab) do not mutually intersect
  - => segments can be vertically ordered and stored in BST
  - Each node v of the x segment tree has an associated y BST
  - BST T(v) of node v stores the canonical subset S(v) according to the vertical order
  - Intersected segments can be found by searching T(v) in O( $k_v$  + log n),  $k_v$  is the number of intersected segments

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#### Segments between vertical segment endpoints

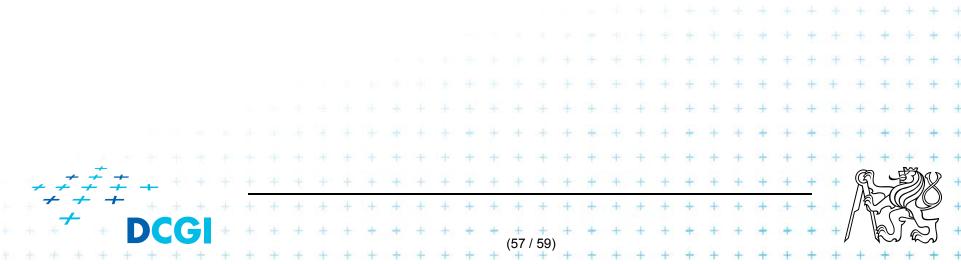
- Segment s is intersected by vert.query segment q iff
  - The lower endpoint (B) of q is below s and
  - The upper endpoint (A) of q is above s



Windowing of arbitrary oriented line segments complexity

Structure associated to node (BST) uses storage linear in the size of S(v)

- Build  $O(n \log n)$
- Storage  $O(n \log n)$
- Query  $O(k + \log^2 n)$ 
  - Report all segments that contain a query point
  - k is number of reported segments



Windowing of line segments in 2D – conclusions

Construction: all variants O(n logn)

- 1. Axis parallelSearchMemoryi. Line (sorted lists) $O(k + \log n)$ O(n)
  - ii. Segment (*range trees*)  $O(k + \log^2 n) O(n \log n)$

```
iii. Segment (priority s. tr.) O(k + \log n) O(n)

2. In general position

- segment tree O(k + \log^2 n) O(n \log n)

f = \int_{-\infty}^{+\infty} DCGI
```

### References

| [Berg] | Mark de Berg, Otfried Cheong, Marc van Kreveld, Mark Overmar    |  |  |  |  |  |  |  |  |  |  |
|--------|-----------------------------------------------------------------|--|--|--|--|--|--|--|--|--|--|
|        | Computational Geometry: Algorithms and Applications, Springer-  |  |  |  |  |  |  |  |  |  |  |
|        | Verlag, 3rd rev. ed. 2008. 386 pages, 370 fig. ISBN: 978-3-540- |  |  |  |  |  |  |  |  |  |  |
|        | 77973-5, Chapters 3 and 9, http://www.cs.uu.nl/geobook/         |  |  |  |  |  |  |  |  |  |  |

[Mount] David Mount, - CMSC 754: Computational Geometry, Lecture Notes for Spring 2007, University of Maryland, Lectures 7,22, 13,14, and 30.

http://www.cs.umd.edu/class/spring2007/cmsc754/lectures.shtml

[Rourke] Joseph O'Rourke: Computational Geometry in C, Cambridge University Press, 1993, ISBN 0-521- 44592-2 <u>http://maven.smith.edu/~orourke/books/compgeom.html</u>

- [Vigneron] Segment trees and interval trees, presentation, INRA, France, http://w3.jouy.inra.fr/unites/miaj/public/vigneron/cs4235/slides.html
- [Schirra] Stefan Schirra. Geometrische Datenstrukturen. Sommersemester 2009 <u>http://wwwisg.cs.uni-</u> magdeburg.de/ag/lehre/SS2009/GDS/slides/S10.pdf

