

Lattice-Based Cryptography

Huijing Gong

10/21/2019

- Slides courtesy of Dana Dachman-Soled, Valeria Nikolaenko, Chris Peikert, and Oded Regev

Traditional Crypto Assumptions

- Recall...

Traditional Crypto Assumptions

- Discrete Log: Given $g^x \bmod p$, find x .
 - (Decisional) Diffie-Hellman Assumptions (g^x, g^y, g^{xy}) , (g^x, g^y, g^z)
- More: Factoring

Are They Secure?

- Algorithmic Advances:
 - Factoring: Best algorithm time $2^{\tilde{O}(n^{\frac{1}{3}})}$ to factor n -bit number.
 - Discrete log: Best algorithm $2^{\tilde{O}(n^{\frac{1}{3}})}$ for groups Z_p^* , where p is n -bit.
- Quantum Computers:
 - Shor's algorithm solves both factoring and discrete log in quantum polynomial time ($\tilde{O}(n^2)$).

Are They Secure?

“For those partners and vendors that have not yet made the transition to Suite B algorithms (ECC), we recommend not making a significant expenditure to do so at this point but instead to **prepare for the upcoming quantum resistant algorithm transition**.... Unfortunately, the growth of elliptic curve use has bumped up against the fact of continued progress in the research on quantum computing, necessitating a re-evaluation of our cryptographic strategy.” —NSA Statement, August 2015

NIST Kicks Off Effort to Defend Encrypted Data from Quantum Computer Threat

April 28, 2016

Google Dabbles in Post-Quantum Cryptography

By Richard Adhikari
Jul 12, 2016 2:06 PM PT

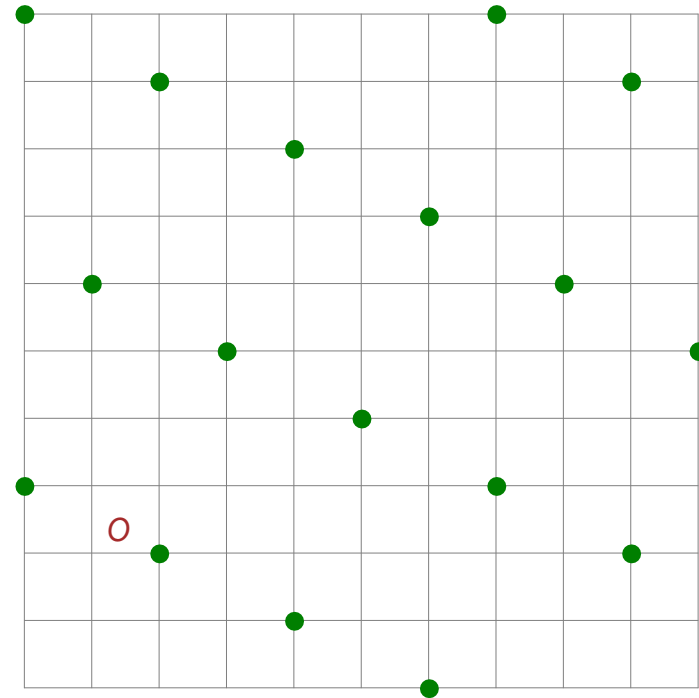
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Post-Quantum Approach

- Believed to be hard for quantum computers.
- Versatile: Can essentially construct all cryptosystems out of these assumptions.
- Candidates: [Lattice-based Crypto](#), Hash-based Crypto, code-based, etc.

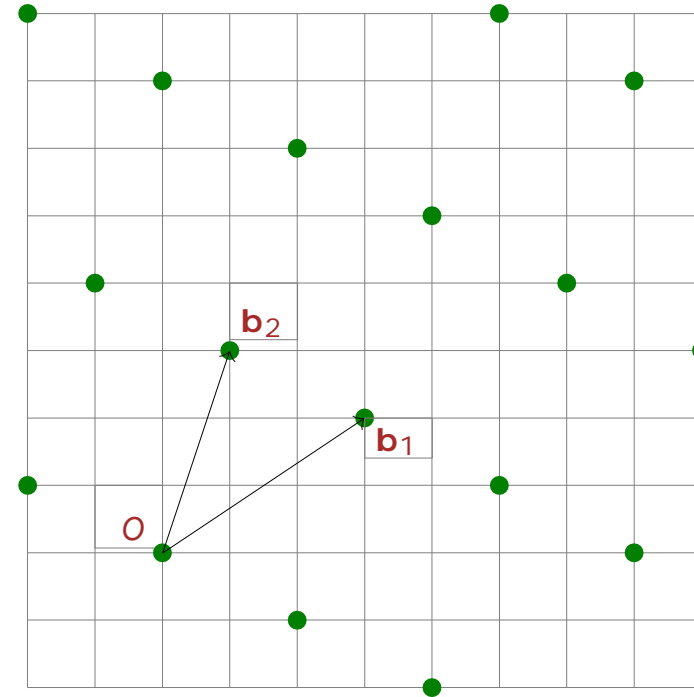
What's a Lattice?

- A **periodic 'grid'** in \mathbb{Z}^m (Formally: full-rank additive subgroup.)



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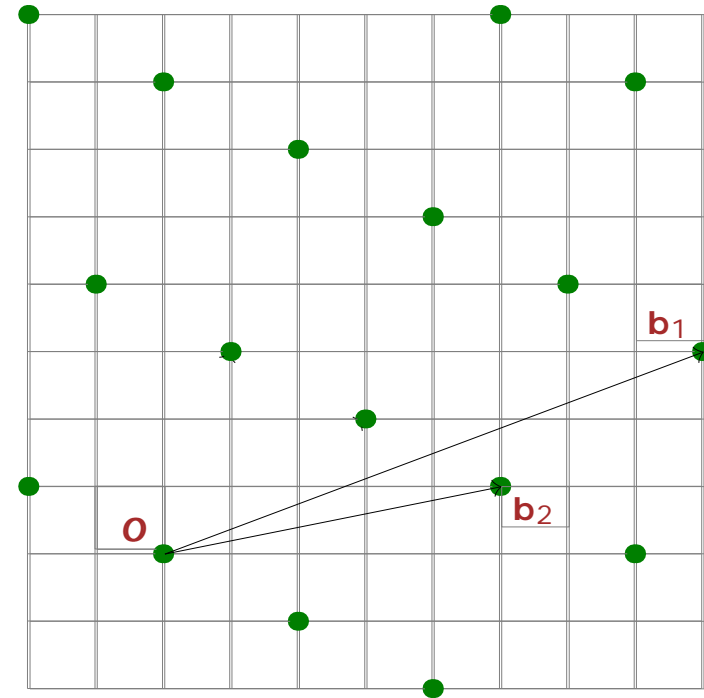
- A **periodic 'grid'** in \mathbb{Z}^m (Formally: full-rank additive subgroup.)
- Basis $\mathbf{B} = \{\mathbf{b}_1, \dots, \mathbf{b}_m\}$
- Lattice = $\sum_{j=1}^m \mathbb{Z} \cdot \mathbf{b}_j$



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- Lattice = $\sum_{j=1}^m \mathbb{Z} \cdot \mathbf{b}_j$

(Other representations too . . .)



Hard Lattice Problem: Learning With Errors (LWE)

[Regev'05]

There is a secret vector s in \mathbb{Z}_p^n (we'll use \mathbb{Z}_{17}^4 as a running example)

An oracle (who knows s) generates a random vector a in \mathbb{Z}_p^n and
"small" noise element e in \mathbb{Z}

The oracle outputs $(a, b = \langle a, s \rangle + e \pmod{17})$

| |
|----|
| 8 |
| 3 |
| 12 |
| 5 |

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

Our task is to find s

Learning With Errors (LWE) Problem

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|---|----|---|---|

| |
|---|
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|---|

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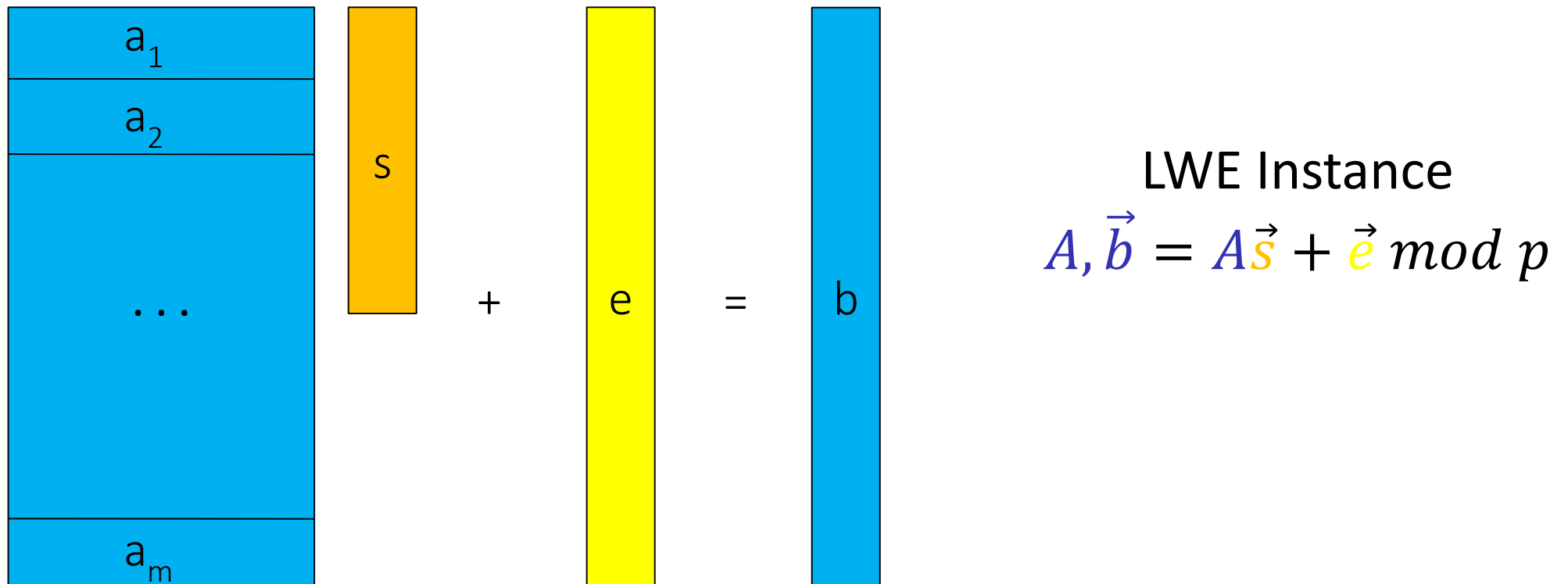
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| | | | | | | | | | |
|---|----|---|----|---|----|---|----|---|----|
| 2 | 13 | 7 | 3 | * | 8 | + | 1 | = | 13 |
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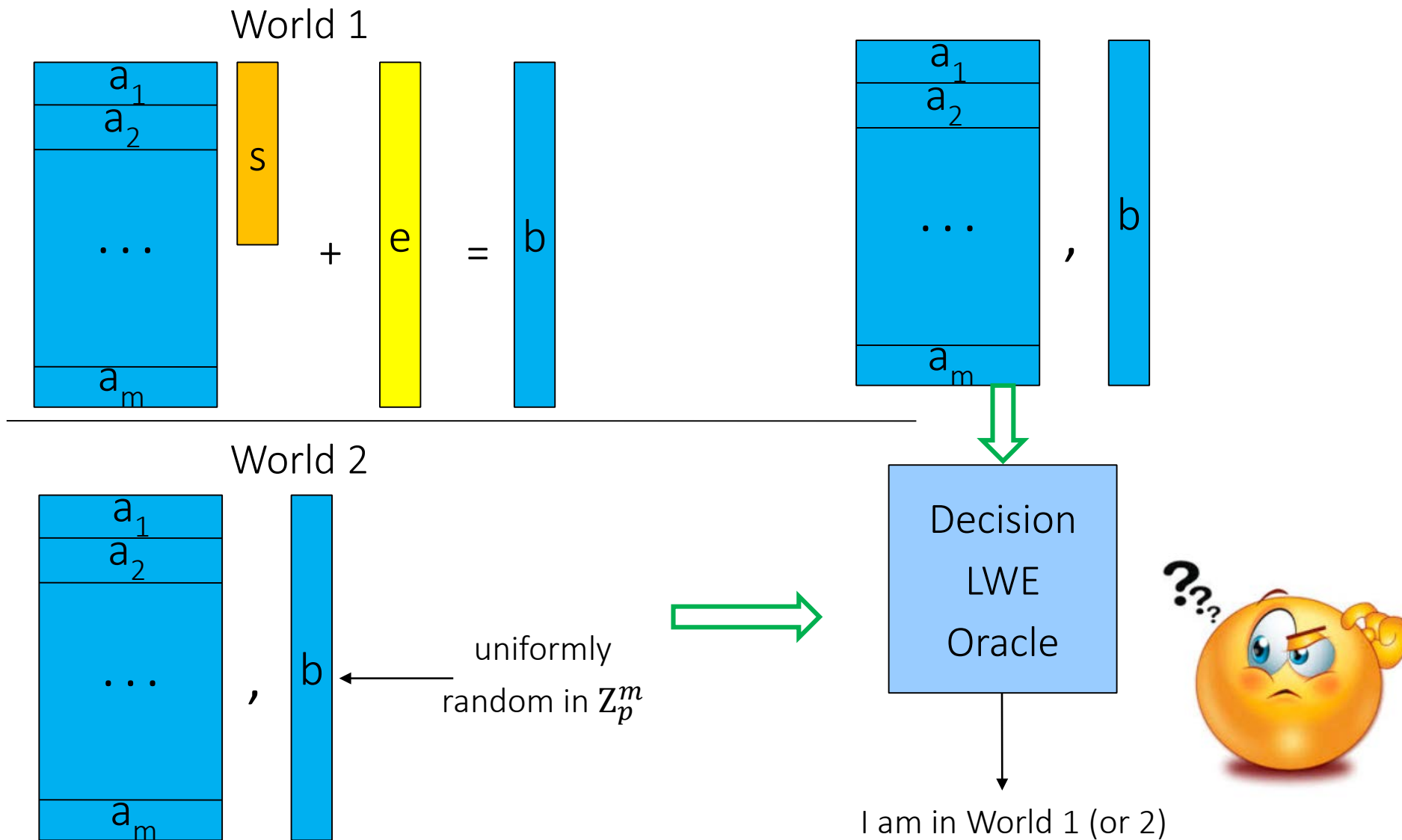
Learning With Errors (LWE) Problem



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.

Decisional LWE Problem



LWE is Versatile

- What kinds of crypto can we do with LWE?
 - Key Exchange, Public Key Encryption
 - Oblivious Transfer
 - Actively Secure Encryption (w/o random oracles)
 - Block Ciphers, Pseudorandom Functions
 - Identity-Based Encryption (w/ RO)
 - Hierarchical ID-Based Encryption (w/o RO)
 - Fully Homomorphic Encryption
 - Attribute-Based Encryption for arbitrary policies
 - and much, much more. .

Recall...

Diffie-Hellman key exchange

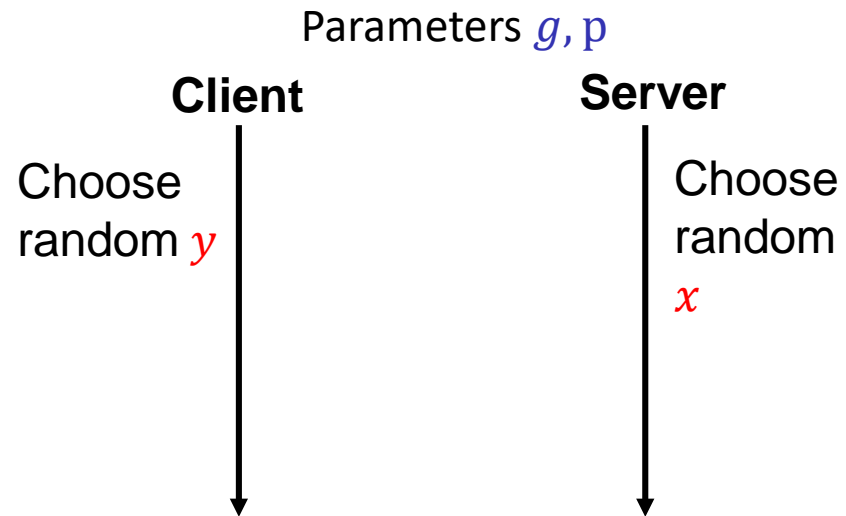
Parameters g, p
Client **Server**

Nonsecret value in blue and secret value in red.

1. Client and Server agree on the algorithm parameters g and p
2. Client and Server generate their own private keys, named y and x , respectively
3. Server computes g^x and sends it to Client.
4. Client computes g^y and sends it to Server.
5. Client computes $(g^x)^y$ and uses it as its secret.
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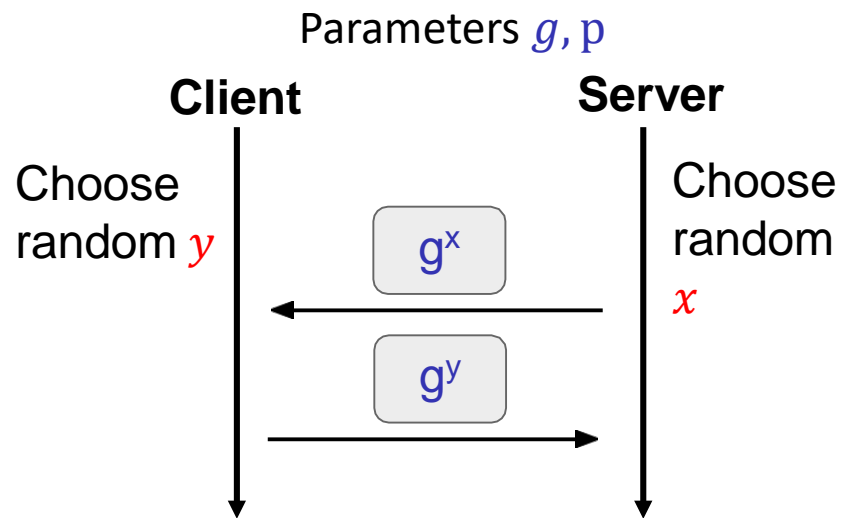


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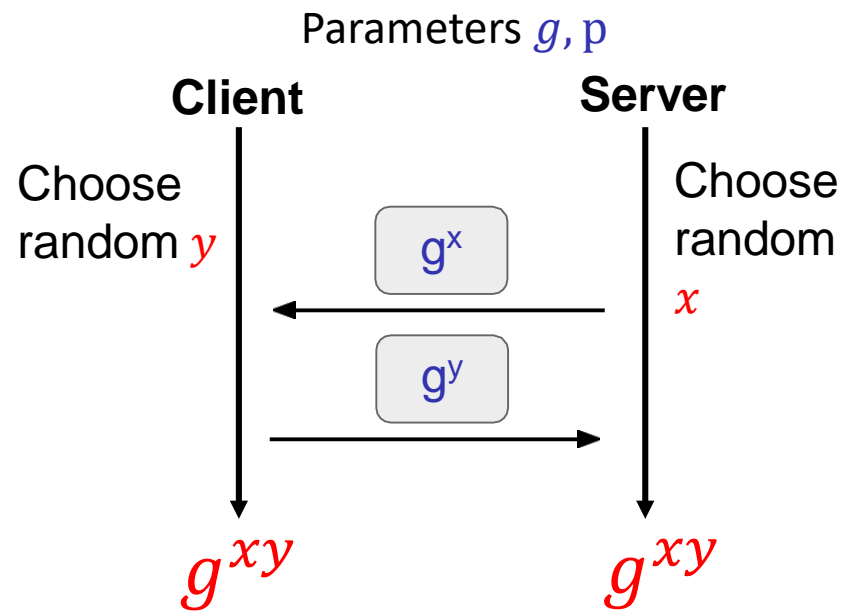


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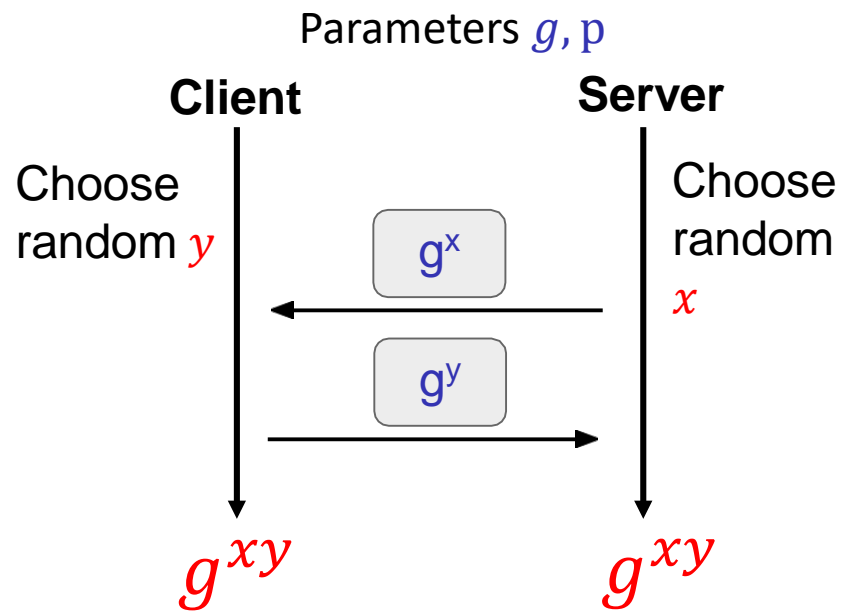


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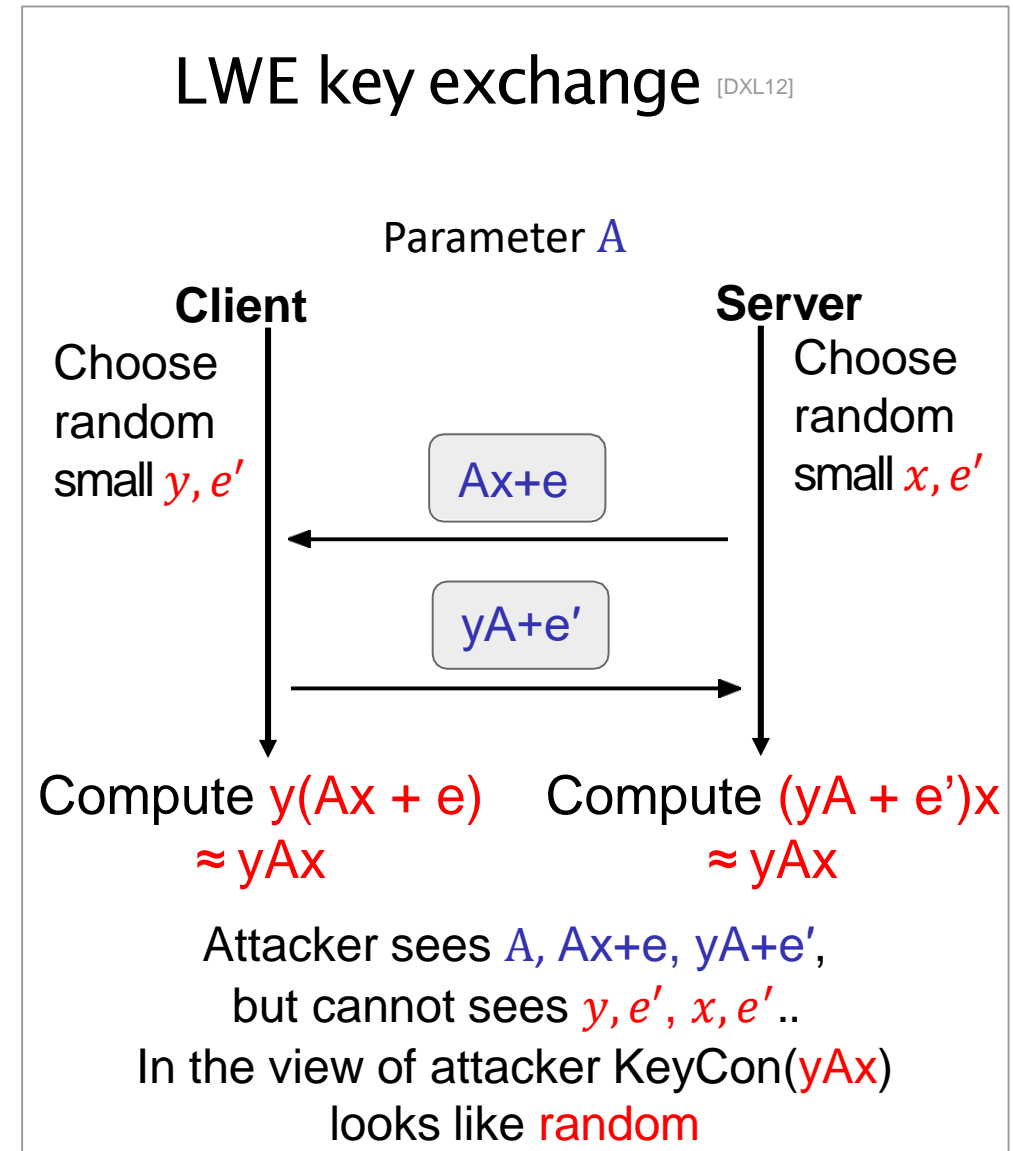
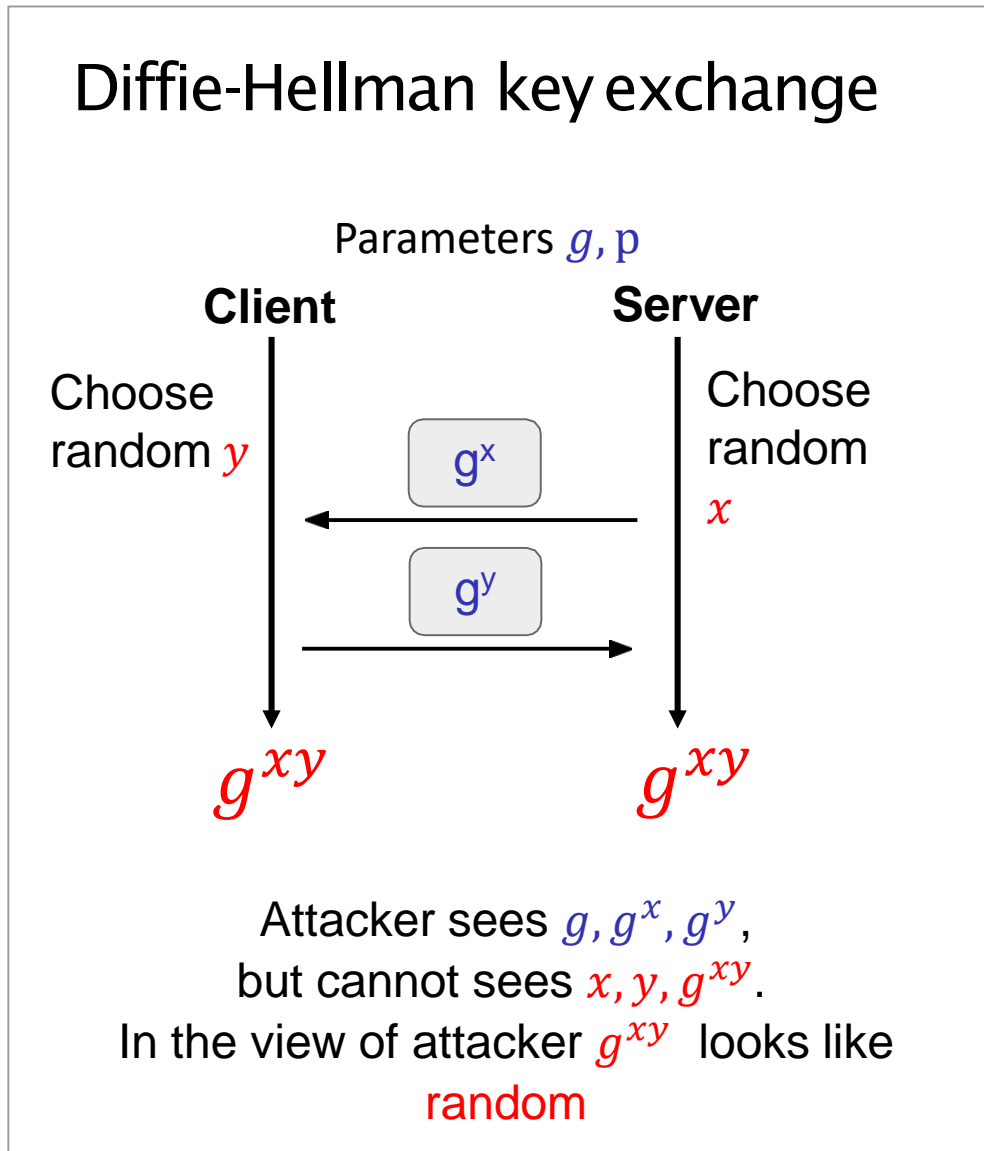
Attacker sees g, g^x, g^y , but cannot see x, y, g^{xy} .

In the view of attacker g^{xy} looks like **random**

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DH Key Exchange Translates to LWE



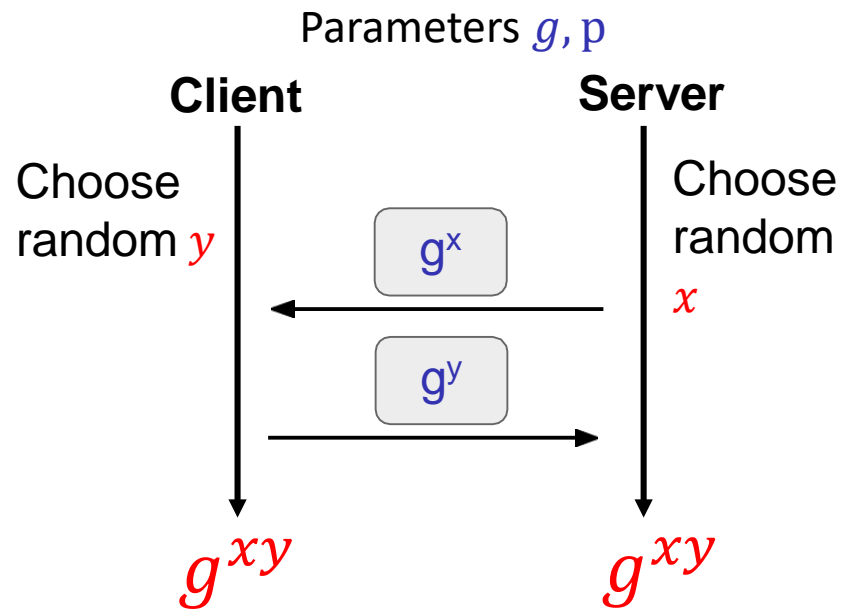
[Pei14] C. Peikert. Lattice cryptography for the Internet. In Post-Quantum Cryptography. Springer, 2014

[DXL12] Ding, J., Xie, X., Lin, X. A Simple Provably Secure Key Exchange Scheme Based on the Learning with Errors

Problem. <https://eprint.iacr.org/2012/688>

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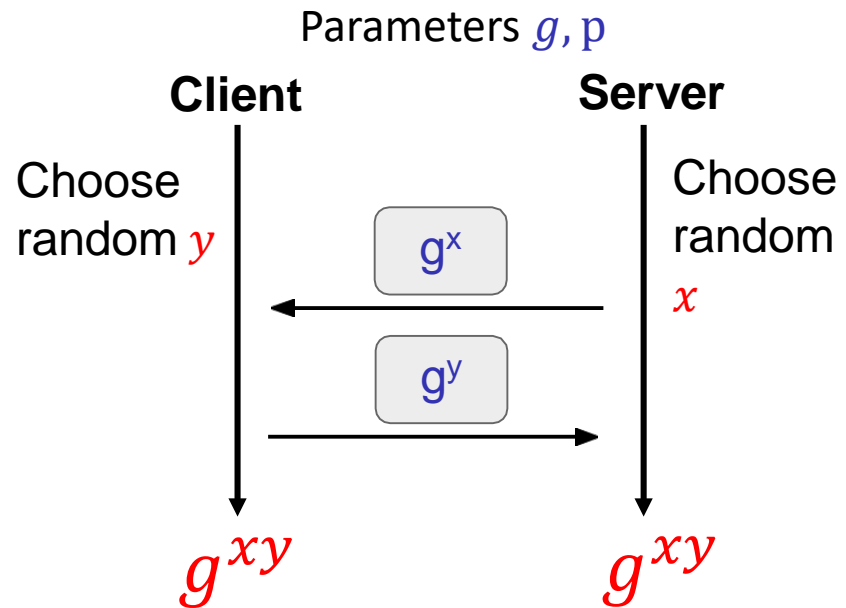
LWE key exchange [DXL12]

Parameter A

Client **Server**

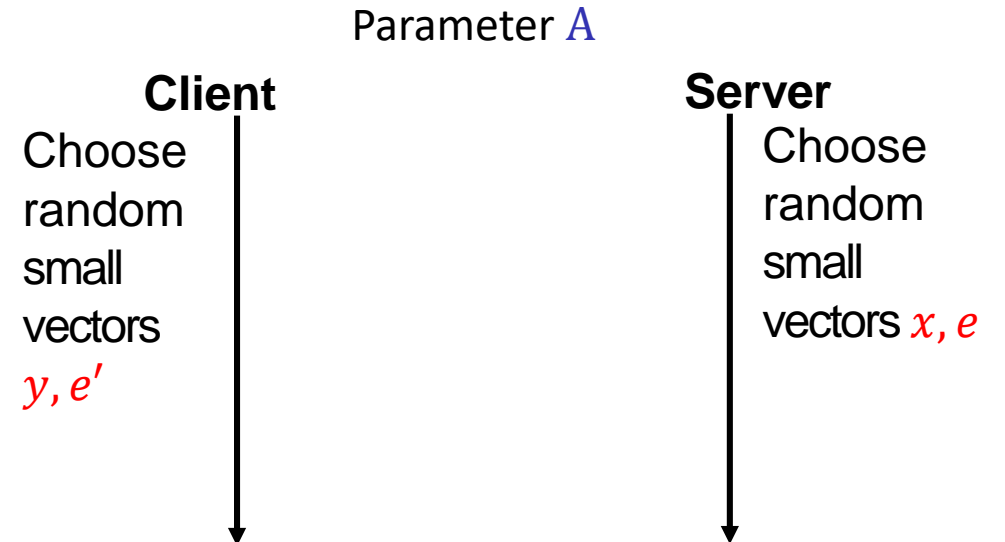
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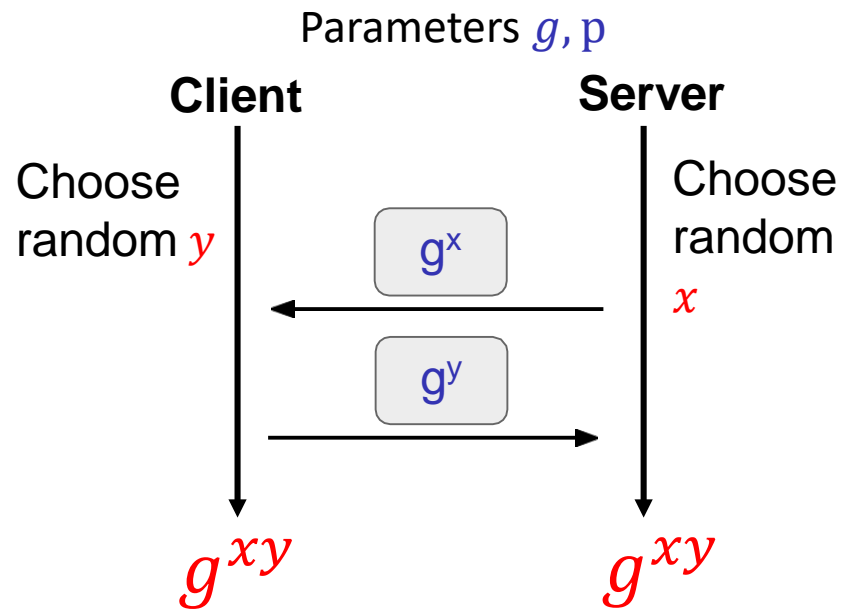
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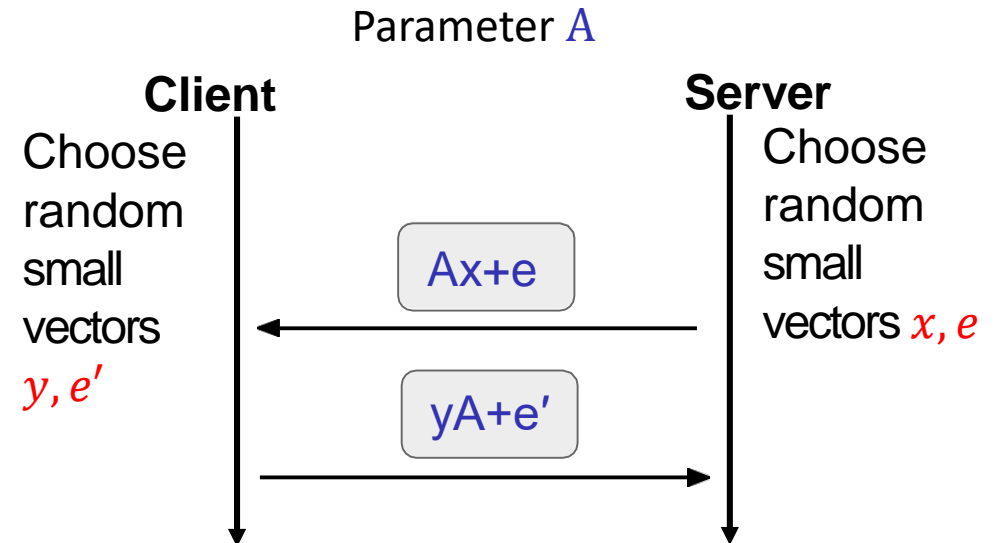
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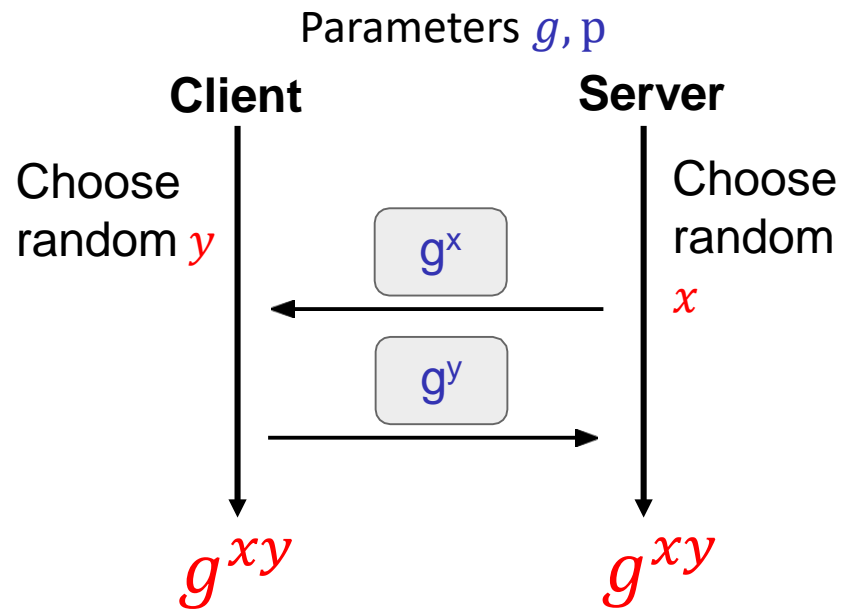
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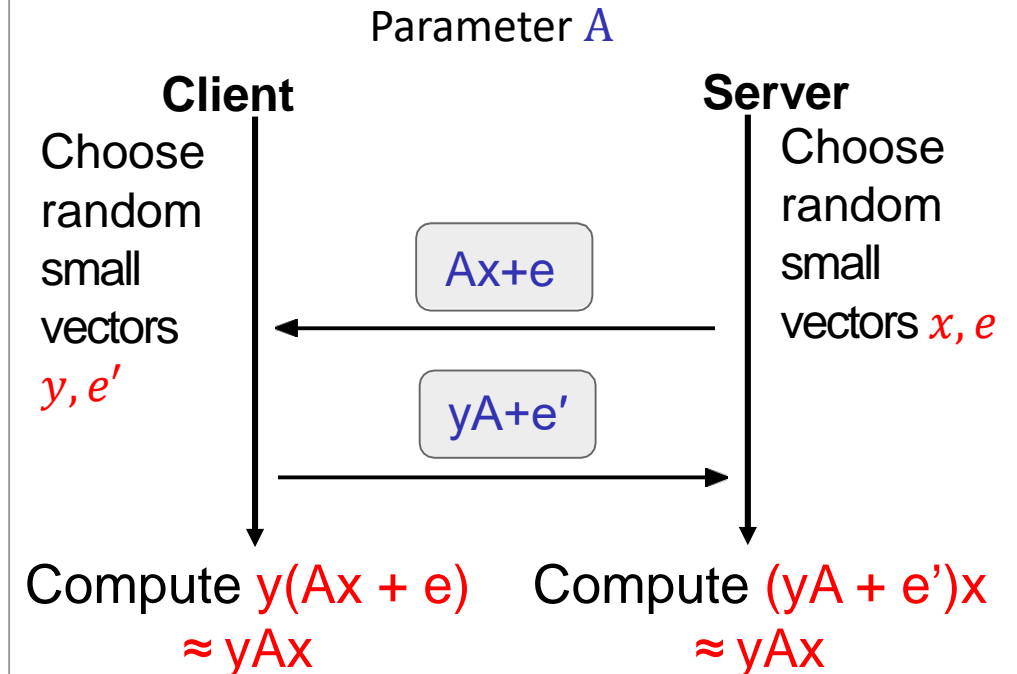
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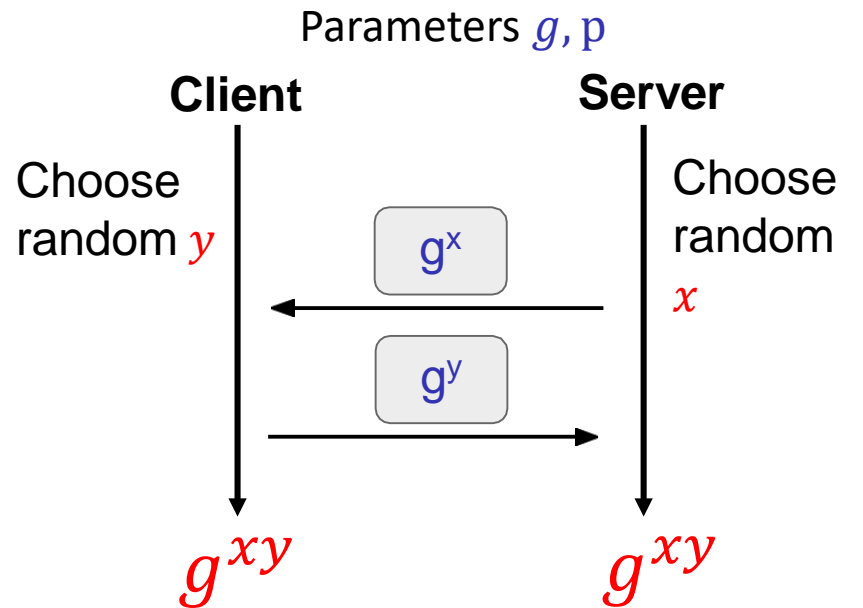
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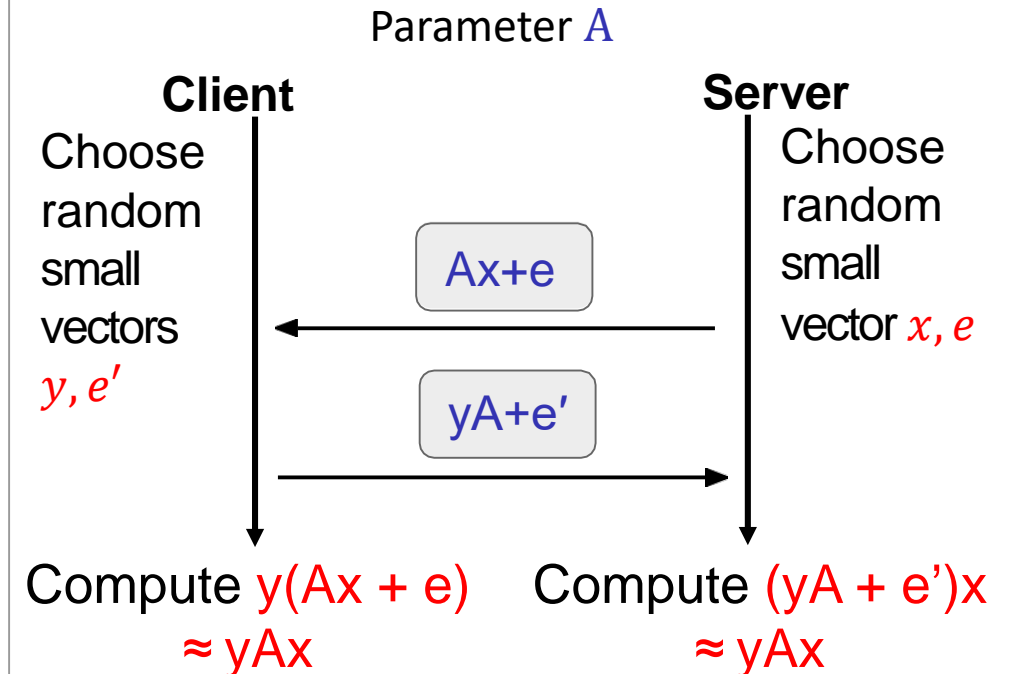
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LWE key exchange [DXL12]



Attacker sees $A, Ax+e, yA+e'$,
but cannot see y, e', x, e' ..
In the view of attacker $\text{KeyCon}(yAx)$
looks like **random**

Key Exchange Implementation

- NewHope [ADPS'15]: Ring-LWE key exchange *a la* [LPR'10,P'14],
 - with many optimizations and conjectured ≥ 200 -bit quantum security.
 - Comparable to or even faster than state-of-the-art ECDH w/ 128-bit (non-quantum) security.
 - Google has experimentally deployed NewHope+ECDH in Chrome canary and its own web servers.
- Frodo [BCDMNRS'16]: Plain-LWE key exchange,
 - with many tricks and optimizations. Conjectured ≥ 128 -bit quantum security.
 - About 10x slower than NewHope, but only ≈ 2 x slower than ECDH

Next Mission – Now you are a cryptanalyst

- Our goal:

Given a pair (A, \vec{b}) , want to know whether it is generated as

$$A, \vec{b} = A\vec{s} + \vec{e} \text{ mod } p \quad \text{OR} \quad A, \vec{b} = \textit{random}$$

- Dual Attack:

- If we can find a short vector \vec{w} such that $\vec{w} A \text{ mod } p = 0$,
- Then compute inner product $\langle \vec{w}, \vec{b} \rangle$

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$$\vec{w} \cdot \vec{b}$$

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$$\begin{aligned} & \vec{w} \cdot \vec{b} \\ = & \vec{w}(A\vec{s} + \vec{e}) \end{aligned}$$

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- If we can find a short vector \vec{w} such that $w A \text{ mod } p = 0$,
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- Wait...That sounds very easy to attack, why LWE is hard?

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- For more...check

Short Integer Solution Problem!

Thank You

Questions?

