

Improving Speed of Dilithium's Signing Procedure

Prasanna Ravi G1802146B

School of Computer Science and Engineering Physical Analysis and Cryptographic Engineering, Temasek Laboratories

17th April 2019





## Table of Contents



#### 2 Background

- Algorithmic Optimizations
- 4 Experimental Results

#### 5 Future Work







## Table of Contents

### Context

#### 2 Background

- 3 Algorithmic Optimizations
- 4 Experimental Results

#### 5 Future Work

#### 6 Conclusion





• Huge money in quantum computing is being invested by computer industry giants like Google, IBM, Intel and other companies like D-Wave, IonQ.





- Huge money in quantum computing is being invested by computer industry giants like Google, IBM, Intel and other companies like D-Wave, IonQ.
- A large scale quantum computer has the potential to break all of public key cryptography that we use today.





- Huge money in quantum computing is being invested by computer industry giants like Google, IBM, Intel and other companies like D-Wave, IonQ.
- A large scale quantum computer has the potential to break all of public key cryptography that we use today.
- This has prompted the cryptographic community to develop quantum resistant alternatives for public-key cryptography.





- Huge money in quantum computing is being invested by computer industry giants like Google, IBM, Intel and other companies like D-Wave, IonQ.
- A large scale quantum computer has the potential to break all of public key cryptography that we use today.
- This has prompted the cryptographic community to develop quantum resistant alternatives for public-key cryptography.
- NIST process for standardization of Post-Quantum cryptography is underway.





- Huge money in quantum computing is being invested by computer industry giants like Google, IBM, Intel and other companies like D-Wave, IonQ.
- A large scale quantum computer has the potential to break all of public key cryptography that we use today.
- This has prompted the cryptographic community to develop quantum resistant alternatives for public-key cryptography.
- NIST process for standardization of Post-Quantum cryptography is underway.
- Lattice-based cryptography has contributed the maximum number of proposals in terms of post-quantum key exchange and post-quantum signature schemes.





• Dilithium is one of the candidate signature schemes based on lattice-based cryptography.





- Dilithium is one of the candidate signature schemes based on lattice-based cryptography.
- This work involves improving the signing speed of Dilithium signature scheme.





- Dilithium is one of the candidate signature schemes based on lattice-based cryptography.
- This work involves improving the signing speed of Dilithium signature scheme.
- The Signing procedure is iterative in nature with multiple *rejection* conditions in each iteration.





- Dilithium is one of the candidate signature schemes based on lattice-based cryptography.
- This work involves improving the signing speed of Dilithium signature scheme.
- The Signing procedure is iterative in nature with multiple *rejection* conditions in each iteration.
- Several iterations of the signing procedure are repeated until the outputs satisfy a certain condition.
- Repetition rate hampers the performance of the signing procedure.





- Dilithium is one of the candidate signature schemes based on lattice-based cryptography.
- This work involves improving the signing speed of Dilithium signature scheme.
- The Signing procedure is iterative in nature with multiple *rejection* conditions in each iteration.
- Several iterations of the signing procedure are repeated until the outputs satisfy a certain condition.
- Repetition rate hampers the performance of the signing procedure.
- We attempt to improve the signing speed through algorithmic optimizations.





## Table of Contents

#### Context

### 2 Background

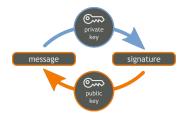
- 3 Algorithmic Optimizations
- 4 Experimental Results

#### 5 Future Work

### 6 Conclusion

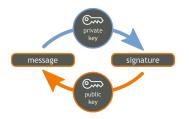










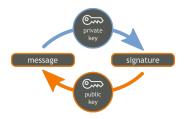


• A signature scheme consists of three procedures:



NANYANG TECHNOLOGICAL UNIVERSITY | SINGAPORE





- A signature scheme consists of three procedures:
  - Key Generation (Generates the public and private keys)







- A signature scheme consists of three procedures:
  - Key Generation (Generates the public and private keys)
  - **Signature Generation** (Generates signature for a given message)





- A signature scheme consists of three procedures:
  - Key Generation (Generates the public and private keys)
  - **Signature Generation** (Generates signature for a given message)
  - Verification (Verifies correctness of signature)







- A signature scheme consists of three procedures:
  - Key Generation (Generates the public and private keys)
  - **Signature Generation** (Generates signature for a given message)
  - Verification (Verifies correctness of signature)







NANYANG TECHNOLOGICAL UNIVERSITY | SINGAPORE



- Let  $\mathbf{A} \in \mathbb{Z}_q^{n imes n}$  and  $\mathbf{S}, \mathbf{E} \in \mathbb{Z}_q^n \leftarrow D_\sigma$
- $\mathbf{T} = (\mathbf{A} \times \mathbf{S} + \mathbf{E}) \in \mathbb{Z}_q^n$





- Let  $\mathbf{A} \in \mathbb{Z}_q^{n imes n}$  and  $\mathbf{S}, \mathbf{E} \in \mathbb{Z}_q^n \leftarrow D_\sigma$
- $\mathbf{T} = (\mathbf{A} \times \mathbf{S} + \mathbf{E}) \in \mathbb{Z}_q^n$
- Search LWE: Given several pairs  $(\mathbf{A},\mathbf{T})\text{, find }\mathbf{S}.$





- Let  $\mathbf{A} \in \mathbb{Z}_q^{n imes n}$  and  $\mathbf{S}, \mathbf{E} \in \mathbb{Z}_q^n \leftarrow D_\sigma$
- $\mathbf{T} = (\mathbf{A} \times \mathbf{S} + \mathbf{E}) \in \mathbb{Z}_q^n$
- Search LWE: Given several pairs  $(\mathbf{A},\mathbf{T})\text{, find }\mathbf{S}.$
- Decisional LWE: Distinguish between valid LWE pairs  $(\mathbf{A}, \mathbf{T})$  from uniformly random samples in  $(\mathbb{Z}_q^{n \times n} \times \mathbb{Z}_q^n)$ .





- Let  $\mathbf{A} \in \mathbb{Z}_q^{n imes n}$  and  $\mathbf{S}, \mathbf{E} \in \mathbb{Z}_q^n \leftarrow D_\sigma$
- $\mathbf{T} = (\mathbf{A} \times \mathbf{S} + \mathbf{E}) \in \mathbb{Z}_q^n$
- Search LWE: Given several pairs  $(\mathbf{A},\mathbf{T})\text{, find }\mathbf{S}.$
- Decisional LWE: Distinguish between valid LWE pairs  $(\mathbf{A}, \mathbf{T})$  from uniformly random samples in  $(\mathbb{Z}_q^{n \times n} \times \mathbb{Z}_q^n)$ .
- Computations over matrices and Vectors were mapped to polynomials in the more efficient variants of LWE such as Ring-LWE (RLWE) and Module-LWE (MLWE).





- Let  $\mathbf{A} \in \mathbb{Z}_q^{n imes n}$  and  $\mathbf{S}, \mathbf{E} \in \mathbb{Z}_q^n \leftarrow D_\sigma$
- $\mathbf{T} = (\mathbf{A} \times \mathbf{S} + \mathbf{E}) \in \mathbb{Z}_q^n$
- Search LWE: Given several pairs  $(\mathbf{A},\mathbf{T})\text{, find }\mathbf{S}.$
- Decisional LWE: Distinguish between valid LWE pairs  $(\mathbf{A}, \mathbf{T})$  from uniformly random samples in  $(\mathbb{Z}_q^{n \times n} \times \mathbb{Z}_q^n)$ .
- Computations over matrices and Vectors were mapped to polynomials in the more efficient variants of LWE such as Ring-LWE (RLWE) and Module-LWE (MLWE).
- Ring LWE:  $\mathbf{R}_q = \mathbb{Z}_q[X]/(X^n + 1)$  with  $\mathbf{A}, \mathbf{S}, \mathbf{E} \in \mathbf{R}_q$ .



- Let  $\mathbf{A} \in \mathbb{Z}_q^{n imes n}$  and  $\mathbf{S}, \mathbf{E} \in \mathbb{Z}_q^n \leftarrow D_\sigma$
- $\mathbf{T} = (\mathbf{A} \times \mathbf{S} + \mathbf{E}) \in \mathbb{Z}_q^n$
- Search LWE: Given several pairs  $(\mathbf{A},\mathbf{T})\text{, find }\mathbf{S}.$
- Decisional LWE: Distinguish between valid LWE pairs  $(\mathbf{A}, \mathbf{T})$  from uniformly random samples in  $(\mathbb{Z}_q^{n \times n} \times \mathbb{Z}_q^n)$ .
- Computations over matrices and Vectors were mapped to polynomials in the more efficient variants of LWE such as Ring-LWE (RLWE) and Module-LWE (MLWE).
- Ring LWE:  $\mathbf{R}_q = \mathbb{Z}_q[X]/(X^n+1)$  with  $\mathbf{A}, \mathbf{S}, \mathbf{E} \in \mathbf{R}_q$ .
- Module LWE:  $\mathbf{R}_q^{k \times l} = (\mathbb{Z}_q[X]/(X^n + 1))^{k \times l}$  with  $\mathbf{A} \in \mathbf{R}_q^{k \times \ell}$ ,  $\mathbf{S} \in \mathbf{R}_q^{\ell}$ ,  $\mathbf{E} \in \mathbf{R}_q^k$ .



## Dilithium Signature Scheme

- Security of Dilithium is based on the MLWE problem.
- Computations are performed over *matrices* and *vectors* of polynomials.
- Signature generation is an iterative procedure with multiple rejection conditions.
- Two algorithmic level optimizations to improve signing speed have been explored.
  - Opt-1: Reduction of computations in every rejected iteration.
  - Opt-2: Reduction of repetition rate.





# Table of Contents

#### Context

### 2 Background

- 3 Algorithmic Optimizations
- 4 Experimental Results

#### 5 Future Work

### 6 Conclusion





• The signing procedure consists of a number of conditional checks.





- The signing procedure consists of a number of conditional checks.
- Is it possible to detect the rejections early to reduce the overhead of the rejected iterations?





- The signing procedure consists of a number of conditional checks.
- Is it possible to detect the rejections early to reduce the overhead of the rejected iterations?
- We perform an *early-evaluation* of the rejection conditions, so we detect the rejections early and immediately abort the current iteration.





### Dilithium's Signing Procedure

```
1 Procedure Sign (sk, M)
               \mathbf{A} \in R_a^{k \times \overline{\ell}} := \mathsf{ExpandA}(\rho)
  2
               \mu = C \vec{R} H(tr || M)
  3
               \kappa = 0, (\mathbf{z}, \mathbf{h}) = \bot
  4
               while (\mathbf{z}, \mathbf{h}) = \bot do
  5
                       \mathbf{y} \in S_{\gamma_1-1}^{\ell} := \mathsf{ExpandMask}(K \| \mu \| \kappa)
  6
                       \mathbf{w} = \mathbf{A} \cdot \mathbf{v}
 7
                       \mathbf{w}_1 = \mathsf{HB}_a(\mathbf{w}, 2\gamma_2)
 8
                       \mathbf{c} \in B_{60} = H(\mu \| \mathbf{w}_1)
 9
                       \mathbf{z} = \mathbf{y} + \mathbf{c} \cdot \mathbf{s}_1
10
                    (\mathbf{r}_1, \mathbf{r}_0) := \mathsf{D}_a(\mathbf{w} - \mathbf{c} \cdot \mathbf{s}_2, 2\gamma_2)
11
                        if \|\mathbf{z}\|_{\infty} > \gamma_1 - \beta or \|\mathbf{r}_0\|_{\infty} > \gamma_2 - \beta or
12
                          \mathbf{r}_1 \neq \mathbf{w}_1 then
                           (\mathbf{z}, \mathbf{h}) = \bot
13
14
                        else
                                \mathbf{h} = \mathsf{MH}_{a}(-\mathbf{c} \cdot \mathbf{t}_{0}, \mathbf{w} - \mathbf{c} \cdot \mathbf{s}_{2} + \mathbf{c} \cdot \mathbf{t}_{0}, 2\gamma_{2})
15
                                if \|\mathbf{c} \cdot \mathbf{t}_0\|_{\infty} \geq \gamma_2 or wt(\mathbf{h}) > \omega then
16
                                      (\mathbf{z},\mathbf{h}) = \bot
17
                        end
18
                       \kappa = \kappa + 1
19
20
               end
               return \sigma = (\mathbf{z}, \mathbf{h}, \mathbf{c})
21
22
```



## Dilithium's Signing Procedure



• We target the rejection conditions that yield frequent rejections.





- We target the rejection conditions that yield frequent rejections.
- Both these rejection conditions are only infinity norm checks  $(\| \cdot \|_{\infty} < K).$





# Reducing Computations in Rejected Iterations

- We target the rejection conditions that yield frequent rejections.
- Both these rejection conditions are only infinity norm checks  $(\| \cdot \|_{\infty} < K).$
- The condition has to be satisfied for all coefficients of a given module.



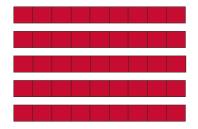


# Reducing Computations in Rejected Iterations

- We target the rejection conditions that yield frequent rejections.
- Both these rejection conditions are only infinity norm checks  $(\| \cdot \|_{\infty} < K).$
- The condition has to be satisfied for all coefficients of a given module.
- Consider the computations involving module  $\mathbf{z} \in R_q^\ell$ .

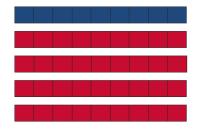








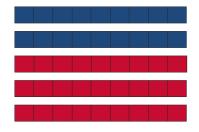




No of Computations: 1







No of Computations: 2



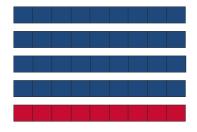




No of Computations: 3







No of Computations: 4



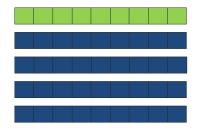




No of Computations: N



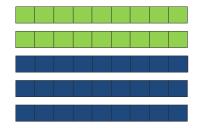




No of Computations: N+1



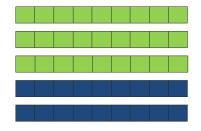




No of Computations: N+2



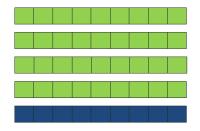




No of Computations: N+3







No of Computations: N+4



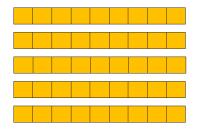




No of Computations: 2N



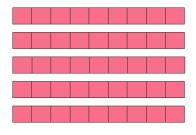




No of Computations: 3N



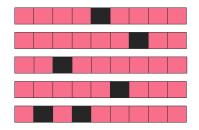




No of Computations: C\*N



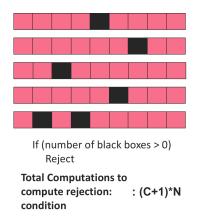




Checking defective elements:

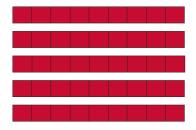






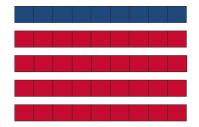












No of Computations: 1



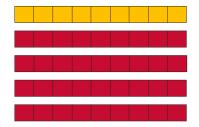




No of Computations: 2



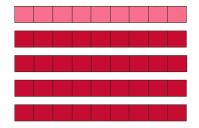




No of Computations: 3



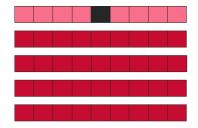




No of Computations: C







No of Computations: C+1 Rejection done with only (C+1) computations





- We perform the complete set of computations **one polynomial at a time**.
- Best Case (C+1) computations.
- Worst Case ((C+1)\*N) computations.
- Average Case  $((C+1)^*\frac{N}{2})$  computations.
- We apply the same optimization to all the *Infy\_Checks* in Dilithium's signing procedure.







• Total Repetition rate depends upon the failure rate of individual rejection conditions





- Total Repetition rate depends upon the failure rate of individual rejection conditions
- We specifically look at one rejection condition:  $\|\mathbf{z}\|_{\infty} < \gamma_1 \beta$

• 
$$\mathbf{z} = \mathbf{sc} + \mathbf{y}$$
.





- Total Repetition rate depends upon the failure rate of individual rejection conditions
- We specifically look at one rejection condition:  $\|\mathbf{z}\|_{\infty} < \gamma_1 \beta$
- $\mathbf{z} = \mathbf{sc} + \mathbf{y}$ .
- $\|\mathbf{y}\| \gg \|\mathbf{sc}\|.$





- Total Repetition rate depends upon the failure rate of individual rejection conditions
- We specifically look at one rejection condition:  $\|\mathbf{z}\|_{\infty} < \gamma_1 \beta$
- $\mathbf{z} = \mathbf{sc} + \mathbf{y}$ .
- $\|\mathbf{y}\| \gg \|\mathbf{sc}\|.$
- Coefficients of  ${\bf y}$  are uniformly distributed in  $[0,\gamma_1-1].$



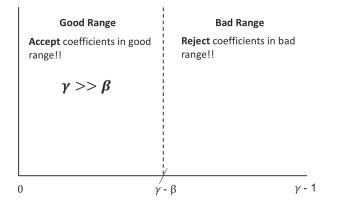


- Total Repetition rate depends upon the failure rate of individual rejection conditions
- We specifically look at one rejection condition:  $\|\mathbf{z}\|_{\infty} < \gamma_1 \beta$
- $\mathbf{z} = \mathbf{sc} + \mathbf{y}$ .
- $\|\mathbf{y}\| \gg \|\mathbf{sc}\|.$
- Coefficients of  ${\bf y}$  are uniformly distributed in  $[0,\gamma_1-1].$
- Coefficients of sc are very small and normally distributed in  $[0,\beta].$





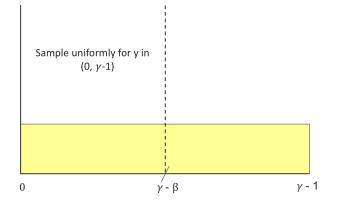
#### Generation of $\mathbf{z}$







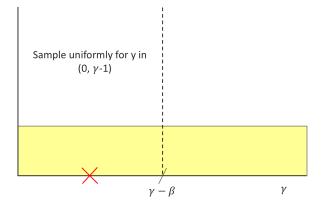
### Generation of ${\bf z}$







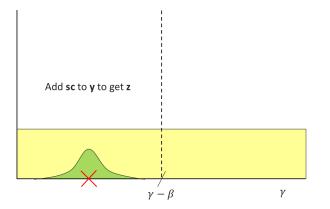
#### Generation of ${\bf z}$







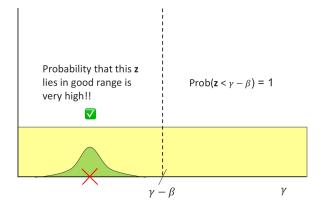
#### Generation of ${\bf z}$







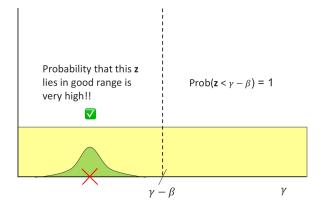
#### Generation of $\mathbf{z}$







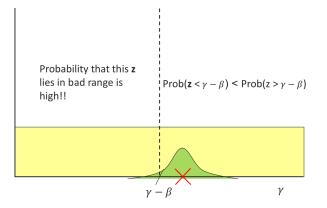
#### Generation of $\mathbf{z}$







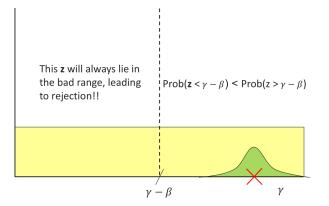
#### Generation of $\mathbf{z}$







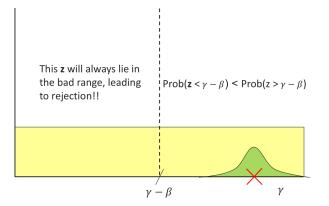
#### Generation of $\mathbf{z}$







#### Generation of $\mathbf{z}$







- Rejection Sampling is performed so as to hide the sc component within z.
- Allows to generate upto  $2^{80}$  signatures without leaking the distribution of the  ${\rm sc}$  component.





- Rejection Sampling is performed so as to hide the sc component within z.
- Allows to generate upto  $2^{80}$  signatures without leaking the distribution of the  ${\rm sc}$  component.
- If  $\mathbf{y} > \gamma_1 \beta$ , probability of  $\mathbf{z}$  in bad range is very high.





- Rejection Sampling is performed so as to hide the sc component within z.
- Allows to generate upto  $2^{80}$  signatures without leaking the distribution of the  ${\rm sc}$  component.
- If  $\mathbf{y} > \gamma_1 \beta$ , probability of  $\mathbf{z}$  in bad range is very high.
- y is sampled uniformly in  $[0, \gamma_1]$  and hence has a certain non-negligible probability that its corresponding z lies in the bad range.

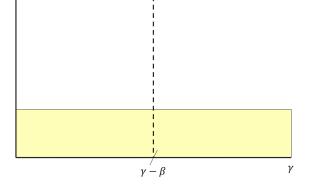




- Rejection Sampling is performed so as to hide the sc component within z.
- Allows to generate upto  $2^{80}$  signatures without leaking the distribution of the  ${\rm sc}$  component.
- If  $\mathbf{y} > \gamma_1 \beta$ , probability of  $\mathbf{z}$  in bad range is very high.
- y is sampled uniformly in  $[0, \gamma_1]$  and hence has a certain non-negligible probability that its corresponding z lies in the bad range.
- Can we alter the distribution of y so as to reduce the occurrence of z in the bad range?

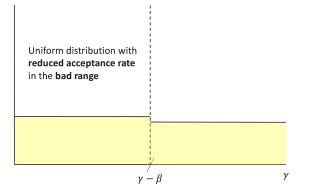






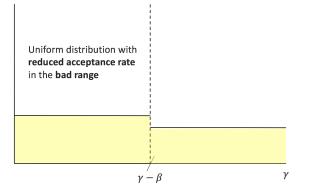






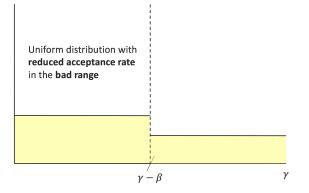






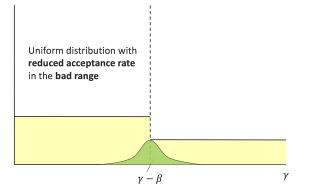






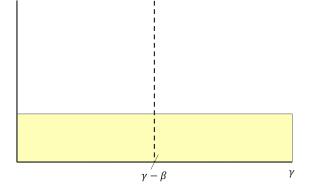








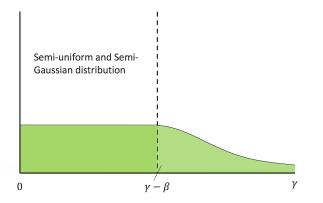






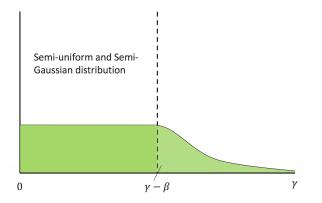
🗱 NANYANG TECHNOLOGICAL UNIVERSITY | SINGAPORE





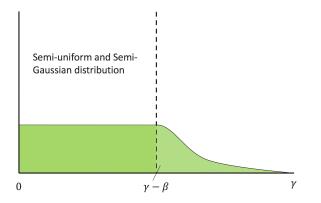






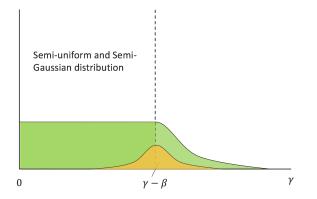
















#### Alternate Distributions for Sampling y

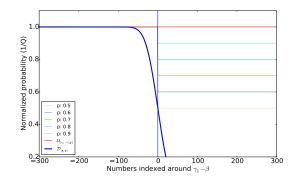


Figure:  $\mathcal{U}_{(\gamma_1-\beta,\gamma_1-1,p)}$  - Uniform distribution with reduced acceptance rate p





#### Alternate Distributions for Sampling y

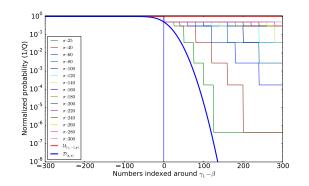


Figure:  $\mathcal{D}_{(\gamma_1-\beta,\gamma_1-1,\sigma)}$  - Piece-wise Gaussian distribution with standard deviation  $\sigma$ 



NANYANG TECHNOLOGICAL UNIVERSITY | SINGAPORE



# Table of Contents

- Context
- 2 Background
- 3 Algorithmic Optimizations
- 4 Experimental Results
- 5 Future Work

#### 6 Conclusion





- Implementation of *Early-Eval* optimization and *Improved-Sampling* optimizations on reference implementation of Dilithium.
- Both the optimizations can be employed independently.
- Since both optimizations are done at the algorithmic level, they can be ported to all implementation platforms.
- Results were obtained for about  $10^7$  runs of the signing procedure.
- Implemented on Intel(R) Core(TM) i5-4460 CPU 3.20GHz and compiled with gcc-4.2.1.





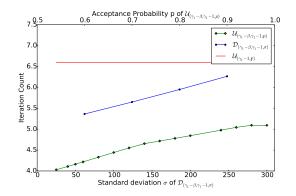


Figure: Improvements in iteration Count evaluated for various parameters of our alternate distributions



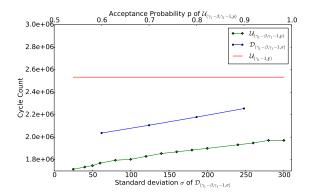


Figure: Improvements in Cycle count evaluated for various parameters of our alternate distributions



- *Early-Eval* optimization yields improvement of about 8% in the signing speed.
- Combination of *Early-Eval* and *Improved-Sampling* optimizations could yield speed up upto 38%.
- *Early-Eval* optimization does not have any impact on security of the scheme.
- Does the use of improved distributions for y affect the security of the scheme? If so, by how much?
- How many signatures does the attacker need to observe an exploitable skew in the distribution of z.
- This could lead to a potential quantitative trade-off between security and efficiency, which needs to be evaluated.





# Table of Contents

- 1 Context
- 2 Background
- 3 Algorithmic Optimizations
- 4 Experimental Results

#### 5 Future Work

#### 6 Conclusion





## Future Work

- Security Analysis of the signing procedure with improved distribution.
- Evaluation of the security-efficiency trade-off due to use of improved distributions.
- Utilization of a constant-time Gaussian sampler to sample from the improved distribution.





# Table of Contents

- 1 Context
- 2 Background
- 3 Algorithmic Optimizations
- 4 Experimental Results
- 5 Future Work







#### Future Work

- This work proposes algorithmic optimizations for the Dilithium signature scheme
- We propose two optimizations:
  - Early-Eval optimization
  - Improved-Sampling optimization
- We were able to achieve a speed-up of upto 38% by employing a combination of both the optimizations.
- Incorporation of the *Improved-Sampling* optimization could lead to a potential security-efficiency trade-off.
- We intend to perform a quantitative evaluation of the security-efficiency trade-off as part of future work.





# Thank you! Any questions?



NANYANG TECHNOLOGICAL UNIVERSITY | SINGAPORE