# Lattice-Based Cryptography

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(Minicrypt)

(Cryptomania)



(Minicrypt)

(Cryptomania)

### **LEARNING WITH ERRORS PROBLEM**

# Learning With Errors (LWE) Problem

There is a secret vector s in  $Z_p^n$  (we'll use  $Z_{17}^4$  as a running example) An oracle (who knows s) generates a random vector a in  $Z_p^n$ and "small" noise element e in Z

The oracle outputs (a,b=<a,s>+e mod 17)



This procedure is repeated with the same s and fresh a and e

Our task is to find s

### Learning With Errors (LWE) Problem



Once there are enough  $a_i$ , the s is uniquely determined

Theorem [Regev '05] : There is a polynomial-time quantum reduction from solving certain lattice problems in the worst-case to solving LWE.

## **Decision LWE Problem**



# Search LWE < Decision LWE

Use the Decision oracle to figure out the coefficients of s one at a time

Let g be our guess for the first coefficient of s

Repeat the following:



Pick random r in Z<sub>17</sub> Send sample below to the Decision Oracle





If g is right, then we are sending a distribution from World 1

If g is wrong, then we are sending a distribution from World 2

We will find the right g in O(p) time

Use the same idea to recover all coefficients of s one at a time

## LWE and Lattices









### Decision LWE < SIS



#### PUBLIC KEY ENCRYPTION FROM LWE





## Public-Key Cryptography



# **Public Key Encryption**

- (sk,pk) ← KeyGen(1<sup>n</sup>)
- c = Enc (pk,m)
- m = Dec(sk,c)

- Correctness: Dec(sk,Enc(pk,m))=m
- CPA-Security: Enc(pk,m<sub>i</sub>) are computationally indistinguishable from each other

### "Computationally Indistinguishable"





## "Dual" Cryptosystem



## "Dual" Cryptosystem



## "Dual" Cryptosystem Security



#### **IDENTITY-BASED ENCRYPTION**



## **Identity-Based Encryption**















CPA-Security: For all m<sub>i</sub>, Encrypt(Chris,m<sub>i</sub>) are **computationally indistinguishable** from each other



### IBE based on LWE (in the Random Oracle Model)



 $(x_1, H(x_1)), (x_2, H(x_2)), (x_3, H(x_3)), ...$ is computationally indistinguishable from  $(x_1, u_1), (x_2, u_2), (x_3, u_3), ...$ 

Security in the Random Oracle Model:

There is a "pseudorandom function" H Prove security assuming that everyone only has "black box access" to H In reality, H is replaced by a "cryptographic hash function" (e.g. SHA-256)

If the real scheme is insecure, then there is something wrong with the hash function

### Security Proofs Using a Random Oracle

Adversary cannot access H directly He must ask us (i.e. the reduction) for H(z) We pick a random y and output y=H(z)

What's the point? Suppose f is a 1-way function and f(x) is uniform for random x For a random y, it's hard to find an x such that f(x)=y

But, for any z, we can *simulate* knowing an x such that f(x)=H(z)Given z, we pick a random x, compute y=f(x), and *program* y=H(z)So f(x)=H(z) and all the distributions are as they should be

## **IBE Based on LWE**



T is a basis for  $L_p^{\perp}(\mathbf{A})$  and has "short" vectors

Lattice  $L_p^{\perp}(\mathbf{A}) = \{ \mathbf{y} : \mathbf{A}\mathbf{y} = \mathbf{0} \mod p \}$ 



Lattice  $L_p^{\perp}(\mathbf{A}) = \{ \mathbf{y} : \mathbf{A}\mathbf{y} = \mathbf{0} \mod p \}$ 



## **Properties Needed**



- Distribution D of s only depends on the length of the vectors comprising T
- 2. The following produce the same distribution of (**s**,**b**)





- (1) is guaranteed by the GPV algorithm
- (2) is true if s has enough entropy (to make As=b uniform mod p)

# Security Proof Sketch

Show that breaking IBE implies breaking the "Dual" cryptosystem



# Security Proof Sketch

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Show that breaking IBE implies breaking the "Dual" cryptosystem



### **LWE Encryption**

n-bit Encryption	Have	Want
Public Key Size	Õ(n) / Õ(n²)	O(n)
Secret Key Size	Õ(n) / Õ (n²)	O(n)
Ciphertext Expansion	Õ(n) / Õ (1)	O(1)
Encryption Time	Õ(n³) / Õ (n²)	O(n)
Decryption Time	Õ(n²)	O(n)

# Source of Inefficiency of LWE



Getting just **one** extra random-looking number requires **n** random numbers and a small error element.

Wishful thinking: get **n** random numbers and produce **n** pseudo-random numbers in "one shot"



#### **IDEAL LATTICES**

#### **Cyclic Lattices**

A set L in **Z**<sup>n</sup> is a *cyclic lattice* if:

1.) For all v,w in L, v+w is also in L -1 2 3 -4 + -7 -2 3 6 = -8 0 6 2

 2.) For all v in L, -v is also in L

 -1
 2
 3
 -4
 1
 -2
 -3
 4

3.) For all v in L, a cyclic shift of v is also in L



### Cyclic Lattices = Ideals in **Z**[x]/(x<sup>n</sup>-1)

A set L in  $Z^n$  is a cyclic lattice if L is an ideal in  $Z[x]/(x^n-1)$
# Why Cyclic Lattices?

- Succinct representations
  - Can represent an n-dimensional lattice with 1 vector
- Algebraic structure
  - Allows for fast arithmetic (using FFT)
  - Makes proofs possible
- One-way functions based on worst-case hardness of SVP in cyclic lattices [Mic02]

# Shortest Vector Problem (SVP)

• SVP: Given a lattice L, find the (non-zero) vector with the smallest norm in L

- SVP $_{\gamma}$ : Given a lattice L, find a non-zero vector whose length is within a factor  $\gamma$  of the shortest vector

# Is SVP<sub>poly(n)</sub> Hard for Cyclic Lattices?

Short answer: we don't know but conjecture it is.

What's wrong with the following argument that SVP<sub>n</sub> is easy?



Algorithm for solving  $SVP_n(L)$  for a cyclic lattice L:

- 1. Construct 1-dimensional lattice  $L'=L \cap \{1^n\}$
- 2. Find and output the shortest vector in L'

# The Hard Cyclic Lattice Instances



The "hard" instances of cyclic lattices lie on plane P perpendicular to the 1<sup>n</sup> vector In algebra language:

If 
$$R=Z[x]/(x^{n}-1)$$
, then  
 $1^{n} = (x^{n-1}+x^{n-2}+...+1) \approx Z[x]/(x-1)$   
 $P = (x-1) \approx Z[x]/(x^{n-1}+x^{n-2}+...+1)$ 

# f-Ideal Lattices = Ideals in Z[x]/(f)

Want f to have 3 properties:

Monic (i.e. coefficient of largest exponent is 1)
 Irreducible over Z
 For all polynomials g,h ||gh mod f||<poly(n)||g||·||h||</li>
 <u>Conjecture:</u> For all f that satisfy the above 3 properties, solving SVP<sub>poly(n)</sub> for ideals in Z[x]/(f) takes time 2<sup>Ω(n)</sup>.

Some "good" f to use:

 $f=x^{n-1}+x^{n-2}+...+1$  where n is prime

 $f=x^n+1$  where n is a power of 2

#### (x<sup>n</sup>+1)-Ideal Lattices = Ideals in **Z**[x]/(x<sup>n</sup>+1)

A set L in  $\mathbb{Z}^n$  is a  $(x^n+1)$ -ideal lattice if L is an ideal in  $\mathbb{Z}[x]/(x^n+1)$ 

#### **RING-LWE**

# **Ring-LWE**

a<sub>1</sub>, a<sub>1</sub>s+e<sub>1</sub> a<sub>2</sub>, a<sub>2</sub>s+e<sub>2</sub> ... a<sub>k</sub>, a<sub>k</sub>s+e<sub>k</sub>

Find: s

a<sub>i</sub> are random in R

s and e<sub>i</sub> have "small" coefficients (distribution symmetric around 0)

#### **Decision Ring-LWE**

Ring 
$$R=Z_q[x]/(x^n+1)$$

Given:

a<sub>1</sub>, b<sub>1</sub> a<sub>2</sub>, b<sub>2</sub> ... a<sub>k</sub>, b<sub>k</sub>

Question: Does there exist "small" s and

 $e_1, ..., e_k$  such that  $b_i = a_i s + e_i$ or are all  $b_i$  uniformly random in R?

# Decision Learning With Errors over Rings



<u>Theorem</u> [LPR '10]: In *cyclotomic* rings, there is a quantum reduction from solving worst-case problems in ideal lattices to solving Decision-RLWE

#### **Ring-LWE cryptosystem**



### Security



#### Pseudorandom??

### Security



Pseudorandom based on Decision Ring-LWE!!

#### Efficiency



n-bit Encryption	From LWE	From Ring-LWE
Public Key Size	Õ(n) /Õ(n²)	Õ(n)
Secret Key Size	Õ(n) / Õ (n²)	Õ(n)
Ciphertext Expansion	Õ(n) / Õ (1)	Õ(1)
Encryption Time	Õ(n³) / Õ (n²)	Õ(n)
Decryption Time	Õ(n²)	Õ(n)

#### **DIGITAL SIGNATURE SCHEMES**

# **Digital Signatures**

```
(sk,pk) ← KeyGen
Sign(sk,m<sub>i</sub>) = s<sub>i</sub>
Verify(pk,m<sub>i</sub>,s<sub>i</sub>) = YES / NO
```

Correctness: Verify(pk, m<sub>i</sub>, Sign(sk,m<sub>i</sub>)) = YES Security: Unforgeability

- 1. Adversary gets pk
- 2. Adversary asks for signatures of  $m_1$ ,  $m_2$ , ...
- Adversary outputs (m,s) where m ≠ m<sub>i</sub> and wins if Verify(pk,m,s) = YES

#### Signature Schemes

• Hash-and-Sign

Requires a trap-door function (like the GPV one)

- Fiat-Shamir transformation
  - Conversion from an identification scheme
  - No trap-door function needed

#### HASH-AND-SIGN SIGNATURE SCHEMES BASED ON SIS

### Hash-and-Sign Lattice Signature

Lattice  $L_p^{\perp}(\mathbf{A}) = \{ \mathbf{y} : \mathbf{A}\mathbf{y} = \mathbf{0} \mod p \}$ 

Т	

T is a basis for  $L_p^{\perp}(\mathbf{A})$  and has "short" vectors

Public Key: **A** Secret Key: **T** 

Sign(**T**,m) 1. **b** = H(m)

Use the GPV algorithm to find a short s such that As = b mod p
 s is the signature of m

Verify(**A**,m,**s**)

check that s is "short" and
 As = H(m) mod p









if it's non-zero, then we have a solution to SIS

### **Properties Needed**





- 2. The following produce the same distribution of (**s**,**b**)
  - (a) Choose **s** ~ D. Set **b**=As
  - (b) Choose random **b**. Use **T** to find an **s** such that **As=b**.



- 3. For a random **b**, there is more than one likely possible output **s** such that **b=As**.
  - (1) is guaranteed by the GPV algorithm
  - (2) is true if s has enough entropy (to make As=b uniform mod p)
  - (3) is true because the standard deviation of GPV is big

#### IDENTIFICATION AND "FIAT-SHAMIR" SIGNATURE SCHEMES BASED ON SIS

#### **Canonical 3-move Identification Scheme**

Prover (sk)

Verifier (pk)

commit

challenge

response

Verify(pk, commit, challenge,response)=1?

# Security of ID Schemes

Passive Adversary

Active Adversary

- 1. Receive public key
- 2. Receive interaction transcripts
- Try to impersonate the valid prover

- 1. Receive public key
- 2. Interact with the valid prover
- 3. Try to impersonate the valid prover

#### **Fiat-Shamir Transform**

#### Passively-Secure 3-round scheme $\rightarrow$ Signature scheme in the random oracle model

Sign(µ) commit challenge = H(µ, commit) response (commit,challenge,response) VerifySig(µ, pk, commit, challenge, response)
 challenge=H(µ, commit)?
 VerifyID(pk, commit, challenge, response)=1?

### Identification Scheme Based on SIS





# Active Security Reduction (Stage 2)

<u>Adversary</u>

Public Key: **A**, **T=AS** mod q



Az=Tc+w mod q Az'=Tc'+w mod q

A(z-z')=T(c-c') mod q A(z-z')=AS(c-c') mod q

Observation: If the adversary knows **S**, then he can always give us **z**-**z**' = **S**(**c**-**c**') Solution: Make sure adversary does not learn **S** 

Hope: **z**-**z'** ≠ **S**(**c**-**c'**)

### Identification Scheme Based on SIS



Have access to samples from g(x) Want f(x)



 $Pr[x] = g(x) \cdot (f(x)/Mg(x)) = f(x)/M$ Something is output with probability 1/M

Impossible to tell whether g(x) or h(x) was the original distribution




## **Rejection Sampling**



v=max ||<mark>Sc</mark>||

## What We Want

```
Choose a target distribution f for z
Choose a distribution g for y
Distribution of z will be g(y-Sc)
Rejection sample to make the distribution of z be f
```



#### Need:

For all *likely* **x** and **Sc**,  $f(\mathbf{x})/M \le g(\mathbf{x}-\mathbf{Sc})$ 

Want:

- 1. M to be as small as possible (1/M is acceptance rate)
- E[||x|| ; x ~ f] to be as small as possible (determines size of signature and hardness of SIS problem)

# Rejection Sampling (L '09)



## Size of the SIS solution

Coefficients of Sc = O(1) Coefficients of y = O(m)  $||z|| \approx ||y|| = O(m^{1.5})$ 

Can we do better??

Use Normal distribution to get  $||\mathbf{z}|| = O(m)$ 

## Normal Distribution

1-dimensional Normal distribution:

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

It is:

Centered at 0 Standard deviation: σ

## Examples



## Shifted Normal Distribution

1-dimensional shifted Normal distribution:

$$\rho_{\sigma,v}(x) = 1/(\sqrt{2\pi}\sigma)e^{-(x-v)^2/2\sigma^2}$$

It is:

Centered at v

Standard deviation:  $\sigma$ 

## n-Dimensional Normal Distribution

n-dimensional shifted Normal distribution:

$$\rho_{\sigma,\mathbf{v}}(\mathbf{x}) = 1/(\sqrt{2\pi}\sigma)^{n} \mathrm{e}^{-||\mathbf{x}-\mathbf{v}||^{2}/2\sigma^{2}}$$

It is:

Centered at **v** Standard deviation: σ

### 2-Dimensional Example



## n-Dimensional Normal Distribution

n-dimensional shifted Normal distribution:

$$\rho_{\sigma,\mathbf{v}}(\mathbf{x}) = 1/(\sqrt{2\pi}\sigma)^{n} \mathrm{e}^{-||\mathbf{x}-\mathbf{v}||^{2}/2\sigma^{2}}$$

It is:

Centered at  $\mathbf{v}$ Standard deviation:  $\sigma$ 

Discrete Normal: for **x** in **Z**<sup>n</sup>,  $D_{\sigma,v} (\mathbf{x}) = \rho_{\sigma,v}(\mathbf{x}) / \rho_{\sigma,v}(\mathbf{Z}^n)$ 

### **New Rejection Sampling**

 $g(x)=f(x)=D_{\sigma,0}(x)$ 

Lemma: If  $\sigma = k||v||$ , then with very high probability, for all likely **x** ~ f,

$$D_{\sigma,0}(x) / D_{\sigma,v}(x) < e^{12/k}$$

## **Rejection Sampling**



## **Rejection Sampling**



## **New Rejection Sampling**

 $g(\mathbf{x})=f(\mathbf{x})=D_{\sigma,\mathbf{0}}(\mathbf{x})$ 

Lemma: If  $\sigma = k||v||$ , then with very high probability, for all likely **x** ~ f,

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Set k=12 (asymptotically  $\sqrt{\log m}$ )  $\rightarrow$  M < e

## **New Rejection Sampling**

 $g(\mathbf{x})=f(\mathbf{x})=D_{\sigma,\mathbf{0}}(\mathbf{x})$ 

Lemma: If  $\sigma = k||v||$ , then with very high probability, for all likely **x** ~ f,

$$D_{\sigma,0}(x) / D_{\sigma,v}(x) < e^{12/k}$$

Set k=12 (asymptotically  $\sqrt{\log m}$ )  $\rightarrow$  M < e ||x||  $\approx \sqrt{m}$  ||v||  $\approx O(m)$ 

## Identification Scheme Based on SIS



If AS=AS' mod q, then (c,z) has the same distribution whether S or S' is used (w,c,z) as well ...

## Security Reduction (Stage 2)

**Adversary** 

Public Key: **A**, **T=AS** mod q



Az=Tc+w mod q Az'=Tc'+w mod q

A(z-z')=T(c-c') mod q A(z-z')=AS(c-c') mod q

Observation: If the adversary knows **S**, then he can always give us **z**-**z**' ≠ **S**(**c**-**c**') Solution: Make sure adversary does not learn **S** With probability at least ½, we solve SIS.

Hope: **z**-**z'** ≠ **S**(**c**-**c'**)

## Signature Scheme

```
Secret Key: S
Public Key: A, T=AS mod q
```

```
\begin{array}{l} \underline{Sign}(\mu) \\ Pick \ensuremath{\mathbf{y}} \sim D_{\sigma,0} \\ Compute \ensuremath{\mathbf{c}}=H(\ensuremath{\mathbf{Ay}}\ensuremath{\,\mathrm{mod}}\ensuremath{\,\mathrm{q}},\mu) \\ \ensuremath{\mathbf{z}}=\ensuremath{\mathbf{Sc}}+\ensuremath{\mathbf{y}} \\ Output(\ensuremath{\mathbf{z}},\ensuremath{\mathbf{c}})\ensuremath{\,\mathrm{with}}\ensuremath{\,\mathrm{probability}} \\ D_{\sigma,0}\ensuremath{\,\mathrm{(z)}}\ensuremath{\,/}\ensuremath{\,\mathrm{(MD}}_{\sigma,\ensuremath{\mathrm{Sc}}}\ensuremath{\,\mathrm{(z)}}\ensuremath{)}) \\ (\text{If nothing was output, repeat)} \end{array}
```

<u>Verify</u>(z,c,μ) Check that z is "small" and c = H(Az – Tc mod q, μ)

#### **PRACTICAL CONSIDERATIONS**



#### Given (A,t), find small s' such that As'=t mod q

## Hardness of the Knapsack Problem



## Signature Hardness

Construction based on SIS



### Lattice Signatures



#### IDENTIFICATION AND "FIAT-SHAMIR" SIGNATURE SCHEMES BASED ON LWE

## Signature Based on LWE



Construction based on LWE



## Identification Scheme Based on SIS

**Adversary** 



If AS=AS' mod q, then (c,z) has the same distribution whether S or S' is used (w,c,z) as well ...

There is only one **S**, so reduction does not work in the second step!!



Important: cannot do simulation if  $z = \Box$ , (how do you generate **w**??) But this is not needed because  $z = \Box$  never appears in the signature scheme.

## Security Reduction (Stage 2)

**Adversary** 

Public Key: A, T mod q



If there is an **S** such that **AS**=**T**, then the Adversary must succeed. If **T** is random:

If adversary does not succeed, then we can solve LWE

If adversary still succeeds, then we solve SIS for  $(A|T) \rightarrow$  can solve LWE

## Hardness of the Knapsack Problem



## Signature Hardness



Construction based on LWE



## Parameters (Using Rings)

	$\bigcirc$		<b>[GLP '12]</b>
sk size (bits)	12,000	2000	2000
pk size (bits)	12,000	12,000	12,000
sig size (bits)	140,000	17,000	9000

 $\approx$  80-100 bit security level [GN '08, CN '11]

