Algorithmic problems over ideal lattices

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CNRS, université de Bordeaux

Discrete Mathematics, Codes and Cryptography eSeminar, Paris 8

(Partly based on a joint work with Guillaume Hanrot and Damien Stehlé)

Outline of the talk

Lattice problems and LWE

2 Adding algebraic structure

Algorithms for ideal-SVP

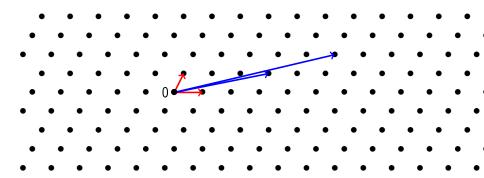
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Lattices

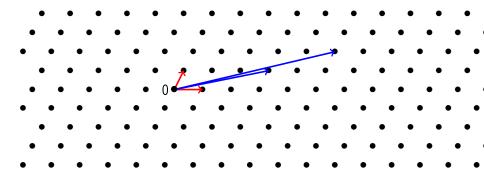


Lattice

A lattice L is a subset of \mathbb{R}^n of the form $L = \{Bx \mid x \in \mathbb{Z}^n\}$, with $B \in \mathbb{R}^{n \times n}$ invertible. B is a basis of L, and n is its rank.

$$\begin{pmatrix} 3 & 1 \\ 0 & 2 \end{pmatrix}$$
 and $\begin{pmatrix} 17 & 11 \\ 4 & 2 \end{pmatrix}$ are two bases of the above lattice.

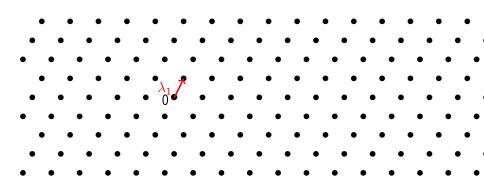
Lattices



Lattice

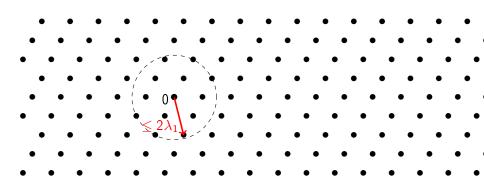
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We represent a lattice by any of its basis



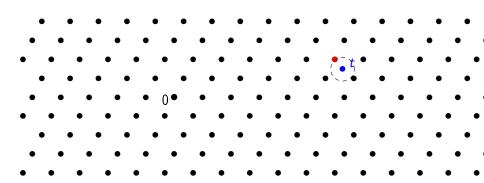
Shortest Vector Problem (SVP)

Find a shortest (in Euclidean norm) non-zero vector. Its Euclidean norm is denoted λ_1 .



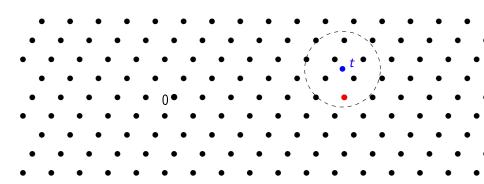
Approximate Shortest Vector Problem (approx-SVP)

Find a short (in Euclidean norm) non-zero vector. (e.g. of norm $\leq 2\lambda_1$).



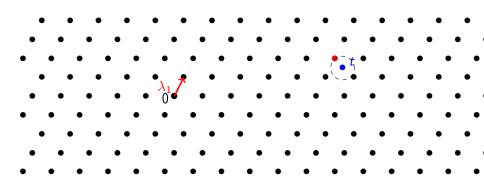
Closest Vector Problem (CVP)

Given a target point t, find a point of the lattice closest to t.



Approximate Closest Vector Problem (approx-CVP)

Given a target point t, find a point of the lattice close to t.

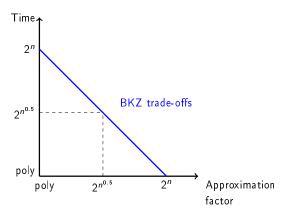


SVP and CVP are hard to solve when n increases

- even with a quantum computer
- ullet even if we allow small approximation factor $(\gamma = poly(n))$

Hardness of SVP and CVP

Best Time/Approximation trade-off for SVP, CVP (even quantumly): BKZ algorithm [Sch87,SE94]

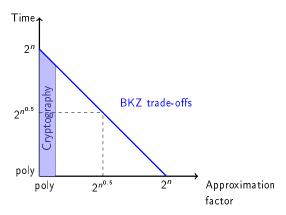


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LWE (Learning With Errors)

Sample $A \leftarrow \text{Uniform}(\mathbb{Z}_q^{n \times n}) \text{ and } S, e \leftarrow \text{Uniform}(\{-B, \dots, B\}^n)$

Given \boxed{A} and \boxed{b} , where $\boxed{b} := \boxed{A} \boxed{s} + \boxed{e} \mod q$

Recover s or e

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$$L = \{ x \in \mathbb{Z}^n \mid \exists s \in \mathbb{Z}^n, As = x \bmod q \}$$

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where $v \in L$ and e small

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LWE \approx CVP in L





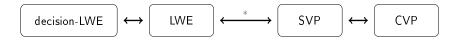
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Advantages of LWE over SVP/CVP:

problem hard on average

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Advantages of LWE over SVP/CVP:

- problem hard on average
- decision variant as hard as the search variant

Not completely exact: it should be LWE \leftrightarrow SIVP (= short independent vectors problem)

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Why: to improve efficiency of cryptographic schemes

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How: use structured matrices

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non structured matrix

- storage: n^2
- matrix \times vector : $O(n^2)$

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non structured matrix

• storage:
$$n^2$$

• matrix
$$\times$$
 vector : $O(n^2)$

$$\begin{pmatrix} a_1 & -a_n & \cdots & -a_2 \\ a_2 & a_1 & \cdots & -a_3 \\ \vdots & \vdots & \ddots & \vdots \\ a_n & a_{n-1} & \cdots & a_1 \end{pmatrix}$$

structured matrix

- storage: n
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SVP + structure = ideal-SVP

Definition

An ideal lattice is a lattice which has a basis (in columns) of the form

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Why is it called an ideal lattice?

Some definitions

Notation

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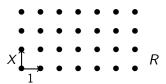
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- Units: $R^{\times} = \{a \in R \mid \exists b \in R, ab = 1\}$ • e.g. $\mathbb{Z}^{\times} = \{-1, 1\}$
- Principal ideals: $\langle g \rangle = \{ gr \mid r \in R \}$ (i.e. all multiples of g)
 - e.g. $\langle 2 \rangle = \{ \text{even numbers} \} \text{ in } \mathbb{Z}$
 - g is called a generator of $\langle g \rangle$
 - ▶ The generators of $\langle g \rangle$ are exactly the ug for $u \in R^{\times}$

$$R \simeq \mathbb{Z}^n$$

$$R = \mathbb{Z}[X]/(X^{n} + 1) \to \mathbb{Z}^{n}$$

$$r = r_{0} + r_{1}X + \dots + r_{n-1}X^{n-1} \mapsto (r_{0}, r_{1}, \dots, r_{n-1})$$

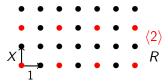


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$\langle g \rangle$ is an ideal lattice

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LWE + structure = Ring-LWE

LWE

$$\begin{pmatrix} a_{1,1} & \cdots & a_{1,n} \\ \vdots & \ddots & \vdots \\ a_{n,1} & \cdots & a_{n,n} \end{pmatrix} \begin{pmatrix} s_1 \\ \vdots \\ s_n \end{pmatrix} + \begin{pmatrix} e_1 \\ \vdots \\ e_n \end{pmatrix}$$

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Ring-LWE

(more exactly Poly-LWE)

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$$= a(X) \cdot s(X) + e(X) \in R$$

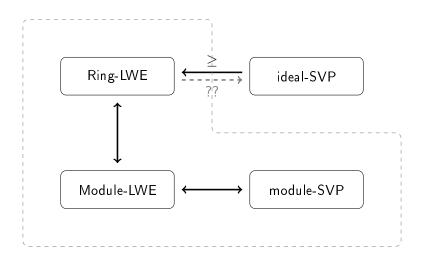
$$R = \mathbb{Z}[X]/(X^n + 1)$$

 $a(X) := \sum_i a_i X^i, \quad s(X) := \sum_i s_i X^i, \quad e(X) := \sum_i e_i X^i \in R$

Ring-LWE vs ideal-SVP

$$\frac{\geq}{\text{Ring-LWE}} \stackrel{\text{ideal-SVP}}{\stackrel{??}{\longrightarrow}}$$

Ring-LWE vs ideal-SVP



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The problem to solve

ideal-SVP

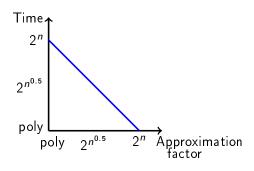
Given a basis of a principal ideal $\langle g \rangle$ and $\alpha \in (0, 1]$, Find $r \in \langle g \rangle$ such that $||r|| \leq 2^{n^{\alpha}} \cdot \lambda_1$.

The problem to solve

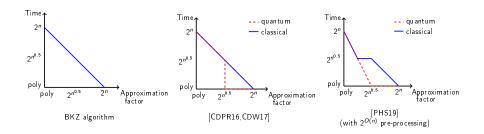
ideal-SVP

Given a basis of a principal ideal $\langle g \rangle$ and $\alpha \in (0, 1]$, Find $r \in \langle g \rangle$ such that $||r|| \leq 2^{n^{\alpha}} \cdot \lambda_1$.

BKZ algorithm can do it in time $2^{O(n^{1-\alpha})}$, can we do better (using the structure)?



Known algorithms for ideal-SVP

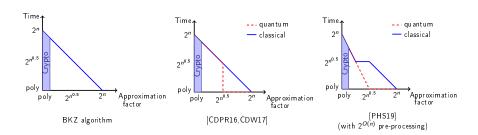


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Known algorithms for ideal-SVP



Ring-LWE is not broken:

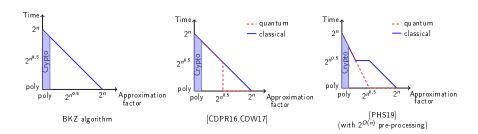
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Known algorithms for ideal-SVP



Ring-LWE is not broken:

- Standard parameters of Ring-LWE are too small for the algorithms
- We don't know how to use an ideal-SVP solver to break Ring-LWE

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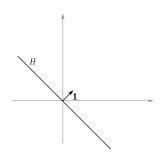
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Main ideas of the ideal-SVP algorithms

 $\mathsf{Log}: R \to \mathbb{R}^n$ (somehow generalising log to R)

Let
$$1=(1,\cdots,1)$$
 and $H=1^{\perp}$.



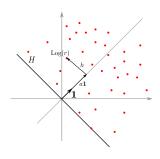
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Properties

Log r = h + a1, with $h \in H$

a ≥ 0



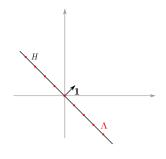
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- a > 0
- a = 0 iff r is a unit
- $\Lambda := \text{Log}(R^{\times})$ is a lattice



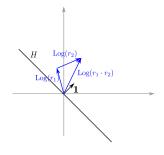
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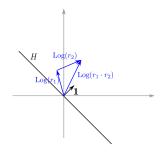
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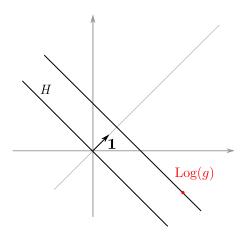
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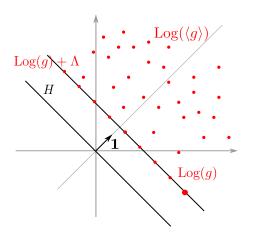
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- $||r|| \simeq 2^{||\operatorname{Log} r||_{\infty}}$



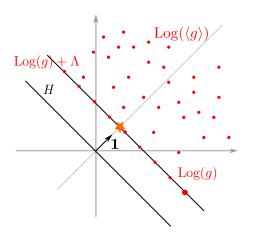
What does $Log\langle g \rangle$ look like?



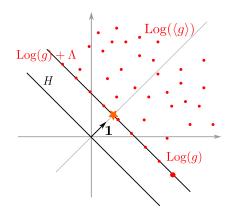
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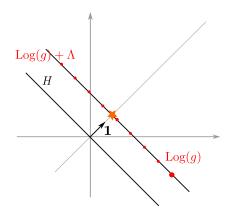


Objective: Find a point • as close as possible from \star



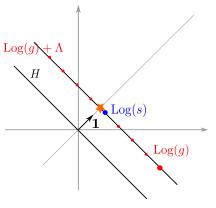
[CGS14]: P. Campbell, M. Groves, and D. Shepherd. Soliloguy: A cautionary tale.

Idea: Only keep the points of $Log(g) + \Lambda$



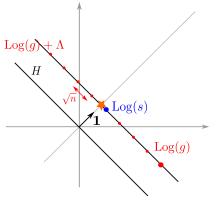
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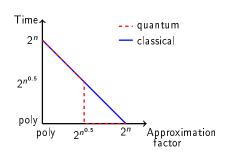
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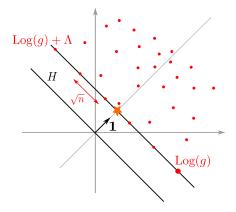


- \bullet Λ is a nice lattice
 - Poly time to recover the closest point Log(s)
- Distance \sqrt{n} between points of Λ
 - approx factor \sqrt{n} in Log space
 - approx factor $2\sqrt{n}$ in real space

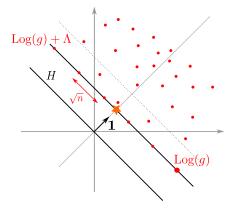
Idea: Only keep the points of $Log(g) + \Lambda$



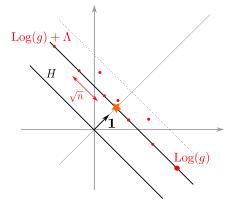
- \bullet Λ is a nice lattice
 - Poly time to recover the closest point Log(s)
- Distance \sqrt{n} between points of Λ
 - ightharpoonup approx factor \sqrt{n} in Log space
 - approx factor $2^{\sqrt{n}}$ in real space



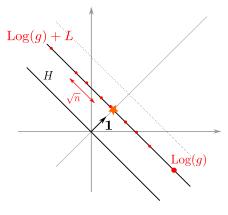
Idea: Keep more points



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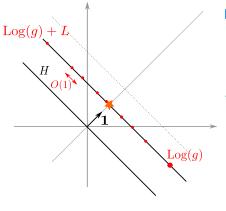


Idea: Keep more points



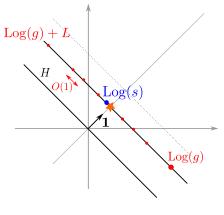
- Project the points on Log(g) + H
 - ▶ shifted lattice Log(g) + L

Idea: Keep more points



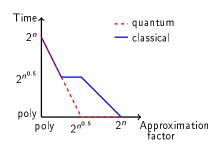
- Project the points on Log(g) + H
 - ▶ shifted lattice Log(g) + L
- + Distance O(1) between points of L
 - ► approx factor O(1)

Idea: Keep more points



- Project the points on Log(g) + H
 - ▶ shifted lattice Log(g) + L
- + Distance O(1) between points of L
 - ► approx factor O(1)
- L is not a nice lattice
 - cannot find close point Log(s) efficiently
 - can pre-process L to improve efficiency

Idea: Keep more points



- Project the points on Log(g) + H
 - ▶ shifted lattice Log(g) + L
- + Distance O(1) between points of L
 - ▶ approx factor *O*(1)
- L is not a nice lattice
 - cannot find close point Log(s) efficiently
 - can pre-process L to improve efficiency

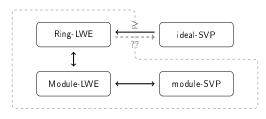
Conclusion

Some open problems

• Are there number fields in which ideal-SVP is significantly easier?

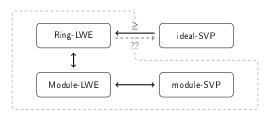
Some open problems

- Are there number fields in which ideal-SVP is significantly easier?
- Is there a gap between ideal-SVP and Ring-LWE?



Some open problems

- Are there number fields in which ideal-SVP is significantly easier?
- Is there a gap between ideal-SVP and Ring-LWE?



Questions?