

ON THE HARDNESS OF THE MODULE LEARNING WITH ERRORS PROBLEM

Adeline Roux-Langlois

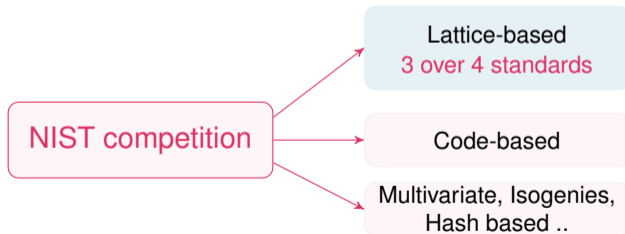
Normandie Univ, UNICAEN, ENSICAEN, CNRS, GREYC, Caen, FRANCE



Context in public key cryptography

→ Need for alternatives

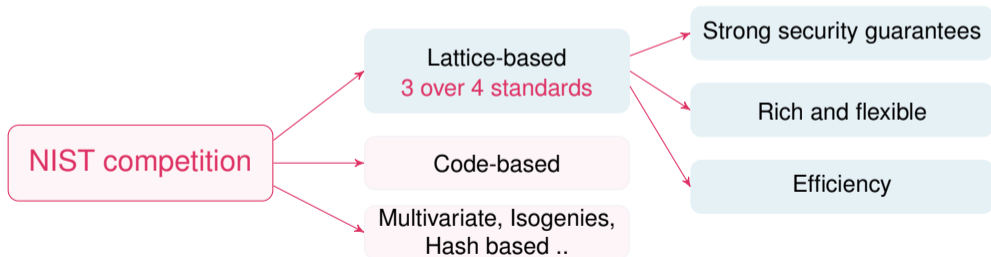
- ▶ Post-quantum secure,
- ▶ Efficient,
- ▶ New functionalities, different types of constructions.

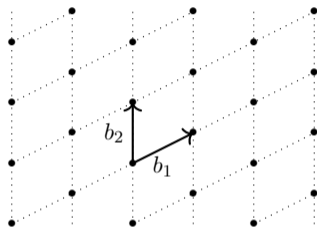


Context in public key cryptography

→ Need for alternatives

- ▶ Post-quantum secure,
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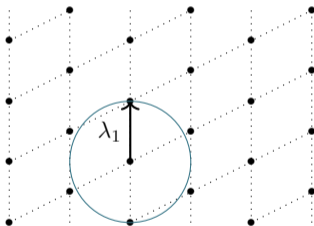
Lattice

$\mathcal{L}(\mathbf{B}) = \{ \sum_{i=1}^n a_i \mathbf{b}_i, a_i \in \mathbb{Z} \}$, where the $(\mathbf{b}_i)_{1 \leq i \leq n}$'s, linearly independent vectors, are a **basis** of $\mathcal{L}(\mathbf{B})$.

Shortest Vector Problem (SVP)

Given a lattice $\mathcal{L}(\mathbf{B})$ of dimension n :

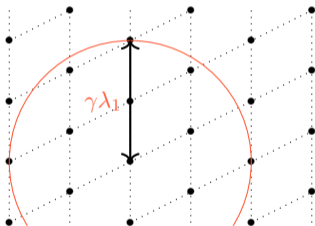
Output: find the shortest non-zero vector $\mathbf{x} \in \mathcal{L}(\mathbf{B})$.



Approx Shortest Vector Problem (Approx SVP $_{\gamma}$)

Given a lattice $\mathcal{L}(\mathbf{B})$ of dimension n :

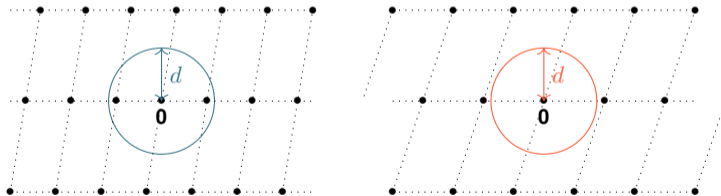
Output: find a non-zero vector $\mathbf{x} \in \mathcal{L}(\mathbf{B})$ such that $\|\mathbf{x}\| \leq \gamma \lambda_1(\mathcal{L}(\mathbf{B}))$



Gap Shortest Vector Problem (GapSVP)

Given a lattice $\mathcal{L}(\mathbf{B})$ of dimension n and $d > 0$:

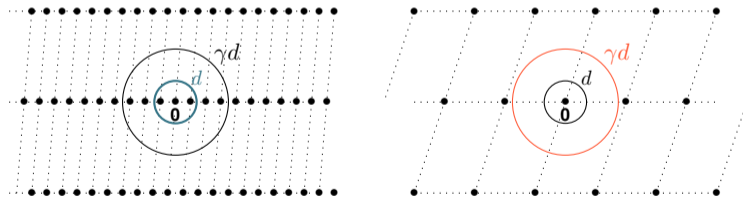
- Output:
- **YES**: there is $\mathbf{z} \in \mathcal{L}(\mathbf{B})$ non-zero such that $\|\mathbf{z}\| < d$,
 - **NO**: for all non-zero vectors $\mathbf{z} \in \mathcal{L}(\mathbf{B})$: $\|\mathbf{z}\| \geq d$.



Gap Shortest Vector Problem (GapSVP $_{\gamma}$)

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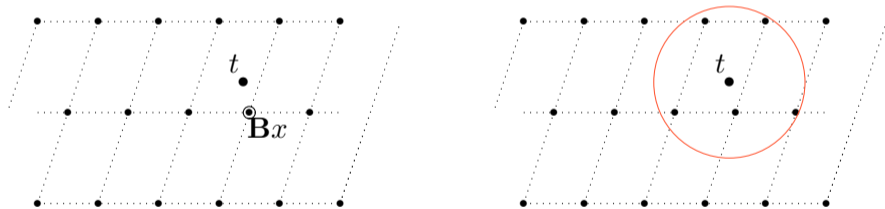


Closest Vector Problem

Given a lattice $\mathcal{L}(\mathbf{B})$ of dimension n and $\mathbf{t} \in \mathbb{Z}^m$:

Output: find $\mathbf{x} \in \mathbb{Z}^n$ minimizing $\|\mathbf{B}\mathbf{x} - \mathbf{t}\|$.

Approx variant: find $\mathbf{x} \in \mathbb{Z}^n$ such that $\|\mathbf{B}\mathbf{x} - \mathbf{t}\| \leq \gamma \cdot \text{dist}(\mathbf{t}, \Lambda(\mathbf{B}))$.

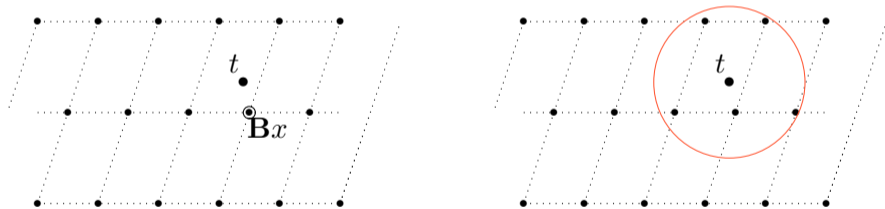


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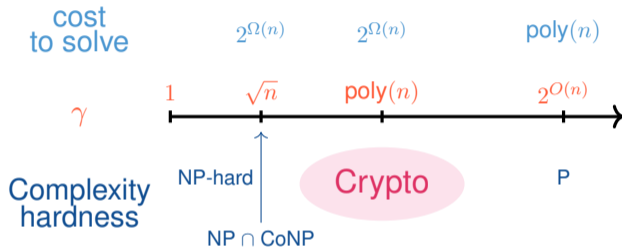
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Approx variant: find $\mathbf{x} \in \mathbb{Z}^n$ such that $\|\mathbf{B}\mathbf{x} - \mathbf{t}\| \leq \gamma \cdot \text{dist}(\mathbf{t}, \Lambda(\mathbf{B}))$.



How hard is it to solve those problems?

Hardness of Approx SVP $_{\gamma}$



Conjecture

There is no polynomial time algorithm that approximates this lattice problem and its variants to within polynomial factors.

At the heart of lattice-based cryptography

the Learning With Errors problem

- ▶ Introduced by Regev in 2005

Problem: solve a linear system with noise.

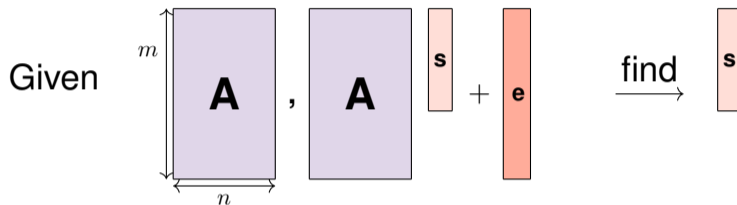
Find $(s_1, s_2, s_3, s_4, s_5)$ such that:

$$\begin{aligned}s_1 + 22s_2 + 17s_3 + 2s_4 + s_5 &\approx 16 \pmod{23} \\3s_1 + 2s_2 + 11s_3 + 7s_4 + 8s_5 &\approx 17 \pmod{23} \\15s_1 + 13s_2 + 10s_3 + 3s_4 + 5s_5 &\approx 3 \pmod{23} \\17s_1 + 11s_2 + 20s_3 + 9s_4 + 3s_5 &\approx 8 \pmod{23} \\2s_1 + 14s_2 + 13s_3 + 6s_4 + 7s_5 &\approx 9 \pmod{23} \\4s_1 + 21s_2 + 9s_3 + 5s_4 + s_5 &\approx 18 \pmod{23} \\11s_1 + 12s_2 + 5s_3 + s_4 + 9s_5 &\approx 7 \pmod{23}\end{aligned}$$

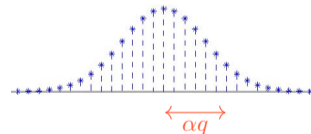
↪ With an arbitrary number of equations.

The Learning With Errors problem

LWE_q^n



- ▶ $\mathbf{A} \leftarrow U(\mathbb{Z}_q^{m \times n})$,
- ▶ $\mathbf{s} \leftarrow U(\mathbb{Z}_q^n)$,
- ▶ e small compared to q .



Discrete Gaussian error $D_{\mathbb{Z}, \alpha q}$

Search version: Given $(\mathbf{A}, \mathbf{b} = \mathbf{A}\mathbf{s} + \mathbf{e})$, find \mathbf{s} .

Decision version: Distinguish from (\mathbf{A}, \mathbf{b}) with \mathbf{b} uniform.

Solving LWE

- ▶ Exhaustive search
 - ▶ Try all the $\mathbf{s} \in \mathbb{Z}_q^n \rightarrow$ is $\mathbf{b} - \mathbf{A}\mathbf{s}$ small?
 - ▶ \Rightarrow cost around q^n .

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 - ▶ Other possibility: guess the n first errors, find $\mathbf{s} \rightarrow$ is $\mathbf{b} - \mathbf{A}\mathbf{s}$ small?
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 - ▶ \Rightarrow cost around $(\alpha q \sqrt{n})^n$.
- ▶ How to do better?
 - ▶ LWE is a lattice problem: consider

$$\Lambda_q(\mathbf{A}) = \{\mathbf{y} \in \mathbb{Z}^m : \mathbf{y} = \mathbf{As} \bmod q \text{ for } \mathbf{s} \in \mathbb{Z}^n\}.$$

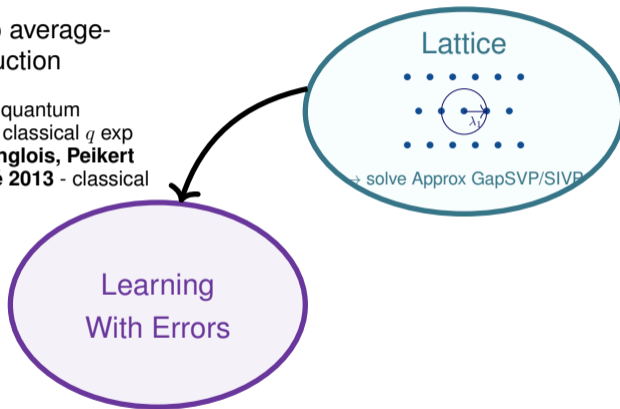
Solving LWE \Leftrightarrow solving CVP in this lattice.

- ▶ Cost: $\left(\frac{n \log q}{\log^2 \alpha}\right)^{\frac{n \log q}{\log^2 \alpha}}$.

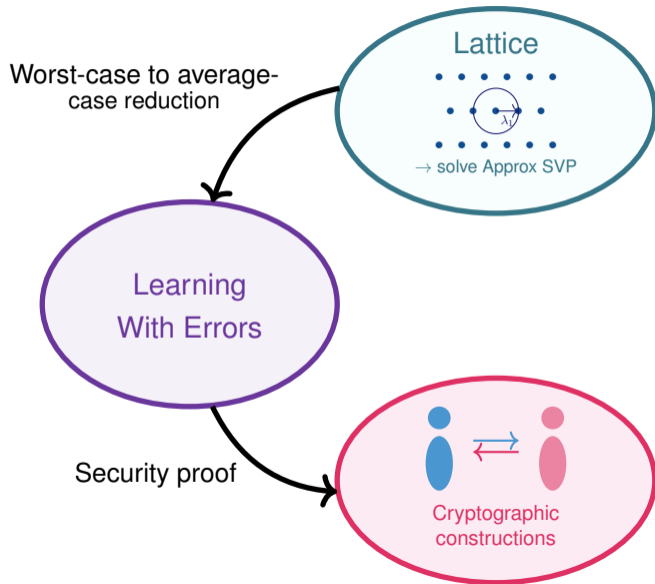
Hardness of the Learning With Errors problem

Worst-case to average-case reduction

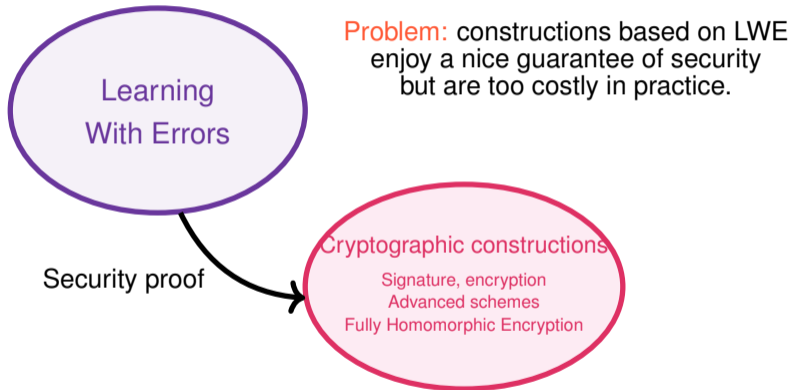
- **Regev 2005** - quantum
- **Peikert 2009** - classical q exp
- **Brakerski, Langlois, Peikert**
Regev, Stehlé 2013 - classical



Using LWE to build provable constructions - theory



Hardness of LWE used as a foundation for many constructions.



Solutions used today?

Among the 5 lattice-based finalists, 3 of them are based on (possibly structured) variants of LWE.

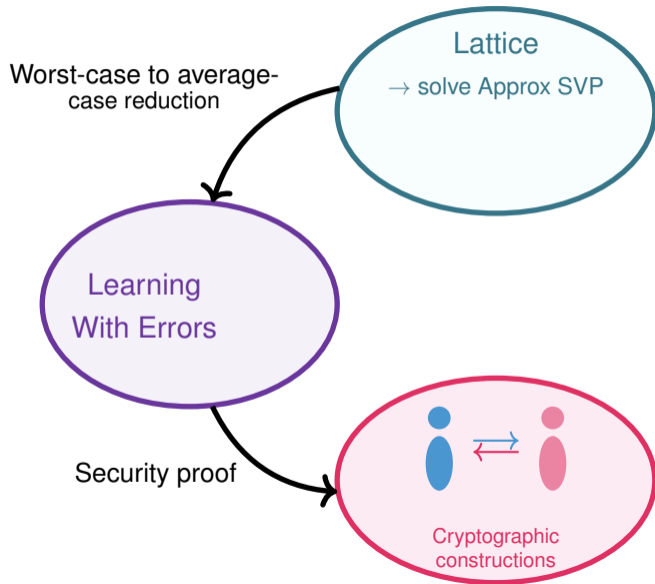
- ▶ Public Key Encryption

- ▶ **Crystals - Kyber**: Module-LWE with both secret and noise chosen from a centered binomial distribution.
- ▶ **Saber**: Module-LWR (deterministic variant).
- ▶ **NTRU**
- ▶ **FrodoKEM** (as alternate candidate): LWE but with smaller parameters.

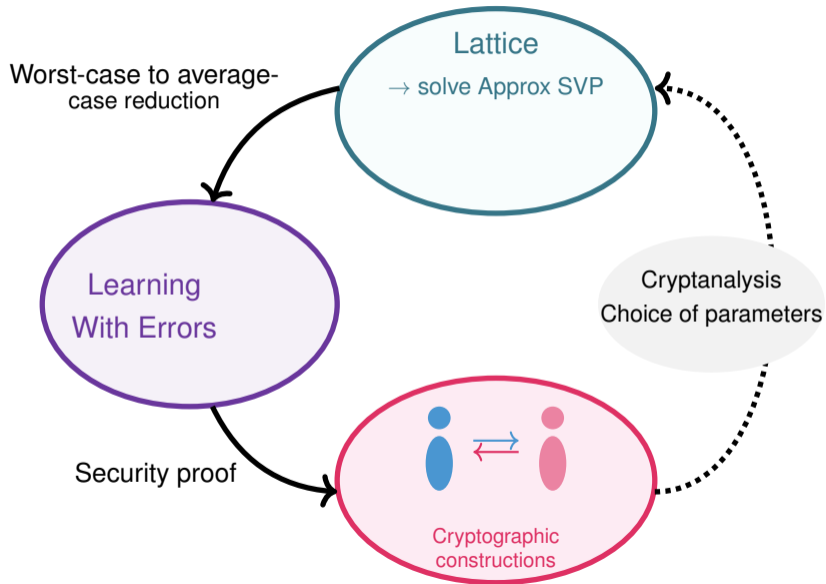
- ▶ Signature

- ▶ **Crystals - Dilithium**: Module-LWE with both secret and noise chosen in a small uniform interval, and Module-SIS.
- ▶ **Falcon**: Ring-SIS on NTRU matrices.

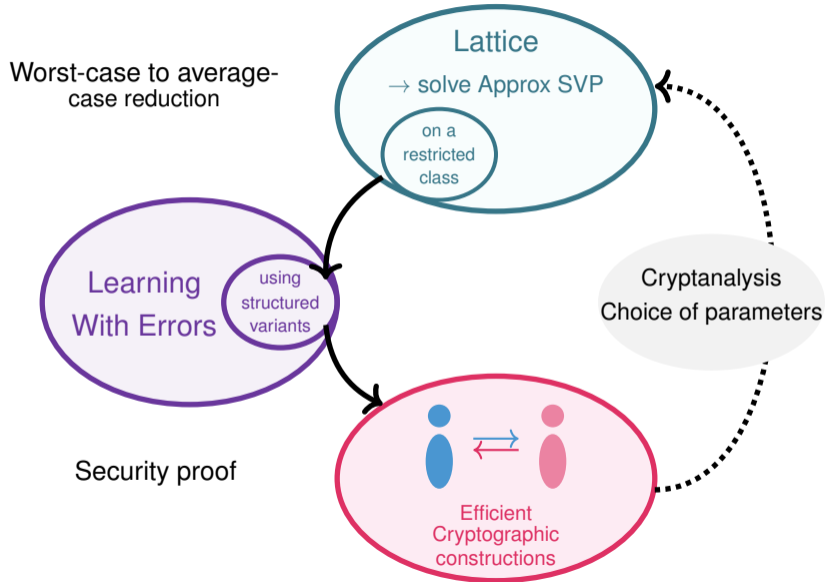
Using LWE to build constructions



Using LWE to build constructions in practice



Using LWE to build constructions in practice

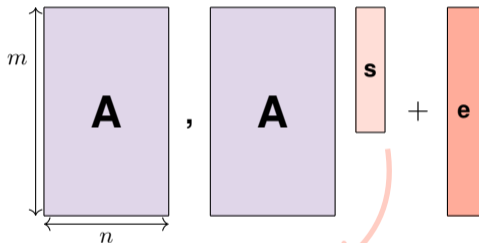


→ A better understanding of the underlying hardness hypothesis to reduce the gap between what is proven and what is used in practice

- ▶ Hardness of LWE variants
 - ▶ Using the Rényi divergence in reductions.
- ▶ Recent results on the hardness of Module-LWE
 - ▶ Binary (bounded) secret,
 - ▶ Classical hardness,
 - ▶ Entropic secret.

Choose another distribution for the secret or the error.

Regev 2009: uniform secret and gaussian error.



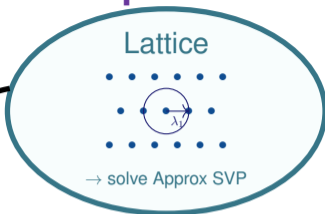
- ▶ Gaussian (continue, discretize, discrete ...),
- ▶ Uniform in small interval,
- ▶ Binary under conditions.

- ▶ Same distribution as the error: in particular Gaussian,
- ▶ Binary (Unif in $\{0, 1\}^n$),
- ▶ Entropic.

Hardness of the Learning With Errors problem

Worst-case to average-case reduction

- **Regev 2005** - quantum
- **Peikert 2009** - classical q exp
- **Brakerski, Langlois, Peikert Regev, Stehlé 2013** - classical



- **Peikert 2010** - discrete Gaussian noise
- **Döttling, Müller-Quade 2013** - small uniform
- **Micciancio, Peikert 2013** - small uniform and binary noise
- **Our result 2015** - small uniform, dimension preserving

Self reductions

- **Applebaum, Cash, Peikert, Sahai 2009** - same error and secret
- **Goldwasser, Kalai, Peikert, Vaikuntanathan 2010** - binary secret
- **Brakerski, Langlois, Peikert, Regev, Stehlé 2013** - binary secret
- **Micciancio 2018** - binary secret
- **Brakerski, Döttling 2020** - entropic secret

Using the Rényi divergence

with S. Bai, T. Lepoint, D. Stehlé, R. Steinfeld and A. Sakzad

- Introduction of RD in security proofs as a measure of distribution closeness,

Let D_1, D_2 be two discrete probability distributions.

Statistical distance

$$\Delta(D_1, D_2) = \frac{1}{2} \sum_{x \in \text{Supp}(D_1)} |D_1(x) - D_2(x)|,$$

Rényi divergence

$$R_2(D_1, D_2) = \sum_{x \in \text{Supp}(D_1)} \frac{D_1(x)^2}{D_2(x)}.$$

Both fulfill the **probability preservation property** for an event E :

$$\begin{aligned} D_1(E) - \Delta(D_1, D_2) &\leq D_2(E) && \text{(additive)} \\ D_1(E)^2 / R_2(D_1, D_2) &\leq D_2(E) && \text{(multiplicative)} \end{aligned}$$

Reduction using the Rényi divergence

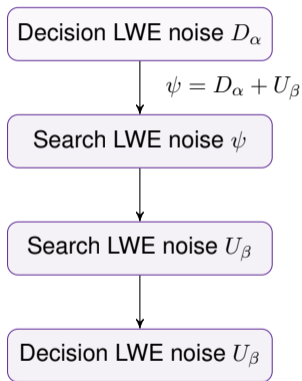
Reduction from LWE_{ψ_2} (with error ψ_2) to LWE_{ψ_1} (with error ψ_1).

Idea: show that if an adversary can solve LWE_{ψ_1} with a probability of success ε_1 *non negligible*, then he can solve LWE_{ψ_2} with a probability ε_2 non negligible.

Using the probability preservation property, we have that:

$$\begin{aligned}\varepsilon_2 &\geq \varepsilon_1 - \Delta(\psi_1, \psi_2) &\Rightarrow & \Delta(\psi_1, \psi_2) \text{ negligible} \\ \varepsilon_2 &\geq \varepsilon_1^2 / R_2(\psi_1, \psi_2) &\Rightarrow & R_2(\psi_1, \psi_2) \text{ constant}\end{aligned}$$

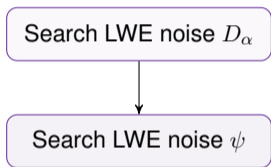
Note that Rényi Divergence only works for search problems.



- ▶ Quite direct by adding samples, then decision-to-search reduction. With $(\mathbf{A}, \mathbf{b} = \mathbf{A}\mathbf{s} + \mathbf{e})$ with $\mathbf{e} \leftarrow D_\alpha$, compute $(\mathbf{A}, \mathbf{b} + \mathbf{e}')$ with $\mathbf{e}' \leftarrow U_\beta$,
- ▶ Using that the Rényi divergence $R_2(U_\beta || \psi)$ can be bounded by $1 + 1.05 \cdot \frac{\alpha}{\beta}$.
- ▶ Using **Micciancio Mol 11** sample preserving search-to-decision reduction (needs prime q).

More general result

Using the Rényi divergence, we have a reduction:



- ▶ Either $R_2(\psi || D_\alpha)$ is small,
- ▶ Either $R_2(\psi || \psi + D_\alpha)$ is small.

- ▶ Works nicely if the two distributions are close enough,
- ▶ Only needs to compute R_2 ,
- ▶ Distributions may be too far from each other (example: binary).

→ A better understanding of the underlying hardness hypothesis to reduce the gap between what is proven and what is used in practice

- ▶ Hardness of LWE variants
 - ▶ Using the Rényi divergence in reductions.

- ▶ Recent results on the hardness of Module-LWE
 - ▶ Binary (bounded) secret,
 - ▶ Classical hardness,
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Idea: replace \mathbb{Z}^n by $R = \mathbb{Z}[x]/\langle x^n + 1 \rangle$

where $n = 2^k$ then the polynomial $x^n + 1$ is irreducible.
Elements of this ring are polynomials of degree less than n .

R is isomorph to \mathbb{Z}^n

Let $a \in R$, we have $a(x) = a_0 + a_1x + \dots + a_{n-1}x^{n-1}$,
the isomorphism $R \rightarrow \mathbb{Z}^n$ associate

the polynomial $a \in R$ to the vector $\mathbf{a} = \begin{bmatrix} a_0 \\ a_1 \\ \vdots \\ a_{n-1} \end{bmatrix} \in \mathbb{Z}^n$.

Idea: replace \mathbb{Z}^n by $R = \mathbb{Z}[x]/\langle x^n + 1 \rangle$

Let's look at the product of two polynomials $x^n + 1$

▶ $a(x) = a_0 + a_1 \cdot x + \dots + a_{n-1} \cdot x^{n-1}$

▶ $s(x) = s_0 + a_1 \cdot x + \dots + a_{n-1} \cdot x^{n-1}$

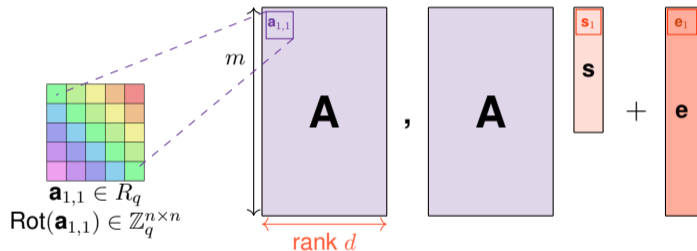
Using matrices, it gives the following block:

$$\begin{bmatrix} a_0 & -a_{n-1} & \cdots & -a_2 & -a_1 \\ a_1 & a_0 & \cdots & -a_3 & -a_2 \\ \vdots & \vdots & \ddots & \vdots & \vdots \\ a_{n-2} & a_{n-3} & \cdots & a_0 & -a_{n-1} \\ a_{n-1} & a_{n-2} & \cdots & a_1 & a_0 \end{bmatrix} \begin{bmatrix} s_0 \\ s_1 \\ \vdots \\ s_{n-2} \\ s_{n-1} \end{bmatrix}$$

Module LWE

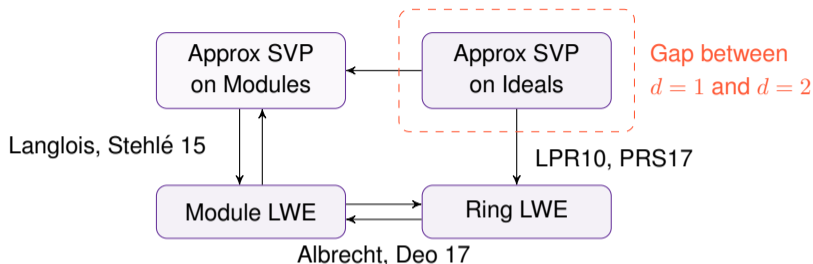
Let K be a number field of degree n with R its ring of integers.
 Think of K as $\mathbb{Q}[x]/(x^n + 1)$ and of R as $\mathbb{Z}[x]/(x^n + 1)$ for $n = 2^k$.

Replace \mathbb{Z} by R , and \mathbb{Z}_q by $R_q = R/qR$.



- ▶ $\mathbf{A} \leftarrow U(R_q^{m \times d})$,
- ▶ $\mathbf{s} \leftarrow U(R_q^d)$,
- ▶ $e \in R^m$ small compared to q .

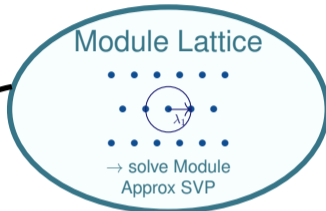
Special case $d = 1$
 is Ring-LWE



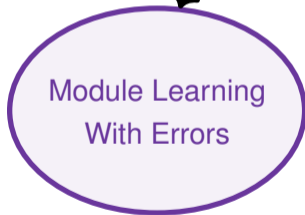
- ▶ Choice of parameters
 - ▶ $R_q = \mathbb{Z}_q[x]/\langle x^n + 1 \rangle$: constraints on parameters $n = 2^k$, $q = 1 \pmod{2n} \dots$
- ▶ An example of parameters set of a signature:
 - ▶ $n = 512 \Rightarrow 60$ bits of security,
 - ▶ $n = 1024 \Rightarrow 140$ bits of security,
 - ▶ $(n = 256, d = 3)$ gives $nd = 768$ which is "in between".
- ▶ **Module LWE allows more flexibility.**

Worst-case to average-
case reduction

- **Langlois Stehlé 2015** - quantum, q poly
- Folklore: adapting **Peikert 2009** gives classical reduction but q exp and only search variant



An R -module M of rank d defines via the canonical embedding $\sigma : K \rightarrow \mathbb{R}^n$ a module lattice $\sigma(M) \in \mathbb{R}^{nd}$



Self reductions

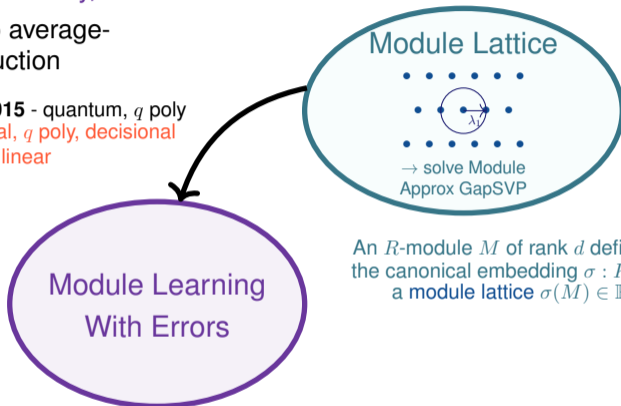
- **Applebaum, Cash, Peikert, Sahai 2009** - same error and secret

Hardness of Module Learning With Errors problem

with K. Boudgoust, C. Jeudy, W. Wen

Worst-case to average-
case reduction

- **Langlois Stehlé 2015** - quantum, q poly
- **Our result**: classical, q poly, decisional
but rank linear



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Self reductions

- **Applebaum, Cash, Peikert, Sahai 2009** - same error and secret
- **Our results 20 & 21**: binary secret, rank increase
- **Our result 2023**: η -bounded secret

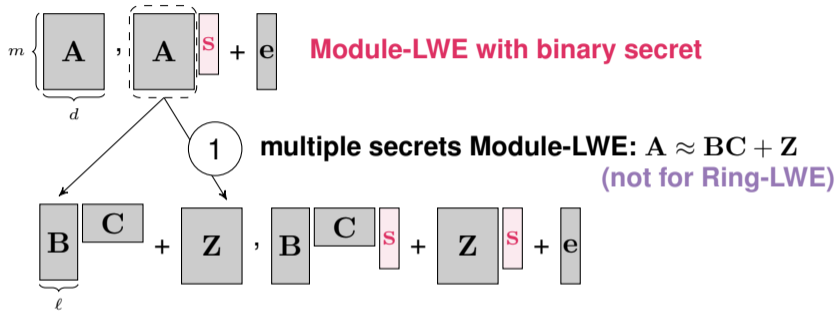
Hardness of binary Module-LWE

The secret $\mathbf{s} \in R_2^d$ is binary and the secret $\hat{\mathbf{s}} \in R_q^\ell$ is modulo q .

$$m \left\{ \underbrace{\mathbf{A}}_d \right\}, \mathbf{A} \mathbf{s} + \mathbf{e} \quad \text{Module-LWE with binary secret}$$

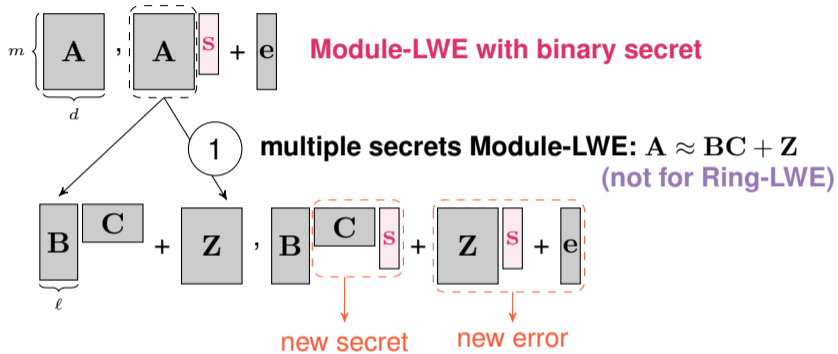
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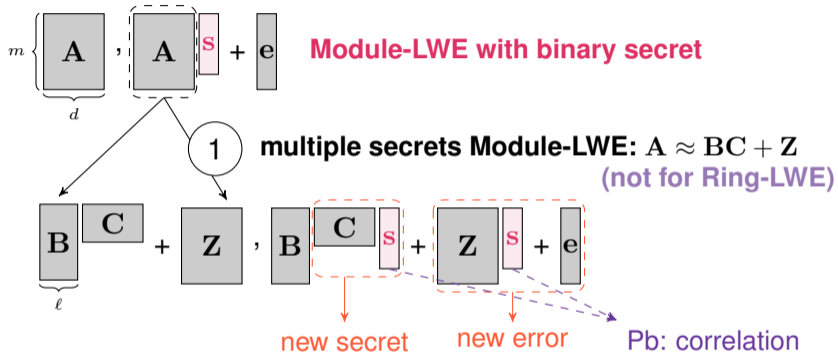
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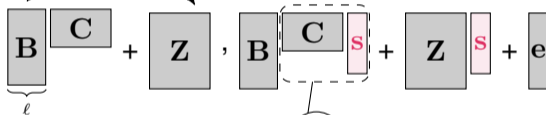


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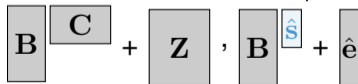


multiple secrets Module-LWE: $\mathbf{A} \approx \mathbf{B}\mathbf{C} + \mathbf{Z}$
 (not for Ring-LWE)



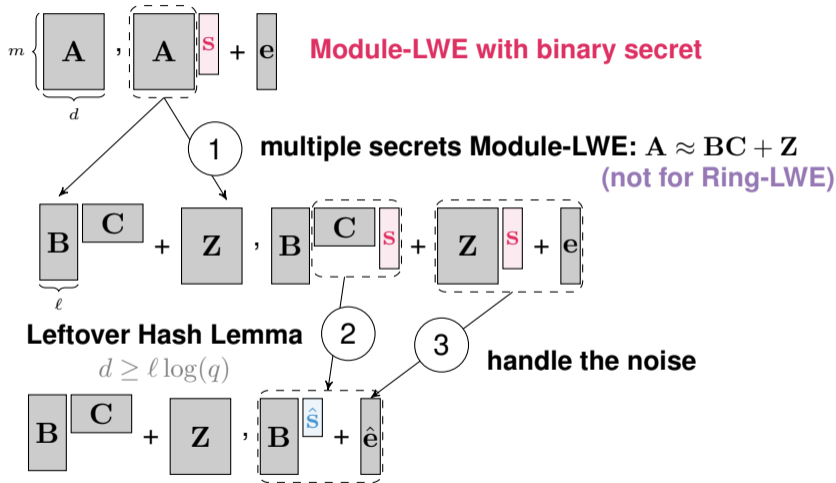
Leftover Hash Lemma

$$d \geq \ell \log(q)$$



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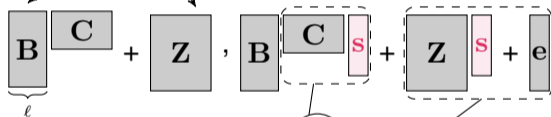
Module-LWE with uniform secret

Hardness of binary Module-LWE

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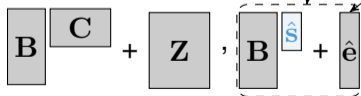


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(not for Ring-LWE)



Leftover Hash Lemma

$$d \geq \ell \log(q)$$



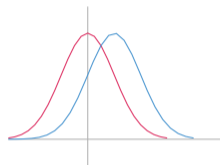
Module-LWE with uniform secret

3 **handle the noise**

- [GKPV10] noise flooding

1. Using Rényi divergence
2. Using Extended Module-LWE
additional hint \mathbf{Z} s

Using the Rényi divergence in the reduction



Example: two Gaussians D_β and $D_{\beta,c}$,

$$R_2(D_\beta, D_{\beta,c}) = \exp\left(\frac{2\pi\|c\|^2}{\beta^2}\right)$$

$$\Delta(D_\beta, D_{\beta,c}) = \frac{\sqrt{2\pi}\|c\|}{\beta}$$

With $\|c\| \leq \alpha$

$$\Delta(D_\beta, D_{\beta,c}) = \frac{\sqrt{2\pi}\|c\|}{\beta} \Rightarrow \alpha/\beta \leq \text{negligible}$$

$$R_2(D_\beta, D_{\beta,c}) = \exp\left(\frac{2\pi\|c\|^2}{\beta^2}\right) \approx 1 + \frac{2\pi\|c\|^2}{\beta^2} \Rightarrow \alpha/\beta \leq \text{constant}$$

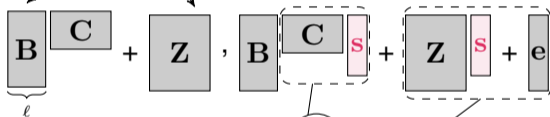
(Taylor expansion at 0)

Hardness of binary Module-LWE

The secret $\mathbf{s} \in R_2^d$ is binary and the secret $\hat{\mathbf{s}} \in R_q^\ell$ is modulo q .

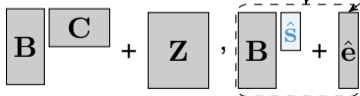


1 **multiple secrets Module-LWE: $\mathbf{A} \approx \mathbf{B}\mathbf{C} + \mathbf{Z}$**
(not for Ring-LWE)



Leftover Hash Lemma

$$d \geq \ell \log(q)$$



Module-LWE with uniform secret

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Standard Module-LWE \longrightarrow **Binary secret Module-LWE**

modulus q
 ring degree n
 secret $\hat{\mathbf{s}} \in R_q^\ell$
 Gaussian width α
 rank ℓ

modulus q
 ring degree n
 secret $\mathbf{s} \in R_2^d$
 Gaussian width β
 rank d

Property	Contribution 1	Contribution 2
Minimal rank d	$\ell \log q + O(\log n)$	$(\ell + 1) \log q + \omega(\log n)$
Noise ratio β/α	$O(n^2 \sqrt{md})$	$O(n^2 \sqrt{d})$
Condition on q	prime	other restrictions
Decision/Search	search	decision

\rightarrow Both proofs have their (dis)advantages

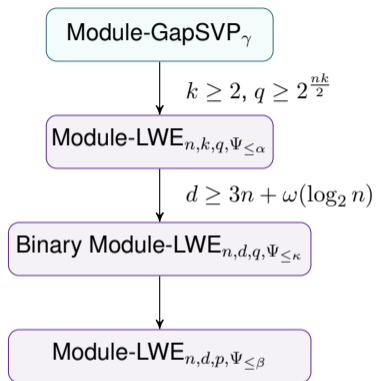
Standard Module-LWE \longrightarrow **η -Module-LWE**

modulus q	modulus q
ring degree n	ring degree n
secret $\hat{s} \in R_q^\ell$	secret $s \in R_\eta^d$
Gaussian width α	Gaussian width β
rank ℓ	rank d

Property	Contribution 1	Contribution 2
Minimal rank d	$\frac{\ell \log q}{\log \eta} + O\left(\frac{\log n}{\log \eta}\right)$	$\frac{2\ell \log q}{\log \eta} + \omega\left(\frac{\log n}{\log \eta}\right)$
Noise ratio β/α	$O((\eta - 1)n^2\sqrt{md})$	$O((\eta - 1)^2n^2\sqrt{d})$

\longrightarrow trade-off between minimal rank and noise ratio

Classical hardness of Module-LWE



- ▶ number theoretic constraints on q
- ▶ $d \geq 3n + \omega(\log_2 n)$ and $\beta = \tilde{\Theta}\left(\frac{n^{5/2}}{\gamma}\right)$

- ▶ Adapting and merging module variants of **Peikert 09** (classical) and **Peikert, Regev, Stephens-Davidowitz 17** (decisional),
- ▶ Adapting **Brakerski, Langlois, Peikert, Regev, Stehlé 13** using Extended Module-LWE,
- ▶ Using **Albrecht, Deo 17**, computing bounds on singular values of rotation matrix, loss in the reduction depends on the norm of the secret.

- ▶ Hardness of Module-LWE with small secret,
- ▶ Hardness of Module-LWE with entropic secret,
- ▶ Still conditions on parameters and on the module rank.

Some open questions

- ▶ Can we prove those results for smaller rank? In particular Ring-LWE?
- ▶ Other error distributions?