LWE-based Cryptography Elementary Principles and Constructions

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The **Two Flavors** of Quantum-Resistant Mechanisms

- **Cryptographic protocols based on quantum mechanics laws** •
 - Quantum Key Distribution (QKD), for instance —
 - unconditionally secure, provided everything in the whole scheme is
 - speed versus distance limits
 - cloud limits or even impossibility
 - not every classical scheme has its practical quantum variant, e.g. signatures
 - security authorities NSA, BSI, NCSC, ANSSI stay highly reserved at this moment -

Classical algorithms for classical computing platforms •

- post-quantum cryptographic suites —
- recommended widespread approach and our main topic here

The Algorithmic Approach of PQC

Traditional crypto	osystems	Purpose	PQC Replacements					
Integer factorization	RSA							
Discrete le gerithm	ElGamal	otior	Crystals-Kyber					
Discrete logarithm	DH	ICIYA	(ML-KEM, FIPS 203)	Learning with errors				
Elliptic curve discrete logarithm	ECDH							
Integer factorization	RSA		Crystals-Dilithium (ML-DSA, FIPS 204)	Learning with errors				
Discrete logarithm	Discrete logarithm DSA entropy		Falcon (FN-DSA, FIPS 206)*	Short integer solution				
Elliptic curve discrete logatithm	ECDSA	<u>i</u>	SPHINCS+ (SLH-DSA, FIPS 205)	Hash inversion				

*) FIPS 206 draft is "... planned for late 2024."



Learning With Errors (LWE) standard, decision version

Definition 1. For positive integers m, n, q, and $\beta < q$, the LWE_{n,m,q,β} problem asks to distinguish between the following two distributions: 1. $(\mathbf{A}, \mathbf{As} + \mathbf{e})$, where $\mathbf{A} \leftarrow \mathbb{Z}_q^{n \times m}, \mathbf{s} \leftarrow$ 2. (A, u), where $\mathbf{A} \leftarrow \mathbb{Z}_q^{n \times m}$ and $\mathbf{u} \leftarrow$

 $[\beta] = \{-\beta, .$

furthermore, in practice, we usually set m = n

$$egin{aligned} &-[eta]^m, \mathbf{e} \leftarrow [eta]^n \ &\mathbb{Z}_q^n. \end{aligned}$$

 $a \leftarrow S$ means that a is chosen uniformly at random from the set S

$$.., -1, 0, 1, ..., \beta$$

[Lyubashevsky, <u>https://ia.cr/2024/1287</u>], cf. also [Peikert, <u>https://ia.cr/2015/939</u>]



LWE Gate - General Definition



Standard-LWE λ_0	$\Omega \in \mathbb{F}_q^{n \times m} = \mathbb{Z}_q^{n \times m}$ $\alpha \in \mathbb{F}_q^m$ $\beta, \varepsilon \in \mathbb{F}_q^n$
Ring-LWE λ_{ρ}	$\Omega \in R_q = \mathbb{Z}_q[x] / \langle x^n + \alpha \in R_q$ $\beta, \varepsilon \in R_q$
Module-LWE λ_{μ}	$\Omega \in R_q^{n \times m}, R_q \text{ see above}$ $\alpha \in R_q^m$ $\beta, \varepsilon \in R_q^n$



LWE Gate - Security Arguments



Standard-LWE λ_0	β indistinguishable from $u \leftarrow \begin{bmatrix} z \\ z \end{bmatrix}$ in particular, $\beta \mapsto \alpha$ is hard
Ring-LWE λ_{ρ}	β indistinguishable from $u \leftarrow \begin{bmatrix} n \\ n \end{bmatrix}$ in particular, $\beta \mapsto \alpha$ is hard
Module-LWE λ_{μ}	β indistinguishable from $u \leftarrow \begin{bmatrix} n \\ n \end{bmatrix}$ in particular, $\beta \mapsto \alpha$ is hard



Standard-LWE Encryption Scheme setup phase



we set m = n, for the general LWE gate

 $\overrightarrow{e_1} \leftarrow \left[\beta_2\right]^m$ sk: $\overrightarrow{s} \leftarrow \left[\beta_1\right]^m$ pk: $\mathbf{A} \leftarrow \mathbb{Z}_q^{m \times m}$ pk: $\vec{t} = \mathbf{A}\vec{s} + \vec{e_1}$

Standard-LWE Encryption Scheme encryption/decryption of one-bit messages



Standard-LWE Encryption Scheme encryption/decryption of one-bit messages



sk:
$$\vec{s} \leftarrow [\beta]^m$$
, pk: $\left(\mathbf{A} \leftarrow \mathbb{Z}_q^{m \times m}, \vec{t} = \mathbf{A}\vec{s} + \vec{e_1}\right)$, where: $\vec{e_1} \leftarrow [\beta]^m$

$$\overrightarrow{r} \leftarrow [\beta_1]^m$$

$$\overrightarrow{e_2} \leftarrow [\beta_2]^m, e_3 \leftarrow [\beta_2]$$

$$\overrightarrow{c_1} = \mathbf{A}^T \overrightarrow{r} + \overrightarrow{e_2}$$

$$c_2 = \overrightarrow{t}^T \overrightarrow{r} + e_3 + \mu \left[\frac{q}{2}\right]$$

$$\overrightarrow{r} = \overrightarrow{r} \overrightarrow{r} \overrightarrow{r} + \overrightarrow{r} + \overrightarrow{r} = \overrightarrow{r} \overrightarrow{r} = \overrightarrow{$$

note $\vec{s}^T \mathbf{A}^T = \vec{t}^T - \vec{e_1}^T$





Geometric interpretation invoking adjoint operator mechanics.





Ring-LWE Encryption Scheme setup phase



 $p(x) \leftarrow S$ means that p(x) coefficients are all chosen uniformly at random from the set S



Ring-LWE Encryption Scheme encryption/decryption of *n*-bit messages



note $s(x)c'_{1}(x) = c'_{1}(x)s(x)$



Ring-LWE Encryption Scheme encryption/decryption of *n*-bit messages



Linear Algebra Viewpoint

Let $a(x), b(x) \in \mathbb{Z}[x]/\langle f(x) \rangle$ and fix a(x), then:

$$a(x)b(x) = a(x)\sum_{i=0}^{d-1} b_i x^i \mod f(x) = \sum_{i=0}^{d-1} b_i \left(a(x)x^i \mod f(x)\right).$$

$$\mathbf{A} = \left(\overrightarrow{a(x)}, \ \overrightarrow{a(x)x} \mod f(\overrightarrow{x}), \ \dots, \ \overrightarrow{a(x)x^{d-1}} \mod f(\overrightarrow{x})\right).$$

This can be interpreted as: $\overrightarrow{a(x)b(x)} = A\overrightarrow{b(x)}$, for $A \in \mathbb{Z}^{d \times d}$ with columns:



R-Modules in MLWE: (pseudo) Linear Algebra Viewpoint





$$\left\langle \vec{u}, \vec{v} \right\rangle$$



Module-LWE Encryption Scheme setup phase



we set m = n, for the general LWE gate

$$\vec{e_1} \leftarrow [\beta_2]^m$$

sk: $\vec{s} \leftarrow [\beta_1]^m$
pk: $\mathbf{A} \leftarrow R_q^{m \times m}, \ R_q = \mathbb{Z}_q[x] / \langle x^n +$
pk: $\vec{t} = \mathbf{A}\vec{s} + \vec{e_1}$





+ Let q = 137, n = 4, $R_q = \mathbb{Z}_{137}[x]/(x^4 + 1)$, k = 3.

+ Let
$$a = \begin{bmatrix} 93 + 51x + 34x^2 + 54x^3 \\ 27 + 87x + 81x^2 + 6x^3 \\ 112 + 15x + 46x^2 + 122x^3 \end{bmatrix}$$
 and $b = \begin{bmatrix} 40 + 78x + x^2 + 119x^3 \\ 11 + 31x + 57x^2 + 90x^3 \\ 108 + 72x + 47x^2 + 14x^3 \end{bmatrix} \in \mathbb{R}_q^k$.

+ Then
$$a + b = \begin{bmatrix} 133 + 129x + 35x^2 + 36x^3 \\ 38 + 118x + x^2 + 96x^3 \\ 83 + 87x + 93x^2 + 136x^3 \end{bmatrix}$$
, $a - b = \begin{bmatrix} 53 + 110x + 33x^2 + 72x^3 \\ 16 + 56x + 24x^2 + 53x^3 \\ 4 + 80x + 136x^2 + 108x^3 \end{bmatrix}$,

and $a \cdot b^T = a[1]b[1] + a[2]b[2] + a[3]b[3] = 93 + 59x + 44x^2 + 132x^3$.

V1b: Prerequisites

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Example: R_a^k

Kyber and Dilithium

[https://cryptography101.ca/]

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Module-LWE Encryption Scheme encryption/decryption of *n*-bit messages





Federal Information Processing Standards Publication

Module-Lattice-Based Key-Encapsulation Mechanism Standard

Category: Computer Security

Subcategory: Cryptography

Information Technology Laboratory National Institute of Standards and Technology Gaithersburg, MD 20899-8900

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Published August 13, 2024



- Fujisaki-Okamato extension to convert IND-CPA scheme to CCA2 secure one
- Number Theoretic Transform for faster ring operations
 - Mandatory and recommended security checks
 - Key and ciphertext data length optimizations
 - Precise definition of the three parametric ML-KEM schemes based on M-LWE
 - Module Lattice refers to lattices corresponding to certain R-modules

[https://doi.org/10.6028/NIST.FIPS.203]

Algorithm 17 ML-KEM.Encaps_internal(ek, n

Uses the encapsulation key and randomness to generate a key and an associated ciphertext.

Input: encapsulation key ek $\in \mathbb{B}^{384k+32}$. Input: randomness $m \in \mathbb{B}^{32}$. Output: shared secret key $K \in \mathbb{B}^{32}$. Output: ciphertext $c \in \mathbb{B}^{32(d_uk+d_v)}$.

- $\mathbf{1:}~(K,r) \gets \mathbf{G}(m \| \mathbf{H}(\mathbf{ek}))$
- 2: $c \leftarrow K-PKE.Encrypt(ek, m, r)$
- 3: return (K,c)

MODULE-LATTICE-BASED KEY-ENCAPSULATION MECHANISM

\triangleright derive shared secret key K and randomness r \triangleright encrypt m using K-PKE with randomness r



Algorithm 18 ML-KEM. Decaps_internal(dk, c)

Uses the decapsulation key to produce a shared secret key from a ciphertext.

Input: decapsulation key dk $\in \mathbb{B}^{768k+96}$. Input: ciphertext $c \in \mathbb{B}^{32(d_uk+d_v)}$. **Output**: shared secret key $K \in \mathbb{B}^{32}$.

1:
$$dk_{PKE} \leftarrow dk[0:384k]$$
 > extr
2: $ek_{PKE} \leftarrow dk[384k:768k+32]$
3: $h \leftarrow dk[768k+32:768k+64]$
4: $z \leftarrow dk[768k+64:768k+96]$
5: $m' \leftarrow K$ -PKE.Decrypt(dk_{PKE}, c)
6: $(K', r') \leftarrow G(m' \| h)$
7: $\bar{K} \leftarrow J(z \| c)$
8: $c' \leftarrow K$ -PKE.Encrypt(ek_{PKE}, m', r')
9: if $c \neq c'$ then
10: $K' \leftarrow \bar{K}$
11: end if
12: return K'

MODULE-LATTICE-BASED KEY-ENCAPSULATION MECHANISM

ract (from KEM decaps key) the PKE decryption key > extract PKE encryption key > extract hash of PKE encryption key \triangleright extract implicit rejection value > decrypt ciphertext

 \triangleright re-encrypt using the derived randomness r'

> if ciphertexts do not match, "implicitly reject"

Tabl	e 2.	Appro	oved p
------	------	-------	--------

	n	q	k	η_1	η_2	d_u	d_v	required RBG strength (bits)
ML-KEM-512	256	3329	2	3	2	10	4	128
ML-KEM-768	256	3329	3	2	2	10	4	192
ML-KEM-1024	256	3329	4	2	2	11	5	256

Table 3. Sizes (in bytes) of keys and ciphertexts of ML-KEM

	encapsulation key	decapsulation key	ciphertext	shared secret key
ML-KEM-512	800	1632	768	32
ML-KEM-768	1184	2400	1088	32
ML-KEM-1024	1568	3168	1568	32

parameter sets for ML-KEM

Short Integer Solution (SIS) - standard, search version

that

$$f_{\mathbf{A}}(\mathbf{z}) := \mathbf{A}\mathbf{z} = \sum_{i} \mathbf{a}_{i} \cdot z_{i} = \mathbf{0} \in \mathbb{Z}_{q}^{n}.$$

Definition 4.1.1 (Short Integer Solution (SIS_{*n*,*q*, β ,*m*)). Given *m* uniformly random vectors $\mathbf{a}_i \in \mathbb{Z}_q^n$, form-} ing the columns of a matrix $\mathbf{A} \in \mathbb{Z}_q^{n \times m}$, find a nonzero integer vector $\mathbf{z} \in \mathbb{Z}^m$ of norm $\|\mathbf{z}\| \leq \beta$ such

(4.1.1)

[Peikert, <u>https://ia.cr/2015/939]</u>

LWE Gate from the SIS Viewpoint



homogeneous case

The homogeneous and inhomogeneous problems are essentially equivalent for typical params. [Peikert, https://ia.cr/2015/939]

inhomogeneous case



LWE or SIS - Heuristic Arguments

- the problem by opponent? The noisy vector is primarily just an obstacle.
 - we view the solution as a short **coordinate vector** for a lattice
 - we apply **Bounded-Distance-Decoding** to find the solution
- - we view the solution as a certain short **lattice vector directly**
 - we apply a sort of a **Short-Vector-Problem** to find the solution -

• Are we searching for the particular solution that we know it exists and that was used to setup



• Or, are we searching for "something like this" instead, without any a priori hint anything like this was used to setup the problem by opponent? The noisy vector is a natural part of the solution.



Up to a scaling factor, the lattices mentioned for LWE and SIS are duals of each other. [Peikert, https://ia.cr/2015/939]



Module-LWE/SIS Signature Scheme setup phase



the noise vector $\vec{s_2}$ is a part of the secret private key; it governs Aborts in Fiat-Shamir later on

sk: $\overrightarrow{s_1} \leftarrow [\beta_1]^l, \overrightarrow{s_2} \leftarrow [\beta_1]^k$ pk: $\mathbf{A} \leftarrow R_q^{k \times l}, R_q = \mathbb{Z}_q[x] / \langle x^n + 1 \rangle$ pk: $\vec{t} = A\vec{s_1} + \vec{s_2}$



Module-LWE/SIS Schnorr-Fiat-Shamir Signature Scheme signature generation/verification







Module-LWE/SIS Schnorr-Fiat-Shamir Signature Scheme signature generation/verification



pick a small random \vec{y} and compute \overline{w} $c = h\left(\mu, \overrightarrow{w_1}\right), \vec{z} = \vec{y} + c \overrightarrow{s_1}$

$$\overrightarrow{w_{1}} = HighBits \left(\overrightarrow{Az} - c \stackrel{?}{=} h \left(\mu, \overrightarrow{w_{1}} \right) \right)$$

$$result \in \{yes, no\}$$

$$\overrightarrow{Az} - c\overrightarrow{t} = \overrightarrow{Ay} + c\overrightarrow{t} - c\overrightarrow{s_{2}}$$

$$= \overrightarrow{Ay} - c\overrightarrow{s_{2}}$$

$$note \overrightarrow{As_{1}} = \overrightarrow{t} - c\overrightarrow{s_{1}} = c\overrightarrow{s_{1}}$$

$$\overrightarrow{v_1} = HighBits\left(\mathbf{A}\overrightarrow{y}\right)$$



Module-LWE/SIS Schnorr-Fiat-Shamir Signature Scheme forgery through Module-SIS



Federal Information Processing Standards Publication

Module-Lattice-Based Digital Signature Standard

Category: Computer Security

Subcategory: Cryptography

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- Fiat-Shamir with Aborts extension
- Rejection sampling to minimize private key leakage - transcript attack
- Number Theoretic Transform for faster ring operations
- Key and signature data length optimizations
- Precise definition of the three parametric ML-DSA schemes based on M-LWE and M-SIS
 - Module Lattice refers to lattices corresponding to certain R-modules

[https://doi.org/10.6028/NIST.FIPS.204]

Table 2. Sizes	(in bytes) of k	eys and sign	atures of ML-DSA				
	Private Key	Public Key	Signature Size				
ML-DSA-44	2560	1312	2420				
ML-DSA-65	4032	1952	3309		aramatar cat	c	
ML-DSA-87	4896	2592	4627		barameter set	3	
					Values assigi	ned by each pa	arametei
		(see Sectio	ns 6.1 and 6.2 of this do	ocument)	ML-DSA-44	ML-DSA-65	ML-DSA
			<i>q</i> - modulus [see § <mark>6.1</mark>]		8380417	8380417	83804
		ζ - a 512 t	h root of unity in \mathbb{Z}_a [se	1753	1753	175	
		d - $#$ of	dropped bits from ${f t}$ [se	13	13	13	
		$ au$ - $\#$ of \pm	± 1 's in polynomial c [se	39	49	60	
		λ - coll	ision strength of \widetilde{c} [see	§ <mark>6.2</mark>]	128	192	256
		γ_1 - coe	efficient range of ${f y}$ [see	§ <mark>6.2</mark>]	2^{17}	2^{19}	2^{19}
		γ_2 - low-c	order rounding range [so	ee § <mark>6.2</mark>]	(q-1)/88	(q-1)/32	(q-1)
		(k,ℓ) -	\cdot dimensions of ${f A}$ [see ${f s}$	§ <mark>6.1</mark>]	(4,4)	(6,5)	(8,7
		η - p	rivate key range [see §6	5.1]	2	4	2
			$eta= au\cdot\eta$ [see §6.2]	78	196	120	
		ω - max $_{7}$	$\#$ of 1's in the hint ${f h}$ [se	e § <mark>6.2</mark>]	80	55	75
		Challenge	entropy $\log_2 inom{256}{ au} + au$ [see § <mark>6.2</mark>]	192	225	257
		Repetit	ions (see explanation b	elow)	4.25	5.1	3.85
		Cl	aimed security strength		Category 2	Category 3	Catego



SLH-DSA by NIST FIPS 205 for Comparison

private key size = 2 x public key size									security	pk	sig
	n	h	d	h'	a	k	lg_w	m	category	bytes	bytes
SLH-DSA-SHA2-128s	16	62	7	٥	17	11	Λ	20	1	27	7 8 5 6
SLH-DSA-SHAKE-128s	10	05	/	9	ΤΖ	14	4	50	T	52	1 000
SLH-DSA-SHA2-128f	16	66	าา	С	6	33	Λ	34	1	32	17 088
SLH-DSA-SHAKE-128f	10	00	22	5			4				
SLH-DSA-SHA2-192s	24	62	7	9	14	17	4	39	3	48	16 224
SLH-DSA-SHAKE-192s	24	05	/								
SLH-DSA-SHA2-192f	24	66	าา	С	8	33	Λ	42	3	48	35 664
SLH-DSA-SHAKE-192f	24	00	22	5			4				
SLH-DSA-SHA2-256s	27	61	0	0	11	22	Λ	17	E	61	20 702
SLH-DSA-SHAKE-256s	52	04	0	0	14	22	4	+ 4/	J	04	29/92
SLH-DSA-SHA2-256f	27	60	17	Л	0	25	Л	40	F	C 1	
SLH-DSA-SHAKE-256f	32	00	Т/	4	9	22	4	49	5	04	49 000

Table 2. SLH-DSA parameter sets

Vulnerabilities we went through before and probably will go again

- Implementation faults, for instance: •
 - faulty encryption/decryption
 - faulty signature generation/verification
- Computational faults •
 - such as were RSA-CRT vulnerabilities
- Side channels
 - sensitive data leakage

Recent Example - EUCLEAK Attack on YubiKey Series 5

- FIDO2 and EAL5+ certified • cryptographic device
- ECDSA implementation broken via EM • side channel
- Possibly affects broader area of • security microcontrollers by Infineon and broader protocols area
- The failure is in radiating modular inversion procedure
- There is a modular inversion in PACE-• CAM(*) involving chip private key z_A

*) PACE-CAM employed in NFC passports and ID cards (SK)



Figure 1.4: YubiKey 5Ci – EM Acquisition Setup

https://ninjalab.io/eucleak/





NTT - Number Theoretic Transform

- Specialized discrete Fourier transform to speed up multiplication in certain rings of convolution polynomials
- Can be also interpreted as a sort of Chinese Remainder Theorem machinery •
- Is a vital core of LWE based algorithms ML-KEM and ML-DSA
- Is a fruitful target of fault and side channel attacks

$$\begin{split} R_q &:= \mathbb{Z}_q[X] / (X^{256} + 1) \qquad T_q := \bigoplus_{i=0}^{127} \mathbb{Z}_q[X] / \left(X^2 - \zeta^{2\mathsf{BitRev}_7(i) + 1} \right) \\ \hat{f} &:= \left(f \bmod (X^2 - \zeta^{2\mathsf{BitRev}_7(0) + 1}), \dots, f \bmod (X^2 - \zeta^{2\mathsf{BitRev}_7(127) + 1}) \right) \end{split}$$

$$\widehat{f} := \big(f \bmod \big(X^2 - \zeta^{2\mathsf{BitRev_7}(0)+1}\big),$$

$$f\times_{R_q}g=\mathsf{NT}$$

$$\Gamma^{-1}(\hat{f} \times_{T_q} \hat{g}) = \text{NIST EIDS 202: ML KEM A}$$

— NIST FIPS 203: ML-KEM, August 13th, 2024



Floating Point FFT in FALCON (FN-DSA)

naturally invokes side-channels that are uneasy to predict and prevent

Floating-Point 4.1

Signature generation, and also part of key pair generation, involve the use of complex numbers. These can be approximated with standard IEEE 754 floating-point numbers ("binary64" format, commonly known as "double precision"). Each such number is encoded over 64 bits, that split into the following elements:

- a sign $s = \pm 1$ (1 bit);
- an exponent e in the -1022 to +1023 range (11 bits);
- a mantissa m such that $1 \le m < 2$ (52 bits).

In general, the represented value is $sm2^e$. The mantissa is encoded as $2^{52}(m-1)$; it has 53 bits of precision, but its top bit, of value 1 by definition, is omitted in the encoding.

Automatic offloading of sensitive computation to a Floating Point Unit (FPU)

[Falcon: Fast-Fourier Lattice-based Compact Signatures over NTRU, v1.2]



Thank you for your attention

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History (year-month-day format)

- 2025-01-18, version 1 release
- 2024-12-12, version 0.9999 beta better annotation towards adjoint operator
- 2024-11-14, version 0.999 beta clarification note on adjoint operator
- 2024-11-14, version 0.99 beta bunch of typos corrected, mainly captions
- 2024-11-13, version 0.9 beta typos may occur(!)