

**MIT 6.875**

**Foundations of Cryptography**

**Lecture 19**

**TODAY (and the next lecture):  
Lattice-based Cryptography**

# Why Lattice-based Crypto?

## □ Exponentially Hard (so far)

While factoring and discrete log can be solved in time  $2^{\sqrt[3]{n}}$  for problems of size  $n$ , the best algorithms for lattice-based crypto run in time nearly  $2^n$ .

# Why Lattice-based Crypto?

- 
- ❑ Exponentially Hard (so far)
  - ❑ Quantum-Resistant (so far)

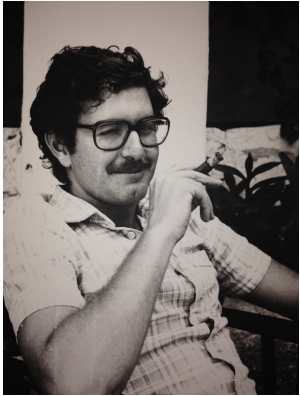
(Very large scale)

(if they exist)

# Quantum Computers Break Crypto



**Shor's Algorithm for Factoring and Discrete Logarithms.**



**“Cryptographers seldom sleep well”.**

[Silvio Micali, 1988]



# Post-Quantum Cryptography

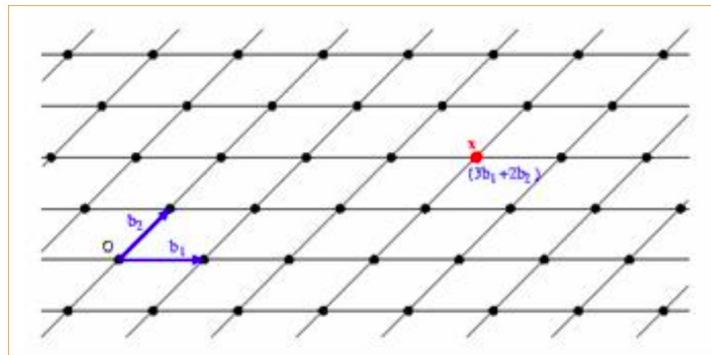
Cryptography that is (believed to be) secure against quantum attacks.

NEWS

## NIST Announces First Four Quantum-Resistant Cryptographic Algorithms

Federal agency reveals the first group of winners from its six-year competition.

July 05, 2022



3 out of 4: Lattice-based Cryptography

# Why Lattice-based Crypto?

- Exponentially Hard** (so far)
- Quantum-Resistant** (so far)
- Worst-case hardness**  
(unique feature of lattice-based crypto)
- Simple and Efficient**
- Enabler of Surprising Capabilities**  
(Fully Homomorphic Encryption)



# Solving Linear Equations

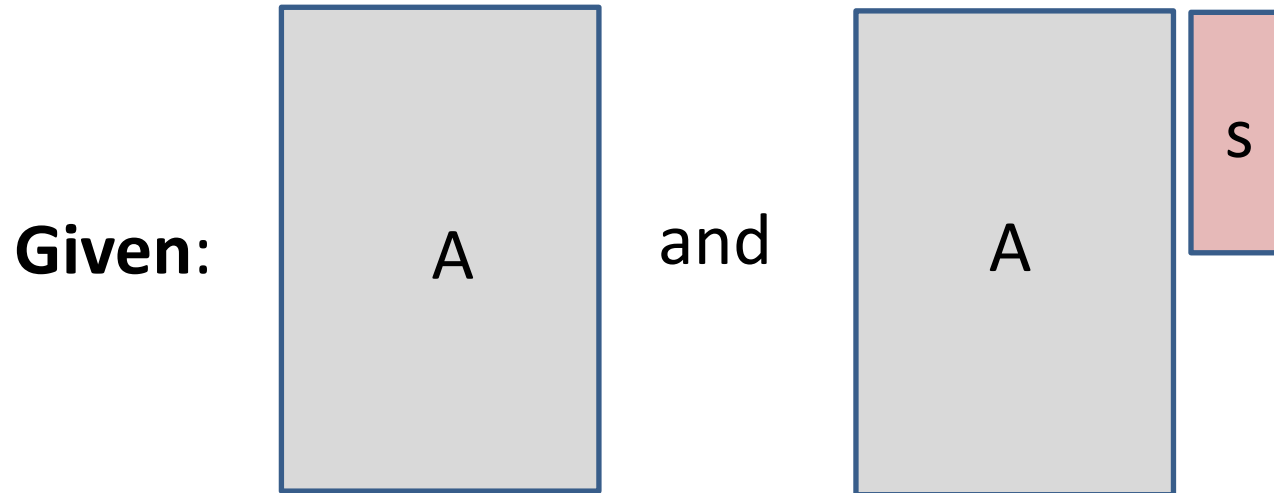
$$5s_1 + 11s_2 = 2$$

$$2s_1 + s_2 = 6$$

$$7s_1 + s_2 = 26$$

where all equations are over  $\mathbb{Z}$ , the integers

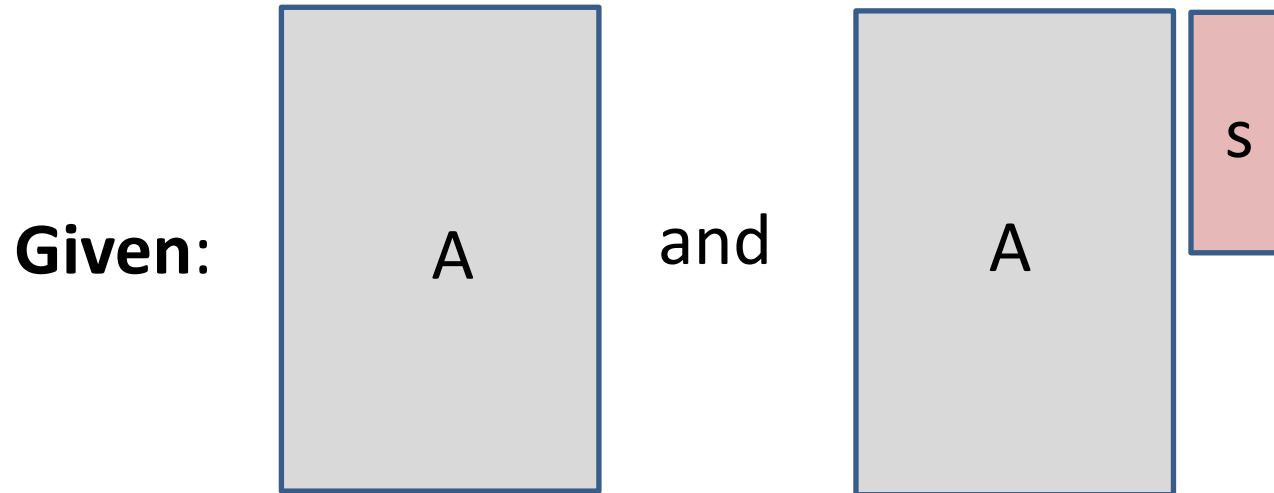
# Solving Linear Equations



**GOAL:** Find  $s$ .

More generally,  $n$  variables and  $m \gg n$  equations.

# Solving Linear Equations

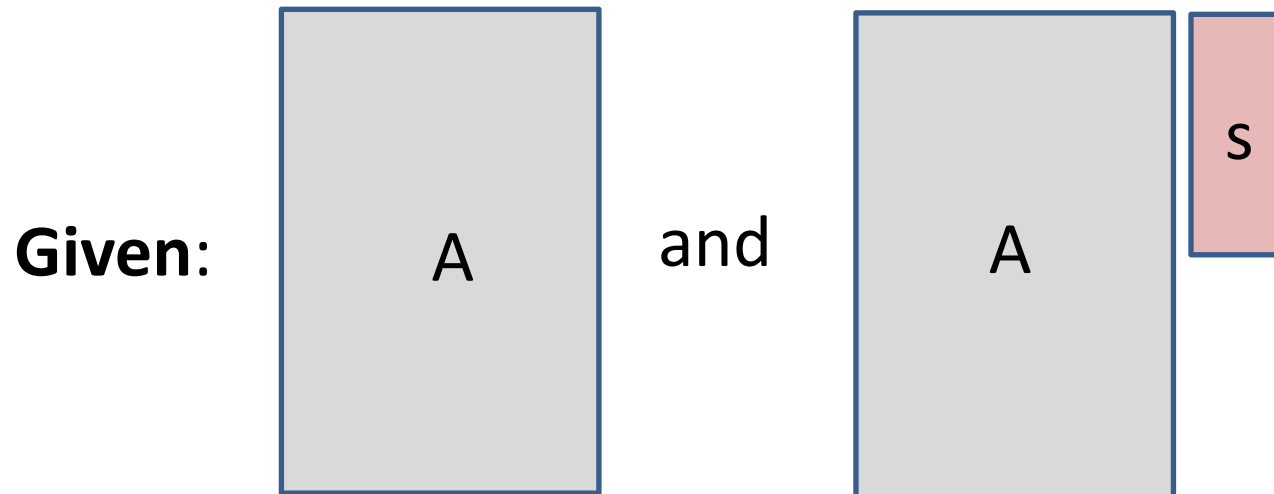


**GOAL:** Find  $s$ .

**EASY!** For example, by Gaussian Elimination



# Solving Linear Equations



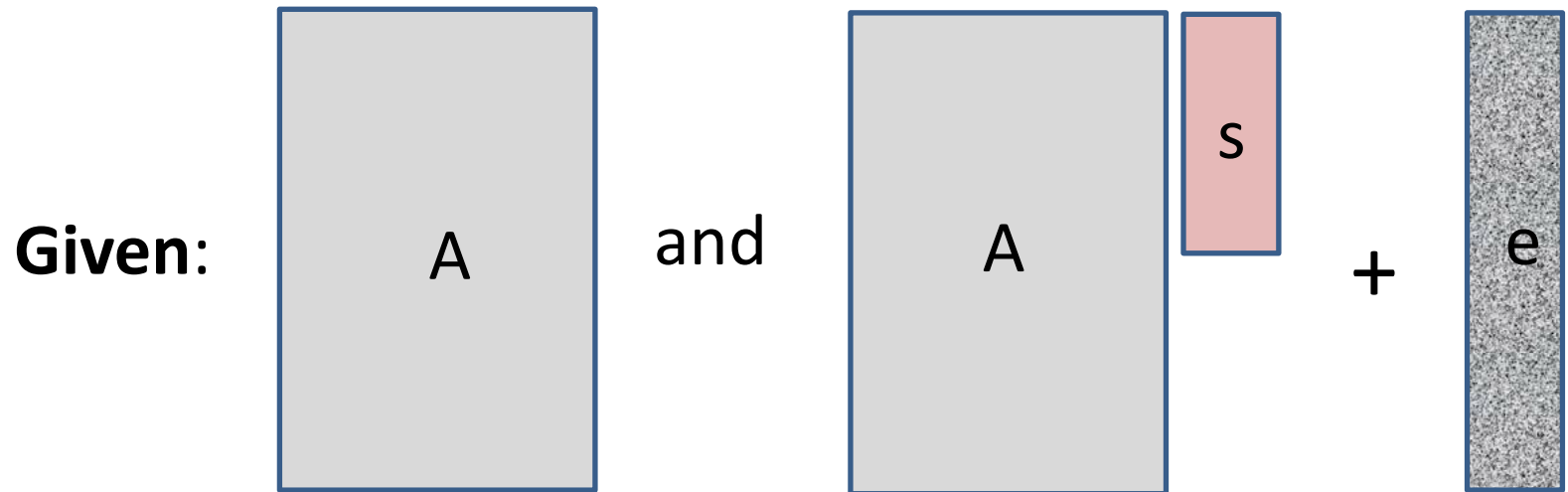
**GOAL:** Find  $s$ .

**How to make it hard: Chop the head?**

That is, work modulo some  $q$ . ( $1121 \bmod 100 = 21$ )

**Still EASY!** Gaussian Elimination mod  $q$

# Solving Linear Equations



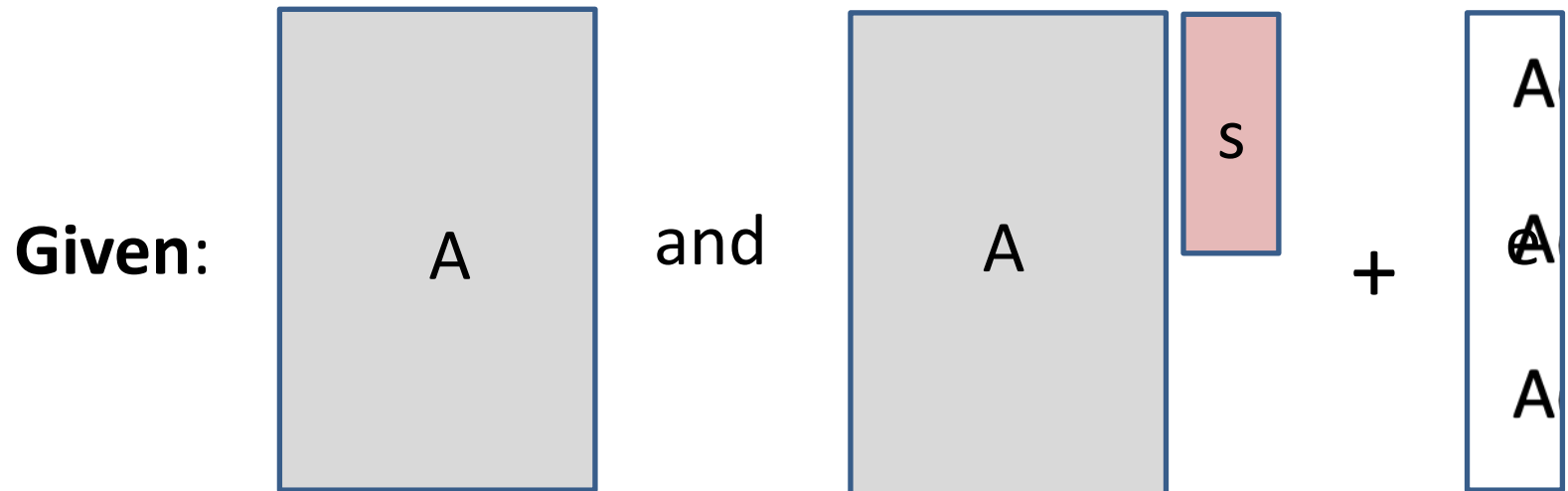
**GOAL:** Find  $s$ .

**How to make it hard: Chop the tail?**

Add a small error to each equation.

**Still EASY!** Linear regression.

# Solving Linear Equations



**GOAL:** Find  $s$ .

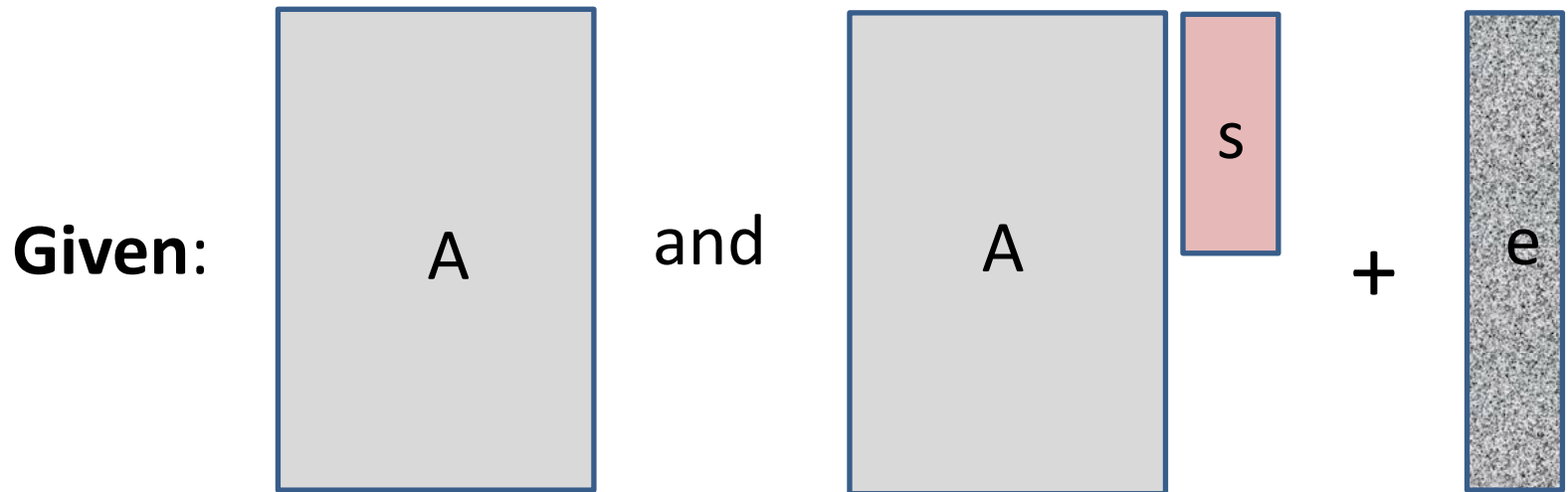
**How to make it hard:** Chop the head *and* the tail?

Add a small error to each equation and work mod  $q$ .

**Turns out to be very HARD!**



# Solving Learning with Errors (LWE) Equations

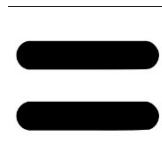


**GOAL:** Find  $s$ .

Parameters: dimensions  $n$  and  $m$ , modulus  $q$ , error distribution  $\chi = \text{uniform in some interval } [-B, \dots, B]$ .

$A$  is chosen at random from  $\mathbb{Z}_q^{m \times n}$ ,  $s$  from  $\mathbb{Z}_q^n$  and  $e$  from  $\chi^m$ .

# Learning with Errors (LWE)



## ◆ Decoding Random Linear Codes

(over  $F_q$  with  $L_1$  errors)

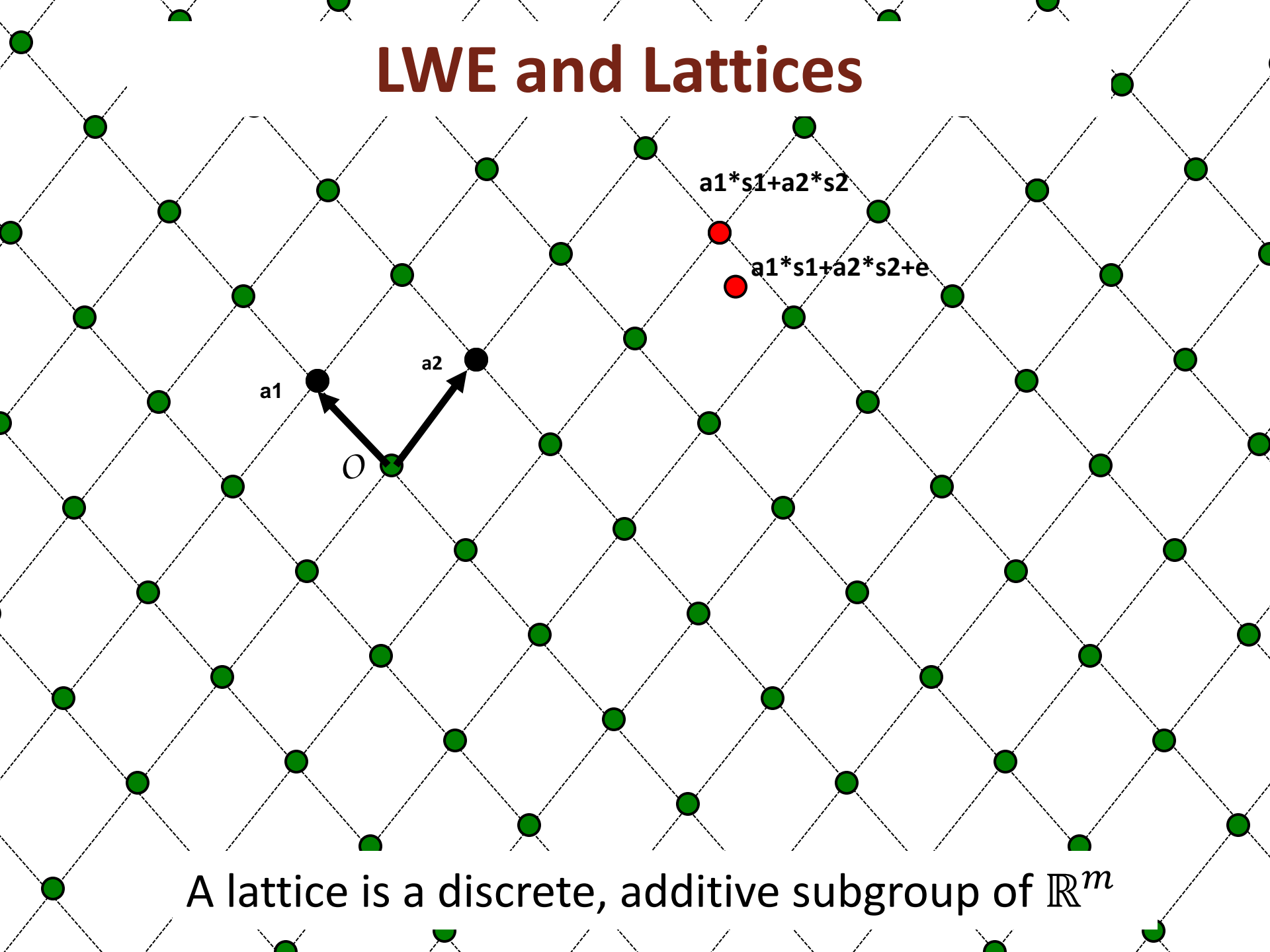
## ◆ Learning Noisy Linear Functions

## ◆ Worst-case hard Lattice Problems

[Regev'05, Peikert'09]



# LWE and Lattices



A lattice is a discrete, additive subgroup of  $\mathbb{R}^m$

# Setting Parameters

**Cryptanalysis over three decades suggests we are safe with the following parameters:**

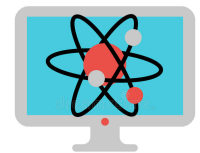
$n$  = security parameter ( $\approx 1 - 10K$ )

$m$  = arbitrary poly in  $n$

$B$  = small poly in  $n$ , say  $\sqrt{n}$

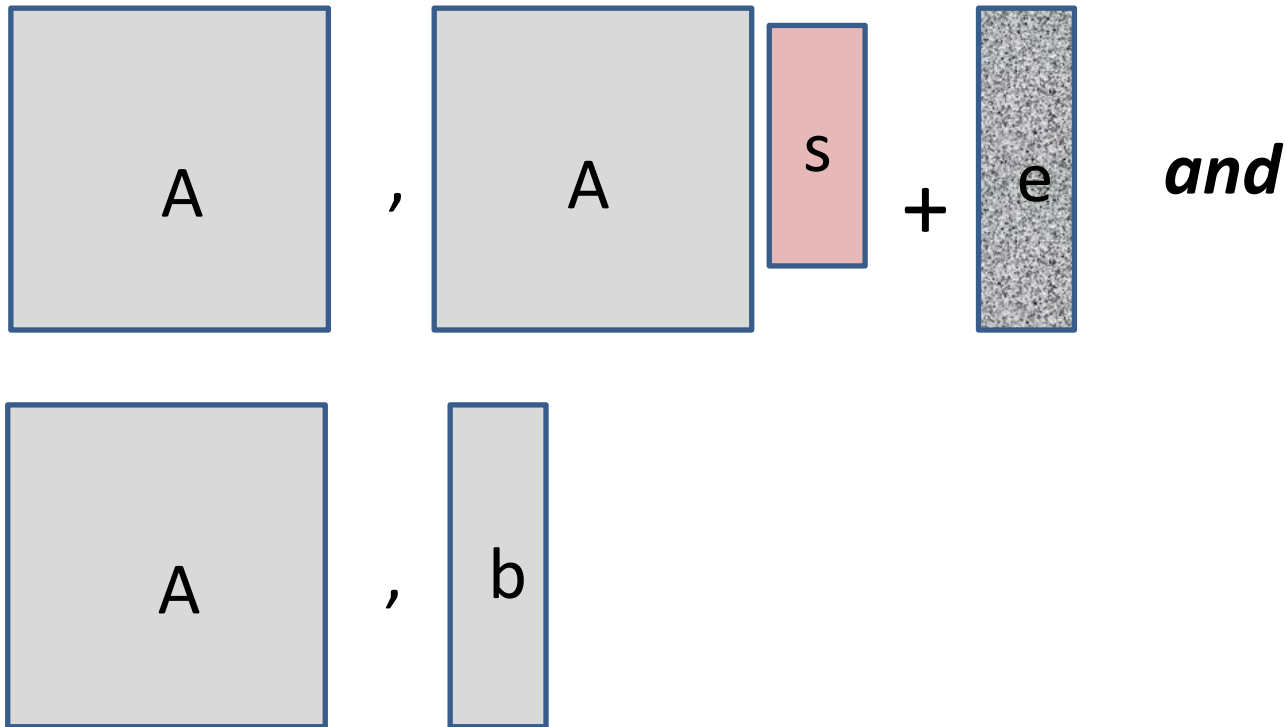
$q$  = poly in  $n$ , larger than  $B$ , and could be as large as sub-exponential, say  $2^{n^{0.99}}$

**even from quantum computers, AFAWK!**



# Decisional LWE

Can you distinguish between:

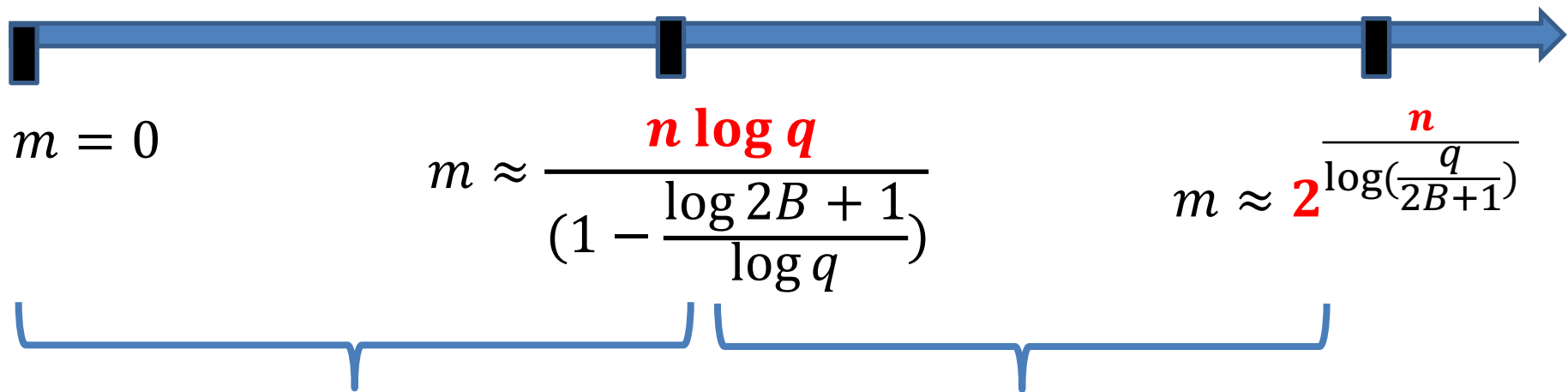


**Theorem: “Decisional LWE is as hard as LWE”.**

# Information-Computation Gap

Fix  $n, q, B$ .

(Search) LWE:



Information-theoretically impossible to recover  $s$ .

$s$  uniquely determined given  $(A, As + e)$ . computationally hard to recover.

# OWF and PRG

$$g_A(s, e) = \mathbf{A}s + e$$

$(\mathbf{A} \in \mathbb{Z}_q^{n \times m}$   
 $\mathbf{s} \in \mathbb{Z}_q^n$  random “small” secret vector  
 $e \in \mathbb{Z}_q^n$ : random “small” error vector)

- $g_A$  is a one-way function (assuming LWE)
- $g_A$  is a pseudo-random generator (decisional LWE)
- $g_A$  is also a trapdoor function...
- also a homomorphic commitment...

# Basic (Secret-key) Encryption

[Regev05]

$n$  = security parameter,  $q$  = “small” modulus

- Secret key  $sk$  = Uniformly random vector  $\mathbf{s} \in Z_q^n$
- Encryption  $\text{Enc}_{\mathbf{s}}(\mu)$ : //  $\mu \in \{0,1\}$ 
  - Sample uniformly random  $\mathbf{a} \in Z_q^n$ , “small” noise  $e \in Z$
  - The ciphertext  $\mathbf{c} = (\mathbf{a}, b = \langle \mathbf{a}, \mathbf{s} \rangle + e + \mu)$
- Decryption  $\text{Dec}_{sk}(\mathbf{c})$ : Output  $(b - \langle \mathbf{a}, \mathbf{s} \rangle \bmod q)$   
// correctness as long as  $|e| < q/4$

# Basic (Secret-key) Encryption

[Regev05]

This scheme is additively homomorphic.

$$c = (a, b = \langle a, s \rangle + e + \mu \lfloor q/2 \rfloor) \quad \leftarrow + \text{Enc}_s(m)$$

$$c' = (a', b' = \langle a', s \rangle + e' + \mu' \lfloor q/2 \rfloor) \quad \leftarrow \text{Enc}_s(m')$$

---

$$c + c' = (a+a', b+b') = \langle a+a', s \rangle + (e+e') + (\mu + \mu') \lfloor q/2 \rfloor$$

In words:  $c + c'$  is an encryption of  $\mu + \mu' \pmod{2}$

# Basic (Secret-key) Encryption

[Regev05]

You can also negate the encrypted bit easily.

We will see how to make this scheme into a fully homomorphic scheme.

For now, note that the error increases when you add two ciphertexts. That is,  $|e_{add}| \approx |e_1| + |e_2| \leq 2B$ .

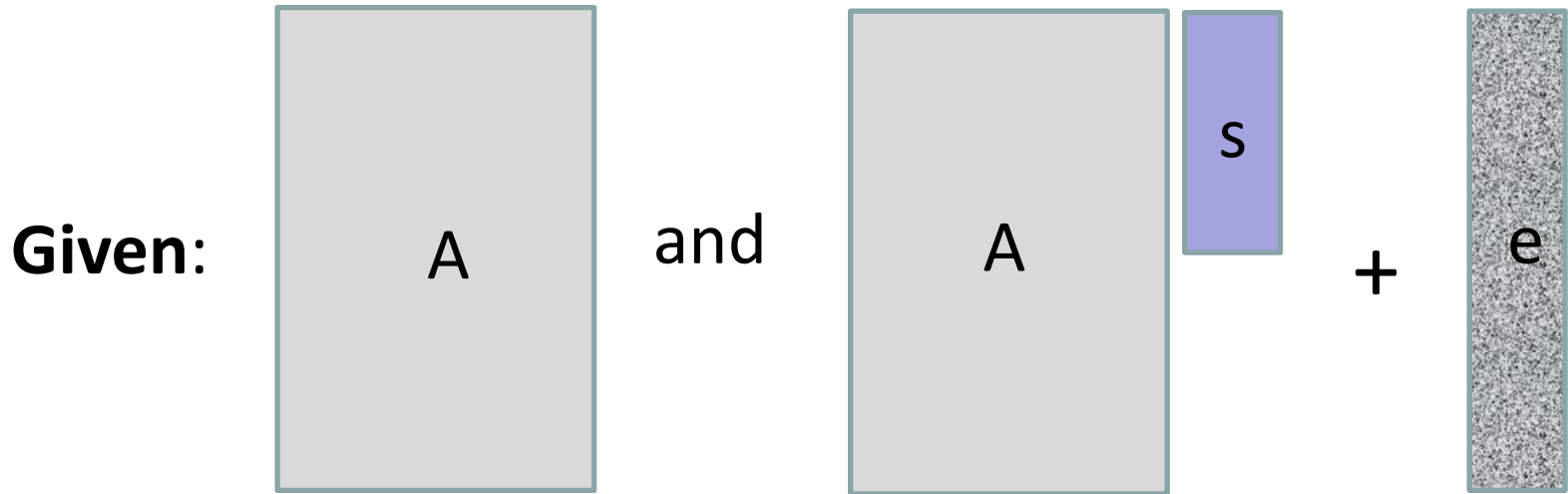
Setting  $q = n^{\log n}$  and  $B = \sqrt{n}$  (for example) lets us support any polynomial number of additions.



## **NEXT UP:**

- 1. Public-key Encryption from LWE and**
- 2. Fully Homomorphic Encryption**

# LWE with Small Secrets



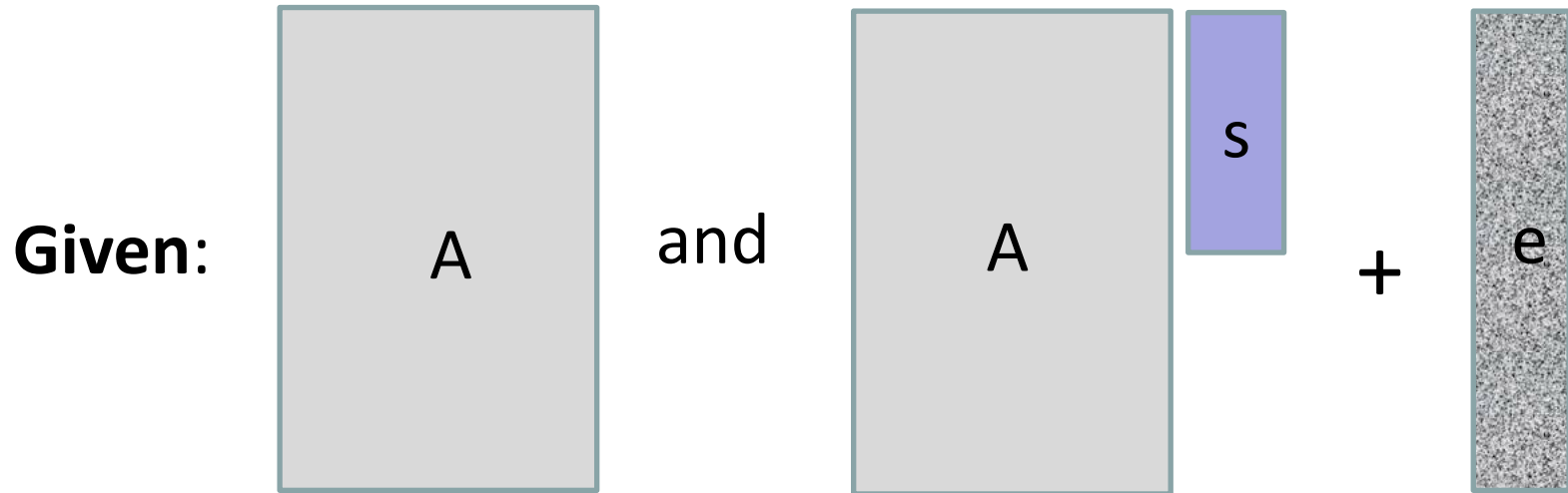
**GOAL:** Find  $s$ .

Parameters: dimensions  $n$  and  $m$ , modulus  $q$ , error distribution  $\chi =$  uniform in some interval  $[-B, \dots, B]$ .

$A$  is chosen at random from  $\mathbb{Z}_q^{m \times n}$ ,  **$s$  from**

**$\chi^n$**  and  $e$  from  $\chi^m$ .

# LWE with Small Secrets



**GOAL:** Find (the small secret)  $s$ .

**Theorem:** LWE with small secrets is as hard as LWE.

**Proof on the board.**

# Public-key Encryption

[Regev05, Micciancio'10, Lyubashevsky-Peikert-Regev'10]

- Secret key  $sk =$  **Small secret  $s$**  from  $\chi^n$
- Public key  $pk$ : for  $i$  from 1 to  $n$

$$c_i = (a_i, \langle a_i, s \rangle + e_i)$$

# Public-key Encryption

[Regev05, Micciancio'10, Lyubashevsky-Peikert-Regev'10]

- Secret key  $sk =$  Small secret  $s$  from  $\chi^n$
- Public key  $pk$ : for  $i$  from 1 to  $n$

$$(A, b = As + e) \quad \boxed{A}, \boxed{A} \boxed{s} + \boxed{e}$$

- Encrypting a message bit  $\mu$ : pick a random vector  $r$  from  $\chi^n$

$$(rA + e', rb + e'' + \mu [q/2])$$

- Decryption: compute

$$(rb + e'' + \mu [q/2]) - (rA + e')s$$

and round to nearest multiple of  $q/2$ .

# Correctness

- Encrypting a message bit  $\mu$ : pick a random vector  $\mathbf{r}$  from  $\chi^n$

$$(\mathbf{rA} + \mathbf{e}', \mathbf{rb} + e'' + \mu \lfloor q/2 \rfloor)$$

- Decryption:

$$\begin{aligned} & (\mathbf{rb} + e'' + \mu \lfloor q/2 \rfloor) - (\mathbf{rA} + \mathbf{e}')\mathbf{s} \\ &= \mathbf{r}(\mathbf{As} + \mathbf{e}) + e'' + \mu \lfloor q/2 \rfloor - (\mathbf{rA} + \mathbf{e}')\mathbf{s} \\ &= \mathbf{re} + e'' - \mathbf{e}'\mathbf{s} + \mu \lfloor q/2 \rfloor \end{aligned}$$

Decryption works as long as  $|\mathbf{re} - \mathbf{e}'\mathbf{s} + e''| < \frac{q}{4}$ .

# Security

Theorem: under decisional LWE, the scheme is IND-secure. In fact, even more: a ciphertext together with the public key is pseudorandom.

We show this by a hybrid argument.

Let's stare at a public key, ciphertext pair.

$$pk = (A, b = As + e), c = Enc(pk, \mu) = rA + e', rb + e'' + \mu [q/2]$$

Call this distribution **Hybrid 0**.

# Security

Theorem: under decisional LWE, the scheme is IND-secure. In fact, even more: a ciphertext together with the public key is pseudorandom.

**Hybrid 1.** Change the public key to random (from LWE).

$$\widetilde{\mathbf{pk}} = (A, \mathbf{b}), \tilde{\mathbf{c}} = \mathit{Enc}(\widetilde{\mathbf{pk}}, \mu) = rA + \mathbf{e}', r\mathbf{b} + \mathbf{e}'' + \mu [q/2]$$

Hybrids 0 and 1 are comp. indist. by decisional LWE.



# Security

Theorem: under decisional LWE, the scheme is IND-secure. In fact, even more: a ciphertext together with the public key is pseudorandom.

**Hybrid 2.** Change  $rA + e'$ ,  $rb + e''$  into random.

$$\widetilde{pk} = (A, b), \widetilde{c} = \text{Enc}(\widetilde{pk}, \mu) = a', b' + \mu [q/2]$$

Hybrids 1 and 2 are comp. indist. by LWE.

# Security

Theorem: under decisional LWE, the scheme is IND-secure. In fact, even more: a ciphertext together with the public key is pseudorandom.

**Hybrid 2.** Change  $rA + e'$ ,  $rb + e''$  into random.

$$\widetilde{pk} = (A, b), \widetilde{c} = Enc(\widetilde{pk}, \mu) = a', b' + \mu [q/2]$$

Now, we have the message  $\mu$  encrypted with a one-time pad which perfectly hides  $\mu$ .

# Public-key Encryption

[Regev05, Micciancio'10, Lyubashevsky-Peikert-Regev'10]

- Secret key  $sk =$  Small secret  $s$  from  $\chi^n$
- Public key  $pk$ : for  $i$  from 1 to  $n$

$$(A, b = As + e)$$

- Encrypting a message bit  $\mu$ : pick a random vector  $r$  from  $\chi^n$

$$(rA + e', rb + e'' + \mu \lfloor q/2 \rfloor)$$

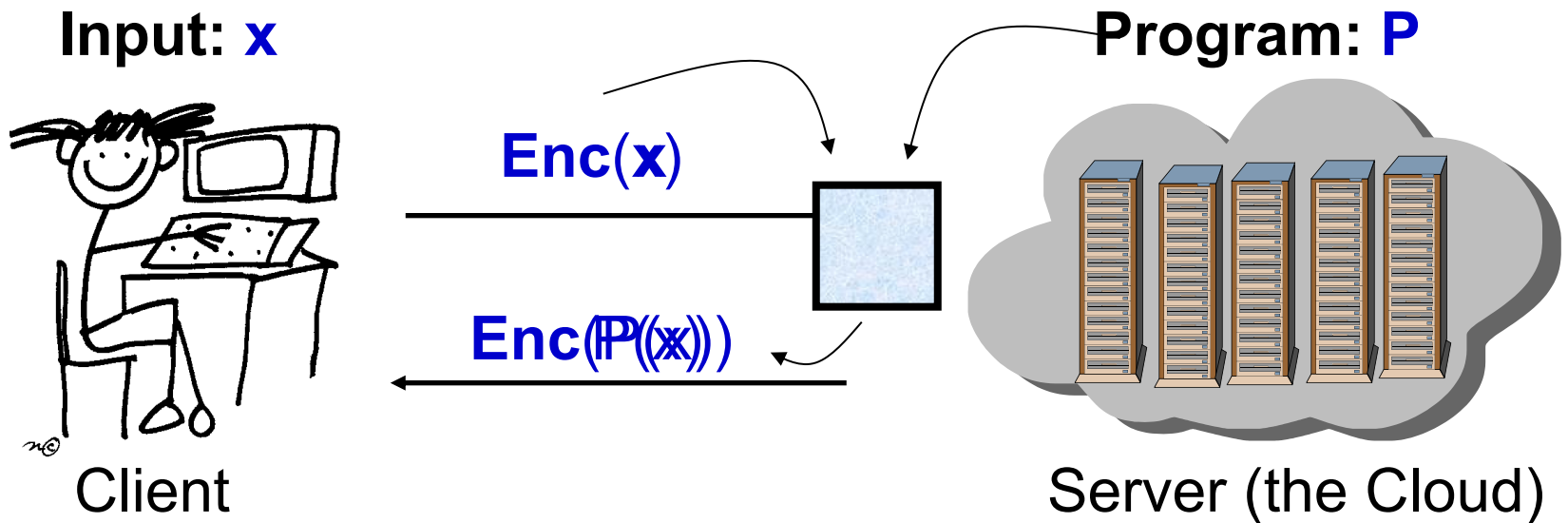
- Decryption: compute

$$(rb + e'' + \mu \lfloor q/2 \rfloor) - (rA + e')s$$

and round to nearest multiple of  $q/2$ .

# Homomorphic Encryption

# Application 1. Secure Outsourcing



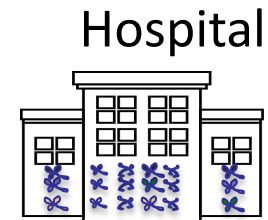
## **A Special Case:** Encrypted Database Lookup

- also called “private information retrieval” (we’ll see in two lectures)

# Application 2. Secure Collaboration



ID	Genome



ID	Phenotype

“Parties learn the genotype-phenotype correlations and nothing else”

# Homomorphic Encryption: Syntax

(can be either secret-key or public-key enc)

4-tuple of PPT algorithms  $(Gen, Enc, Dec, Eval)$  s.t.

- $(sk, ek) \leftarrow Gen(1^n)$ .

PPT Key generation algorithm generates a secret key **as well as a (public) evaluation key**.

- $c \leftarrow Enc(sk, m)$ .

Encryption algorithm uses the secret key to encrypt message  $m$ .

- $c' \leftarrow Eval(ek, f, c)$ .

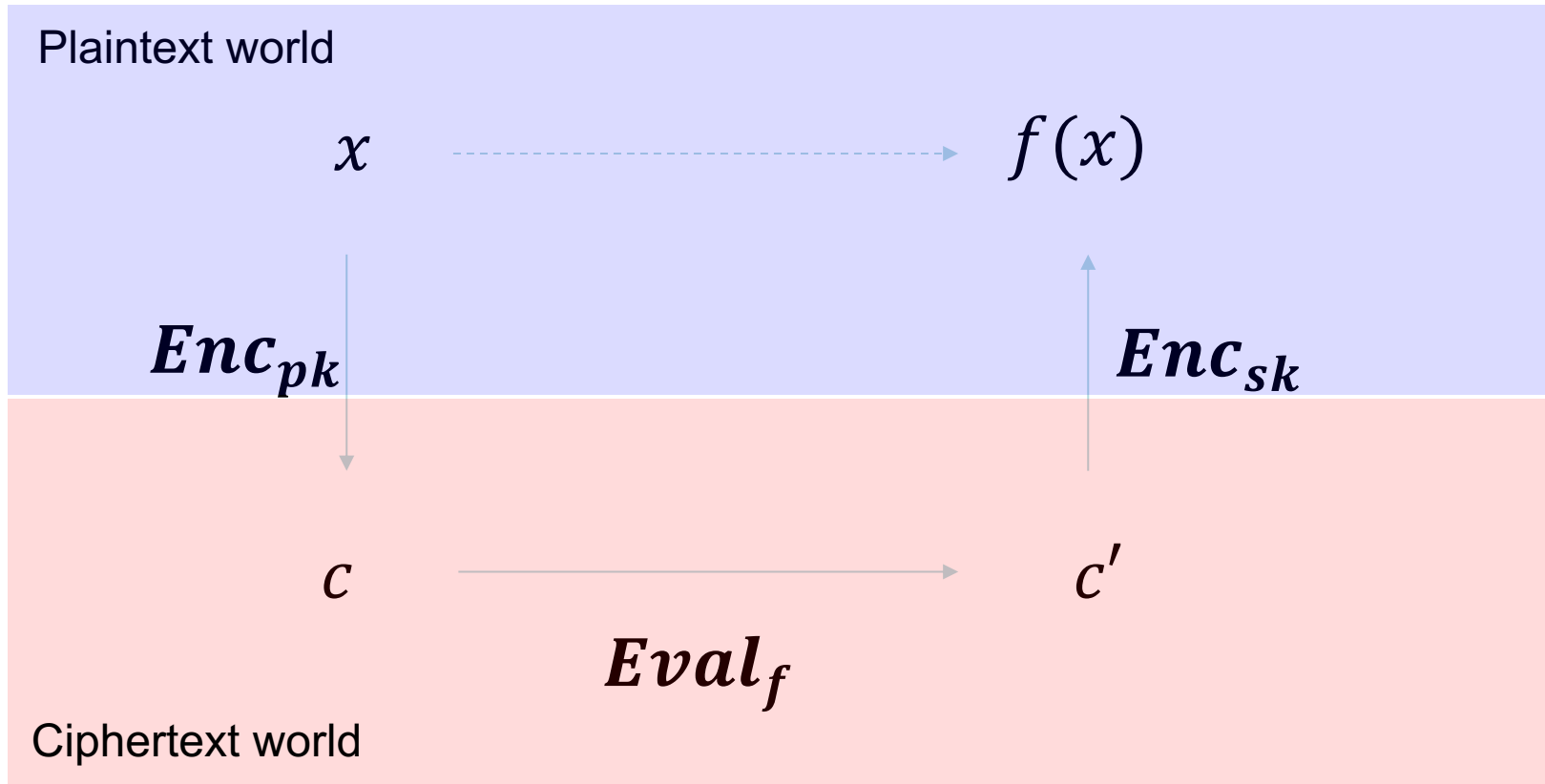
Homomorphic evaluation algorithm uses the evaluation key to produce an “evaluated ciphertext”  $c'$ .

- $m \leftarrow Dec(sk, c)$ .

Decryption algorithm uses the secret key to decrypt ciphertext  $c$ .

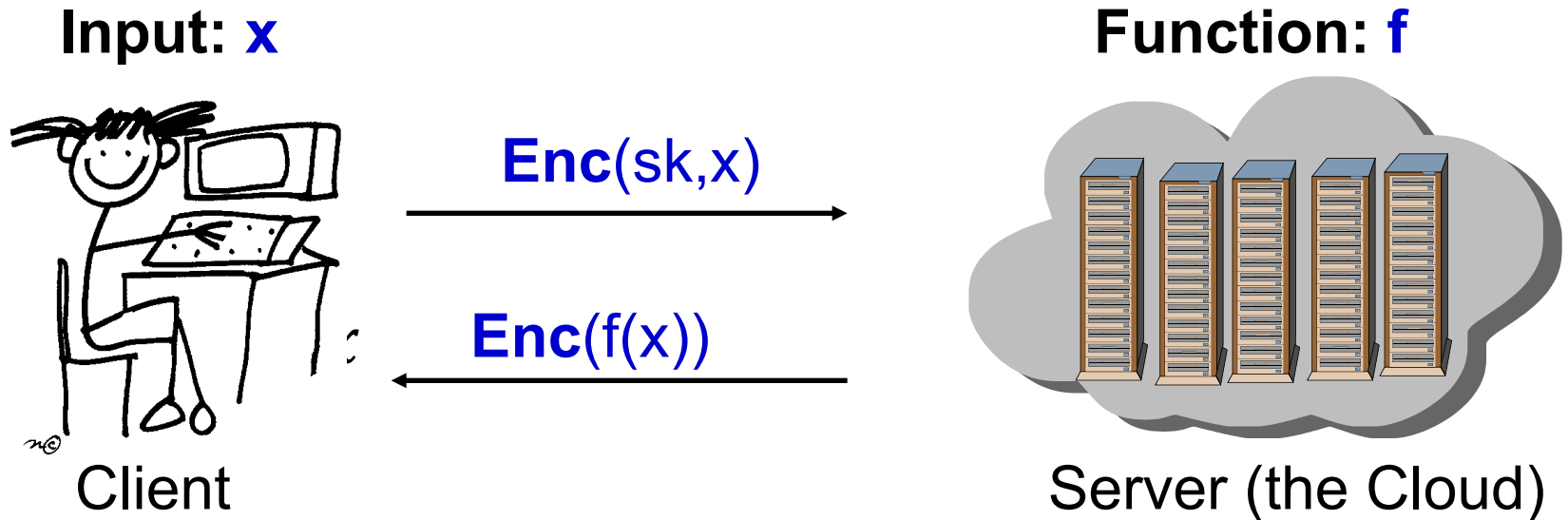
# Homomorphic Encryption: Correctness

$$Dec(sk, Eval(ek, f, Enc(x))) = f(x).$$





# Homomorphic Encryption: Security



Security against the “curious cloud” = standard **IND-security** of secret-key encryption

**Key Point:** Eval is an entirely public algorithm with public inputs.

# Here is a homomorphic encryption scheme...

- $(sk, -) \leftarrow Gen(1^n)$ .

Use any old secret key enc scheme.

- $c \leftarrow Enc(sk, m)$ .

Just the secret key encryption algorithm...

- $c' \leftarrow Eval(ek, f, c)$ .

Output  $c' = c || f$ . So Eval is basically the identity function!!

- $m \leftarrow Dec(sk, c')$ .

Parse  $c' = c || f$  as a ciphertext concatenated with a function description. Decrypt  $c$  and compute the function  $f$ .

**This is correct and it is IND-secure.**

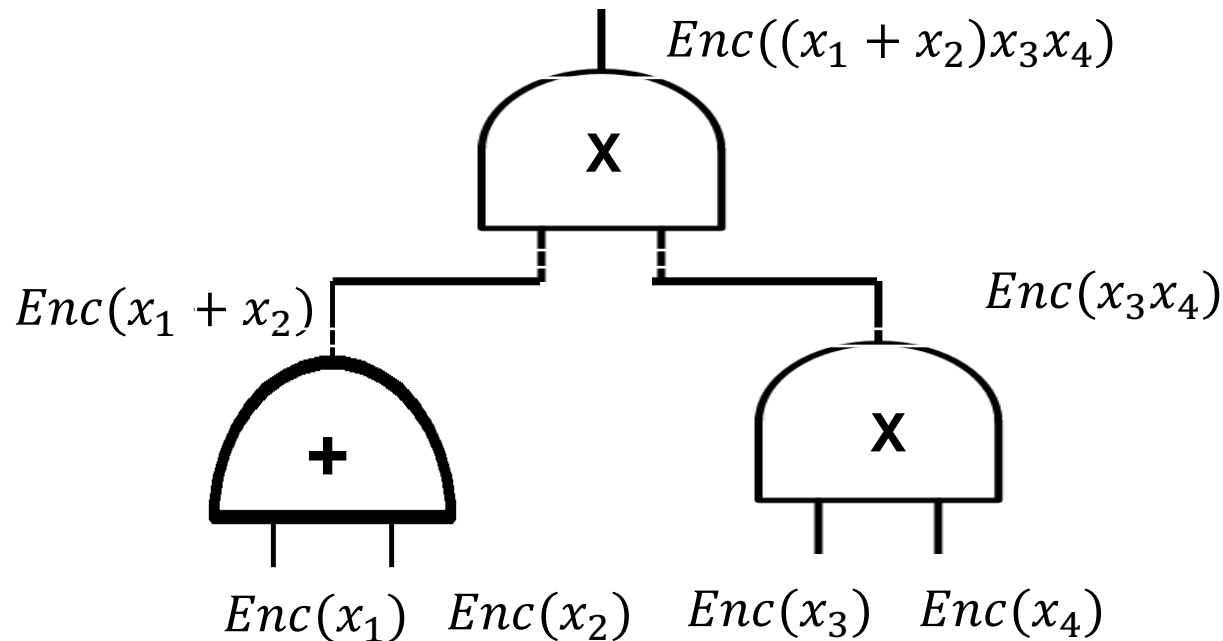
# Homomorphic Encryption: Compactness

The size (bit-length) of the evaluated ciphertext and the runtime of the decryption is *independent of* the complexity of the evaluated function.

***A Relaxation:*** The size (bit-length) of the evaluated ciphertext and the runtime of the decryption *depends sublinearly on* the complexity of the evaluated function.

# How to Compute Arbitrary Functions

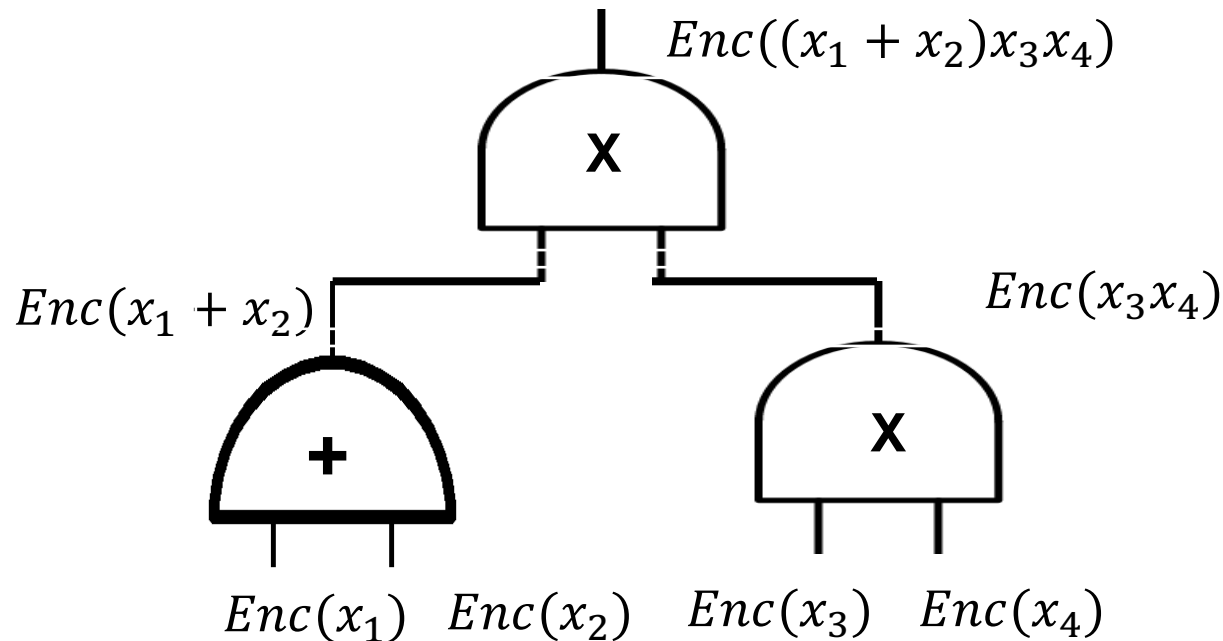
For us, programs = functions = Boolean circuits with XOR ( $+ \text{ mod } 2$ ) and AND ( $\times \text{ mod } 2$ ) gates.



**Takeaway:** If you can compute XOR and AND on encrypted bits, you can compute everything.

# How to Compute Arbitrary Functions

For us, programs = functions = Boolean circuits with XOR ( $+ \text{ mod } 2$ ) and AND ( $\times \text{ mod } 2$ ) gates.



*We already know how to add (XOR), can we multiply?? Next lecture...*