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Side-Channel Attacks On Implementations Of Lattice-Based Cryptosystems

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Abstract

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The abstract should convey to the reader concisely and accurately within the space of a few sentences, the claim to knowledge that the authors are making. It should indicate the boundaries of space and time within which the enquiry has occurred. If there is a claim to generality beyond the boundaries of the enquiry the basis of that claim should be given, for example that a random sample is thought to be representative of a larger population. There should also be a hint of the method of enquiry.

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The abstract should be a condensation of the substance of the paper, not a trailer, nor an introduction. Journals and thesis regulations usually put a limit of around 200 to 300 words to the length of an abstract. Trailer is a term borrowed from the cinema industry to describe a showing of a few highlights in order to win an audience. An Introduction tells that something is coming, but doesnt reveal its substance. These are not what is needed.

Abstracts are recycled in abstract journals and electronic networks and provide the main vehicle for other researchers to become aware of particular studies. Hence the more clearly they convey the claim to knowledge of the original paper the more useful they are in helping the reader to decide whether it is worth taking the trouble to obtain and read the original and possibly cite it in his/her own writing.

Both the abstract and the paper should make sense without the other.

¹Shamelessly ripped from http://www.leeds.ac.uk/educol/abstract.htm

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Acronyms

DPA Differential Power Analysis

HO-DPA Higher Order Differential Power Analysis

NTT Number Theoretic Transform

ring-LWE Ring Learning with Errors Problem

LPR Lyubashevsky-Peikert-Regev

PRNG Pseudo Random Number Generator

1. Introduction

Despite the rapid progress in the development of quantum computers and the hereby increasingly urgent need for post-quantum cryptographic algorithms, no such algorithms has yet been standardized [CJL⁺16]. Current public-key cryptosystems like RSA, DHKE or even elliptic curve cryptography could easily be broken by a quantum computer, due to Shor's algorithm for prime factorization and discrete logarithms [Sho97]. As most of today's digital infrastructure depends (at least partially) on such public-key algorithms, the need for efficient and secure cryptography that can withstand the power of quantum computation is as high as never before.

Lattice-based cryptography is the most promising of all attempts in post-quantum cryptography, as its underlying mathematics are already well understood and reasonably efficient implementations of some of the proposed cryptographic schemes are available today. Our paper will give an overview over some selected lattice-based algorithms and their implementation in respect to their resistance to various side-channel attack techniques.

1.1. Related Work

This paper summarizes the content of several other papers, that have been published in recent years. Some of them are referred to below and we strongly recommend to take a look at them.

Shortly after the ring-LWE problem was introduced in [LPR12] in 2012, the authors of [RRVV15] laid the groundwork for masked implementations of one ring-LWE encryption scheme and refined it in [RdCR+16] by getting rid of the need for a masked decoder. Just a year after the ring-LWE encryption scheme was introduced, the authors of [DDLL13] proposed the BLISS signature scheme, which is as well based on the ring-LWE problem. A possible side-channel attack on a slightly altered version of that signature scheme was then shown in [BHLY16] in 2016, which might be prevented by the blinding techniques used by the authors of [Saa16].

1.2. Structure of this Paper

In Section 2 we will start with an explanation of our notation and give an overview over the mathematic background needed to understand this paper. This includes introducing the reader to the concept of (ideal) lattices, the Ring Learning with Errors Problem (ring-LWE), Discrete Gaussian Distributions, a ring-LWE Encryption Scheme and the BLISS Signature Scheme. Additionally, we will give a short explanation of the side-channel attack terminology used throughout this paper.

Section 3 will deal with the ring-LWE encryption scheme and will be split into two parts, starting with the description of a masked implementation of the decryption function, including a masked decoder build upon a masked table lookup. The second part of this section will be an evaluation of the proposed implementation in respect to its soundness to first- and second-order side-channel attacks.

A different approach to masking of the ring-LWE encryption scheme will be presented in Section 4 of our paper, which will as well be split into a description of the proposed scheme and an evaluation. Furthermore, the second masking scheme will be compared to the first one in respect to efficiency and complexity. Section 5 will discuss the FLUSH+RELOAD cache attacks on the Gaussian sampler used in the BLISS signature scheme. This part will start with a description of a perfect side channel attack on two Gaussian sampling algorithms, namely the cumulative distribution function (CDT sampling) and rejection sampling. This will be followed by an evaluation of the FLUSH+RELOAD attacks on an actual BLISS implementation, while running on modern CPUs.

Furthermore, in Section 6 we will be presenting two measures used for blinding polynomial multiplication and Gaussian sampling, which might help against the attacks described in Section 5.

Finally, Section 7 will summarize the content of our paper shortly and some conclusions will be drawn.

2. Theoretical Background

2.1. Notation

As we will only work with ideal lattices in our paper, all operations will be done within the ring $R_q = \mathbb{Z}_q[x]/(f(x))$ with f(x) being an irreducible polynomial of degree n and all coefficients being reduced modulo q.

Polynomials will be written as bold lower case letters (\mathbf{f}). As we will use the *Number Theoretic Transform* (NTT) for efficient polynomial multiplication within a ring R_q , polynomials in the NTT domain will be written as $\tilde{\mathbf{f}}$. Vectors will be denoted with an arrow on top of them (\vec{x}), while matrices will be denoted by bold upper case letters (\mathbf{A}). The entries of a vector \vec{x} will be called x_i , with i specifying the position within the vector starting at 0.

The notation for the l_p norm of a vector \vec{x} will be $||\vec{x}||_p$, only with the exception of the l_2 norm, which will be referred to as $||\vec{x}|| = \sqrt{\sum_i x_i^2}$.

2.2. Ideal Lattices

A lattice Λ is discrete subgroup of \mathbb{R}^n that is defined as a set of $m \leq n$ linearly independent vectors $\vec{b}_1, ..., \vec{b}_m \in \mathbb{R}^n$ and is generated by all linear combinations of those \vec{b}_i 's with integer coefficients:

$$\Lambda(\vec{b}_1, ..., \vec{b}_m) = \left\{ \sum_{i=1}^m x_i \vec{b}_i \mid x_i \in \mathbb{Z} \right\}$$
(2.1)

The set $\{\vec{b}_1,...,\vec{b}_m\}$ of those vectors is called the basis of that lattice, which commonly is represented by a matrix $\mathbf{B} = (\vec{b}_1,...,\vec{b}_m)$.

Furthermore, an ideal lattice is is lattice that corresponds to ideals in a ring R_q . From this it follows that we can deal with polynomials instead of matrices, which makes arithmetics used for cryptographic applications much more efficient. In our paper we will confine ourselves to those ideal lattices, as most of the current work in that area focuses around them. For more on the topic of ideal lattices, see [LPR12].

2.3. Ring Learning with Errors Problem

The Ring Learning with Errors Problem (ring-LWE) has been introduced in [LPR12] in 2012. There are two instances of the ring-LWE, a search one and a decisional one. For both of them, we can state that there is a given $\mathbf{s} \in R_q$. Next, an error polynomial $\mathbf{e}_i \in R_q$ is sampled from the discrete Gaussian distribution $\mathcal{N}^n_{\mathbb{Z}}(0, \sigma^2)$ and another polynomial $\mathbf{a}_i \in R_q$ is sampled uniformy at random. Finally, a polynomial \mathbf{b}_i is computed as $\mathbf{b}_i = (\mathbf{a}_i \cdot \mathbf{s}) + \mathbf{e}_i$.

For the search ring-LWE problem, one needs to find the unknown polynomial s for a given pair $(\mathbf{a}_i, \mathbf{b}_i)$. The decisional ring-LWE problem is about distinguishing between pairs $(\mathbf{a}_i, \mathbf{b}_i)$ that have actually been computed the way described before and pairs $(\mathbf{a}_i, \mathbf{b}_i)$ that have been sampled uniformly at random in R_q .

2.4. Discrete Gaussian Distribution

The discrete Gaussian distribution with mean μ and standard deviation σ is denoted as $\mathcal{N}_{\mathbb{Z}}(\mu, \sigma^2)$. In this paper we will focus on zero-centered distributions $\mathcal{N}_{\mathbb{Z}}(0, \sigma^2)$ with a density function $\rho_{\sigma}(x)$ given by:

$$\rho_{\sigma}(x) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{x^2}{2\sigma^2}} \tag{2.2}$$

The probability function of discrete Gaussian distribution over \mathbb{Z} is then defined as $D_{\sigma}(x) = \rho_{\sigma}(x)/\rho_{\sigma}(\mathbb{Z})$ with $\rho_{\sigma}(\mathbb{Z}) = \sum_{y=-\infty}^{\infty} \rho_{\sigma}(y)$. As we will sample entire vectors most of the time, we denote the discrete Gaussian distribution over \mathbb{Z}^m as $\mathcal{N}^n_{\mathbb{Z}}(\mu, \sigma^2)$ and its probability function as $D^m_{\sigma}(\vec{x}) = \rho_{\sigma}(\vec{x})/\rho_{\sigma}(\mathbb{Z})^m$ with $\rho_{\sigma}(\vec{x})$ being defined as follows:

$$\rho_{\sigma}(\vec{x}) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{\|\mathbf{x}\|^2}{2\sigma^2}} \tag{2.3}$$

2.5. Cryptographic Algorithms

This Section will give a short overview of two cryptographic algorithms, that are based on ideal lattices and the ring-LWE problem. While the first algorithm can exclusively be used for encryption, the second one is a signature algorithm. For more information on the mathematical background of those algorithms, we would like to refer you to the cited papers.

2.5.1. Ring-LWE Encryption Scheme

In our paper we focus on the encryption scheme published in [LPR12], which will be referred to as Lyubashevsky-Peikert-Regev (LPR). This scheme consists

of three main operations: Key Generation, Encryption and Decryption. The globally known parameters of this scheme are (n, q, σ) and a polynomial \mathbf{g} . The dimension of the polynomial ring R_q is defined by n, while q is the modulus. The standard deviation of the discrete Gaussian distribution is given by σ .

Key Generation: In this step, the coefficients of the two polynomials \mathbf{r} and \mathbf{s} are sampled according to the discrete Gaussian distribution $\mathcal{N}_{\mathbb{Z}}^n(0, \sigma^2)$. Then the public key \mathbf{p} is computed by $\mathbf{p} = \mathbf{r} - \mathbf{g} \cdot \mathbf{s}$. The resulting output is a key pair (\mathbf{p}, \mathbf{s}) with \mathbf{p} being the public key and \mathbf{s} being the secret key.

Encryption: The encryption phase takes a n-bit message \mathbf{m} and the public key \mathbf{p} as input. Initially, the message \mathbf{m} is encoded as an element of the ring R_q by multiplying each of its bits by q/2 and is then denoted by \mathbf{m}_{enc} . In the following step, three error polynomials \mathbf{e}_1 , \mathbf{e}_2 and \mathbf{e}_3 are sampled according to $\mathcal{N}^n_{\mathbb{Z}}(0, \sigma^2)$ and will be used as noise. The ciphertext then consists of two parts $(\mathbf{c}_1, \mathbf{c}_2)$, with $\mathbf{c}_1 = \mathbf{g} \cdot \mathbf{e}_1 + \mathbf{e}_2$ and $\mathbf{c}_2 = \mathbf{p} \cdot \mathbf{e}_1 + \mathbf{e}_3 + \mathbf{m}_{enc}$. The encryption algorithm returns the ciphertext $(\mathbf{c}_1, \mathbf{c}_2)$.

Decryption: For decryption, we start by computing $\mathbf{m}_{enc} = \mathbf{c}_1 \cdot \mathbf{s} + \mathbf{c}_2$. To decode \mathbf{m}_{enc} , we need a function $\text{DECODE}(m_{enc,i})$ with $m_{enc,i}$ being an element of \mathbf{m}_{enc} . One possible function is given below:

DECODE
$$(x) = \begin{cases} 0, & \text{if } x \in (0, q/4) \cup (3q/4, q) \\ 1, & \text{if } x \in (q/4, 3q/4) \end{cases}$$
 (2.4)

2.5.2. BLISS Signature Scheme

Algorithm 1 BLISS KEY GENERATION

Output: BLISS key pair (\mathbf{A}, \mathbf{S}) with public key $\mathbf{A} = (\mathbf{a}_1, \mathbf{a}_2) \in R_{2q}^2$ and secret key $\mathbf{S} = (\mathbf{s}_1, \mathbf{s}_2) \in R_{2q}^2$, such that $\mathbf{AS} = \mathbf{a}_1 \cdot \mathbf{s}_1 + \mathbf{a}_2 \cdot \mathbf{s}_2 \equiv q \mod 2q$

- 1: Choose $\mathbf{f}, \mathbf{g} \in R_{2q}$ uniformly at random with exactly d_1 entries in $\{\pm 1\}$ and d_1 entries in $\{\pm 2\}$
- 2: $\mathbf{S} = (\mathbf{s}_1, \mathbf{s}_2) = (\mathbf{f}, 2\mathbf{g} + 1)$
- 3: if f violates certain conditions (see [DDLL13]) then
- 4: Restart
- 5: end if
- 6: $\mathbf{a}_q = (2\mathbf{g} + 1)/\mathbf{f} \mod q$ (restart if \mathbf{f} is not invertible)
- 7: **return** (\mathbf{A}, \mathbf{S}) with $\mathbf{A} = (2\mathbf{a}_q, q 2) \mod 2q$

Algorithm 2 BLISS SIGNATURE ALGORITHM

```
Input: Message \mu, public key \mathbf{A} = (\mathbf{a}_1, q - 2), secret key \mathbf{S} = (\mathbf{s}_1, \mathbf{s}_2)
Output: Signature (\mathbf{z}_1, \mathbf{z}_2^{\dagger}, \mathbf{c}) \in \mathbb{Z}_{2q}^n \times \mathbb{Z}_p^n \times \{0, 1\}^n
```

- 1: $\mathbf{y}_1, \mathbf{y}_2 \leftarrow \mathcal{N}^n_{\mathbb{Z}}(0, \sigma^2)$
- 2: $\mathbf{u} = \zeta \cdot \mathbf{a}_1 \cdot \mathbf{y}_1 + \mathbf{y}_2 \mod 2q$
- 3: $\mathbf{c} = H(\lfloor \mathbf{u} \rceil_d) \mod p, \, \mu$
- 4: Choose a random bit b
- 5: $\mathbf{z}_1 = \mathbf{y}_1 + (-1)^b \mathbf{s}_1 \cdot \mathbf{c} \mod 2q$
- 6: $\mathbf{z}_2 = \mathbf{y}_2 + (-1)^b \mathbf{s}_2 \cdot \mathbf{c} \mod 2q$
- 7: Continue with a probability based on σ , $\|\mathbf{Sc}\|$, $\langle \mathbf{z}, \mathbf{Sc} \rangle$ (see [DDLL13]), else restart
- 8: $\mathbf{z}_2^{\dagger} = (\lfloor \mathbf{u} \rceil_d \lfloor \mathbf{u} \mathbf{z}_2 \rceil_d) \mod p$
- 9: return $(\mathbf{z}_1, \mathbf{z}_2^{\dagger}, \mathbf{c})$

Algorithm 3 BLISS VERIFICATION ALGORITHM

```
Input: Message \mu, public key \mathbf{A} = (\mathbf{a}_1, q - 2), signature (\mathbf{z}_1, \mathbf{z}_2^{\dagger}, \mathbf{c})
```

- 1: if $\mathbf{z}_1, \mathbf{z}_2^{\dagger}$ violate certain conditions (see [DDLL13]) then
- 2: Reject
- 3: end if
- 4: if $\mathbf{c} = H(\lfloor \zeta \cdot \mathbf{a}_1 \cdot \mathbf{z}_1 + \zeta \cdot q \cdot \mathbf{c} \rceil_d + \mathbf{z}_2^{\dagger} \mod p, \mu)$ then
- 5: Accept
- 6: end if

2.6. Side-Channel Attack Terminology

Side-channel attacks use leaked information from physical implementations of cryptographic algorithms to conclude secret information like encryption keys. Such leakage could e.g. be the power consumption during cryptographic operations. One type of attacks that makes use of leakages through power consumption is *Differential Power Analysis (DPA)*.

To perform a DPA, one needs to correlate a leakage with a prediction made on a special value that depends on both, the secret key and the plaintext. Such a value is called a sensitive variable. A common countermeasure to DPA is masking, where sensitives variables are randomly split into d shares. A masking approach with d shares is reffered to as a (d-1)-th order masking, as d-1 shares are picked randomly and the last share is computed in a way, that the combination of all d shares equals the shared sensitive variable. To defeat this kind of countermeasures, the class of Higher Order Differential Power Analysis (HO-DPA) has been introduced. To overcome (d-1)-th order masking, d-th order DPA is needed, which can be done by combining the leakage of d different signals that correspond to the d shares of the sensitive variable. Theoretically, higher order masking can always be defeated by HO-DPA. However, the difficulty of HO-DPA is growing exponentially due to noise effects. In practice, first order masking is most commonly used, thus there is a big focus on second order DPA in research.

3. Masking the Ring-LWE Encryption Scheme Using a Masked Decoder

Since most side-channel attacks focus on the decryption operation, this section will present an attempt to masking the decryption function of the $LPR\ ring-LWE$ encryption scheme. This masking approach was originally proposed in [RRVV15], for more details we would refer you to that paper.

3.1. Implementation

We will start by giving the reader an overview of the general setup, before going into more detail about the masked decoding algorithms. We will make strong use of the NTT in this chapter. We recall, that our notation for polynomials in the NTT domain is $\tilde{\mathbf{f}}$. The NTT operation itself will be denoted as NTT(.), while its inverse operation will be written as INTT(.). We want to stress, that NTT(.) and INTT(.) are linear operations, as we will use this characteristic for our blinding technique.

3.1.1. Overview

This Subsection will cover a concise overview of the blinding technique proposed in [RRVV15]. For the sake of simplicity, the intermediate \mathbf{m}_{enc} will be referred to as \mathbf{a} in the following.

We start by splitting the secret key \mathbf{s} into two shares $\mathbf{s}', \mathbf{s}'' \in R_q$ such that $\mathbf{s} = \mathbf{s}' + \mathbf{s}''$. Therefore, we choose all coefficients of \mathbf{s}' uniformly at random and calculate $\mathbf{s}'' = \mathbf{s} - \mathbf{s}'$. In the *NTT* domain it follows that $\tilde{\mathbf{s}} = \tilde{\mathbf{s}}' + \tilde{\mathbf{s}}''$. Due to the linearity of INTT(.) and the multiplication, we can compute \mathbf{a} as:

$$\mathbf{a} = \text{INTT}(\tilde{\mathbf{s}} \cdot \tilde{\mathbf{c}}_1 + \tilde{\mathbf{c}}_2) = \text{INTT}(\tilde{\mathbf{s}}' \cdot \tilde{\mathbf{c}}_1 + \tilde{\mathbf{c}}_2) + \text{INTT}(\tilde{\mathbf{s}}'' \cdot \tilde{\mathbf{c}}_1)$$
(3.1)

This enables us to split the whole equation into two branches, calculating \mathbf{m}'_{enc} and \mathbf{m}''_{enc} in the following way:

$$\mathbf{a}' = \text{INTT}(\tilde{\mathbf{s}}' \cdot \tilde{\mathbf{c}}_1 + \tilde{\mathbf{c}}_2), \ \mathbf{a}'' = \text{INTT}(\tilde{\mathbf{s}}'' \cdot \tilde{\mathbf{c}}_1)$$
 (3.2)

Those computations can be done on a arithmetic processor without any protection against side-channel attacks like DPA, as both branches are totally independent of our secret key s.

However, the DECODE(a_i) function in the decryption stage of the LPR scheme is non-linear and cannot easily be split into two parts. For this reason, we will present a masked decoder in the next Subsection, that takes \mathbf{a}' and \mathbf{a}'' as inputs to compute two shares \mathbf{m}' , \mathbf{m}'' of the decoded message \mathbf{m} in a fairly efficient way.

3.1.2. Masked Decoder

This Section briefly describes a probabilistic masked decoder. We recall, that the *i*-th element of a is called a_i and the shares (a'_i, a''_i) of such an element are chosen in a way, that $a'_i + a''_i = a_i \pmod{q}$. To keep it simple, we will refer to an arbitrary a_i as a, the same follows for its shares.

For our masked decoder, we do not need to know the exact values of a' and a'' to compute $\mathsf{DECODE}(a)$. The following example will help us to lay down some rules for the decoder: Given (a', a'') with 0 < a' < q/4 and q/4 < a'' < q/2. Then know that for a = a' + a'' it follows, that q/4 < a < 3q/4 and therefore $\mathsf{DECODE}(a) = 1$. We only need to know the most significant bits of a' and a'' to determine, which values they are bounded by.

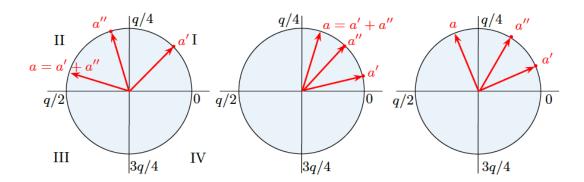


Figure 3.1.: The basic idea of our masked decoder. The circle represents elements in \mathbb{Z}_q . The first case shown allows us to conclude $\mathsf{DECODE}(a) = 1$, while we cannot make any guesses about the last two ones. [RRVV15]

Figure 3.1 shows our example from above on the left. We can use this knowledge to state a total of four rules, the first of whom is taken from our example:

- $\bullet \ 0 < a' < q/4, \, q/4 < a'' < q/2 \implies a \in (q/4, 3q/4) \implies \mathrm{Decode}(a) = 1$
- $\bullet \ q/2 < a' < 3q/4, \, 3q/4 < a'' < q \implies a \in (q/4, 3q/4) \implies \mathrm{Decode}(a) = 1$
- $q/4 < a' < q/2, \ q/2 < a'' < 3q/4 \implies a \in (0, q/4) \cup (3q/4, q) \implies \text{Decode}(a) = 0$

•
$$3q/4 < a' < q, 0 < a'' < q/4 \implies a \in (0, q/4) \cup (3q/4, q) \implies Decode(a) = 0$$

With swapping a' and a'' in the above rules, one can obtain another four rules. From the rules it follows, that we only need to know the quadrant of each a' an a'' to infer the output of DECODE(a). However, this does not work for all cases, as Figure 3.1 shows. We can actually only apply those rules in half of the possible cases.

So, what happens if our (a', a'') does not match any rule? We simply need to refresh the splitting by computing $a' = a' + \Delta_1$ and $a'' = a'' - \Delta_1$ with $\Delta_i \in \mathbb{Z}_q$. From $(a' + \Delta_1) + (a'' - \Delta_1) = a' + a'' = a$ it follow, that a stays unchanged by that refresh. Now that we have a fresh pair (a', a''), we can again try to apply our rules from above. This process can be repeated until all shares have been decoded. Note, that a new Δ_i should be chosen for each iteration. About half of the a', a'' are decoded per iteration, so that the amount of decoded shares rises exponentially with the number of iterations. The authors of [RRVV15] propose a number of N = 16 iterations for a satisfactory result.

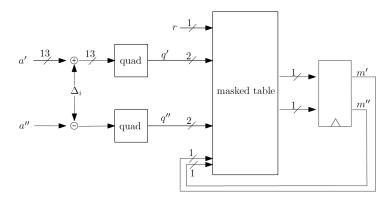


Figure 3.2.: Hardware implementation of the masked decoder. [RRVV15]

A possible hardware implementation of such a masked decoder is shown in Figure 3.2. The refreshing step is depicted on the left, using a different Δ_i in each iteration. The quadrant function used in the next step simply takes a refreshed share a' or a'' as an input and outputs two bits depending on the quadrant that the share belongs to. Next, a masked table is used to check the two bits against the rules we described above. Finally, the masked table function returns two one bit shares of the decoded message m. In our implementation the masked takes additional inputs, like a random bit r and the output of the last iteration (m'_{i-1}, m''_{i-1}) . For more details on the masked table lookup, we would like to refer you to the paper of Oscar Reparaz et. al. [RRVV15].

3.2. Evaluation

Starting with efficiency, Reparaz et. al. showed that this implementation is at least 1.9x times better on a Virtex-2 FPGA than an unprotected high-speed elliptic curve scalar multiplier architecture introduced in [RRM12].

Furthermore, as both, the LPR ring-LWE encryption scheme and our masked decoder, are probabilistic, there will always be a chance for errors occurring during decoding. The global error rate of decoding rises significantly when using our masked decoder instead of a deterministic decoder. To offset this effect, we can adapt the number of iterations for the masked decoder. While for N=3 iterations the global error rate is about 49 times larger than when using a deterministic decoder, N=16 iterations yield a global error rate that is almost identical with the one of a deterministic decoder. Further improvement could be achieved by increasing the number of iterations again, but this would lead to a significantly higher cycle count and thus to a much more inefficient implementation.

For our evaluation in terms of side-channel attack soundness, we assume the attacker knows the details of our implementation and is aware of the rest of the key while guessing a subkey. Our evaluation will follow three steps: First, we perform a first-order key recovery attack with our source of randomness (PRNG) turned off. This attack will be successful, showing that our setting is correct. In the second step, we will turn on the PRNG and repeat the same attack, but it should not be successful in this case. Finally, we perform a second-order attack to confirm the correctness of the first two steps.

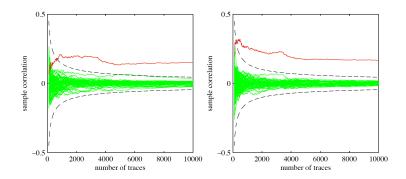


Figure 3.3.: PRNG is turned off. Graph shows the correlation coefficient increasing with the number of traces for the intermediates a'_0 (left) and a''_0 (right). The correct subkey is shown in red, all other guesses in green. [RRVV15]

For each of those steps, four different points that cover all relevant steps of the algorithm have been tested. The targets are a'_0 , a''_0 , the first input to the masked

3.2 Evaluation 13

decoder and the first output bit. Pearson's correlation coefficient has been used to compare our guesses with real measurements [BCO04].

PRNG off: When the Pseudo Random Number Generator (PRNG) is turned off, sharing of s in s' and s" is deterministic. This translates to the masking being turned off. Figure 3.3 shows the correlation coefficient evolving with the number of traces. The attack seems to be successful starting at about a hundred traces.

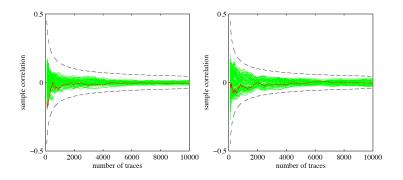


Figure 3.4.: Same as Figure 3.3, but with the PRNG turned on. It is no longer possible to identify the correct subkey within all guesses, meaning that the masking is successful. [RRVV15]

PRNG on: When the *PRNG* is turned on, the masking is effective. As we can see in Figure 3.4, the correct subkey can no longer be distinguished from all the other guesses, not even with an enormous amount of traces. This is what an attacker would see when conducting an first-order *DPA* on our masking scheme.

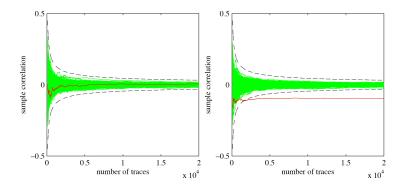


Figure 3.5.: On the left is the correlation for an increasing number of traces of a first-order attack with masking turned on. On the right we can see a successful second-order attack on our decoding scheme with masking turned on. [RRVV15]

Second-Order Attack: To confirm that we have used a sufficient number of

traces in the first two steps, we perform a second-order attack on our masking scheme. In Figure 3.5 we can see, that the second-order attack starts to be successful at around 2000 traces. From this we conclude, that we carried out the first-order attack on the activated masking scheme correctly, as we are already successful with 2000 traces. We stress that an attacker would need a significantly higher number of traces and computations in reality, as we used a pretty friendly setting for our scenario.

4. Additively Homomorphic ring-LWE Masking

Less than a year after [RRVV15] (which has been described in the last Section) was published, Reparaz et. al. published a follow-up paper [RdCR+16] introducing a much easier approach for the masking of the ring-LWE encryption scheme. In the following, the approach of said paper will be introduced and evaluated in terms of efficiency and side-channel attack resistance. In our description we again focus on the LPR scheme, though the techniques are also applicable for other ring-LWE encryption schemes.

4.1. Implementation

For ring-LWE masking, we make use of the fact that the LPR encryption scheme is additively homomorphic. Thus for given ciphertexts $(\mathbf{c}_1, \mathbf{c}_2)$ and $(\mathbf{c}'_1, \mathbf{c}'_2)$, which are the encryption of two messages \mathbf{m} and \mathbf{m}' with $m_i, m_i' \in \{0, 1\}$ using the same public key \mathbf{p} , it follows that $(\mathbf{c}_1 + \mathbf{c}'_1, \mathbf{c}_2 + \mathbf{c}'_2)$ is the encryption of $\mathbf{m} \oplus \mathbf{m}'$. As a consequence, we can write down the following equation:

$$decryption(\mathbf{c}_1, \mathbf{c}_2) \oplus decryption(\mathbf{c}'_1, \mathbf{c}'_2) = decryption(\mathbf{c}_1 + \mathbf{c}'_1, \mathbf{c}_2 + \mathbf{c}'_2)$$
 (4.1)

Now, we want to make use of the property of additive homomorphism for our masking scheme. This, again, focuses on the decryption function, as this is the part of the encryption scheme, where the secret key is used, which makes it a prime target for attackers.

To randomize the decryption of $(\mathbf{c}_1, \mathbf{c}_2)$, we need to follow three simple steps:

- 1. Generate a random message \mathbf{m}' unknown to the adversary
- 2. Encrypt \mathbf{m}' to $(\mathbf{c}'_1, \mathbf{c}'_2)$
- 3. Decrypt $(\mathbf{c}_1 + \mathbf{c}'_1, \mathbf{c}_2 + \mathbf{c}'_2)$ to receive $\mathbf{m} \oplus \mathbf{m}'$

The masked message returned by this approach is $(\mathbf{m}', \mathbf{m} \oplus \mathbf{m}')$, such that $\mathbf{m} = (\mathbf{m} \oplus \mathbf{m}') \oplus \mathbf{m}'$.

The advantage of this approach is, that no masked decoder is needed. For decoding, an unprotected decoder might be used without leaking any useful information for an attacker.

4.2. Evaluation

5. Flush+Reload Cache Attack on Bliss

5.1. Gaussian Sampling

5.1.1. CDT Sampling

Using the cumulative distribution function in the sampler, we build a large table, in which we approximate the probabilities $p_y = \mathbb{P}[x \leq y | x \leftarrow D_{\sigma}]$ with λ Bits of precision. At sampling time, we generate a uniformly random $r \in [0,1)$ and perform a binary search in the table to locate $y \in [-r\sigma, r\sigma]$, so $r \in [p_{y-1}, p_y)$. If restricted to the non-negative part $[o, r\sigma]$, the probabilities are $p_y^* = \mathbb{P}[|x| \leq y | x \leftarrow D_{\sigma}]$, sampling is still $r \in [0,1)$, but $y \in [0,r\sigma]$ is located.

The binary search in this sampling method can take some time, so one can speed it up by using an additional guide table I. This table stores for example 256 entries consisting of intervals $I[u] = (a_u, b_u), u \in \{0, ...255\}$ such that $p_{a_u}^* \leq u/256$ and $p_{b_u}^* \geq (u+1)/256$. At sampling time, the first byte of r is then used to select the corresponding I[u], which leads to a smaller interval to binary search. r is effectively picked byte-by-byte using the guide table approach. Algorithm 4 summarizes the guide table approach.

5.1.2. Rejection Sampling

Rejection Sampling basically accepts a sampled uniformly random integer $y \in [-r\sigma, r\sigma]$ with probability $p_{\sigma}(y)/p_{\sigma}(\mathbb{Z})$. This is done by sampling a uniformly random value $r \in [0, 1)$ and accepting the uniformly random y if $r \leq p_{\sigma}(y)$. This procedure can be quite expensive, because $p_{\sigma}(y)$ has to be calculated to a high precision and even then the rejection rate may be quite high.

The authors of the paper introducing BLISS (QUELLE) proposed a more efficient rejection sampling algorithm, which will be used in the following chapters.

This algorithm reduces the amount of rejected samples significantly. It begins with sampling a value x according to the binary discrete Gaussian distribution D_{σ_2} with $\sigma_2 = \frac{1}{2ln2}$. Uniformly random bits can be used to do this efficiently. $y = Kx + z, z \in \{0, ..., K-1\}$ is then uniformly random sampled and $K = \lfloor \frac{\sigma}{\sigma_2} + 1 \rfloor$

22: end while

Algorithm 4 CDT Sampling With Guide Table

Input: Big table T[y] containing values p_y^* of the cumulative distribution function of the discrete Gaussian distribution (using only non-negative values), omitting the first byte. Small table I consisting of the 256 intervals.

```
Output: Value y \in [-r\sigma, r\sigma], sampled with probability according to D_{\sigma}
 1: pick a random byte r
 2: Let (I_{min}, I_{max}) = (a_r, b_r) be the left and right bounds of interval I[r]
 3: if I_{max} - I_{min} = 1 then
        generate a random sign bit b \in \{0, 1\}
 4:
        return y = (-1)^b I_{min}
 5:
 6: end if
 7: Let i = 1 denote the index of the byte to look at
 8: Pick a new random byte r
 9: while 1 do
        I_z = \lfloor \frac{I_{min} + I_{max}}{2} \rfloor
10:
        if r > (ith byte of T[I_z]) then
11:
12:
            I_{min} = I_z
        else if r < (i\text{th byte of } T[I_z]) then
13:
14:
            I_{max} = I_z
        else if I_{max} - I_{min} = 1 then
15:
            generate a random sign bit b \in \{0, 1\}
16:
            return y = (-1)^b I_{min}
17:
        else
18:
            increase i by 1
19:
20:
            pick new random byte r
21:
        end if
```

is distributed according to the targeted discrete Gaussian distribution D_{σ} by rejecting when $b = \exp(z(z + 2Kx)/(2^2)) = 0$ holds.

This last step still requires some computing because of the exponential value b, but the authors provided a more efficient algorithm for this, too.

5.2. The FLUSH+RELOAD Attack

The attack used in PAPER HIER EINFGEN is the FLUSH+RELOAD cache attack. This attack abuses the fact, that modern CPUs feature multiple different cache levels, for example L1 cache. This is the fastest and smallest cache level and located closest to the CPU core. The next level, L2 cache, is bigger and slower than L1, L3 is even bigger and slower than L2, etc.

If the CPU has to access a memory address, it looks for the corresponding memory block in higher levels first. If the block is found, a *cache hit*, the data is accessed. But in case of a *cache miss*, it starts to look for the memory block on lower cache levels down to the system memory. If the corresponding block is found in lower levels, the processor *evicts* a cache line in the higher memory and places the found memory line there, to speed up future access on the same memory block.

The higher access times on the lower cache levels are exploited by cache timing attacks like the FLUSH+RELOAD attack. The attacker has to use the same memory as the victim to apply this kind of attack. He can monitor the state of the cache and use the timing differences to check which memory blocks are cached and which addresses were accessed by the victim. If done correctly, the attacker can deduce the cache lines of the victims table access, which limits the possible chosen values.

The FLUSH+RELOAD attack abuses the x86_64 instruction clflush to evict a memory block from cache, before the victim executes his algorithm. After the victim is done with his memory access, he measures the time to access the memory block again. If the victim accessed the memory block, the block will be in a fast cache level and the access time will be low. If it was not accessed, the CPU has to load the memory block from a lower cache level and the access will be much slower. The attacker then knows, if the flushed memory block was accessed or not.

5.3. Attacking the Sampling Algorithms

5.4. Evaluation

6. Blinding Countermeasures

Blinding is a countermeasure commonly used to prevent side-channel attacks like DPA [KJJ99]. It is used to add additional randomness to mathematical operations in a way, that the attacker cannot easily draw conclusions from his observations. This Section summarizes two blinding countermeasures presented in [Saa16], which appear to be of special interest for ring-LWE cryptosystems. While the first countermeasure will be an approach to blinding of polynomial multiplication within a ring R_q , the second one will be a blinding countermeasure for Gaussian sampling. All those techniques are believed to help against the attacks we described in 5, yet this has not been verified.

6.1. Blinding Polynomial Multiplication

There are two pretty types of blinding for polynomial multiplications, the first of whom is the multiplication of each polynomial with a constant. For two polynomials $\mathbf{f}, \mathbf{g} \in R_q$ and constants $a, b \in \mathbb{Z}_q$ the blinding operation and the inverse operation look as follows:

$$\mathbf{h} = a\mathbf{f} \cdot b\mathbf{g} \tag{6.1}$$

$$\mathbf{f} \cdot \mathbf{g} = (ab)^{-1} \mathbf{h} \tag{6.2}$$

The second type would be circularly shifting the coefficients in each of the polynomials. As a polynomial can be written as $\mathbf{f} = \sum_{i=0}^{n-1} f_i x^i$ with f_i being the *i*-th coefficient of the polynomial \mathbf{f} , a shift by j positions would be equal to the following computation:

$$x^{j}\mathbf{f} = \sum_{i=0}^{n-1} f_{i}x^{i+j} = \sum_{i=0}^{n-1} f_{i-j}x^{i}$$
(6.3)

Both of those blinding operation can be combined within one function, which will be called PolyBlind(\mathbf{v}, s, c) from now on. This function works on the coefficient vectors of polynomials of degree n and is given in Algorithm 5.

The inverse operation can be denoted by POLYBLIND($\vec{v'}$, -s, c^{-1}). Due to the isometries of the ring R_q , the multiplication of two polynomials (here: their coefficient vectors) can be blinded using the POLYBLIND function in the following way:

Algorithm 5 POLYBLIND

```
Input: coefficient vector \vec{v}, number of shifts s, constant c

Output: blinded coefficient vector \vec{v'}

1: for i = 0, ..., n - s - 1 do

2: v'_i = cv_{i+s} \mod q

3: end for

4: for i = n - s, ..., n - 1 do

5: v'_i = q - cv_{i+s-n} \mod q

6: end for

7: return \vec{v'}
```

$$\begin{split} \vec{f'} &= \text{PolyBlind}(\vec{f}, r, a) \text{ with } r \in_R 0, ..., n-1 \text{ and } a \in_R \mathbb{Z}_q \\ \vec{g'} &= \text{PolyBlind}(\vec{g}, s, b) \text{ with } s \in_R 0, ..., n-1 \text{ and } b \in_R \mathbb{Z}_q \\ \vec{h'} &= \vec{f'} \cdot \vec{g'} \\ \vec{h} &= \text{PolyBlind}(\vec{h'}, -(r+s), (ab)^{-1}) \end{split}$$

6.2. Blinding Gaussian Sampling

As with the blinding of polynomial multiplication in the last subsection, there are two pretty easy ways to blind the coefficient vectors during the process of Gaussian sampling. We will again give a short description of both of them and present a function, that combines both methods.

We define a function VectorSample(n, σ), that samples and returns a vector according to the discrete Gaussian distribution $\mathcal{N}^n_{\mathbb{Z}}(0, \sigma^2)$. A naive implementation of this function could lead to leakage of information to an attacker using e.g. DPA. This has been done in the cache attack from [BHLY16] we described in Section 5.

The first approach to blinding would be to randomly shuffle the elements in the coefficient vector. The function VectorShuffle(\vec{x}) is doing exactly that, so that VectorShuffle(VectorSample(n, σ)) would increase security to a certain extend.

For the second approach we need to take a short detour through probability theory. For two Gaussian distributions $X = \mathcal{N}_{\mathbb{Z}}^n(\mu_X, \sigma_X^2)$ and $Y = \mathcal{N}_{\mathbb{Z}}^n(\mu_Y, \sigma_Y^2)$ it holds that their sum is equal to $X + Y = \mathcal{N}_{\mathbb{Z}}^n(\mu_X + \mu_Y, \sigma_X^2 + \sigma_Y^2)$. As we focus on zero-centered distributions, the center does not change for us. For the standard deviation it follows, that $\sigma_{X+Y} = \sqrt{\sigma_x^2 + \sigma_Y^2}$. Algorithm 6 is one possible way to make use of those characteristics of Gaussian distributions. It also makes use of the Vectorshuffle(\vec{x}) function to increase overall security. Another, very similar approach, has been described in [PDG14].

Algorithm 6 VectorBlindSample

Input: length of the vector n, number of iterations m, standard deviation σ Output: sampled vector \vec{x}

- 1: x = 0
- 2: for i=1,...,m do 3: $\vec{x}=\vec{x}+\mathcal{N}^n_{\mathbb{Z}}(0,(\frac{1}{\sqrt{m}}\sigma)^2)$ 4: $\vec{x}=\text{VectorShuffle}(\vec{x})$
- 5: end for
- 6: return \vec{x}

7. Conclusion

Conclude your thesis and discuss your results...

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