

## Randomized incremental construction

Special sampling idea:

- Sample all *except* one item
- hope final addition makes small or no change

Method:

- process items in order
- average case analysis
- randomize order to achieve average case
- e.g. binary tree for sorting

Backwards analysis

- compute expected time to insert  $S_{i-1} \rightarrow S_i$
- backwards: time to delete  $S_i \rightarrow S_{i-1}$
- conditions on  $S_i$
- but generally analysis doesn't care what  $S_i$  is.

## Trapezoidal decomposition:

Motivation:

- manipulate/analyze a collection of  $n$  segments
- assume no degeneracy: endpoints distinct
- (simulate touch by slight crossover)
- e.g. detect segment intersections
- e.g., point location data structure
- Basic idea:
  - Draw verticals at all points and intersects
  - Divides space into slabs
  - binary search on  $x$  coordinate for slab
  - binary search on  $y$  coordinate inside slab (feasible since lines noncrossing)
  - problem:  $\Theta(n^2)$  space

Definition.

- draw altitudes from each endpoints and intersection till hit a segment.
- trapezoid graph is *planar* (no crossing edges)
- each trapezoid is a *face*
- show a face.
- one face may have many vertices (from altitudes that hit the *outside* of the face)
- but max vertex degree is 6 (assuming nondegeneracy)
- so total space  $O(n + k)$  for  $k$  intersections.
- number of faces also  $O(n + k)$  (at least one edge/face, at most 2 face/edge)
- (or use Euler's theorem:  $n_v - n_e + n_f \geq 2$ )
- standard clockwise pointer representation lets you walk around a face

Randomized incremental construction:

- to insert segment, start at left endpoint
- draw altitudes from left end (splits a trapezoid)
- traverse segment to right endpoint, adding altitudes whenever intersect
- traverse again, erasing (half of) altitudes cut by segment

Implementation

- clockwise ordering of neighbors allows traversal of a face in time proportional to number of vertices
- for each face, keep a (bidirectional) pointer to all not-yet-inserted left-endpoints in face
- to insert line, start at face containing left endpoint
- traverse face to see where leave it
- create intersection,
  - update face (new altitude splits in half)
  - update left-end pointers
- segment cuts some altitudes: destroy half
  - removing altitude merges faces
  - update left-end pointers
  - (note nonmonotonic growth of data structure)

Analysis:

- Overall, update left-end-pointers in faces neighboring new line
- time to insert  $s$  is

$$\sum_{f \in F(s)} (n(f) + \ell(f))$$

where

- $F(s)$  is faces  $s$  bounds after insertion
  - $n(f)$  is number of vertices on face  $f$  boundary
  - $\ell(f)$  is number of left-ends inside  $f$ .
- So if  $S_i$  is first  $i$  segments inserted, expected work of insertion  $i$  is

$$\frac{1}{i} \sum_{s \in S_i} \sum_{f \in F(s)} (n(f) + \ell(f))$$

- Note each  $f$  appears at most 4 times in sum since at most 4 lines define each trapezoid.
- so  $O(\frac{1}{i} \sum_f (n(f) + \ell(f)))$ .
- Bound endpoint contribution:
  - note  $\sum_f \ell(f) = n - i$
  - so contributes  $n/i$
  - so total  $O(n \log n)$  (tight to sorting lower bound)
- Bound intersection contribution
  - $\sum n(f)$  is just number of vertices in planar graph
  - So  $O(k_i + i)$  if  $k_i$  intersections between segments so far
  - so cost is  $E[k_i]$
  - intersection present if both segments in first  $i$  insertions
  - so expected cost is  $O((i^2/n^2)k)$
  - so cost contribution  $(i/n^2)k$
  - sum over  $i$ , get  $O(k)$
  - **note:** adding to RIC, assumption that first  $i$  items are random.
- Total:  $O(n \log n + k)$

## Search structure

Starting idea:

- extend all vertical lines infinitely
- divides space into slabs
- binary search to find place in slab
- binary search in slab feasible since lines in slab have total order
- $O(\log n)$  search time

Goal: apply binary search in slabs, without  $n^2$  space

- Idea: trapezoidal decom is “important” part of vertical lines
- problem: slab search no longer well defined
- but we show ok

The structure:

- A kind of search tree
- “ $x$  nodes” test against an altitude
- “ $y$  nodes” test against a segment
- leaves are trapezoids
- each node has two children
- **But** may have many parents

Inserting an edge contained in a trapezoid

- update trapezoids
- build a 4-node subtree to replace leaf

Inserting an edge that crosses trapezoids

- sequence of traps  $\Delta_i$
- Say  $\Delta_0$  has left endpoint, replace leaf with  $x$ -node for left endpoint and  $y$ -node for new segment
- Same for last  $\Delta$
- middle  $\Delta$ :
  - each got a piece cut off

- cut off piece got merged to adjacent trapezoid
- Replace each leaf with a  $y$  node for new segment
- two children point to appropriate traps
- merged trap will have several parents—one from each premerge trap.

Search time analysis

- depth increases by one for new trapezoids
- RIC argument shows depth  $O(\log n)$ 
  - Fix search point  $q$ , build data structure
  - Length of search path increased on insertion only if trapezoid containing  $q$  changes
  - Odds of top or bottom edge vanishing (backwards analysis) are  $1/i$
  - Left side vanishes iff **unique** segment defines that side and it vanishes
  - So prob.  $1/i$
  - Total  $O(1/i)$  for  $i^{\text{th}}$  insert, so  $O(\log n)$  overall.

## Treaps

Dictionaries for **ordered** sets

- New Operations.
  - enumerate in order
  - successor-of, predecessor-of (even if not in set)
  - $\text{join}(S, k, T)$ ,  $\text{split}$ ,  $\text{paste}(S, T)$

Binary tree.

- child and parent pointers
- endogenous: leaf nodes empty.
- *balanced* if depth  $O(\log n)$
- average case.
- worst case

Tree balancing

- rotations (show)
- implementing operations.
- red/black, AVL

- splay trees.
  - drawbacks in geometry:
  - auxiliary structure on nodes in subtree (eg, for remaining dimensions)
  - rebuild on rotation

Returning to average case:

- Assign random “arrival orders” to keys
- Build tree **as if** arrived in that order
- Average case applies
- No rotations on searches

Choosing priorities

- define arrival by random priorities
- assume continuous distribution, fix.
- eg, use  $2 \log n$  bits, w.h.p. no collisions

Treaps.

- tree has keys in heap order of priorities
- unique tree given priorities—follows from insertion order
- implement insert/delete etc.
- rotations to maintain heap property

Depth  $d(x)$  analysis

- Tree is trace of a quicksort
- We proved  $O(\log n)$  w.h.p.

**lemma:** for  $x$  rank  $k$ ,  $E[d(x)] = H_k + H_{n-k+1} - 1$

- $S^- = \{y \in S \mid y \leq x\}$
- $Q_x^- =$  ancestors of  $x$
- Show  $E[Q_x^-] = H_k$ .
- to show:  $y \in Q_x^-$  iff inserted before all  $z$ ,  $y < z \leq x$ .
- deduce: item  $j$  away has prob  $1/j$ . Add.
- Suppose  $y \in Q_x^-$ .

- Then inserted before  $x$
- Suppose some  $z$  between inserted before  $y$
- Then  $y$  in left subtree of  $z$ ,  $x$  in right, so not ancestor
- Thus,  $y$  before every  $z$
- Suppose  $y$  first
  - then  $x$  follows  $y$  on all comparisons (no  $z$  splits)
  - So ends up in subtree of  $y$

#### Rotation analysis

- Insert/Delete time
  - define spines
  - equal left spine of right sub plus right spine of left sub
  - proof: when rotate up, one spine increments, other stays fixed.
- $R_x$  length of right spine of left subtree
- $E[R_x] = 1 - 1/k$  if rank  $k$
- To show:  $y \in R_x$  iff
  - inserted after  $x$
  - but before all  $z$ ,  $y < z < x$
  - sinceif  $z$  before  $y$ , then  $y$  goes left, so not on spine
- deduce: if  $r$  elts between,  $r!$  of  $(r + 2)!$  permutations work.
- So probability  $1/(r + 1)(r + 2)$ .
- Expectation  $\sum 1/(1 \cdot 2) + 1/(2 \cdot 3) + \dots = 1 - 1/k$
- subtle: do analysis only on elements inserted in real-time before  $x$ , but now assume they arrive in random order in virtual priorities.