#### Inner Product Functional Encryption

Edouard Dufour Sans

January 25, 2018

# Table of Contents

#### Introduction

Functional Encryption Security definitions Notations

#### The Power of Inner Products

Descriptive statistics Machine Learning Practical security

#### The first practical scheme: ABDP

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

Presentation

Correctness

#### A fully secure scheme: ALS

Presentation

Correctness

Security

Traditional PKE: all or nothing.



Traditional PKE: all or nothing.

 Have the key? Get the plaintext.

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへぐ

Traditional PKE: all or nothing.

- Have the key? Get the plaintext.
- Don't have the key? Get nothing.

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへぐ

Traditional PKE: all or nothing.

- Have the key? Get the plaintext.
- Don't have the key? Get nothing.

Functional Encryption: **A new** paradigm.

Traditional PKE: all or nothing.

- Have the key? Get the plaintext.
- Don't have the key? Get nothing.

Functional Encryption: **A new paradigm**. Get a *function* of the cleartext.

Traditional PKE: all or nothing.

- Have the key? Get the plaintext.
- Don't have the key? Get nothing.

Functional Encryption: **A new paradigm**. Get a *function* of the cleartext. **Function depends on the key**.

Four algorithms:



◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへぐ

Four algorithms:

- Setup
- Encrypt
- KeyGen
- Decrypt

Four algorithms:

• Setup( $\lambda$ ): Returns (ek, msk).

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

- Encrypt
- KeyGen
- Decrypt

Four algorithms:

• Setup( $\lambda$ ): Returns (ek, msk).

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

- Encrypt(*ek*,*x*): Returns *c*.
- KeyGen
- Decrypt

Four algorithms:

- Setup( $\lambda$ ): Returns (ek, msk).
- Encrypt(ek,x): Returns c.
- KeyGen(*msk*, *f*): Returns *sk<sub>f</sub>*.

Decrypt

Four algorithms:

- Setup( $\lambda$ ): Returns (ek, msk).
- Encrypt(ek,x): Returns c.
- KeyGen(*msk*, *f*): Returns *sk<sub>f</sub>*.
- Decrypt( $sk_f, c$ ): Returns f(x).

Four algorithms:

- Setup( $\lambda$ ): Returns (ek, msk).
- Encrypt(ek,x): Returns c.
- KeyGen(*msk*, *f*): Returns *sk<sub>f</sub>*.
- Decrypt( $sk_f, c$ ): Returns f(x).

Function hiding.

Four algorithms:

- Setup( $\lambda$ ): Returns (ek, msk).
- Encrypt(ek,x): Returns c.
- KeyGen(*msk*, *f*): Returns *sk<sub>f</sub>*.
- Decrypt( $sk_f, c$ ): Returns f(x).

Function hiding (or not).

Four algorithms:

- Setup( $\lambda$ ): Returns (ek, msk).
- Encrypt(ek,x): Returns c.
- KeyGen(*msk*, *f*): Returns *sk<sub>f</sub>*.
- Decrypt( $sk_f, c$ ): Returns f(x).

Function hiding (or *not*).  $f \in \mathcal{F}$ : the *functionality*.

Can we simply re-use the definitions of standard SE or PKE?

◆□ ▶ < 圖 ▶ < 圖 ▶ < 圖 ▶ < 圖 • 의 Q @</p>

Can we simply re-use the definitions of standard SE or PKE?  $\mathbf{No}.$ 

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへぐ

Can we simply re-use the definitions of standard SE or PKE? No. Ear any non trivial  $f \rightarrow distinguish by submitting vs. vs. with$ 

For any non-trivial  $f \implies$  distinguish by submitting  $x_0, x_1$  with  $f(x_0) \neq f(x_1)$ .

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 の�?

Can we simply re-use the definitions of standard SE or PKE? No.

For any non-trivial  $f \implies$  distinguish by submitting  $x_0, x_1$  with  $f(x_0) \neq f(x_1)$ . Would not be a useful definition.

Indistinguishibility-Based Game



Indistinguishibility-Based Game

Polynomial number of queries to the following oracles:

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへぐ

#### Indistinguishibility-Based Game

Polynomial number of queries to the following oracles:

Initialize: Run the setup and send the public key.

#### Indistinguishibility-Based Game

Polynomial number of queries to the following oracles:

- Initialize: Run the setup and send the public key.
- ► KeyDer: Run KeyGen and give the decryption key.

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

#### Indistinguishibility-Based Game

Polynomial number of queries to the following oracles:

- Initialize: Run the setup and send the public key.
- ► KeyDer: Run KeyGen and give the decryption key.
- LeftOrRight: Receive  $(x_0, x_1)$ , return Encrypt $(ek, x_b)$ .

#### Indistinguishibility-Based Game

Polynomial number of queries to the following oracles:

- Initialize: Run the setup and send the public key.
- ► KeyDer: Run KeyGen and give the decryption key.
- LeftOrRight: Receive  $(x_0, x_1)$ , return Encrypt $(ek, x_b)$ .
- Finalize: If key requests were legitimate, check validity of guess.

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

#### Indistinguishibility-Based Game

Polynomial number of queries to the following oracles:

- Initialize: Run the setup and send the public key.
- ► KeyDer: Run KeyGen and give the decryption key.
- LeftOrRight: Receive  $(x_0, x_1)$ , return Encrypt $(ek, x_b)$ .
- Finalize: If key requests were legitimate, check validity of guess.

One query to LeftOrRight is enough.

#### Indistinguishibility-Based Game

Polynomial number of queries to the following oracles:

- Initialize: Run the setup and send the public key.
- ► KeyDer: Run KeyGen and give the decryption key.
- LeftOrRight: Receive  $(x_0, x_1)$ , return Encrypt $(ek, x_b)$ .
- Finalize: If key requests were legitimate, check validity of guess.

One query to LeftOrRight is enough.

Requests were illegitimate if for some f queries to KeyDer,  $f(x_0) \neq f(x_1)$ .

#### Indistinguishibility-Based Game

Polynomial number of queries to the following oracles:

- Initialize: Run the setup and send the public key.
- ► KeyDer: Run KeyGen and give the decryption key.
- LeftOrRight: Receive  $(x_0, x_1)$ , return Encrypt $(ek, x_b)$ .
- Finalize: If key requests were legitimate, check validity of guess.

One query to LeftOrRight is enough.

Requests were illegitimate if for some f queries to KeyDer,  $f(x_0) \neq f(x_1)$ .

Selective game: Adversary must query LeftOrRight first.

Adaptive game: No such constraint.

#### Notations

- Brackets:  $[x] = g^x$ .
- Matrices and brackets:

$$\begin{bmatrix} \begin{pmatrix} x_{11} & \dots & x_{1n} \\ \vdots & \ddots & \vdots \\ x_{d1} & \dots & x_{dn} \end{pmatrix} = \begin{pmatrix} [x_{11}] & \dots & [x_{1n}] \\ \vdots & \ddots & \vdots \\ [x_{d1}] & \dots & [x_{dn}] \end{pmatrix}$$

- We encrypt vectors  $\mathbf{x}$ , and give keys for vectors  $\mathbf{y}$ . We conflate  $f_{\mathbf{y}} : \mathbf{x} \to \sum_{i=1}^{n} x_i y_i$  and  $\mathbf{y}$ .
- Scalar x, vector x and matrix X.

# Table of Contents

#### Introductior

Functional Encryption Security definitions Notations

#### The Power of Inner Products

Descriptive statistics Machine Learning Practical security

#### The first practical scheme: ABDP Presentation Correctness

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

#### A fully secure scheme: ALS

- Presentation Correctness
- Security

#### The Power of Inner Products

We will work towards constructing schemes for the inner product functionality.

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへぐ

#### The Power of Inner Products

We will work towards constructing schemes for the inner product functionality. Is this a useful primitive?

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

#### Descriptive statistics

Averages.

(4日) (個) (目) (目) (目) (の)

#### Descriptive statistics

- Averages.
- Weighted averages.

◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 のへぐ

## Descriptive statistics

- Averages.
- Weighted averages.
- Standard deviation.

## Descriptive statistics

- Averages.
- Weighted averages.
- Standard deviation (if we encrypt the squares).

Machine learning: linear regression

Predict t (e.g. income) from  $\boldsymbol{x}$  (e.g. housing data about the family).

▲□▶ ▲□▶ ▲□▶ ▲□▶ ▲□▶ ▲□▶ ▲□▶

# Machine learning: linear regression

Predict t (e.g. income) from  $\boldsymbol{x}$  (e.g. housing data about the family).

A somewhat naive model:

$$\begin{array}{ll} t \approx & \sum_{i=1}^n x_i y_i \\ \approx & \langle \mathbf{x}, \mathbf{y} \rangle \end{array}$$

# Machine learning: linear regression

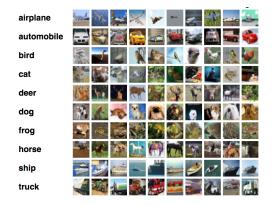
Predict t (e.g. income) from  $\mathbf{x}$  (e.g. housing data about the family).

A somewhat naive model:

$$\begin{array}{ll} t \approx & \sum_{i=1}^n x_i y_i \\ \approx & \langle \mathbf{x}, \mathbf{y} \rangle \end{array}$$

Works very well for some (basic) problems!

# Machine learning: linear classification



#### Figure: The CIFAR10 dataset. Source: https://www.cs.toronto.edu/~kriz/cifar.html

# Machine learning: linear classification

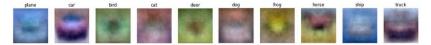


Figure: CIFAR10 linear classifiers as images. Source: http://cs231n.github.io/linear-classify/

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

### The key for y lets you compute $\langle \mathbf{x}, \mathbf{y} \rangle \implies$ one projection.



The key for y lets you compute  $\langle \mathbf{x}, \mathbf{y} \rangle \implies$  one projection. m independent keys  $\implies m$  projections.

The key for y lets you compute  $\langle \mathbf{x}, \mathbf{y} \rangle \implies$  one projection. m independent keys  $\implies m$  projections. Actual number of keys you can give?

## Leakage

The key for y lets you compute  $\langle \mathbf{x}, \mathbf{y} \rangle \implies$  one projection. m independent keys  $\implies m$  projections. Actual number of keys you can give depends on plaintext distribution.

# Table of Contents

#### Introduction

Functional Encryption Security definitions Notations

The Power of Inner Products

Descriptive statistics Machine Learning Practical security

### The first practical scheme: ABDP Presentation Correctness

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

### A fully secure scheme: ALS Presentation Correctness Security

ABDP15 Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

◆□ ▶ < 圖 ▶ < 圖 ▶ < 圖 ▶ < 圖 • 의 Q @</p>

### ABDP15

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- Setup
- Encrypt
- KeyGen
- Decrypt

### ABDP15

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

• Setup( $\lambda$ ): Pick  $\mathbf{s} \stackrel{\hspace{0.1em}\mathsf{\scriptscriptstyle\$}}{\leftarrow} \mathbb{Z}_{p}^{n}$ . Return  $[\mathbf{s}], \mathbf{s}$ .

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

- Encrypt
- KeyGen
- Decrypt

#### ABDP15

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- Setup( $\lambda$ ): Pick  $\mathbf{s} \stackrel{\hspace{0.1em}\mathsf{\scriptscriptstyle\$}}{\leftarrow} \mathbb{Z}_p^n$ . Return  $[\mathbf{s}], \mathbf{s}$ .
- ► Encrypt([**s**], **x**): Pick  $r \stackrel{\$}{\leftarrow} Z_{\rho}$ . Return [r], [**x**] · [**s**]<sup>r</sup> = [r], [**x** + r**s**].

- KeyGen
- Decrypt

### ABDP15

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- Setup( $\lambda$ ): Pick  $\mathbf{s} \stackrel{\hspace{0.1em}\mathsf{\scriptscriptstyle\$}}{\leftarrow} \mathbb{Z}_p^n$ . Return  $[\mathbf{s}], \mathbf{s}$ .
- Encrypt([**s**], **x**): Pick  $r \stackrel{s}{\leftarrow} Z_p$ . Return  $[r], [\mathbf{x} + r\mathbf{s}]$ .

- KeyGen(s, y): Return  $\langle s, y \rangle$ .
- Decrypt

### ABDP15

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- Setup( $\lambda$ ): Pick  $\mathbf{s} \stackrel{\hspace{0.1em}\mathsf{\scriptscriptstyle\$}}{\leftarrow} \mathbb{Z}_p^n$ . Return  $[\mathbf{s}], \mathbf{s}$ .
- Encrypt([**s**], **x**): Pick  $r \stackrel{s}{\leftarrow} Z_p$ . Return  $[r], [\mathbf{x} + r\mathbf{s}]$ .
- KeyGen(s, y): Return  $\langle s, y \rangle$ .
- Decrypt((s, y), ([r], [x + rs])): Compute

$$[\gamma] = [\mathbf{x} + r\mathbf{s}]^{\mathsf{T}} \cdot \mathbf{y} / [r]^{\langle \mathbf{s}, \mathbf{y} \rangle}$$

and solve the discrete logarithm to return  $\gamma$ .

## Correctness

► Decrypt( $\langle \mathbf{s}, \mathbf{y} \rangle$ , ([r], [ $\mathbf{x} + r\mathbf{s}$ ])): Compute [ $\gamma$ ] = [ $\mathbf{x} + r\mathbf{s}$ ]<sup>T</sup> ·  $\mathbf{y}/[r]^{\langle \mathbf{s}, \mathbf{y} \rangle}$ 

and solve the discrete logarithm to return  $\gamma.$ 

Proof.

On the black board, or check the paper.

# Table of Contents

#### Introduction

Functional Encryption Security definitions Notations

### The Power of Inner Products

Descriptive statistics Machine Learning Practical security

### The first practical scheme: ABDP

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

Presentation Correctness

### A fully secure scheme: ALS

Presentation Correctness Security

ALS16 Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_{p}^{n}$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

### ALS16

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- Setup
- Encrypt
- KeyGen
- Decrypt

### ALS16

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

► Setup( $\lambda$ ): Pick  $\mathbf{a} \stackrel{\$}{\leftarrow} \mathbb{Z}_p^2$ ,  $\mathbf{S} \stackrel{\$}{\leftarrow} \mathbb{Z}_p^{n \times 2}$ . Return ([a], [Sa]), (a, S).

- Encrypt
- KeyGen
- Decrypt

### ALS16

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- ► Setup( $\lambda$ ): Pick  $\mathbf{a} \stackrel{\$}{\leftarrow} \mathbb{Z}_p^2$ ,  $\mathbf{S} \stackrel{\$}{\leftarrow} \mathbb{Z}_p^{n \times 2}$ . Return ([a], [Sa]), (a, S).
- Encrypt(([a], [Sa]), x): Pick  $r \stackrel{\hspace{0.1em}{\leftarrow}}{\leftarrow} Z_p$ . Return [ar], [x + Sar].

- KeyGen
- Decrypt

### ALS16

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- ► Setup( $\lambda$ ): Pick  $\mathbf{a} \stackrel{s}{\leftarrow} \mathbb{Z}^2_p$ ,  $\mathbf{S} \stackrel{s}{\leftarrow} \mathbb{Z}^{n \times 2}_p$ . Return ([a], [Sa]), (a, S).
- ► Encrypt(([a], [Sa]), x): Pick  $r \stackrel{\$}{\leftarrow} Z_p$ . Return [ar], [x + Sar].

- KeyGen(S, y): Return S<sup>T</sup>y.
- Decrypt

#### ALS16

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- ► Setup( $\lambda$ ): Pick  $\mathbf{a} \stackrel{\$}{\leftarrow} \mathbb{Z}^2_p$ ,  $\mathbf{S} \stackrel{\$}{\leftarrow} \mathbb{Z}^{n \times 2}_p$ . Return ([a], [Sa]), (a, S).
- ► Encrypt(([a], [Sa]), x): Pick  $r \stackrel{\$}{\leftarrow} Z_p$ . Return [ar], [x + Sar].
- KeyGen(S, y): Return S<sup>T</sup>y.
- Decrypt(S<sup>T</sup>y, ([ar], [x + Sar])): Compute

$$[\boldsymbol{\gamma}] = [\mathbf{x} + \mathbf{S}\mathbf{a}r]^{\mathsf{T}} \cdot \mathbf{y} - [\mathbf{a}r]^{\mathsf{T}} \cdot \mathbf{S}^{\mathsf{T}}\mathbf{y}$$

and solve the discrete logarithm to return  $\gamma$ .

## Correctness

Compute

$$[\gamma] = [(\mathbf{x} + \mathbf{S}\mathbf{a}r)^{\mathsf{T}}\mathbf{y} - (\mathbf{a}r)^{\mathsf{T}}\mathbf{S}^{\mathsf{T}}\mathbf{y}]$$

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

and solve the discrete logarithm to return  $\gamma.$ 

#### Proof.

On the black board (or check the paper).

# Security

### ALS16

Fixed *n*.  $\mathcal{F} \approx \mathbb{Z}_p^n$ ,  $f_{\mathbf{y}} \approx \mathbf{y}$ .

- ► Setup( $\lambda$ ): Pick  $\mathbf{a} \stackrel{\$}{\leftarrow} \mathbb{Z}_p^2$ ,  $\mathbf{S} \stackrel{\$}{\leftarrow} \mathbb{Z}_p^{n \times 2}$ . Return ([a], [Sa]), (a, S).
- ► Encrypt(([a], [Sa]), x): Pick  $r \stackrel{\$}{\leftarrow} Z_p$ . Return [ar], [x + Sar].
- KeyGen(S, y): Return S<sup>T</sup>y.
- Decrypt(S<sup>T</sup>y, ([ar], [x + Sar])): Compute

$$[\boldsymbol{\gamma}] = [(\mathbf{x} + \mathbf{S}\mathbf{a}r)^{\mathsf{T}}\mathbf{y} - (\mathbf{a}r)^{\mathsf{T}}\mathbf{S}^{\mathsf{T}}\mathbf{y}]$$

and solve the discrete logarithm to return  $\boldsymbol{\gamma}.$ 

Proof.

On the black board (or check Appendix A in AGR+17).

## References

- M. Abdalla, F. Bourse, A. De Caro, and D. Pointcheval. Simple functional encryption schemes for inner products. PKC 2015.
- M. Abdalla, R. Gay, M. Raykova, and H. Wee. Multi-input Inner-Product Functional Encryption from Pairings. EUROCRYPT 2017.
- S. Agrawal, B. Libert, and D. Stehlé. Fully secure functional encryption for inner products, from standard assumptions. CRYPTO 2016.
- 4. D. Boneh, A. Sahai, and B. Waters. Functional encryption: Definitions and challenges. TCC 2011.
- A. O'Neill. Definitional Issues in Functional Encryption. Cryptology ePrint Archive, Report 2010/556.