

## TECHNISCHE UNIVERSITÄT MÜNCHEN

Bachelor's Thesis in Informatics

# Benchmarking Supersingular Isogeny Diffie-Hellman Implementations

Jonas Hagg





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Submission Date: Submission date



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|  |                        |                            |         |



# **Abstract**

This thesis introduces and describes currently available Supersingular Isogeny Diffie-Hellman impelementations: *SIKE*, *CIRCL* and *SIKE* for Java. Additionally, the libraries *SIKE* and *CIRCL* are compared with each other and with the currently distributed Elliptic Curve Diffie-Hellman based on performance benchmarks. While the developed benchmarking suite indicates *PQCrypto-SIDH* as the library executing the least amount of instructions for a single SIDH key exchange, *SIKE* allocates least memory. *CIRCL* demands the most resources (execution time and memory) among the compared libraries. The comparison with a modern Elliptic Curve Diffie-Hellman library (*OpenSSL*) demonstrates the limitations of current SIDH algorithms in terms of execution time for a single key exchange.

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## 1. Introduction

This thesis benchmarks several Supersingular Isogeny Diffie-Hellman (SIDH) implementations. Cryptography based on supersingular isogenies is a candidate to replace state-of-the-art asymmetric encryption primitives in the upcoming age of quantum-computers. Especially SIDH might replace modern Diffie-Hellman key exchange algorithms in future.

The goal of this thesis is the comparison between existing SIDH implementations. For a complete analysis of the current state of SIDH, this upcoming technology is also compared to widely used Elliptic Curve Diffie-Hellman (ECDH) protocols.

In order to generate comparable benchmarks, a benchmarking suite is developed for this thesis. The SIDH implementations *SIKE* and *CIRCL* are integrated into this benchmarking suite to obtain reliable benchmarking results.

After this introduction, Chapter 2 firstly introduces the necessary technical background. Besides the introduction of basic encryption and key exchange protocols, the chapter illustrates the influence of upcoming quantum computing to modern cryptography. Finally, the term Supersingular Isogeny Diffie-Hellman (SIDH) is introduced in detail.

Chapter 3 presents currently available libraries implementing SIDH: *SIKE*, *CIRCL* and *Sike* for Java. Their implemented primitives, optimized versions, parameter sets and APIs are summarized and compared. Moreover the relation between the similar libraries SIKE and PQCrypto-SIDH is investigated.

In Chapter 4 the benchmarking suite – developed in the scope of this thesis – is introduced. Besides the usage and the internal operations of the software, the chapter also reveals and justifies the applied benchmarking methodologies.

Chapter 5 provides the results measured by the benchmarking suite. The SIDH libraries *SIKE* and *CIRCL* are are compared based on their available implementations. Furthermore, the chapter takes ECDH in consideration to compare SIDH with currently deployed technologies. The final Chapter 6 summarizes the major results and describes limitations of this thesis.

# 2. Background

This opening chapter covers the technical background needed to read and understand this thesis. Besides a short introduction into modern cryptography schemes and advanced key exchange concepts, the emergence and consequences of quantum computers are explained. Finally, this chapter discusses isogeny-based cryptography – the theoretical background of this thesis.

In modern cryptography one can distinguish between *symmetric* and *asymmetric* encryption schemes. While in a *symmetric* scheme the decryption and encryption of data is processed with the same key, *asymmetric* protocols introduce a key pair for every participant: A public key for encryption and a private key for decryption. The public key of *asymmetric* protocols is, as the name suggests, public to everyone. However, the private key needs to be secret and nobody but the owner has knowledge about the private key.

## Symmetric Cryptography

Figure 2.1 shows a simple symmetric encryption scheme. First, a plaintext is encrypted using a symmetric encryption algorithm and a secret key. The resulting ciphertext text is transported to the receiver, where it is decrypted using the appropriate decryption algorithm and the same secret key. The red section in the middle represents an insecure channel (e.g. the internet), where attackers may read or modify data. Since for encryption and decryption the same secret key is used, the exchange of the key through that insecure channel is critical: Somehow the symmetric key needs to be transported securely to the receiver of the ciphertext.

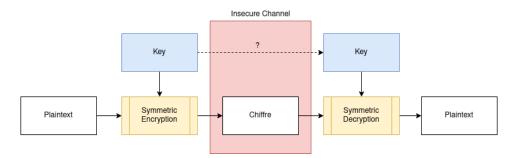


Figure 2.1.: Simple symmetric encryption scheme: Encryption and decryption algorithm use the same key.

In the following, symmetric decryption and encryption is expressed in a more formal way. The common key k is used for encryption Enc and decryption Dec, p is the plaintext and c is

the ciphertext:

$$Enc(p,k) = c$$
  
 $Dec(c,k) = p$ 

## **Asymmetric Cryptography**

In asymmetric cryptography each participating subject needs to generate a key pair which consist of a private key and a public key. As mentioned above, the public key needs to be public (e.g. stored in a public database or a public key server). The private key, however, is only known to the owner and is kept secret. Figure 2.2 shows an example for asymmetric encryption. Assume that Alice wants to send encrypted data to Bob. Therefore, Bob created a key pair and published his public key. Alice requests Bob's public key (e.g. from a public database) and uses it to encrypt the data. Once Bob received the ciphertext, he uses his secret private key for decryption in order to retrieve the original plaintext. In this thesis, the term public-key encryption, PKE and public-key algorithm are used as a synonyms for asymmetric cryptography.

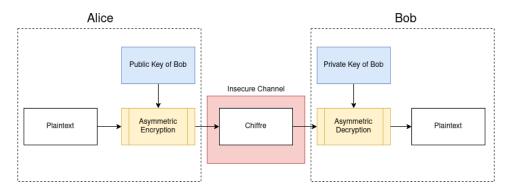


Figure 2.2.: Asymmetric encryption scheme: Encryption and decryption algorithm use different keys.

To formalize this procedure, again assume p as plaintext and c as ciphertext. The generated key pair of Bob consists of a private key for decryption ( $d_{Bob}$ ) and a public key for encryption ( $e_{Bob}$ ).

$$Enc(p, e_{Bob}) = c$$
  
 $Dec(c, d_{Bob}) = p$ 

In contrast to *symmetric* encryption, no secret key needs to be exchanged. However, the encryption and decryption of data using *asymmetric* encryption require intensive mathematical computations. Hence, the encryption of big sets of data using asymmetric encryption is not

efficient.

One the other hand, *symmetric* encryption algorithms are usually based on simple operations, such as bit shifting or XOR. This can be implemented efficiently in software and hardware. Thus, the practical relevance of *symmetric* encryption is enormous [1].

As stated above, securely exchanged keys are a precondition for the use of efficient *symmetric* encryption schemes. In order to exchange arbitrary keys securely, two major key exchange protocols are available.

## 2.1. Key Exchange

This section describes and compares the major protocols to establish a shared secret between two communicating subjects: The *Diffie-Hellman Key-Exchange* and a *Key Encapsulation Mechanism*.

## 2.1.1. Diffie-Hellman Key-Exchange

The Diffie-Hellman key exchange was introduced by Whitfield Diffie and Martin Hellman in 1976 [2]. This protocol creates a shared secret between two subjects. The resulting shared key of the protocol is calculated decentralized and is never transported through an insecure channel.

#### **Protocol**

The classical Diffie-Hellman key exchange assumes that Alice and Bobs want to create a shared secret key. Therefore, they agree on a big prime p and g, which is a primitive root modulo  $p^1$ . Both, p and g are not secret and may be known to the public [3].

- 1. Alice choses a random  $a \in \{1, 2, ..., p 2\}$  as private key.
- 2. Alice calculates the public key  $A = g^a \mod p$ .
- 3. Bob choses a random  $b \in \{1, 2, ..., p 2\}$  as private key.
- 4. Bob calculates the public key  $B = g^b \mod p$ .
- 5. Alice and Bob exchange their public keys *A* and *B*.
- 6. Alice calculates:

$$k_{AB} = B^{a} \mod p$$

$$= (g^{b} mod p)^{a} \mod p$$

$$= g^{ba} \mod p$$

$$= g^{ab} \mod p$$

$$= g^{ab} \mod p$$
(2.1)

<sup>&</sup>lt;sup>1</sup>The primitive root modulo p is a generator element for the set  $S = \{1, 2, ..., p-1\}$  [1].

#### 7. Bob calculates:

$$k_{AB} = A^b \mod p$$

$$= (g^a \mod p)^b \mod p$$

$$= g^{ab} \mod p$$
(2.2)

8. Alice and Bob created the shared secret  $k_{AB}$ . Note that only the public keys of Alice and Bob were sent through an insecure channel. The generated secret was calculated locally by Alice and Bob, respectively.

This procedure can also be illustrated in the following diagram emphasizing the commutative properties of the protocol. It does not make any difference which function is applied first to the starting point g ( $x \to x^a$  or  $x \to x^b$ ). The result is the same, since  $g^{ab} = g^{ba}$ .

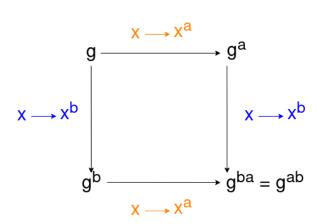


Figure 2.3.: Diffie-Hellman diagram - both paths lead to the same result.

## Security

The security of the Diffie-Hellman protocol is based on the challenge: Given the public generator element g, the public key of Alice  $g^a$  and the public key of Bob  $g^b$ , compute  $g^{ab}$ . If an attacker wants to compute  $g^{ab}$ , she needs to compute the private keys a and b of Alice and Bob. Since only the public keys  $A = g^a$  and  $B = g^b$  are exchanged, it suffices to compute:

$$b = \log_g B \bmod p$$
$$a = \log_g A \bmod p$$

Hence, the security of the classical Diffie-Hellman key exchange is based on the discrete logarithm problem considered difficult to be solved by classical computers (see section 2.2). However, if an attacker is able to solve this challenge, this would neither compromise any keys from the past nor any future keys of the communication (this is called *perfect forward* 

secrecy, short *PFS* [1]). Another Diffie-Hellman handshake would challenge the attacker with the discrete logarithm problem again. Thus, the Diffie-Hellman key exchange may be used as efficient PFS protocol when keys are renewed regularly.

In modern cryptography elliptic curves are often used to increase the security of the Diffie-Hellman key exchange (ECDH). The participants have to agree on an elliptic curve and a point P on that curve. In order to generate a shared secret  $k_{AB}$  ECDH follows the same principles as described above. However, the protocol is adopted to work on elliptic curves. The advantage of ECDH is the increased security strength while using the same key size as the classical Diffie-Hellman protocol [1].

Note that the introduced protocol does not authenticate the participating subjects and does not guarantee integrity. Thus, this simple protocol may be exploited by a Man-In-The-Middle attack. A more advanced protocol using certificates and signed messages can be implemented, to guarantee authentication and integrity [1].

## 2.1.2. Key Encapsulation

A Key Encapsulation Mechanism (KEM) transmits a previously generated symmetric key to another subject. KEMs usually use asymmetric key pairs in order to encrypt the generated symmetric key. In the following, the concept of KEMs is illustrated by RSA-KEM using RSA key pairs to transmit a shared secret of length n from Alice to Bob [4]:

- 1. Bob generates a RSA key pair (public key  $e_{Bob}$  and private key  $d_{Bob}$ ) and transmits the public key to Alice.
- 2. Alice generates a random secret key  $k_{AB}$ :

$$k_{AB} = random(n)$$

3. Alice maps this secret to an integer *m*, using a well-defined mapping function *h*:

$$m = h(k_{AB})$$

4. Alice encrypts *m* with Bobs public key using the RSA encryption algorithm and transmits *c* to Bob.

$$c = RSA_{enc}(m, e_{Boh})$$

5. Bob decrypts the received ciphertext *s* to obtain the integer *m*:

$$m = RSA_{dec}(c, d_{Bob})$$

6. Finally, bob uses the inverse mapping function  $h^{-1}$  to retrieve the shared secret:

$$k_{AB} = h^{-1}(m1)$$

## Security

If an attacker wants to compute  $k_{AB}$  it is necessary to break the RSA encryption  $RSA_{enc}(m, e_{Bob})$  in order to reveal m. Applying the inverse mapping function  $h^{-1}$  then yields the secret key  $k_{AB}$ . In order to break the RSA encryption it is sufficient to compute the private key of Bob given his public key. This computation is assumed to be equally demanding as solving the factorization problem (see section 2.2) for big numbers [5].

Note that once an attacker was able to compromise Bobs private key, all following exchanged shared secrets  $k_{AB}$  are compromised as well. Thus, this protocol does not ensure perfect forward secrecy (PFS).

## 2.1.3. Differences

Both presented protocols securely share a symmetric encryption key between two communicating subjects. However, there are some differences between KEM and Diffie-Hellman. Firsty, while KEMs transmit a shared secret from one subject to another, the calculation in the Diffie-Hellman protocol is decentralized. Thus, the shared secret will never be send through an insecure channel.

Secondly, KEM relies on a long-term asymmetric key pair which is used to encapsulate and decapsulate the randomly chosen shared secret. If the private key is compromised by an attacker, all following symmetric encrypted communication could be revealed. On the contrary, a compromised Diffie-Hellman key exchange would only affect the messages which are encrypted using the secret resulting from that single Diffie-Hellman handshake. All following DH key exchanges are not compromised from the previously compromised exchange. Thus, DH key exchanges might be used as the basis of a PFS protocol.

Thirdly, KEMs can be used offline: Since one subject (e.g the sending subject) chooses the secret key, data calculation and encryption can be performed without any previous communication with the receiver. Thus, no synchronization between the subjects is necessary to exchange encrypted data.

## 2.2. Post-Quantum Cryptography

This section introduces the term *quantum computer* and describes its consequences on modern cryptography. In the following, a *classical computer* refers to a non-quantum computer which can be simulated by a Turing machine. In contrast to *classical computer* the term *quantum computer* describes a machine using quantum mechanical phenomena to perform computations. It is important to note that quantum computers can simulate classical computers [6]. In addition, classical computer are able to simulate quantum computers with exponential time overhead [6]. Thus, classical and quantum computers can calculate the same class of functions. However, quantum computers enable operations allowing much faster computation in some cases [6].

In the past, scientists queried whether large-scale quantum computer are physically possible. It was argued that the underlying quantum states are too fragile and hard to control [7].

Today, quantum error correction codes are known, putting large-scale quantum computers within the realms of possibility [8]. However, it is still a major engineering challenge from a laboratory approach to a general-purpose quantum computer that involves thousands or millions of logical qubits [7].

The security of modern asymmetric cryptographic primitives is usually based on difficult number theoretic problems, e.g. the discrete logarithm problem (DH, ECDH) or the factorization problem (RSA) [7]. While these problems are theoretically solvable, the computation on classical computers claim an impractical amount of resources. In 2019, scientists solved the factorization problem for a 240 digit integer in about 900 core-years on a classical computer (one core year corresponds to running a CPU for a full year) [9]. In the following, the discrete logarithm problem and the factorization problem are described.

## Discrete Logarithm Problem

The discrete logarithm problem consists in the following challenge [10]: Given a prim p and two integers g and y. Find an integer x, such that

$$y = g^x \bmod p$$
$$\iff x = \log_g y \bmod p$$

Up to this date, it remains still unknown if a classical computer is able to compute the general discrete logarithm problem in polynomial time. Thus, the discrete logarithm problem is considered difficult to be solved by classical computers [10]. This assumption makes the discrete logarithm problem an attractive basis for various cryptographic primitives: DSA, ElGamal, classical Diffie-Hellman, and Elliptic Curve Diffie-Hellman employ the hardness of the discrete logarithm problem in order to secure their algorithms.

## **Factorization Problem**

Given two large primes p and q, it is easy to compute their respective product:

$$n = p \cdot q$$

For a given n, however, it is difficult to find the prime factors p and q. The computation of the prime factorization for a given integer n is called the factorization problem [1]. For large numbers n no efficient algorithm for classical computers is known to solve this challenge [1]. The most famous cryptographic protocol which builds upon the hardness of the factorization problem is RSA.

## 2.2.1. Impact of Quantum Computers on Cryptography

As stated above, quantum computers enable new operations which accelerate certain algorithms. Two quantum algorithms which have enormous consequences on modern cryptography are *Shor's algorithm* [11] and *Grover's algorithm* [12].

## Shor's Algorithm

Peter Shor published "Algorithms for quantum computation: discrete logarithms and factoring" in 1994 [11]. In this publication he demonstrated that the factorization problem and the discrete logarithm problem can be solved in polynomial time on quantum computers. Both problems form the basis of many public-key systems (RSA, DH, ECDH, ...) used intensively in modern communication systems. Hence, a quantum computer running *Shor's algorithm* would qualify for the assumption of most asymmetric encryption schemes and thus break their security.

## Grover's Algorithm

The second algorithm impacting computer security was published by Lov Grover in 1996 ("A fast quantum mechanical algorithm for database search", [12]) - also referred to as Grover's algorithm. The algorithms solves the problem of finding an element y in a set S (e.g. a database) where |S| = N. On a classical computer an algorithm solving this problem runs in O(N). However, Grover's algorithm has complexity  $O(\sqrt{N})$  [6].

In contrast to public-key systems that rely on hard mathematical problems, symmetric encryption schemes rely in particular on the secrecy of a randomly generated key. Thus, to break symmetric encryption, one can perform a brute-force attack on the symmetric key. *Grover's algorithm* offers a square root speed-up on classical brute-force attacks [13]. Assume a randomly generated n-bit key. A classical brute force algorithm takes  $\mathcal{O}(2^n)$  steps, which is considered to be safe for a big n (e.g. n=128). *Grover's algorithm* speeds up this attack to  $\mathcal{O}(\sqrt{2^n}) = \mathcal{O}(2^{n/2})$  steps [13]. For n=128 this results in a security level of 64-bit  $(2^{128/2}=2^{64})$  [13]. Note that NIST considers a security-level of at least 112-bits as secure [14]. However, the complexity is still exponential and with a growing key size n the security can be increased further (E.g. doubling key size n is sufficient to restore previous security). Thus, *Grover's algorithm* forces symmetric encryption schemes to increase their key size in order to stay secure.

Summing up, quantum computers make use of quantum mechanical phenomena in order to solve mathematical problems which are assumed to be difficult for classical computers. As a result large-scale quantum computers might break many algorithms of modern *asymmetric* cryptography and enforce increased key sizes for *symmetric* encryption schemes. The following table form the NIST "*Report on Post-Quantum Cryptography*" [7] demonstrates the impact of quantum computers on modern encryption schemes:

| Cryptographic | Type          | Purpose         | Impact from quantum  |
|---------------|---------------|-----------------|----------------------|
| algorithm     |               |                 | computer             |
| AES           | Symmetric key | Encryption      | Larger key sizes     |
|               |               |                 | needed               |
| SHA           | <u> </u>      | Hash functions  | Larger output needed |
| RSA           | Public key    | Signatures, key | No longer secure     |
|               |               | establishment   |                      |
| DSA           | Publiy key    | Signatures, key | No longer secure     |
|               |               | exchange        |                      |
| ECDH, ECDSA   | Public key    | Signatures, key | No longer secure     |
|               |               | exchange        |                      |

Table 2.1.: Impact of quantum computers on modern encryption schemes (adopted from [7]).

In contrast to this development in modern cryptography NIST states [7]:

"In the last three decades, public key cryptography has become an indispensable component of our global communication digital infrastructure. These networks support a plethora of applications that are important to our economy, our security, and our way of life, such as mobile phones, internet commerce, social networks, and cloud computing. In such a connected world, the ability of individuals, businesses and governments to communicate securely is of the utmost importance."

This statement emphasizes the urgency and need of new asymmetric encryption schemes. As a consequence, NIST initiated a process to standardize quantum-secure public-key algorithms [15]. This is called *post-quantum cryptography*, since the objectives of the submitted procedures is to stay secure against a large-scale quantum computer. In July 2020, Round 3 of this standardization process was announced. Different approaches for quantum-resistant algorithms have been proposed. This thesis focus on isogeny-based cryptography (section 2.3). Other classes of post-quantum cryptography are described for completeness in the following section 2.2.2.

## 2.2.2. Classes of Post-Quantum Cryptography

This section provides an overview over important post-quantum cryptography classes: Lattice-based, multivariate and code-based cryptography as well as hash-based signatures are briefly presented.

## Lattice-based Cryptography

Lattice-based cryptography is – as the name suggests – based on the mathematical construct of lattices<sup>2</sup>. There are different computational optimization problems involving lattices that

<sup>&</sup>lt;sup>2</sup>A lattice *l* is a subgroup of  $\mathbb{R}^n$ . In the context of cryptography usually integer lattices are considered:  $l \subseteq \mathbb{Z}^n$  [16].

are considered difficult to be solved even by quantum computers [16]. In 1998, NTRU was published as the first public-key system based on lattices [17]. Since then NTRU was continuously improved resulting in NTRUencrypt (public-key system) and NTRUsign (digital signing algorithm). Furthermore, a fully homomorphic encryption scheme based on lattices was published in 2009 [18].

Lattice-based cryptography is characterized by simplicity and efficiency [7]. However, lattices encryption schemes have problems to prove security against known cryptoanalysis [7].

## Multivariate Cryptography

Multivariate cryptography are public key systems that are based on multivariate polynomials (e.g. p(x,y) = x + 2y) over a finite field  $\mathbb{F}$ . The proof that solving systems of multivariate polynomials are NP-hard [19] is the bsis of their security. This makes multivariate public key systems attractive for post-quantum cryptography; especially their short signatures make them a candidate for quantum-secure digital signature algorithms [20], e.g. the Rainbow signature scheme [21].

## **Code-based Cryptography**

Code-based cryptographic primitives are build upon error-correcting codes. A public key system using error-correcting codes uses a public key to add errors to a given plaintext resulting in a ciphertext. Only the owner of the private key is able to correct these errors and to reconstruct the plaintext [22]. McEliece, published in 1978, was the first of those systems and it has not been broken until today [23]. On the other hand, code-based cryptography requires large key sizes [22].

Besides asymmetric cryptography, code-based schemes have been proposed for digital signatures, random number generators and cryptographic hash functions [22].

## **Hash-based Signatures**

Hash-based signatures refer to the construction of digital signatures schemes based on hash functions. Thus, the security of theses primitives is based on the security of the underlying hash function and not on hard algorithmic problems [22]. Since hash functions are widely deployed in modern computer systems, the security of hash-based signatures is well understood [7].

The initially developed One-Time Signatures have the downside that a new public key pair is needed for each signature [24]. In 1979, Merkle introduced the Merkle Signature Scheme (MSS) which uses one public key for multiple signatures [25]. Further improvements of MSS introduced public keys usable for 2<sup>80</sup> signatures. However, this also leads to longer signature sizes [24].

## 2.3. Isogeny-based Cryptography

Isogeny-based cryptography was proposed in 2011 as a new cryptographic system that might resists quantum computing [26]. Besides the publication describing isogeny-based cryptgraphy, the authors also provided a reference implementation of a PKE and a KEM based on isogenies. This implementation is called *SIKE* [27]. Isogeny-based cryptography benfits from small key sizes compared to other post-quantum cryptography classes, however, their performance is comparatively slow [27]. The security of these primitives is based on finding isogenies between supersingular elliptic curves.

In the following, the problem is firstly roughly illustrated. It is not indented to provide exact mathematical details about isogeny-based cryptography, since that would be beyond the scope of this thesis. However, one might become a intuition for supersingular isogenies. Subsequently, the central component of isogeny-based cryptography - namely the Supersingular Isogeny Diffie-Hellman (SIDH) - is described. Finally, details of the reference implementation SIKE are given and the security of SIDH is considered.

#### 2.3.1. Mathematics

This section is adopted from "A Friendly Introduction to Supersingular Isogeny Diffie-Hellman" [28] and "Supersingular Isogeny Key Exchange for Beginners" [29].

Isogeny-based cryptography works on supersingular elliptic curves. To be more precise: It is based on isogenies between supersingular elliptic curves.

In the context of elliptic curves one can calculate a quotient of an elliptic curve E by a subgroup S. Essentially, this means to construct a new elliptic curve  $E \setminus S$ . Besides this new curve, the procedure also yields a function  $\phi_S : E \to E \setminus S$  which is called an *isogeny*. Carefully chosen elliptic curves E have a wide range of subgroups which can be used to construct many isogenies.

Supersingular elliptic curves are a special type of elliptic curves having properties that are useful for cryptography. Since supersingular elliptic curves can be seen as subset from ordinary elliptic curves, they can also be used to calculate isogenies between them, as described above.

The idea behind isogeny-based cryptography might be illustrated as follows:

- 1. Start with a known curve E and build a isogeny to a arbitrary reachable curve  $E_A$ .
- 2. This yields the isogeny  $\phi_A : E \to E_A$  which is used as private key.
- 3. The curve  $E_A$  is used as part of the public key.

Usually, in asymmetric asymmetric cryptography the hard mathematical problem consists in computing the private key while knowing the public key. To be more precise: Find the isogeny  $\phi_A : E \to E_A$  while knowing curves E and  $E_A$  is considered to be a quantum-resistant challenge. In literature, this is formally defined as SIDH problem [27].

This key pair, however, is not used to decrypt or encrypt data. In fact, the procedure is very

similar to the previously introduced Diffie-Hellman key exchange where the key pair is used to establish a shared secret between two communication partners. In its core, isogney-based cryptography creates a shared secret via a Diffie-Hellman like procedure. This is called *Supersingular Isogeny Diffie Hellman (SIDH)*.

## 2.3.2. Supersingular Isogeny Diffie-Hellman (SIDH)

In the previous section the underlying mathematical idea of isogeny-based cryptography was illustrated. The described key generation can be extended to a key exchange primitive which has strong similarity to the classical Diffie-Hellman key exchange. The SIDH key exchange is represented by the following protocol.

Starting point of SIDH is a publicly known supersingular elliptic curve E.

- 1. Alice creates an isogeny  $\phi_A$  (private key) which leads to curve  $E_A$  (part of Alice's public key).
- 2. Bob creates an isogeny  $\phi_B$  (private key) which leads to curve  $E_B$  (part of Bob's public key).
- 3. Alice and Bob exchange their public keys.
- 4. Bob computes  $\phi'_B$  (using additional information from the public key of Alice) and applies  $\phi'_B$  to the received  $E_A$ . This results in  $E_{AB}$
- 5. Alice computes  $\phi'_A$  (using additional information from the public key of Bob) and applies  $\phi'_A$  to the received  $E_B$ . This results in  $E_{AB}$
- 6. Alice and Bob share the common secret  $E_{AB}$ .

Figure 2.3 above showed the commutative property of the classical Diffie-Hellman protocol. The same diagram can be drawn for the Diffie-Hellman based on supersingular isogenies (see Figure 2.4):

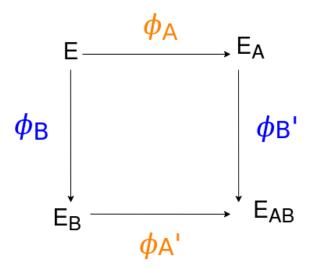


Figure 2.4.: Supersingular Isogeny Diffie-Hellman procedure - both paths lead to the same result  $E_{AB}$ . Note the different isogenies  $\phi'_A$  and  $\phi'_B$  that are applied in each second step of the diagram. The reason for this lies in the mathematics of supersingular isogenies:  $\phi_A\phi_B \neq \phi_B\phi_A$ . In order to construct  $\phi'_X$  or  $\phi'_B$  the public key of each communication partner provides additional information besides the curve  $E_A$  or  $E_B$ . [30]

## 2.3.3. Implemenation Details

The implementation details described in this subsection are based on *SIKE* [27], the first proposed supersingular isogeny-based cryptography. The following explanations also illustrate the connection between SIDH and isogeny-based PKE and KEM.

The reference implementation of SIKE provides two fundamental functions: *isogen* and *isoex*. Both are used, to implement the previously introduced SIDH algorithm. Note that the secret key *sk* is represented as a random integer. Moreover, the used parameters that represent the applied supersingular curve are also passed to *isogen* and *isoex*. For simplicity, this is not listed here, however the exact parameter sets for all curves are listed in the specification of SIKE [27].

| Function | Input                | Output            |  |
|----------|----------------------|-------------------|--|
| isogen   | parameter set param  | public key pk     |  |
|          | party <i>p</i>       |                   |  |
|          | secret key <i>sk</i> |                   |  |
| isoex    | parameter set param  | shared secret sec |  |
|          | party <i>p</i>       |                   |  |
|          | secret key <i>sk</i> |                   |  |
|          | public key <i>pk</i> |                   |  |

Table 2.2.: Core functions of the SIKE reference implementation.

The function *isogen* takes a secret key (random integer), the parameter set and the party (Alice or Bob) as input and generates the public key. The shared secret is generated by *isoex* taking the own secret key and the foreign public key as input. Additionally *isoex* also expect the used parameter set and the party of the key exchange. The party needs to be specified since Alice and Bob do not use the same logic to generate their keys and the shared secret. The reason for this lies in the mathematical foundation of isogeny based crpytography. The SIDH key exchange procedure with respect to *isogen* and *isoex* works as follows:

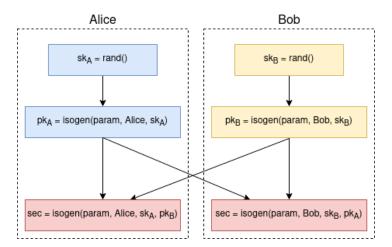


Figure 2.5.: SIDH based on *isogen* and *isoex*: After generating a random secret key *sk* each subject computes its public key *pk*. After the exchange of public keys each subject finally calculates the shared secret *sec*. It is important that both parties use the same parameter set *param* 

Besides this key exchange algorithm, SIKE provides a complete asymmetric encryption scheme and a key encpsulation mechansim [27]. Both of these schemes build upon the here described SIKE core functions *isogen* and *isoex*.

## **Isogeny-based PKE**

The isogeny-based public-key encryption system (PKE, Figure 2.6) consists of three algorithms:

- 1. Gen generates a key pair  $(sk_A, pk_A)$
- 2. *Enc* encrypts a given plaintext m using a foreign public key  $pk_B$  and a random r.
- 3. Dec decodes a given ciphertext using the secret key  $sk_B$

Note that the function *F* used in *Enc* and *Dec* is a key derivation function.

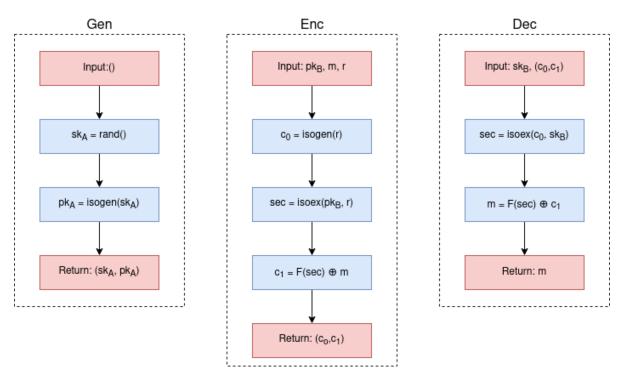


Figure 2.6.: Isogeny-based public-key encryption (PKE) scheme.

## **Isogeny-based KEM**

The isogeny-based key encapsulation mechanism (KEM, Figure 2.7) consists of three algorithms:

- 1. Gen generates a key pair  $(sk_A, pk_A)$  and a secret s.
- 2. *Encaps* takes a given public key  $pk_B$  as input and calculates a secret to share named K. Moreover, the function returns a ciphertext c that will be forwarded to the owner of the public key.
- 3. *Decaps* takes a ciphertext *c* and the output of *Gen* as input in order to retrieve the shared secret *K*.

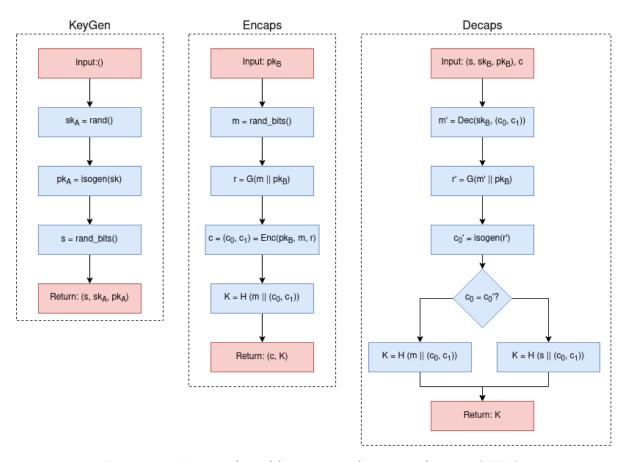


Figure 2.7.: Isogeny-based key encapsulation mechanism (KEM).

## 2.3.4. Security

The security of isogeny-based cryptography is based on the hardness of the SIDH problem: Given two supersingular elliptic curves E and E', find an isogeny between them [27]. The SIKE reference implementation proposes different parameter sets, each supposing to ensure a NIST defined security level. These NIST defined security levels are:

- Level 1: Any attack breaking this security level must require resources comparable to perform a key search on a 128-bit key (e.g. AES128).
- Level 2: Any attack breaking this security level must require resources comparable to perform a collision search on a 256-bit hash function (e.g. SHA256).
- Level 3: Any attack breaking this security level must require resources comparable to perform a key search on a 192-bit key (e.g. AES192).
- Level 4: Any attack breaking this security level must require resources comparable to perform a collision search search on a 384-bit hash function (e.g. SHA384).
- Level 5: Any attack breaking this security level must require resources comparable to perform a key search on a 256-bit key (e.g. AES256).

The proposed parameter sets of SIKE are named after the bit length of the underlying primes p. This prime p is part of the parameter set itself. See [27] for the detailed definition of each parameter set. Note that the authors of SIKE did not propose a parameter set supposed to satisfy NIST security level 4 (SHA384).

- p434 supposed to satisfy NIST security level 1 (AES128)
- p503 supposed to satisfy NIST securiy level 2 (SHA256)
- p610 supposed to satisfy NIST securiy level 3 (AES192)
- p751 supposed to satisfy NIST securiy level 5 (AES256)

All isogeny-based cryptographic primitives presented in this chapter can be initialized with one of these parameter sets to match a certain security level. In the context of this thesis the used parameter sets are also called *curves*.

Current research suggest that the SIKE parameter sets satisfy the defined security levels even under the assumption of currently known algorithms [31]. Therefore, the authors consider three algorithms to solve the SIDH problem: Tani's quantum claw finding algorithm [32], Grover's algorithm [12] and a parallel collision-finding algorithm [33].

Ephemeral SIDH keys are predestined to implement quantum-secure perfect forward secret protocols [34]. PFS ensures that a compromised long-term key does not reveal past or future keys of the protocol.

Side-channel attacks against isogeny-based cryptography might 1) reveal parts of the secret private key or 2) reveal parts of the public key computation. To protect against power-analysis side-channel attacks it is recommend to implement constant-time cryptography [27]. The authors state, however, that an attacker has "access to a wide range of power, timing, fault and various other side-channels". Thus, preventing isogeny-based cryptography from all side-channel attacks seems to be a challenge and is an active research area.

# 3. Description of existing SIDH implementations

Currently, three implementations of SIDH are available: *SIKE* [27] (closely related to *PQCrypto-SIDH* [35]), *CIRCL* [36] and *SIKE for Java* [37]. In this chapter each implementation is introduced in detail. At the end of this chapter, Table 3.1 summarizes similarities and differences between all approaches.

In the following, some algorithms are described as *compressed*. These compressed version exploit shorter public key sizes while increasing the computation time of the algorithms.

## **3.1. SIKE**

SIKE stands for Supersingular Isogeny Key Encapsulation. It is the reference implementation of the first proposed isogeny-based cryptographic primitives [26]. Today, SIKE is a NIST candidate for quantum-resistant "Public-key Encryption and Key-establishment Algorithms". It is developed by a cooperation of researchers, lead by David Jao [27].

## SIKE vs. PQCrypto-SIDH

The SIKE implementation is highly related to the SIDH source code of Microsoft available on Github<sup>1</sup>, called PQCrypto-SIDH. At the beginning of this thesis both implementations were considered as different implementations. Since some researches of SIKE also work for Microsoft the similarities of both APIs seemed to be reasonable. After contacting the SIKE team due to compilation issues of their NIST Round 3 submission, David Jao stated that SIKE uses the "[G]it repository hosted by Microsoft at https://github.com/Microsoft/PQCrypto-SIDH [...] as the source repository [...] to build the NIST package." (personal communication, November 17, 2020). this circumstance is unfortunately not documented by SIKE. This thesis treats them as equal (if not stated otherwise) since both libraries are closely related.

SIKE implements its key encapsulation mechanism (KEM) upon a public key encryption system (PKE) which is built upon SIDH (as described in chapter 2). Besides a generic reference implementation, SIKE offers various optimized implementations of their cryptographic primitves:

Generic optimized implementation, written in portable C

<sup>&</sup>lt;sup>1</sup>https://github.com/microsoft/PQCrypto-SIDH

- x64 optimized implementation, partly written in x64 assembly
- x64 optimized compressed implementation, partly written in x64 assembly
- ARM64 optimized implementation, partly written in ARMv8 assembly
- ARM Cortex M4 optimized implementation, partly written in ARM thumb assembly
- VHDL implementation

All of these implementations can be run with the following parameter sets: p434, p503, p610 and p751. SIKE asserts to countermeasure timing and cache attacks by implementing constant time cryptography [27].

#### Benchmarked version

The SIKE software release used in this thesis is the official Round 2 submission package<sup>2</sup>. The latest release (Round 3 package) does not support native SIDH compilation as David Jao stated in private communication. Thus, updating to this release is not sufficient. In terms of code optimization the Round 3 package introduces improved algorithms for compressing keys [27]. The differences of these improvements are analyzed using the benchmarks of the PQCrypto-SIDH<sup>3</sup> library, which contains the changes.

#### **SIKE API**

The API of SIKE for a SIDH key exchange is the following:

All parameters used in this API are of type unsigned char\*. Note that for all implementations and all parameter sets the API is the same. Therefore, during compilation one need to include the correct subfolders (namely SIKEp434, SIKEp503, SIKEp610 and SIKEp751) to initialize SIKE with a specific parameter set.

```
// Generate random private key for Alice
void random_mod_order_A(PrivateKey_A);
```

Generating a random private key for Alice. The generated random bytes lie within an interval that is defined by the used parameter set. The generated private key is stored within PrivateKey\_A. No value is returned.

```
// Generate random private key for Bob
void random_mod_order_B(PrivateKey_B);
```

Generating a random private key for Bob. The generated random bytes lie within an interval that is defined by the used parameter set. The generated private key is stored within PrivateKey\_B. No value is returned.

<sup>&</sup>lt;sup>2</sup>https://csrc.nist.gov/CSRC/media/Projects/Post-Quantum-Cryptography/documents/round-2/submissions/SIKE-Round2.zip

<sup>&</sup>lt;sup>3</sup>commit: 1f8292d08570fe83c518797b6e103eb8a9f5e6dc

```
// Generate ephemeral public key for Alice
int EphemeralKeyGeneration_A(PrivateKey_A, PublicKey_A);
```

This function takes Alice's randomly generated private key PrivateKey\_A as input and computes a corresponding public key in PublicKey\_A. The function returns 0 if successful. The reference implementation of SIKE calls this function isogen. All later published SIKE implementations renamed the function to EphemeralKeyGeneration.

```
// Generate ephemeral public key for Bob
int EphemeralKeyGeneration_B(PrivateKey_B, PublicKey_B);
```

This function takes Bob's randomly generated private key PrivateKey\_B as input and computes a corresponding public key in PublicKey\_B. The function returns 0 if successful. The reference implementation of SIKE calls this function isogen. All later published SIKE implementations renamed the function to EphemeralKeyGeneration.

```
// Computation of shared secret by Alice
int EphemeralSecretAgreement_A(PrivateKey_A, PublicKey_B, SharedSecret_A)
```

This function uses Alice's PrivateKey\_A and Bob's PublicKey\_B to produce a shared secret SharedSecret\_A between Alice and Bob. If successful, this function returns 0. Note that this is the same as the function isoex in the SIKE Reference implementation.

```
// Computation of shared secret by Bob
int EphemeralSecretAgreement_B(PrivateKey_B, PublicKey_A, SharedSecret_B)
```

This function uses Bob's PrivateKey\_B and Alice's PublicKey\_A to produce a shared secret SharedSecret\_B between Alice and Bob. If successful, this function returns 0. Note that this is the same as the function isoex in the SIKE Reference implementation.

## 3.2. CIRCL

CIRCL (Cloudflare Interoperable, Reusable Cryptographic Library) is a collection of cryptographic primitives developed by Cloudflare [36]. CIRCL is written in Go and implements some quantum-secure algorithms like SIDH and an isogeny-based KEM. Note that the GO compiler outputs a native binary. Cloudflare does not guarantee for any security within their library. Furthermore, the isogeny-based cryptographic primitives are adopted from the official SIKE implementation. The following implementation optimizations are stated to be available:

- Generic optimized implementation, written in Go
- AMD64 optimized implementation, partly written in assembly
- ARM64 optimized implementation, partly written in assembly

Note that there are no compressed versions available. The library supports the following parameter sets: p434, p503 and p751. To avoid side-channel attacks, their code is implemented in constant time [38].

#### Benchmarked version

The software release used in this thesis is identified by the following commit id 0440a499b7237516c7ba535bd1420241e13d385c of the CIRCL Github repository<sup>4</sup>.

#### **CIRCL API**

The API of CIRCL for a SIDH key exchange is the following:  $(XXX \in \{434, 503, 751\})$ 

```
// Generate random private key for Alice
PrivateKey_A = sidh.NewPrivateKey(sidh.FpXXX, sidh.KeyVariantSidhA)
PrivateKey_A.Generate(rand.Reader)

// Generate random private key for Bob
PrivateKey_B = sidh.NewPrivateKey(sidh.FpXXX, sidh.KeyVariantSidhB)
PrivateKey_B.Generate(rand.Reader)
```

The function NewPrivateKey allocates memory for a new private key using the defined parameter set (sidh.FpXXX) and the defined subject (sidh.KeyVariantSidhA for Alice and sidh.KeyVariantSidhB for Bob). The generated private key objects provides the function Generate that randomly generates a new private key based on a passed random number generator (rand.Reader). The code above initializes and randomly generates the private keys for Alice (PrivateKey\_A) and Bob (PrivateKey\_B).

```
// Generate public key for Alice
PublicKey_A = sidh.NewPublicKey(sidh.FpXXX, sidh.KeyVariantSidhA)
PrivateKey_A.GeneratePublicKey(PublicKey_A)

// Generate public key for Bob
PublicKey_B = sidh.NewPublicKey(sidh.FpXXX, sidh.KeyVariantSidhB)
PrivateKey_B.GeneratePublicKey(PublicKey_B)
```

The function NewPublicKey allocates memory for a new public key using the defined parameter set (sidh.FpXXX) and the defined subject (sidh.KeyVariantSidhA for Alice and sidh.KeyVariantSidhB for Bob). The already generated private key object provides the function GeneratePublicKey that returns the appropriate public key into the passed public key object. This corresponds to the isogen function of the SIKE reference implementation. The code above firstly initializes the public keys for Alice (PublicKey\_A) and Bob (PublicKey\_B). The above created private keys of Alice and Bob are then used to fill the public key objects.

<sup>&</sup>lt;sup>4</sup>https://github.com/cloudflare/circl/

```
// Computation of shared secret by Alice
SharedSecret_A := make([]byte, PrivateKey_A.SharedSecretSize())
PrivateKey_A.DeriveSecret(SharedSecret_A, PublicKey_B)

// Computation of shared secret by Bob
SharedSecret_B := make([]byte, PrivateKey_B.SharedSecretSize())
PrivateKey_B.DeriveSecret(SharedSecret_B, PublicKey_A)
```

In order to create the shared secrets for Alice and Bob, the initially created private key objects provide the function <code>DeriveSecret</code>. This function expects a public key and a previously allocated memory to store the shared secret in. This corresponds to the <code>isoex</code> function of the SIKE reference implementation. The code above firstly allocates the memory for a shared secret and finally generates the shared secret between Alice and Bob.

## 3.3. SIKE for Java

SIKE for Java implements experimental supersingular isongeny cryptography in Java [37]. The library is developed by Wutra in coooperation with Raiffeisen Bank International. Besides a slow reference implementation which focuses on code readability, SIKE for Java implements a optimized variant that focuses on performance and security. The library implements isogeny based PKE, KEM and SIDH and supports the following parameter sets: p434, p503, p610 and p751.

Since Java applications run via the Java Virtual Maschine (JVM)and are compiled during execution (Just-in-time compiler), the execution of Java programs is significantly slower than executing C or GO programs, which compile the source code before the execution takes place (Ahead-of-time compiler). Thus, comparing SIDH implementations between Java and C/GO does not produce meaningful results. For that reason *SIKE for Java* will not be considered for the benchmarks in this work.

## SIKE for Java API

The API of *SIKE for Java* for a SIDH key exchange using the optimized implementation is the following:

```
(XXX \in \{434, 503, 610, 751\})
```

```
// Defining parameter set
SikeParam sikeParam = new SikeParamP434(ImplementationType.OPTIMIZED);

// Initializing key generator
KeyGenerator keyGenerator = new KeyGenerator(sikeParam);

// Prepare SIDH object
Sidh sidh = new Sidh(sikeParam);
```

First of all, the parameter set and the desired implementation is defined by creating a object sikeParam of type SikeParam. This object is used to initialize a KeyGenerator object (used to generate keys) and to initialize a Sidh object (used to compute the shared secret).

```
// Initializing key pair for Alice
KeyPair keyPairA = keyGenerator.generateKeyPair(Party.ALICE);

// Initializing key pair for Bob
KeyPair keyPairB = keyGenerator.generateKeyPair(Party.BOB);
```

The object keyGenerator is used to generate key pairs for Alice and Bob by passing the appropriate party as parameter.

In order to generate the shared secret between Alice and Bob, both need to call the generateSharedSecret function of the sidh object created above. Each party passes the own private key and the public key of the other party in order to compute the shared secret of type Fp2Element.

## 3.4. Overview

|                             | SIKE   | CIRCL                       | SIKE for Java                |
|-----------------------------|--|-----------------------------|------------------------------|
| Developer                   | Research cooperation   | Cloudflare                  | Wultra                       |
| Language                    | C<br>Assembly  | GO<br>Assembly              | Java                         |
| Reference                   | www.sike.org   | Github:<br>cloudflare/circl | Github:<br>wultra/sike-java  |
| Implemented primitives      | SIDH<br>PKE<br>KEM   | SIDH<br>KEM                 | SIDH<br>PKE<br>KEM           |
| Available<br>parameters     | p434<br>p503<br>p610<br>p751   | p434<br>p503<br>p751        | p434<br>p503<br>p610<br>p751 |
| Optimized versions          | Generic<br>Generic compressed<br>x64<br>x64 compressed<br>ARM64<br>ARM Cortex M4<br>VHDL | Generic<br>AMD64<br>ARM64   | Generic for Java             |
| Security                    | Constant time  | Constant time               | Constant time                |
| Considered for benchmarking | Yes (distinction to PQCrypto-SIDH)   | Yes                         | No                           |

Table 3.1.: Overview over existing SIDH implementations.

# 4. Benchmarking Suite

In this chapter a benchmarking suite is presented that is able to generate comparable benchmarks between all SIDH implementations introduced in chapter 3. To get a better understanding of the results, this chapter starts with a description of the tools and methodologies used for benchmarking (section 4.1). The implementation details given in section 4.2 provide precise internals of the benchmarking suite. This might be used for further development of the software. A description of how to actually use the presented benchmarking suite is given in section 4.3.

## 4.1. Benchmarking Methodology

In order to generate independent and stable benchmarking results, the benchmarking suite runs within a virtual environment: *Docker* is used to separate the running suite from the host operating system. This reduces the influence of resource intensive processes which might falsify benchmarking results. Moreover, *Docker* enables a portable and scalable software solution. The benchmarking suite runs within a Ubuntu Docker container providing a virtual operating system.

The benchmarks measured in this thesis are *execution time* and *memory consumption*. These measurements are used to quantify the claimed resources of an algorithm.

In the following, the process of benchmarking is described within five steps. In a short version, the required steps are:

- 1. Create the benchmarking source code
- 2. Compile the benchmarking source code
- 3. Run Callgrind
- 4. Run Massif
- 5. Collect benchmarks

## Create the benchmarking code

Each software libraries presented in chapter 3 implements various cryptographic primitives. To avoid overhead when calculating benchmarks, only the required functions to generate a SIDH key exchange should be called. Thus, a simple benchmarking file is provided for each implementation which calls the appropriate underlying API. This benchmarking file must ensure that all required headers are imported, the API is called correctly and a main-function is provided.

## Compile the benchmarking code

Once the benchmarking source code is created, it needs to be compiled to a binary. Therefore, all required dependencies (libraries, headers, source code, ...) need to be provided to the compiler. The benchmarking suite provides a Makefile for each implementation, where the compilation process is implemented. All compilations performed for the benchmarking suite must use consistent compiler optimizations. This ensures the comparability of the binaries. Currently, the optimization flag -03 is passed to the gcc compiler. Note that CIRCL is implemented in GO and therefore the go compiler is used for compilation. Since this compiler does not provide optimization flags, the default compiler optimizations are used [39]. To be able to extract benchmarks for specific functions *inlining* is disabled during compilation. In order to avoid the modification of the source code of the libraries simple wrapper function were created, which only call the underlying API function. These wrapper function were marked to avoid *inlining*. The C programming language offers the following directive to disable *inlining* for a function:

```
// This function will not be inlined by the compiler
void __attribute__ ((noinline)) no_inlining() {
// ...
}

// This function might be inlined by the compiler
void inlining() {
// ...
}
```

The go compiler can be directly invoked with a no-inlining (-1) flag:

```
go build -gcflags "-1"
```

Compiling the source code determines the Instruction Set Architecture (ISA) of the binary. The architecture of a processor describes the ISA a concrete processor is able to process. When executing the binary the instructions that are defined in the ISA are executed by the processor.

## Run Callgrind

*Callgrind* records function calls of a binary. For each call the executed instructions which are processed by the processor are counted. Moreover, the tool provides detailed information about the callee and frequency of function calls. Thus, the tool also provides information about execution hotspots of the binary. *Callgrind* is part of *Valgrind*, a profiling tool which allows deep analysis of executed binaries.

Callgrind is invoked on the command line via:

```
valgrind --tool=callgrind --callgrind-out-file=callgrind.out binary
```

The profiling data of *callgrind* is written to the file defined by -callgrind-out-file. This file might be analyzed using a graphical tool like *KCachegrind* or any other analyzing script.

Running a binary using callgrind slows down the execution times of the benchmarking suite significantly. This is the main reason for the long execution times when collecting benchmarks.

Besides counting the instructions executed by the processor, one could also count elapsed CPU cycles or equivalently the elapsed time for a concrete binary. In the following paragraph the differences are considered and reasons for measuring instructions are given.

Firstly, the measured instruction count of *callgrind* can be converted to elapsed CPU cycles and to thus to the elapsed time. The following calculation exemplarily shows this conversion for the execution of a SIDH key exchange (using the SIKE x64\_optimized implementation initialized with parameter set p434). *Callgrind* measures constantly 64 621 792 instructions when executing that binary. The performance analyzing tool *perf* can also be run on that binary (sudo run perf binary). Besides the elapsed CPU cycles and elapsed time *perf* also measures the executed instructions per CPU cycle (IPC) and the average CPU frequency in GHz. This values can be used to compute the elapsed time of an application. It is important to note, that the IPC is not a characteristic index for a CPU, moreover it varies between multiple runs of the same application based on scheduling decisions and hardware dependencies (e.g. cache size) [40]. Thus, the measured CPU cycles and the corresponding elapsed time of an application is not constant. The measured IPC for the binary (SIKE x64\_optimized using p434) is on average 2.87 (10 samples). The measured CPU frequency is on average 2.66 *GHz* (10 samples). Thus, the elapsed time depending on the measured instructions can be computed as follows [40]:

$$\begin{split} \textit{Elapsed Time} &= \frac{\textit{Instructions}}{\textit{Instructions per Cycle (IPC)} \cdot \textit{CPU Frequency in GHz} \cdot 10^9} \; [s] \\ &= \frac{\textit{Instructions}}{2.87 \cdot 2.66 \cdot 10^9} \; [s] = \frac{\textit{Instructions}}{7,6342 \cdot 10^9} \; [s] \end{split}$$

For the instructions counted using *callgrind* this formula yields:

Elapsed Time = 
$$\frac{Instructions}{7.6342 \cdot 10^9} = \frac{64\ 621\ 792}{7.6342 \cdot 10^9} = 0.0084647759\ [s] = 8.465\ [ms]$$

At the same time the measured execution time by perf is on average 8.476 [ms] (10 samples). Since the difference is marginal it seems to be sufficient to provide the instruction counts instead of measuring the exact execution times.

Secondly, the elapsed time for an application depends on the IPC, which is a highly dynamic value (e.g. depending on scheduling decisions, cache misses or parallelism of the underlying CPU [40]). At the same time *callgrind* measures the executed instructions of the compiled application, which is a constant value if the binary itself implements static runtime behavior (e.g. the measured instructions of a binary printing "Hello World" once is constant, while

the executed instructions of a binary printing a randomly chosen amount of "Hello World" messages is not constant). Thus, the measured instructions only depend on the compiler and CPU architecture (ISA) and they are independent of the dynamic behavior of the concrete underlying CPU. Besides abstracting from the concrete CPU this also increases reproducibility of the benchmarking results.

## Run Massif

*Massif* measures memory usage of a binary including heap and stack. *Massif* is also part of the profiling tool *Valgrind*. The tool creates multiple snapshots of the memory consumption during execution. Thus, one can extract the maximum memory consumption of a binary. The following command runs the *Massif*:

```
valgrind --tool=massif --stacks=yes --massif-out-file=massif.out binary
```

The profiling data will be written to the file defined by -massif-out-file. *Massif-visualizer* could be used to graphically analyze the data.

#### Collect benchmarks

Once the output files of *Callgrind* and *Massif* are produced, one can parse and analyze the corresponding files to obtain:

- 1. Absolute instructions per function.
- 2. Maximum memory consumption during SIDH key exchange.

This information is finally used by the benchmarking suite to produce graphs and tables for further investigation. To receive reliable information all benchmarks are measured multiple times (e.g. N=100 times).

To further increase the quality and reproducibility of the results the cache of the virtual operating system is cleared, before *Callgrind* and *Massif* are executed. This is done via:

```
sync; sudo sh -c "echo_1_>_/proc/sys/vm/drop_caches"

sync; sudo sh -c "echo_2_>_/proc/sys/vm/drop_caches"

sync; sudo sh -c "echo_3_>_/proc/sys/vm/drop_caches"
```

## 4.2. Application Details

The benchmarking suite is developed in Python3 on a Linux/Ubuntu operating system. Currently, the following implementations are included:

- SIKE working on: p434, p503, p610 and p751
  - Sike reference implementation (SIKE\_Reference)
  - Sike generic optimized implementation (SIKE\_Generic)

- Sike generic optimized and compressed implementation (SIKE\_Generic\_Compressed)
- Sike x64 optimized implementation (SIKE\_x64)
- Sike x64 optimized and compressed implementation (SIKE\_x64\_Compressed)
- PQCrypto-SIDH working on: p434, p503, p610 and p751
  - PQCrypto-SIDH generic optimized implementation (Microsoft\_Generic)
  - PQCrypto-SIDH generic optimized and compressed implementation (Microsoft\_Generic\_Compressed)
  - PQCrypto-SIDH x64 optimized implementation (Microsoft\_x64)
  - PQCrypto-SIDH x64 optimized and compressed implementation (Microsoft\_x64\_Compressed)
- CIRCL working on: p434, p503 and p751
  - CIRCL x64 optimized implementation (CIRCL\_x64)

Furthermore, the benchmarking suite provides ECDH implemented in *OpenSSL*. Since SIDH is a candidate to replace current Diffie-Hellman algorithms, ECDH is intended as reference value: The objective is to compare optimized state-of-the-art ECDH with quantum-secure SIDH.

Since each parameter set of SIDH meets a different security level (compare subsection 2.3.4) ECDH is also instantiated with different curves, each matching a SIDH security level. The used elliptic curves are:

- 1. secp256r1 (openssl: prime256v1 [41]): 128 bit security matching p434 [42]
- 2. secp384r1 (openssl: secp384r1): 192 bit security matching p610 [42]
- 3. secp521r1 (openssl: secp521r1): 256 bit security matching p751 [42]

For each of these introduced implementations the application measures benchmarks. The following sections present detailed information about the internals of the suite. Besides the precise application flow (subsection 4.2.1), the internal class structure of the Python3 code is shown (subsection 4.2.2).

#### 4.2.1. Application Flow

This sections illustrates the application flow of the benchmarking suite (see Figure 4.1). Once triggered to run benchmarks, the following procedure is repeated for every implementation: The suite first compiles the benchmarking code. The binary is then executed multiple times to generate N benchmarking results, respectively for *Callgrind* and *Massif*. Outputs of *Callgrind* and *Massif* are parsed and saved in the benchmarking suite after each run.

Finally, the results are visualized in different formats. Graphs compare the recorded instruction counts and the peak memory consumption among implementations instantiated with

comparable security classes. The HTML and LaTeX tables lists detailed benchmarks per implementation.

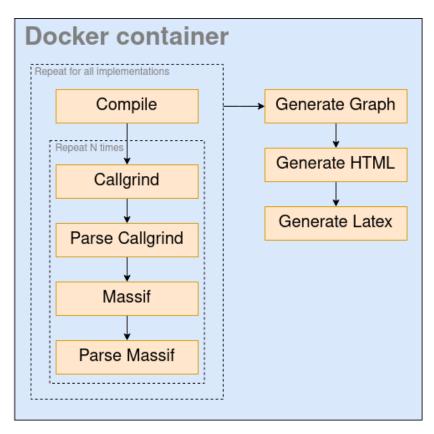


Figure 4.1.: Flow chart of the benchmarking suite. For each implementation, the source code is compiled and benchmarked multiple times. The benchmarking results are visualized in different format: Graphs, HTML and LaTeX.

#### 4.2.2. Application Structure

This section covers the internal structure of the benchmarking suite. It illustrates, how each implementation is represented in code and how the benchmarking results are managed. To get a detailed description of the implemented functions, consider the the well-documented source code.

#### Representation of concrete implementations

The main logic of the benchmarking suite is placed within the class BaseImplementation. This class implements the logic for compiling, executing *Callgrind* and *Massif* and parsing their results. For each implementation which shall be benchmarked, a subclass of BaseImplementation is created (see Figure 4.2). These subclasses provide a link to the respective *Makefile* which is used by the BaseImplementation for compiling, running callgrind and

| running massif. <i>Makefile</i> . | Furthermore, e | ach subclass ca | n provide a set | of arguments p | passed to the |
|-----------------------------------|----------------|-----------------|-----------------|----------------|---------------|
|                                   |                |                 |                 |                |               |
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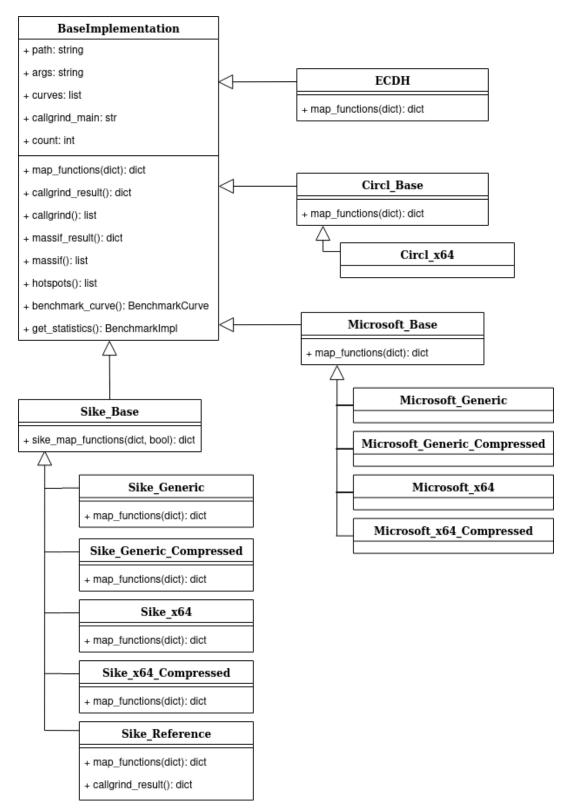


Figure 4.2.: Class diagram for all implementations supported by the benchmarking suite. All concrete implementations of SIDH inherit from BaseImplementation. A *Makefile* provided by each subclass specifies how the benchmarking code is built and run.

#### Representation of benchmarking results

In order to ensure a clear analysis of the results, the application implements a structure for the returned benchmarking values. Since each implementation can be run based on different parameter sets (in the terminology of the benchmarking suite this is called *curves*) and for each curve different benchmarking values are processed, the following hierarchy is applied (see Figure 4.3).

The class BechmarkImpl represents the benchmarking results of a specific implementation. Therefore, the class manages a list of BenchmarkCurve objects which contains benchmarks for a specific curve. Each benchmark for such a curve is represented by an instance of Benchmark. Thus, BenchmarkCurve holds a list of Benchmark objects.

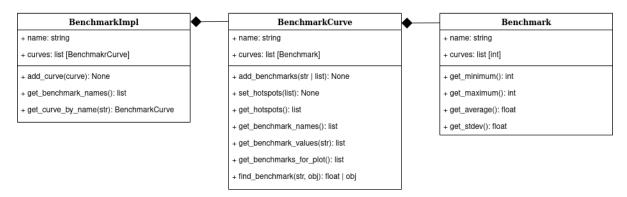


Figure 4.3.: Class diagram representing the management of the benchmarking results.

#### 4.2.3. Adding Implementations

To add a new implementation to the benchmarking suite it is recommended to consider already existing implementations. Moreover, addenda A.1 might be helpful to get a better understanding about the applied project hierarchy. Adding a SIDH implementation to the benchmarking suite requires the following steps:

- 1. Add a new folder into the container/ folder of the root directory container/new\_implementation/.
- 2. Create a file container/new\_implementation/benchmark.c that calls the SIDH key exchange API of the new implementation.
- 3. Add all necessary dependencies into container/new\_implementation/ that are needed to compile benchmark.c. Note, maybe some changes in the *Dockerfile* are necessary to install certain dependencies on the virtual operating system started by Docker.
- 4. Create a Makefile supporting the following commands:
  - build: Compile benchmark.c into the executable new\_implementation/build/benchmark
  - callgrind: Runs callgrind with the executable and stores the result in new\_implementation/benchmark/callgrind.out.

- massif: Runs massif with the executable and stores the result in new\_implementation/benchmark/massif.out.
- 5. Add a new class to the source code which inherits from BaseImplementation. You need to overwrite the map\_functions() method to map the specific API functions of the new implementation to the naming used within the benchmarking suite. The new class might look similar to this:

```
class New_Implementation(BaseImplementation):
   def __init__(self, count):
       super().__init__(count=count,
              path=[path to Makefile],
              args=[args for Makefile],
              callgrind_main=[name of main function],
              curves=curves)
   def map_functions(self, callgrind_result: dict) -> dict:
       res = {
           "PrivateKeyA": callgrind_result[[name of api function]],
           "PublicKeyA": callgrind_result[[name of api function]],
           "PrivateKeyB": callgrind_result[[name of api function]],
           "PublicKeyB": callgrind_result[[name of api function]],
           "SecretA": callgrind_result[[name of api function]],
           "SecretB": callgrind_result[[name of api function]],
       }
       return res
```

6. Import the created class into container/benchmarking.py and add the class to the implementations list:

```
implementations =[
    #...
New_Implementation,
]
```

Once these steps are done the benchmarking suits is able to benchmark the new implementation.

# 4.3. Usage

This section explains the usage of the benchmarking suite. Besides the execution of benchmarks, the application also provides unit tests for the suite itself. Both tasks - running benchmarks and executing unit tests - need to run within the docker container. Thus, it is

mandatory to install docker on your system to run the benchmarking suite<sup>1</sup>. To provide an easy to use interface for both tasks a script *run.sh* is available (see addenda A.1 for the project hierarchy). This script can be invoked with different arguments:

• Building the docker container:

./run.sh build

• Running unit tests within the docker container.

./run.sh test

Testing the benchmarking suite runs for a while, since each implementation is compiled to verify the functionality of the *Makefiles*. However, this procedure is logged while the unit tests are executed.

Running benchmarks within the docker container.

./run.sh benchmark

This command triggers the *benchmarking.py* script within the docker container. This script contains the entry logic of the benchmarking suite. It benchmarks all available implementations and generates different output formats (graphs, HTML, LaTeX). The frequency of measurements for each benchmark is configurable: The variable N in container/benchmarking.py describes the amount of repetitions for *callgrind* and *massif*. Once the benchmarks are done all output files can be inspected in the data/ folder of your current directory. These files visualize average values over N samples. The output files are:

- XXX.png: These files compare the absolute instruction counts of all implementations which were run on the XXX parameter set (XXX  $\in$  434, 503, 610, 751). Additionally, it contains a ECDH benchmark for comparison.
- $XXX\_mem.png$ : These files compare the peak memory consumption of all implementations which were run on the XXX parameter set (XXX  $\in$  434, 503, 610, 751). Additionally, it contains a ECDH benchmark for comparison.
- cached.json: This json file contains cached benchmarking results. It can be used as input for the benchmarking suite to import cached data instead of generating all benchmarks again. Since the benchmarking suite runs multiple hours if each implementation is evaluated N=100 times, this functionality speeds up the generation of the output graphs significantly. To use the cached file as input, copy it to container/.cached/cached.json and run the benchmarking suite again.
- *results.html*: This file lists detailed benchmarking results in a human readable HTML table.
- *results.tex*: This file contains the benchmarking results formatted in LaTeX. The output is used for this thesis.

The application was developed using Docker version 19.03.8, build afacb8b7f0. Instructions for installing *Docker*: https://docs.docker.com/get-docker/

# 5. Benchmarking Results

The results presented in this chapter have been calculated on a x64 architecture (Intel(R) Core(TM) i5-6200U CPU @ 2.30GHz) running Ubuntu 20.04.1 LTS. The installed docker version was 19.03.8. The benchmarking suite was initialized to run callgrind and massif 100 times, respectively (e.g. N=100). All values presented in this chapter are averages over N=100 samples. Additionally, all graphs contain the standard derivation (If no standard derivation can be observed in a particular graph, the value is zero or too small to be drawn). The exact values and the identified execution hotspots for all implementations instantiated respectively with all parameter sets (see section 4.2) can be found in addenda A.2. The efficiency in this chapter is quantified by the peak memory consumption and by the absolute instruction count measured by the benchmarking suite (details in chapter 4).

The graphs below use the following terminology: Assume Alice (A) and Bob (B) want to establish a shared secret using a SIDH key exchange.

- *KeygenA* describes the key generation (public and private key) of Alice.
- *KeygenB* describes the key generation (public and private key) of Bob.
- *SecretA* describes the computation of the shared secret by Alice.
- *SecretB* describes the computation of the shared secret by Bob.

This chapter starts with a comparison between all SIDH security levels in section 5.1. This demonstrates the performance differences of the available parameter sets.

A comparison among all available SIKE implementations is given in section 5.2: This section works out differences between *reference*, *generic optimized*,  $x_64$  *optimized* and *compressed* implementations of SIKE. Moreover, the previously mentioned similarities and differences between PQCrypto-SIDH and SIKE are investigated based on the measured benchmarking results.

In section 5.3 the comparison between SIKE and CIRCL is drawn to identify the most performant SIDH key exchange implementation. This section also analyses the observed execution hotspots of both libraries.

Differences in terms of efficiency between modern state-of-the-art ECDH and quantum-resistant SIDH are pointed out in section 5.4. This section also highlights execution hotspots measured for ECDH.

The chapter concludes with security considerations for all benchmarked implementations in terms of constant time cryptography and key size (section 5.5).

# 5.1. Comparing SIDH security levels

Before drawing any differences between libraries or implementations, this section considers the different parameter sets proposed in [27]: p434, p503, p610 and p751. All these parameters match a security level defined by NIST (see subsection 2.3.4 for details). This section makes use of the SIKE\_x64 implementation to visualize the claimed resources of the different parameter sets. Additionally, this section also compares the currently deployed SIDH parameters to classical elliptic curve cryptography parameters: secp256, secp384 and secp521. Recall the security classes of all parameter sets:

| Security Level | SIDH parameters | ECDH parameters |
|----------------|-----------------|-----------------|
| NIST level 1   | p434            | secp256         |
| NIST level 2   | p503            | -               |
| NIST level 3   | p610            | secp384         |
| NIST level 5   | p751            | secp521         |

Table 5.1.: NIST security levels with SIDH and ECDH parameters.

Figure 5.1 shows the absolute instruction counts for SIKE\_x64 initialized with all available parameter sets. While p434 executes 18 million instructions for *KeygenA*, p751 requires 67 million operations (3.7 times more). Roughly the same can be observed regarding *KeygenB*, *SecretA* and *SecretB*. The other parameter sets p503 and p610 almost lie on a linear line between the highest and lowest security class. At the same time the ECDH implementations are clearly faster while providing the same security levels: Secp256 processes in total 1.7 million instructions while p434 executes 69 million operations (40.6 times more) for a single SIDH key exchange. Secp384 (40 million) executes 4.3 times more instructions than p610 (170 million) and secp521 (96 million) executes 2.6 times more instructions than p751 (253 million).

The measured peak memory consumption is for p751 the highest (13.3 kB) and for p434 the lowest (8.2 kB) among SIDH parameters. Again, further parameter sets can be found in between of these boundary values (Figure 5.2). Moreover, one can observe an increased memory consumption of ECDH parameters: Compared to p434, the elliptic curve parameter set secp256 demands 4 kB more memory. Secp384 and secp521 allocate 3 kB additionaly memory compared to their appropriate SIDH parameters, respectively.

This analysis clearly demonstrates that an increased security level of SIDH corresponds with a increased claim of resources. Whereas the difference in terms of memory consumption is relatively small, the execution times differ noticably: On average and compared to p434 the parameter set

- p503 executes 1.4 times more instructions
- p610 executes 2.5 times more instructions
- p710 executes 3.7 times more instructions

While the ECDH parameter sets enable faster computation times for a single key exchange, they also suffer from an increased memory consumption. The reason for this might be a trade-off between execution time and memory consumption for implementing secure cryptography. Increased memory allocations for available SIDH parameters might also need to be taken into account in future to further reduce execution times.

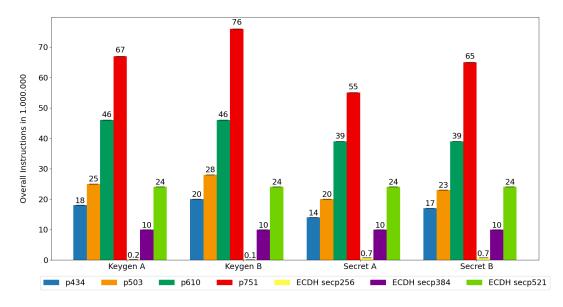


Figure 5.1.: Overall instructions for SIKE\_x64 initiated with all possible parameter sets compared to appropriate ECDH parameter sets.

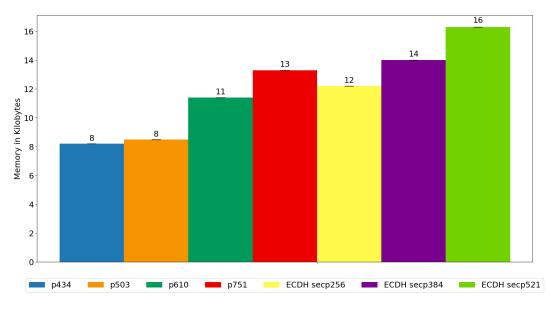


Figure 5.2.: Maximum memory consumption in kilobytes of SIKE\_x64 initiated with all possible parameter sets compared to appropriate ECDH parameter sets.

# 5.2. Comparing SIKE implementations

Before the comparisons between the SIDH libraries *SIKE* and *CIRCL* are drawn, the differences of available *SIKE* implementations are investigated. Besides a *reference* implementation, the library provides *generic optimized* and *x64 optimized* variants. This section analyzes the differences between these *optimized* implementations. Moreover, *compressed* versions for both *optimized* variants are available. The performance differences between *compressed* and *non-compressed* versions are additionally emphasized in this section. Note that all *compressed* versions of SIKE also contain *optimized* code. Their key sizes, however, are reduced compared to non-compressed variants. Since the previous section investigated differences between SIDH parameter sets this section only considers p434.

#### Reference implementation

The SIKE\_Reference implementation is with 11.2 kB allocated memory close to the average (~ 12.7 kB) of all SIKE implementations (see Figure 5.4). Regarding the execution times for key generation in Figure 5.3, the reference implementation is by far the slowest variant: More than 2.3 billion (2.300.000.000) instructions were measured in order to generate Bobs key pair. This is slower by factor 100 compared to SIKE\_x64. As the name suggests, this reference implementation must be seen as a proof-of-concept. Thus, performance criteria are no requirements for this implementation, which is confirmed by the observed benchmarking results.

#### Optimized implementations

SIKE provides two *optimized* implementations: SIKE\_generic and SIKE\_x64. The benchmarks in Figure 5.3 show a significant speed up of SIKE\_x64 compared to SIKE\_generic. Key generation for Alice and Bob is 10.8 times faster and secret generation about 11 times. At the same time SIKE\_generic allocates 7.7 kB memory, which is 0.5 kB less than the x64 optimized variant (Figure 5.4). Thus, the increased speed involves the allocation of more memory – a time-memory trade-off [43].

#### Compressed implementations

Figure 5.3 clearly shows a difference between *optimized* and *compressed* versions of SIKE in terms of absolute instructions. Compressed versions roughly claim twice as much operations ( $\sim 500$  million for SIKE\_Generic\_Compressed and  $\sim 45$  million SIKE\_x64\_Compressed) to generate a key pair as non-compressed variants ( $\sim 200$  million for SIKE\_Generic and  $\sim 19$  million SIKE\_x64). Additionally, the generation of the shared secret using compressed implementations is slightly slower.

Besides execution times, Figure 5.4 also compares the memory consumption. As stated by the authors of SIKE, compressed variants allocate more memory [27]: The peak memory allocation is with 17 kilobytes (SIKE\_Generic\_Compressed) and 19.2 kilobytes (SIKE\_x64\_Compressed) twice as high as for the non-compressed versions.

The comparison between all SIKE implementations showed that *optimized* versions have decreased instructions counts as well as decreased memory consumptions compared to *compressed* implementations. Roughly speaking, *compressed* versions demand twice as much resources than *optimized* variants, while decreasing the effective key sizes (see subsection 5.5.2 for details).

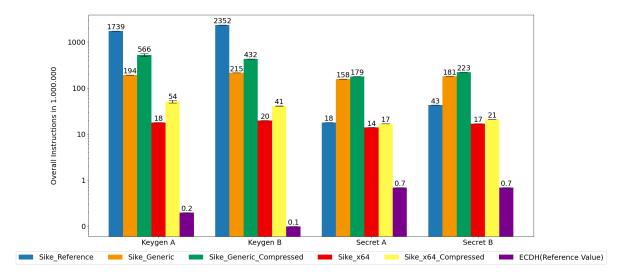


Figure 5.3.: Overall instructions for all SIKE implementations initialized with p434. ECDH is shown as reference value using parameter secp256.

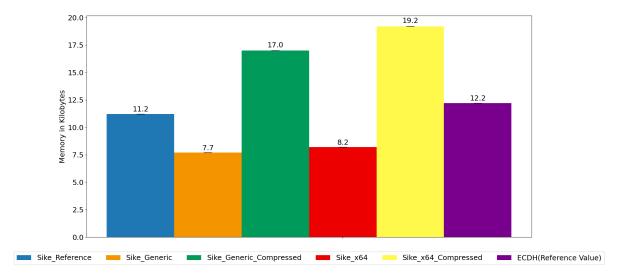


Figure 5.4.: Maximum memory consumption in kilobytes or all SIKE implementations initialized with p434. ECDH is shown as reference value using parameter secp256.

#### 5.2.1. PQCrypto-SIDH vs. SIKE

This section describes the similarities and differences between PQCrypto-SIDH and SIKE. Note, that the SIKE team uses the Microsoft Github repository of PQCrypto-SIDH to create their NIST submissions (see section 3.1 for details). At the same time the libraries reveal considerable differences when analyzing their *compressed* versions. Compressed implementations of SIDH promise shortened key size compared to non-compressed versions, however, this leads to increased execution times and memory allocations.

#### Optimized implementations

#### Compressed implementations

Figure 5.5 shows the execution time benchmarks for the compressed variants of PQCrypto-SIDH and SIKE initiated with p434. Naturally, the x64 optimized code is faster than the generic optimization. The Microsoft implementations executed less operations than SIKE: Regarding key generation, SIKE\_Generic\_Compressed performed on average 38% more instructions than Microsoft\_Generic\_Compressed. SIKE\_x64\_Compressed performed on average 45% more instructions than Microsoft\_x64\_Compressed. The generation of the secret key only shows slight differences between SIKE and Microsoft, however Microsoft remains the fastest. The trend of this analysis also applies to improved security classes, e.g to parameter p751 (see Figure 5.7)

The following evaluation of the allocated memory is surprising (Figure 5.6): The Microsoft implementations occupy three times more memory than SIKE when initiated with p434. This gap rises strongly when increasing the security class to p751 (Figure 5.8), where the the PQCrypto-SIDH library of Microsoft allocates almost seven times more memory.

While the benchmarks for the compressed Microsoft implementations show faster execution times, the overhead of allocated memory compared to SIKE is enormous. As stated earlier this is surprising since both libraries are highly related to each other. Further investigation stated out that the benchmarked PQCrypto-SIDH version already contained optimized compression algorithms [44] which are not included in the NIST Round2 submission of SIKE [27]. Thus, the observed differences are the results of optimizing compression algorithms: Reducing the execution times for compression directly increases the memory consumption of the algorithms – again a time-memory trade-off.

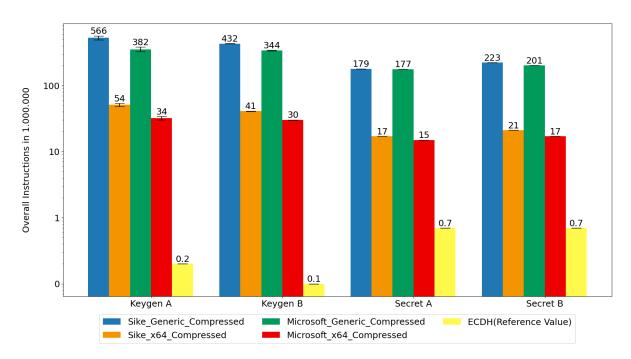


Figure 5.5.: Overall instructions for compressed SIDH parameter p434.

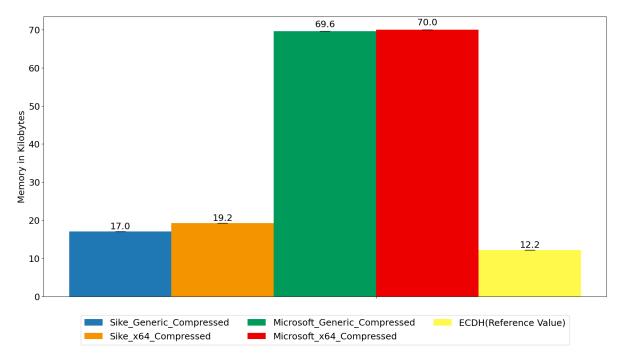


Figure 5.6.: Maximum memory consumption in kilobytes for compressed SIDH parameter p434.

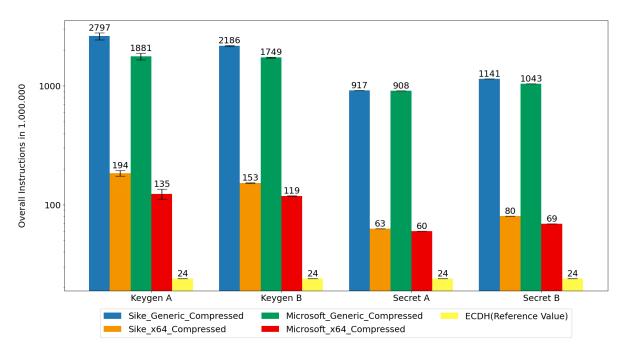


Figure 5.7.: Overall instructions for compressed SIDH parameter p751.

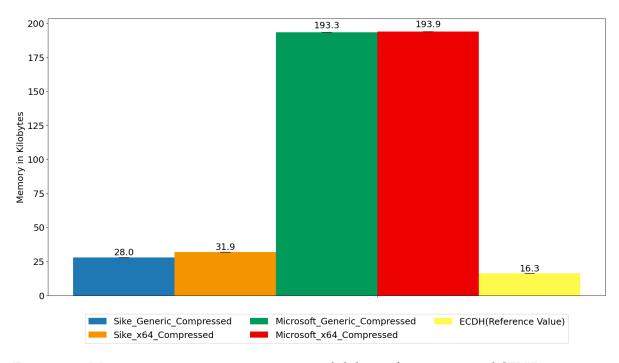


Figure 5.8.: Maximum memory consumption in kilobytes for compressed SIDH parameter p751.

# 5.3. Comparing SIKE and CIRCL

#### 5.3.1. Comparing optimized implementations

This subsection firstly compares generic optimized SIDH variants before x64 optimized implementations are analyzed.

#### Generic optimized implementations

Generic optimized implementations contain generally optimized code for various hardware platforms. However, no hardware specific instructions can be exploited in these versions. The benchmarking suite currently supports <sup>1</sup>:

- 1. SIKE Generic
- 2. Microsoft\_Generic

Figure 5.9 shows the benchmarks for execution time of all optimized variants initiated with p434. For this section, however, only *SIKE\_Generic* and *Microsoft\_Generic* are taken into account. In all four steps of the SIDH key exchange, the benchmarked values for both implementations look almost the same. However, when considering exact measurements from A.2, one can observe that *SIKE\_Generic* executes constantly half a million operations less than *Microsoft\_Generic* (this holds for all four categories: Keygen A, Keygen B, Secret A and Secret B). While this sounds significant, the relative difference is actually less than 0.01%. While the absolute gap further increases, when higher security classes are analyzed (about three million operations constant difference for p751), the relative disparity stays below 0.01%.

Peak memory consumptions for parameter *p434* are visualized in Figure 5.10. As in terms of execution time, memory allocation numbers between *SIKE\_Generic* and *Microsoft\_Generic* hardly differ: The SIKE version occupies 0.3 kB less memory for *p434* and 0.7 kB less than for *p751*. Overall, the relative difference regarding memory consumption is about 5%.

Although both implementations hardly differ in their performance benchmarks, one can state that *SIKE\_Generic* demands less resources (executed instructions and memory) than *Microsoft\_Generic*. This disparity, however, is marginal.

#### x64 optimized implementations

X64 optimized implementations exploit AMD64 specific hardware operations to improve performance on these machines. The benchmarking suite currently supports the following x64 optimized variants:

- 1. *SIKE\_x64*
- 2. Microsoft\_x64

<sup>&</sup>lt;sup>1</sup>Although CIRCL states to offer a generic optimized implementation[36], this version could not be compiled.

#### 3. CIRCL\_x64

Figure 5.9 shows the execution time benchmarks for all optimized variants initiated with p434. For this section, however, only SIKE\_x64, Microsoft\_x64 and CIRCL\_x64 are taken into account. In all four categories listed in the graph Microsoft\_x64 is the fastest implementation. SIKE\_x64 is slightly slower executing about two million instructions more in each category. This corresponds to a relative difference of about 10%. The most expensive implementation in terms of performed operations is CIRCL\_x64: 40% more operations are needed in each step of the SIDH key exchange compared to the fastest variant Microsoft\_x64.

Figure 5.11 compares the implementations initiated with p751 - matching the highest NIST security level 5.  $Microsoft\_x64$  stays the fastest version while the relative differences to  $SIKE\_x64$  (5%) and  $CIRCL\_x64$  (30%) decrease.

In order to compare the memory consumption of the x64 optimized implementations, consider Figure 5.10. The memory benchmarks of *SIKE\_x64* (8.2 kB) and *Microsoft\_x64* (8.9 kB) hardly differ, whereas *CIRCL\_x64* has a peak allocation of 24.7 kB for a single SIDH key exchange. This is by factor 2.5 greater compared to the others. However, Figure 5.12 reveals that the memory consumption for *CIRCL\_x64* does barely change for higher security classes. Nevertheless, *CIRCL\_x64* has the most intense memory consumption of all x64 optimized implementations and *Microsoft\_x64* allocates roughly about 10% more memory than *SIKE\_x64* (this holds respectively for all security classes) .

The fastest x64 optimized SIDH key exchange is performed by *Microsoft\_x64*. *SIKE\_x64* is slightly slower but allocates less memory than *Microsoft\_x64*. The most resources are consumed by *CIRCL\_x64* (instruction count and memory allocations).

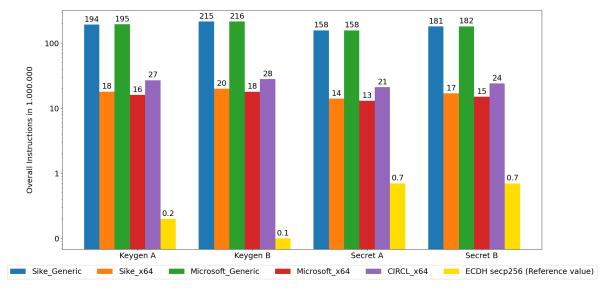


Figure 5.9.: Overall instructions for SIDH parameter p434 compared to ECDH via secp256r1.

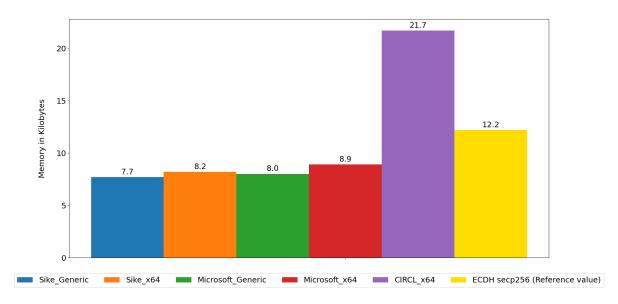


Figure 5.10.: Maximum memory consumption in kilobytes for SIDH parameter p434 compared to ECDH via secp256r1.

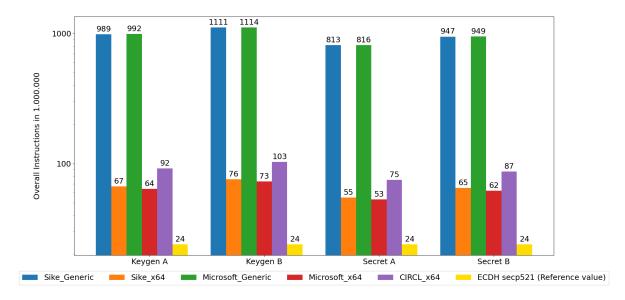


Figure 5.11.: Overall instructions for SIDH parameter p751 compared to ECDH via secp521r1.

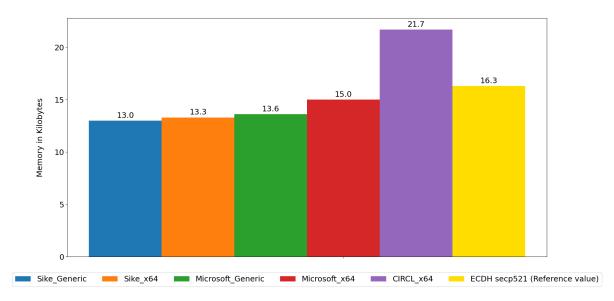


Figure 5.12.: Maximum memory consumption in kilobytes for SIDH parameter p751 compared to ECDH via secp521r1.

#### 5.3.2. Analysis of execution hotspots

Besides detailed benchmarks, addenda A.2 also lists the execution hotspots of each implementation initialized with different parameters. The following description of these hotspots reveals potentials to further improve performance of SIDH.

This evaluation also shows the similarity of *SIKE* and *PQCrypto-SIDH* which apparently build their SIDH APIs upon the same source code. Thus, both libraries suffer from the same execution hotspots: Each variant of *SIKE* and *PQCrypto-SIDH* spends more than 50% of its execution time within the function mp\_mul. The second great hotspot of both libraries is the function rdc\_mont with up to 32% consumed operations:

- 1. mp\_mul calculates c = a \* b for two given n-digit integers a and b (based on Karatsubas multiplication algorithm).
- 2.  $rdc_mont$  calculates  $c = a \mod p$  for given integers a and p (based on Montgomery reduction).

The identified hotspots of *CIRCL* are namely mulPxxx ( $\sim$ 50%) and rdcPxxx ( $\sim$ 50%) where xxx  $\in$  {434,503,751}. The source code provides further information, however, the documentation of *CIRCL* makes it hard to form reliable statements on the exact internals of the identified hotspot functions:

- 1. mulPxxx calculates z = x \* y given integers a and b (based on Karatsubas multiplication algorithm).
- 2. rdcPxxx calculates  $z = x * R^{-1}(mod2*p)$  for given integers x and p (based on Montgomery reduction).

It can be seen that all three SIDH libraries struggle with the same issue: Performing many multiplications and modulo operations is expensive. Since all libraries exploit state-of-the-art algorithms (Karatsubas multiplication algorithm and Montgomery reduction) the ongoing research in supersingular isogeny cryptography needs to find other ways to improve performance. Especially when comparing SIDH with modern ECDH key exchanges, these limitations are clearly visible.

# 5.4. Comparing SIDH and ECDH

To be able to make reliable statements about the current state of SIDH this section compares the quantum-secure SIDH implementations with state-of-the-art ECDH.

Besides all optimized SIDH versions, Figure 5.9 also shows benchmarks for a ECDH reference value via secp256r1. Note that the security class of parameter set p434 matches with secp256r1 (see section 4.2 for details). Compared to the fastest SIDH optimized implementation (Microsoft\_x64), ECDH is significantly faster: 80 times less instructions for KeygenA and 180 times less instruction for KeygenB are executed. Additionally, the generation of the secret is 18 times faster for secretA and 21 times faster for secretB.

More moderate results can be observed for parameter set P751 and secp512 (Figure 5.11): KeygenA (2.5 times), KeygenB (3 times), SecretA (2.2 times) and SecretB (2.6 times) of secp512 are faster compared to the fastest SIDH variant Microsoft\_x64.

While ECDH exploits much faster execution times, the memory consumption of ECDH is higher. Figure 5.10 shows a memory consumption of 7.7 kB (SIKE\_Generic via p434) while ECDH allocates 12.2 kB memory (1.5 times more). Similarly ECDH allocates 1.2 times more memory than SIDH instantiated with p751 (Figure 5.12).

In order to enable fast and user-friendly cryptography the execution times of cryptographic primitives are essential. ECDH of *OpenSSL* requires less instructions than all SIDH libraries. While the difference to lower security classes is considerable, the comparison of higher security classes reveals less differences. However, the use of SIDH in a wide range of applications is currently hard to imagine. At the same time research is still ongoing and multiple optimizations for SIDH were proposed within the last years (see https://sike.org/).

#### 5.4.1. Analysis of ECDH execution hotspots

As listed in addenda A.2, the measured execution hotspots for the *OpenSSL* implementation of ECDH differ, since the *OpenSSL* implementation for secp256r1 is prime256v1 while secp384r1 and secp512r1 are directly implemented in the library [41].

The hotspots of secp256r1 are the low level prime field arithmetic functions \_\_ecp\_nistz256\_mul\_montq (29.9%) and \_\_ecp\_nistz256\_sqr\_montq (18.3%):

1. \_\_ecp\_nistz256\_mul\_montq Computation of a montgomery multiplication:  $res = a * b * 2^{-256} \mod P$ , for integers a,

b and P.

2. \_\_ecp\_nistz256\_sqr\_montq Computation of a montgomery square:  $res = a * a * 2^{-256} \mod P$ , for integers a and P.

The measured hotspots for the secp384r1 and secp512r1 are likewise prime field arithmetics: bn\_mul\_mont claims 67.2% (secp384r1) and 80.0% (secp512r1) of all executed instructions. bn\_mod\_add\_fixed\_top demands 6.2% (secp384r1) and 4.3% (secp512r1):

- 1. bn\_mul\_mont Computation of a montgomery multiplication for *bignum* integers.
- 2. bn\_mod\_add\_fixed\_top
  "BN\_mod\_add variant that may be used if both a and b are non-negative and less than m."

Similar to the previously described SIDH hotspots, the underlying performance bottlenecks of ECDH are related to prime field arithmetic. The well researched ECDH cryptography enables similar algorithms (montgomery multiplication) in order to accelerate cryptographic primitives. This results in fast and user-friendly encryption schemes.

# 5.5. Security Considerations

In order to analyze the given implementations in terms of security, the claim of all libraries to implement security relevant functions in constant time is investigated in subsection 5.5.1. The implemented key sizes of all SIDH libraries and the used ECDH curves will be considered additionally in subsection 5.5.2.

#### 5.5.1. Constant time

Besides the average for N=100 executions addenda A.2 also lists the standard deviation of the measured execution time and allocated memory. This standard deviation is computed as  $s=\sqrt{\frac{1}{N-1}\sum_{i=1}^{N}(x_i-\bar{x})^2}$ . In this section the measured standard deviations are considered to verify which libraries implement constant time cryptography.

Since the performed public key compression of each *compressed* variant of SIDH depends on the public key itself (rather than on the public key size), they are not implemented in constant time. This is directly visible in addenda A.2.

The standard deviation for the following variants is zero and thus these variants implement constant time cryptography:

- SIKE\_Reference, SIKE\_Generic and SIKE\_x64
- Microsoft\_Generic and Microsoft\_x64

On the other hand, the following implementations show deviations in their execution time. Thus, they are not implemented in constant time:

- ECDH for the benchmarked curves secp256r1, secp384r1, secp512r1 in OpenSSL
- CIRCL\_x64

#### **5.5.2.** Key size

This section compares the size of public keys implemented by the SIDH libraries *SIKE*, *PQCrypto-SIDH* and *CIRCL* with modern *OpenSSL* ECDH. The used parameters matching the appropriate NIST security level can be found in section 4.2. Since all SIDH libraries implement the same parameter sets their key sizes are identical. However, *compressed* variants of SIDH benefit from reduced public key sizes, while extending execution time. The key sizes of the used ECDH curves is part of the name, e.g. secp256r1 exploits 256 bits (256/8 = 32 bytes) as public key. The following table lists the relevant key sizes in bytes:

| Algorithm    | SIDH | SIDH<br>compressed | ECDH               |
|--------------|------|--------------------|--------------------|
| NIST level 1 | 330  | 197                | 256/8 = 32         |
| NIST level 2 | 378  | 225                | 384/8 = 48         |
| NIST level 3 | 462  | 274                | -                  |
| NIST level 5 | 564  | 335                | $521/8 \approx 65$ |

Table 5.2.: Comparison of key sizes in bytes

Shorter public key sizes reduce transmitting and storage costs. The ECDH implementations exploit significantly shorter public keys than SIDH. However, SIDH implements the shortest public key sizes of all quantum-resistant alternatives [34].

# 6. Conclusion

This final chapter presents the major results of the previous chapter 5 in section 6.1 and describes limitations of the thesis in section 6.2.

#### 6.1. Results

This section summarizes all results of the benchmarking suite. For a detailed analysis of the measured data see chapter 5 and addenda A.2. The presented data in this section provides a relative comparison between the SIDH libraries *SIKE*, PQ-*Crypto* and *CIRCL*. Moreover, the relative difference between SIDH and ECDH is shown.

The most efficient implementation in the following tables is highlighted in green and has a relative difference of 1 to itself. All other implementations in the appropriate row are labeled with the relative distance to the most efficient implementation. For this evaluation the execution times and memory consumption for a whole Diffie-Hellman exchange are accumulated (key generation of A and B *plus* secret generation of A and B).

#### **Comparing SIDH libraries**

The values in Table 6.1 indicate *PQCrypto-SIDH* as the fastest library for *x64*, *x64 compressed* and *generic compressed* implementations, while *SIKE* is little faster for the *generic* variant. *CIRCL* only provides an *x64* implementation and is much slower than *SIKE* and *PQCrypto-SIDH* .

| Category           | SIKE | PQCrypto | CIRCL |
|--------------------|------|----------|-------|
| x64                | 1.09 | 1        | 1.57  |
| Generic            | 1    | 1.002    | -     |
| x64 compressed     | 1.37 | 1        | -     |
| Generic compressed | 1.27 | 1        | -     |

Table 6.1.: Comparison of execution times for all SIDH libraries initialized with p434.

On the contrary, *SIKE* allocates less memory than *PQCrypto-SIDH* for all implementations, especially for both *compressed* versions *PQCrypto-SIDH* demands clearly more memory. Again, *CIRCL* request the most resources.

| Category           | SIKE | PQCrypto | CIRCL |
|--------------------|------|----------|-------|
| x64                | 1    | 1.09     | 2.65  |
| Generic            | 1    | 1.04     | -     |
| x64 compressed     | 1    | 3.68     | -     |
| Generic compressed | 1    | 4.1      | -     |

Table 6.2.: Comparison of memory consumption for all SIDH libraries initialized with p434.

#### Comparing SIDH and ECDH

The analysis of Table 6.3 reveals the differences between *SIDH* and *ECDH* in terms of execution times. Note that all security classes and only the x64 optimized variants of all libraries are considered.

While the overhead of *SIDH* for the security level AES128 (matches NIST security level 1 and p434) is enormous the relative difference for higher security levels decreases. However, ECDH requests slightly more memory than SIDH (see chapter 5).

| Security Level |       | SIDH     |       | ECDH    |
|----------------|-------|----------|-------|---------|
| Security Level | SIKE  | PQCrypto | CIRCL | openSSL |
| AES128         | 44.55 | 40.93    | 64.46 | 1       |
| AES192         | 2.36  | 2.18     | 2.78  | 1       |
| AES256         | 2.71  | 2.59     | 3.66  | 1       |

Table 6.3.: Comparison of the x64 optimized SIDH implementations with modern x64 optimized ECDH by *OpenSSL* in terms of execution time.

#### 6.2. Limitations

This section lists limitations and approaches for future work in the context of this thesis. Firstly, the correctness of the results measured by the benchmarking suite is based on the tools *massif* and *callgrind* provided by valgrind. Any disruptions within these tools directly affect all benchmarks.

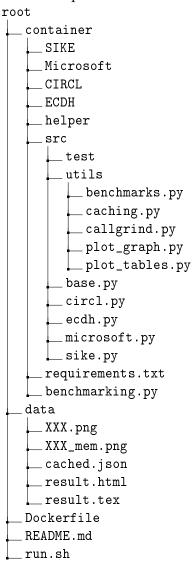
Secondly, the integration process to generate benchmarks for a new implementation could be further improved. Up to now, the process described in 4.2.3 is time-consuming and errorprone. This could be improved e.g. by auto detecting new sub folders containing appropriate Makefiles. Moreover, the generation of different output graphs can currently only be achieved by manually changing the source code of the benchmarking suite. Appropriate command line arguments for the benchmarking suite might increase usability.

Finally, for the comparison between SIDH and ECDH only three curves of the *OpenSSL* library are considered. A more precise analysis among existing ECDH libraries might reveal more detailed results.

# A. General Addenda

# A.1. Project hierarchy

This section illustrates the project hierarchy of the developed benchmarking suite. For details see the description below.



The root project directory contains following sub directories:

#### 1. container:

This folder contains everything needed to start the Docker container. Besides the source code of the benchmarking suite (container/src), this folder also contains sub folders for all included libraries. These sub folders (container/SIKE, container/Microsoft, container/CIRCL and container/ECDH) contain Makefiles to compile and benchmark the appropriate library (for details see subsection 4.2.3).

*Requirements.txt* lists the Python dependencies for the benchmarking suite and *benchmarking.py* contains the entrypoint of the benchmarking suite.

#### 2. data:

The data folder contains the output data of the benchmarking suite as described in section 4.3.

#### 3. Dockerfile:

This Dockerfile specifies the Docker container the benchmarking suite runs in.

#### 4. README.md:

The README describing the usage of the benchmarking suite.

#### 5. run.sh:

This shell script can be invoked with the following arguments: benchark, build and test. For details see section 4.3.

#### A.2. Detailed Benchmarks

This addenda contains the detailed benchmarks which were measured by the benchmarking suite. The listed tables contain benchmarking results for all supported implementations. For each implementation and each parameter set the listed functions where executed N=100 times. The tables contain the average execution time and average peak memory consumption  $(\bar{x} = \frac{1}{N} \sum_{i=1}^{N} (x_i))$ . Moreover, the values in brackets are the standard deviation over all measured values. This standard deviation is computed as  $s = \sqrt{\frac{1}{N-1} \sum_{i=1}^{N} (x_i - \bar{x})^2}$ . All values (except memory) are absolute instruction counts.

#### A.2.1. Benchmarks for ECDH

| Parameter     | secp256 | secp384    | secp521    |
|---------------|---------|------------|------------|
| PrivateKeyA   | 0       | 0          | 0          |
| TilvateReyA   | (0)     | (0)        | (0)        |
| PublicKeyA    | 159.418 | 10.357.129 | 24.548.035 |
| rublickeyA    | (0)     | (3.556)    | (6.482)    |
| Drivata Var P | 0       | 0          | 0          |
| PrivateKeyB   | (0)     | (0)        | (0)        |
| PublicKeyB    | 114.430 | 10.307.769 | 24.499.652 |
| rublickeyb    | (0)     | (4.039)    | (6.215)    |
| SecretA       | 652.796 | 10.305.471 | 24.497.519 |
| SecretA       | (2)     | (3.531)    | (6.193)    |
| SecretB       | 651.270 | 10.303.993 | 24.494.213 |
| Secreto       | (2)     | (3.882)    | (6.054)    |
| Memory        | 12.152  | 13.984     | 16.251     |
| in bytes      | (0)     | (0)        | (13)       |

Table A.1.: Benchmarks for ECDH

# Execution hotspots parameter *secp256*:

1. \_\_ecp\_nistz256\_mul\_montq: 29.89%

 $2. \ \_\texttt{ecp\_nistz256\_sqr\_montq} \colon 18.32\%$ 

3. \_dl\_relocate\_object: 7.27%

# Execution hotspots parameter *secp384*:

 $1. \ \mathtt{bn\_mul\_mont} \colon 67.23\%$ 

2. bn\_mod\_add\_fixed\_top: 6.28%3. bn\_mul\_mont\_fixed\_top: 3.82%

# Execution hotspots parameter *secp521*:

1.  $bn_mul_mont: 80.08\%$ 

2. bn\_mod\_add\_fixed\_top: 4.83%3. bn\_mul\_mont\_fixed\_top: 2.2%

#### A.2.2. Benchmarks for Sike Reference

| Parameter     | 434           | 503           | 610           | 751            |
|---------------|---------------|---------------|---------------|----------------|
| D.: ( - I/ A  | 28.919        | 29.020        | 34.541        | 34.770         |
| PrivateKeyA   | (0)           | (0)           | (0)           | (0)            |
| PublicKeyA    | 1.739.736.057 | 2.512.464.770 | 4.308.288.592 | 7.461.795.045  |
| TublickeyA    | (0)           | (0)           | (0)           | (0)            |
| Drivata Var P | 29.418        | 29.519        | 34.617        | 35.289         |
| PrivateKeyB   | (0)           | (0)           | (0)           | (0)            |
| PublicKeyB    | 2.352.757.723 | 3.435.254.160 | 5.790.924.796 | 10.556.125.964 |
| rublickeyb    | (0)           | (0)           | (0)           | (0)            |
| SecretA       | 18.726.146    | 22.075.791    | 27.927.622    | 35.617.111     |
| Secreta       | (0)           | (0)           | (0)           | (0)            |
| SecretB       | 43.530.260    | 56.573.382    | 79.580.027    | 118.687.930    |
| Secreto       | (0)           | (0)           | (0)           | (0)            |
| Memory        | 11.208        | 11.928        | 12.904        | 13.736         |
| in bytes      | (0)           | (0)           | (0)           | (0)            |

Table A.2.: Benchmarks for Sike Reference

#### Execution hotspots parameter 434:

- 1. \_\_gmpn\_sbpi1\_div\_qr: 10.7%
- 2. \_\_gmpn\_tdiv\_qr: 9.59%
- 3.  $\_gmpn\_hgcd2: 9.29\%$

# Execution hotspots parameter 503:

- 1. \_\_gmpn\_sbpi1\_div\_qr: 11.08%
- 2. \_\_gmpn\_hgcd2: 9.8%
- 3. \_\_gmpn\_submul\_1: 9.61%

#### Execution hotspots parameter 610:

- 1. \_\_gmpn\_submul\_1: 12.08%
- 2. \_\_gmpn\_sbpi1\_div\_qr: 11.67%
- 3.  $\_gmpn_mul_basecase: 10.13\%$

#### Execution hotspots parameter 751:

- 1. \_\_gmpn\_submul\_1: 15.21%
- 2.  $\_gmpn_mul_basecase: 11.82\%$
- 3. \_\_gmpn\_sbpi1\_div\_qr: 11.69%

#### A.2.3. Benchmarks for Sike Generic

| Parameter      | 434         | 503         | 610         | 751           |
|----------------|-------------|-------------|-------------|---------------|
| Drive to Voy A | 90          | 95          | 96          | 97            |
| PrivateKeyA    | (0)         | (0)         | (0)         | (0)           |
| PublicKeyA     | 194.932.002 | 299.462.858 | 618.958.459 | 989.778.051   |
| TublickeyA     | (0)         | (0)         | (0)         | (0)           |
| Drivata Var P  | 57          | 57          | 53          | 59            |
| PrivateKeyB    | (0)         | (0)         | (0)         | (0)           |
| Public Vov P   | 215.702.626 | 329.835.556 | 616.667.764 | 1.111.885.426 |
| PublicKeyB     | (0)         | (0)         | (0)         | (0)           |
| SecretA        | 158.061.535 | 243.950.880 | 515.975.033 | 813.862.458   |
| SecretA        | (0)         | (0)         | (0)         | (0)           |
| SecretB        | 181.708.340 | 278.459.825 | 522.486.909 | 947.216.296   |
| Secreto        | (0)         | (0)         | (0)         | (0)           |
| Memory         | 7.720       | 7.784       | 11.288      | 13.016        |
| in bytes       | (0)         | (0)         | (0)         | (0)           |

Table A.3.: Benchmarks for Sike Generic

# Execution hotspots parameter 434:

mp\_mul: 59.45%
 rdc\_mont: 31.67%

 $3. \ \mathtt{fp2mul434\_mont} \colon 4.58\%$ 

# Execution hotspots parameter 503:

1. mp\_mul: 59.06% 2. rdc\_mont: 33.02%

3.  $fp2mul503_mont: 4.07\%$ 

# Execution hotspots parameter 610:

1. mp\_mul: 60.05% 2. rdc\_mont: 32.8%

3.  $fp2mul610_mont: 4.0\%$ 

#### Execution hotspots parameter 751:

mp\_mul: 61.06%
 rdc\_mont: 32.76%

3. fp2mul751\_mont: 3.42%

# A.2.4. Benchmarks for Sike Generic Compressed

| Parameter      | 434          | 503          | 610           | 751           |
|----------------|--------------|--------------|---------------|---------------|
| Drive to Voy A | 97           | 95           | 99            | 107           |
| PrivateKeyA    | (0)          | (0)          | (0)           | (0)           |
| Dublic Vov A   | 530.693.055  | 800.568.613  | 1.546.560.342 | 2.619.265.805 |
| PublicKeyA     | (36.636.736) | (51.179.821) | (104.069.626) | (178.208.196) |
| Privato Vov. R | 185          | 145          | 215           | 200           |
| PrivateKeyB    | (0)          | (0)          | (0)           | (0)           |
| PublicKeyB     | 430.783.226  | 648.550.068  | 1.209.676.275 | 2.163.046.938 |
| 1 ublickeyb    | (2.956.687)  | (5.818.409)  | (9.989.150)   | (23.915.892)  |
| SecretA        | 179.835.016  | 276.744.609  | 575.396.837   | 917.385.785   |
| SecretA        | (2.751)      | (2.820)      | (4.432)       | (6.137)       |
| SecretB        | 223.183.731  | 342.669.712  | 640.870.333   | 1.141.966.654 |
| Secreto        | (2.871.219)  | (3.247.052)  | (5.431.240)   | (14.089.895)  |
| Memory         | 16.968       | 19.080       | 23.976        | 28.008        |
| in bytes       | (0)          | (0)          | (0)           | (0)           |

Table A.4.: Benchmarks for Sike Generic Compressed

#### Execution hotspots parameter 434:

1. mp\_mul: 58.77% 2. rdc\_mont: 32.15%

3. fp2mul434\_mont: 4.13%

# Execution hotspots parameter 503:

1. mp\_mul: 58.4% 2. rdc\_mont: 33.46%

3. fp2mul503\_mont: 3.71%

#### Execution hotspots parameter 610:

mp\_mul: 59.42%
 rdc\_mont: 33.34%

3. fp2mul610\_mont: 3.61%

#### Execution hotspots parameter 751:

1. mp\_mul: 60.46% 2. rdc\_mont: 33.29%

3. fp2mul751\_mont: 3.1%

# A.2.5. Benchmarks for Sike x64

| Parameter       | 434        | 503        | 610        | 751        |
|-----------------|------------|------------|------------|------------|
| Drivata Vay A   | 90         | 95         | 96         | 97         |
| PrivateKeyA     | (0)        | (0)        | (0)        | (0)        |
| PublicKeyA      | 18.197.636 | 25.309.825 | 46.870.491 | 67.976.631 |
| TublickeyA      | (0)        | (0)        | (0)        | (0)        |
| Dwizzało V ozzP | 57         | 57         | 53         | 59         |
| PrivateKeyB     | (0)        | (0)        | (0)        | (0)        |
| DublicKovP      | 20.227.975 | 28.024.313 | 46.946.162 | 76.798.386 |
| PublicKeyB      | (0)        | (0)        | (0)        | (0)        |
| SecretA         | 14.735.273 | 20.595.673 | 39.015.534 | 55.840.033 |
| SecretA         | (0)        | (0)        | (0)        | (0)        |
| SecretB         | 17.044.799 | 23.672.739 | 39.800.369 | 65.465.094 |
|                 | (0)        | (0)        | (0)        | (0)        |
| Memory          | 8.168      | 8.520      | 11.392     | 13.328     |
| in bytes        | (0)        | (0)        | (0)        | (0)        |

Table A.5.: Benchmarks for Sike x64

# Execution hotspots parameter 434:

mp\_mul: 52.23%
 rdc\_mont: 23.46%
 fpsub434: 4.22%

# Execution hotspots parameter 503:

mp\_mul: 49.88%
 rdc\_mont: 27.18%
 fpsub503: 4.12%

# Execution hotspots parameter 610:

mp\_mul: 51.51%
 rdc\_mont: 28.57%
 fpsub610: 3.72%

#### Execution hotspots parameter 751:

mp\_mul: 53.34%
 rdc\_mont: 27.94%
 fpsub751: 3.81%

# A.2.6. Benchmarks for Sike x64 Compressed

| Parameter       | 434         | 503         | 610         | 751          |
|-----------------|-------------|-------------|-------------|--------------|
| DuixataVax A    | 97          | 95          | 99          | 107          |
| PrivateKeyA     | (0)         | (0)         | (0)         | (0)          |
| Dublic Vov A    | 51.478.796  | 70.633.473  | 120.698.795 | 184.983.750  |
| PublicKeyA      | (3.842.012) | (4.623.263) | (6.557.301) | (10.400.022) |
| Dwizzało V ozzP | 142         | 144         | 179         | 188          |
| PrivateKeyB     | (0)         | (0)         | (0)         | (0)          |
| Public/CovP     | 41.648.989  | 56.629.973  | 94.418.639  | 152.512.949  |
| PublicKeyB      | (345.077)   | (517.293)   | (796.824)   | (1.142.155)  |
| SecretA         | 17.062.490  | 23.745.084  | 44.067.290  | 63.697.941   |
| SecretA         | (1.558)     | (2.055)     | (2.871)     | (4.288)      |
| SecretB         | 21.428.968  | 29.717.372  | 49.633.365  | 80.095.836   |
| Secreto         | (241.953)   | (262.099)   | (394.707)   | (886.898)    |
| Memory          | 19.240      | 21.608      | 27.264      | 31.936       |
| in bytes        | (0)         | (0)         | (0)         | (0)          |

Table A.6.: Benchmarks for Sike x64 Compressed

# Execution hotspots parameter 434:

mp\_mul: 50.21%
 rdc\_mont: 23.14%
 fpsub434: 4.22%

# Execution hotspots parameter 503:

mp\_mul: 47.88%
 rdc\_mont: 26.74%
 fpsub503: 4.1%

#### Execution hotspots parameter 610:

mp\_mul: 49.73%
 rdc\_mont: 28.31%
 fpsub610: 3.75%

#### Execution hotspots parameter 751:

mp\_mul: 51.71%
 rdc\_mont: 27.79%
 fpsub751: 3.82%

#### A.2.7. Benchmarks for CIRCL x64

| Parameter      | 434        | 503        | 751         |
|----------------|------------|------------|-------------|
| PrivateKeyA    | 671        | 671        | 671         |
|                | (0)        | (0)        | (0)         |
| PublicKeyA     | 27.173.063 | 30.588.687 | 92.516.170  |
| TublickeyA     | (12.785)   | (14.339)   | (11.132)    |
| Drive to Vov P | 672        | 672        | 672         |
| PrivateKeyB    | (0)        | (0)        | (0)         |
| PublicKeyB     | 28.959.178 | 32.771.303 | 103.101.351 |
|                | (431)      | (314)      | (244)       |
| SecretA        | 21.089.046 | 23.926.495 | 75.130.980  |
| SecretA        | (2.101)    | (1.461)    | (636)       |
| SecretB        | 24.364.188 | 27.627.692 | 87.853.968  |
| Secreto        | (324)      | (360)      | (337)       |
| Memory         | 21.654     | 21.691     | 21.663      |
| in bytes       | (1.022)    | (896)      | (1.055)     |

Table A.7.: Benchmarks for CIRCL x64

# Execution hotspots parameter 434:

p434.mulP434: 47.28%
 p434.rdcP434: 22.93%
 p434.subP434: 5.81%

# Execution hotspots parameter 503:

p503.mulP503: 41.39%
 p503.rdcP503: 23.04%
 p503.subP503: 8.39%

# Execution hotspots parameter 751:

1. p751.mulP751: 56.16% 2. p751.rdcP751: 21.72% 3. p751.subP751: 6.02%

#### A.2.8. Benchmarks for Microsoft Generic

| Parameter   | 434         | 503         | 610         | 751           |
|-------------|-------------|-------------|-------------|---------------|
| PrivateKeyA | 86          | 91          | 91          | 91            |
|             | (0)         | (0)         | (0)         | (0)           |
| PublicKeyA  | 195.425.484 | 300.437.100 | 620.117.514 | 992.618.213   |
|             | (0)         | (0)         | (0)         | (0)           |
| PrivateKeyB | 53          | 53          | 48          | 53            |
|             | (0)         | (0)         | (0)         | (0)           |
| PublicKeyB  | 216.131.501 | 330.771.955 | 617.536.325 | 1.114.734.257 |
|             | (0)         | (0)         | (0)         | (0)           |
| SecretA     | 158.459.759 | 244.758.599 | 516.977.970 | 816.142.131   |
|             | (0)         | (0)         | (0)         | (0)           |
| SecretB     | 182.033.988 | 279.212.025 | 523.130.069 | 949.500.928   |
|             | (0)         | (0)         | (0)         | (0)           |
| Memory      | 8.040       | 8.360       | 11.784      | 13.624        |
| in bytes    | (0)         | (0)         | (0)         | (0)           |

Table A.8.: Benchmarks for Microsoft Generic

# Execution hotspots parameter 434:

mp\_mul: 60.55%
 rdc\_mont: 31.9%

3.  $fp2mu1434_mont: 4.56\%$ 

# Execution hotspots parameter 503:

mp\_mul: 60.12%
 rdc\_mont: 33.25%
 fp2mul503\_mont: 3.96%

# Execution hotspots parameter 610:

mp\_mul: 61.24%
 rdc\_mont: 32.54%
 fp2mul610\_mont: 4.02%

#### Execution hotspots parameter 751:

1. mp\_mul: 62.22% 2. rdc\_mont: 32.44%

3. fp2mul751\_mont: 3.43%

# A.2.9. Benchmarks for Microsoft Generic Compressed

| Parameter   | 434          | 503          | 610           | 751           |
|-------------|--------------|--------------|---------------|---------------|
| PrivateKeyA | 97           | 95           | 99            | 105           |
|             | (0)          | (0)          | (0)           | (0)           |
| PublicKeyA  | 354.807.131  | 548.929.246  | 1.058.952.592 | 1.767.280.284 |
|             | (28.640.848) | (48.233.475) | (69.882.412)  | (114.624.073) |
| PrivateKeyB | 239          | 233          | 206           | 314           |
|             | (0)          | (0)          | (0)           | (0)           |
| PublicKeyB  | 340.645.715  | 513.777.907  | 956.709.613   | 1.731.204.963 |
|             | (4.510.751)  | (5.790.443)  | (11.260.973)  | (18.353.464)  |
| SecretA     | 177.456.197  | 274.002.754  | 569.195.853   | 908.459.651   |
|             | (1.970)      | (1.875)      | (3.954)       | (5.191)       |
| SecretB     | 201.752.486  | 309.529.792  | 577.403.156   | 1.043.916.680 |
|             | (871)        | (1.000)      | (1.459)       | (1.618)       |
| Memory      | 69.576       | 89.896       | 134.600       | 193.336       |
| in bytes    | (0)          | (0)          | (0)           | (0)           |

Table A.9.: Benchmarks for Microsoft Generic Compressed

#### Execution hotspots parameter 434:

1. mp\_mul: 59.82% 2. rdc\_mont: 32.48%

3.  $fp2mu1434_mont: 4.06\%$ 

#### Execution hotspots parameter 503:

1. mp\_mul: 59.26% 2. rdc\_mont: 33.89%

3. fp2mul503\_mont: 2.89%

#### Execution hotspots parameter 610:

mp\_mul: 60.56%
 rdc\_mont: 33.26%

3. fp2mul610\_mont: 3.55%

# Execution hotspots parameter 751:

mp\_mul: 61.48%
 rdc\_mont: 33.03%

3. fp2mul751\_mont: 2.33%

# A.2.10. Benchmarks for Microsoft x64

| Parameter   | 434        | 503        | 610        | 751        |
|-------------|------------|------------|------------|------------|
| PrivateKeyA | 86         | 91         | 91         | 91         |
|             | (0)        | (0)        | (0)        | (0)        |
| PublicKeyA  | 16.733.523 | 23.373.795 | 44.826.467 | 64.976.610 |
|             | (0)        | (0)        | (0)        | (0)        |
| PrivateKeyB | 53         | 53         | 48         | 53         |
|             | (0)        | (0)        | (0)        | (0)        |
| PublicKeyB  | 18.587.638 | 25.858.758 | 44.876.850 | 73.377.700 |
|             | (0)        | (0)        | (0)        | (0)        |
| SecretA     | 13.529.422 | 18.993.109 | 37.346.394 | 53.326.381 |
|             | (0)        | (0)        | (0)        | (0)        |
| SecretB     | 15.655.268 | 21.831.732 | 38.025.823 | 62.514.039 |
|             | (0)        | (0)        | (0)        | (0)        |
| Memory      | 8.936      | 9.048      | 12.944     | 15.008     |
| in bytes    | (0)        | (0)        | (0)        | (0)        |

Table A.10.: Benchmarks for Microsoft x64

# Execution hotspots parameter 434:

mp\_mul: 55.81%
 rdc\_mont: 23.82%

 $3. 0 \pm 00000000000000$   $\pm 4.56\%$ 

# Execution hotspots parameter 503:

mp\_mul: 52.33%
 rdc\_mont: 28.27%

3. 0x00000000000d8e4: 4.38%

# Execution hotspots parameter 610:

mp\_mul: 53.86%
 rdc\_mont: 29.88%

3. 0x0000000000001256: 3.86%

#### Execution hotspots parameter 751:

mp\_mul: 55.83%
 rdc\_mont: 29.24%

3. 0x0000000000000fefd: 3.62%

# A.2.11. Benchmarks for Microsoft x64 Compressed

| Parameter   | 434         | 503         | 610         | 751          |
|-------------|-------------|-------------|-------------|--------------|
| PrivateKeyA | 97          | 95          | 99          | 105          |
|             | (0)         | (0)         | (0)         | (0)          |
| PublicKeyA  | 32.099.997  | 44.418.194  | 80.996.244  | 123.157.832  |
|             | (2.309.282) | (3.712.967) | (6.287.779) | (12.599.138) |
| PrivateKeyB | 149         | 152         | 187         | 200          |
|             | (0)         | (0)         | (0)         | (0)          |
| PublicKeyB  | 30.784.457  | 41.848.170  | 72.151.350  | 118.144.325  |
|             | (316.772)   | (319.398)   | (669.781)   | (1.757.118)  |
| SecretA     | 15.538.409  | 21.689.738  | 42.096.902  | 60.202.926   |
|             | (588)       | (483)       | (1.350)     | (1.955)      |
| SecretB     | 17.949.468  | 24.856.517  | 42.885.495  | 69.857.944   |
|             | (571)       | (656)       | (895)       | (1.243)      |
| Memory      | 69.960      | 90.640      | 135.216     | 193.872      |
| in bytes    | (0)         | (0)         | (0)         | (0)          |

Table A.11.: Benchmarks for Microsoft x64 Compressed

# Execution hotspots parameter 434:

mp\_mul: 52.82%
 rdc\_mont: 23.28%

 $3. 0 \times 00000000000247 dc: 3.56\%$ 

# Execution hotspots parameter 503:

mp\_mul: 49.75%
 rdc\_mont: 27.75%

3. 0x0000000000026694: 3.45%

# Execution hotspots parameter 610:

mp\_mul: 51.53%
 rdc\_mont: 29.48%

3. 0x00000000002e046: 3.09%

#### Execution hotspots parameter 751:

mp\_mul: 53.4%
 rdc\_mont: 28.99%

3. 0x000000000032f6d: 2.8%

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# List of Abbreviations

Notation Description

AES Advanced Encryption Standard, symmetric encryption

scheme

CIRCL Cloudflare Interoperable, Reusable Cryptographic Li-

brary

CPU Central Processing Unit, the processor of a computer

Dec Decryption function

DH Diffie-Hellman key exchange protocol

DSA Digital Signature Algorithm

ECDH Elliptic Curve Diffie-Hellman key exchange protocol

ECDSA Elliptic Curve Digital Signature Algorithm

Enc Encryption function

HTML Hypertext Markup Language

IPC Instructions per Cycle, the executed instructions within

a CPU clycle

ISA Instruction Set Arcitecture

JVM Java Virtual Maschine

 $k_{AB}$  Shared secret between subjects A and B

kB kilobytes

KEM Key Encapsulation Mechanism

McEliece Public-key cryptosystem MSS Merkle Signature Scheme

NIST National Institute of Standards and Technology

NTRU Public-key cryptosystem, NTRUencrypt

Notation Description

NTRUsign Digital signature algorithm

OpenSSL Software library for secure communication

PFS Perfect Forward Secrecy
PKE Public-Key Encryption

PQCrypto-SIDH Post-Quantum cryptographic library based on Supersin-

gular Isogenies

RSA Rivest–Shamir–Adleman public-key cryptosystem RSA-KEM Key Encapsulation Mechanism based on RSA

SHA Secure Hash Algorithms

SIDH Supersingular Isogeny Diffie-Hellman key exchange pro-

tocol

SIKE Supersingular Isogeny Key Encapsulation, first pro-

posed cryptographic protocols based on isogenies including key exchange, public-key encryption and key

encapsulation

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