Side-Channel Analysis of Lattice-based PQC Candidates

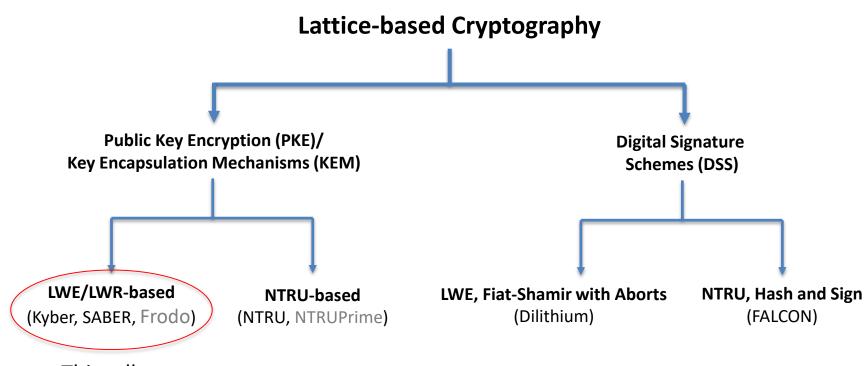
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Notice

- Talk includes published works from journals, conferences, and IACR ePrint Archive.
- Talk includes works of other researchers (cited appropriately)
- For easier explanation, we 'simplify' concepts
- Due to time limit, we do not exhaustively cover all relevant works.
 - Main focus on LWE/LWR-based PKE/KEM schemes
 - Timing, Power, and EM side-channels

Classification of PQC finalists and alternative candidates



This talk

Outline

- Background:
 - Learning With Errors (LWE) Problem
 - LWE/LWR-based PKE framework
- Overview of side-channel attacks:
 - Algorithmic-level
 - Implementation-level
- Overview of masking countermeasures
- Conclusions and future works

Given two linear equations with unknown x and y

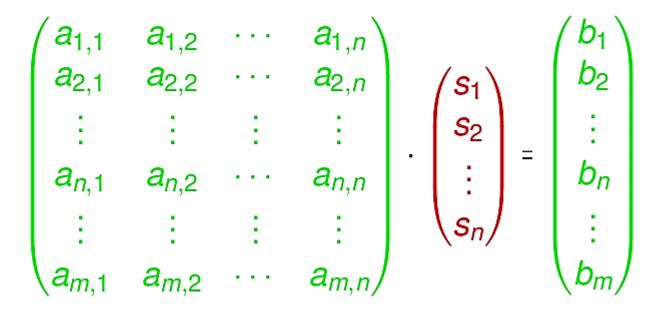
$$3x + 4y = 26$$

$$2x + 3y = 19$$
 or
$$\begin{pmatrix} 3 & 4 \\ 2 & 3 \end{pmatrix} \cdot \begin{pmatrix} x \\ y \end{pmatrix} = \begin{pmatrix} 26 \\ 19 \end{pmatrix}$$

Find x and y.

Solving a system of linear equations

System of linear equations with unknown s



Gaussian elimination solves s when number of equations $m \ge n$

Solving a system of linear equations with errors Matrix A Vector **b** $\begin{pmatrix} a_{1,1} & a_{1,2} & \cdots & a_{1,n} \\ a_{2,1} & a_{2,2} & \cdots & a_{2,n} \\ \vdots & \vdots & \vdots & \vdots \\ a_{n,1} & a_{n,2} & \cdots & a_{n,n} \\ \vdots & \vdots & \vdots & \vdots \\ a_{m,1} & a_{m,2} & \cdots & a_{m,n} \end{pmatrix}$ *e*2 **S**1 : 1 **S**2 mod q ٠ b_n . **e**_n . <mark>S</mark>n/ . **a**_{m, 1}

- Search Learning With Errors (LWE) problem:
 Given (A, b) → computationally infeasible to solve (s, e)
- Decisional Learning With Errors (LWE) problem:
 Given (A, b) → hard to distinguish from uniformly random

LWE

$$\begin{pmatrix} a_{0,0} & a_{0,1} & a_{0,2} & a_{0,3} \\ a_{1,0} & a_{1,1} & a_{1,2} & a_{1,3} \\ a_{2,0} & a_{2,1} & a_{2,2} & a_{2,3} \\ a_{3,0} & a_{3,1} & a_{3,2} & a_{3,3} \end{pmatrix} * \begin{pmatrix} s_0 \\ s_1 \\ s_2 \\ s_3 \end{pmatrix} + \begin{pmatrix} e_0 \\ e_1 \\ e_2 \\ e_3 \end{pmatrix} = \begin{pmatrix} b_0 \\ b_1 \\ b_2 \\ b_3 \end{pmatrix} (\text{mod q})$$

Uniformly random matrix

Ring LWE

$$\begin{pmatrix} a_0 & -a_3 & -a_2 & -a_1 \\ a_1 & a_0 & -a_3 & -a_2 \\ a_2 & a_1 & a_0 & -a_3 \\ a_3 & a_2 & a_1 & a_0 \end{pmatrix} * \begin{pmatrix} s_0 \\ s_1 \\ s_2 \\ s_3 \end{pmatrix} + \begin{pmatrix} e_0 \\ e_1 \\ e_2 \\ e_3 \end{pmatrix} = \begin{pmatrix} b_0 \\ b_1 \\ b_2 \\ b_3 \end{pmatrix} (\text{mod } q)$$

Matrix by rotating first column

Ring LWE

$$\begin{pmatrix} a_{0} & -a_{3} & -a_{2} & -a_{1} \\ a_{1} & a_{0} & -a_{3} & -a_{2} \\ a_{2} & a_{1} & a_{0} & -a_{3} \\ a_{3} & a_{2} & a_{1} & a_{0} \end{pmatrix} * \begin{pmatrix} s_{0} \\ s_{1} \\ s_{2} \\ s_{3} \end{pmatrix} + \begin{pmatrix} e_{0} \\ e_{1} \\ e_{2} \\ e_{3} \end{pmatrix} = \begin{pmatrix} b_{0} \\ b_{1} \\ b_{2} \\ b_{3} \end{pmatrix} \pmod{q}$$

$$(\text{mod } q)$$

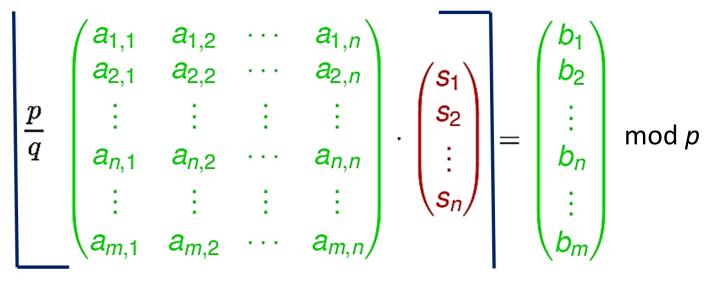
$$\begin{bmatrix} a(x) * \mathbf{s}(x) + \mathbf{e}(x) = \mathbf{b}(x) \pmod{q} \pmod{q} + 1 \\ \text{where} \\ a(x) = (a_{0} + a_{1}x + a_{2}x^{2} + a_{3}x^{3}) \\ \mathbf{s}(x) = (s_{0} + s_{1}x + s_{2}x^{2} + s_{3}x^{3}) \\ \mathbf{e}(x) = (b_{0} + b_{1}x + b_{2}x^{2} + b_{3}x^{3}) \end{pmatrix}$$

$$Polynomial arithmetic$$

Module LWE

$\boldsymbol{\mathcal{C}}$	
$ \begin{bmatrix} a_0 & -a_3 & -a_2 & -a_1 \\ a_1 & a_0 & -a_3 & -a_2 \\ a_2 & a_1 & a_0 & -a_3 \\ a_3 & a_2 & a_1 & a_0 \end{bmatrix} $	$ \begin{vmatrix} a_8 & -a_{11} - a_{10} & -a_9 \\ a_9 & a_8 & -a_{11} & -a_{10} \\ a_{10} & a_9 & a_8 & -a_{11} \\ a_{11} & a_{10} & a_7 & a_8 \end{vmatrix} \ \begin{vmatrix} s_0 \\ s_1 \\ s_2 \\ s_3 \end{vmatrix} \ \begin{vmatrix} e_0 \\ e_1 \\ e_2 \\ e_3 \end{vmatrix} \ \begin{vmatrix} b_0 \\ b_1 \\ b_2 \\ b_3 \end{vmatrix} $
$ \begin{bmatrix} a_4 & -a_7 & -a_6 & -a_5 \\ a_5 & a_4 & -a_7 & -a_6 \\ a_6 & a_5 & a_4 & -a_7 \\ a_7 & a_6 & a_5 & a_4 \end{bmatrix} $	$\begin{bmatrix} a_{12} & -a_{15} & -a_{14} & -a_{13} \\ a_{13} & a_{12} & -a_{15} & -a_{14} \\ a_{14} & a_{13} & a_{12} & -a_{15} \\ a_{15} & a_{14} & a_{13} & a_{12} \end{bmatrix} * \begin{bmatrix} s_4 \\ s_5 \\ s_6 \\ s_7 \end{bmatrix} + \begin{bmatrix} e_4 \\ e_5 \\ e_6 \\ e_7 \end{bmatrix} = \begin{bmatrix} b_4 \\ b_5 \\ b_6 \\ b_7 \end{bmatrix}$
$ \begin{pmatrix} a_{0,0}(x) & a_{0,1}(x) \\ a_{1,0}(x) & a_{1,1}(x) \end{pmatrix} * \begin{pmatrix} s_0(x) \\ s_1(x) \end{pmatrix} + \begin{pmatrix} e_0(x) \\ e_1(x) \end{pmatrix} = \begin{pmatrix} b_0(x) \\ b_1(x) \end{pmatrix} $	

Learning with Rounding (LWR)



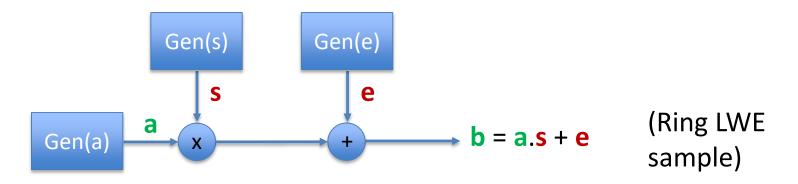
where p < q

- Errors are generated by performing rounding
- LWR can be extended to "Ring LWR" and "Module LWR"

Ring LWE-based PKE (IND-CPA secure)

Key Generation:

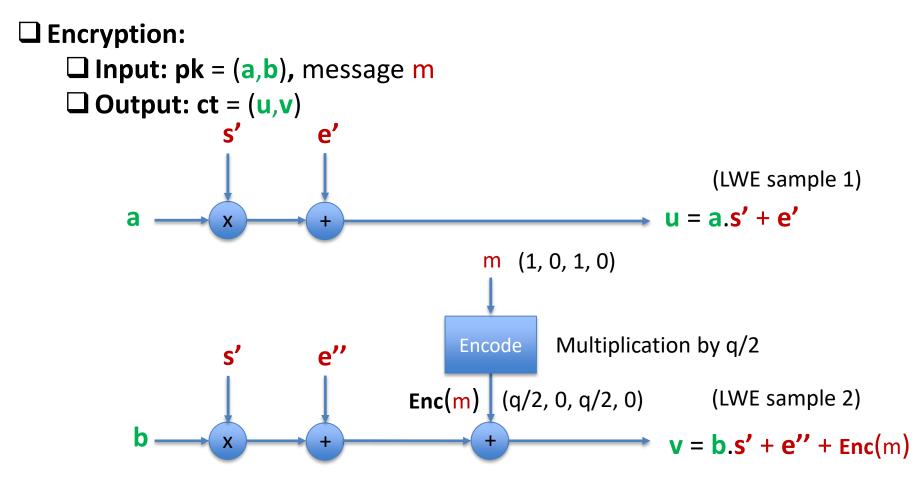
Output: public key (pk), secret key (sk)



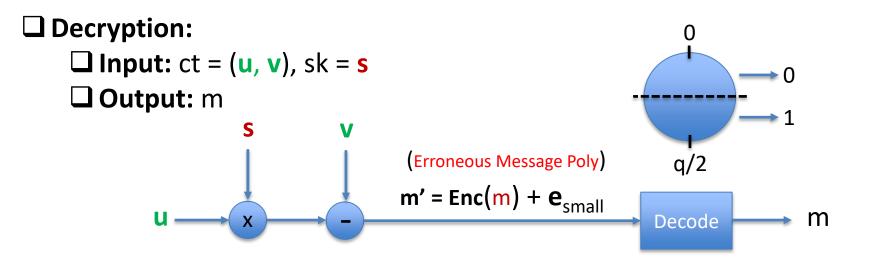
Arithmetic operations are performed in a polynomial ring R_q **Public Key (pk):** (a,b) **Secret Key (sk):** (s)

V. Lyubashevsky, C. Peikert, and O. Regev. "On Ideal Lattices and Learning with Errors Over Rings". IACR ePrint 2012/230.

Ring LWE-based PKE (IND-CPA secure)



Ring LWE-based PKE (IND-CPA secure)



$$v - u.s = m' = Enc(m) + (e.s' + e'' + e'.s)$$

= Enc(m) + e_{small}

General Framework for PKE

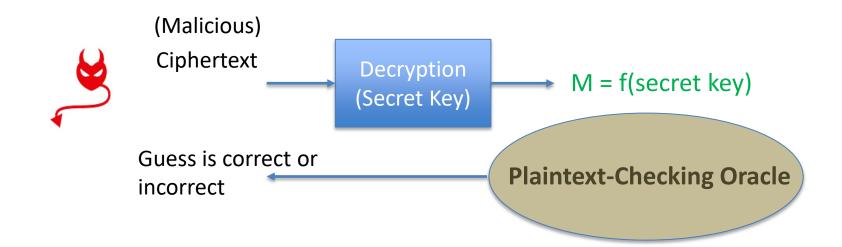
- The "ring LWE PKE" example can be extended to describe various standard/ring/module LWE/LWR-based schemes.
- Differences in them
 - Variant of LWE/LWR problem
 - Operating Ring, Modulus etc.
 - Choice of Distribution for secret and error.
 - Choice of Error Correcting Code (to reduce decryption failures)
 - Specific optimization techniques
 - Protocol-level differences

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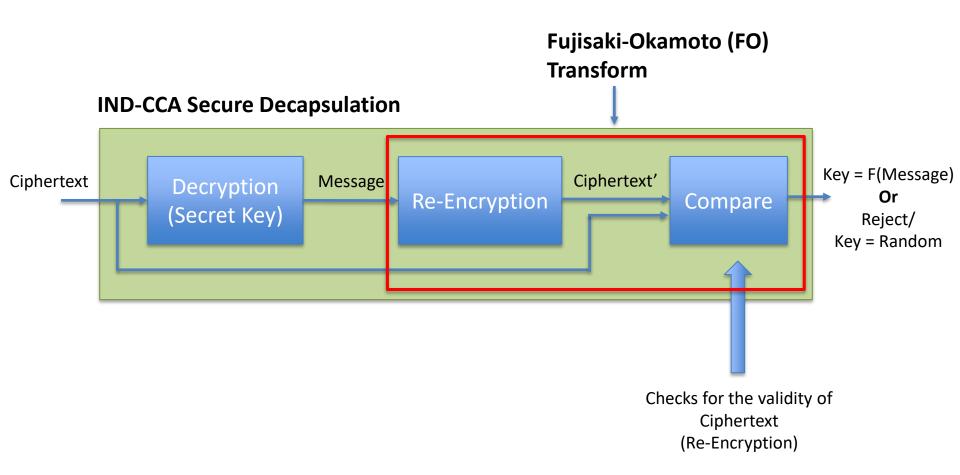
We will use the "ring LWE PKE" example for different side-channel attacks

Chosen Ciphertext Attack (CCA): Key Recovery

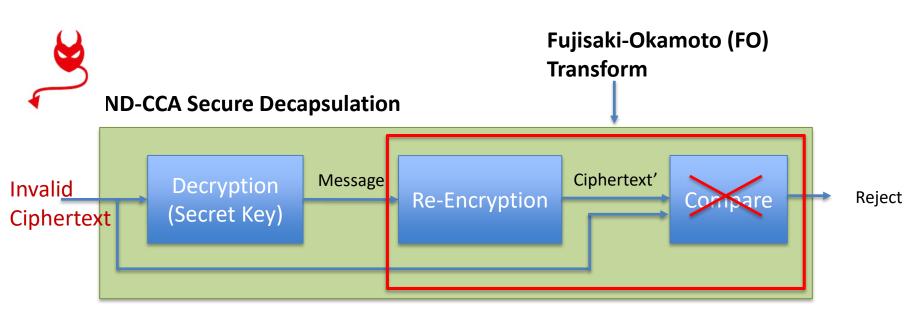
Attacker targets the decryption procedure of IND-CPA PKE



CCA-security using FO transformation



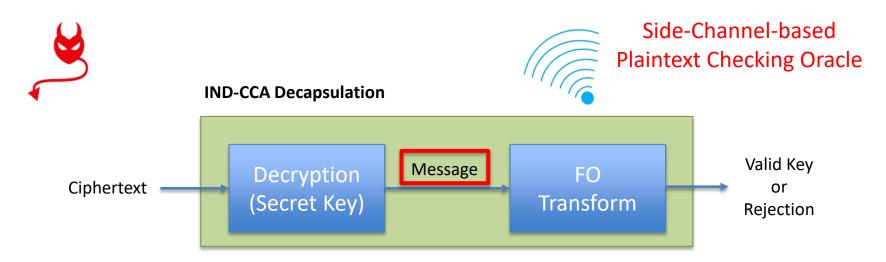
CCA-security using FO transformation



Attacker cannot gain any information about the message.

Can attacker use side-channel(s) to guess the messages?

Side-Channel Assisted Chosen Ciphertext Attacks



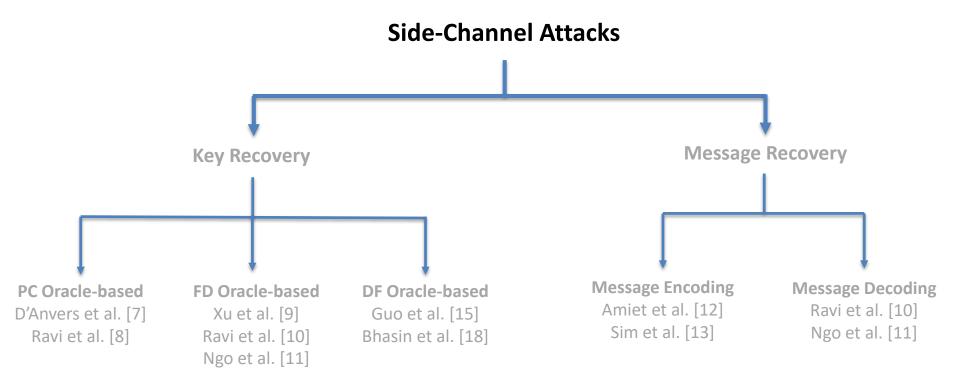
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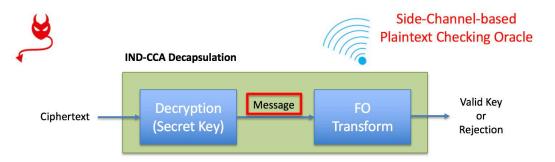
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Classification of SCA of lattice-based PKE/KEMs:



Side-Channel Assisted Chosen Ciphertext Attacks



Bauer et al. [BGRR19] – Proposed to use SCA to assist chosen ciphertext attacks for LWE/LWR-based PKE/KEMs.

D'Anvers et al. [DTVV19] demonstrated a concrete side-channel based Plaintext checking Oracle Attack:

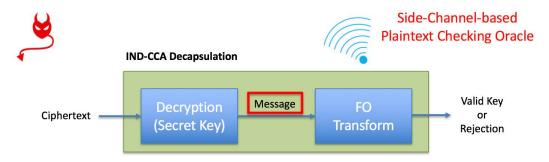
- **Target Schemes: LAC** and RAMSTAKE
- **Timing Side-Channel**: Variable run-time of error correcting codes
- Ravi et al. [RRCB20] generalized the attack to constant time implementations:
 - **EM Side-Channel**: Extension of technique to multiple LWE/LWR-based PKE/KEMs

[BGRR19] Bauer, Aurélie, Henri Gilbert, Guénaël Renault, and Mélissa Rossi. "Assessment of the key-reuse resilience of NewHope." In *Cryptographers' Track at the RSA Conference*, pp. 272-292. Springer, Cham, 2019.

[DTVV19] D'Anvers, Jan-Pieter, Marcel Tiepelt, Frederik Vercauteren, and Ingrid Verbauwhede. "Timing attacks on error correcting codes in post-quantum schemes." In *Proceedings of ACM Workshop on Theory of Implementation Security Workshop*, pp. 2-9. 2019.

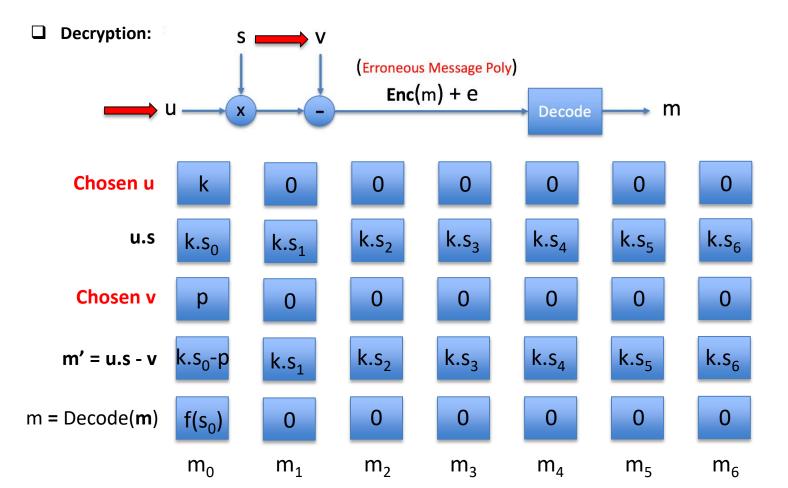
[RRCB20] Ravi, Prasanna, Sujoy Sinha Roy, Anupam Chattopadhyay, and Shivam Bhasin. "Generic Side-channel attacks on CCA-secure lattice-based PKE and KEMs." *IACR Transactions on Cryptographic Hardware and Embedded Systems* (2020): 307-335.

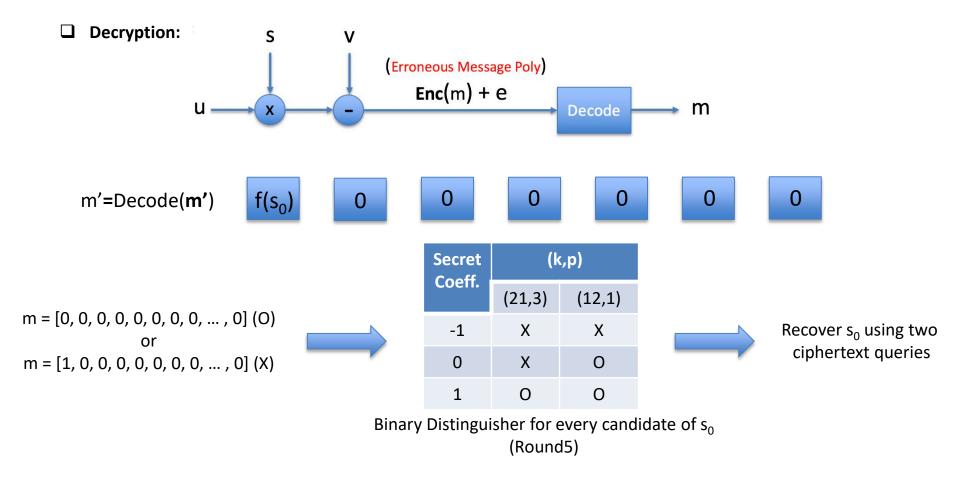
Side-Channel Assisted Chosen Ciphertext Attacks



□ Plaintext-Checking (PC) Oracle based attack consists of two parts:

- **Part-I**: Construction of **malicious ciphertexts**
- **Part-II**: **Perform SCA** to obtain useful information about **decryption output** for malicious ciphertexts

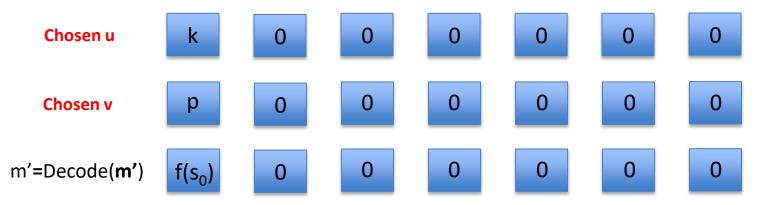




□ Polynomial multiplication in polynomial rings have special rotational properties.

 $R_q = \mathbb{Z}_q[x] \mod (x^n - 1) \quad R_q = \mathbb{Z}_q[x] \mod (x^n + 1)$

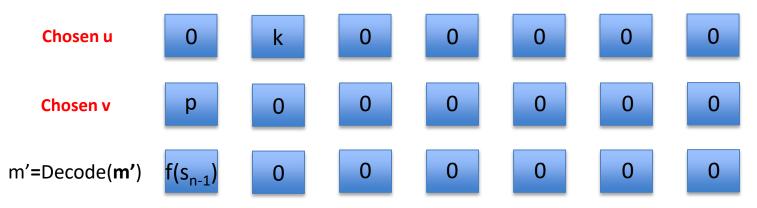
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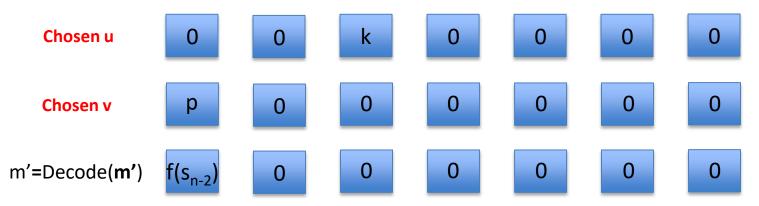
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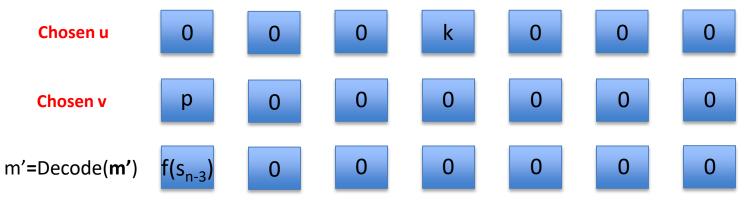
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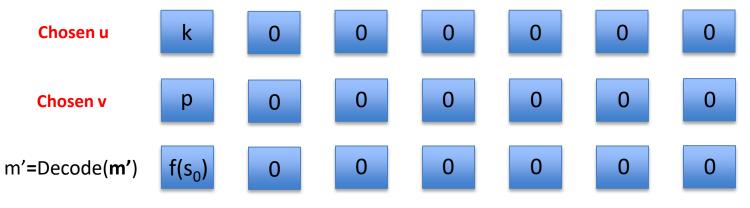
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- No Rotation property in schemes based on Standard LWE/LWR (FrodoKEM) But, attack still works...
 Location of non-zero bit of message changes (depending upon secret coefficient to recover)



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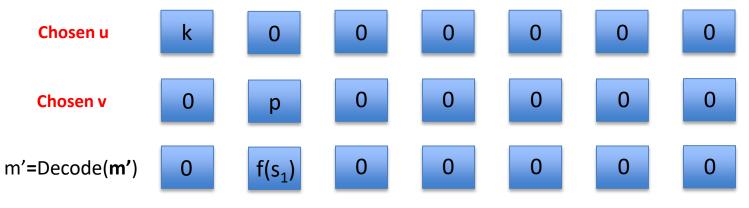
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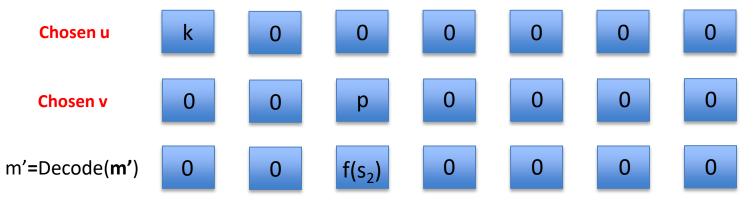
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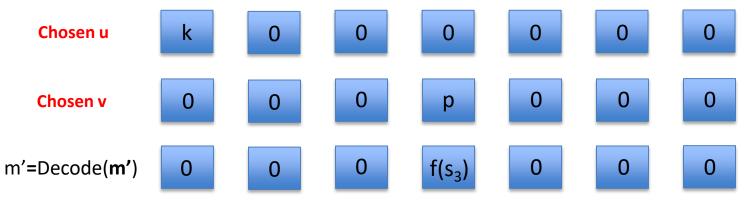
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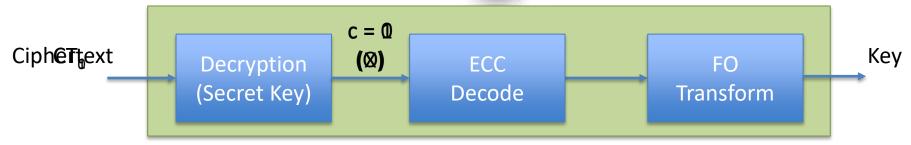


PC Oracle-based SCA: Using SCA as O/X distinguisher (Part-II)

D'Anvers et al. [DTVV19] exploited variable runtime of error correcting codes in LAC and RAMSTAKE.

- O Valid codeword, X Invalid codeword
- Decode_Time(O) << Decode_Time(X)</p>





Pre-Processing Phase (Template Generation):

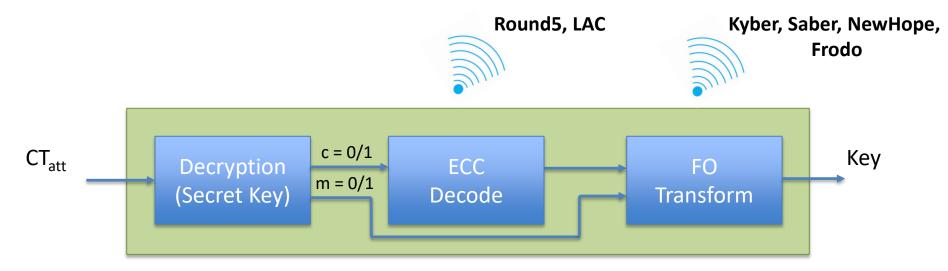
- Create ciphertexts for both classes: O and X.
- **Query ciphertexts to build template for O and X.**

Attack Phase (Template Matching):

- Query with malicious chosen ciphertexts and classify as O or X
- Use O/X info. to recover secret key

PC Oracle-based SCA: Using SCA as O/X distinguisher (Part-II)

- Attack generalized to constant-time implementations by Ravi et al. [RRCB20] using the EM side-channel for multiple LWE/LWR-based PKE/KEMs.
- □ Vulnerable operations leaking EM side-channel information about O/X:
 - **ECC Decoding Procedure** (Decode(O) != Decode(X))
 - **FO Transform** (Hash(0,pk) != Hash(1,pk))



PC Oracle-based SCA: Experimental Results

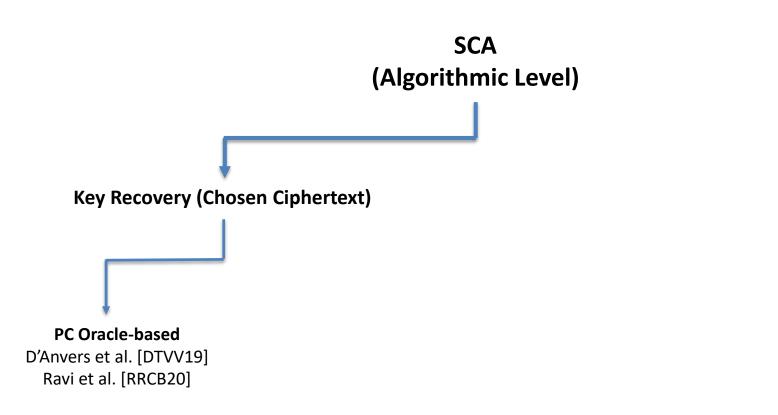
Tabulation of attack complexity on different LWE/LWR-based based PKE/KEMs (Source: Ravi et al. [RRCB20]) **Target:** ARM Cortex-M4, EM-side channel

Scheme	# Coeffs	# traces for template	# Attack traces	Time (Minutes)
Kyber (KYBER512)	512	2 x 50 = 100	7.7k	10.8
Round5 (R5ND_1KEM_5d)	490	2 x 50 = 100	2.9k	4.5
LAC (LAC128)	512	2 x 50 = 100	3.0k	25

ADVANTAGE:

- Easy SCA (Classification Problem with two classes) No sophisticated SCA setup required.
- Non-profiled Attack
- □ Attack done in a matter of a few minutes (few thousand traces).

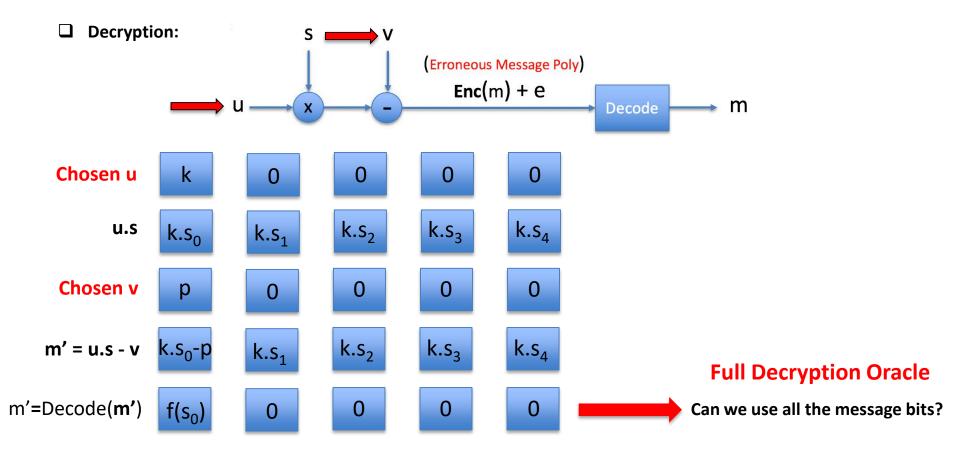
COUNTERMEASURE: Concrete Masking (additive sharing of message)



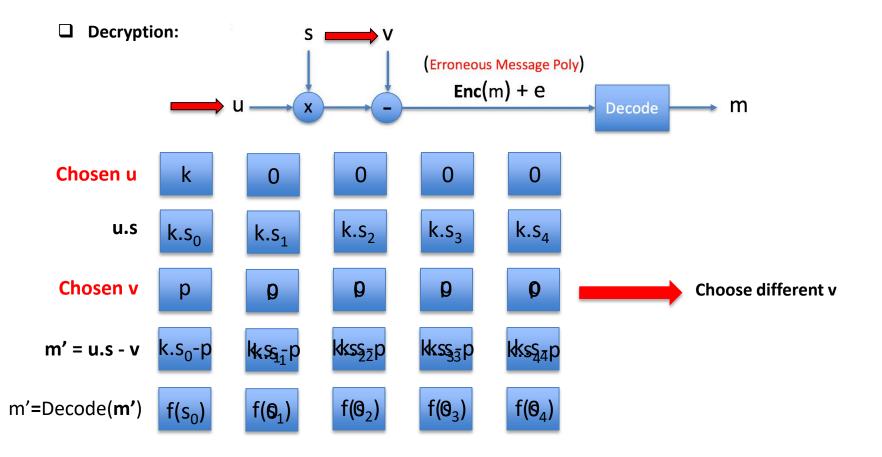
A Few Observations on the PC Oracle-based SCA...

- □ Key recovery still requires a few thousand traces.
- **C**an we do better with much fewer traces???

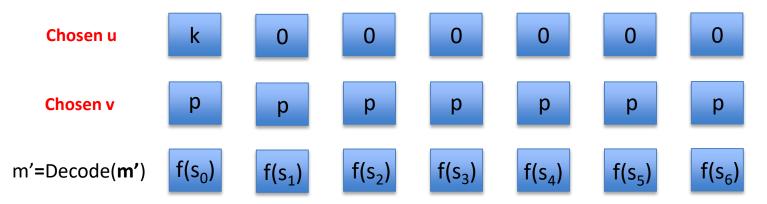
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Full Decryption (FD) Oracle-based SCA:



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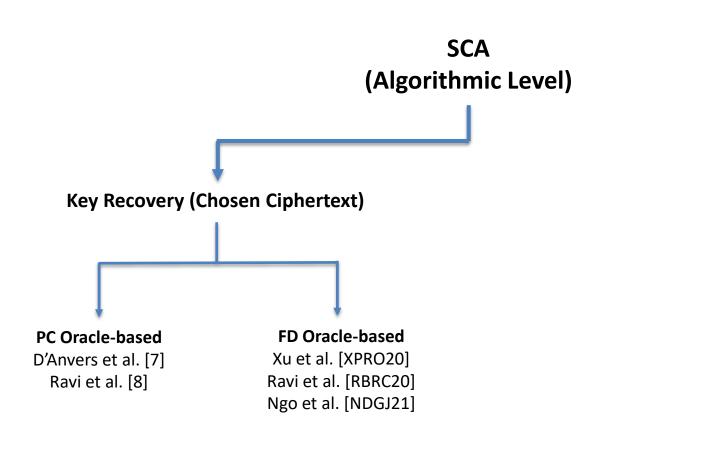


Proposed by Xu et al. [XPRO20]:

Full Key Recovery for Kyber512 in 8 queries (improved to 6 queries by Ravi et al. [RBRC20])

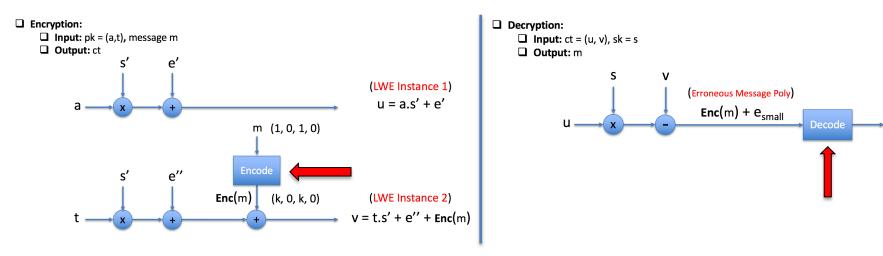
Ngo et al. [NDGJ21] proposed improved techniques for key recovery with FD oracle:
 Error Correction mechanism for noise in recovered message (Saber - 16 queries)

[XPRO20] Xu, Zhuang, Owen Pemberton, Sujoy Sinha Roy, and David Oswald. *Magnifying Side-Channel Leakage of Lattice-Based Cryptosystems with Chosen Ciphertexts: The Case Study of Kyber*. Cryptology ePrint Archive, Report 2020/912, 2020. https://eprint.iacr.org/2020/912, 2020.
 [RBRC20] Ravi, Prasanna, Shivam Bhasin, Sujoy Sinha Roy, Anupam Chattopadhyay. "On Exploiting Message Leakage in (few) NIST PQC Candidates for Practical Message Recovery and Key Recovery Attacks." Cryptology ePrint Archive, Report 2020/1559, 2020. https://eprint.iacr.org/2020/1559, 2020.
 [NDGJ21] Ngo, Kalle, Elena Dubrova, Qian Guo, and Thomas Johansson. "A Side-Channel Attack on a Masked IND-CCA Secure Saber KEM." Cryptology ePrint Archive, Report 2021/079, 2021. https://eprint.iacr.org/2021/079, 2021.



How does an attacker perform full message recovery through SCA???

Encoding and Decoding Functions:

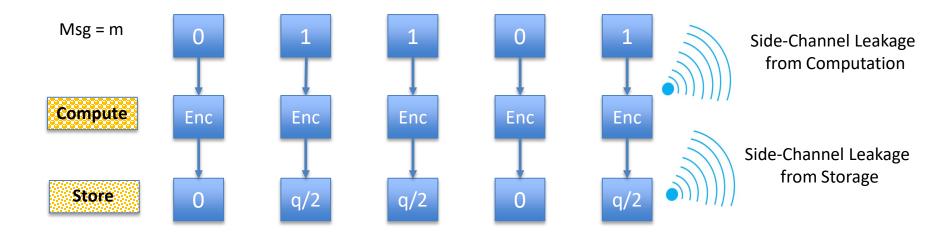


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Used to convert message to polynomial and vice versa.

- **Encode** and **Decode** Unique for LWE/LWR-based PKE scheme
- **Bitwise** manipulation of the message.
- Does bitwise manipulation lead to side-channel leakage?

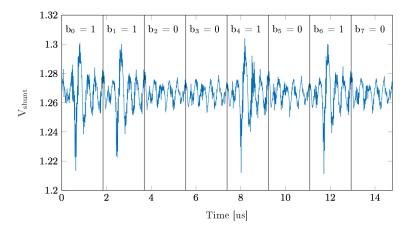
SCA of Message Encoding



Observation: Only two possible types of operation for each bit – (**0 encoded to 0**) or (**1 encoded to q/2**)

SCA of Message Encoding

Amiet et al. [ACLZ20] – Single trace message recovery attack on NewHope (Template Matching)



Single Side channel trace from message encoding Operation NewHope – Unoptimized Impl. On ARM Cortex-M4 Source: Amiet et al. [12]

Sim et al. [SKL⁺20] – Generalization of attack to multiple schemes (Kyber, SABER, Frodo, Round5, LAC)

[ACLZ20] Amiet, Dorian, Andreas Curiger, Lukas Leuenberger, and Paul Zbinden. "Defeating NewHope with a single trace." In International Conference on Post-Quantum Cryptography, pp. 189-205. Springer, Cham, 2020.

[SKL⁺20] Sim, Bo-Yeon, Jihoon Kwon, Joohee Lee, Il-Ju Kim, Tae-Ho Lee, Jaeseung Han, Hyojin Yoon, Jihoon Cho, and Dong-Guk Han. "Single-Trace Attacks on Message Encoding in Lattice-Based KEMs." *IEEE Access* 8 (2020): 183175-183191.

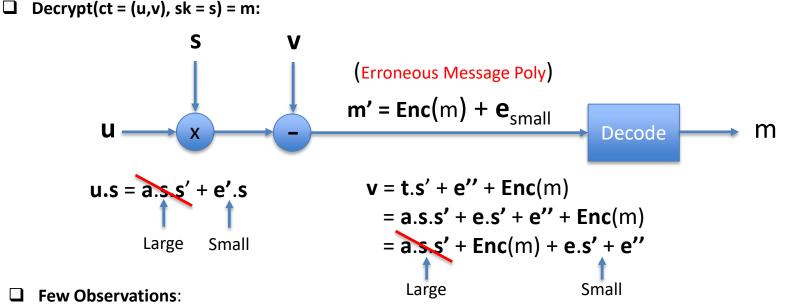
Defending against SCA of Message Encoding

- □ Idea 1: Parallelize the Encoding Procedure
 - □ Vectorization in HW/SW platforms.
 - Simultaneous leakage from multiple bits Removes leakage from individual bits
- □ Idea 2: Shuffle the Order of Encoding (Sim et al.[SKL⁺20], Amiet et al. [ACLZ20])
 - □ Shuffle the order of processing of message bits
 - □ Can recover all message bits, but not the correct order.
- But, do these techniques help thwart the attack???
- Ravi et al. [RBRC20] showed that "Ciphertext Malleability" in LWE/LWR-based PKEs can be used to defeat the aforementioned designs.

[RBRC20] Ravi, Prasanna, Shivam Bhasin, Sujoy Sinha Roy, Anupam Chattopadhyay. "On Exploiting Message Leakage in (few) NIST PQC Candidates for Practical Message Recovery and Key Recovery Attacks." Cryptology ePrint Archive, Report 2020/1559, 2020. https://eprint.iacr.org/2020/1559, 2020. [ACLZ20] Amiet, Dorian, Andreas Curiger, Lukas Leuenberger, and Paul Zbinden. "Defeating NewHope with a single trace." In *International Conference on Post-Quantum Cryptography*, pp. 189-205. Springer, Cham, 2020.

[SKL⁺20] Sim, Bo-Yeon, Jihoon Kwon, Joohee Lee, Il-Ju Kim, Tae-Ho Lee, Jaeseung Han, Hyojin Yoon, Jihoon Cho, and Dong-Guk Han. "Single-Trace Attacks on Message Encoding in Lattice-Based KEMs." *IEEE Access* 8 (2020): 183175-183191.

Ciphertext Malleability in LWE/LWR-based PKE



Message polynomial only additively hidden within the ciphertext component v.

■ No diffusion of the message polynomial.

 \square m_i = f(v[i]) - Each coefficient v[i] determines corresponding message bit m_i

Ciphertext Malleability in LWE/LWR-based PKE

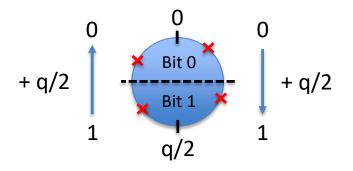
□ Valid Ciphertext v:

v = t.s' + e'' + Enc(m)

- □ Adding (q/2) to v[i]: □ v' = v + (q/2).xⁱ
 - □ With (v' u.s = m') m'[i] = m[i] + e[i] + q/2

 $\square m'_i = Decode(m'[i]) = Flip(m'_i)$

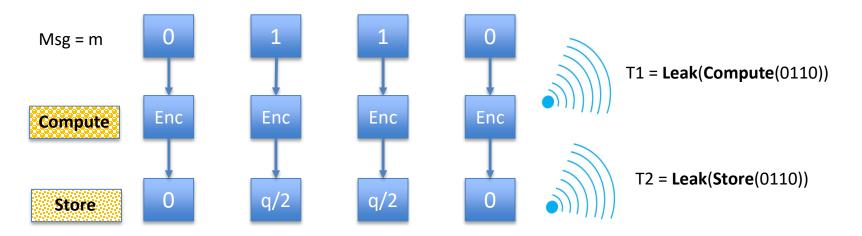
Decoding of m'[i]



Malleability Property: To flip m_i, add q/2 to v[i]

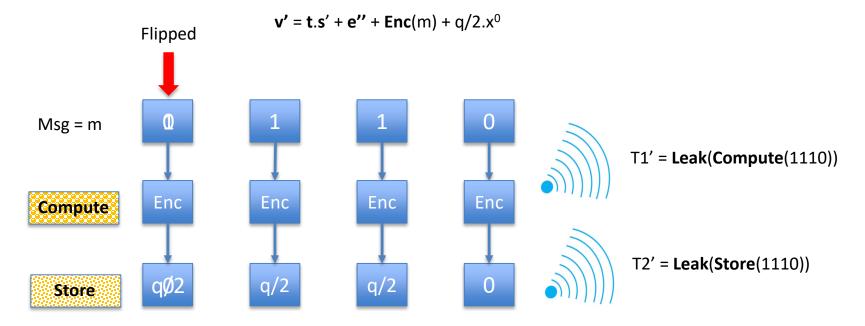
- □ Idea 1: Parallelized Encoding Procedure (x4)
 - Step 1: Query Decapsulation device with valid ct = (u,v)

v = **t**.**s**' + **e**'' + **Enc**(m)



Message Encoding (Re-Encryption)

- □ Idea 1: Parallelized Encoding Procedure (x4)
 - Step 2: Modify v to construct v' and query v'



Message Encoding (Re-Encryption)

- □ Idea 1: Parallelized Encoding Procedure (x4)
 - Step 3: Compare the leakages T1 and T1' (resp. T2 and T2')
 - If T1' > T1, flip is from 0 to 1 => m₀ = 0
 - If T1' < T1, flip is from 1 to 0 => m₀ = 1
 - Attack Simultaneously all nibbles of the message
 - If (x 4) parallelization, full message recovery in 5 traces.
 - If (x n) parallelization, full message recovery in (n+1) traces.

- □ Idea 2: Shuffle the order of Encoding of bits
 - Step 1: Query Decapsulation device with valid ct = (u,v)

v = **t**.**s**' + **e**'' + **Enc**(m)

- Step 2: Retrieve all the bits from leakage and let Hamming Weight(m') = X' (number of 1s)
- Step 3: Modify v to construct v' and query v'

 $v' = t.s' + e'' + Enc(m) + q/2.x^{0}$

- Step 4: Retrieve all the bits from leakage and let Hamming Weight(m") = X"
- Step 5: Compare X and X' to retrieve m0
 - If X'' = X' + 1, flip is from 0 to 1 => $m_i = 0$
 - If X'' = X' 1, flip is from 1 to 0 => $m_i = 1$
- If "k" bits in message, message recovery can be done in (k+1) traces.

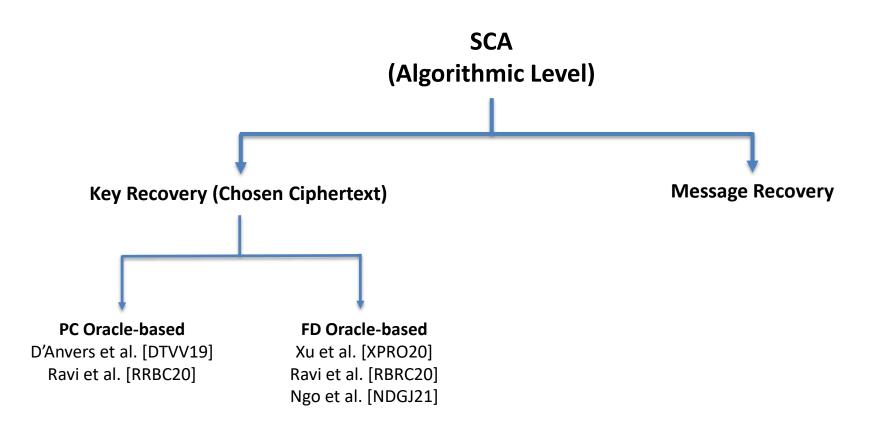
- □ Can also be extended to **masked** implementations albeit with higher number of traces [RBRC20].
- □ Attack also applies to message decoding procedure in decryption [RBRC20].
- Protections increase attacker's complexity, but do not prevent attack.
- Shuffling + Masking Considered to be secure for message encoding and decoding operation.
- Advantages:
 - □ Very Effective (Full Message Recovery)

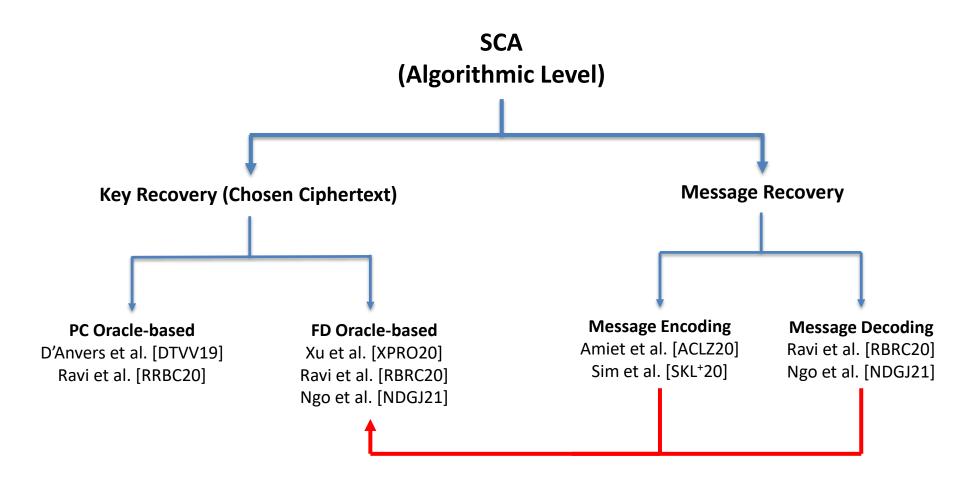
Disadvantages:

- **Q** Relatively high SNR required (Identify Precise Leakage Points, Distniguish single bit changes)
- □ Attack can be made effective using more sophisticated setup (trace filtering, synchronization)

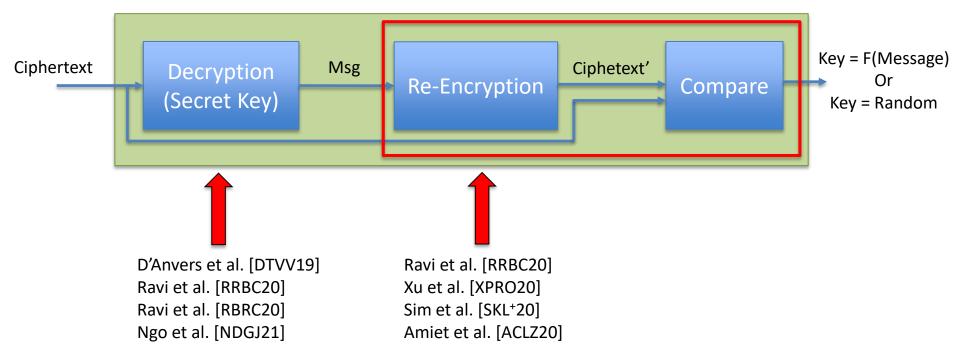
Leakage from Encoding/Decoding + "Ciphertext Malleability" - Improved/Enhanced SCA for message recovery

[RBRC20] Ravi, Prasanna, Shivam Bhasin, Sujoy Sinha Roy, Anupam Chattopadhyay. "On Exploiting Message Leakage in (few) NIST PQC Candidates for Practical Message Recovery and Key Recovery Attacks." Cryptology ePrint Archive, Report 2020/1559, 2020. https://eprint.iacr.org/2020/1559, 2020.



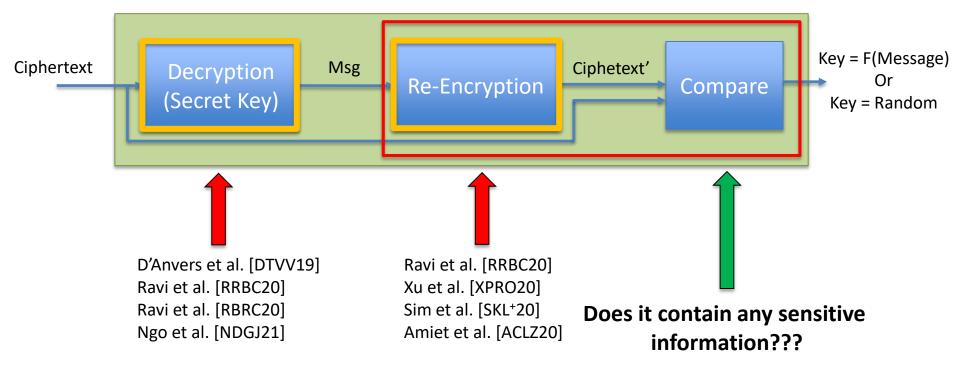


IND-CCA Secure Decapsulation



Defending against SCA on LWE/LWR-based PKE/KEMs:

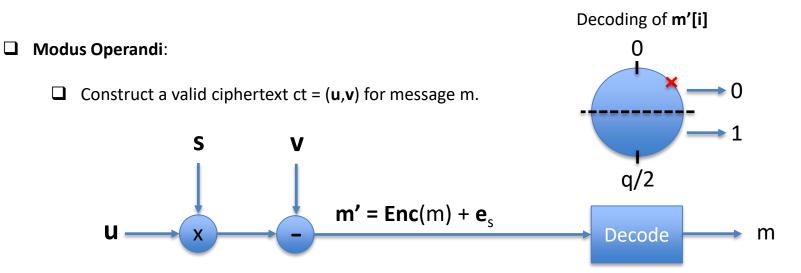
IND-CCA Secure Decapsulation

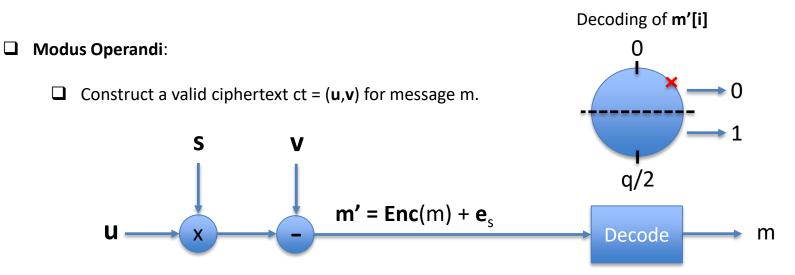


Analysis of Ciphertext Comparison:

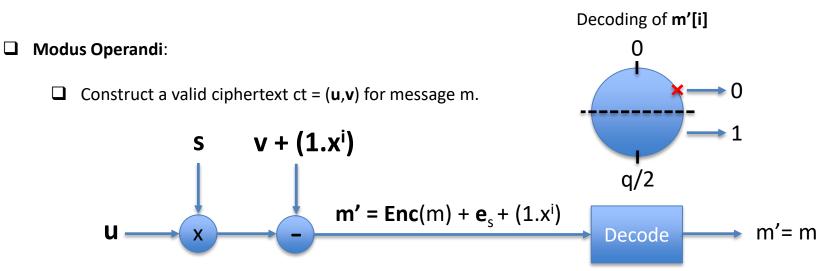
- □ For valid Ciphertexts ----- Comparison: PASS
- □ For Invalid Ciphertexts ----- Comparison: FAIL
- The comparison always fails for invalid ciphertexts (used in chosen ciphertext attacks)
- □ So, do we need to protect ciphertext comparison???
- **Revelation:** "How comparison fails" leaks information about secret key (Guo et al. in [GJN20])
- Decryption Failure Oracle-based SCA

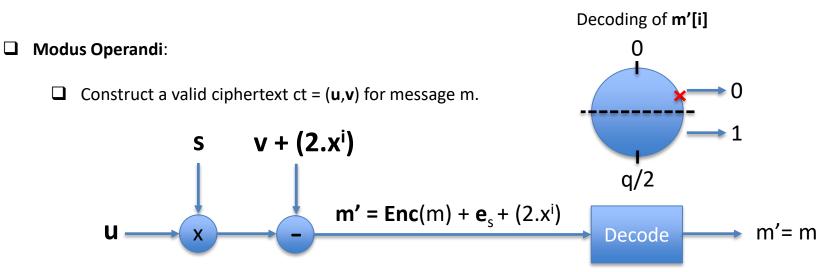
[GJN20] Qian Guo, Thomas Johansson, Alexander Nilsson. "A key-recovery timing attack on post-quantum primitives using the Fujisaki-Okamoto transformation and its application on FrodoKEM." <u>https://eprint.iacr.org/2020/743</u> In IACR-CRYPTO 2020.

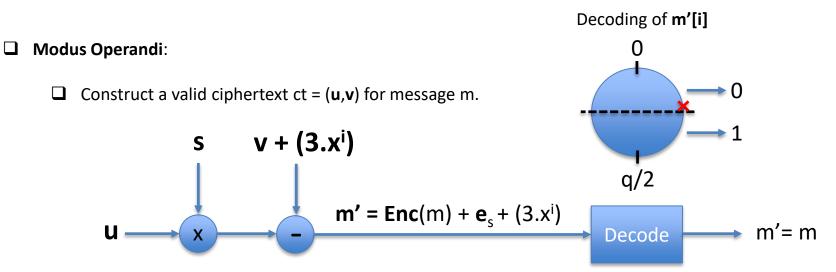


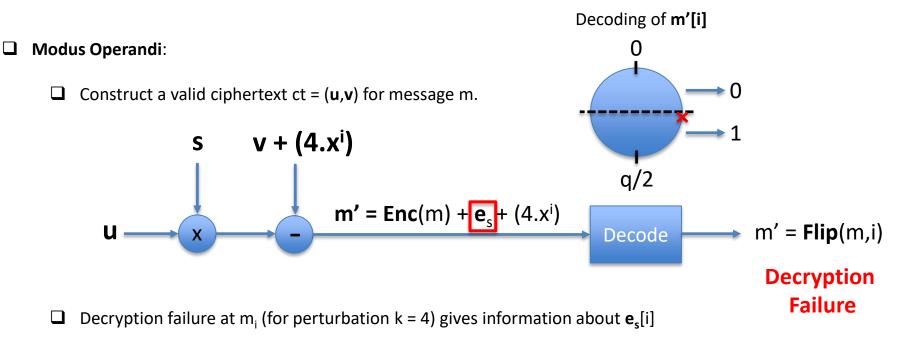


 \Box Add a small error to the ith coefficient of **v** (v[i]) and observe change in the message m'.







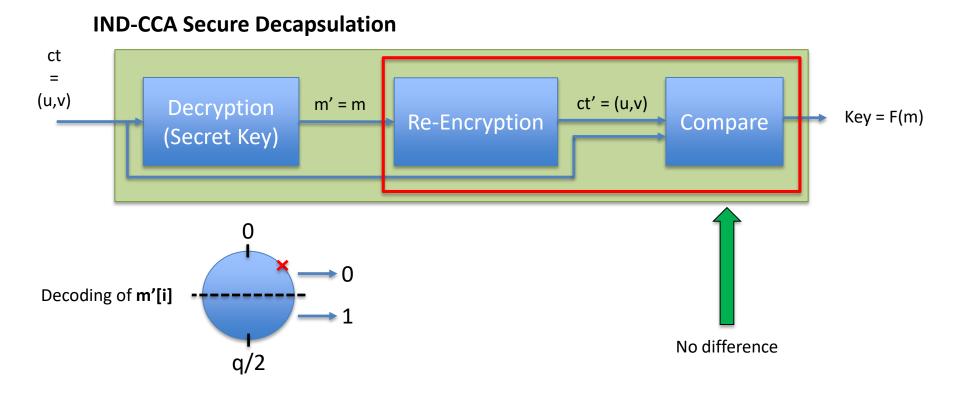


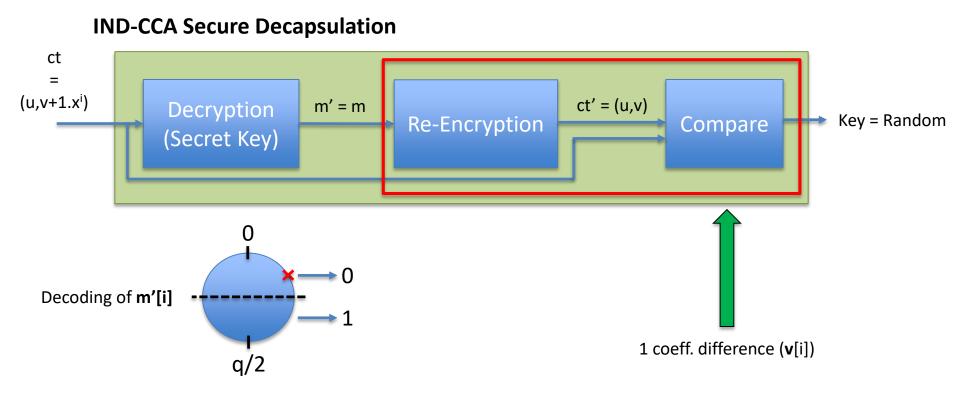
e_s - **secret dependent** error polynomial

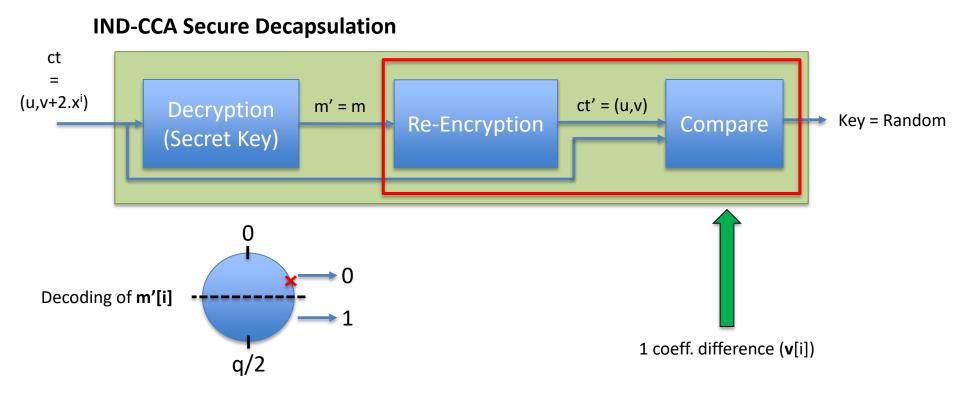
Attacker can obtain linear hints about secret through decryption failures

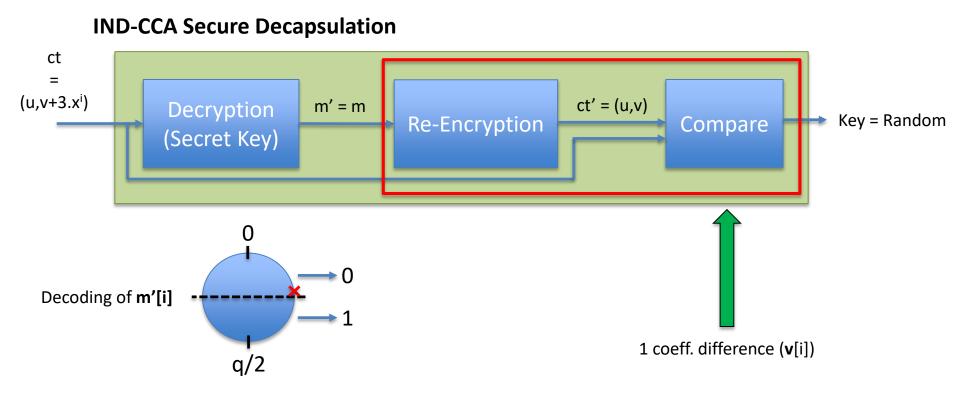
□ Enough number of hints potentially reveals the secret key.

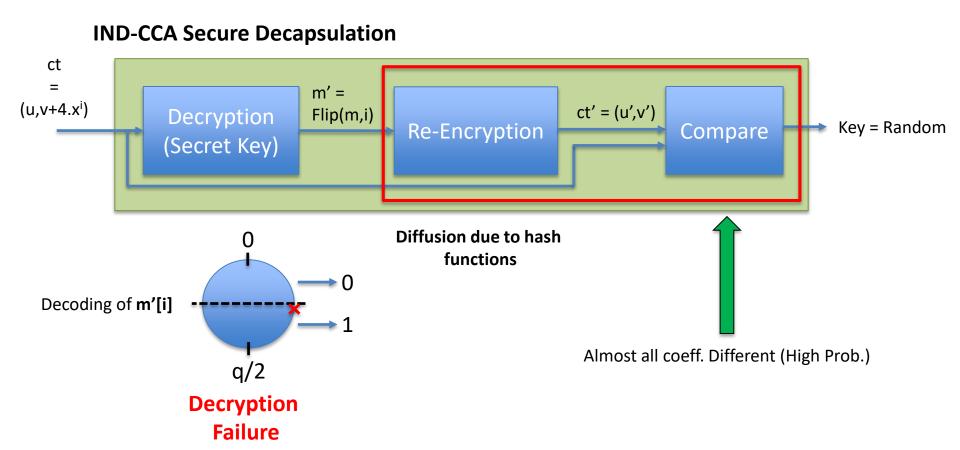
How does an attacker identify decryption failures through SCA???



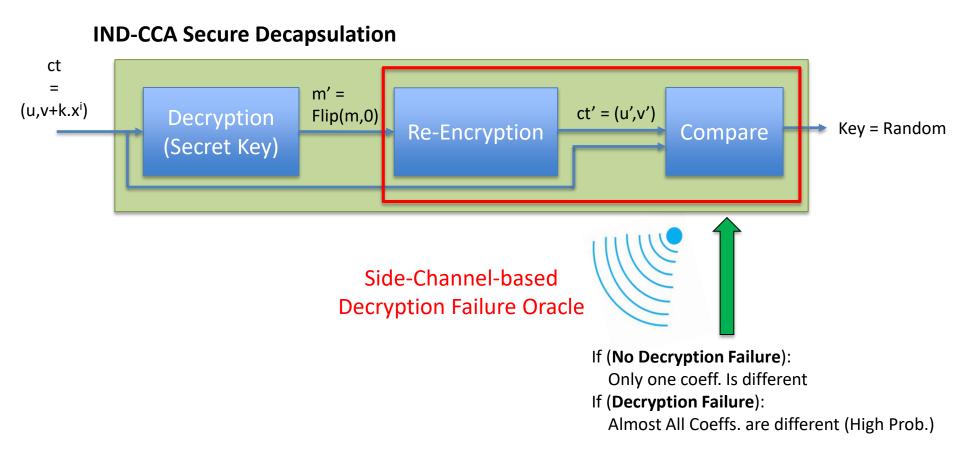








Decryption Failure (DF) Oracle-based SCA:



Decryption Failure (DF) Oracle-based SCA:

- Guo et al. [GJN20] presented the first DF oracle-based attack in SCA context on Frodo KEM:
 - **Timing Attack** on Non-Constant Time Comparison

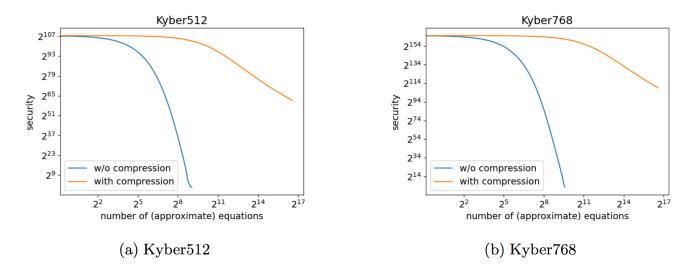
If(**Decryption Failure**) Comparison immediately aborts (Lesser Time) Else if(**No Decryption Failure**) Comparison only aborts at ith coeff. (More Time)

- □ 2³⁰ decapsulation queries for full secret key recovery (incl. retries to get cleaner timing signal)
- Several approaches known for efficient masked ciphertext comparison (Oder et al. [OSPG18] and Bache et al. [BPO⁺20])
- □ For efficiency, they **unmask results of partial checks** (under notion that they are non-leaky).
- Unmasking result of partial checks leaks information about decryption failures Bhasin et al. [BDH⁺21]

[OSPG18] Oder, Tobias, Tobias Schneider, Thomas Pöppelmann, and Tim Güneysu. "Practical CCA2-secure and masked ring-LWE implementation." *IACR Transactions on Cryptographic Hardware and Embedded Systems* (2018): 142-174. [BPO⁺20] Bache, Florian, Clara Paglialonga, Tobias Oder, Tobias Schneider, and Tim Güneysu. "High-Speed Masking for Polynomial Comparison in Lattice-based KEMs." *IACR Transactions on Cryptographic Hardware and Embedded Systems* (2020): 483-507. [BDH⁺21] Bhasin, Shivam, Jan-Pieter D'Anvers, Daniel Heinz, Thomas Pöppelmann, and Michiel Van Beirendonck. "Attacking and Defending Masked

Polynomial Comparison for Lattice-Based Cryptography."

Decryption Failure (DF) Oracle-based SCA:



Security of Kyber512 and Kyber768 in function of the number of (approximate) equations retrieved. Source: Bhasin et al. [BDH⁺21]

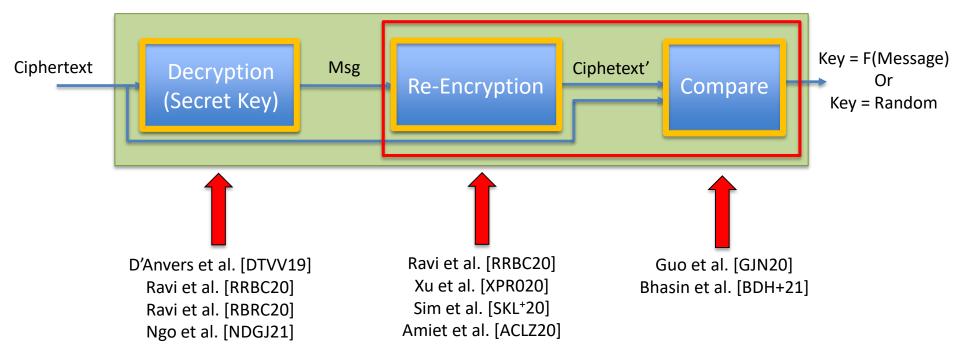
Takeaway:

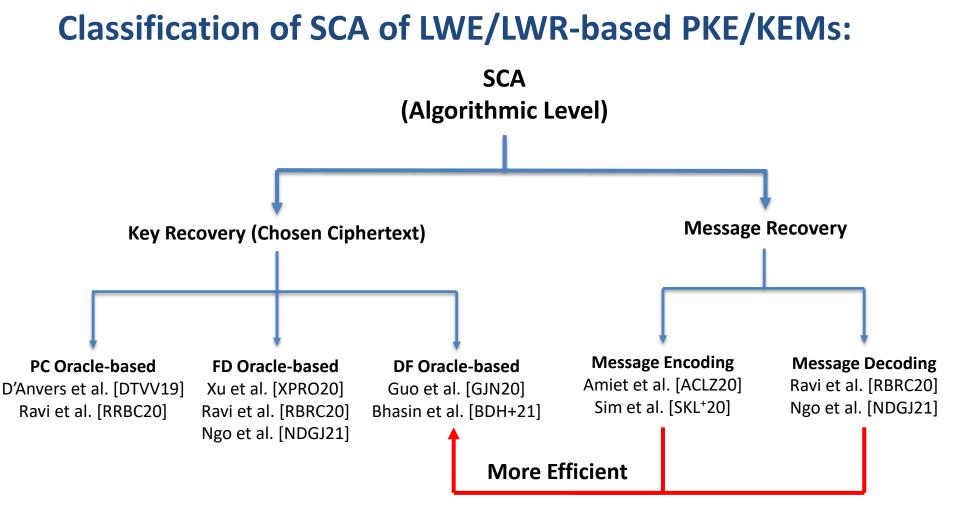
- Implement **Constant-time Comparison**
- □ Masked Implementation: **Do not unmask partial checks**

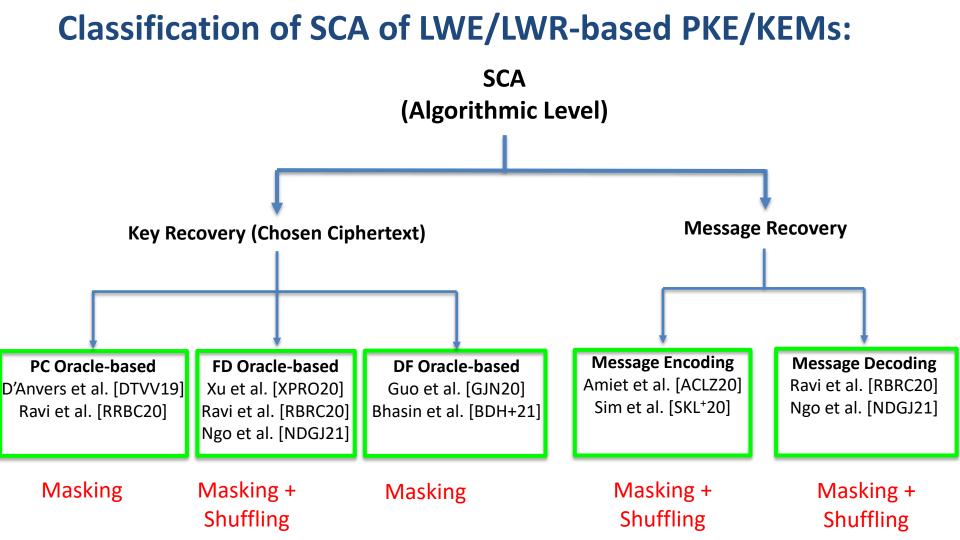
[BDH⁺21] Bhasin, Shivam, Jan-Pieter D'Anvers, Daniel Heinz, Thomas Pöppelmann, and Michiel Van Beirendonck. "Attacking and Defending Masked Polynomial Comparison for Lattice-Based Cryptography."

Classification of SCA of LWE/LWR-based PKE/KEMs:

IND-CCA Secure Decapsulation







Outline

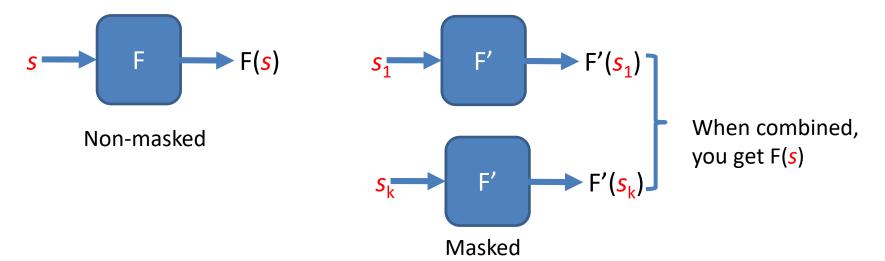
- Background:
 - Learning With Error (LWE) Problem
 - LWE/LWR-based PKE framework
- Overview of side-channel attacks:
 - Algorithmic-level
 - Implementation-level
- Overview of masking countermeasures:
- Conclusions and future works:

What is masking countermeasure?

- Countermeasure against differential power analysis (DPA)
- Randomizes computation by splitting secret data into random shares

$$s = s_1 + s_2 + s_3 + \dots + s_k$$

• No information about *s* can be obtained by observing a proper subset



Arithmetic and Boolean shares

- Two common ways of splitting a secret into shares
- Boolean shares: secret bit is split in GF(2)

 $s = s_1 \oplus s_2 \oplus s_3 \oplus ... \oplus s_k \mod 2$

... applicable to words (vector of bits)

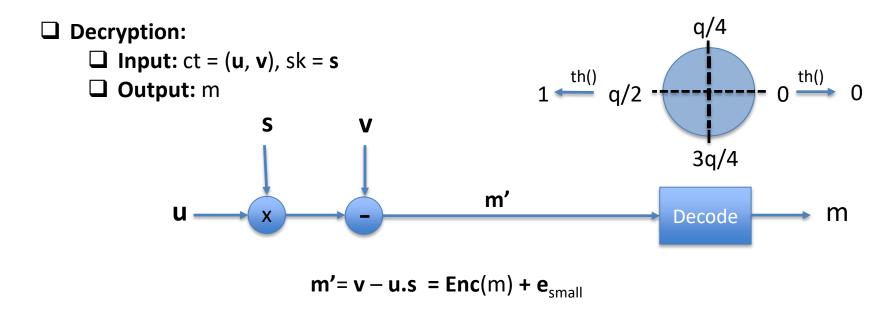
• Arithmetic shares: secret is split in GF(p) where p>2

 $s = s_1 + s_2 + s_3 + \dots + s_k \mod p$ E.g., 7 = 8 + 10 mod 11

• Some cryptographic algorithms require working with both types

How to apply masking to lattice-based PKE?

Ring LWE-based PKE (IND-CPA)



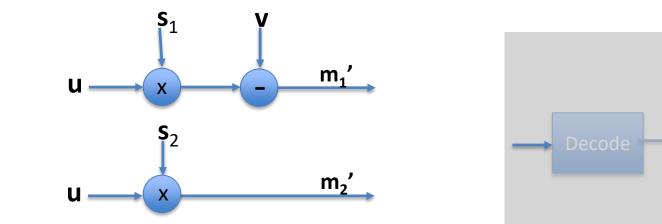
Note: ct = (u, v) is controlled by attacker

Masking Idea: Split s into random shares and randomize computation

1st Order Masking for IND-CPA PKE

• Step1: Split s into two arithmetic shares

 $\mathbf{s} = \mathbf{s}_1 - \mathbf{s}_2 \mod \mathbf{q}$

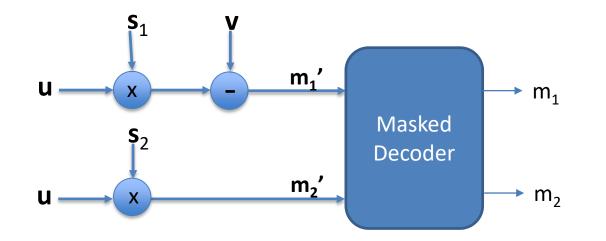


 $m_1' = v - u.s_1$ $m_2' = u.s_2$

How to compute decoding on two shares?

Easy to check **m**₁'+**m**₂' = **v** – **u.s** = **m**'

Masked Decoding



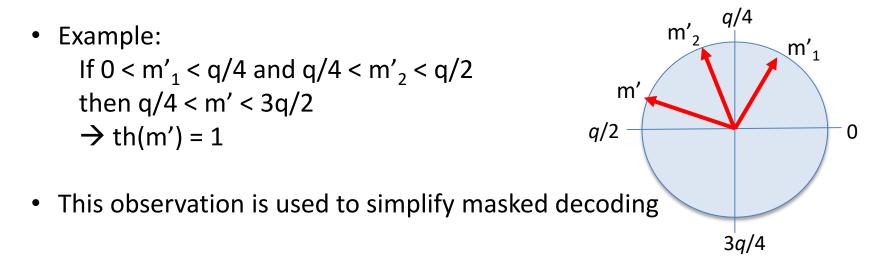
What we want:

- 1. Compute mask-message pair (m_1 , m_2) s.t. $m = m_1 + m_2 \mod 2$
- 2. No combination of the two input shares m_1' and m_2'

There are several approaches to design masked decoders

Masked Decoder of [RRVV15]

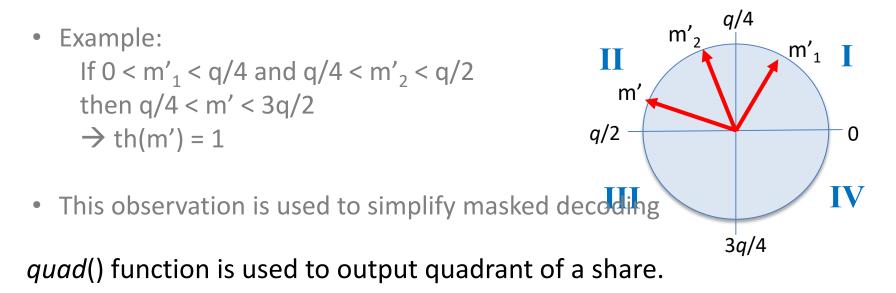
• Observation: Only a few most significant bits of the shares are helpful to perform threshold decoding



[RRVV15] O. Reparaz, S. S. Roy, F. Vercauteren, I. Verbauwhede. "A Masked Ring-LWE Implementation". CHES 2015.

Masked Decoder of [RRVV15]

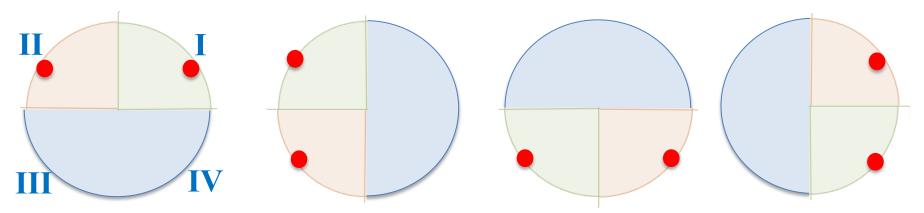
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[RRVV15] O. Reparaz, S. S. Roy, F. Vercauteren, I. Verbauwhede. "A Masked Ring-LWE Implementation". CHES 2015.

Masked Decoder of [RRVV15]

Quad-based decoding works if two shares are in adjacent quadrants.



Otherwise, this approach fails. Solution proposed in [RRVV15]: Refresh shares and try again.

- 1. Take a constant δ_i from a table
- 2. $m'_1 := m'_1 \delta_i$
- 3. $m'_2 := m'_2 + \delta_i$
- 4. Check if they are in adjacent quadrants

Iterated a fixed number of times

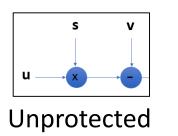
Results: Masked ring-LWE PKE (IND-CPA) [RRVV15]

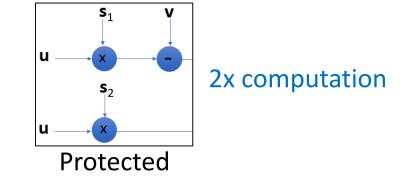
Masking overhead: ~2.7 times more cycles in HW (FPGA) ~5.8 times more cycles in SW (ARM M4

Decryption failure increases.

Reasons behind increased computation time:

1. Polynomial arithmetic cost doubles





2. Iterative 'quad-based decoding' increases the cost further

VS

More Efficient Masked Decoder by [OSPG18]

- Assume that m'₁ and m'₂ are Boolean shares (instead of arithmetic)
 i.e., m' = m'₁ ⊕ m'₂
- Naturally, $MSb(m') = MSb(m'_1) \bigoplus MSb(m'_2)$
- Hence, $th(m') = th(m'_1) \bigoplus th(m'_2)$
- \rightarrow Masked decoding becomes an easy operation in this setting

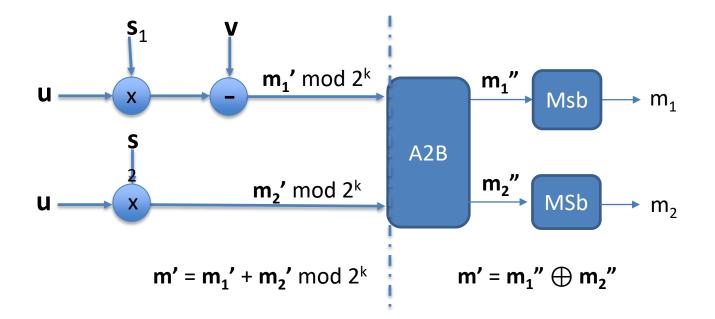
Can we realize this for ring/mod LWE/LWR?

Idea in [OSPG18]: Arithmetic to Boolean conversion (A2B)

[OSPG18] T. Oder, T. Schneider, T. Pöppelmann, T. Güneysu. "Practical CCA2-Secure and Masked Ring-LWE Implementation". TCHES 2018

Masked Decoder with A2B approach [OSPG18]

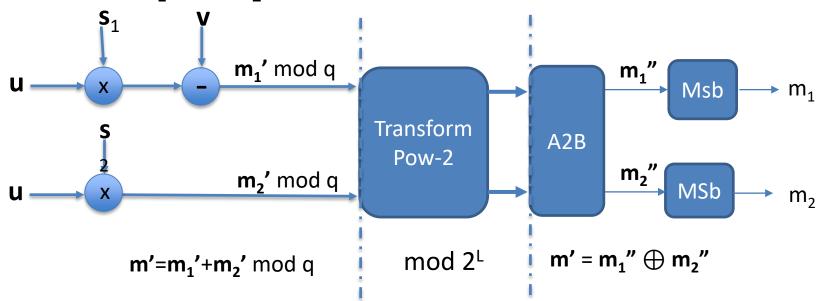
Assume that m_1' and m_2' are in (mod 2^k) for some k



A2B requires inputs to be modulo power-of-2

Masked Decoder with A2B approach [OSPG18]

Assume that m_1' and m_2' are in (mod q) where $q \neq 2^k$

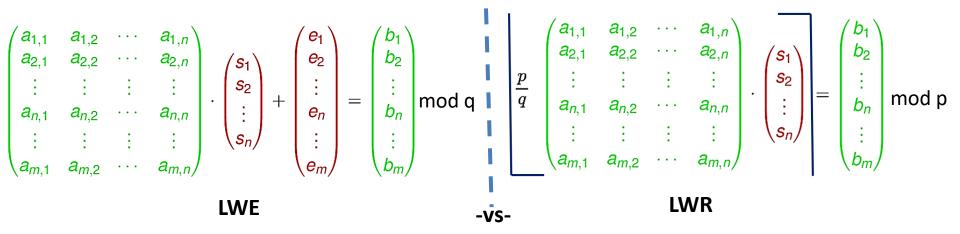


An additional block "Transform-Power-of-2" is needed [OSPG18]

[OSPG18] T. Oder, T. Schneider, T. Pöppelmann, T. Güneysu. "Practical CCA2-Secure and Masked Ring-LWE Implementation". TCHES 2018

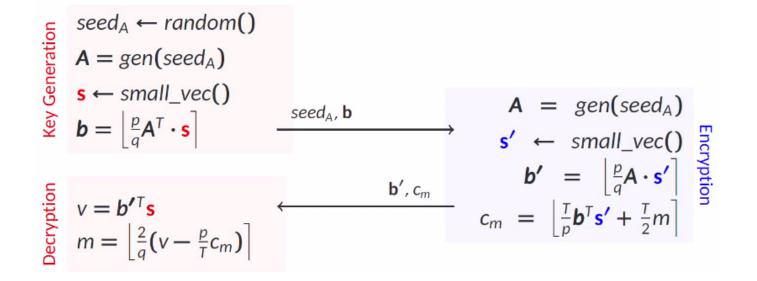
Masking implementation: Case study for Saber KEM

• Saber uses Module LWR problem



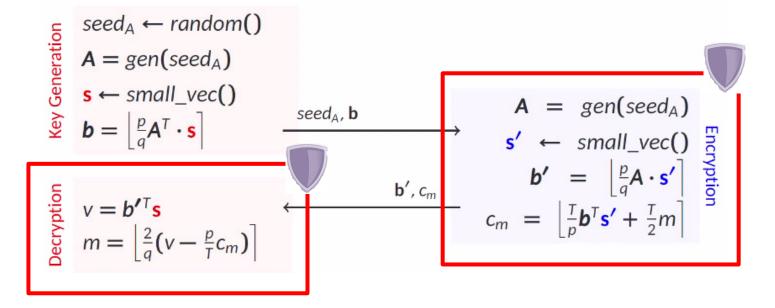
- No explicit noise generation.
- Saber uses power-of-2 moduli p=2¹⁰ and q=2¹³
 → Rounding becomes bit-shift

Saber protocol



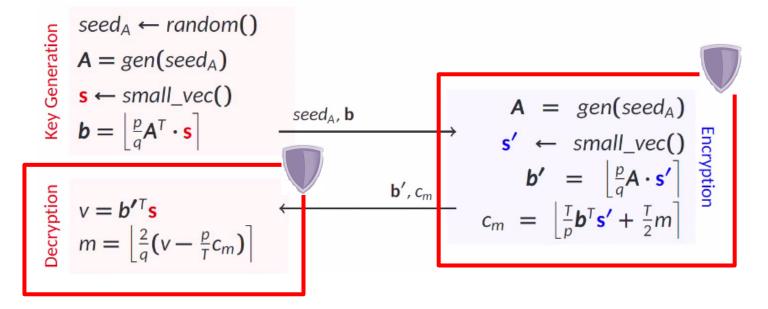
Saber.KEM is obtained via the Fujisaki-Okamoto transform.

Saber KEM with masking



Masking of **decryption + re-encryption + ct comparison**

Saber KEM with masking



Masking of decryption + re-encryption + ct comparison

Building blocks that should be protected:

- Polynomial addition and multiplication
- Rounding (i.e., bit-shifting)

- Keccak-based functions: SHA, SHAKE
- Binomial sampling
- Comparison of ciphertexts

Masking of rounding in Saber

- As *p* and *q* are powers-of-2, rounding is bit-shifting in Saber
- Bit-shifting is easy with Boolean shares
 To perform x>>k, shift x₁>>k and x₂>>k where x = x₁⊕ x₂
- However, inputs to rounding are arithmetic shares
 - E.g. Output of polynomial arithmetic is rounded
- Idea: Apply A2B transformation before rounding. Apply B2A transformation after rounding.
- [BDKBV20] proposes an *optimized implementation* that combines A2B+Shifting+B2A

[BDKBV20] MV. Beirendonck, JP D'Anvers, A. Karmakar, J. Balasch, I. Verbauwhede. "A Side-Channel Resistant Implementation of SABER", ACM JETC.

Masking of binomial sampling in Saber

• Binomial sampling: Pseudo-random strings x and y as inputs. Produces

Sample z = HammingWeight(x) - HammingWeight(y)

- Easy to compute on arithmetic shares.
- However, pseudorandom strings are generated by Keccak

Keccak
$$\rightarrow$$
 x Masked \rightarrow x₁
Keccak \rightarrow x₂ Boolean shares

Optimized: [BDKBV20] evaluates 'half adder/subtractor circuits' on Boolean shares
 > Uses bit-slicing to improve performance

Results: 1st order masking of Saber

SW Results (ARM M4) [BDKBV20]

- Masked IND-CCA decapsulation has 2.5x cycle counts as overhead
- Overall masked decapsulation takes < 3M cycles
- Memory requirement increases by 1.84x

What helps masking in Saber?

- Power-of-2 moduli → Easier A2B conversions
- LWR has implicit error \rightarrow Less error sampling

Preliminary HW Results (Xilinx FPGA)

Ongoing work by A. Basso, L. Prakop, and S. S. Roy

- Masked IND-CCA decapsulation has 2.4x cycle counts as overhead
- Area increase 1.3x

Outline

Background:

- Learning With Error (LWE) Problem
- LWE/LWR-based PKE Framework (Main Focus)

Overview of Side-Channel Attacks:

- □ Algorithmic-Level
- □ Implementation-Level

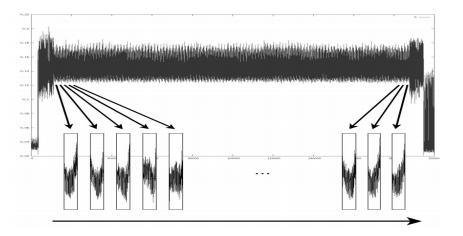
Overview of Side-Channel Countermeasures:

Implementation-based SCA on LWE/LWR-based PKE/KEMs

Major Computation Sub-blocks:

- Delynomial/Matrix-Vector Multiplication
- □ Error/Secret Sampler (Gaussian/Sub-Gaussian Distribution)
- □ PRF/PRNG Extendable Output Function (XOF (e.g.) SHAKE)

Single-trace key recovery attacks using power/EM side-channel - Most Potent



Modus Operandi:

Partition Trace into sub-traces (sensitive intermediates)

Two common ways to extract information:

- □ Horizontal CPA/DPA [CFG+10]
- Template Matching and Algebraic techniques (Soft-Analytical SCA [VGS14])

[CFG+10] Clavier, Christophe, Benoit Feix, Georges Gagnerot, Mylène Roussellet, and Vincent Verneuil. "Horizontal correlation analysis on exponentiation." In *International Conference on Information and Communications Security*, pp. 46-61. Springer, Berlin, Heidelberg, 2010. [VGS14] Veyrat-Charvillon, Nicolas, Benoît Gérard, and François-Xavier Standaert. "Soft analytical side-channel attacks." In *International Conference on the Theory and Application of Cryptology and Information Security*, pp. 282-296. Springer, Berlin, Heidelberg, 2014.

Implementation-based SCA on LWE/LWR-based PKE/KEMs

Single Trace Key Recovery Attacks (Implementation Level)

Reported Works	Attack Technique	Target Scheme
School Book Multiplier (Poly Mul./Matrix-Vector Mul.)		
Aysu et al. [ATT+18]	Horizontal DPA (Extend and Prune)	Frodo and NewHope
Bos et al. [BFM+18]	Template Attack (Extend and Prune)	Frodo
Number Theoretic Transform (Poly Mul.)		
Primas et al. [PPM17]	Template Attack (SASCA)	Generic LWE/LWR-based PKE
Pessl et al. [PP20]	Template Attack (SASCA)	Generic LWE/LWR-based PKE
SHAKE (PRNG)		
Kannwischer et al. [KPP20]	Template Attack (SASCA)	Generic LWE/LWR-based PKE

Implementation-based SCA on LWE/LWR-based PKE/KEMs

Advantages:

- Single Trace Key Recovery
- Only Side-Channel information sufficient (No communication with target-device)

Disadvantages:

- □ Requires some/complete knowledge of implementation
- □ Sensitive to SNR (horizontal noise (jitter))

Countermeasures:

Shuffling of intermediate operations within single computation [ZBT19, RPBC20]

[ATT⁺18] Aysu, Aydin, Youssef Tobah, Mohit Tiwari, Andreas Gerstlauer, and Michael Orshansky. "Horizontal side-channel vulnerabilities of post-quantum key exchange protocols." In 2018 IEEE International Symposium on Hardware Oriented Security and Trust (HOST), pp. 81-88. IEEE, 2018.

[PPM17] Primas, Robert, Peter Pessl, and Stefan Mangard. "Single-trace side-channel attacks on masked lattice-based encryption." In International Conference on Cryptographic Hardware and Embedded Systems, pp. 513-533. Springer, Cham, 2017.

[PP19] Pessl, Peter, and Robert Primas. "More practical single-trace attacks on the number theoretic transform." In International Conference on Cryptology and Information Security in Latin America, pp. 130-149. Springer, Cham, 2019.

[HCY20] Huang, Wei-Lun, Jiun-Peng Chen, and Bo-Yin Yang. "Power analysis on NTRU prime." IACR Transactions on Cryptographic Hardware and Embedded Systems (2020): 123-151.

[KPP20] Kannwischer, M. J., Pessl, P., & Primas, R. (2020). Single-Trace Attacks on Keccak. IACR Transactions on Cryptographic Hardware and Embedded Systems, 2020(3), 243-268.

[BFM+18] Bos, Joppe W., Simon Friedberger, Marco Martinoli, Elisabeth Oswald, and Martijn Stam. "Assessing the feasibility of single trace power analysis of frodo." In *International Conference on Selected Areas in Cryptography*, pp. 216-234. Springer, Cham, 2018.

[RPBC20] Ravi, Prasanna, Romain Poussier, Shivam Bhasin, and Anupam Chattopadhyay. "On Configurable SCA Countermeasures Against Single Trace Attacks for the NTT." In International Conference on Security, Privacy, and Applied Cryptography Engineering, pp. 123-146. Springer, Cham, 2020.

[ZBT19] Zijlstra, Timo, Karim Bigou, and Arnaud Tisserand. "FPGA implementation and comparison of protections against SCAs for RLWE." In *International Conference on Cryptology in India*, pp. 535-555. Springer, Cham, 2019.

Outline

- Background:
 - Learning With Error (LWE) Problem
 - LWE/LWR-based PKE framework
- Overview of side-channel attacks:
 - Algorithmic-level
 - Implementation-level
- Overview of masking countermeasures:
- Conclusions and future works:

Conclusion:

U We cannot ignore side-channel security of lattice-based schemes

Several practical attacks which break only with a very few traces.

□ Requirement of more analysis of SCA-protected implementations of lattice-based schemes.

Scope for improvement in efficiency of masking countermeasures for LWE/LWR-based PKE/KEMs.

Requirement of new techniques to concretely estimate security after SCA
 Leaky LWE Estimator (Toolkit: https://github.com/lducas/leaky-LWE-Estimator)

Future Works:

More Attacks

□ Scope for algorithmic-level SCA on NTRU:

- Existing SCA mostly target the polynomial multiplier [ABGV08,MKS⁺10,WZW13,ZWW13,SMS19,HCY20]
- Several PC Oracle-based key recovery attacks known for NTRU-based schemes [JJ00, GP07, ZCQ⁺21, DDS⁺19]

Countermeasures

- □ Fully masked implementations
- □ Scheme-specific countermeasures

References:

[JJ00] Jaulmes, Éliane, and Antoine Joux. "A chosen-ciphertext attack against NTRU." In *Annual International Cryptology Conference*, pp. 20-35. Springer, Berlin, Heidelberg, 2000.

[GP07] Gama, Nicolas, and Phong Q. Nguyen. "New chosen-ciphertext attacks on NTRU." In *International Workshop on Public Key Cryptography*, pp. 89-106. Springer, Berlin, Heidelberg, 2007.

[ZCQ⁺21] Zhang, Xiaohan, Chi Cheng, Yue Qin, and Ruoyu Ding. "Small Leaks Sink a Great Ship: An Evaluation of Key Reuse Resilience of PQC Third Round Finalist NTRU-HRSS."

[DDS⁺19] Ding, J., Deaton, J., Schmidt, K., Vishakha, Zhang, Z.: A simple and efficient key reuse attack on ntru cryptosystem (2019), https://eprint.iacr. org/2019/1022

[MKS⁺10] LEE Mun-Kyu, Jeong Eun Song, and HAN Dong-Guk. Countermeasures against power analysis attacks for the NTRU public key cryptosystem. IEICE transactions on fundamentals of electronics, communications and computer sciences, 93(1):153–163, 2010.

[WZW13] An Wang, Xuexin Zheng, and Zongyue Wang. Power analysis attacks and countermeasures on NTRU-based wireless body area networks. TIIS, 7(5):1094–1107, 2013.

[ZWW13] Xuexin Zheng, An Wang, and Wei Wei. First-order collision attack on protected NTRU cryptosystem. Microprocessors and Microsystems -Embedded Hardware Design, 37(6-7):601–609, 2013.

[ABGV08] AC Atici, Lejla Batina, Benedikt Gierlichs, and Ingrid Verbauwhede. Power analysis on NTRU implementations for RFIDs: First results. In The 4th Workshop on RFID Security, July 9th -11th, Budapest, 2008

[HCY20] Huang, Wei-Lun, Jiun-Peng Chen, and Bo-Yin Yang. "Power analysis on NTRU prime." *IACR Transactions on Cryptographic Hardware and Embedded Systems* (2020): 123-151.

[SMS19] Schamberger, Thomas, Oliver Mischke, and Johanna Sepulveda. "Practical evaluation of masking for NTRUEncrypt on ARM Cortex-M4." In *International Workshop on Constructive Side-Channel Analysis and Secure Design*, pp. 253-269. Springer, Cham, 2019.