# Voronoi Cells of Lattices with Respect to Arbitrary Norms 

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## Section 1

## Motivation

## Lattices - 2 equivalent definitions

## Definition (I)

An n-dimensional lattice is a discrete, additive subgroup of $\mathbb{R}^{n}$.


$$
I-X X
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## Lattices - 2 equivalent definitions

## Definition (l)

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## Definition (II)



Let $b_{1}, \ldots, b_{m} \in \mathbb{R}^{n}$ be linearly independent. Then

$$
\mathcal{L}\left(b_{1}, \ldots, b_{m}\right):=\left\{\sum_{i=1}^{m} z_{i} b_{i} \mid z_{1}, \ldots, z_{m} \in \mathbb{Z}\right\}
$$

is a lattice with basis $\left(b_{1}, \ldots, b_{m}\right)$ of rank $m$ and dimension $n$.

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Assume $m=n$.

## Lattice problems

## Shorłest Vecłor Problem (SVP):

Given lattice basis ( $b_{1}, \ldots, b_{n}$ ), find shortest vector in
$\mathcal{L}\left(b_{1}, \ldots, b_{n}\right) \backslash\{0\}$.

II - XX

## Lattice problems

Shortest Vector Problem (SVP): Given lattice basis ( $b_{1}, \ldots, b_{n}$ ), find shortest vector in
$\mathcal{L}\left(b_{1}, \ldots, b_{n}\right) \backslash\{0\}$.


Closest Vector Problem (CVP): Given lattice basis ( $b_{1}, \ldots, b_{n}$ ) and $x \in \mathbb{R}^{n}$, find closest vector to $x$ in $\mathcal{L}\left(b_{1}, \ldots, b_{n}\right)$.


## Lattice problems

## Shortest Vector Problem (SVP):

 Given lattice basis ( $b_{1}, \ldots, b_{n}$ ), find shortest vector in$\mathcal{L}\left(b_{1}, \ldots, b_{n}\right) \backslash\{0\}$.


Decision variant NP-hard (under randomized reductions) (Ajtai)

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Decision variant NP-complete (Micciancio, Goldwasser)
II - XX

## Lattice problems

Algorithm by Micciancio and
Voulgaris:

- solves both problems for Euclidean distance
- $2^{O(n)}$ time and space complexity
- core of algorithm:
- solve CVP with additional input: Voronoi cell



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## Definition

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All $v \in \wedge$ needed?

## Voronoi-relevant vectors



$$
I V-X X
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## Voronoi-relevant vectors



## Definition

$v \in \Lambda \backslash\{0\}$ is Voronoi-relevant (VR) w.r.t. $\|\cdot\|$ if $\exists x \in \mathbb{R}^{n}:\|x\|=\|x-v\|$,

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$\Rightarrow$ VR vectors determine Voronoi cell for Euclidean norm $\|\cdot\|_{2}$, i.e., $\mathcal{V}\left(\Lambda,\|\cdot\|_{2}\right)=\left\{x \in \mathbb{R}^{n} \mid \forall v \in \Lambda:\|x\|_{2} \leq\|x-v\|_{2}\right\}$ (Agrell et al.)

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at most $2\left(2^{n}-1\right)$ Voronoi-relevant vectors in $n$-dimensional lattice w.r.t. Euclidean norm (Agrell et al.)
- essential for above algorithm

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- essential for above algorithm
- proof uses parallelogram identity
- open problem by Micciancio and Voulgaris: extend algorithm to p-norms
$\Longrightarrow$ Upper bound for number of Voronoi-relevant vectors w.r.t. arbitrary p-norms?


## Section 2

2 Dimensions

## Geometry Do VR vectors determine Voronoi cell?

## Combinatorics

How many $v \in \wedge$ are VR w.r.t. \|• • \|?

## Geometry

 Do VR vectors determine Voronoi cell?$n \geq 1$ : yes, for Euclidean norm

Combinatorics How many $v \in \Lambda$ are VR w.r.t. \|• • \|?
$\leq 2\left(2^{n}-1\right)$

## Geometry

Do VR vectors determine Voronoi cell?
$n \geq 1$ : yes, for Euclidean norm
Our results:
$n=2$ : yes, for strictly convex norm 4 or 6

## Strict convexity

## Definition

A norm is strictly convex if its unit sphere does not contain a line segment.
$\|\cdot\|_{1}$ : not strictly convex
$\|\cdot\|_{2}$ : strictly convex

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$\Rightarrow$ Generalized Voronoi-relevant
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## Section 3

General Dimensions

## Geometry

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## Combinatorics

How many $v \in \Lambda$ are VR w.r.t. $\|\cdot\|$ ?
$\leq 2\left(2^{n}-1\right)$
\#GVR vectors: not bounded by $f(n)$

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## Smooth norms

## Definition

Let $S \subseteq \mathbb{R}^{n}$ and $s \in \partial S$. A hyperplane $H \in \mathbb{R}^{n}$ is a supporting hyperplane of $S$ at $s$ if
$\square s \in H$ and

- $S$ is contained in one of the 2 closed halfspaces bounded by H

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- $s \in H$ and
- S is contained in one of the 2 closed halfspaces bounded by H


## Definition

A norm is smooth if each point on its unit sphere has a unique supporting hyperplane.

$$
X-X X
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## Smooth norms



$$
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There is no upper bound for the number of Voronoi-relevant vectors

- w.r.t. general strictly convex and smooth norms
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$Q:$ Can $a+m b$ for $a, b \in \Lambda$ and large $m \in \mathbb{N}$ be Voronoi-relevant?



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## 3-norm

XIV - XX

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XIV - XX

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XIV - XX

## Idea



XV - XX

## Idea



Rotate lattice s.t.


> XV - XX

## Idea



Rotate lattice s.t.


## Construct lattice family $\Lambda_{m}$

Modify standard lattice:

XVII - XX

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c-axis s.t. a + mb lies on yellow axis


XVII - XX

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XVII - XX

## Construct lattice family $\Lambda_{m}$

Modify standard lattice:
I Stretch in c-direction by $5 \sqrt{2} m^{5}$
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III Rotate around yellow axis by $45^{\circ}$

XVII - XX

## Construct lattice family $\Lambda_{m}$

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$\Longrightarrow$ Lattice $\wedge_{m}$


## Construct lattice family $\Lambda_{m}$

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$\Longrightarrow$ Lattice $\wedge_{m}$

- Move x along c-direction
$\Longrightarrow a+m b \vee R$ w.r.t. 3-norm



## Construct lattice family $\Lambda_{m}$



Rotate lattice s.t.


## Construct lattice family $\Lambda_{m}$


XIX - XX

## Construct lattice family $\Lambda_{m}$

Analogous: Theorem (Blömer, K.)
For $2 \leq k \leq \sqrt{m}, a+k b$ is Voronoi-relevant in $\wedge_{m}$ w.r.t. 3-norm.

XIX - XX

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How many $v \in \Lambda$ are VR w.r.t. $\|\cdot\|$ ?
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## Thank you!

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## Combinatorics

 How many $\vee \in \Lambda$ are VR w.r.t. $\|\cdot\|$ ?$\leq 2\left(2^{n}-1\right)$

## General upper bound

## Proposition (Blömer, K.)

Every lattice $\Lambda \subseteq \mathbb{R}^{n}$ has at most $\left(1+4 \frac{\mu(\Lambda,\| \| \cdot \|)}{\lambda_{1}(\lambda,|\cdot| l \mid)}\right)^{n}$ generalized Voronoi-relevant vectors w.r.t. every norm.

## Definition

The covering radius of $\wedge$ w.r.t. $\|\cdot\|$ is

$$
\mu(\Lambda,\|\cdot\|):=\inf \left\{d \in \mathbb{R}_{\geq 0} \mid \forall x \in \mathbb{R}^{n} \exists v \in \Lambda:\|x-v\| \leq d\right\} .
$$

The first successive minimum of $\wedge$ w.r.t. || $\cdot \|$ is

$$
\lambda_{1}(\Lambda,\|\cdot\|):=\inf \{\|v\| \mid v \in \Lambda, v \neq 0\} .
$$

## Taxicab norm $\left|\mid \cdot \|_{1}\right.$ - Voronoi cell



## Taxicab norm || • \| $\|_{1}$ - Voronoi cell



- 2 Voronoi-relevant vectors


## Taxicab norm || • $\|_{1}$ - Voronoi cell



- 2 Voronoi-relevant vectors
- x not in Voronoi-cell


## Taxicab norm $\left|\mid \cdot \|_{1}\right.$ - Voronoi cell



- 2 Voronoi-relevant vectors
- x not in Voronoi-cell, BUT:
- x closer to 0 than to

Voronoi-relevant vectors

## Generalized Voronoi-relevant vectors

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\begin{array}{r}
\exists x \in \mathbb{R}^{n}:\|x\|=\|x-v\|, \\
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## Theorem (Blömer, K.)

| For every lattice $\Lambda \subseteq \mathbb{R}^{n}$ and every norm $\|\cdot\|$,

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\| $\mathcal{L}\left(\binom{1}{1},\binom{0}{m}\right)$ has at least $2 m$ GVR vectors w.r.t. Taxicab norm.

