## Efficient MPC

Oblivious Transfer and
Oblivious Linear Evaluation
aka "How to Multiply"


Scalable Oblivious Data Analytics


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## Circuit Evaluation



## 3) Multiplication?

 How to compute [z]=[xy] ?Alice, Bob should compute
How do we compute this?

$$
\begin{aligned}
z_{1}+z_{2} & =\left(x_{1}+x_{2}\right)\left(y_{1}+y_{2}\right) \\
& =x_{1} y_{1}+x_{2} y_{1}+x_{1} y_{2}+x_{2} y_{2}
\end{aligned}
$$

Alice can compute this

> Bob can compute this

## On the use of computational assumptions

- How much can we ask users to trust crypto?

1. Necessary (one way functions are needed for symmetric crypto, public key crypto is probably needed for 2PC)
2. We must believe that some problems are hard (e.g., breaking RSA or breaking AES). But we should not ask for more trust than needed!
3. Construct complex systems based on well studied assumptions. Then prove (via reduction), that any adv that can break property $X$ of system $S$ can be used to solve computational problem P.
4. If we believe problem $P$ to be hard, then we conclude that system S has property X .

## The Crypto Toolbox

# OTP $\gg$ SKE $\gg$ PKE $\gg$ FHE $\gg$ Obfuscation 

More efficient


Less efficient

## Reduction Proof

- If: an adversary can break the security (e.g., learn the secret input $x$ )
- Then: use this adversary as a subroutine to break the security of some hard problem (e.g., RSA)
- But: the problem is hard
- So: the protocol must be secure



## Part 2: How to multiply

- Warmup: Useful OT Properties
- OT Extension
- Multiplication Protocols
- OT-based
- Pailler Encryption
- Noisy Encodings


## 1-2 OT

## Receiver

Sender


- Receiver does not learn $\mathrm{m}_{1-\mathrm{b}}$
- Sender does not learn b


## 1-2 OT

Receiver


Sender


- $m_{b}=(1-b) m_{0}+b m_{1}$
- $m_{b}=m_{0}+b\left(m_{1}-m_{0}\right)$


## k-n OT

Receiver


Sender


## 2PC via 1-n OT

Receiver


Sender


## Oblivious Transfer = bit multiplication

Receiver
Sender


## Short OT $\rightarrow$ Long OT



Random OT = OT
if $b=c$


## (R)OT is symmetric



No communication!

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## Efficiency

- Problem: OT requires public key primitives, inherently inefficient


## The Crypto Toolbox

# OTP $\gg$ SKE $\gg$ PKE $\gg$ FHE $\gg$ Obfuscation 

More efficient


Less efficient

## Efficiency

- Problem: OT requires public key primitives, inherently inefficient
- Solution: OT extension
- Like hybrid encryption!
- Start with few (expensive) OT based on PKE
- Get many (inexpensive) OT using only SKE


## OT Extension, Pictorially

## Starting point: k "seed" OTs



## Condition for OT extension


$\oplus$


Problem for active security!

## OT Extension, Pictorially



## OT Extension, Pictorially



## OT Extension, Turn your head!



## OT Extension, Pictorially



## OT Extension, Pictorially



## Break the correlation!



## Breaking the correlation

- Using a correlation robust hash function H s.t. 1. $\left\{a_{0}, \ldots, a_{n}, H\left(a_{0}+r\right), \ldots, H\left(a_{n}+r\right)\right\} / /\left(a_{i}^{\prime} ' s, r\right.$ random $)$

2. $\left\{a_{0}, \ldots, a_{n}, b_{0}, \ldots, b_{n}\right\} \quad / /\left(a_{i}\right.$ 's, $b_{i}$ 's s random)
are computationally indistinguishable

## OT Extension, Pictorially



## Recap

0. Strech $\mathbf{k}$ OTs from $k$ - to poly $(k)=n$-bitlong strings
1. Send correction for each pair of messages $x_{0}^{i}, x_{1}^{i}$ s.t. $\mathbf{x}_{0}^{i} \oplus \mathbf{x}_{1}{ }_{1}=\mathbf{c}$
2. Turn your head ( $S / R$ swap roles)
3. The bits of $\mathbf{c}$ are the new choice bits
4. Break the correlation: $y^{\mathbf{j}}{ }_{0}=\mathrm{H}\left(\mathbf{u}^{\mathrm{j}}\right), \mathrm{y}^{\mathrm{j}}{ }_{1}=\mathrm{H}\left(\mathbf{u}^{\mathrm{j}} \oplus \mathrm{b}\right)$

- Not secure against active adversaries


## Recent Results in OT Extension

 (see references at the end)- Active secure OT extension "essentially" as efficient as passive OT.
- Asharov et al.
- Keller et al.
- The columns of the matrix

- Can be seen as a simple replica encoding of a bit. Better encodings can be used for better efficiency, see e.g.,
- Kolesnikov et al.
- Cascudo et al.


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Oblivious

## Linear Evaluation

Receiver


Sender


## n UTs = OLE <br> (Gilboa)

Receiver
$b=\left(b_{0}, b_{1}, \ldots, b_{n-1}\right)$


Sender a ( n bit number) $c_{0}+\ldots+c_{n-1}=c$


$$
d_{0}+\ldots+d_{n-1}=a\left(b_{0}+2 b_{1}+\ldots+2^{n-1} b_{n-1}\right)+\left(c_{0}+\ldots+c_{n-1}\right)=a b+c
$$

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## Additive (or Linear)

## Homomorphic Encryption

- Pailler is a AHE whose security is related to the hardness of factoring
- Still an important tool in the protocol designer toolbox!

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## (Simplified) Pailler

- Public key:
$-N=p q$, with $|p|=|q|$
- Pailler works mod $\mathrm{N}^{2}$
- Secret key:
- $\Phi(\mathrm{N})=(\mathrm{p}-1)(\mathrm{q}-1)$

$$
\mathbb{Z}_{N^{\wedge} 2}^{*}=\mathbb{Z}_{N} \times \mathbb{Z}_{N}^{*}
$$

- Note that due to choice of parameters $\operatorname{gcd}(\Phi(\mathrm{N}), \mathrm{N})=1$


## (Simplified) Pailler

- $\left(c \in \mathbb{Z}_{N^{\wedge} 2}\right) \leftarrow \operatorname{Encrypt}\left(m \in \mathbb{Z}_{N} ; r \in \mathbb{Z}_{N}{ }_{N}\right)$
- Output $c=\alpha(m) \cdot \beta(r) \bmod N^{2}$
- Where:
$-\alpha(m)$ takes care of the homomorphism
$-\beta(r)$ takes care of security


## $\alpha(m)$ - For homomorphism

- $\alpha\left(m \in \mathbb{Z}_{N}\right)=(1+m N) \bmod N^{2}$
- For decryption:
$-\alpha(m)$ efficiently invertible
$-\alpha^{-1}\left(y \in \mathbb{Z}_{N 2}\right)=y-1 / N \quad / /$ Integer division
- For homomorphism:
$-\alpha\left(m_{1}\right) \cdot \alpha\left(m_{2}\right)=\alpha\left(m_{1}+m_{2} \bmod N\right)$
- Exercise: check this!


## $\beta(r)$ - For security

- $\beta\left(r \in \mathbb{Z}_{N}{ }^{*}\right)=r^{N} \bmod N^{2}$


## $\Phi\left(N^{2}\right)=N \cdot \Phi(N)$ and

- For decryption:

$$
-\beta(r)^{\Phi(N)}=1 \bmod N^{2}
$$

- Assumption for security

$$
-\left\{\beta(r) \mid r \leftarrow \mathbb{Z}_{N}^{*}\right\} \approx\left\{s \leftarrow \mathbb{Z}_{N \wedge 2}{ }^{*}\right\}
$$

- For homomorphism

$$
-\beta\left(r_{1}\right) \cdot \beta\left(r_{2}\right)=\beta\left(r_{1} \cdot r_{2}\right)
$$

## Putting Things Together

- Security:
- Enc $_{\text {pk }}(m ; r)=\alpha(m) \cdot \beta(r) \quad / / r$ unif. in $\mathbb{Z}_{N}{ }^{*}$
comp.ind. from $\quad \approx \alpha(\mathrm{m}) \cdot \mathrm{s}$
$/ / s$ unif. in $\mathbb{Z}_{\mathrm{N} 2}{ }^{*}$
distributed
三 t
// t unif. in $\mathbb{Z}_{\mathrm{N} 2}{ }^{*}$


## Putting Things Together

- Homomorphism:
$-\operatorname{Enc}_{\mathrm{pk}}\left(\mathrm{m}_{1} ; r_{1}\right) \cdot \operatorname{Enc}_{\mathrm{pk}}\left(\mathrm{m}_{2} ; r_{2}\right)$

$$
\begin{aligned}
& =\alpha\left(m_{1}\right) \cdot \beta\left(r_{1}\right) \cdot \alpha\left(m_{2}\right) \cdot \beta\left(r_{2}\right) \\
& =\alpha\left(m_{1}+m_{2} \bmod N\right) \cdot \beta\left(r_{1} \cdot r_{2}\right)
\end{aligned}
$$

$$
=\operatorname{Enc}_{\mathrm{pk}}\left(\mathrm{~m}_{1}+\mathrm{m}_{2} \bmod \mathrm{~N} ; \mathrm{r}_{1} \cdot \mathrm{r}_{2}\right)
$$

## Putting Things Together - Decryption

- Dec(sk,c):

1. $\mathrm{t}_{1}=\mathrm{c}^{\Phi(N)} \bmod N^{2}$
2. $\mathrm{t}_{2}=\alpha^{-1}\left(\mathrm{t}_{1}\right) \bmod N$
3. $t_{3}=t_{2} \cdot \Phi(N)^{-1} \bmod N$

$$
=m
$$

4. Output $\mathrm{m}=\mathrm{t}_{3}$

# How to Multiply with Pailler 

Receiver
Sender
$\mathrm{pk}, \mathrm{B}=\mathrm{Enc}_{\mathrm{pk}}(\mathrm{b} ; \mathrm{r})$

$$
\mathrm{D}=\mathrm{c}^{\mathrm{a}} \cdot \mathrm{Enc}_{\mathrm{pk}}(\mathrm{c} ; \mathrm{s})
$$

$d=\operatorname{Dec}_{\text {sk }}(\mathrm{D})=a b+c \bmod N$


## How to Multiply with Pailler

Receiver
$\mathrm{pk}, \mathrm{B}=\mathrm{Enc}_{\mathrm{pk}}(\mathrm{b} ; \mathrm{r})$

$$
\mathrm{D}=\mathrm{c}^{\mathrm{a}} \cdot \mathrm{Enc}_{\mathrm{pk}}(\mathrm{c} ; \mathrm{s})
$$

Privacy for Alice:

$$
\begin{gathered}
\mathrm{B} \approx \mathrm{Enc}_{\mathrm{pk}}(0 ; r) \\
\text { due to IND-CPA of Pailler }
\end{gathered}
$$

## Privacy for Bob?

Alice knows the secret key! But due to homomorphism of Pailler $\{s k, D\} \approx\left\{s k, E n c_{p k}(a b+c ; t)\right\}$

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- Noisy Encodings


# OLE from Noisy Encodings 

(Ishai et al. [IPS09], generalizing [NP06])

## Noisy Encodings

- Encode:

Takes $a \in \mathbb{F}^{m}$, outputs a set $L$ and encoding $v \in \mathbb{F}^{n}$

- Eval:

Takes $b, c \in \mathbb{F}^{m}$ and the encoding $v$, outputs an encoding $w$

- Decode:

Takes an encoding $w$ and the set $L$, outputs $y=a b+c$

## OLE from Noisy Encodings

Encode(a)

1. Pick a polynomial $A$ of degree $k-1$ with $A(0)=a$, evaluate at $n=4 k$ positions $1 . . . n$

2. Pick a random error vector $e$ with $\rho=2 k+1$ non-zero elements, $L=\left\{\boldsymbol{i} \mid \boldsymbol{e}_{\boldsymbol{i}}=\mathbf{0}\right\}$
$e$

| 0 | $e_{2}$ | $e_{3}$ | 0 | $e_{i}$ | 0 | 0 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |

3. Add the two together


Assumption - Pseudorandomness

$$
v \leftarrow \operatorname{Encode}(a) \equiv \mathcal{U}_{n}
$$

## OLE from Noisy Encodings

$\operatorname{Eval}(v, b, r)$

1. Pick a polynomial $B$ of degree $k-1$
with $B(0)=b$, evaluate at $n=4 k$ positions $1 \ldots n$

|  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $\tilde{b}$ | $B(1)$ | $B(2)$ | $\ldots$ | $\ldots$ | $\ldots$ | $\ldots$ |

$\times$

$v$| $A(1)$ | $e_{2}$ | $\ldots$ | $\ldots$ | $\ldots$ | $\ldots$ | $A(n)$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |

2. Pick a polynomial $R$ of degree $2 k-2$ with $C(0)=c$, evaluate at $n=4 k$ positions $1 . . . n$

$$
+
$$



## OLE from Noisy Encodings

## Decode(w,L)

1. Ignore all $i \notin L$

2. Interpolate the polynomial $Y(x)$ and output $Y(0)=a b+c$

| $y$ | $y(1)$ | $Y(2)$ | $\ldots$ | $\ldots$ | $\ldots$ | $\ldots$ | $Y(n)$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

## OLE from Noisy Encodings

## $a \in \mathbb{F}$

## $b, c \in \mathbb{F}$

|  |
| :--- | :--- | :--- |



$$
w \leftarrow \operatorname{Eval}(v, b, c)
$$

$y \leftarrow \operatorname{Decode}\left(w_{\mid L}, L\right)(=a b+c)$

## Constant overhead per multiplication!*

*using packed secret sharing

## Summary

- OT properties
- Symmetric
- ROT and OT equivalence
- OT can be stretched
- OT extension
- Passive security
- Multiplication protocols
- Gilboa (OT-based)
- \#OTs = \#bits
- (works on any ring)
- AHE (Pailler)
- Noisy Encoding
- (works for fields)
- \#OTs independent on bitlength


## Primary References

- Cryptographic Computing, lecture notes, http://orlandi.dk/crycom (with theory and programming exercises)
- Extending Oblivious Transfers Efficiently (Ishai et al.)
- A Generalisation, a Simplification and Some Applications of Paillier's Probabilistic Public-Key System (Damgård et al.)
- Public-Key Cryptosystems Based on Composite Degree Residuosity Classes (Paillier)
- Secure Arithmetic Computation with No Honest Majority (Ishai et al.)
- Two Party RSA Key Generation (Gilboa)
- Extending Oblivious Transfers Efficiently - How to get Robustness Almost for Free (Nielsen)


## other References

- Oblivious Polynomial Evaluation (Naor et al.)
- More Efficient Oblivious Transfer Extensions with Security for Malicious Adversaries (Asharov et al.)
- Actively Secure OT Extension with Optimal Overhead (Keller et al.)
- Improved OT Extension for Transferring Short Secrets (Kolesnikov et al.)
- Efficient Batched Oblivious PRF with Applications to Private Set Intersection (Kolesnikov et al.)
- Actively Secure OT-Extension from q-ary Linear Codes (Cascudo et al.)
- Maliciously Secure Oblivious Linear Function Evaluation with Constant Overhead (Ghosh et al.)
- MASCOT: Faster Malicious Arithmetic Secure Computation with Oblivious Transfer (Keller et al.)
- A New Approach to Practical Active-Secure Two-Party Computation (Nielsen et al.)

