

On the Learning Parity with Noise Problem

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Scenario

Cryptography schemes

- address the security of communication across an insecure medium
- are usually based only on complexity assumptions (standard model)

Near Future:

- **Problem:** What if someone constructs large quantum computers?
- Cryptography world may fall apart:
 - 1 cryptographic assumptions broken by efficient quantum algorithms
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Post-Quantum cryptography

Schemes that are believed to resist classical & quantum computers

- **Hash-based cryptography**
- **Code-based cryptography**
- **Lattice-based cryptography**

Our contribution

We investigate about the Learning Parity with Noise (LPN) problem

We propose a Threshold Public-Key Encryption scheme based on LPN

We propose a Signature scheme based on LPN

Post-Quantum cryptography

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Learning Parity with Noise Problem LPN

- Dimension ℓ (security parameter), $q \gg \ell$, $\tau \in (0, \frac{1}{2}]$
- **Search:** find $\mathbf{s} \in \mathbb{Z}_2^\ell$ given “noisy random inner products”

Errors $e_i \leftarrow \text{Ber}_\tau$, i.e. $\Pr(e_i = 1) = \tau$

- **Decision:** distinguish $(\mathbf{a}_i, \mathbf{b}_i)$ from uniform $(\mathbf{a}_i, \mathbf{b}_i)$
- *decisional* and *search* LPN are “*polynomially equivalent*”

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$$\mathbf{A} = \begin{pmatrix} \mathbf{a}_1 \\ \vdots \\ \mathbf{a}_q \end{pmatrix}, \mathbf{b} = \mathbf{A} \cdot \mathbf{s} \oplus \mathbf{e}$$

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Learning Parity with Noise Problem LPN

Hardness of LPN

Breaking the search LPN problem takes

- $2^{\Theta(\ell/\log \ell)}$ having the same number of samples q
- $2^{\Theta(\ell/\log \log \ell)}$ having $q = \text{poly}(\ell)$ samples
- $2^{\Theta(\ell)}$ having $q = \Theta(\ell)$ samples

where ℓ is the security parameter

Interesting features

- **Efficiency** \Rightarrow suitable for limited computing power devices (e.g. RFID).
- **quantum algorithm resistance**

Threshold Public-Key Encryption schemes

Public-key cryptography

- the ability of decrypting or signing is restricted to the owner of the secret key.
- \Rightarrow only one person has all the power

Threshold Public-Key Encryption schemes

Solution: Threshold PKE

- Shares trust among a group of users, such that *enough* of them, the *threshold*, is needed to sign or decrypt
- The secret key is split into shares and each share is given to a group of users.

Our contribution

A **Threshold Public-Key Encryption** scheme which is:

- based on LPN
- secure in the *Semi-honest* model

Alekhnovich PKE scheme

Key Generation

The receiver \mathbf{R} chooses

- a secret key $\mathbf{s} \xleftarrow{R} \mathbb{Z}_2^\ell$
- $\mathbf{A} \xleftarrow{R} \mathbb{Z}_2^{q \times \ell}$ and the error $\mathbf{e} \leftarrow \text{Ber}_\tau^q$, where $\tau \in \Theta(\frac{1}{\sqrt{\ell}})$ and computes the pk as $(\mathbf{A}, \mathbf{b} = \mathbf{A}\mathbf{s} \oplus \mathbf{e})$

Encryption of a message bit $m \in \mathbb{Z}_2$

Sender $\underline{\mathbf{S}}$

Receiver $\underline{\mathbf{R}}$

choose a vector $\mathbf{f} \leftarrow \text{Ber}_\tau^q$

compute $\mathbf{u} = \mathbf{f} \cdot \mathbf{A}$

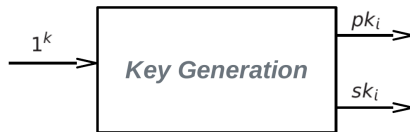
$$c = \langle \mathbf{f}, \mathbf{b} \rangle \oplus m \xrightarrow{(\mathbf{u}, c)}$$

Decryption

The receiver \mathbf{R} computes $d = c \oplus \langle \mathbf{s}, \mathbf{u} \rangle = \dots = \langle \mathbf{f}, \mathbf{e} \rangle \oplus m$

ThPKE: Protocol phases

- **Key Generation**
- Key Assembly
- Encryption
- Partial Decryption
- Finish Decryption



Key Generation

- All the receivers share a matrix $\mathbf{A} \xleftarrow{R} \mathbb{Z}_2^{q \times \ell}$
- Each receiver R_i **independently** choose a secret key $\mathbf{s}_i \xleftarrow{R} \mathbb{Z}_2^\ell$ and an error $\mathbf{e}_i \leftarrow \text{Ber}_\tau^q$
- the public key for R_i is the pair $(\mathbf{A}, \mathbf{b}_i = \mathbf{A}\mathbf{s}_i \oplus \mathbf{e}_i)$

ThPKE: Protocol phases

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Key Assembly

The combined public key is the pair (A, b) , where

$$b = \bigoplus_{i \in I} b_i$$

and I is the users subset

ThPKE: Protocol phases

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Sender S



Receivers R_i, R_j

$$(C_1, c_2) \leftarrow \text{ThLPN.Enc}(m, b)$$

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Receivers R_i, R_j

$$(C_1, c_2) \leftarrow \text{ThLPN.Enc}(m, b)$$

Encryption function (Alekhnovich scheme)

$$C_1 = F \cdot A, \quad c_2 = F \cdot b \oplus \underbrace{\begin{bmatrix} 1 \\ \dots \\ 1 \end{bmatrix}}_q \cdot m \quad \text{where } F := \begin{bmatrix} f_1 \\ \dots \\ f_q \end{bmatrix}, \quad f_i \leftarrow \text{Ber}_\tau^q$$

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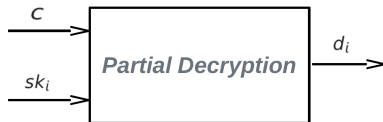
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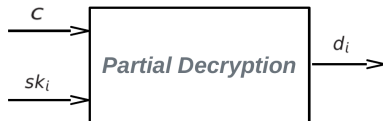
Receiver $\underline{R_i}$

$$d_i \leftarrow \text{ThLPN.Pdec}(C_1, c_2, s_i)$$

Receiver $\underline{R_j}$

ThPKE: Protocol phases

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Receiver $\underline{R_i}$ Receiver $\underline{R_j}$

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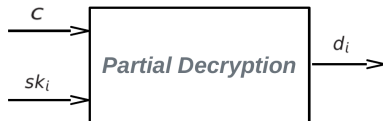
Partial decryption function (Alekhnovich scheme)

$$d_i = C_1 \cdot s_i \oplus \nu_i$$

where $\nu_i \leftarrow \text{Ber}_\sigma^q$

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Receiver $\underline{R_i}$ Receiver $\underline{R_j}$

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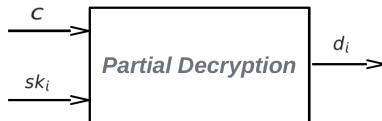
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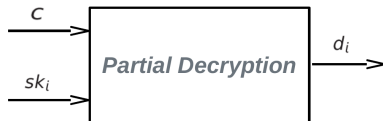
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ThPKE: Protocol phases

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Receiver $\underline{R_i}$ Receiver $\underline{R_j}$

$$d_i \leftarrow \text{ThLPN.Pdec}(C_1, c_2, s_i) \xrightarrow{d_i} \xleftarrow{d_j} d_j \leftarrow \text{ThLPN.Pdec}(C_1, c_2, s_j)$$

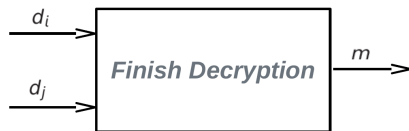
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ThPKE: Protocol phases

- Key Generation
- Key Assembly
- Encryption
- Partial Decryption
- **Finish Decryption**



Finish decryption

- Each receiver independently computes the vector

$$d = c_2 \bigoplus_{i \in I} (d_i) = \mathbf{F} \cdot \mathbf{e} \oplus \underbrace{\begin{bmatrix} 1 \\ \dots \\ 1 \end{bmatrix}}_q \cdot m \bigoplus_{i \in I} (\nu_i).$$

- the bit in the vector \mathbf{d} that is in majority is separately chosen by each receiver as the plaintext m

Protocol Security Analysis

Semi-honest model

A semi-honest party:

- 1 Follows the protocol properly
- 2 Keeps a record of all its intermediate computations

Security

- **Encryption:** from the Alekhnovich's scheme security
- **Decryption:** from the LPN hardness assumption, as each \mathbf{R}_i is generating LPN samples

$$d_i = C_1 \cdot s_i \oplus \nu_i$$

Protocol Security Analysis

Relaxed Semi-honest model

- Semi-honest model not so realistic (*replay attacks* may occur)
- **Problem:** if the same message is encrypted multiple times then it is possible to recover information about the secret key from the ciphertexts

Proposed solutions

- 1 implement the receivers as **stateful** machines (not good in resource-constrained devices)
- 2 make use of **pseudorandom functions** (i.e. deterministic algorithms that simulate truly random functions, given a “seed”)

Commitment Protocols

Commitment protocol

- can be thought as the digital analogue of a sealed envelope
- **Commit:** the sender **S** commit to a message m and the receiver **R** does not learn any information about m (**hiding** property)
- **Open:** **S** can choose to open the commitment and reveal the content m , but no other value (**binding** property)

Our contribution

We presented a **Commitment protocol**

- based on the commitment protocol by *Jain et al*
- based on Exact-LPN problem (where $\mathbf{wt}(e) = \lfloor \tau \cdot \ell \rfloor$)
- not in a *common reference string (CRS)* model

The commitment protocol by *Jain et al*

Setup Phase

In order to commit a message $\mathbf{m} \in \mathbb{Z}_2^k$ where $k \in \Theta(\ell + v)$

We state $\mathbf{A} = [\mathbf{A}' \parallel \mathbf{A}''] \in \mathbb{Z}_2^{k \times (\ell + v)}$ as **the common reference string (CRS)**. Finally, we set $w = \lfloor \tau k \rfloor$.

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Commitment phase

Sender $\underline{\mathbf{S}}$

Receiver $\underline{\mathbf{R}}$

chooses $\mathbf{r} \xleftarrow{R} \mathbb{Z}_2^\ell$, $\mathbf{e} \in \mathbb{Z}_2^k$ s.t. $wt(\mathbf{e}) = w$

computes $\mathbf{c} = \mathbf{A}(\mathbf{r} \parallel \mathbf{m}) \oplus \mathbf{e}$

The commitment protocol by *Jain et al*

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Opening phase

define $\mathbf{d} = (\mathbf{m}', \mathbf{r}') \xrightarrow{\mathbf{d}}$

The commitment protocol by *Jain et al*

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Commitment phase

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computes $\mathbf{c} = \mathbf{A}(\mathbf{r} \parallel \mathbf{m}) \oplus \mathbf{e} \xrightarrow{\mathbf{c}}$

Opening phase

define $\mathbf{d} = (\mathbf{m}', \mathbf{r}') \xrightarrow{\mathbf{d}}$

computes $\mathbf{e}' = \mathbf{c} \oplus \mathbf{A}(\mathbf{r}' \parallel \mathbf{m}')$

$\xleftarrow{\text{Yes, No}}$ accepts iff $\text{wt}(\mathbf{e}') = w$

Proposed commitment protocol

Problem

We need a trusted third party for the common matrix $\mathbf{A} = [\mathbf{A}' \parallel \mathbf{A}'']$

Solution:

The Commitment and Opening phases are the same as in the original scheme

Proposed commitment protocol

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We need a trusted third party for the common matrix $\mathbf{A} = [\mathbf{A}' \parallel \mathbf{A}'']$

Solution:

Setup phase

Sender $\underline{\mathbf{S}}$

Receiver $\underline{\mathbf{R}}$

chooses $\mathbf{A}' \xleftarrow{R} \mathbb{Z}_2^{k \times \ell} \xrightarrow{\mathbf{A}'}$

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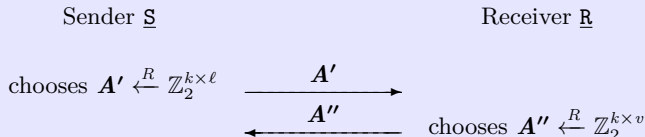
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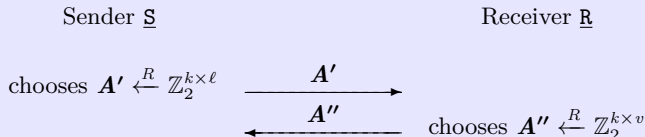
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The commitment protocol: a LPN-based variant

LPN variant

- security directly based on the standard LPN problem
- **Commit phase:** we set $w' = 2 \cdot \lfloor \tau k \rfloor$ and we choose e such that $wt(e) \leq w'$

Choice of parameters

According to

 **Levieil, Éric and Fouque, Pierre-Alain**

An Improved LPN Algorithm

Springer Berlin Heidelberg, 2006

we choose $\ell = 768$ and noise rate $\tau = \frac{1}{8} \Rightarrow 2^{90}$ bytes of memory to solve LPN

Theorem

Our commitment scheme is statistically binding and computationally hiding

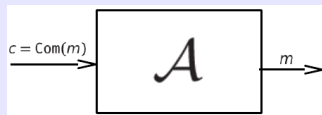
Proof

Statistically binding

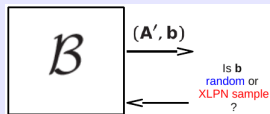
even if \mathcal{S} is computationally unbounded she cannot cheat with probability greater than 2^{-k}

Computationally hiding

- proof for reduction (single bit message)
- we assume that \mathcal{A} is able to break the commitment scheme

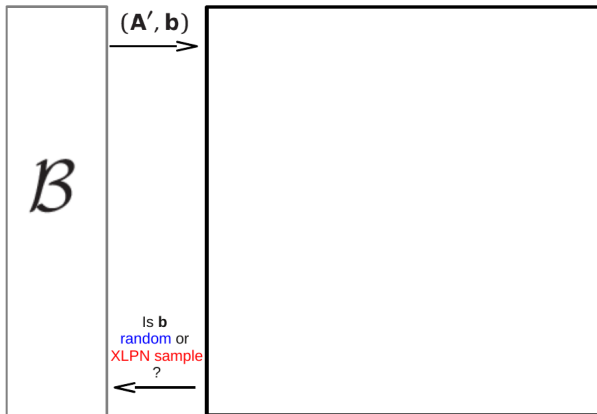


- Let \mathcal{B} an oracle

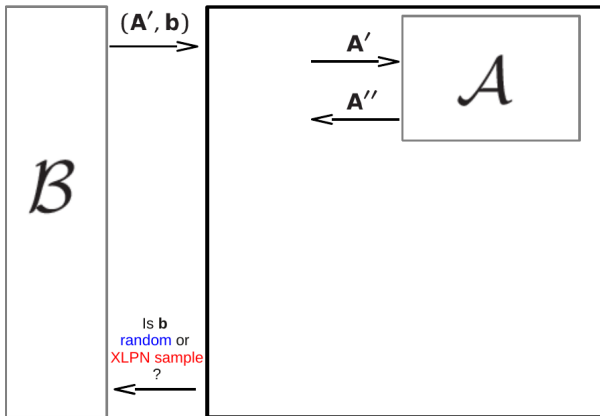


$$\text{where } b = \begin{cases} \text{random} & w.p. 1/2 \\ \mathcal{A}'s \oplus e & w.p. 1/2 \end{cases}$$

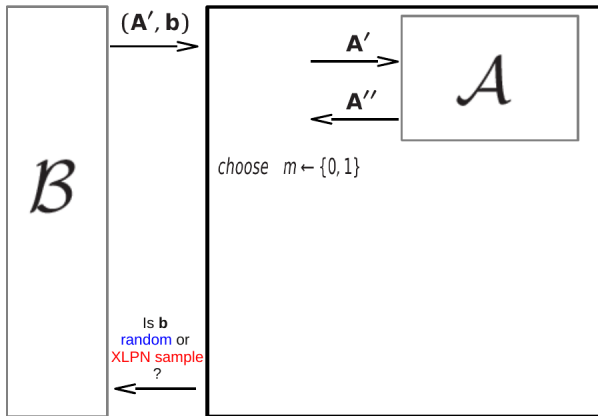
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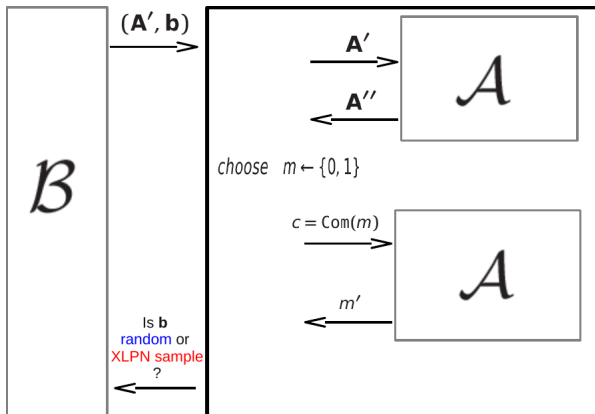
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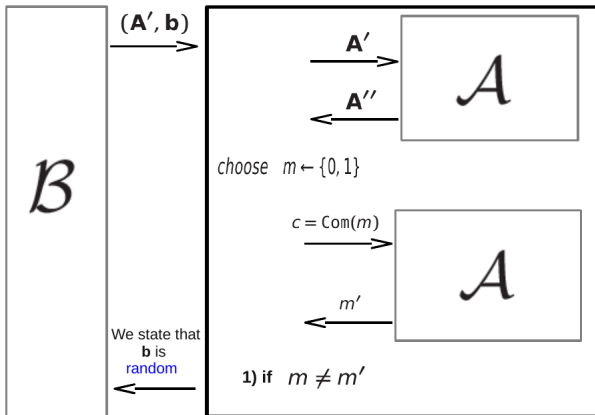
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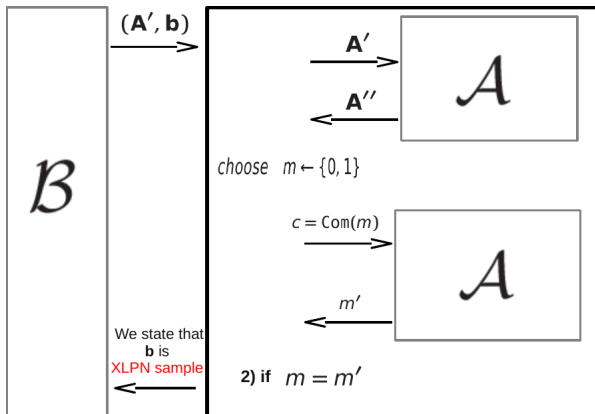
Proof



case 1)

\mathbf{b} is random $\Rightarrow c = \mathbf{b} \oplus \mathbf{A}''m$ is a **onetime-pad** encryption
 $\Rightarrow \mathcal{A}$ guesses w.p. $\frac{1}{2}$

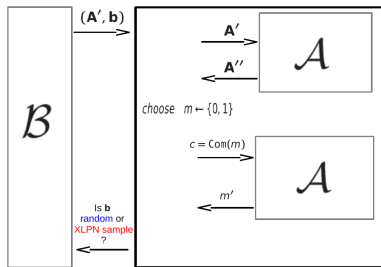
Proof



case 2)

b is a Exact-LPN sample $\Rightarrow c$ is a well formed commitment
 $\Rightarrow \mathcal{A}$ guesses w.p. 1 (by hypothesis)

Proof



case 1) and 2)

Let E = the reduction breaks the Exact-LPN problem,

$$\begin{aligned} \Pr(E) &= \Pr(E \mid \mathbf{b} = \mathbf{A}'\mathbf{s} \oplus \mathbf{e}) \cdot \Pr(\mathbf{b} = \mathbf{A}'\mathbf{s} \oplus \mathbf{e}) + \Pr(E \mid \mathbf{b} \text{ is random}) \cdot \Pr(\mathbf{b} \text{ is random}) \\ &= 1 \cdot \frac{1}{2} + \frac{1}{2} \cdot \frac{1}{2} = \frac{3}{4} \gg 2^{-k} \end{aligned}$$

Exact-LPN hardness \Rightarrow Hiding commitment

Conclusions and Open Problems

Our contribution

- study the security of our Threshold Public-Key Encryption scheme in the *malicious model*
- find statistically hiding commitments
- find efficient statistically binding commitments

LPN open problems

- relation between standard LPN and some variants
- Does LPN with noise rate τ imply anything about LPN with $\tau' < \tau$? Is there a threshold?
- how to get some basic primitives from standard LPN?