# Covering Many or Few Points with Unit Disks 

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## Overview

- MAX: covering many points with unit disks
- MIN: covering few points with a unit disk
- the problems and their context
- new results
- algorithm for MAX

MAX: covering many points with unit disks
$m \in \mathbb{N}$ a constant
$P: n$ points in $\mathbb{R}^{2}$


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Place $m$ unit disks, max number covered points


## MAX: covering many points with unit disks

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Place $m$ unit disks, max number covered points


Weighted points $\Rightarrow$ maximize sum of weights

Disks may overlap, no multiplicity when counting (Non-overlapping disks: collides with packing)

## MIN: covering few points with a unit disk

$X$ : constraint region for the centers $P: n$ points in $\mathbb{R}^{2}$


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Place a unit disk, centered at $X$ min number covered points


## MIN: covering few points with a unit disk

$X$ : constraint region for the centers
$P: n$ points in $\mathbb{R}^{2}$

Place a unit disk, centered at $X$ min number covered points


Weighted points $\Rightarrow$ minimize sum of weights
( $X$ constant complexity)
$X=\mathbb{R}^{2}$ or placing $m>1$ disks $\Rightarrow$ problems in the definition

## The problems and their context

- $\operatorname{MAX}(P, m)$ : place $m$ unit disks maximizing the weight of the covered points; $m$ is a constant.
- $\operatorname{MIN}(P, X)$ : place a unit disk with center in $X$ and minimizing the weight of the covered points.

Motivation: Location of attractive or obnoxious facilities with fixed range of impact.

## The problems and their context

Known results for $\operatorname{MAX}(P, m)$ and $\operatorname{MIN}(P, X)$ :

- solvable in polynomial time.
[folklore]
- $O\left(n^{2}\right)$ time for $\operatorname{MAX}(P, 1)$ and $\operatorname{MIN}(P, X)$.
[Drezner '81, Drezner \& Wesolowsky '94, Chazelle \& Lee '86]

■ 3 SUM-hard $\Rightarrow$ no subquadratic algorithm known.
■ randomized $(1+\varepsilon)$-approximation for unweighted $\operatorname{MAX}(P, 1)$ and $\operatorname{MIN}(P, X)$ in $O\left(n \varepsilon^{-2} \log n\right)$ time.
[Aronov \& Har-Peled '05]

## The problems and their context

Variations on $\operatorname{MAX}(P, m)$ and $\operatorname{MIN}(P, X)$ :

- $\operatorname{MIN}(P, X)$ but placing a unit square: $O(n \log n)$ time. [Katz \& Kedem \& Segal, '02]

■ MAX $(P, 1)$ but placing convex object of constant complexity: randomized near-linear time.
[Agarwal et al. '02]

- MAX $(P, 2)$ but with disjoint disks: $O\left(n^{8 / 3} \log ^{2} n\right)$ time.
[Cabello et al '06]


## New results

(1 $\pm \varepsilon$ )-approximation algorithms for:

- $\operatorname{MAX}(P, m)$ in $O\left(n\left(\log n+\varepsilon^{-O(m)}\right)\right)$ time.
- $\operatorname{MIN}(P, X)$ in $O\left(n\left(\log ^{3} n+\varepsilon^{-4} \log ^{2} n\right)\right)$ expected time.


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First near-linear deterministic result for any $m$.

- $\operatorname{MIN}(P, X)$ in $O\left(n\left(\log ^{3} n+\varepsilon^{-4} \log ^{2} n\right)\right)$ expected time.
"Adapt" [Aronov \& Har-Peled '05] for weighted point sets $\Rightarrow$ Extra logs and $\varepsilon$ 's.


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## Algorithm for $\operatorname{MAX}(P, m)$

Ingredients:

- bounded VC-dimension $\Rightarrow(1 / r)$-approximations
- shifted grids
- dynamic programming


## Algorithm for $\operatorname{MAX}(P, 1)$

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## Algorithm for $\operatorname{MAX}(P, 1)$

A biased course on discrepancy.

## Algorithm for $\operatorname{MAX}(P, 1)$

$P$ a weighted $n$-point set.
$r$ a parameter.
Point set $A$ is a $(1 / r)$-approximation for $P$ if

$$
|w(D \cap P)-w(D \cap A)| \leq \frac{1}{r} \cdot w(P)
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for any unit disk $D$.

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Thm: There is a $(1 / r)$-approximation $A$ for $P$ with $O\left(r^{2} \log r\right)$ points. It takes $O\left(n r^{O(1)}\right)$ time to construct it.

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Aim: $(1+\varepsilon)$-approximation algorithm.

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Warning!
finding an $\varepsilon$-approximation $A$ and an optimal solution for $A$ is not good.

So, why did I explain it...?

## Algorithm for $\operatorname{MAX}(P, 1)$

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Grid of spacing 3.
set $r=100 / \varepsilon$
set $A=\emptyset$
for each cell $C$
find $(1 / r)$-approximation $A_{C}$ for $P \cap C$ add $A_{C}$ to $A$


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Lem: Optimal solution for $A$ is a $(1+\varepsilon)$-approximation.
Proof: ...


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Did we gain anything?
Each grid cell has $O\left(r^{2} \log r\right)=O\left(\varepsilon^{-O(1)}\right)$ points.

## Algorithm for $\operatorname{MAX}(P, 1)$



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Take its $3^{2}$ integer shifts. Each cell $O\left(\varepsilon^{-O(1)}\right)$ points.

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Take its $3^{2}$ integer shifts. Each cell $O\left(\varepsilon^{-O(1)}\right)$ points.
Lem: One of them does not intersect the optimal solution.

## Algorithm for $\operatorname{MAX}(P, 1)$

replace $P$ by $A$
for each of the 9 shifted grids $G^{\prime}$
for each cell $C$ in $G^{\prime}$
find best disk inside $C$
report the best disk you found.

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for each of the 9 shifted grids $G^{\prime}$
for each cell $C$ in $G^{\prime} \longleftarrow C$ has $O\left(\varepsilon^{-O(1)}\right.$ points
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## Algorithm for $\operatorname{MAX}(P, 1)$

replace $P$ by $A$
for each of the 9 shifted grids $G^{\prime}$ for each cell $C$ in $G^{\prime} \longleftarrow C$ has $O\left(\varepsilon^{-O(1)}\right)$ points find best disk inside $C \longleftarrow$ takes $O\left(\varepsilon^{-O(1)}\right.$ time report the best disk you found.

Thm: $\operatorname{MAX}(P, 1)$ can be $(1+\varepsilon)$-approximated in $O\left(n \log n+n \varepsilon^{-2} \log (1 / \varepsilon)\right)$ time.

## Algorithm for $\operatorname{MAX}(P, m)$

replace $P$ by $A$
for each of the $O\left(m^{2}\right)$ shifted grids $G^{\prime}$ find best $m$ disks avoiding $G^{\prime}$ report the best group you found.
replace $P$ by $A$
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## Algorithm for $\operatorname{MAX}(P, m)$

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replace $P$ by $A$
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Dynamic programming accross cells of $G^{\prime}$

## Algorithm for $\operatorname{MAX}(P, m)$

## replace $P$ by $A$

for each of the $O\left(m^{2}\right)$ shifted grids $G^{\prime}$
replace $P$ by $A$
for each of the 9 shifted grids $G^{\prime}$ for each cell $C$ in $G^{\prime}$
find best disk inside $C$
$\longrightarrow$ find best $m$ disks avoiding $G^{\prime}$
report the best group you found.
Dynamic programming accross cells of $G^{\prime}$

Grid of size $3 m$.

Thm: For $m>1, \operatorname{MAX}(P, m)$ can be $(1+\varepsilon)$-approximated in $O\left(n \log n+n \varepsilon^{-4 m+4} \log ^{2 m-1}(1 / \varepsilon)\right)$ time.

## Summary

$(1+\varepsilon)$-approximation algorithm for

- $\operatorname{MAX}(P, m)$ in $O\left(n \log n+n \varepsilon^{-O(m)}\right)$; deterministic.
- $\operatorname{MIN}(P, X)$ in $O\left(n \log ^{3} n+n \varepsilon^{-4} \log ^{2} n\right)$ time; randomized MC and LV.

What remains?

- subcubic exact for $\operatorname{MAX}(P, 2)$ with disks or squares?
- is it true that nobody studied $\operatorname{MAX}(P, m)$ before?


## Summary

$(1+\varepsilon)$-approximation algorithm for

- $\operatorname{MAX}(P, m)$ in $O\left(n \log n+n \varepsilon-{ }^{-}(m)\right.$, deterministic.
- $\operatorname{MIN}(P, X)$ in $O\left(n \log ^{2} n+n=5^{4} \log ^{2} n\right)$ time; randomized MC and LV

What remain

- subcubic exact for $\operatorname{MAX}(P, 2)$ with disks or squares? is it true that nobody studied $\operatorname{MAX}(P, m)$ before?

