Computational Geometry for Fat Objects and Low Density Scenes

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binary space partitions (BSPs): recursive subdivision of space until in each region there is only one object (or: constant number of objects)

Practice: BSPs are used

Theory: worst-case size $\Theta(n^2)$ (Paterson-Yao '90)







12,748,510 triangles





motivation

- analysis not only as function of input size *n*, but also as function of certain geometry-describing parameters
- leads (hopefully) to
 - better prediction of when algorithms are efficient in practice
 - simpler algorithms, designed with practical inputs in mind

- fat triangles



 $\delta\text{-fat}$ triangle: minimum angle at least δ

- fat triangles



 $\delta\text{-fat}$ triangle: minimum angle at least δ





Definitions: fat objects (2)

Non-convex objects





Non-convex objects





Non-convex objects



fat objects should not have skinny parts

these objects are not fat

Definitions: fat objects (3)



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not locally fat



• distribution parameter for sets of objects: density



diam(o) := diameter of o

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van der Stappen '94

density of set S of objects: minimum λ such that for any ball b :

 $\#\{o \in S : o \text{ intersects } b, \operatorname{diam}(o) \ge \operatorname{diam}(b) \} | \le \lambda$

Hope: density will in practice be a (small) constant.

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object = facet of polytope

refining the object does not increase the density significantly



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polyhedral model of a building



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Proof: we must show that for any ball *b*:

 $\#\{o: o \text{ intersects } b, \operatorname{diam}(o) \geq \operatorname{diam}(b)\} = O(1/\beta)$



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- each object o that we must count covers a fraction $\Omega(\beta)$ of the ball b_2
- objects are disjoint

 $S: n \text{ locally } \gamma\text{-fat objects}$

E: "edges" of boundary of union of S

dB '05

The set E has density $O(1/\gamma)$.



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• combinatorics

- overview of results
- recent result: union of fat triangles
- algorithms and data structures
 - overview of results
 - some tools and examples

Combinatorics for Fat Objects and Low Density Scenes



n arbitrary triangles:

```
union complexity can be \Theta(n^2)
```



[Matoušek *et al.* '94, Pach-Tardos '02] n fat triangles: complexity is $O(n \log \log n)$ Conjecture: $\Theta(n\alpha(n))$



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Ezra-Aronov-Sharir (SODA 11): $O(n2^{\alpha(n)} \log^* n)$



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Efrat-Sharir '97, Efrat-Katz '98, Efrat '05, dB '05, dB'10 n fat (possibly non-convex and/or curved) objects: complexity is $O(\lambda_{s+2}(n) \log n)$ Conjecture: $O(\lambda_{s+2}(n))$



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Union complexity: objects in 3D

- worst case: $\Theta(n^3)$
- Pach *et al.* '03: arbitrarily oriented equal-sized cubes: $O(n^{2+\varepsilon})$
- Ezra-Sharir '07: fat tetrahedra: $O(n^{2+\varepsilon})$
- Aronov *et al.* '04: κ -round objects: $O(n^{2+\varepsilon})$
- fat convex polyhedra: open

decompositions of (non-convex) polyhedra into tetrahedra

- worst case: $\Theta(n^2)$
- dB-Gray '08: fat polyhedra with fat faces: O(n)

Some more results

complexity of Voronoi diagrams on terrains Moet *et al.* '06, Aronov-dB-Thite '08

- \bullet terrain with n triangles, m sites
- worst-case: $\Omega(n^2)$ even for two sites
- on realistic terrain: $O(n + m\sqrt{n})$





complexity of visibility maps of terrains Moet *et al.* '06, dB-Haverkort-Tsirogiannis '09

- worst case: $\Theta(n^2)$
- realistic terrain: $\Theta(n\sqrt{n})$
- realistic terrain with noise: $\Theta(n)$

river networks: $O(n^2)$ complexity on realistic terrains, instead of $O(n^3)$

The union complexity of γ -fat triangles (and of locally γ -fat curved objects)

(joint work with Boris Aronov, Esther Ezra, and Micha Sharir)



basic tool: Merging Lemma

Let A and B be two sets of locally γ -fat objects in \mathbb{R}^2 . Then $UC(A \cup B) = O((1/\gamma) \cdot (UC(A) + UC(B))),$ where UC = union complexity

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$$UC(A \cup B) = O((1/\gamma) \cdot (UC(A) + UC(B))),$$

where UC = union complexity

(alternative for polygonal objects: Combination Lemma)

Note: not true for non-fat objects



another tool

• cover each triangle by subtriangles with canonical shape



subtriangles have two edges with canonical directions



another tool

• cover each triangle by subtriangles with canonical shape



T: orginal set of n triangles $\implies T_1, T_2, \ldots : O(1/\gamma^2)$ sets of subtriangles

within each set all subtriangles are fat and use the same canonical directions

(in fact, $O(1/\gamma)$ sets suffice in this problem)

 T_1 :

union complexity of fat triangles (cont'd)

each vertex of union of T is

- a vertex of some union $\bigcup T_i$
- a vertex of some union $\bigcup (T_i \cup T_j)$



 T_1 :

 T_2 :

each vertex of union of T is

- a vertex of some union $\bigcup T_i$
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Merging Lemma

 $\sum_{i,j} UC(T_i \cup T_j)$

- $= \sum_{i,j} O(UC(T_i) + UC(T_j))$
- = (# subsets) $\cdot \sum_i O(UC(T_i))$

 $= O(1/\gamma^2) \cdot O(\sum_i UC(T_i))$



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bound for fat canonical triangles carries over to fat triangles





New problem: bound union complexity of n canonical triangles

- each triangle has a horizontal bottom edge
- each triangle has vertical left edge
- angles at top corner and right corner are at least γ (in fact, can get angles arbitrary close to 45°)



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a further reduction:

 cover triangles by towers: fat triangle on top of long (but still fat) rectangle

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crucial property:

diagonal edge of one tower cannot simultaneously intersect top edge and bottom edge of base of another tower



The union complexity of towers



union complexity of fat triangles (cont'd)

Lemma: The number of HV-, HD, and VD-vertices is O(n).

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Proof:

HV-vertices

HD-vertices

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union complexity of fat triangles (cont'd)

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Proof:

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It remains to bound the number of DD-vertices



- upper-envelope complexity gives $\Omega(n\alpha(n))$ lower bound
- upper-envelopes connection also gives upper bound ??

union complexity of fat triangles (cont'd)

Lemma: Union complexity of n towers stabbed by a vertical line is O(n).

Recall: we only need to worry about DD-vertices

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Proof: only consider triangular top of each tower



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 \implies single cell: $O(n\alpha(n))$ [in fact, special type: O(n)]

Theorem: Union complexity of n fat triangles is $O(n \log^* n)$.

Proof:

- 1. Reduce problem to bounding union complexity of towers.
- 2. Prove that number of HV-, HD-, and VD-vertices is O(n).
- 3. Prove that union complexity is O(n) if triangles are stabbed by vertical line.
- 4. Use a clever scheme based on interval trees and intersectionsensitive cuttings to get a recursion that solves to $O(n \log^* n)$.

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Similar proof gives $O(n2^{O(\log^* n)})$ bound for locally fat curved objects.

Algorithms and Data Structures for Fat Objects and Low Density Scenes

data structures: storage for O(polylog n) query time in 3D

			general		
BSP trees			n^2	n	
point location			$n\log n$	n]
intersection searching		approx	_	n	
		exact	n^4	n^3	
ray shooting	arbitrary		n^4	n^2	
	vertical		n^2	$n\log^2 n$	

algorithms (some assumptions omitted)

f-DOF motion planning	n^f	$n \log n$	constant density
depth orders	$n^{4/3}$	$n \log^3 n$	
hidden-surface removal	$n^{4/3}$	n polylog n	
kinetic collision detection	n^2	n polylog n	

fat objects:

• cover objects by simpler objects using canonical directions



canonical directions can be handled efficiently

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sets with low density

• replace objects by carefully chosen points ("guards")



guards "represent" distribution of objects

Example: how to find and use guarding points

- S: set of n objects
- λ : density of S
- G: set of 4n bounding-box vertices of the objects in S

Any square not containing bounding-box vertex intersects $\leq 4\lambda$ objects.

Proof:



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Proof:



Note: similar statement holds in higher dimensions.

TU/e Guarding points with respect to squares / cubes (cont'd)

Using vertices of polyhedral object as guards does not work.



not in 3D ...

TU/e Guarding points with respect to squares / cubes (cont'd)

Using vertices of polyhedral object as guards does not work.



... not even in 2D
Compressed quadtrees for low-density scenes (based on dB-Haverkort-Thite-Toma '10)

- size of compressed quadtree is linear
- works in any dimension
- can be used to do point location
- can be used to do map overlay
- can be used to obtain linear size BSP
- can be used to do approximate range searching (range = convex region; data = low-density set)
- can be made I/O-efficient

Compressed quadtrees for point sets:

compress paths with only one non-empty subtree into single nodes



number of cells: O(n)

Recursively partition square

- points in more than one quadrant: split into quadrants
- all points in same quadrant: split into
 - smallest quadtree square containing all the poins
 - donut (contains no points)

Stop when zero or one point left

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Step 1: replace objects by vertices of bounding boxes

Step 2: construct compressed quadtree for resulting set of points



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donut can be covered by six squares

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 O(λn) fragments



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Reducing the number of fragments:

• sort bb-vertices in Z-order

• only keep every λ -th bb-vertex

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at most $2\lambda - 1$ bb-vertices per cell \Longrightarrow still $O(\lambda)$ objects / cell

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sort bb-vertices in Z-order:

- $P_0 = P = p_1, p_2, p_3, p_4, p_5, \dots, p_{4n}$
- $P_1 = p_1, p_3, p_5, \dots$
- $P_2 = p_1, p_5, \dots$

Construct hierarchy of compressed quadtrees

Compressed quadtrees for low-density scenes





every cell has O(1) children number of levels is $O(\log n)$ \longrightarrow point location in $O(\log n)$ time

- S: set of n objects in \mathbb{R}^d
- $\lambda: \text{ density of } S$

Theorem: There is a compressed quadtree hierarchy of $O(\log n)$ depth and $O(n/\lambda)$ size where any leaf region intersects $O(\lambda)$ objects.

Example: how to use canonical directions

TU/e Using canonical directions: exact range searching

2D range searching: report all points inside a query range



Using canonical directions: exact range searching

range is β -fat triangle: all angles $\geq \beta$

canonical directions: $0, \beta, 2\beta, \ldots, 2\pi - \beta$



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partition query triangle into four sub-triangles using canonical directions



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partition query triangle into four sub-triangles using canonical directions



subtriangle is intersection of an "axis-parallel" rectangle and half-plane

 \implies combine halfplane and rectangle structures into single structure: storage $O(n \log^2 n)$, query time $O(\log^3 n)$



[Aronov-dB-Gray '06]

cover $\beta\text{-fat}$ convex object by "towers" using $O(1/\beta^2)$ canonical directions



Improved bounds for

- ray shooting: storage $O(n^{2+\varepsilon})$, query $O(\operatorname{polylog} n)$
- intersection searching: storage $O(n^{3+\varepsilon})$, query O(polylog n+k)
- range searching: storage O(n polylog n), query O(polylog n+k)

geometry-sentive analysis

- analysis not only as function of input size n, but also as function of certain geometry-describing parameters
- by now, nice theory that leads to
 - algorithms with much better scale-up behavior
 ... if geometry parameters are indeed constant
 - often simpler, more practical algorithms
 - better prediction of efficiency in practice ??

TU/e the union complexity of locally γ -fat objects — revisited

Why local fatness ?

Standard fatness definition: For any disk D with center in o, we have:

 $\operatorname{area}(D \cap o) \geq \gamma \cdot \operatorname{area}(D)$


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