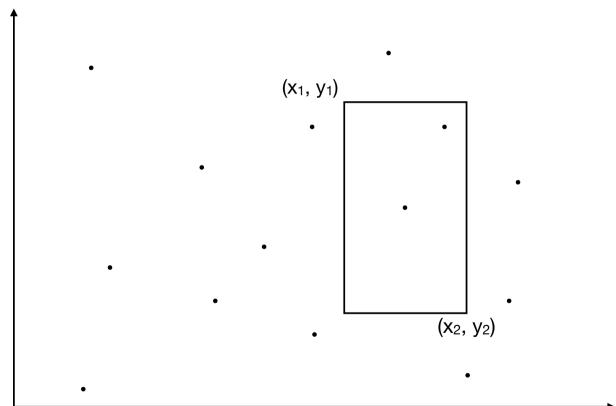
- Range reporting problem
- 1D range reporting
- · 2D range reporting
  - Range trees
  - Predecessor in nested sets
  - kD trees

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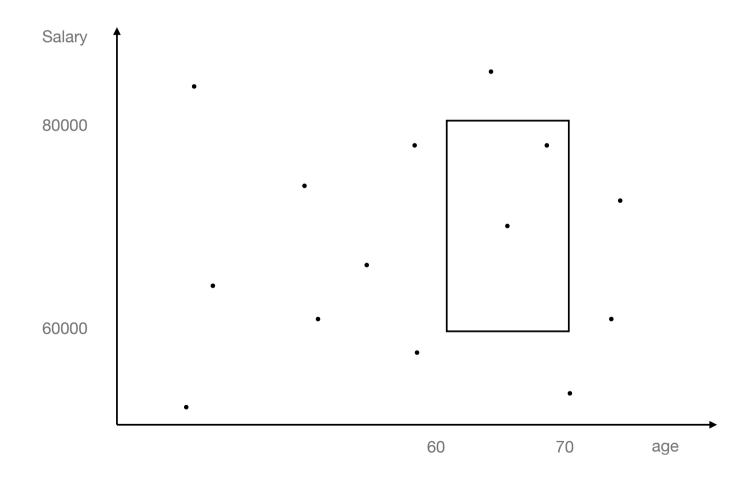
## Range Reporting Problem

- 2D range reporting problem. Preprocess at set of points  $P \subseteq \Re^2$  to support
  - report( $x_1$ ,  $y_1$ ,  $x_2$ ,  $y_2$ ): Return the set of points in R  $\cap$  P, where R is rectangle given by ( $x_1$ ,  $y_1$ ) and ( $x_2$ ,  $y_2$ ).



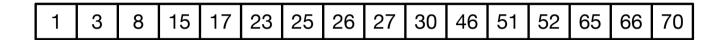
## **Applications**

 Relational databases. SELECT all employees between 60 and 70 years old with a montly salary between 60000 and 80000 DKr



- Range reporting problem
- 1D range reporting
- · 2D range reporting
  - Range trees
  - Predecessor in nested sets
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- 1D range reporting. Preprocess a set of n points P ⊆ ℜ to support:
  - report( $x_1, x_2$ ): Return the set of points in interval [ $x_1, x_2$ ]
- Output sensitivity. Time should depend on the size of the output.
- · Simplifying assumption. Only comparison-based techniques (e.g. no hashing or bittricks).
- Solutions?



- Sorted array. Store P in sorted order.
- Report( $x_1, x_2$ ): Binary search for predecessor of  $x_1$ . Traverse array until >  $x_2$ .
- Time. O(log n + occ)
- · Space. O(n)
- Preprocessing. O(n log n)

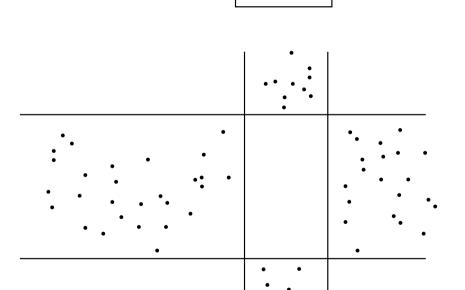
- Theorem. We can solve the 1D range reporting problem in
  - · O(n) space.
  - O(log n + occ) time for queries.
  - O(n log n) preprocessing time.
- Optimal in comparison-based model.

- Range reporting problem
- 1D range reporting
- · 2D range reporting
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  - kD trees

- · Goal. 2D range reporting with
  - O(n log n) space and O(log n + occ) query time or
  - O(n) space and  $O(\sqrt{n} + occ)$  query time.
- Solution in 4 steps.
  - · Generalized 1D range reporting.
  - · 2D range trees.
  - 2D range trees with bridges.
  - · kD trees.

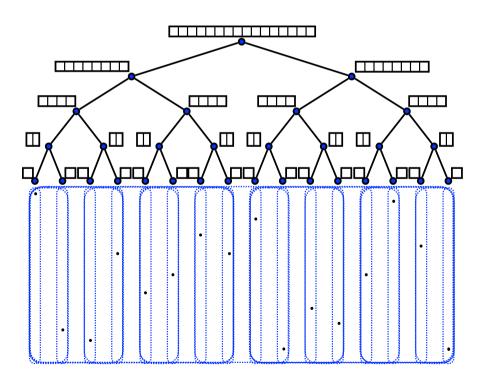
## Generalized 1D Range Reporting

- Data structure.
  - Sorted array over x-coordinate
  - Sorted array over y-coordinate
- Report(x<sub>1</sub>, y<sub>1</sub>, x<sub>2</sub>, y<sub>2</sub>):
  - · Compute all points R<sub>x</sub> in x-range.
  - · Compute all points R<sub>y</sub> in y-range.
  - $\bullet \ \ Return \ R_x \cap R_y$
- · Time?



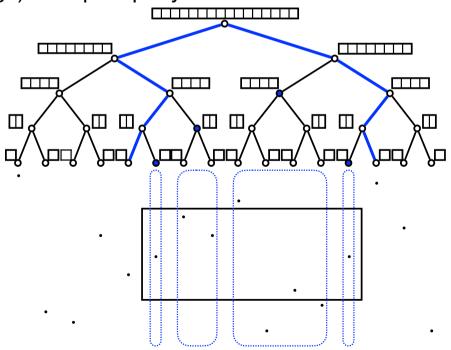
## 2D Range Trees

- Data structure.
  - Perfectly balanced binary tree over x-coordinate.
  - Each node v stores array of points below v sorted by y coordinate.
- Space?
  - O(n log n).
- Preprocessing time. O(n log n)



### 2D Range Trees

- Report( $x_1, y_1, x_2, y_2$ ): Find paths to predecessor of  $x_1$  and successor of  $x_2$ .
  - At each off-path node do 1D query on y-range.
  - · Return union of results.
- Time?
  - Predecessor + successor: O(log n)
  - < 2log n 1D queries: O(log n + occ in subrange) time per query.</li>
  - $\Rightarrow$  total O(log<sup>2</sup> n + occ) time.

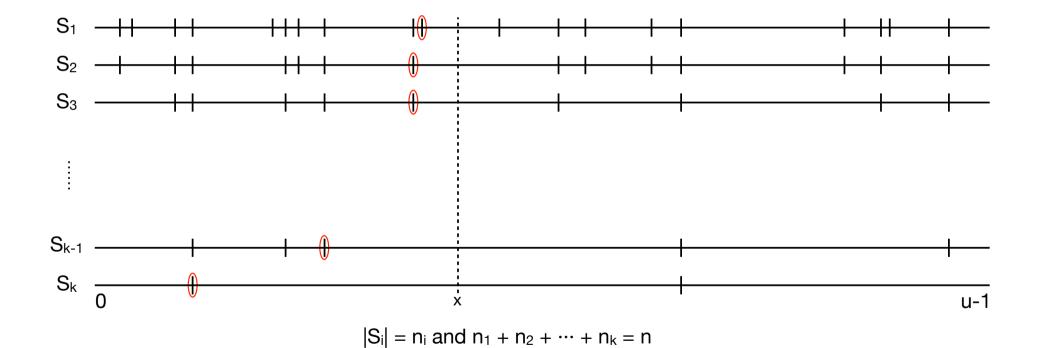


- Theorem. We can solve the 2D range reporting problem in
  - · O(n log n) space.
  - O(log² n + occ) time for queries.
  - O(n log n) preprocessing time.
- Challenge. Do we really need the log<sup>2</sup> n term for queries? Can we get (optimal) O(log n + occ) instead?

- Range reporting problem
- 1D range reporting
- · 2D range reporting
  - Range trees
  - Predecessor in nested sets
  - kD trees

#### Predecessor in Nested Sets

- Predecessor problem in nested sets. Let  $S = \{S_1, S_2, ..., S_k\}$  be a family of sets from universe U such that  $U \supseteq S_1 \supseteq S_2 \supseteq \cdots \supseteq S_k$ .
  - predecessor(x): return the predecessor of x in each of S<sub>1</sub>, S<sub>2</sub>, ..., S<sub>k</sub>.

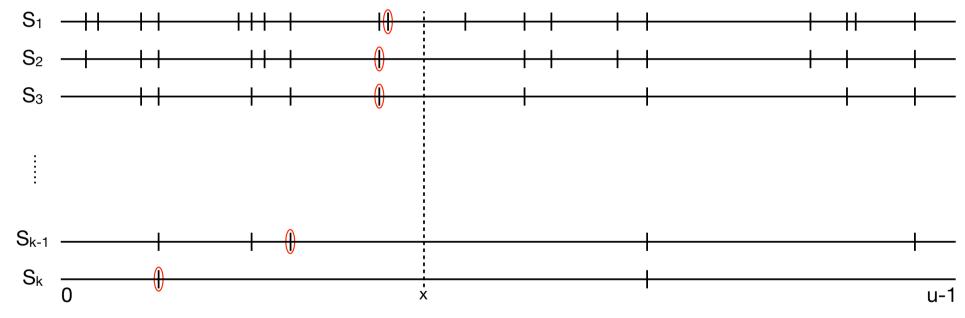


#### Predecessor in Nested Sets

- Goal. Predecessor in nested sets with O(n) space and O(log n + k) query time.
- Solution in 3 steps.
  - Sorted arrays. Slow and linear space.
  - Tabulation. Fast but too much space.
  - Sorted arrays with bridges. Fast and little space.

### Solution 1: Sorted Arrays

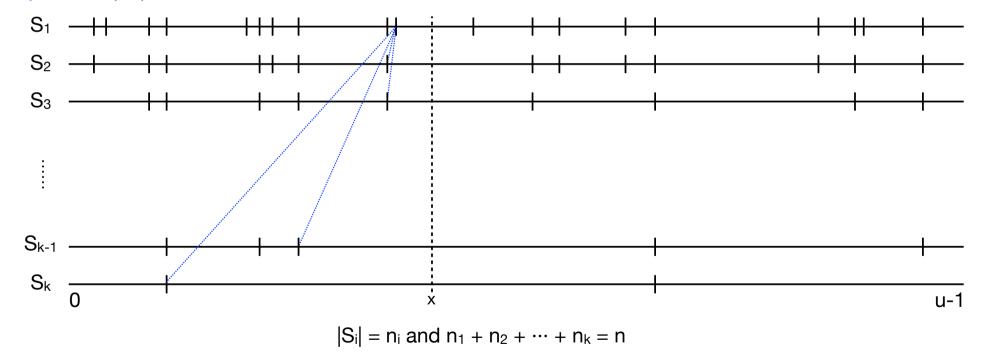
- Data structure. Sorted arrays for each set.
- Predecessor(x): Binary search in each array.
- Time.  $O(\log n_1 + \log n_2 + \cdots + \log n_k) = O(k \log n)$
- · Space. O(n)



$$|S_i| = n_i \text{ and } n_1 + n_2 + \dots + n_k = n$$

#### Solution 2: Tabulation

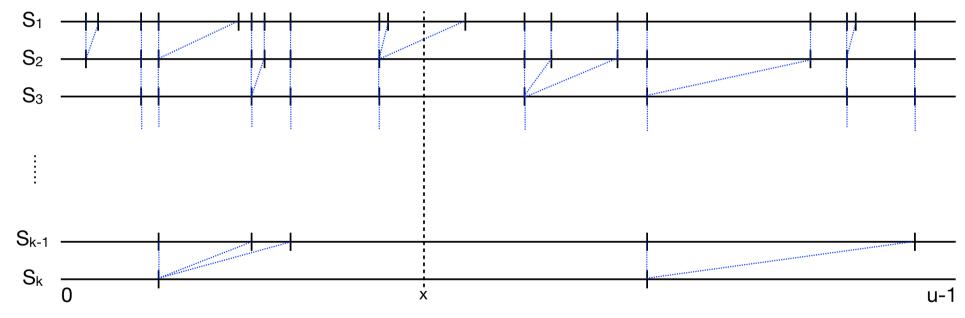
- Data structure. Sorted array on S<sub>1</sub> + each entry stores k-1 predecessors in S<sub>2</sub>, ..., S<sub>k</sub>.
- Predecessor(x): Binary search in S<sub>1</sub> array + report predecessors.
- Time.  $O(\log n_1 + k) = O(\log n + k)$
- Space. O(nk)



Challenge. Can we get the best of both worlds?

## Solution 3: Sorted Arrays with Bridges

- Data structure. Sorted arrays for each set + bridges.
- Predecessor(x): Binary search in S<sub>1</sub> array + traverse bridges and report elements.
- Time.  $O(\log n_1 + k) = O(\log n + k)$
- · Space. O(n)

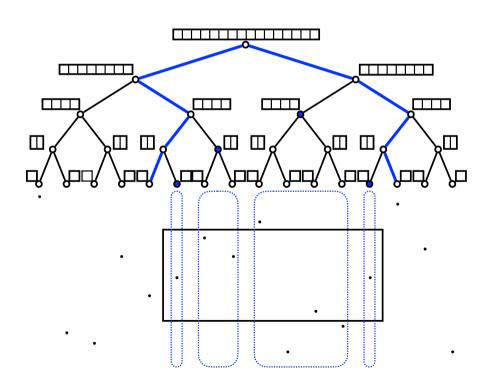


$$|S_i| = n_i$$
 and  $n_1 + n_2 + \cdots + n_k = n$ 

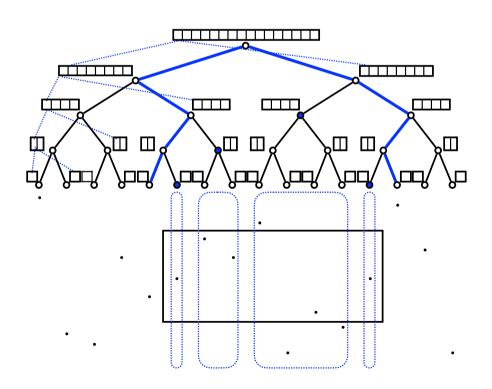
#### Predecessor in Nested Sets

- Theorem. We can solve the predecessor in nested sets problem in
  - · O(n) space.
  - $O(\log n + k)$  query time.
  - O(n log n) preprocessing time.
- Extensions.
  - Predecessor ⇒ 1D range reporting.
  - More tricks ⇒ works for non-nested sets. Called fractional cascading.
- · Challenge. How can we use predecessor in nested sets for 2D range reporting?

- · Goal. 2D range reporting in O(n log n) space and O(log n) time
- · Idea. Consider node v with children v<sub>I</sub> and v<sub>r</sub>.
  - Arrays at v<sub>1</sub> and v<sub>r</sub> are subsets of array at v.
  - All searches in arrays during a query are on the same y-range.



- Data structure. 2D range tree with bridges.
  - Each point in array at v stores bridges to arrays in v<sub>1</sub> and v<sub>r</sub>.
- Report(x<sub>1</sub>, y<sub>1</sub>, x<sub>2</sub>, y<sub>2</sub>): As 2D range tree query
  - Binary search in root array + traverse bridges for remaining 1D queries.
- Time. O(log n + occ)
- · Space. O(nlog n)
- Preprocessing. O(nlog n)

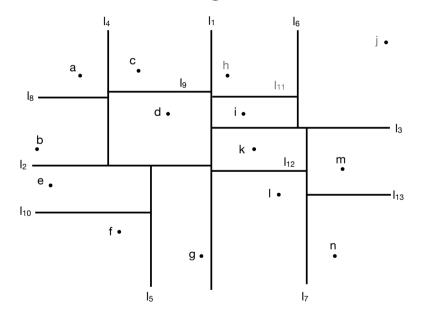


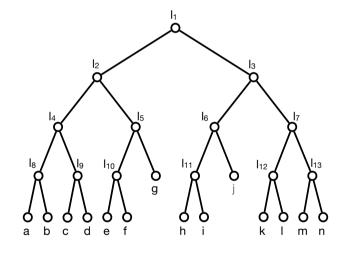
- Theorem. We can solve the 2D range reporting problem in
  - · O(n log n) space
  - O(log n + occ) time for queries.
  - O(n log n) preprocessing time.
- What can we do with only linear space?

- Range reporting problem
- 1D range reporting
- · 2D range reporting
  - Range trees
  - Predecessor in nested sets
  - kD trees

#### kD Trees

- The 2D tree (k = 2).
  - · A balanced binary tree over point set P.
  - Recursively partition P into rectangular regions containing (roughly) same number of points.
    Partition by alternating horizontal and vertical lines.
  - · Each node in tree stores region and line.

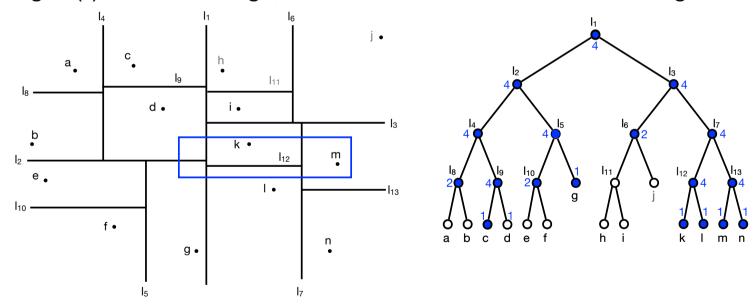




- · Space. O(n)
- Preprocessing. O(n log n)

#### kD Trees

- Report(x<sub>1</sub>, y<sub>1</sub>, x<sub>2</sub>, y<sub>2</sub>): Traverse 2D tree starting at the root. At node v:
  - Case 1. v is a leaf: report the unique point in region(v) if contained in range.
  - Case 2. region(v) is disjoint from range: stop.
  - Case 3. region(v) is contained in range: report all points in region(v).
  - Case 4. region(v) intersects range, and v is not a leaf. Recurse left and right.



· Time.  $O(\sqrt{n})$ 

### kD trees

- Theorem. We can solve the 2D range reporting problem in
  - · O(n) space
  - $O(\sqrt{n} + occ)$  time
  - O(n log n) preprocessing

- Theorem. We can solve 2D range reporting in either
  - O(n log n) space and O(log n + occ) query time
  - O(n) space and  $O(\sqrt{n} + occ)$  query time.
- Extensions.
  - More dimensions.
  - Inserting and deleting points.
  - Using word RAM techniques.
  - · Other shapes (circles, triangles, etc.)

- Range reporting problem
- 1D range reporting
- · 2D range reporting
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  - kD trees