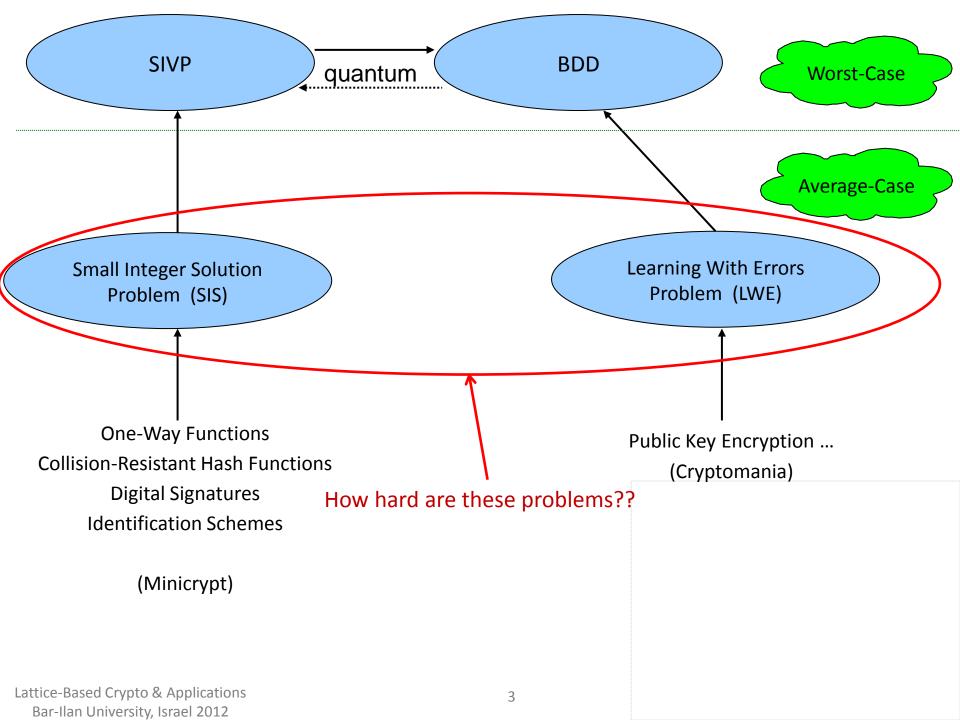
## **Basic Cryptanalysis**

Vadim Lyubashevsky INRIA / ENS, Paris

#### Outline

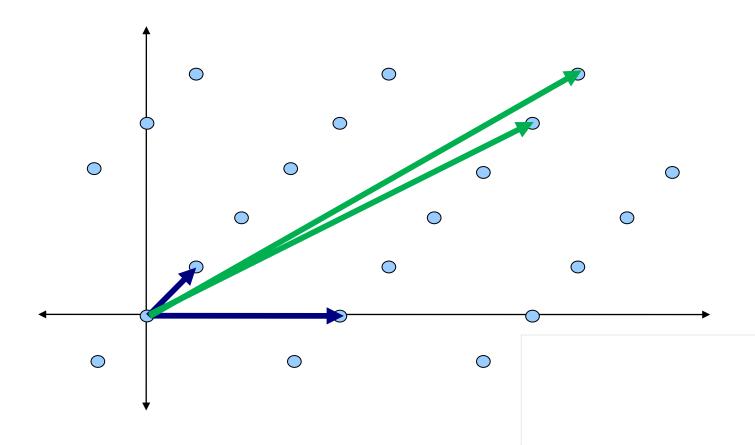
- LLL sketch
- Application to Subset Sum
- Application to SIS
- Application to LWE
- Lattice Reduction in Practice





[Lenstra, Lenstra, Lovasz '82]

## **Lattice Bases**



### The Goal of Lattice Reduction

Obtain a basis **B** in which the Gram-Schmidt vectors are not decreasing too quickly

This roughly means that the basis vectors are somewhat orthogonal to each other

### LLL Reduced Basis **B**

$$\mu_{i,j} = (\mathbf{b_i} \cdot \mathbf{\tilde{b}_j}) / ||\mathbf{\tilde{b}_j}||^2$$

1. All 
$$|\mu_{i,j}| \le 0.5$$

1. All 
$$|\mu_{i,j}| \le 0.5$$
  
2.  $0.75||\tilde{\mathbf{b}}_{i}||^{2} \le ||\mu_{i+1,i}\tilde{\mathbf{b}}_{i} + \tilde{\mathbf{b}}_{i+1}||^{2}$   $||\tilde{\mathbf{b}}_{i+1}||^{2} \ge 0.5||\tilde{\mathbf{b}}_{i}||^{2}$ 

## Short Vector in an LLL-reduced Basis

<u>Thm:</u> The vector  $\mathbf{b_1}$  in an LLL-reduced basis has length at most  $2^{(n-1)/2} \cdot \lambda_1(L(\mathbf{B}))$ 

#### Proof:

$$||\tilde{\mathbf{b}}_{\mathbf{n}}||^{2} \ge 0.5||\tilde{\mathbf{b}}_{\mathbf{n-1}}||^{2} \ge ... \ge 0.5^{n-1}||\tilde{\mathbf{b}}_{\mathbf{1}}||^{2} = 0.5^{n-1}||\mathbf{b}_{\mathbf{1}}||^{2}$$
  
 $||\mathbf{b}_{\mathbf{1}}|| \le 2^{(n-1)/2}||\tilde{\mathbf{b}}_{\mathbf{i}}||$  for all i  
Since,  $\min_{\mathbf{i}} ||\tilde{\mathbf{b}}_{\mathbf{i}}|| \le \lambda_{1}(L(\mathbf{B}))$ , we have  
 $||\mathbf{b}_{\mathbf{1}}|| \le 2^{(n-1)/2} \cdot \lambda_{1}(L(\mathbf{B}))$ 

$$\begin{bmatrix} & & & & & & & & & \\ & & & & & & & & \\ & & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & & \\ & & & & & \\ & & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & &$$

- 1. All  $|\mu_{i,i}| \le 0.5$
- 2.  $0.75||\tilde{\mathbf{b}}_{\mathbf{i}}||^2 \le ||\mu_{\mathbf{i+1},\mathbf{i}}\tilde{\mathbf{b}}_{\mathbf{i}} + \tilde{\mathbf{b}}_{\mathbf{i+1}}||^2$

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# APPLICATION OF LLL: THE SUBSET SUM PROBLEM

#### Subset Sum Problem

$$a_i$$
, T in  $Z_M$ 

a<sub>i</sub> are chosen randomly

T is a sum of a random subset of the a<sub>i</sub>

 $a_1 \quad a_2 \quad a_3 \quad \dots \quad a_n$ 

Find a subset of a<sub>i</sub>'s that sums to T (mod M)

#### Subset Sum Problem

$$a_i$$
, T in  $Z_{49}$ 

a<sub>i</sub> are chosen randomlyT is a sum of a random subset of the a<sub>i</sub>

15 31 24 3 14

11

$$15 + 31 + 14 = 11 \pmod{49}$$

## How Hard is Subset Sum?

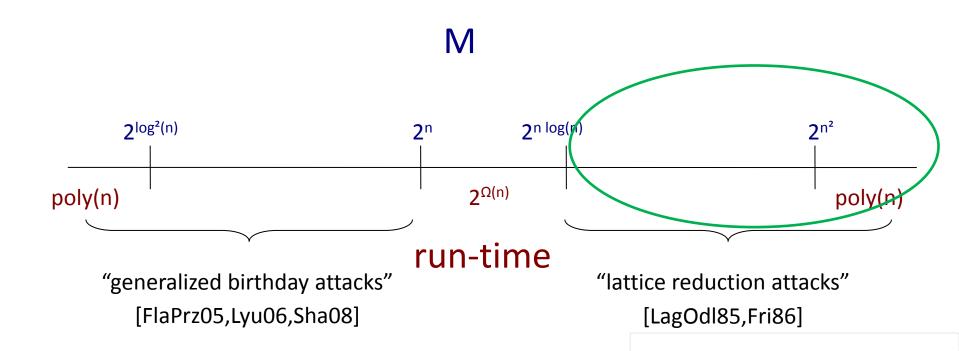
$$a_i$$
,  $T$  in  $Z_M$ 
 $a_1$   $a_2$   $a_3$  ...  $a_n$   $T$ 

Find a subset of a 's that sums to T (mod M)

#### Hardness Depends on:

- Size of n and M
- Relationship between n and M

# Complexity of Solving Subset Sum



### Subset Sum and Lattices

$$a_1 \ a_2 \ a_3 \ ... \ a_n \ T = (\Sigma a_i x_i \mod M) \text{ for } x_i \text{ in } \{0,1\}$$

$$a = (a_1, a_2, ..., a_n, -T)$$

$$L^{\perp}(a) = \{y \text{ in } \mathbf{Z}^{n+1} : \mathbf{a} \cdot \mathbf{y} = 0 \mod M\}$$

Notice that 
$$\mathbf{x} = (x_1, x_2, \dots, x_n, 1)$$
 is in  $L^{\perp}(\mathbf{a})$ 

$$||\mathbf{x}|| < \sqrt{(n+1)}$$

Want to use LLL to find this x

## When Will LLL Solve Subset Sum?

$$L^{\perp}(\mathbf{a}) = \{ \mathbf{y} \text{ in } \mathbf{Z}^{n+1} : \mathbf{a} \cdot \mathbf{y} = 0 \text{ mod } \mathbf{M} \}$$

Notice that 
$$\mathbf{x} = (x_1, x_2, ..., x_n, 1)$$
 is in  $L^{\perp}(\mathbf{a}), ||\mathbf{x}|| < \sqrt{(n+1)}$ 

LLL can find a vector 
$$< \delta^{n+1} \lambda_1(L^{\perp}(a)) < \delta^{n+1} \sqrt{(n+1)}$$

So if there are *no other vectors* in  $L^{\perp}(a)$  of length  $< \delta^{n+1} V(n+1)$ , LLL must find  $\mathbf{x} = (x_1, x_2, ..., x_n, 1)$ !

Caveat:  $\pm x$ ,  $\pm 2x$ ,  $\pm 3x$ , ... are all in  $L^{\perp}(a)$ , but we could recover x from these Good vectors:  $(kx_1, kx_2, ..., kx_n, k)$ 

#### The "Bad" Vectors

$$y=(y_1, ..., y_n, k)$$
 such that  $||y|| < \delta^{n+1} \sqrt{(n+1)} = r$  and

$$a_1y_1 + ... + a_ny_n - kT = 0 \mod M$$
  
 $a_1y_1 + ... + a_ny_n - k(a_1x_1 + ... + a_nx_n) = 0 \mod M$   
 $a_1(y_1 - kx_1) + ... + a_n(y_n - kx_n) = 0 \mod M$ 

(and for some i,  $y_i$  -  $kx_i \neq 0 \mod M$ )

## Probability of a Bad Lattice Vector

$$S_r = \{ y \text{ in } Z^{n+1}, ||y|| < r \}$$

For any 
$$(x_1,...,x_n)$$
 in  $\{0,1\}^n$  and  $(y_1, ..., y_n,k)$  in  $S_r$ :

$$Pr_{a_1,...,a_n}[a_1(y_1 - kx_1) + ... + a_n(y_n - kx_n) = 0 \mod M]$$

$$= 1/M \quad unless (y_i - kx_i) = 0 \mod M \text{ for all i}$$
(the last line assumes that M is prime)

# Probability of a Bad Lattice Vector

$$S_r = \{ y \text{ in } Z^{n+1}, ||y|| < r \}$$

For <u>all</u>  $(x_1,...,x_n)$  in  $\{0,1\}^n$  and  $(y_1, ..., y_n, k)$  in  $S_r$  such that  $y_i - kx_i \neq 0$  mod M for some i:

$$Pr_{a_1, ..., a_n}[a_1(y_1 - kx_1) + ... + a_n(y_n - kx_n) = 0 \mod M]$$
  
  $\leq |S_r| \cdot 2^n / M$ 

Want  $|S_r| \cdot 2^n \ll M$ 

# Number of **Z**<sup>n</sup> Points in a Sphere

# of integer points in a sphere of radius r

 $\approx$ 

volume of sphere of radius r

 $\approx$ 

 $(\pi n)^{-1/2}(2\pi e/n)^{n/2} r^n$ 

(r needs to be at least  $n^{1/2+\epsilon}$ )

# Probability of a Bad Lattice Vector

Want  $|S_r| \cdot 2^n \ll M$ , where  $r = \delta^{n+1} \sqrt{(n+1)}$ 

$$|S_r| \cdot 2^n < 9^{n+1} \cdot \delta^{(n+1)^2}$$

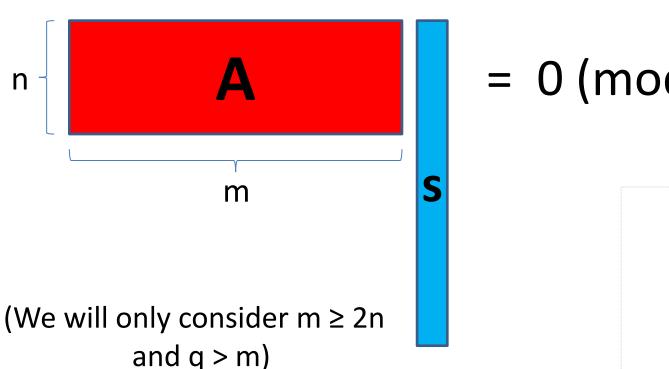
If M >  $9^{n+1} \cdot \delta^{(n+1)^2}$ , subset sum can be solved in poly-time

(for all but a negligible number of instances)

# APPLICATION OF LLL: THE SIS PROBLEM

### The SIS Problem

Given a random **A** in  $\mathbf{Z}_{\alpha}^{n \times m}$ , Find a "small" s such that As = 0 mod q



 $= 0 \pmod{q}$ 

# Finding "Small" Vectors Using LLL

$$L^{\perp}(\mathbf{A}) = \{\mathbf{y} \text{ in } \mathbf{Z}^{m} : \mathbf{A}\mathbf{y} = 0 \text{ mod } \mathbf{q}\}$$

What is the shortest vector of  $L^{\perp}(A)$ ?

Minkowski's Theorem:  $\lambda_1(L^{\perp}(\mathbf{A})) \leq \sqrt{m} \det(L^{\perp}(\mathbf{A}))^{1/m}$ 

What is  $det(L^{\perp}(\mathbf{A}))^{1/m}$ ?

## Determinant of an Integer Lattice

If L is an integer lattice, then  $det(L) = \# (Z^m/L)$ 

- 1.  $\#(\mathbf{Z}^{m}/L^{\perp}(\mathbf{A})) \leq q^{n}$ 
  - For any  $\mathbf{x_1}$ ,  $\mathbf{x_2}$  in  $\mathbf{Z}^m$ , if  $\mathbf{A}\mathbf{x_1} = \mathbf{A}\mathbf{x_2}$  mod q, then  $\mathbf{x_1}$ ,  $\mathbf{x_2}$  are in the same coset of  $\mathbf{Z}^m / \mathbf{L}^{\perp}(\mathbf{A})$ .
- 2. If **A** has n linearly-independent columns, then  $\#(\mathbf{Z}^m/L^{\perp}(\mathbf{A})) = q^n$

For every  $\mathbf{y}$  in  $\mathbf{Z}_{q}^{n}$ , there is an  $\mathbf{x}$  in  $\mathbf{Z}^{m}$  such that  $\mathbf{A}\mathbf{x}=\mathbf{y}$  mod  $\mathbf{q}$ 

# Shortest Vector in $L^{\perp}(\mathbf{A})$

Minkowski's Theorem:  $\lambda_1(L^{\perp}(\mathbf{A})) \leq \sqrt{m} \det(L^{\perp}(\mathbf{A}))^{1/m}$ For almost all  $\mathbf{A}$ ,  $\det(L^{\perp}(\mathbf{A})) = q^n$ Thus,  $\lambda_1(L^{\perp}(\mathbf{A})) \leq \sqrt{m} \ q^{n/m}$ 

Can it be much smaller??

If  $q^{n/m} >> \sqrt{2\pi e}$ , then No.

# Shortest Vector in $L^{\perp}(\mathbf{A})$

$$S_r = \{ y \text{ in } Z^m, ||y|| < r \}$$

For any  $s\neq 0$  mod q in  $S_r$ ,  $Pr_A[As = 0 \mod q] = 1/q^n$ For all  $s\neq 0$  mod q in  $S_r$ ,  $Pr_A[As = 0 \mod q] \leq |S_r|/q^n$  $\approx (\pi m)^{-1/2}(2\pi e/m)^{m/2} r^m / q^n$ 

r needs to be 
$$\approx \sqrt{m/(2\pi e)}q^{n/m}$$

(since we assumed,  $q^{n/m} >> \sqrt{2\pi e}$ , we have  $r >> \sqrt{m}$ , and so # of integer points in a sphere of radius  $r \approx$  volume of sphere of radius r)

# Shortest Vector in $L^{\perp}(\mathbf{A})$

For almost all **A** in  $\mathbb{Z}_q^{n \times m}$ , when  $q^{n/m} >> \sqrt{2\pi e}$ 

$$(1-ε)\sqrt{m/(2πe)}q^{n/m} \le \lambda_1(L^{\perp}(\mathbf{A})) \le \sqrt{m} q^{n/m}$$

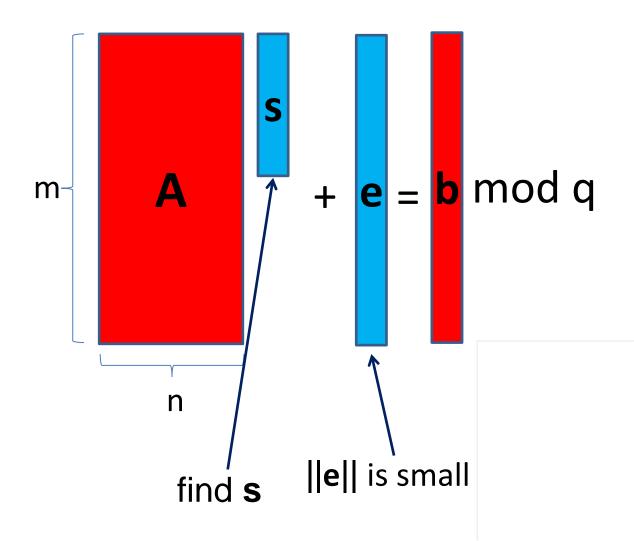
Experiments show that it's closer to this

Using LLL, can find a vector of length  $\delta^{m}$ .  $\sqrt{m/(2\pi e)}q^{n/m}$ 

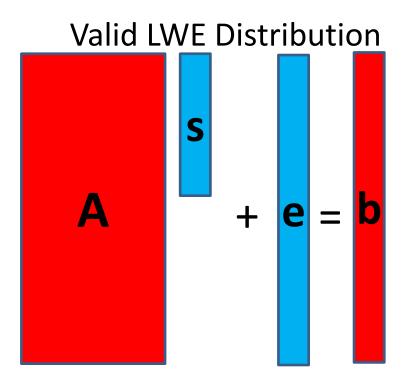
- Sometimes, to break a system, need to bound the infinity norm, so could be harder
- Sometimes it makes sense to not use all m columns

# APPLICATION OF LLL: THE LWE PROBLEM

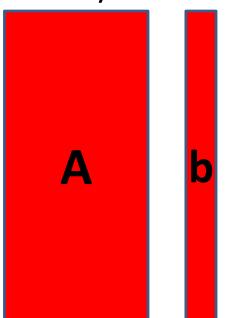
## The LWE Problem



### **Decision LWE**

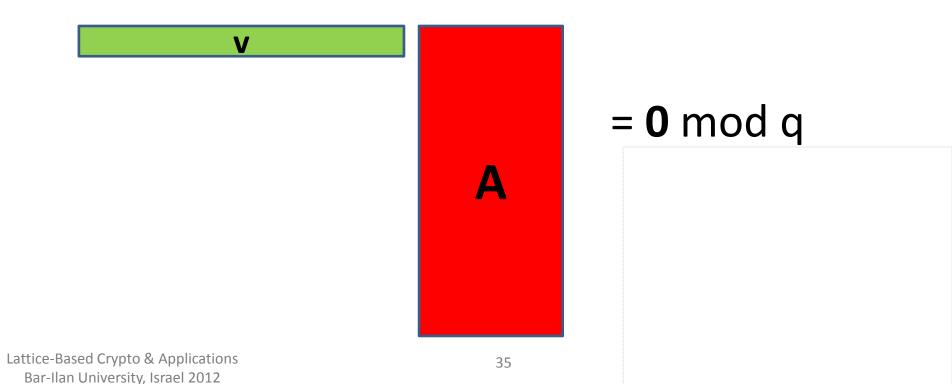






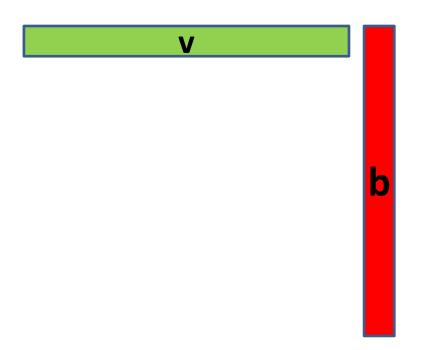
### Solve SIS to Solve LWE

Using LLL, can find a vector  $\mathbf{v}$  of length  $\delta^{m} \cdot \sqrt{m/(2\pi e)} q^{n/m}$  (set m optimally, to minimize the length of  $\mathbf{v}$ )



### Solve SIS to Solve LWE

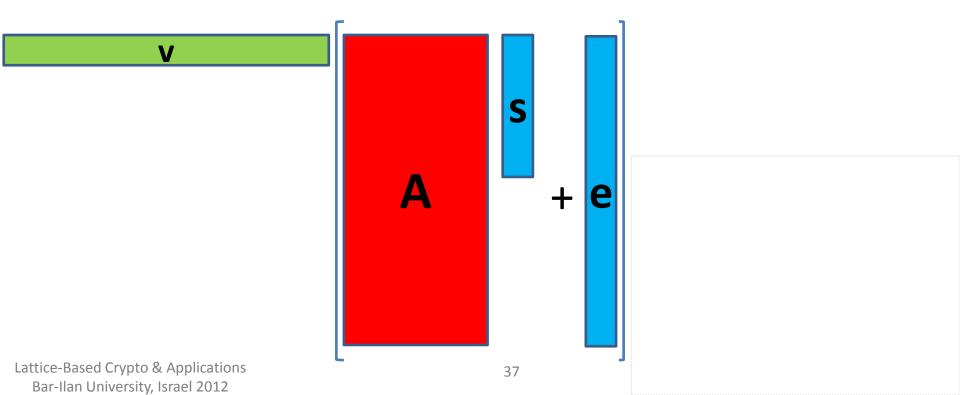
Using LLL, can find a vector  $\mathbf{v}$  of length  $\delta^{m} \cdot \sqrt{m/(2\pi e)}q^{n/m}$  (set m optimally, to minimize the length of  $\mathbf{v}$ ) Compute  $\mathbf{v} \cdot \mathbf{b}$  mod q.



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### Solve SIS to Solve LWE

Using LLL, can find a vector  $\mathbf{v}$  of length  $\delta^{m} \cdot \sqrt{m/(2\pi e)}q^{n/m}$  (set m optimally, to minimize the length of  $\mathbf{v}$ ) Compute  $\mathbf{v} \cdot \mathbf{b}$  mod q. If  $\mathbf{b} = \mathbf{A}\mathbf{s} + \mathbf{e}$ , then  $\mathbf{v} \cdot \mathbf{b} = \mathbf{v} \cdot \mathbf{e}$  is small.



### Solve SIS to Solve LWE

Using LLL, can find a vector  $\mathbf{v}$  of length  $\delta^{m} \cdot \sqrt{m/(2\pi e)} q^{n/m}$  (set m optimally, to minimize the length of  $\mathbf{v}$ )

Compute  $\mathbf{v} \cdot \mathbf{b}$  mod q. If  $\mathbf{b} = \mathbf{A}\mathbf{s} + \mathbf{e}$ , then  $\mathbf{v} \cdot \mathbf{b} = \mathbf{v} \cdot \mathbf{e}$  is small.

If  $\mathbf{b}$  is uniform, then  $\mathbf{v} \cdot \mathbf{b}$  mod q is uniform.



### Solve SIS to Solve LWE

Using LLL, can find a vector  $\mathbf{v}$  of length  $\delta^{m} \cdot \sqrt{m/(2\pi e)} q^{n/m}$  (set m optimally, to minimize the length of  $\mathbf{v}$ )
Compute  $\mathbf{v} \cdot \mathbf{b}$  mod q. If  $\mathbf{b} = \mathbf{A}\mathbf{s} + \mathbf{e}$ , then  $\mathbf{v} \cdot \mathbf{b} = \mathbf{v} \cdot \mathbf{e}$  is small.

If  $\mathbf{b}$  is uniform, then  $\mathbf{v} \cdot \mathbf{b}$  mod q is uniform.

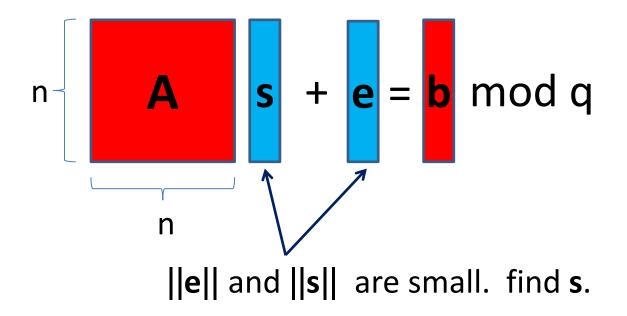
$$||\mathbf{v} \cdot \mathbf{e}|| \le ||\mathbf{v}|| \cdot ||\mathbf{e}|| \le \delta^{m} \cdot \sqrt{m/(2\pi e)} q^{n/m} ||\mathbf{e}||$$

So, if  $\delta^m \cdot \sqrt{m/(2\pi e)} q^{n/m} || \mathbf{e} || < q/2$ , can solve decision LWE and then search LWE as well

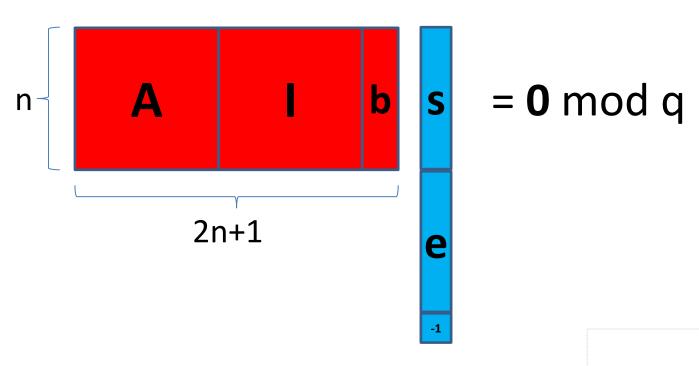
# A Different Algorithm

- The previous algorithm assumed we could obtain a lot of samples. Many crypto applications do not provide this.
- If we don't have a lot of samples can use "sample-preserving" reduction from search to decision LWE [MicMol '11]
- In some cases, that reduction does not apply (e.g. ideal lattices ...)

# LWE Problem With Few Samples



# LWE Problem With Few Samples



 $L^{\perp}(A') = \{y \text{ in } Z^{2n+1} : [A|I|b]y = 0 \text{ mod } q\}$ 

Can show that for most **A**, the "bad" vectors have length at least  $(1-\epsilon)\sqrt{m/(2\pi e)}q^{n/m}$ 

## Important Caveat

$$L^{\perp}(A') = \{y \text{ in } Z^{2n+1} : [A|I|b]y = 0 \text{ mod } q\}$$

Can show that for most **A**, the "bad" vectors have length at least  $(1-\epsilon)\sqrt{m/(2\pi e)}q^{n/m}$ 

Can find s,e if  $||\mathbf{s}|\mathbf{e}| - \mathbf{1}|| \le \delta^{m} (1-\epsilon) \sqrt{m/(2\pi e)} q^{n/m}$ 

What if LLL does not find s,e?

Then it will act as if the short vector **s**|**e**|**-1** does not exist!

#### IN PRACTICE

[Gama and Nguyen '08]

# Two Types of Problems

**Short Vector** 

given **A**, find a short **s** such that **As=0** mod q

**Unique Short Vector** 

given **A** and **As** mod q, find this short **s** 

||s|| is greater than det<sup>1/m</sup>

||s|| is less than det<sup>1/m</sup>

# Unique Short Vector Problem

Looking for very short vector s

The next shortest vector not equal to ks is v

The hardness of finding s depends on ||v|| / ||s||

Let 
$$\alpha = ||\mathbf{v}|| / ||\mathbf{s}|| = \lambda_2 / \lambda_1$$

### **Short Vector Problem**

Looking for vector **s** such that  $\mathbf{As} = \mathbf{0}$  mod q (and there are no very short vectors in  $L^{\perp}(\mathbf{A})$ )

The shortest **s** that can be found depends on  $\alpha = ||\mathbf{s}|| / \det(\mathbf{L}^{\perp}(\mathbf{A}))^{1/m}$ 

## Two Types of Problems

Short Vector

i.e. given **A**, find a short **s** such that **As=0** mod q

$$\alpha = ||\mathbf{s}|| / \det(\mathbf{L}^{\perp}(\mathbf{A}))^{1/m}$$

Unique Short Vector

i.e. given **A** and **As** mod q, find this short **s** 

$$\mathbf{A'} = [\mathbf{A} \mid \mathbf{As}]$$

$$\alpha = \lambda_2(\mathsf{L}^{\perp}(\mathbf{A'})) / ||\mathbf{s}||$$

$$\approx \lambda_1(\mathsf{L}^{\perp}(\mathbf{A})) / ||\mathbf{s}||$$

$\alpha$ =1.02 <sup>m</sup>	Can be broken using LLL
$\alpha$ =1.01 <sup>m</sup>	Can be broken using BKZ (improvement of LLL)
$\alpha$ =1.007 <sup>m</sup>	Seems quite secure for now
α=1.005 <sup>m</sup>	Seems quite secure for the foreseeable future

### **Further References**

LLL Algorithm: Oded Regev's lecture notes

www.cs.tau.ac.il/~odedr/teaching/lattices\_fall\_2009/index.html

Cryptanalysis using lattice reduction algorithms:

Nicolas Gama and Phong Nguyen: "Predicting Lattice Reduction"

Oded Regev and Daniele Micciancio: "Lattice-Based Cryptography"