Fundamental Techniques in Computational Geometry: ARRANGEMENTS, PARTITIONS, AND APPLICATIONS



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Algorithms for Spatial Data

Geometry is everywhere

- geographic information systems
- computer-aided design and manufacturing
- virtual reality
- robotics
- computational biology
- sensor networks
- databases
- and more ...







Computational Geometry

area within algorithms research dealing with spatial data

- aim for provably correct solutions (no heuristics)
- theoretical analysis of running time, memory usage: $O(\cdots)$

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beautiful connections to discrete geometry

- combinatorial bounds needed to analyze algorithms
- computational-geometry techniques useful for combinatorial problems



Paul Erdős

Computational Geometry: Tools of the Trade

Algorithmic design techniques and tools

- plane sweep
- geometric divide-and-conquer
- randomized incremental construction
- parametric search
- (multi-level) geometric data structures
- . . .

Geometric structures and concepts

- Voronoi diagrams and Delaunay triangulations
- arrangements
- cuttings, simplicial partitions, polynomial partitions



• coresets

Lecture Overview



Lecture Overview



(Substructures in) Arrangements

S: set of n lines / segments / curves / etc in \mathbb{R}^2

 $\mathcal{A}(S) = \text{arrangement induced by } S \\ = \text{partitioning of } \mathbb{R}^2 \text{ into faces, edges, and vertices induced by } S \\ \end{cases}$



combinatorial complexity of $\mathcal{A}(S) =$ total number of vertices, edges, faces

Substructures in Arrangements



Many geometric problems can be phrased in terms of (substructures in) arrangements by viewing them in an appropriate parametric space.





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- 1. Transform problem to motion-planning problem for a point-shaped robot by expanding each obstacle. (Expanded obstacles can intersect!)
- 2. Decompose free space into "quadrilaterals"
- 3. Construct motion graph $\mathcal G$ and compute path from s to t in $\mathcal G$



reachable region of the robot

=

single cell in arrangement induced by a set S of n curves in \mathbb{R}^2 for other types of robots: in \mathbb{R}^d , where d = #(degrees of freedom)

The Complexity of (Substructures in) Arrangements



 $\mathcal{A}(S) := \text{arrangement of set } S \text{ of } n \text{ line/segments/curves in } \mathbb{R}^2$ (or: hyperplanes/(d - 1)-simplices/surface patches in \mathbb{R}^d)

what is the worst-case complexity of these substructures in $\mathcal{A}(S)$?

The Complexity of Arrangements

Theorem. Let S be a set of n simple curves such that any two curves intersect at most s times, where S is a fixed constant. Then the complexity of the full arrangement $\mathcal{A}(S)$ is $O(n^2)$.



Proof.

Assume curves are finite.



- number of vertices
- number of edges
- number of faces

Proof.

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number of vertices

$$|V| \leqslant 2n + s \cdot \binom{n}{2} = O(n^2)$$

- number of edges
- number of faces

Proof.

Assume curves are finite.

• number of

f vertices
$$|V| \leqslant 2n + s \cdot$$

$$\leqslant 2n + s \cdot \binom{n}{2} = O(n^2)$$

- number of edges $|E| \leq n \cdot (s(n-1)+1) = O(n^2)$
- number of faces

Proof.





$$| \leq 2n + s \cdot \binom{n}{2} = O(n^2)$$

- number of edges $|E| \leq n \cdot (s(n-1)+1) = O(n^2)$
- number of faces

Euler's formula: |V| - |E| + |F| = 2

The Complexity of Upper Envelopes



analysis using Davenport-Schinzel sequences

Lecture Overview



Lecture Overview



A COMBINATORIAL PROBLEM CONNECTED WITH DIFFERENTIAL EQUATIONS.

By H. DAVENPORT and A. SCHINZEL.

1. Let

(1)

F(D)f(x) = 0

be a (homogeneous) linear differential equation with constant coefficients, of order d. Suppose that F(D) has real coefficients, and that the roots of $F(\lambda) = 0$ are all real though not necessarily distinct. As is well known, any solution of (1) is of the form

(2)
$$f(x) = P_1(x)e^{\lambda_1 x} + \cdots + P_k(x)e^{\lambda_k x},$$

where $\lambda_1, \dots, \lambda_k$ are the distinct roots of $F(\lambda) = 0$ and $P_1(x), \dots, P_k(x)$ are polynomials of degrees at most $m_1 - 1, \dots, m_k - 1$, where m_1, \dots, m_k are the multiplicities of the roots, so that $m_1 + \cdots + m_k = d$.

Let

 $f_1(x), \cdots, f_n(x)$ (3)

be n distinct (but not necessarily independent) solutions of (1). For each real number x, apart from a finite number of exceptions, there will be just one of the functions (3) which is greater than all the others. We can therefore dissect the real line into N intervals

$$(-\infty, x_1), (x_1, x_2), \cdots, (x_{N-1}, \infty)$$

such that inside any one of the intervals (x_{j-1}, x_j) a particular one of the functions (3) is the greatest, and such that this function is not the same for two consecutive intervals. It is almost obvious that N is finite, and a formal proof will be given below.

The problem of finding how large N can be, for given d and given n, was proposed to one of us (in a slightly different form) by K. Malanowski. This problem can be made to depend on a purely combinatorial problem, by the following considerations. With each $j = 1, 2, \cdots, N$ there is associated the integer i = i(j) for which $f_i(x)$ is the greatest of the functions (3) in the interval (x_{i-1}, x_i) . (We write $x_0 = -\infty$ and $x_N = \infty$ for convenience.) This defines a sequence of N terms

 $i(1), i(2), \cdots, i(N),$

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Harold Davenport Andrzej Schinzel (1907 - 1965)

(1937 - 2021)

A combinatorial problem

Consider a sequence over the alphabet $\{1,\ldots,n\}$ such that

• \ldots *i i* \ldots does not appear

•
$$\dots \underbrace{i \dots j \dots i \dots j}_{s+2 \text{ times}}$$
 does not appear

How long can such a sequence be?

Davenport-Schinzel sequence of order s (over alphabet of size n) is sequence that does not contain the following:

- $\ldots i i \ldots$
- $\dots \underbrace{i \dots j \dots i \dots j}_{s+2 \text{ times}}$

no two consecutive symbols are the same

- Example (n = 9, s = 2)
 - 6, 4, 5, 6, 1, 2, 2, 7, 3
 - 2, 5, 1, 2, 7, 8, 7, 1, 3, 4
 - 3, 6, 4, 2, 5, 1, 5, 9, 8, 9, 7

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no alternating subsequence of length s+2

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Exercise: Determine the maximal possible length of a DS-sequence of order s as a function of n, for s = 1, s = 2, s = 3, ...

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 $DS_s(n) := maximum \text{ length of DS-sequence of order } s \text{ on } n \text{ symbols}$



• s = 2:

Davenport-Schinzel sequence of order s (over alphabet of size n) is sequence that does not contain the following:

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 $DS_s(n) := maximum \text{ length of DS-sequence of order } s \text{ on } n \text{ symbols}$

• s = 1: possible sequence: 1, 2, 3, ..., nno symbol can appear twice $DS_1(n) = n$

• s = 2:

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• *i i*

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 $DS_s(n) := maximum \text{ length of DS-sequence of order } s \text{ on } n \text{ symbols}$

- s = 1: possible sequence: 1, 2, 3, ..., nno symbol can appear twice $B \implies DS_1(n) = n$
- s = 2: possible sequence $1, 2, \ldots, n-1, n, n-1, \ldots, 2, 1$

 $\implies \mathrm{DS}_2(n) \ge 2n-1$

Proof by induction, remove symbol whose first occurrence is last, plus at most one adjacent symbol:

 $DS_2(n) \leq DS(n-1) + 2 \implies DS_2(n) \leq 2n-1$
Davenport-Schinzel sequences

Theorem. $DS_s(n)$ is near-linear for any constant s. In particular,

- $DS_1(n) = n$
- $DS_2(n) = 2n 1$
- $DS_3(n) = \Theta(n\alpha(n))$
- $DS_s(n) = o(n \log^* n)$ for any fixed constant s

where $\alpha(n)$ is the inverse Ackermann function

 $\alpha(n)$ grows slower than super-super-super-super-super-slowly . . .

 $\alpha(n)$ is inverse of Ackermann function A(n), where $A(n) = A_n(n)$ with:

$$A_1(n) = 2n \qquad \text{for } n \ge 1$$

$$A_k(1) = 2 \qquad \text{for } k \ge 1$$

$$A_k(n) = A_{k-1}(A_k(n-1)) \qquad \text{for } k \ge 2 \text{ and } n \ge 2$$

$$-2 \quad A(2) = 4 \quad A(3) = 16 \quad A(4) = \text{tower of } 65536 \text{ 2's}$$

A(1) = 2, A(2) = 4, A(3) = 16, A(4) = tower of 65536 2's



back to upper envelopes

Theorem. Let S be a set of n infinite x-monotone curves such that any two curves intersect at most s times. Then the maximum complexity of the upper envelope of S is $O(DS_s(n))$.



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alternating sequence of length t implies t-1 intersections



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we cannot have alternating sequence of length s + 2 \implies DS(n, s)-sequence alternating sequence of length t implies t-1 intersections



Theorem. Let S be a set of n infinite x-monotone curves such that any two curves intersect at most s times. Then the maximum complexity of the upper envelope of S is $O(DS_{s+2}(n))$.

for example: $O(n\alpha(n))$ for line segments

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Proof.

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alternating sequence of length timplies t - 3 intersections



we cannot have alternating sequence of length s + 4 $\implies DS(n, s + 2)$ -sequence

Proof.

P: set of n points in \mathbb{R}^2 that move linearly (or: on polynomial trajectories)



- How often can the closest pair change, in the worst case?
- How often can the convex hull change, in the worst case?
- How often can the Delaunay triangulation change, in the worst case?

How often can the closest pair change, in the worst case?



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Lower bound

How often can the closest pair change, in the worst case?



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Upper bound

How often can the closest pair change, in the worst case?



Upper bound

- for each pair p, q define $f_{pq}(t) :=$ distance between p and q at time t
- number of changes = complexity of lower envelope of n^2 functions $\approx O(n^2)$

How often can the convex hull change, in the worst case?



Lower bound

How often can the convex hull change, in the worst case?





How often can the convex hull change, in the worst case?



Trivial upper bound

How often can the convex hull change, in the worst case?



Trivial upper bound

convex hull changes \implies three points become collinear

 \implies happens O(1) times for each triple

 $\implies O(n^3)$ changes to convex hull

How often can the convex hull change, in the worst case?



A better bound using upper envelopes

How often can the convex hull change, in the worst case?



A better bound using upper envelopes

• for each point p define function $f_p: [0, 2\pi) \times \mathbb{R}_{\geq 0} \to \mathbb{R}$

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A better bound using upper envelopes

- for each point p define function $f_p: [0,\pi) \times \mathbb{R}_{\geqslant 0} \to \mathbb{R}$
- p on convex hull at time t iff (there is a θ such that $f_p(\theta, t) \ge f_q(\theta, t)$ for all q at time t) or $(\ldots \le \ldots)$

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- number of changes

 $= O(\text{complexity of upper envelope of surfaces in } \mathbb{R}^3) = O(n^{2+\varepsilon})$

The Complexity of Single Cells

Theorem. Let S be a set of n curves in the plane such that any two curves intersect at most s times. Then the maximum complexity of a single cell of $\mathcal{A}(S)$ is $O(DS_{s+2}(n))$.

for example: $O(n\alpha(n))$ for line segments



proof also uses Davenport-Schinzel sequences but is more complicated

Lecture Overview



Lecture Overview









Levels in arrangements



Levels in arrangements





What is the max complexity of the k-level in an arrangement of n lines?

- 0-level = lower envelope \implies complexity $\leq n$
- $k \ge 1$: complexity is $n2^{\Omega(\sqrt{\log k})}$ and $O(nk^{1/3})$ major open problem

The Clarkson-Shor Technique: Application to $(\leq k)$ -levels



What is the max complexity of the ($\leq k$)-level in an arrangement of n lines?

The Clarkson-Shor Technique: Application to $(\leq k)$ -levels



What is the max complexity of the ($\leq k$)-level in an arrangement of n lines?





Clarkson-Shor '89: $\Theta(nk)$

- in \mathbb{R}^d : $\Theta(n^{\lfloor d/2 \rfloor}k^{\lfloor d/2 \rfloor})$
- bound for d = 2 was already known

The Clarkson-Shor Technique: Application to $(\leq k)$ -levels

Theorem. The max complexity of the $(\leq k)$ -level in an arrangement induced by a set L of n lines in the plane is O(nk).
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vertex of k-level of L shows up on 0-level of R iff

- both lines defining \boldsymbol{v} are in \boldsymbol{R}
- none of the at most k lines below v are in ${\cal R}$

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- $\bullet\,$ both lines defining v are in R
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$$\operatorname{prob} \ge \left(\frac{1}{k}\right)^2 \cdot \left(1 - \frac{1}{k}\right)^k \ge \left(\frac{1}{k}\right)^2 \cdot \frac{1}{e}$$

Theorem. The max complexity of the $(\leq k)$ -level in an arrangement induced by a set L of n lines in the plane is O(nk).

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 $\mathbb{E}\left[\text{complexity of 0-level of } R\right] \geq (\text{complexity of } k\text{-level in } L) \cdot \left(\frac{1}{k}\right)^2 \cdot \frac{1}{e}$

Overview of Complexity of Substructures in Arrangements in \mathbb{R}^2



Lecture Overview





- divide-and-conquer: important algorithmic design technique
- for geometric problems: perform divide step by partitioning space

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Example: point location in arrangements



Store lines in data structure such that we can find the cell containing a query point q in $O(\log n)$ time

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Example: point location in arrangements



Store lines in data structure such that we can find the cell containing a query point q in $O(\log n)$ time Idea

- Partition plane into small number of regions
- Find region containing query point q
- Recursively find cell containing q within region

- divide-and-conquer: important algorithmic design technique
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Example: point location in arrangements











Analysis

- query time:
- storage:





Analysis

- query time: $Q(n) = O(r) + Q(n/r) \implies Q(n) = O(\log n)$
- storage:





Analysis

- query time: $Q(n) = O(r) + Q(n/r) \implies Q(n) = O(\log n)$
- storage: $S(n) = (number of regions) \cdot S(n/r)$





Analysis

- query time: $Q(n) = O(r) + Q(n/r) \implies Q(n) = O(\log n)$
- storage: $S(n) = (number of regions) \cdot S(n/r)$ (number of regions) = $O(r^2) \implies S(n) = O(n^{2+\varepsilon})$

 $(1/r)\text{-}\mathrm{cutting}$ for set L of n lines in \mathbb{R}^2

partitioning of \mathbb{R}^2 into (possibly unbounded) triangles Δ_i such that each Δ_i intersects only n/r lines



(1/r)-cutting for set L of n lines in \mathbb{R}^2 partitioning of \mathbb{R}^2 into (possibly unbounded) triangles Δ_i such that each Δ_i intersects only n/r lines



Theorem. For any set L of n lines in \mathbb{R}^2 and any r with $1 \leq r \leq n$ there is a (1/r)-cutting consisting of $O(r^2)$ triangles.

(1/r)-cutting for set L of n lines in \mathbb{R}^2 partitioning of \mathbb{R}^2 into (possibly unbounded) triangles Δ_i such that each Δ_i intersects only n/r lines



Theorem. For any set L of n lines in \mathbb{R}^2 and any r with $1 \leq r \leq n$ there is a (1/r)-cutting consisting of $O(r^2)$ triangles.

Theorem. For any set L of n hyperplanes in \mathbb{R}^d and any r with $1 \leq r \leq n$ there is a (1/r)-cutting consisting of $O(r^d)$ simplices.

fine simplicial partition for set P of n points in \mathbb{R}^2

collection $\{(P_1, \Delta_1), \ldots, (P_r, \Delta_r)\}$ where

- $P = P_1 \cup \ldots \cup P_r$ and P_i 's are disjoint
- Δ_i is triangle containing P_i
- $n/(2r) \leqslant |P_i| \leqslant 2n/r$



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Theorem. For any set P of n points in \mathbb{R}^2 and any r with $1 \leq r \leq n$ there is a fine simplicial partition of O(r) triangles such that any line crosses $O(\sqrt{r})$ triangles.

fine simplicial partition for set P of n points in \mathbb{R}^2

collection $\{(P_1, \Delta_1), \ldots, (P_r, \Delta_r)\}$ where

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Theorem. For any set P of n points in \mathbb{R}^d and any r with $1 \leq r \leq n$ there is a fine simplicial partition of O(r) simplices such that any hyperplane crosses $O(r^{1-1/d})$ simplices.

Cuttings (and simplicial partitions) form the basis of data structures for

- point location
- range searching
- ray shooting

and of many other algorithmic and combinatorial results

Basic polynomial partitions [Guth-Katz'10]

- $P = \text{set of } n \text{ points in } \mathbb{R}^d$
- D = parameter (can depend on n)

Theorem. There exists a surface Z(f) that is the zero-set of a polynomial of degree at most D such that $\mathbb{R}^d \setminus Z(f)$ consists of $O(D^d)$ cells each containing $O(n/D^d)$ points from P.



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Used to (basically) solve

Erdős distinct-distances problem:

any set of n points in the plane defines $\Omega(n/\log n)$ distinct distances



Generalization of polynomial partitions [Guth'15]

- $L = \text{set of } n \text{ lines in } \mathbb{R}^d$
- D = parameter (can depend on n)

Theorem. There exists a surface Z(f) that is the zero-set of a polynomial of degree at most D such that $\mathbb{R}^d \setminus Z(f)$ consists of $O(D^d)$ cells each intersecting $O(n/D^{d-1})$ lines from L.

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(result is actually even more general)





Depth orders

S: set of n disjoint triangles (or other objects) in \mathbb{R}^3

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T is below T' (notation: T \prec T'):
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Applications

- computer graphics (Painter's Algorithm)
- computer-aided design and manufacturing (assembly sequences)
Depth orders

Depth order need not exist, due to cyclic overlap



Questions:

- Decide if a given order T_1, \ldots, T_n is a valid depth order.
- Compute a depth order, or decide that none exists.
- How many cuts are needed, in the worst case, to eliminate all cycles?

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For line segments in \mathbb{R}^3

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• in the worst case $\Omega(n^{3/2})$ cuts may be needed



three groups of $\sqrt{n}\times \sqrt{n}$ segments each

• $O(n^{9/4})$ for bipartite weavings of line segments [Chazelle *et al.*, FOCS'91]



• $O(n^{2-1/69} \log^{16/69} n)$ to get rid of triangular cycles for lines [Aronov,Koltun,Sharir STOC'03]



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- $O(n^{7/4} \text{ polylog } n)$ for triangles, with straight-line cuts [dB, FOCS'18]

technique uses polynomial partitions

uses curved cuts

combines Aronov-Sharir result with cuttings

Polynomial Partitions for Lines in \mathbb{R}^3

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- D = parameter

Theorem. There exists a surface Z(f) that is the zero-set of a polynomial of degree at most D such that $\mathbb{R}^d \setminus Z(f)$ consists of $O(D^3)$ cells each intersecting $O(n/D^2)$ lines from L.

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3. Recursively cut lines within each cell.

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- associate 3D polygonal curve Γ to cycle
- if Γ lies completely inside cell of $\mathbb{R}^3 \setminus Z(f)$ then cycles are removed by induction
- otherwise consider how level (number of intersection of upward ray with Z(f)) changes as we walk along Γ



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- similar but much more complicated approach works for triangles
- triangles are cut by polynomial, so pieces have curved boundaries

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- $\mathcal{E} = \text{set of } 3n \text{ edges of the triangles}$
- C =vertical, triangular column



Lemma. If C does not contain any triangle vertex in its interior and $\mathcal{E} \cap C$ is acyclic, then $\mathcal{T} \cap C$ is acyclic.

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using hierarchical gives $O(n^{7/4} \operatorname{polylog} n)$ fragments.




Lecture Overview



Thanks for your attention!



TU/e

