

The Anatomy of a Geometric Algorithm*

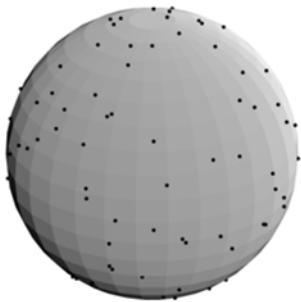
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What is computational geometry?

(examples rather than a definition)

An n -point set in \mathbb{R}^3 :



- What is the diameter of this point set?
- What is the smallest ball enclosing it?
- What is the “best fit” by a sphere?
- What is a “nice surface” defined by these points?

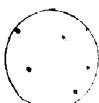
⋮

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OUR PARTICULAR PROBL-F4A4..

INPUT: AX POINTS,
in the plane
 $\leq n$

F(M): A SMALLEST CIRCLE
to POINTS



WHILE DISCUSSING AN ALGO-
RITHM | WE WU, (MEPT)

ft & E-V. T. T. L., Fi W. "ETCNUVQES

- Reformulation in terms of arrays, $\mathbb{R}^d \times \mathbb{R}^d$
- various combinatorial-geometric observations
- randomized algorithms
- parametric search (and how it's done, voice, i*)
- " n^2 -hard" problems
- geometric optimization from KMOVK (LP-type problems)
- TYPICAL OBSTACLES TO IMPLEMENTATION

TRICK... 1.00K AT FIXED SIZE WO 6LEM

Given m points and $r \geq 0$,
is there a circle
of radius r enclosing
 ≥ 4 (seitt's?)

"TESTING" given r

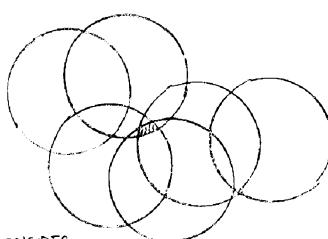
{ "CONVERSION" BY
GENERAL TECHNIQUES
(PARAMETRIC
SEARCH & OTHERS)
TO

"SEARCHING" for

$\min \{r \geq 0 : \text{test positive}\}$

REFORMULATION WITH ARRANGEMENTS

$3 \cup \text{disc} \subset \text{size} \geq k$



CONSIDER:
 m disks of radius r
around the given points
 \exists point of DEPTH $\geq k$
(depth = # of containing
disks)

COMPUTING depth(r)'S4a?*, dan¹, o, ppv ood.. •'

(as a planar graph)

- walk through it,
find depth for all
regions

COMPUTING ARRANGEMENT

OF w/ "NICE" CURVES
WITH intersections (1.0-f->1)5

- PLANE SWEEP 

- RANDOMIZED INCREMENTAL
CONSTRUCTION

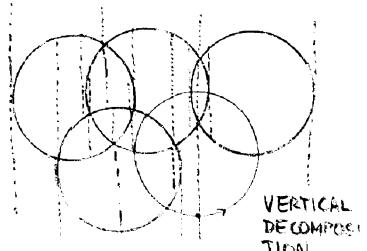
- A FEW &TH&?. FANCY

RANDOMIZED

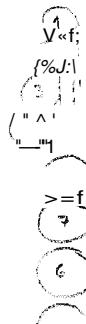
INCREMENTAL

CONSTRUCT OK)

- ADD CIRCLES ONE BY ONE
IN RANDOM ORDER
- INSERTING NEW CIRCLE
 - FIND INITIAL POINT
 - WALK THROUGH ARRANGE-
MENT



- Two CO INSTRUCTION M16HT
 - R^r -> rni STEPS EVEN
 - IF UI&t-W AB6¹ MO iMYgtSSCTIONA



- BUT:
THE EXPECTED
NUMBER OF STEPS
OVER A R-AnacN
INSERTION onDer*

O6, jrCtTi 1 ^

IS

O(n log n + I)

(PLANE SWEEP:

t

COHESIVE MATERIAL INFORMATION:

IP «%Ji, fx) » E

TURK

(fF 1

Oil V«

DM*

EygM MOEE IS TRUE:

IF NEW

EACH DISC IM7E¹.SEXTS,
10 ST O(e) owestsf u VIMBORANT ... ALL HAVE
B SAME RADIUS ! 3

WHY:



M CVM V6E" C ftM TKTGIVEN λ COMPUTE DEPTH(λ)

MOW Do WE F/M>>

"S"?ftNt>ARX" C Cl, \$A)& !(") APPROACH

PARAMETRIC SEARCH

[Dg^j] TAITE SOMF AIGtmTNH G

SUCH AS: test depth(λ) $\geq k$ SIMULATE $t \in \mathbb{N}$ EXRCUNO/V

E>P ^ PoK. ^ = H *

$$\lambda^* \stackrel{?}{=} q_p \text{ & given}$$

$$> \text{depth}(q) < k \Rightarrow \lambda^* > q.$$

$$\text{depth}(q) \geq k \Rightarrow \lambda^* \leq q.$$

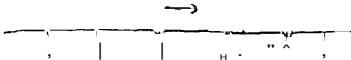
{ignores equality for now}

TO RESOLVE 1 COMPARISON $\lambda \stackrel{?}{=} q$
NEED TO COMPUTE depth(q) 1x

^ ^ i& ^ AINV COM ^ RRTfE 0 M.S.

)VR ONCE C * ^ . . . ^

SEA RT CN

→ PARAM. SEARCH ALGORITHMS
ASVNPT. QUITE FABT (i.e. es ioiT)

PfSRTfM • SfftStM ETC

, n.) algorithm

(practical, impractical)

OTHER AppaoACMFs.:

- k^{th} ORDER VOLVO M1 DIAGRAMS
- SUBDIVISION OF TUB PLANE
- REGION = POINTS WITH THE SAME flexible OS
- \wedge tAA, R, T POTOTI IN 7WP
- GIVEN SET

KNOWN complexity

CONSTRUCTION TIME close
 $\propto O(k^2 m^2)$ [by m]

- ANALYZE "EVENTS" IN PARAM. SEARCH,
- (PRIMH. EACH BCLfTfEP Bi
- RANDOMIZED SEARCH • PROBLEM-SPECIFIC)

PHASE 1FINO λ , Si*, WITHg; $\stackrel{?}{=}$ 1ST OF oft) POTBKTKIALN. \rightarrow λ \rightarrow λ \rightarrow λ TRUE: APPROXIMATE depth(λ)BY grid-depth(λ)

volume argument:

$$\text{grid-depth}(\lambda) \leq \text{depth}(\lambda)$$

$$\leq \text{conv} \cdot \text{grid-depth}(\lambda)$$

BESUIT, PHASE 1 CAM & DONE

IN $O(m^2 k^2 h)$ TIME S- 6f-1) SPACE

PHASE 2 $x_0 \geq x^*$ FIND x^* 14

$p \in P$

(x)

y

$\{x : \text{depth on } p_p \text{ is } \geq k\}$

$\Rightarrow \{x : p \in P\}$

\wedge can be computed in $Q(h)$ time; t-ru, \otimes

[EVENTS \Rightarrow x da
val di
— +VJC3 Under val]

AtL A^{1^n} EVENTS

OR 60 BIN. SEARCH $\gg [*]$

PHASE 2 CONT'D 15

$\min \{ * : p \in P \}$

x_0

y

$\{x : \text{depth on } p_p \text{ is } \geq k\}$

$\Rightarrow \{x : p \in P\}$

- KNOWING $>^k_p$...
CC-M BlE< MITS Alt
y' UJIT

6V one

COMPUTE

••• Acur

*I OP p.
DISCA!OI+

TYPICAL Ta.ick ff; i

$\rightarrow O(n)$ space, C

$\rightarrow O(n^2)$ space,
 $O(n \log n + A \cdot A)$ TIME

16

CA-(vi WE Do CHUC-M)
fttrITeli THAN/ -j (* t -) ?
ANSWER; DON'T ICNOW

JMM&WEI: NOftT UUBtV WOT
IN THE WORST CASE

"AV" - HftftD " Pft.O^LEMb
R&OVJCTIONS AMONS SSoNEMie
Pn.O&tEMS, IF ON& COUUs SE
SOLij & FASTEH T&AM "V" vi* STY&
TI?BVi OThB!.s COULb (LIKE¹ w- NA¹)

"BfeSiC" PflO5IEM , - W o , , ^ . ^ ^
Qorsnow • (A + A) n A = 0 ?
I dUres c. + b = c iu< v a.
solution in A ?]

MANY OTHERS (GARETAN, OVERMARS)
OUTS: m=1000 FOR n=2k

17

ANSWER ~> Soi-iFrrtHEi VTS

SMALL&T EMCLOS^AIS
CIB,C LE

C f O Lf-fL-fJPDoI

GEnFyMj_ Ff2.AMEWOfK.

SHArtIR1tMEi_2.LI

"ABST'ACT" OPTIMIZATION PR06LC/M
AXIOM & PRIMITIVE OeaAriows

CHECK (VXIOMS g< iMfteWEivr
INITIVS OPERATIOnI
" > SEu^riAL Pew EftFuu
At&o^ITViMS

^JIVE Kft. Prt,OefitA^IMfJe, SMALLEST
ENC LOSIWG. g,t,L IM ^, pSTB!MCE
OT 1^O^QUVHBOAA! CONVER

<p>k. OosfT</p> <p>$\leq i^* < * - \frac{1}{n}$ SHALL</p> <p>LP-TVPE- $P_{p-ti} & LWH$ Ut TM</p> <p>a VIOLATED CONSTR. A-N7&</p> <p>$O(m \log m + a_i^* J)$ (HOT VET PRACTICAL)</p> <p>ey. cwc3</p> <p>$\lambda = 2$ PROBABLY $\Sigma(m \log n)$</p> <p>$O(n)$</p>	1S	<p>IMPLEMENTATION</p> <p>- 1 H1.0ft,pT Cfft, PWHR&</p> <p>OFTBN <<OO SB "pftSV" SOLUroINS fovJT F_vmtv DIFFICULT TO PROCRM & USE</p> <p>- US^W.V.V, COMSH>BRAE!.g SA0k</p> <p>TC INPLgfHCAJT TH^OS, A,L60 V-JELL - HAW THINSS WEEO</p> <p>- NIIM^ftiCM. / P!rciS5or\i tssufii, ..</p> <p>» PI.OftTIMG PoiIVT AR.ITH, WQ_gTtV No 6&O&</p> <ul style="list-style-type: none"> • USE EXACT Aiirrvi. ANB/O/? MMTH, PILT&S.& (.Lm^iCi) • • • SLo VVER gor p^Vi @po- (aETTE'f? SLOIV TWAV Cft-*&HIArS^
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Appendix

The purpose of this small appendix to the slides is to cite sources for the results directly mentioned in the talk, and to point to a few general-purpose references on computational geometry.

There are several introductory textbooks by now; one of them is [2]. Randomized incremental algorithms and applications of arrangements can be found there. There are two handbooks of computational geometry [6], [11]. Recent activity in the field, with increasing emphasis on more practically oriented studies, can be monitored in proceedings of the Annual ACM Symposia on Computational Geometry.

A parametric search algorithm for the considered problem is from [3]. Parametric search was formulated in [10]. Other papers on the problem are [4], [1]. The algorithm discussed in some detail is from [9]. The N^2 -hard problems are collected in [5]. The LP-type problems were introduced in [8], and the application on circles enclosing all but q points is in [7].

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