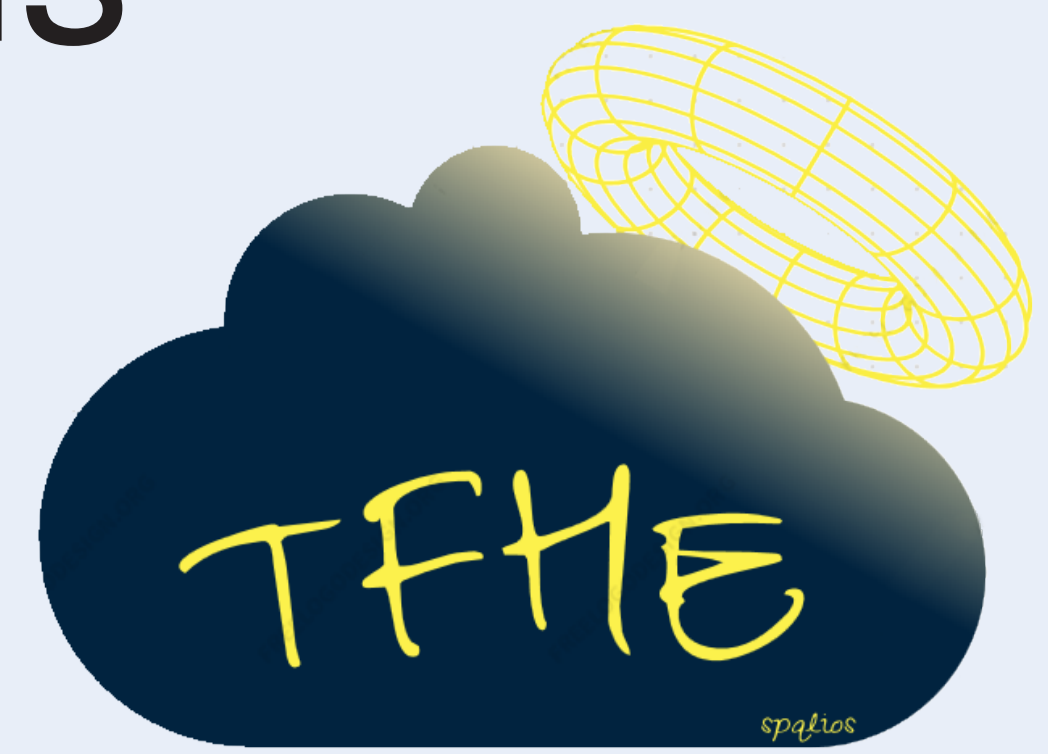


# TFHE: Fully Homomorphic Encryption over the Torus

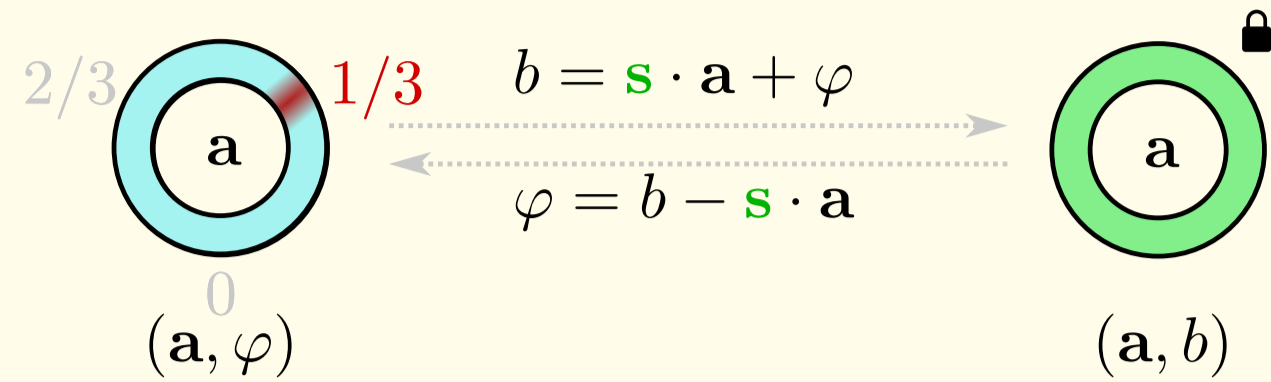
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<https://tfhe.github.io>



## TLWE Encryption over the torus

secret key:  $s \in \{0, 1\}^n$



### TLWE Encryption

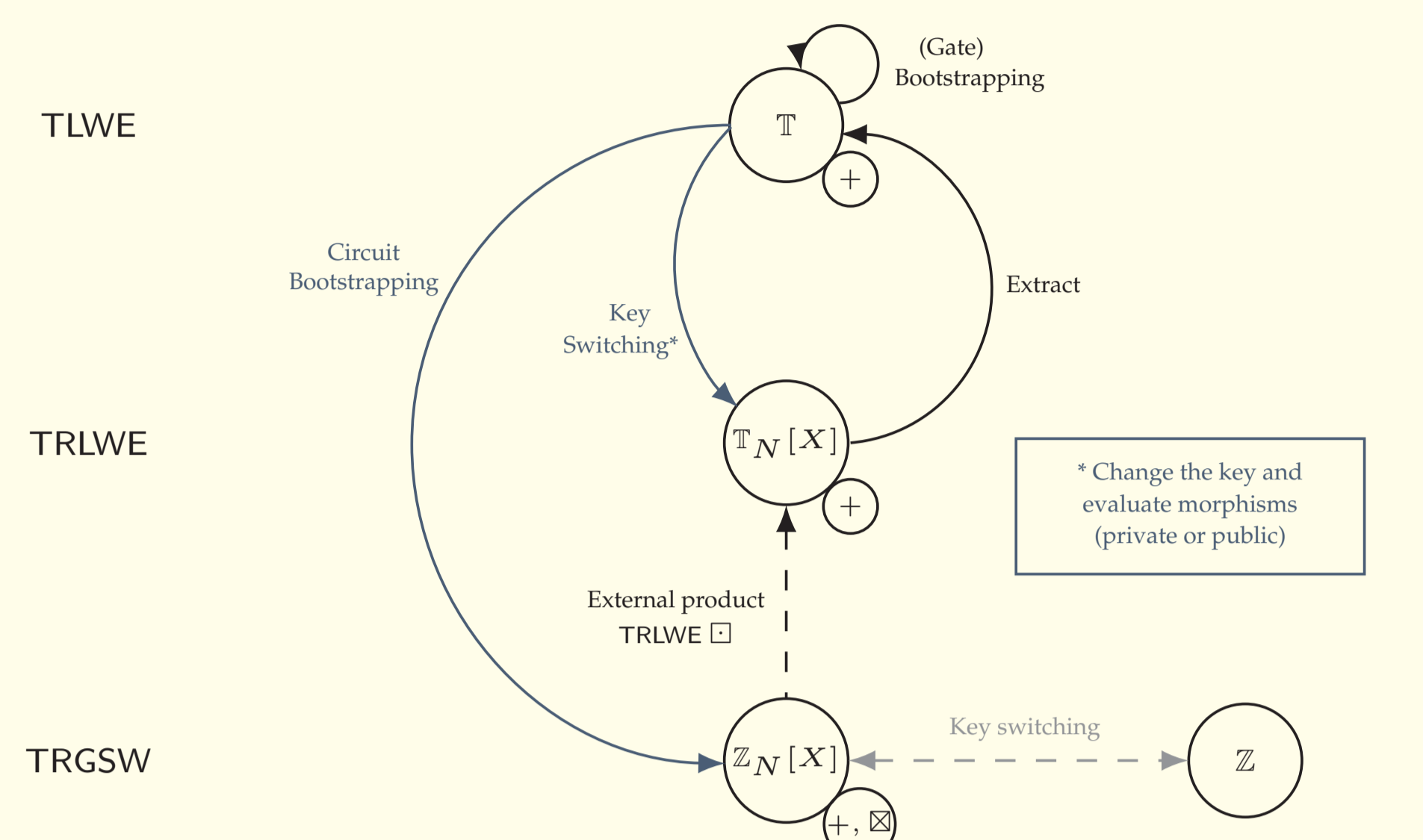
- $\varphi = \mu + \text{Gaussian Error}$
- Random mask  $a \in \mathbb{T}^n$

### TLWE Decryption

- Unlock the representation  $(a, \varphi)$
- Round  $\varphi$  to the nearest message  $\mu \in M$

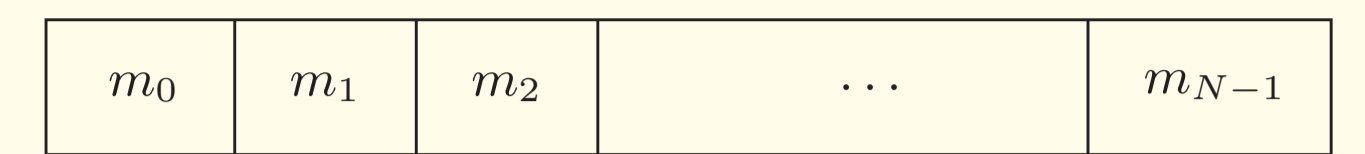
## TFHE Morphisms

	message	ciphertext	key	lin. com.	prod.
TLWE	$\mathbb{T}$	$\mathbb{T}^{n+1}$	$\mathbb{B}^n$	✓	✗
TRLWE	$\mathbb{T}_N[X]$	$\mathbb{T}_N[X]^{k+1}$	$\mathbb{B}_N[X]^k$	✓	✗
TRGSW	$\mathbb{Z}_N[X]$	$\ell$ -vect. of TRLWE	$\mathbb{B}_N[X]^k$	✓	✓



## Batching and Vertical Packing

TRLWE: messages  $\mathbf{m} = \sum_{i=0}^{N-1} m_i \cdot X^i \in \mathbb{T}_N[X]$



LookUp Tables to evaluate arbitrary functions:

$$f: \mathbb{B}^d \rightarrow \mathbb{T}^s$$

$$x = (x_0, \dots, x_{d-1}) \mapsto f(x) = (f_0(x), \dots, f_{s-1}(x))$$

$x_0 \dots x_{d-1}$	$f_0$	$\dots$	$f_{s-1}$
0 ... 0	$\sigma_{0,0}$	$\dots$	$\sigma_{s-1,0}$
1 ... 0	$\sigma_{0,1}$	$\dots$	$\sigma_{s-1,1}$
0 ... 0	$\sigma_{0,2}$	$\dots$	$\sigma_{s-1,2}$
1 ... 0	$\sigma_{0,3}$	$\dots$	$\sigma_{s-1,3}$
$\vdots$	$\vdots$	$\vdots$	$\vdots$
0 ... 1	$\sigma_{0,2^d-2}$	$\dots$	$\sigma_{s-1,2^d-2}$
1 ... 1	$\sigma_{0,2^d-1}$	$\dots$	$\sigma_{s-1,2^d-1}$

## TLWE/TRLWE Linear Operations

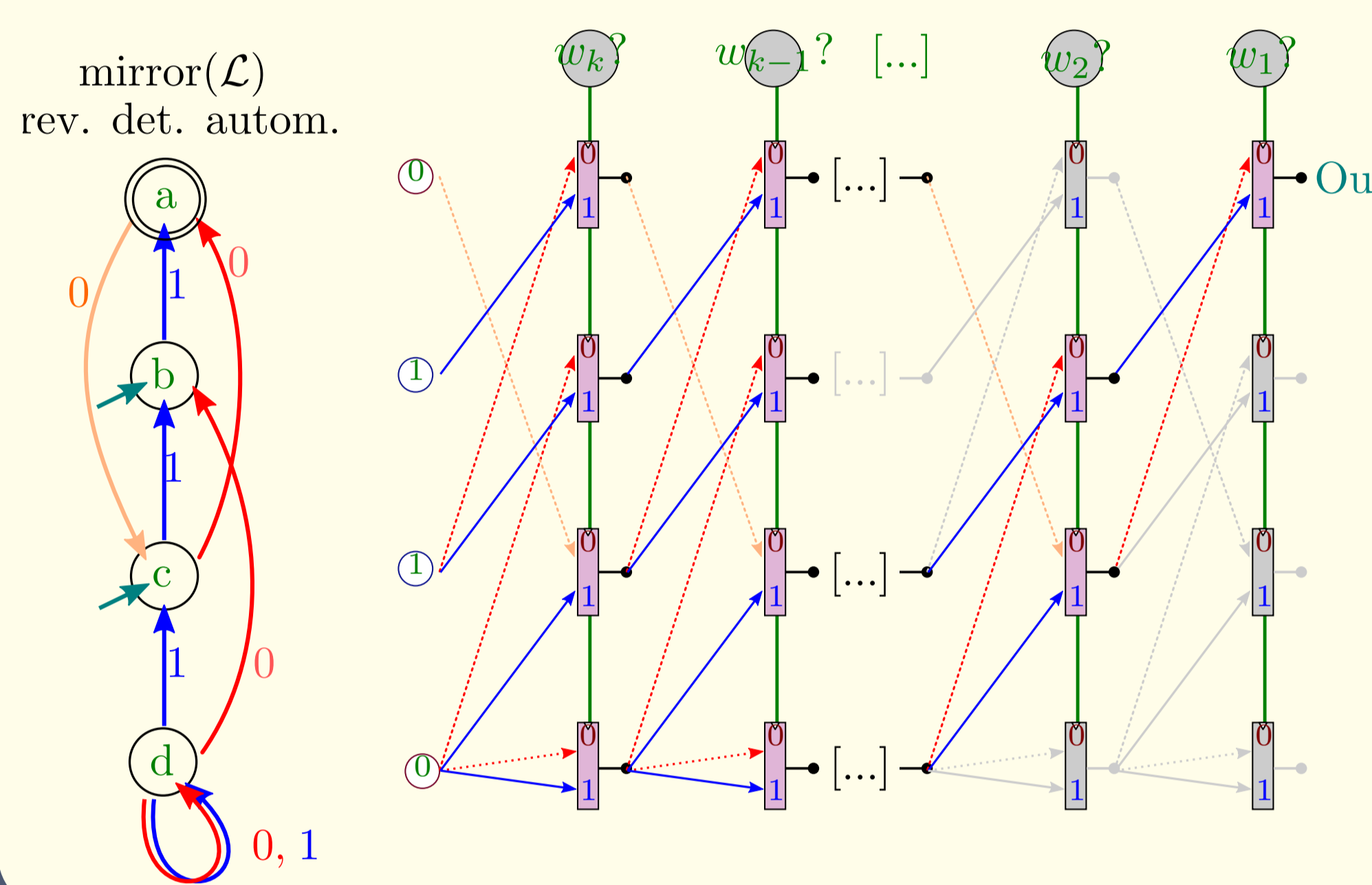
$$x \cdot \begin{matrix} \text{a} \\ b \end{matrix} + y \cdot \begin{matrix} \text{a}' \\ b' \end{matrix} = \begin{matrix} \text{a}'' \\ b'' \end{matrix} \quad \begin{matrix} \text{a}'' = x \cdot \text{a} + y \cdot \text{a}' \\ b'' = x \cdot b + y \cdot b' \end{matrix}$$

$$x \cdot \begin{matrix} \text{a} \\ \varphi \end{matrix} + y \cdot \begin{matrix} \text{a}' \\ \varphi' \end{matrix} = \begin{matrix} \text{a}'' \\ \varphi'' \end{matrix} \quad \begin{matrix} \varphi'' = x \cdot \varphi + y \cdot \varphi' \\ \mu'' = x \cdot \mu + y \cdot \mu' \\ \alpha'' = x^2 \alpha^2 + y^2 \alpha'^2 \end{matrix}$$

$\mu = \mathbb{E}(\varphi)$     $\mu'$     $\mu''$     $\alpha = \text{stdev}(\varphi)$     $\alpha'$     $\alpha''$

Sublinear noise propagation

## Automata



### DFA (deterministic finite automata)

- Decisional: returns accepted (1) or rejected (0)

### det-WFA (deterministic weighted automata)

- Computational: returns a weight in  $\mathbb{T}_N[X]$
- Weights act like a "memory" that stores the result all along the evaluation

## TRGSW Ciphertexts

TRGSW:  $C = Z + \mu H$   
with  $\mu \in \mathbb{Z}_N[X]$

$$\text{TRGSW}(\mu) = \begin{pmatrix} \text{TRLWE}_K(K \cdot \frac{\mu}{2}) \\ \text{TRLWE}_K(K \cdot \frac{\mu}{4}) \\ \text{TRLWE}_K(K \cdot \frac{\mu}{8}) \\ \text{TRLWE}_K(1 \cdot \frac{\mu}{2}) \\ \text{TRLWE}_K(1 \cdot \frac{\mu}{4}) \\ \text{TRLWE}_K(1 \cdot \frac{\mu}{8}) \end{pmatrix}$$

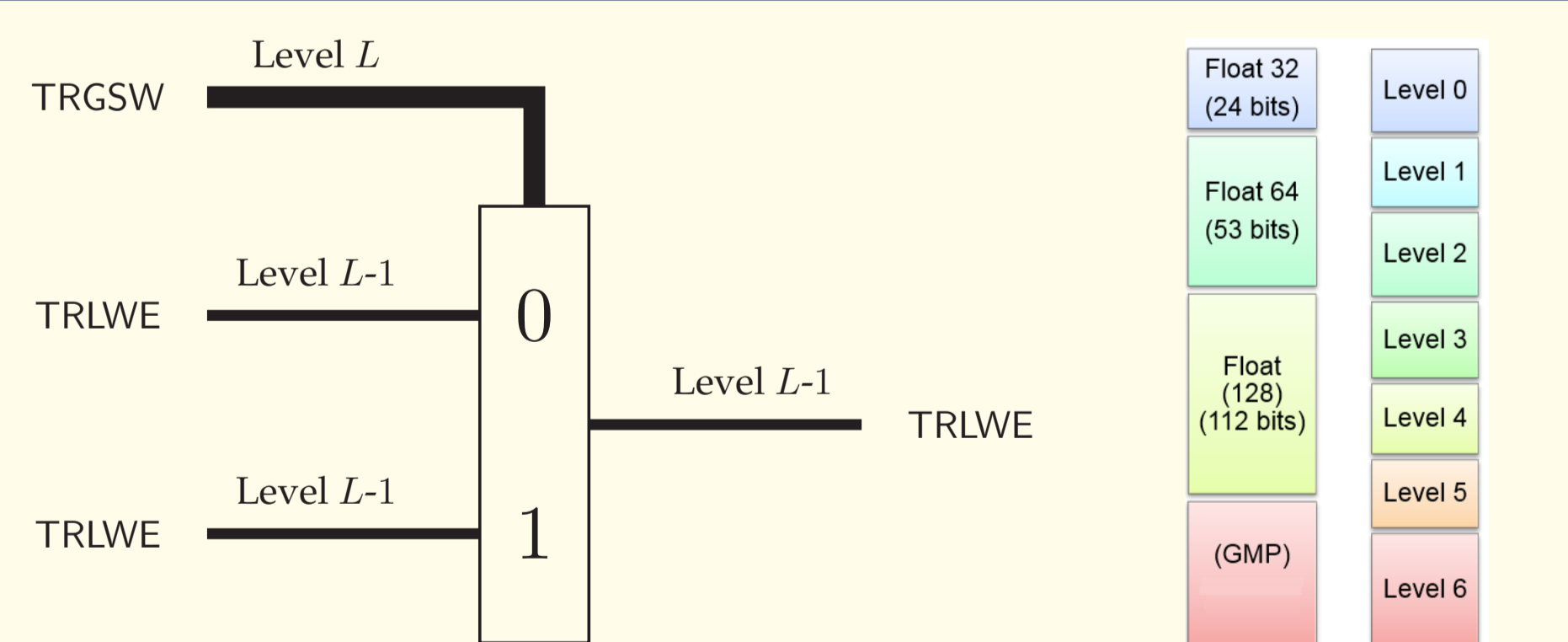
### Homomorphic ops.

- Additions
- Public Linear combinations
- Sublinear noise propagation
- Internal products
- External products
- Unbalanced noise propagation

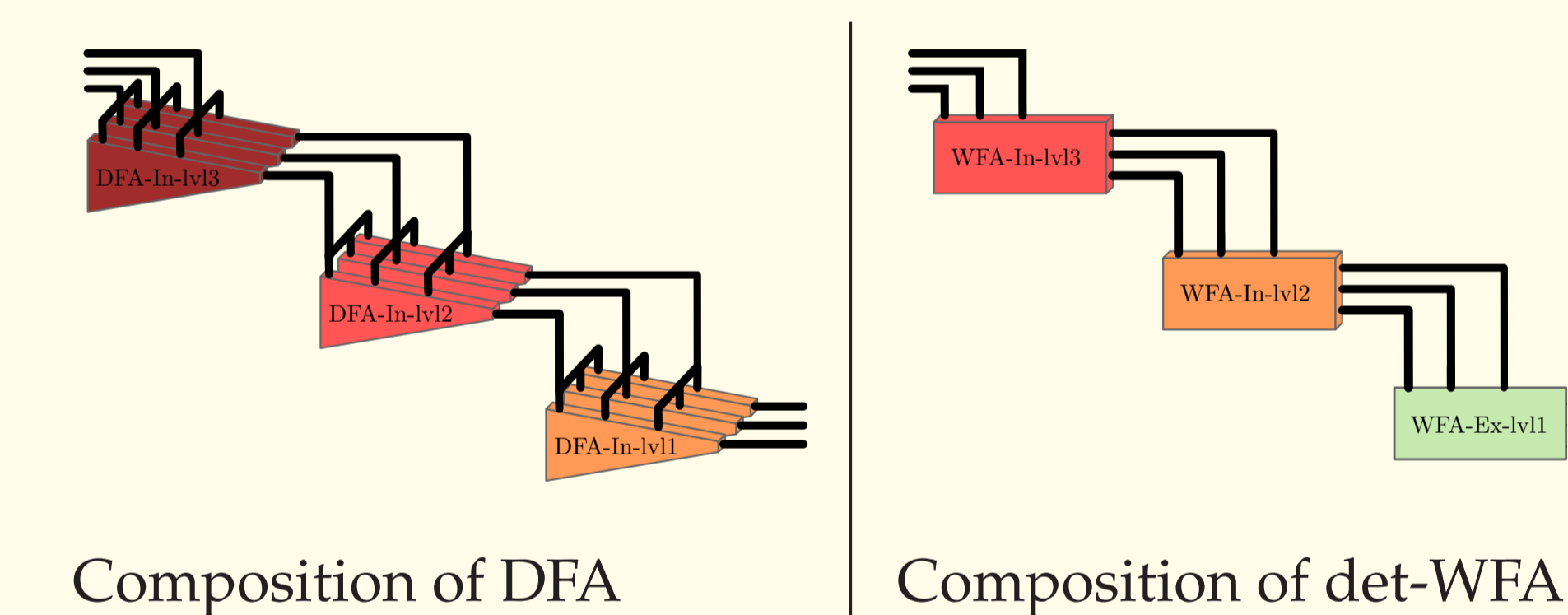
## External Product

$$\begin{matrix} \text{T-GSW} \\ \eta_A \end{matrix} \cdot \begin{matrix} \mu_A \\ \eta_B \end{matrix} = \begin{matrix} \mu_A \cdot \mu_B \\ \|\mu_A\|_1 \eta_B + O(\eta_A) \end{matrix} \begin{matrix} \text{T-LWE} \end{matrix}$$

## Homomorphic MUX

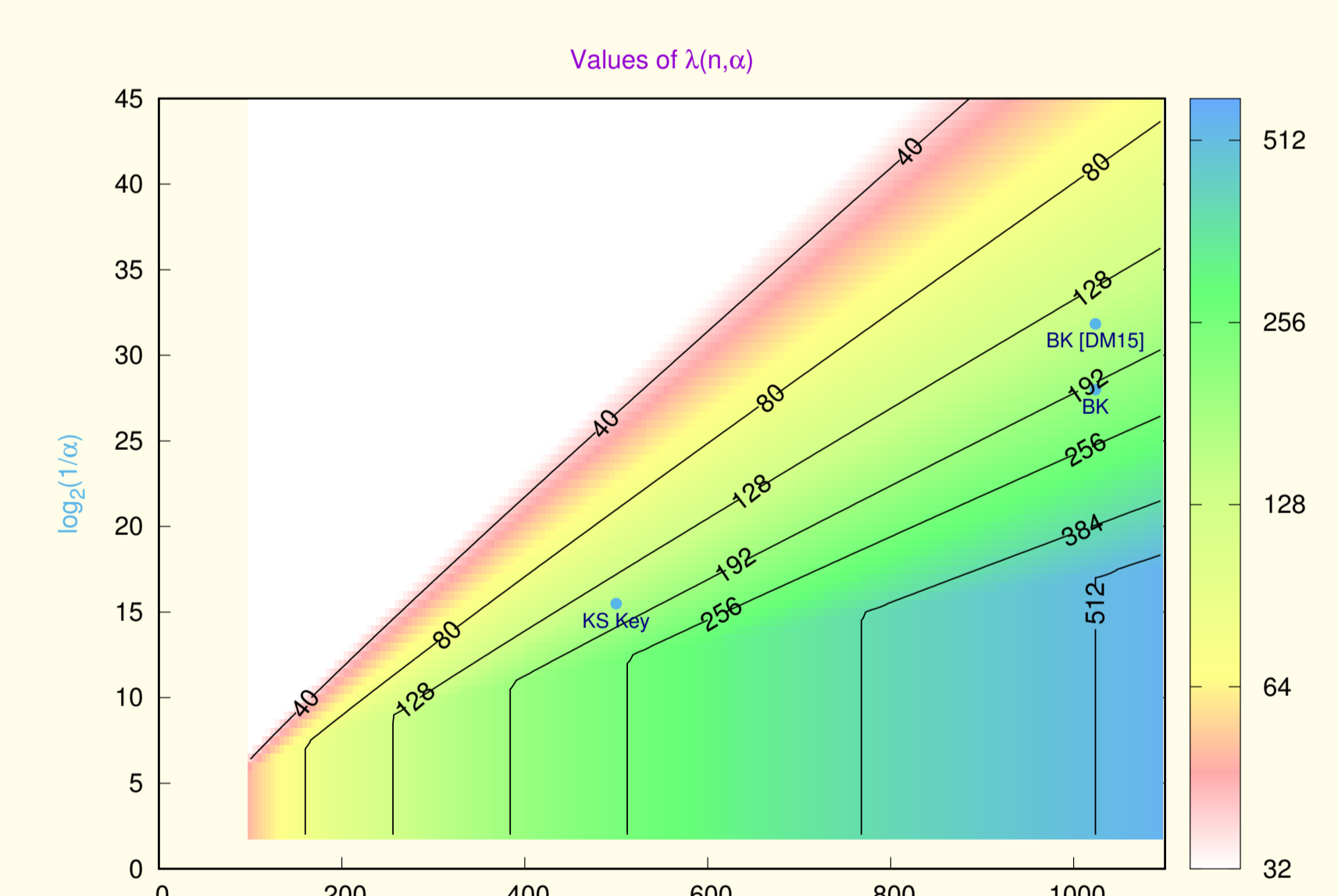


## Compositions

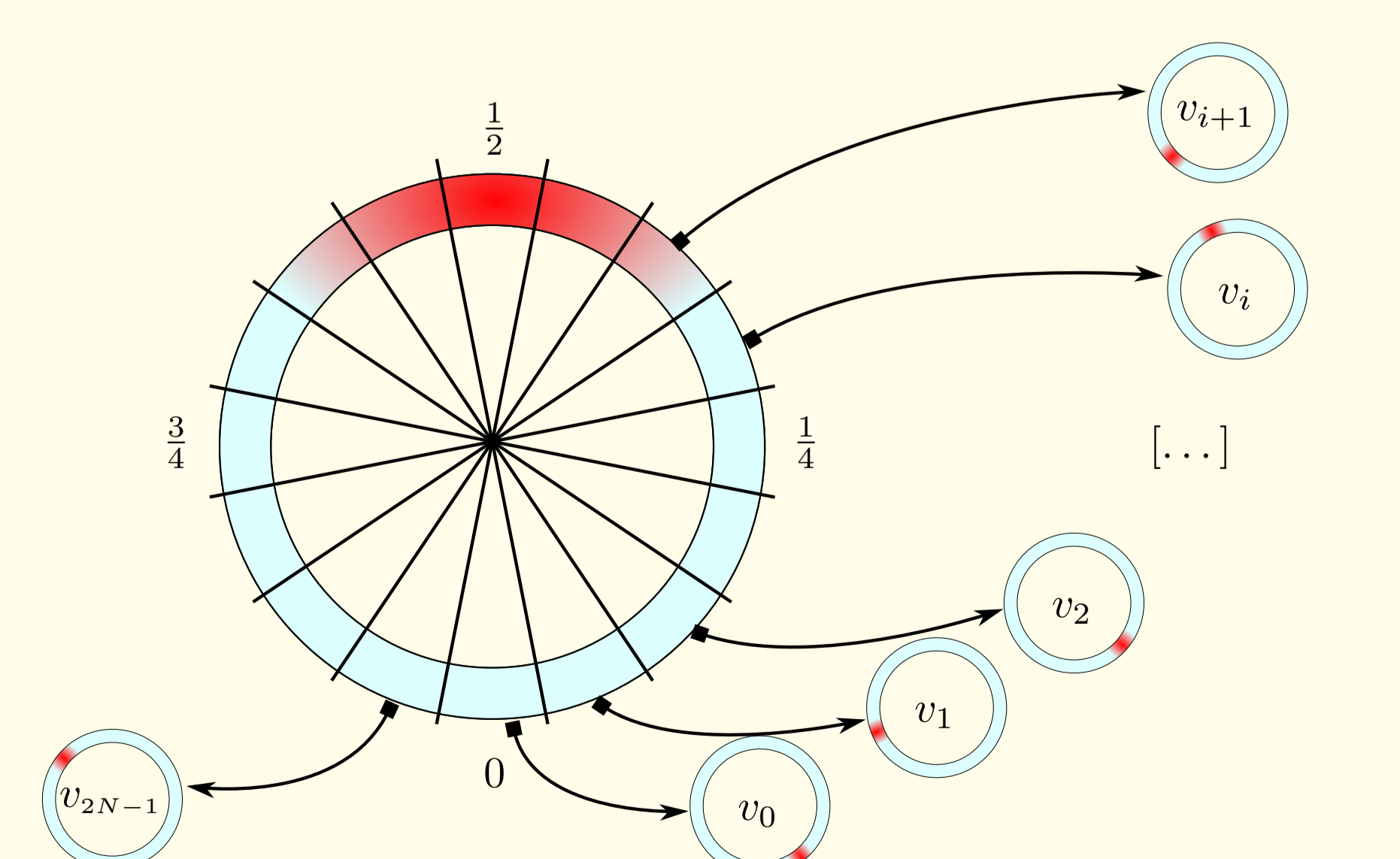


Levels = composition depth  
colors: very slow, slow, ..., very fast

## Security



## Gate Bootstrapping



### Bootstrapping algorithm of (a, b)

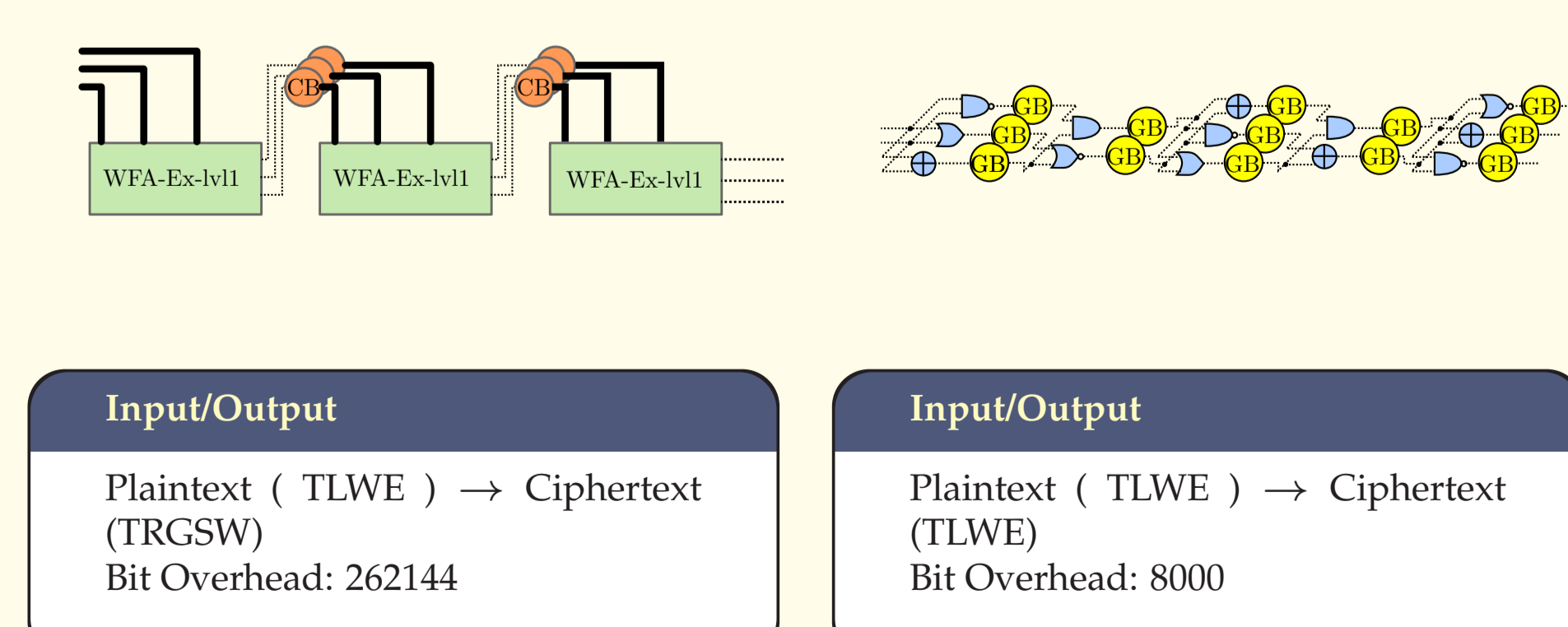
- Start from (a trivial) TRLWE ciphertext of message  $v_0 + v_1 X + \dots + v_{N-1} X^{N-1}$   
 $N$  coeffs mod  $X^N + 1$  can be viewed as  $2N$  coeffs mod  $X^{2N} - 1$  s.t.  $v_{N+i} = -v_i$
- Rotate it by  $p = -\varphi_s(a, b)$  positions using external product.
- Extract the constant term (which encrypts  $v_p$ ).

## Circuit Bootstrapping

Permits composition of automata and run everything in levels 0,1 and 2 (i.e. native floats).  
Reconstruct a TRGSW encryption directly from its internal structure.

## Gate/Circuit Bootstrapping

TFHE in Circuit Bootstrap mode: Bootstrap after many gates  
TFHE in Gate Bootstrap mode: Bootstrap between each gate



- Very fast: transition in 34  $\mu$ s
- No so fast: circuit bootstrapped in 134 ms but after many gates
- Composition: LUT, (W)DFA

TFHE in Circuit bootstrap mode can evaluate LUT 16 to 8 in 1 sec

- No so fast: bootstrapped binary gate runs in 13 ms
- All gates have the same cost
- Composable: between each gate

With TFHE we can compute 76 gates per second, for any circuit.

## Timings (seconds)

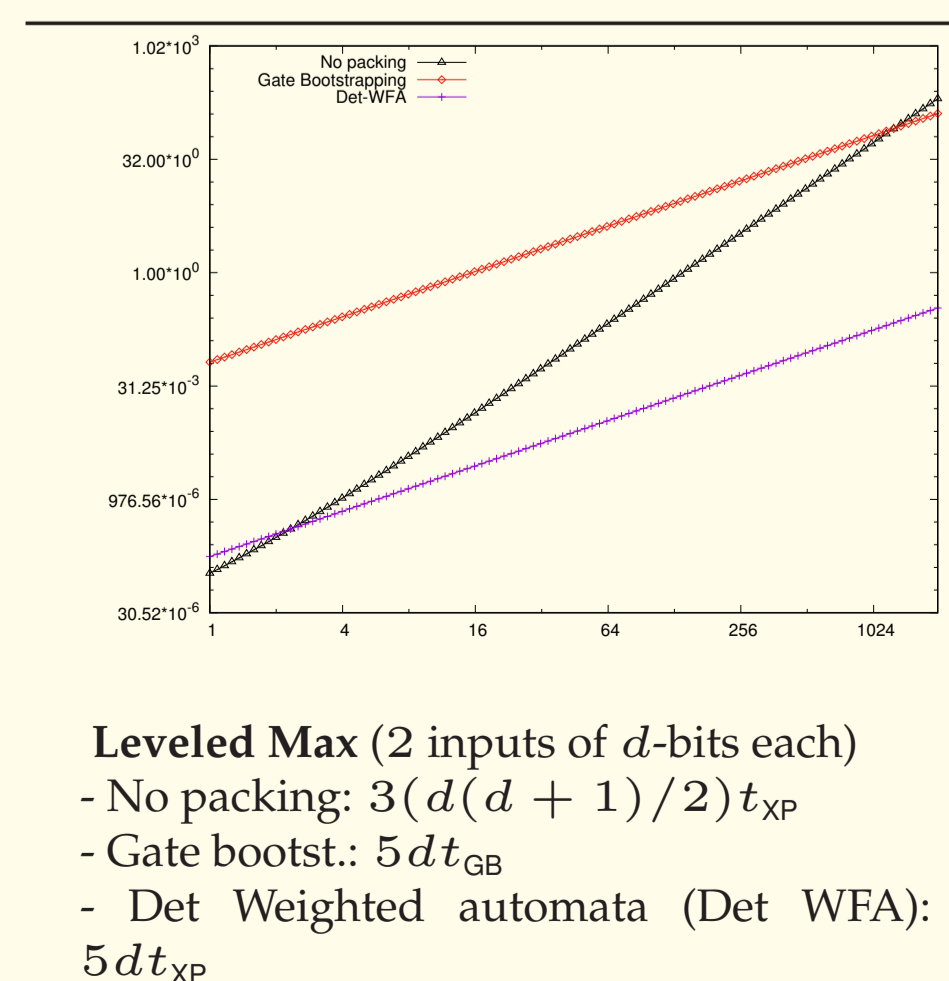
### Multiplication

- Multiplication (2 inputs of  $d$ -bits each)
- Gate bootst.:  $(6d^2 - 3d)t_{GB}$
- Circuit bootst with Det WFA:  $2dt_{CB} + \Theta(d^3)t_{XP}$  (computed by optimization program)
- Circuit bootst with TBSR: (computed by optimization program)

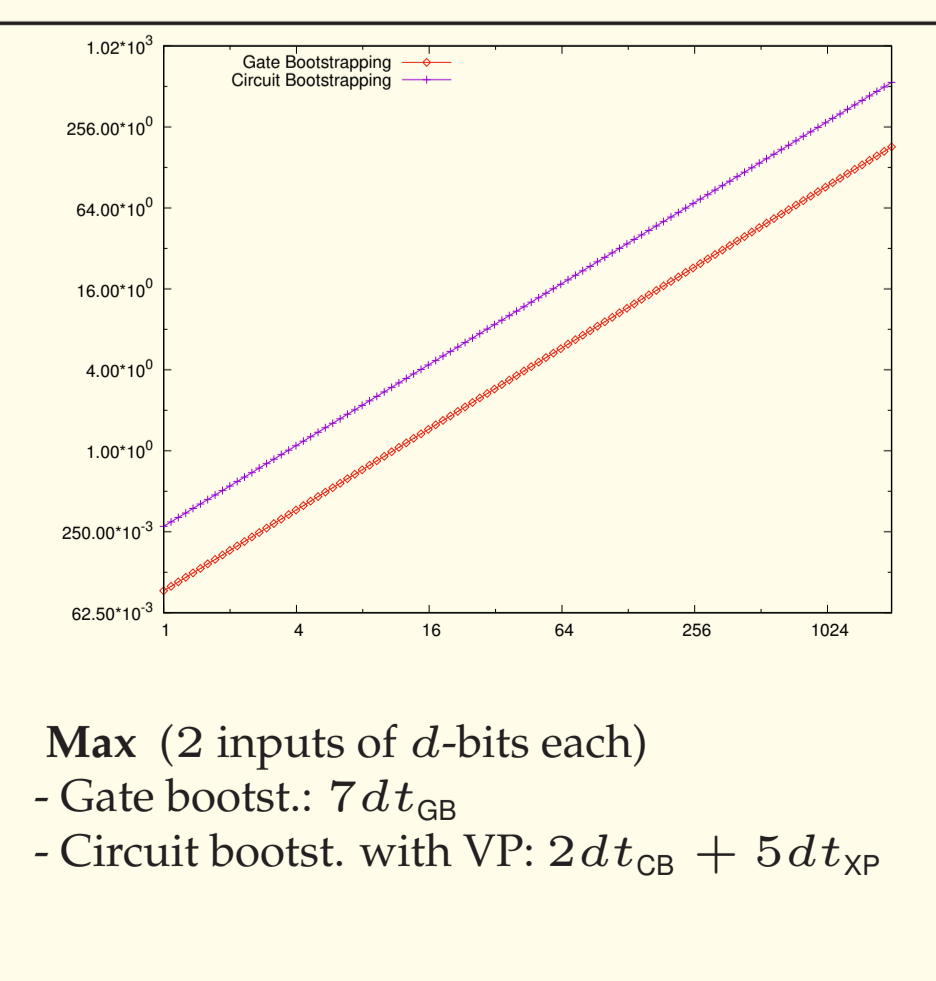
### n to 8-bit LUT

- LUT ( $d$ -bits input and  $s = 8$ -bits output)
- Gate bootst.:  $(d + s(2^d - 1))t_{GB}$
- Circuit bootst. with HP:  $dt_{CB} + (2^d - 1)t_{XP}$
- Circuit bootst. with VP:  $dt_{CB} + s(2^d/N - 1 + \log N)t_{XP}$

### Leveled HE MAX



### FHE MAX



- Leveled Max (2 inputs of  $d$ -bits each)
- No packing:  $3(d(d+1)/2)t_{XP}$
- Gate bootst.:  $5dt_{GB}$
- Det Weighted automata (Det WFA):  $5dt_{XP}$

- Max (2 inputs of  $d$ -bits each)
- Gate bootst.:  $7dt_{GB}$
- Circuit bootst. with VP:  $2dt_{CB} + 5dt_{XP}$