

Lattice Problems

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Lattice Algorithms



- Input = **integer matrix**, whose rows span the lattice. Parameters:
 - Size of basis coefficients
 - Lattice dimension
- Asymptotically:
 - dim increases
 - coeff-size polynomial in dim.



Euclid with Vectors

- If $b_1, \dots, b_n \in \mathbf{Z}^m$, $L(b_1, \dots, b_n)$ is a lattice: can you **efficiently** find a lattice basis?
- This would be **our first non-trivial lattice algorithm**.
- If $n=2$ and $m=1$, this is exactly the **gcd** problem, so we are trying to generalize **Euclid's algorithm**.

Hard Lattice Problems

○ Since 1996, lattices are **very trendy** in classical and quantum complexity theory.

○ Depending on the dimension d : approx. factor

○ NP-hardness

$$O(1)$$

$$1$$

○ non NP-hardness (NP_{nc} -NP)

$$\sqrt{d}$$

○ worst-case/average-case reduction

$$d \log d$$

○ cryptography

$$d^{O(1)}$$

○ **subexp-time** algorithms

$$2^{\sqrt{d}}$$

○ **poly-time** algorithms

$$2^{\frac{d \log \log d}{\log d}}$$



$$\infty$$



Hard Lattice Problems

- Input: a lattice L and an n -dim ball C .
- Output: decide if $L \cap C$ is non-trivial, and find a point when applicable. Easy if $L = \mathbf{Z}^n$.

- Two settings

- Approx: $L \cap C$ has **many points**.

Ex: SIS and ISIS.



- Unique: **only one** non-trivial point.

Ex: BDD.



The Shortest Vector Problem (SVP)

- Input: a basis of a d -dim lattice L
- Output: nonzero $v \in L$ minimizing $\|v\|$ i.e.

$$\|v\| = \lambda_1(L)$$

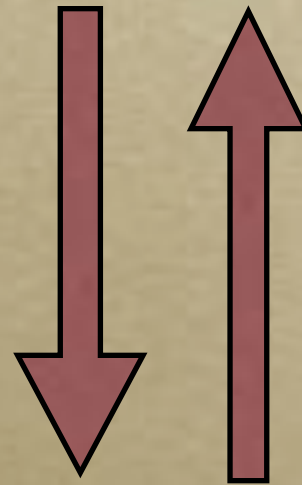


2	0	0	0	0
0	2	0	0	0
0	0	2	0	0
0	0	0	2	0
1	1	1	1	1



Relaxing SVP

- Input: a basis of a d -dim lattice L .
- Output: nonzero $v \in L$ such that
- **Approximate-SVP**: $\|v\| \leq f(d) \lambda_1(L)$ [relative]



- **Hermite-SVP**: $\|v\| \leq g(d) \text{vol}(L)^{1/d}$ [absolute]

Lattice Challenges

TU DARMSTADT LATTICE CHALLENGE

HALL OF FAME

Position	Dimension	Shortest Norm	Contestant	Submission	Date
1	400	127.94	Yasunori Asari, Phong Nguyen	Details	2017-02-04
	400	128.27	Yasunori Asari, Phong Nguyen	Details	2017-02-04
	400	130.26	Yasunori Asari, Phong Nguyen	Details	2017-02-04
2	400	105.00	Yasunori Asari, Phong Nguyen	Details	2017-02-04
	400	106.40	Yasunori Asari, Phong Nguyen	Details	2017-02-04
	400	107.57	Yasunori Asari, Phong Nguyen	Details	2017-02-04
	400	111.00	Yasunori Asari, Phong Nguyen	Details	2017-02-04
	400	114.00	Yasunori Asari, Phong Nguyen	Details	2017-02-04
	400	116.00	Yasunori Asari, Phong Nguyen	Details	2017-02-04

SVP CHALLENGE

HALL OF FAME

Position	Dimension	Shortest Norm	Seed	Contestant	Solution	Algorithm	Submit Date	Awards Factor
1	170	1439	0	L. Scalet, M. Stevens, W. van Wazeren	Yes	Sieving	2010-06-12	1.04400
2	151	2020	0	L. Scalet, M. Stevens, W. van Wazeren	Yes	Sieving	2010-06-22	1.04900
3	166	1683	0	M. Albrecht, L. Duray, G. Harsh, E. Karpman, E. Poppelmann, M. Stevens, P. Zimmer	Yes	Sieving	2010-06-18	1.05000
4	162	1582	0	Martin Albrecht, Leo Duray, Gertfried Harsh, Elena Karpman, Edoardo Poppelmann, Mark Stevens	Yes	Sieving	2010-06-30	1.05100
5	154	2007	0	Kang Minchulshikha and Yuseon YOUNG	Yes	Other	2010-02-1	1.05100

WILMINGTON, MA (POWER) FEBRUARY 05, 2015

Security Innovation is pleased to launch the NTRU Challenge today, February 5th, 2015. The NTRU Challenge will increase the understanding of the shortest vector problem in NTRU lattices while encouraging and stimulating further research into the security analysis of NTRU-based cryptosystems. The NTRU Challenge has been designed to provide additional information to users of NTRU public-key cryptosystems to aid in their selection of suitable key lengths for a desired level of security.

Access the challenge here: <http://www.SecurityInnovation.com/NTRUChallenge>

The Challenge asks participants to compute the NTRU private keys from the given list of public keys and associated system parameters. This is the type of problem faced by hackers who wish to defeat an NTRU-based cryptosystem. The Challenge consists of several individual NTRU challenges, targeted at different security levels, some of which can be solved in a day, some in a few months and some which are considered to be computationally intractable.

The prize for the first correct solution for the 11 lower security level challenges will be \$1,000 each, with \$5,000 being awarded per solution for the 16 higher security level challenges. Additionally, participants who arrive at innovative and unique solutions may be chosen for induction into the NTRU Hall of Fame, an award which includes an all-expenses paid trip to a major cryptographic conference.

The Closest Vector Problem (CVP)

- Input: a basis of a lattice L of dim d , and a target vector t .
- Output: $v \in L$ minimizing $\|v - t\|$.



- **BDD** (bounded distance decoding): special case when t is very close to L .

Intuition

- SVP is not harder than CVP: if one can solve exact CVP, one can solve exact SVP.



Random Instances

- Which distributions of integer lattices (SVP and CVP) and target (CVP/BDD)?

Regrouping Lattices

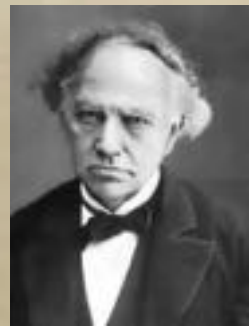
- A **full-rank** integer lattice $L \subseteq \mathbf{Z}^m$ defines a finite Abelian group \mathbf{Z}^m/L . Two different lattices can define the same quotient.
- Reciprocally, for any finite Abelian group G , let $L_m(G) = \{ \text{lattices } L \subseteq \mathbf{Z}^m \text{ s.t. } \mathbf{Z}^m/L \sim G \}$.
- If $L \in L_m(G)$, then $\text{rank}(L) = m$.

Remarks

- $L \in L_m(G)$ iff $\text{rank}(G) \leq m$ and
 $\exists g_1, \dots, g_m \in G$ generating G s.t.
 $L = \{(x_1, \dots, x_m) \in \mathbf{Z}^m \text{ s.t. } \sum_i x_i g_i = 0\}$.
- If you pick $g_1, \dots, g_m \in G$ uniformly at random until they generate G , then
 $L = \{(x_1, \dots, x_m) \in \mathbf{Z}^m \text{ s.t. } \sum_i x_i g_i = 0\}$ is uniformly distributed in $L_m(G)$.

Remarks

- G can be decomposed as a product of n cyclic groups. If $n > m$, then $L_m(G) = \emptyset$.
- $L_m(G)$ is finite because of the Hermite normal form.
- The sets $L_m(G)$ form a partition of the set of full-rank lattices in \mathbf{Z}^m .
- Most lattices L have a low-rank quotient G .



The Hermite normal form

- Any full-rank lattice $\subseteq \mathbf{Z}^m$ has a unique basis which is:
 - lower-triangular
 - has positive diagonal
 - in each column, all coefficients are ≥ 0 and $<$ the diagonal coefficient.



The SIS Problem (1996): Small Integer Solutions

- Let $(G,+)$ be a finite Abelian group: $G=(\mathbf{Z}/q\mathbf{Z})^n$ in [Ajtai96]. View G as a \mathbf{Z} -module.
- Pick g_1, \dots, g_m uniformly at random from G .
- Goal: Find short $(x_1, \dots, x_m) \in \mathbf{Z}^m$ s.t. $\sum_i x_i g_i = 0$,
e.g. $\|x\| \leq m (\#G)^{1/m}$.
- This is essentially finding a short vector in a (uniform) **random lattice** of $L_m(G) = \{ \text{lattices } L \subseteq \mathbf{Z}^m \text{ s.t. } \mathbf{Z}^m/L \sim G \}$.



Ex: Cyclic G

- Let $G = \mathbf{Z}/q\mathbf{Z}$
- Pick g_1, \dots, g_m uniformly at random mod q .
- Goal: Find short $\mathbf{x} = (x_1, \dots, x_m) \in \mathbf{Z}^m$
s.t. $\sum_i x_i g_i \equiv 0 \pmod{q}$.
- This is finding a short lattice vector for
random lattices L such that $\mathbf{Z}^m/L \sim \mathbf{Z}/q\mathbf{Z}$.



Worst-case to Average-case Reduction

- [Ajtai96]: If one can efficiently solve SIS for $G=(\mathbf{Z}/q_n\mathbf{Z})^n$ on the average, then one can efficiently find short vectors in **every n -dim** lattice.
- [GINX16]: This can be generalized to any sequence (G_n) of finite abelian groups, provided that **$\#G_n$ is sufficiently large**
 $\geq n^{\Omega(\max(n, \text{rank}(G)))}$ and m too. Ex: $(\mathbf{Z}/2\mathbf{Z})^n$ is not.

Application: Hash Function

- Let $(G,+)$ be a finite Abelian group: Pick g_1, \dots, g_m uniformly at random from G .
- Let $h(\mathbf{x}) = \sum_i x_i g_i$ for $\mathbf{x} = (x_1, \dots, x_m)$ in $\{0,1\}^m$.
- Then **finding collisions** ($x \neq y$ s.t. $h(x) = h(y)$) is as hard as solving SIS on the average, which is as hard as worst-case lattice problems.

Remark

- Inverting h is called the ISIS problem.
- It is the same as finding a lattice point inside a ball, where the center is defined by the input.



Duality

- Remember the SIS lattice:
 - g_1, \dots, g_m in some finite Abelian group $(G, +)$
 - $L = \{ \mathbf{x} = (x_1, \dots, x_m) \in \mathbf{Z}^m \text{ s.t. } \sum_i x_i g_i = 0 \}$
- The **dual lattice** of L is related to the dual group G^\vee of (additive) characters of G : morphisms from G to $\mathbf{T} = \mathbf{R}/\mathbf{Z}$
 - $L^\vee = \{ (y_1, \dots, y_m) \in \mathbf{R}^m \text{ s.t. for some } s \in G^\vee, \text{ for all } i$
 $y_i \equiv s(g_i) \pmod{1} \}$

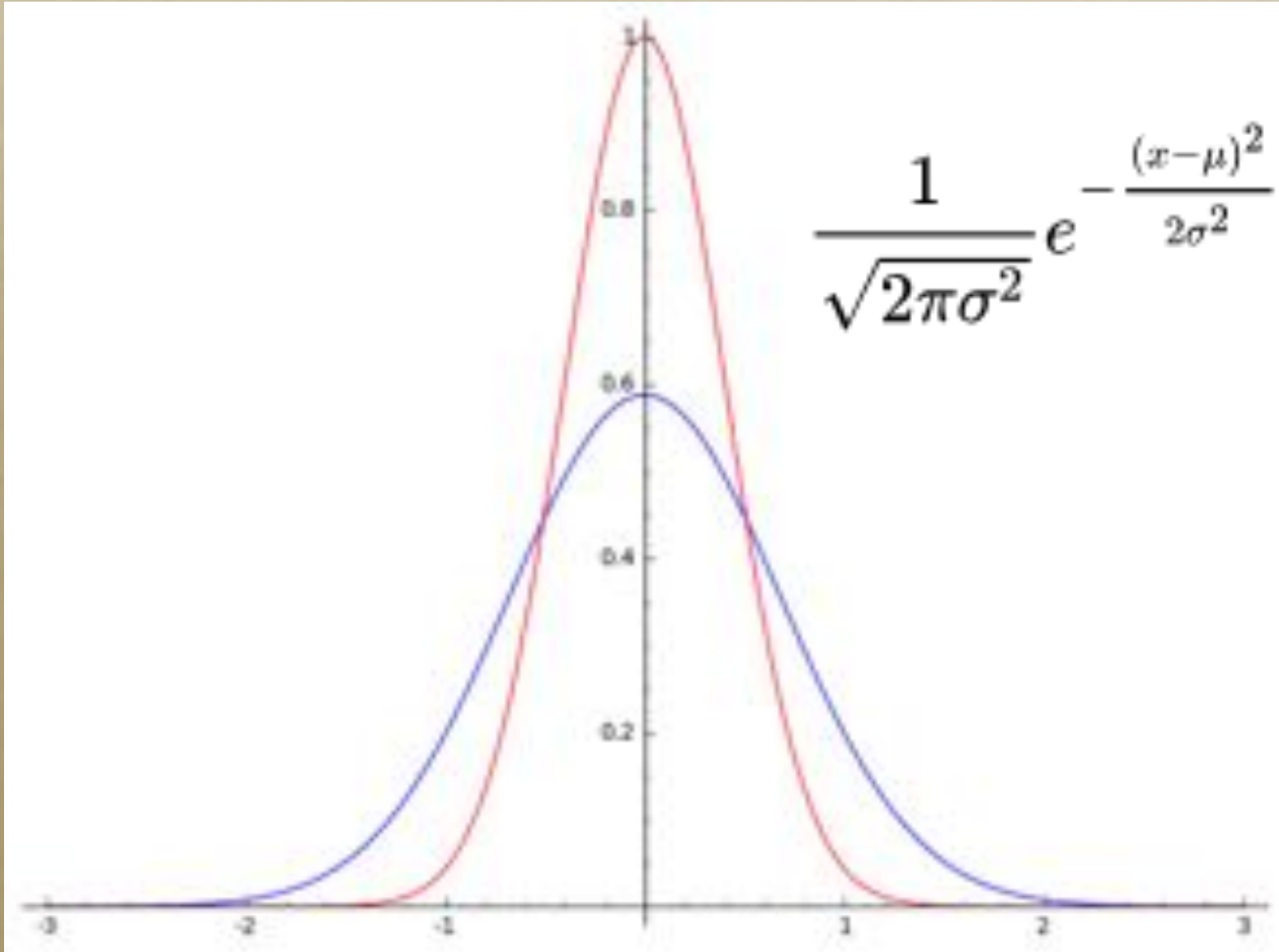


The LWE Problem:

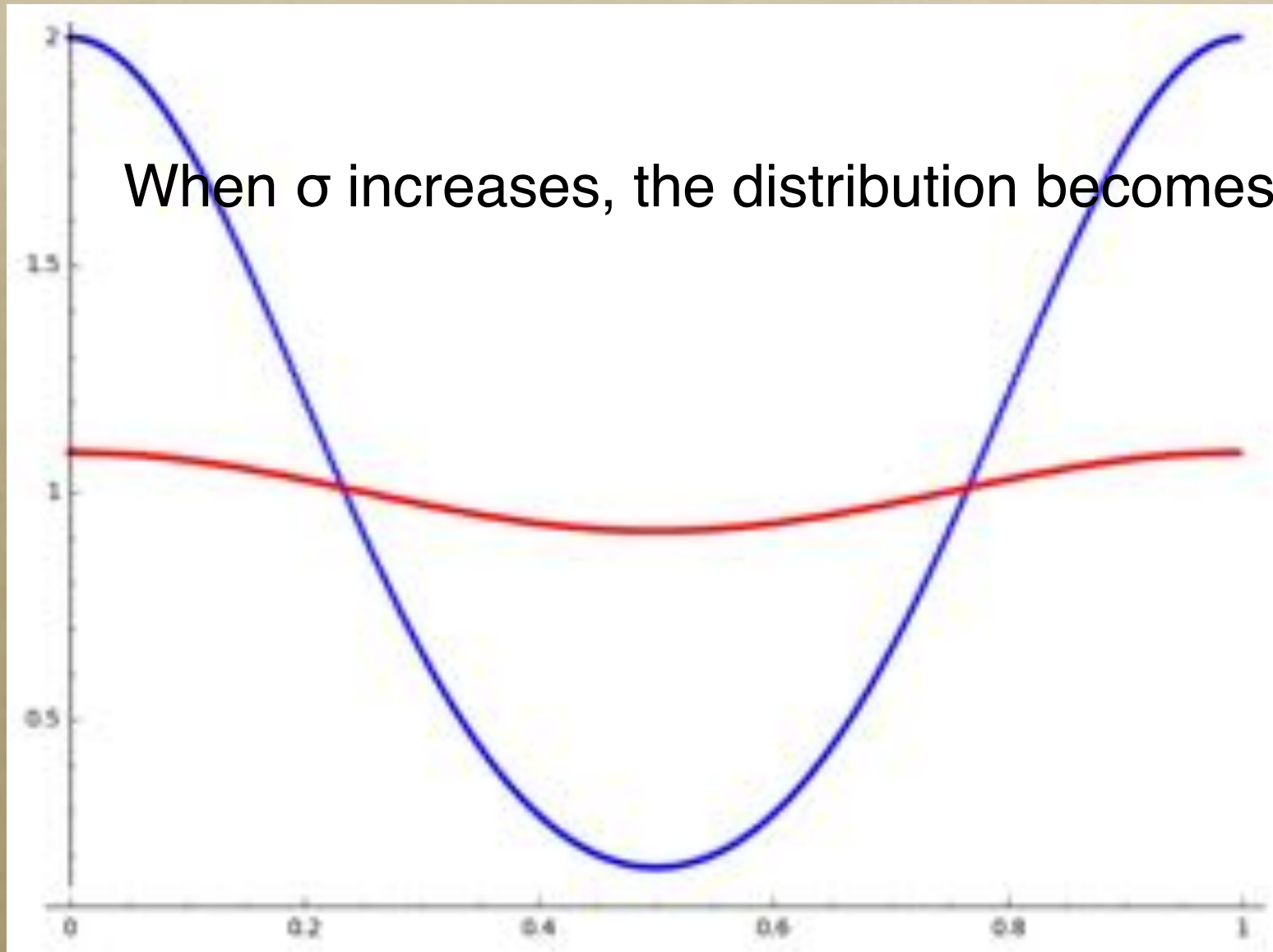
Learning (a Character) with Errors

- Let $(G,+)$ be any finite Abelian group
e.g. $G=(\mathbf{Z}/q\mathbf{Z})^n$ in [Re05].
- Pick g_1, \dots, g_m uniformly at random from G .
- Pick a random **character** s in G^\vee .
- Goal: recover **s** given g_1, \dots, g_m and **noisy** approximations of **$s(g_1), \dots, s(g_m)$** .
Ex: Gaussian noise.

Gaussian Noise over \mathbf{R}



Gaussian Noise over R/Z





Ex: Cyclic G

- Let $G = \mathbf{Z}/q\mathbf{Z}$
- Pick g_1, \dots, g_m uniformly at random mod q .
- Goal: recover $s \in \mathbf{Z}$ given g_1, \dots, g_m and randomized approximations of $sg_1 \bmod q, \dots, sg_m \bmod q$.
- This is exactly a randomized variant of Boneh–Venkatesan's **Hidden Number Problem** from CRYPTO '96.



Hardness of LWE

- [Regev05]: If one can efficiently solve LWE for $G=(\mathbf{Z}/q_n\mathbf{Z})^n$ on the average, then one can **quantum**-efficiently find short vectors in **every n-dim** lattice.
- [GINX16]: This can be generalized to any sequence (G_n) of finite abelian groups, provided that **$\#G_n$ is sufficiently large**.



A Glimpse of Worst-case to Average-case Reductions



Short Lattice Vectors: Minkowski's Inequality

- [Minkowski]: Any d -dim lattice L has at least one non-zero vector of norm \leq

$$2 \frac{\Gamma(1 + d/2)^{1/d}}{\sqrt{\pi}} \operatorname{covol}(L)^{1/d} \leq \sqrt{d} \operatorname{covol}(L)^{1/d}$$

- This is **Minkowski's inequality** on Hermite's constant:

$$\sqrt{\gamma_d} \leq \frac{2}{v_d^{1/d}} = 2 \frac{\Gamma(1 + \frac{d}{2})^{1/d}}{\sqrt{\pi}} \leq \sqrt{d}$$

Four Proofs of Minkowski's Inequality



- Blichfeldt's proof: «continuous» pigeon-hole principle.



- Minkowski's original proof: sphere packings.
- Siegel's proof: Poisson summation.
- Mordell's proof: pigeon-hole principle.

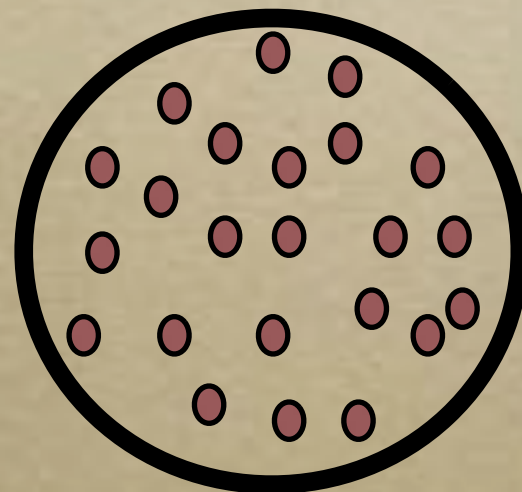
Mordell's
Proof
(1933)





Mordell's Proof (1933)

- For $q \in \mathbf{N}$, let $\bar{L} = q^{-1}L$ then $[\bar{L}:L] = q^d$.
Among $> q^d$ points v_1, \dots, v_m in \bar{L} , $\exists i \neq j$ s.t. $v_i - v_j \in L$.
- There are enough points in a **large ball** of radius r (r is close to Minkowski's bound in L , but large for \bar{L})



- We obtain a **short non-zero** point in L : $\text{norm} \leq 2r$.



Key Point

- Mordell proved the existence of short lattice vectors by using the existence of short vectors in a **special** class of **higher-dimensional integer** lattices.
 - Let distinct $v_1, \dots, v_m \in \bar{L} = q^{-1}L$.
 - Consider the integer lattice L' formed by all $(x_1, \dots, x_m) \in \mathbf{Z}^m$ s.t. $\sum_i x_i v_i \in L$.
 - If $m > q^d$, $\lambda_1(L') \leq \sqrt{2}$.



An Algorithm From Mordell's Proof

- Mordell's proof gives an (**inefficient**) algorithm:
 - Need to generate $>q^d$ lattice points in \bar{L} .
 - Among these exponentially many lattice points, find a difference in L , possibly by **exhaustive search**.
 - Both steps are expensive.



Wishful Thinking

- To apply the pigeon-hole principle, we need an exponential number m of lattice vectors in \bar{L} .
- Can we get away with a **small polynomial number m** and make the algorithm efficient?
 - Maybe if we could find short vectors in certain higher-dimensional random lattices.

Overlattices and Groups

○ If L is n -dim, $\bar{L} = q^{-1}L$ and $G = (\mathbf{Z}/q\mathbf{Z})^n$ then $\bar{L}/L \cong G$.

○ There is an **exact sequence**:

$$0 \rightarrow L \xrightarrow{1} \bar{L} \xrightarrow{\phi} G \rightarrow 0$$

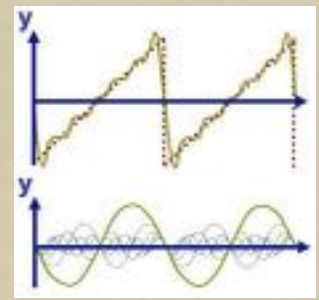
○ $L = \text{Ker } \phi$ where ϕ is efficiently computable.

○ Let $v_1, \dots, v_m \in \bar{L}$ and define $g_1, \dots, g_m \in G$ by $g_i = \phi(v_i)$.

○ If $\sum_i x_i g_i = 0$ for $(x_1, \dots, x_m) \in \mathbf{Z}^m$ then $\sum_i x_i v_i \in L$.



Fourier Analysis



- Fourier analysis shows that if $v_1, \dots, v_m \in \bar{L}$ are chosen from a **suitable (short) distribution**, $g_i = \phi(v_i)$ has uniform distribution over G .
- Any probability mass function f over \bar{L} s.t. for any $x \in \bar{L}$, $\sum_{y \in L} f(x+y) \approx 1/\#G$.
Ex: discrete Gaussian distribution.
- This is a **key step**: transforming a worst-case into an average-case.



Remember SIS

- Let $(G,+)$ be a finite Abelian group: $G=(\mathbf{Z}/q\mathbf{Z})^n$ in [Ajtai96]. View G as a \mathbf{Z} -module.
- Pick g_1, \dots, g_m uniformly at random from G .
- Goal: Find short $(x_1, \dots, x_m) \in \mathbf{Z}^m$ s.t. $\sum_i x_i g_i = 0$,
e.g. $\|x\| \leq m (\#G)^{1/m}$.
- This is essentially finding a short vector in a (uniform) **random lattice** of $L_m(G) = \{ \text{lattices } L \subseteq \mathbf{Z}^m \text{ s.t. } \mathbf{Z}^m/L \sim G \}$.



Worst-to-average Reduction from Mordell's Proof

- Sample short $v_1, \dots, v_m \in \bar{L}$ from a suitable distribution, so that $g_i = \phi(v_i)$ has uniform distrib. over $G = (\mathbf{Z}/q\mathbf{Z})^n$
- Call the SIS-oracle on (g_1, \dots, g_m) to find a short $\mathbf{x} = (x_1, \dots, x_m) \in \mathbf{Z}^m$ s.t. $\sum_i x_i g_i = 0$ in G ,
i.e. $\sum_i x_i v_i \in L$.
- Return $\sum_i x_i v_i \in L$.



Generalized SIS Reduction

- The SIS reduction is based on this crucial fact: If B is a reduced basis of a lattice L , then $q^{-1}B$ is a reduced basis of the overlattice $\bar{L}=q^{-1}L$.
- If G is an arbitrary finite Abelian group, [GINX16] finds a reduced basis of some overlattice $\bar{L} \supseteq L$ s.t. $\bar{L}/L \simeq G$, so that we can sample **short vectors** in \bar{L} .