## Garbled Circuits

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## Garbled circuits (recap)



Key idea: Given garbled gate + one wire label per input wire:
can learn only one output label (authenticity) cannot learn truth value of labels (privacy)

## Optimizing garbled circuits

## Size of garbled circuits . . .

... is the most important parameter

- Applications of garbled circuits are network-bound
- Garbled circuit computations are very fast (typically hardware AES)


## Today's Agenda:

Optimizations: How did garbled boolean circuits get so small?


New frontiers: How to garble arithmetic circuits

## Ciphertext expansion



Position in this list leaks semantic value!

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$\Rightarrow$ Need to detect [in]correct decryption
$\Rightarrow$ Need encryption scheme with ciphertext expansion (size doubles)

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- Association between $(\bullet, \bullet) \leftrightarrow(T, F)$ is random for each wire
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No need for trial decryption $\Rightarrow$ no need for ciphertext expansion!

- Can use simple one-time encryption $\mathbb{E}_{A, B}(C)=H(A, B) \oplus C$
- $H=$ random oracle (in practice: 1 call to AES)


## Scoreboard

|  | size $(\times \lambda)$ | garble cost | eval cost |
| :--- | :---: | :---: | :---: |
| Classical [Yao86,GMW87] | 8 | 4 | 2.5 |
| P\&P [BeaverMicaliRogaway90] | 4 | 4 | 1 |

## Garbled Row Reduction ${ }_{\text {Naopipiasasummese }]}$



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## Garbled Row Reduction

Instead of choosing output wire labels uniformly ...
... choose so that first ciphertext is $0^{n}$ (depends on colors \& gate function)

No need to include 1st ciphertext:

- Evaluator can "reconstruct" missing ciphertext and do the usual thing:



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## 

$$
\xlongequal[B_{0}, B_{1}]{A_{0}, A_{1}} \backsim \square C_{0}, C_{1}
$$

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| Free XOR [KolesnikovSchneider08] | $\mathbf{0}$ | $\mathbf{3}$ | $\mathbf{0}$ | $\mathbf{4}$ | $\mathbf{0}$ | $\mathbf{1}$ |

## 

Instead of choosing output wire labels uniformly, choose them so that . . .


Note: (More complicated) 2-ctxt AND first appeared in [PinkasSchneiderSmartWilliams09].

## 

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\begin{aligned}
& C_{0} \leftarrow\{0,1\}^{n} \\
& C_{1} \leftarrow\{0,1\}^{n}
\end{aligned}
$$

Instead of choosing output wire labels uniformly, choose them so that . . .


- $H\left(A_{0}, B_{1}\right) \oplus C_{1}^{\bullet}$
- $H\left(A_{0}, B_{0}\right) \oplus C_{0}^{\circ}$
- $H\left(A_{1}, B_{1}\right) \oplus C_{0}^{*}$
-• $H\left(A_{1}, B_{0}\right) \oplus C_{0}^{0}$

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\begin{gathered}
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\begin{gathered}
C_{0}=H_{00} \oplus H_{11} \oplus H_{10} \\
C_{1}=H\left(A_{0}, B_{1}\right)
\end{gathered}
$$



Instead of choosing output wire labels uniformly, choose them so that ...
$\ldots$ first ciphertext is $0^{n}$
$\ldots$ XOR of other ciphertexts is $0^{n}$

First 2 ciphertexts don't need to be sent!


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| Free XOR [KolesnikovSchneider08] | 0 | 3 | 0 | 4 | 0 | 1 |
| GRR2 [PinkasSchneiderSmartWilliams09] | $\mathbf{2}$ | $\mathbf{2}$ | $\mathbf{2}$ | $\mathbf{2}$ | $\mathbf{1}$ | $\mathbf{1}$ |

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| GRR2 [PinkasSchneiderSmartWilliams09] | 2 | 2 | 2 | 2 | 1 | 1 |

- Depending on circuit, either Free-XOR or GRR2 may be better
- Two techniques are incompatible! (can't guarantee $C_{0} \oplus C_{1}=\Delta$ )

Samee Zahur, Mike Rosulek, David Evans: Two Halves Make a Whole: Reducing Data Transfer in Garbled Circuits using Half Gates. Eurocrypt 2015

Best of both worlds: Free-XOR + 2-ciphertext AND

## Half Gates

What if garbler knows in advance the truth value on one input wire?

$$
\frac{A, A \oplus \Delta}{B, B \oplus \Delta} \square C, C \oplus \Delta
$$

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if $a=0:$

| 0 | 0 |
| :--- | :--- |
| 1 | 0 |

unary gate $b \mapsto 0$

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What if garbler knows in advance the truth value on one input wire?


$$
\begin{aligned}
& \text { if } a=0 \text { : } \\
& \qquad \begin{array}{|l|l|}
\hline B & C \\
B \oplus \Delta & C \\
\text { unary gate } b \mapsto 0
\end{array} \\
& \text { und }
\end{aligned}
$$

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& \text { if } a=0 \text { : } \\
& \begin{array}{l}
H(B) \oplus C \\
H(B \oplus \Delta) \oplus C
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$$
\begin{aligned}
& \quad \text { if } a=1 \text { : } \\
& \begin{array}{|l|l|l}
0 & 0 \\
1 & 1
\end{array} \\
& \hline \text { gate } b \mapsto b
\end{aligned}
$$

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Fine print: permute ciphertexts with permute-and-point.

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Fine print: no need for permute-and-point here

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## $a \wedge b$

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$$
a \wedge b=(a \oplus r \oplus r) \wedge b
$$

- Garbler chooses random bit $r$


## Two halves make a whole!

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a \wedge b & =(a \oplus r \oplus r) \wedge b \\
& =[(a \oplus r) \wedge b] \oplus[r \wedge b]
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- Arrange for evaluator to learn $a \oplus r$ in the clear


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one input known to garbler

- Garbler chooses random bit $r$
- $r=$ color bit of false wire label $A$
- Arrange for evaluator to learn $a \oplus r$ in the clear
- $a \oplus r=$ color bit of wire label evaluator gets $(A$ or $A \oplus \Delta)$
- Total cost $=2$ "half gates" +1 XOR gate $=2$ ciphertexts


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|  | XOR | AND | XOR | AND | XOR | AND |
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| GRR3 [NaorPinkasSumner99] | 3 | 3 | 4 | 4 | 1 | 1 |
| Free XOR [KolesnikovSchneider08] | 0 | 3 | 0 | 4 | 0 | 1 |
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| Half gates [ZahurRosulekEvans15] | $\mathbf{0}$ | 2 | $\mathbf{0}$ | $\mathbf{4}$ | $\mathbf{0}$ | $\mathbf{2}$ |

## Open Question

# Can we do better than half-gates? 

## NO

[ZahurRosulekEvans15]

Can't garble an AND gate with $<2$ ciphertexts

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## YES

[BallMalkinRosulek16, KempkaKikuchiSuzuki16]

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Can garble an AND gate with 1 ciphertext...
... but not in context of a larger circuit ${ }^{+}$

## Open Question

## Can we do better than half-gates? in any useful way?

## NO

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Can garble an AND gate with 1 ciphertext...
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## Roadmap

Optimizations: How did garbled boolean circuits get so small?

New frontiers: How to garble arithmetic circuits

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New frontiers: How to garble arithmetic circuits
[BallMalkinRosulek16]

## 

## Free XOR:

Wire carries a truth value from
$\{0,1\}$
Wire labels are bit strings $\{0,1\}^{\lambda}$.
Global wire-label-offset $\Delta \in\{0,1\}^{\lambda}$
false wire label is $A$ true wire label is $A \oplus \Delta$

## Generalized Free XOR ${ }_{[\text {BalMalakinposuleth }]}$

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$\oplus$ is componentwise addition mod 2

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+ is componentwise addition $\bmod m$


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Idea: Truth value $a \in \mathbb{Z}_{m}$ encoded by wire label $\underline{A+a \Delta} \in\left(\mathbb{Z}_{m}\right)^{\lambda}$

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$$
\left.\frac{A+a \Delta}{\overline{B+b \Delta}}\right) \sqrt[\mathbb{Z}_{m}]{ }
$$

Evaulator can simply add wire labels

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$$
\frac{A+a \Delta}{B+b \Delta}-\mathbb{Z}_{m}-C+(a+b) \Delta
$$

Evaulator can simply add wire labels $\Rightarrow$ free garbled addition $\bmod m$

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$$
\left.\frac{A+a \Delta}{\overline{B+b \Delta}}\right) \mathbb{Z}_{m}-C+(a+b) \Delta
$$

Evaulator can simply add wire labels $\Rightarrow$ free garbled addition $\bmod m$

- Free multiplication by public constant $c$, if $\operatorname{gcd}(c, m)=1$


## Garbling unary gates



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- Different "preferred modulus" on each wire $\Rightarrow$ different offsets $\Delta$


## Garbling unary gates



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- Cost: $m$ ciphertexts ( $m-1$ using standard row reduction)
- Generalized point-and-permute: "color bit" from $\mathbb{Z}_{m}$


## Generalized garbling tools

We can efficiently garble any computation/circuit where:

- Each wire has a preferred modulus $\mathbb{Z}_{m}$
$\Rightarrow$ Wire-label-offset $\Delta_{m}$ global to all $\mathbb{Z}_{m}$-wires
- Addition gates: all wires touching gate have same modulus $\Rightarrow$ Garbling cost: free
- Mult-by-constant gates: input/output wires have same modulus $\Rightarrow$ Garbling cost: free
- Unary gates: $\mathbb{Z}_{m}$ input and $\mathbb{Z}_{\ell}$ output
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Better basis for many computations than traditional boolean circuits!

## Arithmetic computations

## Example Scenario

Securely compute linear optimization problem on 32-bit values.
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|  | cost (\# ciphertexts) |
| ---: | :---: |
| addition | 62 |
| multiplication by public constant | 758 |
| multiplication | 1200 |
| squaring, cubing, etc | 1864 |

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Using generalized garbling techniques:

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|  | standard | ours |
| ---: | :---: | :---: |
| addition | 62 | 0 |
| multiplication by public constant | 758 | 0 |
| multiplication | 1200 | 8589934590 |
| squaring, cubing, etc | 1864 | 4294967295 |

## Arithmetic computations

instead of $\mathbb{Z}_{4294967296}$

$$
\downarrow
$$

use $\mathbb{Z}_{6469693230}$

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## Arithmetic computations

instead of $\mathbb{Z}_{4294967296}=\mathbb{Z}_{2^{32}}$ $\downarrow$
use $\mathbb{Z}_{6469693230}=\mathbb{Z}_{2 \cdot 3 \cdot 5 \cdot 7 \cdots 29}$

## Arithmetic computations

## CRT residue number system!

- Generalized garbling scheme supports many moduli in same circuit
- Represent 32-bit integer $x$ as $(x \% 2, x \% 3, x \% 5, \ldots, x \% 29)$
- Do all arithmetic in each residue (each with small modulus)

|  | standard | madness |  |
| ---: | :---: | :---: | :---: |
| addition | 62 | 0 |  |
| mult by public constant | 758 | 0 |  |
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## Arithmetic computations

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|  | standard | madness | CRT |
| ---: | :---: | :---: | :--- |
| addition | 62 | 0 | $\mathbf{0}$ |
| mult by public constant | 758 | 0 | $\mathbf{0}$ |
| multiplication | 1200 | 25769803776 | $\mathbf{2 3 8} \approx 2(2+3+5+$ |
| squaring, cubing, etc | 1864 | 4294967296 | $\mathbf{1 1 9}$ |

## Challenges:

## State of the art:

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## State of the art:

"If values are represented in CRT form then garbled operations are cheap."

## But doesn't it cost something to get values into CRT form??

Not so good:

- Converting from binary to CRT
- Getting CRT values into the circuit via OT

Kinda bad: (room for improvement)

- Comparing two CRT-encoded values
- Converting from CRT to binary
- Integer division
- Modular reduction different than the CRT composite modulus (e.g., garbled RSA)


## Converting to CRT

## Claim:

It's not hard to convert into CRT representation $\mathbb{Z}_{p_{1}} \times \mathbb{Z}_{p_{2}} \times \cdots \times \mathbb{Z}_{p_{k}}$

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From binary $b_{n} b_{n-1} \cdots b_{1} b_{0}$ :

- For all $i, j$, use unary gate $b_{i} \mapsto b_{i}\left(\bmod p_{j}\right) \quad$ ( 1 ciphertext each)
- For all $j$, add to obtain $\sum_{i} b_{i} 2^{i}\left(\bmod p_{j}\right)$ (free)
- Total cost $=(\#$ primes $) \times(\#$ bits) (e.g., 320 ciphertexts for 32 bits)


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(free)
- Total cost $=(\#$ primes $) \times$ (\# bits) (e.g., 320 ciphertexts for 32 bits)

At the input level (e.g., OTs in Yao): (similar to [Gilboa99,KellerOrsiniScholl16])

- Outside of the circuit, convert plaintext input into CRT form
- Convert $\mathbb{Z}_{p_{j}-}$-residue to binary, and transfer it using $\left\lceil\log p_{j}\right\rceil$ OTs
- Total cost: $\sum_{j} \log p_{j}$ OTs
(e.g., 37 OTs for 32 -bit values)


## Comparing CRT values

CRT view of $\mathbb{Z}_{2 \cdot 3 \cdot 5 \cdot 7}$ :


## Comparing CRT values

CRT view of $\mathbb{Z}_{2 \cdot 3 \cdot 5 \cdot 7}$ :

| 0 | 0 | 0 | 0 | 0 |
| :--- | :--- | :--- | :--- | :--- |
| 1 | 1 | 1 | 1 | 1 |
| 2 | 2 | 2 | 0 |  |
| 3 | 3 | 0 | 1 | 3 |
| 4 | 4 | 1 | 0 | 4 |
| 5 | 0 | 2 | 1 | 5 |
| 6 | 1 | 0 | 0 | 6 |
| 0 | 2 | 1 | 1 | 7 |

## Theorem

CRT representation sucks for comparisons!

## Comparing CRT values

CRT view of $\mathbb{Z}_{2 \cdot 3 \cdot 5 \cdot 7}$ :

| 0000 | 0 |
| :---: | :---: |
| 1111 | 1 |
| 2220 | 2 |
| 3301 | 3 |
| 4410 | 4 |
| 5021 | 5 |
| 6100 | 6 |
| 0211 | 7 |
| 1421 | 29 |
| 2000 | 30 |



## Comparing CRT values

CRT view of $\mathbb{Z}_{2 \cdot 3 \cdot 5 \cdot 7}$ :
Primorial Mixed Radix (PMR)

| 0000 | 0 | 0 | 0 |
| :---: | :---: | :---: | :---: |
| 1111 | 1 | 1 | 1 |
| 2220 | 2 | 10 | 2 |
| 3301 | 3 | 11 | 3 |
| 4410 | 4 | 20 | 4 |
| 5021 | 5 | 21 | 5 |
| 6100 | 6 | 100 | 6 |
| 0211 | 7 | 101 | 7 |
| : | : |  |  |
| 1421 | 29 | 421 | 29 |
| 2000 | 30 | 1000 | 30 |
| : | : |  |  |

# Approach for comparisons CRT values given $\downarrow$ 

Convert both CRT values to PMR

## $\downarrow$

Compare PMR (simple $L \rightarrow R$ scan)

# Approach for comparisons CRT values given 

Convert both CRT values to PMR

PMR representation of $x$ :
$\ldots,\left\lfloor\frac{x}{2 \cdot 3 \cdot 5}\right\rfloor \% 7, \quad\left\lfloor\frac{x}{2 \cdot 3}\right\rfloor \% 5, \quad\left\lfloor\frac{x}{2}\right\rfloor \% 3, \quad\lfloor x\rfloor \% 2$

## $\downarrow$

Compare PMR (simple L $\rightarrow$ R scan)

## Approach for comparisons CRT values given

## Convert both CRT values to PMR

Simple building block:

$$
(x \% p, \quad x \% q) \mapsto\left\lfloor\frac{x}{p}\right\rfloor \% q
$$

allows you to compute PMR representation of $x$ :

$$
\ldots,\left\lfloor\frac{x}{2 \cdot 3 \cdot 5}\right\rfloor \% 7,\left\lfloor\frac{x}{2 \cdot 3}\right\rfloor \% 5, \quad\left\lfloor\frac{x}{2}\right\rfloor \% 3, \quad\lfloor x\rfloor \% 2
$$

## $\downarrow$

Compare PMR (simple L $\rightarrow$ R scan)
$(x \% p, x \% q) \mapsto\lfloor x / p\rfloor \% q$

| $\boldsymbol{x}$ | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 |
| :---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $\boldsymbol{x} \% 3$ | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 |
| $\boldsymbol{x} \% 5$ | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 |

$$
\begin{array}{|l|lllllllllllllll}
\lfloor x / 3\rfloor \% & 0 & 0 & 0 & 0 & 1 & 1 & 1 & 2 & 2 & 2 & 3 & 3 & 3 & 4 & 4
\end{array}
$$

$(x \% p, x \% q) \mapsto\lfloor x / p\rfloor \% q$

| $x$ | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 |
| :---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $x \% 3$ | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 |
| $x \% 5$ | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 |
| $\boldsymbol{x \% 3 - x \% 5}$ | 0 | 0 | 0 | -3 | -3 | 2 | -1 | -1 | -1 | -4 | 1 | 1 | -2 | -2 | -2 |


| $\lfloor x / 3\rfloor \%$ | 5 | 0 | 0 | 0 | 1 | 1 | 1 | 2 | 2 | 2 | 3 | 3 | 3 | 4 | 4 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

1. Subtract $x \% 3-x \% 5$
$(x \% p, x \% q) \mapsto\lfloor x / p\rfloor \% q$

| $x$ | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 |
| :---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $x \% 3$ | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 |
| $x \% 5$ | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 |
| $x \% 3-x \% 5$ | 0 | 0 | 0 | -3 | -3 | 2 | -1 | -1 | -1 | -4 | 1 | 1 | -2 | -2 | -2 |


| $\lfloor x / 3\rfloor$ | $\%$ | 5 | 0 | 0 | 0 | 1 | 1 | 1 | 2 | 2 | 2 | 3 | 3 | 3 | 4 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |

1. Subtract $x \% 3-x \% 5$
2. Result has the same "constant segments" as what we want
$(x \% p, x \% q) \mapsto\lfloor x / p\rfloor \% q$

| $x$ | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 |
| :---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $x \% 3$ | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 |
| $x \% 5$ | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 |
| $x \% 3-x \% 5$ | 0 | 0 | 0 | -3 | -3 | 2 | -1 | -1 | -1 | -4 | 1 | 1 | -2 | -2 | -2 |
| $(x \% 3-x \% 5) \% 7$ | 0 | 0 | 0 | 4 | 4 | 2 | 6 | 6 | 6 | 3 | 1 | 1 | 5 | 5 | 5 |
| $\lfloor x / 3\rfloor \% 5$ | 0 | 0 | 0 | 1 | 1 | 1 | 2 | 2 | 2 | 3 | 3 | 3 | 4 | 4 | 4 |

1. Subtract $x \% 3-x \% 5(\bmod 7$ is fine $)$
2. Result has the same "constant segments" as what we want

## $(x \% p, x \% q) \mapsto\lfloor x / p\rfloor \% q$

| $x$ | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 |
| :---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $x \% 3$ | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 |
| $x \% 5$ | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 |
| $x \% 3-x \% 5$ | 0 | 0 | 0 | -3 | -3 | 2 | -1 | -1 | -1 | -4 | 1 | 1 | -2 | -2 | -2 |
| $(x \% 3-x \% 5) \% 7$ | 0 | 0 | 0 | 4 | 4 | 2 | 6 | 6 | 6 | 3 | 1 | 1 | 5 | 5 | 5 |
| $\lfloor x / 3\rfloor \% 5$ | 0 | 0 | 0 | 1 | 1 | 1 | 2 | 2 | 2 | 3 | 3 | 3 | 4 | 4 | 4 |

1. Subtract $x \% 3-x \% 5(\bmod 7$ is fine $)$

- "Project" $x \% 3$ and $x \% 5$ to $\mathbb{Z}_{7}$ wires
- Subtract mod 7 for free

2. Result has the same "constant segments" as what we want

## $(x \% p, x \% q) \mapsto\lfloor x / p\rfloor \% q$

| $x$ | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 |
| :---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| $x \% 3$ | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 | 0 | 1 | 2 |
| $x \% 5$ | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 3 | 4 |
| $x \% 3-x \% 5$ | 0 | 0 | 0 | -3 | -3 | 2 | -1 | -1 | -1 | -4 | 1 | 1 | -2 | -2 | -2 |
| $(x \% 3-x \% 5) \% 7$ | 0 | 0 | 0 | 4 | 4 | 2 | 6 | 6 | 6 | 3 | 1 | 1 | 5 | 5 | 5 |
| $\lfloor x / 3\rfloor \% 5$ | 0 | 0 | 0 | 1 | 1 | 1 | 2 | 2 | 2 | 3 | 3 | 3 | 4 | 4 | 4 |

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2. Result has the same "constant segments" as what we want

- Apply unary projection:

$$
\begin{array}{llll}
0 \mapsto 0 & 2 \mapsto 1 & 4 \mapsto 1 & 6 \mapsto 2 \\
1 \mapsto 3 & 3 \mapsto 3 & 5 \mapsto 4 &
\end{array}
$$

## Approach for comparisons

1. General $(x \% p, x \% q) \mapsto\lfloor x / p\rfloor \% q$ gadget costs $\sim 2 p+2 q$ ciphertexts
2. PMR conversion requires this gadget between all pairs of primes
3. Total cost $O\left(k^{3}\right)$ for $k$-bit integers

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Operations on 32-bit integers:

|  | boolean | CRT |
| ---: | :---: | :---: |
| addition | 62 | 0 |
| multiplication by public constant | 758 | 0 |
| multiplication | 1200 | 238 |
| squaring, cubing, etc | 1864 | 119 |
| comparison | $\mathbf{6 4}$ | $\mathbf{2 5 4 1}$ |

