

# Session #5: Learning With Errors

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Winter School on Lattice-Based Cryptography and Applications  
Bar-Ilan University, Israel  
19 Feb 2012 – 22 Feb 2012

## Last Time...

- ▶ SIS: find “small” nontrivial  $z_1, \dots, z_m \in \mathbb{Z}$  such that:

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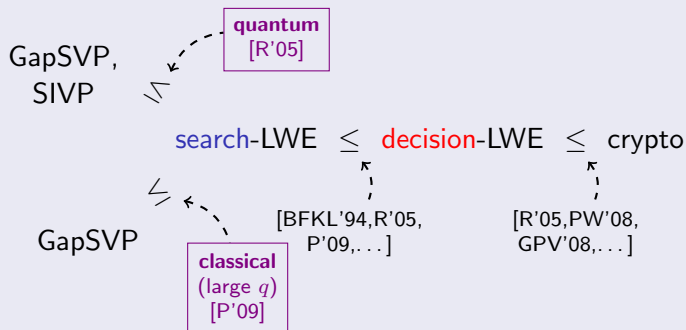
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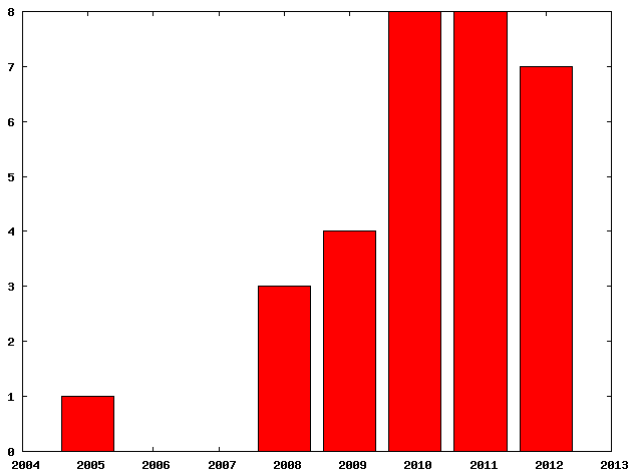
- ▶ This talk: a complementary problem, **Learning With Errors**

# Overview of LWE Hardness



# History of LWE

Crypto papers with “something new” regarding LWE:



## Learning With Errors [Regev'05]

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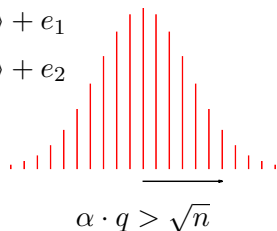
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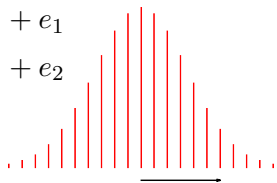
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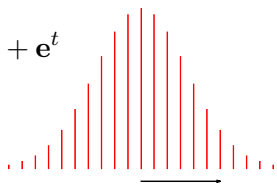
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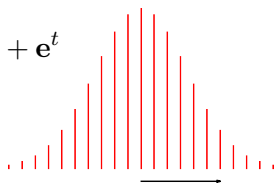
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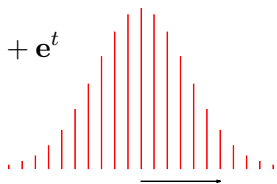
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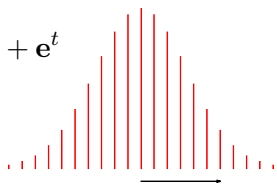
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  - ★ There's an  $\exp((\alpha q)^2)$ -time attack! [AG'11]

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'CRYPTOMANIA'

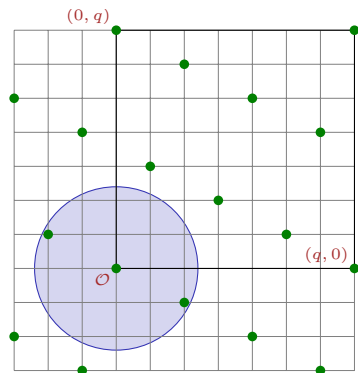
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Average-case SVP:

$$\mathcal{L}^\perp(\mathbf{A}) = \{\mathbf{z} \in \mathbb{Z}^m : \mathbf{Az} = \mathbf{0}\}$$

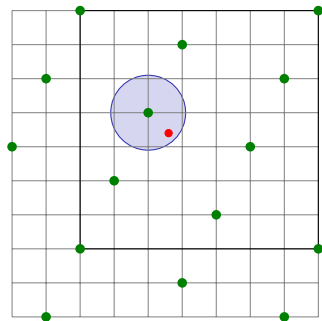


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Average-case BDD:

$$\mathcal{L}(\mathbf{A}) = \{\mathbf{z}^t \equiv \mathbf{s}^t \mathbf{A} \pmod{q}\}$$



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- 3 **Multiple secrets:**  $(\mathbf{a}, b_1 \approx \langle s_1, \mathbf{a} \rangle, \dots, b_t \approx \langle s_t, \mathbf{a} \rangle)$  vs.  $(\mathbf{a}, b_1, \dots, b_t)$ .  
Simple hybrid argument, since  $\mathbf{a}$ 's are *public*.

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- ▶ Suppose  $\mathcal{D}$  solves **decision**-LWE: it 'perfectly' distinguishes between pairs  $(\mathbf{a}, b = \langle \mathbf{s}, \mathbf{a} \rangle + e)$  and  $(\mathbf{a}, b)$ .

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- ▶ Don't really need  $q = \text{poly}(n)$  [P'09,ACPS'09,MM'11,MP'12]

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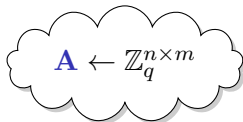
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- ▶ This maps  $(\mathbf{a}, \mathbf{b})$  to  $(\mathbf{a}', \mathbf{b}')$ , so it applies to decision-LWE too.

# Public-Key Cryptosystem [R'05]



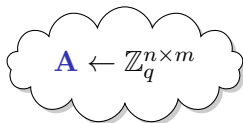
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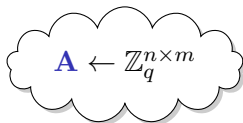
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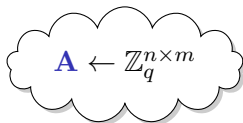
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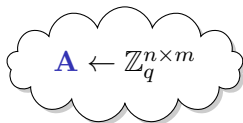
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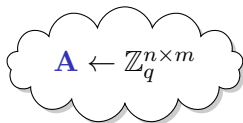
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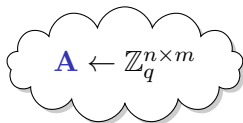
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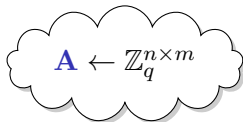


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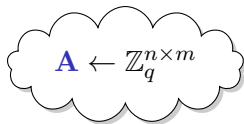


$(\mathbf{A}, \mathbf{b}^t), (\mathbf{u}, \mathbf{u}')$   
by LWE and  
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# 'Dual' Cryptosystem [GPV'08]



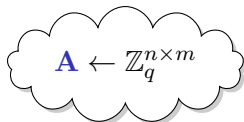
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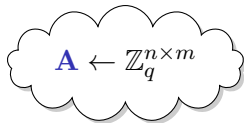
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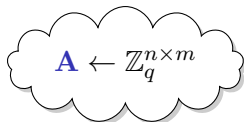
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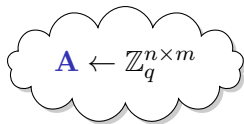
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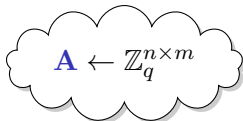
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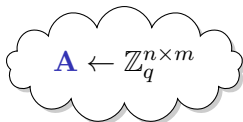
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- ▶ security: encrypting to 'malformed'  $pk = (\mathbf{A}, \mathbf{b}^t)$  induces **uniform** ciphertext

## Dual

- ▶  $pk = (\mathbf{A}, \mathbf{u} = \mathbf{A}\mathbf{x})$  is **statistically random** with many possible  $sk = \mathbf{x}$
- ▶ c'text  $(\mathbf{b}, \mathbf{b}') \approx \mathbf{s}^t(\mathbf{A}, \mathbf{u})$  is many LWE RHS's, with unique Enc coins  $\mathbf{s}, \mathbf{e}$

# Primal vs. Dual Systems

## Primal

- ▶  $pk = (\mathbf{A}, \mathbf{b}^t = \mathbf{s}^t \mathbf{A} + \mathbf{e}^t)$  is **pseudorandom** with unique  $sk = \mathbf{s}$
- ▶ c'text  $(\mathbf{u} = \mathbf{A}\mathbf{x}, \mathbf{u}' \approx \mathbf{s}^t \mathbf{u})$  is a fresh LWE sample, with many possible Enc coins  $\mathbf{x}$
- ▶ security: encrypting to 'malformed'  $pk = (\mathbf{A}, \mathbf{b}^t)$  induces **uniform** ciphertext

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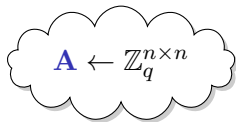
(shared)  $\mathbf{A}$  size:  $n \times (n \log q)$  elements of  $\mathbb{Z}_q$   
(user)  $pk$  &  $ct$  size:  $n \log q$  &  $n$  elements, or vice-versa



# Most Efficient Cryptosystem [A'03,LPS'10,LP'11]



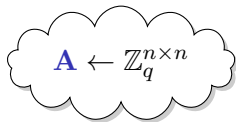
$$\mathbf{s} \leftarrow \chi^n$$



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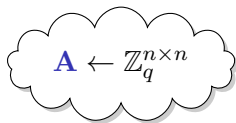
$$\mathbf{u}^t = \mathbf{s}^t \mathbf{A} + \mathbf{e}^t$$

—————→  
(public key)

# Most Efficient Cryptosystem [A'03,LPS'10,LP'11]



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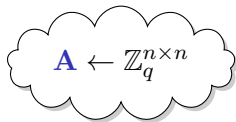
$$\mathbf{b} = \mathbf{A}\mathbf{r} + \mathbf{x}$$

←—————  
(ciphertext 'preamble')

# Most Efficient Cryptosystem [A'03,LPS'10,LP'11]



$$\mathbf{s} \leftarrow \chi^n$$



$$\mathbf{A} \leftarrow \mathbb{Z}_q^{n \times n}$$

$$\mathbf{r} \leftarrow \chi^n$$



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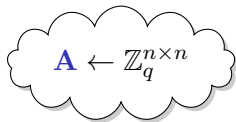
$$\mathbf{b}' = \mathbf{u}^t \mathbf{r} + \mathbf{x}' + \text{bit} \cdot \frac{q}{2}$$

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( 'payload' )

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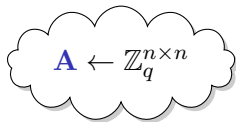
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$$\mathbf{b}' - \mathbf{s}^t \mathbf{b} \approx \text{bit} \cdot \frac{q}{2}$$

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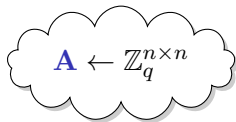


$$(\mathbf{A}, \mathbf{u}, \mathbf{b}, b')$$

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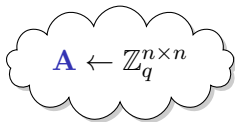


$(\mathbf{A}, \mathbf{u}, \mathbf{b}, \mathbf{b}')$   
by LWE (HNF)

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$(\mathbf{A}, \mathbf{u}, \mathbf{b}, b')$   
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## When We Come Back. . .

- ▶ A different kind of LWE application: Efficient **pseudorandom functions**

## When We Come Back. . .

- ▶ A different kind of LWE application: Efficient pseudorandom functions

### Selected bibliography for this talk:

- R'05** O. Regev, "On lattices, learning with errors, random linear codes, and cryptography," STOC'05 / JACM'09.
- GPV'08** C. Gentry, C. Peikert, V. Vaikuntanathan, "Trapdoors for hard lattices and new cryptographic constructions," STOC'08.
- ACPS'09** B. Applebaum, D. Cash, C. Peikert, A. Sahai, "Fast Cryptographic Primitives and Circular-Secure Encryption Based on Hard Learning Problems," CRYPTO'09.
- LPS'10** V. Lyubashevsky, A. Palacio, G. Segev, "Public-Key Cryptographic Primitives Provably as Secure as Subset Sum," TCC'10.
- LP'11** R. Lindner, C. Peikert, "Better Key Sizes (and Attacks) for LWE-Based Encryption," CT-RSA'11.