## Randomized Geometric Algorithms

Ken Clarkson AT&T Bell Labs Murray Hill, NJ

# Outline

- Trapezoidal diagrams
- Randomized divide-and-conquer
- Convex hulls
- Randomized incremental algorithms

#### Trapezoidal Diagrams

Given a set S of n line segments, with A intersection points, its TD T(S) has  $\Theta(n + A)$  regions.

#### Results

Suppose S forms K known chains. How much work is needed to find  $\mathcal{T}(S)$ , and how quickly can the diagram be found?

work time  $/ \lg n$ 

$\Omega(K \log n + A)$	A	+n)	$\Omega(1)$	
$K \lg n + L$	A +	$n \lg^* n$	$\lg \lg n \lg^* n$	ССТ
	A +	$-n \lg n$	1	ССТ
		n	$\lg \lg n \lg^* n$	CCT; simple
		n	•	Cha: simple
	,	$n \lg^* n$	•	CTVW,S
		2	4	
		<i>n</i> <sup>2</sup>	T	G, HJVV
$A \lg b$	n + n	$n \lg^2 n$	1	G
	A +	$-n \lg n$	1	red/blue; GSG

Randomized divide-and-conquer [CS]:

- take  $R \subset S$  random of size r;
- compute  $\mathcal{T}(R)$ ;
- for  $T \in \mathcal{T}(R)$ , find segments  $S_T$  meeting it (insertion);
- compute  $T \cap \mathcal{T}(S_T)$  for  $T \in \mathcal{T}(R)$ ;
- merge pieces to find  $\mathcal{T}(S)$ ;

We can use "slow" algorithms for  $\mathcal{T}(R)$  and the  $T \cap \mathcal{T}(S_T)$ , since:

Each trapezoid meets O(n/r) segments, on average, and  $O(n/r) \log r$  with high probability.

Moreover,  $\mathcal{T}(R)$  has expected  $O(r + Ar^2/n^2)$ trapezoids.

For parallel work  $O(A + n \log n)$ , choose  $r = n/\log n$ ; compute  $\mathcal{T}(R)$  using  $O(\log n)$  slack [G], and do  $O(n/r)^2$  work [G][HJW] for subdiagrams. Why  $O(n/r) \log r$  segments/trapezoid?

 $T \in \mathcal{T}(S)$  is in some  $\mathcal{T}(A)$  for |A| < 4, so  $O(n^4)$  trapezoids to consider.

A trapezoid meeting  $\alpha n$  segments has  $\binom{n-\alpha n-4}{r-4} / \binom{n}{r} \approx (r/n)^4 (1-\alpha)^{r-4}$ chance to be in  $\mathcal{T}(R)$ .

So the probability that a trapezoid meeting  $K(n/r) \log r$  segments is in  $\mathcal{T}(R)$  is  $O(r^4)(1 - K(\log r)/r)^{r-4}$ , less than about  $e^{K \log r - 4 \log r} = 1/r^{K-4}$ .

# Using connectivity (a.k.a., simple polygon triangulation)

To insert, walk through  $\mathcal{T}(R)$  and S;

This gives  $O(n \log \log n)$  expected time, with  $r = n/\log n$  and average subproblem size  $O(\log n)$ .

For  $O(n \log^* n)$  work: For subsets  $S^1 \subset S^2 \subset \cdots \subset S^{\log^* n} = S$ , with  $|S^1| = n/\log n$ ,  $|S^2| = n/\log\log n$ ,  $|S^i| = n/\log^{(i)} n$ , compute  $\mathcal{T}(S^i)$  using  $\mathcal{T}(S^{i-1})$ . In parallel, the insertion is done by many parallel walks through subchains.

The main problem: while every trapezoid of  $\mathcal{T}(R)$  meets few segments,

a segment may meet many trapezoids.

How to handle *bad* segments that meet  $\Omega(\log n)$  trapezoids?

There are  $O(n/\log n)$  bad segments, on average: to insert them, compute their intersections with the visibility edges using algorithm [GSG]. One way to show that each  $T \in \mathcal{T}(R)$  meets < 4n/(r+1) segments on average:

pick  $x \in S \setminus R$  at random. How many  $T \in \mathcal{T}(R)$  does it meet?

That is, how big is  $\mathcal{T}(R) \setminus \mathcal{T}(R')$ , where  $R' = R \cup \{x\}$ ?

Since  $|A| + |B \setminus A| = |B| + |A \setminus B|$ ,  $E|\mathcal{T}(R) \setminus \mathcal{T}(R')|$  $= E|\mathcal{T}(R)| - E|\mathcal{T}(R')| + E|\mathcal{T}(R') \setminus \mathcal{T}(R)|$  That is, it's enough to know the number of trapezoids created when x is added = number deleted when x deleted from  $R' < 4E|\mathcal{T}(R')|/(r+1)$ . since T incident to < 4 segs, each with prob 1/(r+1) of being x.

So the number of seg/trap intersections is expected  $< 4(n-r)E|\mathcal{T}(R')|/(r+1)$ .

## Convex hulls

Given a set S of n points in d dimensions, maintain the convex hull of  $R \subset S$ .

We'll analyze under assumptions implying R is random: e.g., add points in random order.

When  $x \in S \setminus R$  is added to R, edges *visible* to xare no longer in the hull.

Visibility testing requires a line-point orientation test. The algorithm: maintain a *triangulation* of conv R.

#### To update

when adding x, and edge  $\overline{ab}$  is visible to x, include  $\Delta abx$ . The (asymptotically) hard problem is **search:** find the edges visible to x.

One technique: walk through the triangulation from a known point (the origin). Another search scheme: starting at origin, look at all triangles whose *base edges* are visible to x.

#### Base edge:

When x is added and  $\Delta abx$  created,  $\overline{ab}$  is a base edge.

**Visibility** now means: edge visible to y when edge created. (If y added instead of x, get  $\Delta yab$ .

## Analysis

...of second scheme, under random insertions  $x_1, \ldots, x_i$ 

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space: what is E|\mathcal{T}|,
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the expected number of triangles in triangulation  $\mathcal{T}$ ?

**time:** what is the expected number of triangles visited for  $x_i$ ?

Note  $R_i = \{x_1 \dots, x_i\}$ is a random subset of S,  $x_i$  is a random element of  $R_i$  and S.

Let  $f_i =$  expected number of current hull edges of  $R_i$ .

Space:

(Look at general dimension d, since d = 2 trivial.)

= expected number of(current and old convex hull) facets.

Count the expected number of facets created when  $x_j$  is inserted, for  $j \leq i$ , and sum over j.

facets created when  $x_j$  added are facets incident to  $x_j$  in conv  $R_j$ .

d vertices/facet, implies  $df_j$  expected vertex-facet incidences, implies  $df_j/j$  facets incident to  $x_j$ , expected.

So  $E|\mathcal{T}| = \sum_{j \leq i} df_j/j$ .

Time:

Let  $H = H_{i-1} = H(x_1, \dots, x_{i-1})$ denote the set of hull facets for insertions  $x_1, \dots, x_i$ . (So  $|H| = |\mathcal{T}|$ .)

Let 
$$H' = H(x_i, x_1, ..., x_{i-1}).$$

then  $H \setminus H'$  is the set of facets of H visible to  $x_i$ , and search time is  $O(d)E|H \setminus H'|$ .

Since  $|H| + |H' \setminus H| = |H'| + |H \setminus H'|$ ,  $E|H| + E|H \setminus H| = E|H'| + E|H \setminus H'|$ .

the space analysis gives  $E|H| = \sum_{j \le i-1} df_j/j, \ E|H'| = \sum_{j \le i} df_j/j,$ so  $E|H \setminus H'| = E|H' \setminus H| - df_i/i.$  We want  $E|H' \setminus H|$ , the expected number of facets incident to  $x_i$  in the set  $H' = H(x_i, x_1, \dots, x_{i-1}).$ 

As in the space bound, count the number expected when  $x_j$  is inserted, and sum over j.

The facets are incident to  $x_i$  and  $x_j$ , and facets of conv  $R'_i$ ,  $R'_i = \{x_i, x_1, \dots, x_j\}$ .

$$\begin{pmatrix} d \\ 2 \end{pmatrix}$$
 vertex pairs/facet implies  
 $\begin{pmatrix} d \\ 2 \end{pmatrix} f_{j+1}$  pair-facet incidences, implies  
 $\begin{pmatrix} d \\ 2 \end{pmatrix} f_{j+1} / \begin{pmatrix} j+1 \\ 2 \end{pmatrix}$  facets/pair.

So

$$E|H' \setminus H| = \sum_{j \le i-1} \frac{d(d-1)}{(j+1)j} f_{j+1}$$

or

$$\sum_{j\leq i}\frac{d(d-1)}{j(j-1)}f_j$$

The expected number of location tests for  $x_i$  is less than twice this.

## Conclusions

We've seen randomization for

- parallel algorithms, divide-and-conquer;
- dynamic algorithms, incremental;
- data structures
- TD, CH/VD, LP, MSTs, BSPTs, NN, HSE,...

What about

- determinism; [M,M,M,M,...]
- simple O(n) triangulation;
- realistic machine models for parallel algorithms;
- tail estimates;
- self-adjustment;