

Towards Stream Ciphers for Efficient FHE with Low-Noise Ciphertexts

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Joint work with:

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and Claude CARLET

Eurocrypt 2016 — Vienna, Austria

Monday May 9

Outsourcing Computation

Alice

Limited storage

Limited power

Store ?

Compute ?



Outsourcing Computation

Alice

Limited storage

Limited power

Store ✓

Compute ✓



Claude

Huge storage

Huge power



Outsourcing Computation

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Privacy ?



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Outsourcing Computation

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Limited power

Store ✓
Compute ✓

Privacy ✓



Claude

Huge storage
Huge power

Fully
Homomorphic
Encryption



FHE Framework

Alice

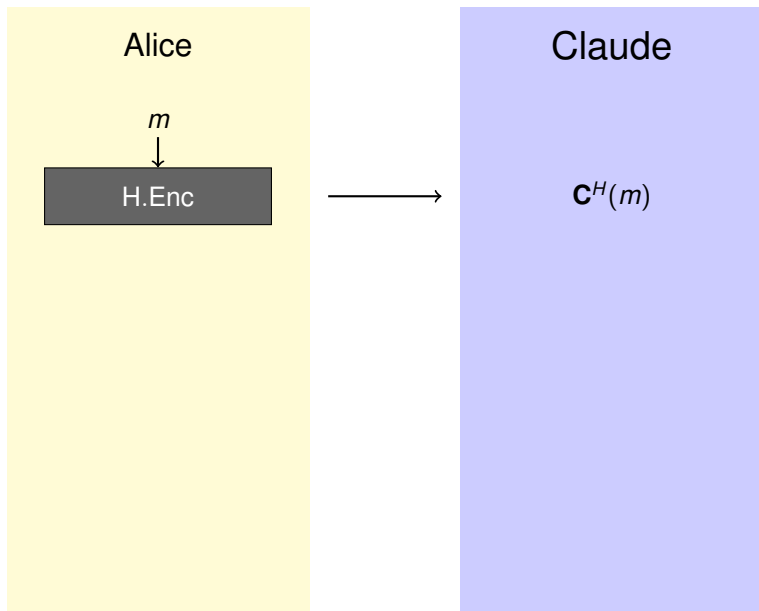
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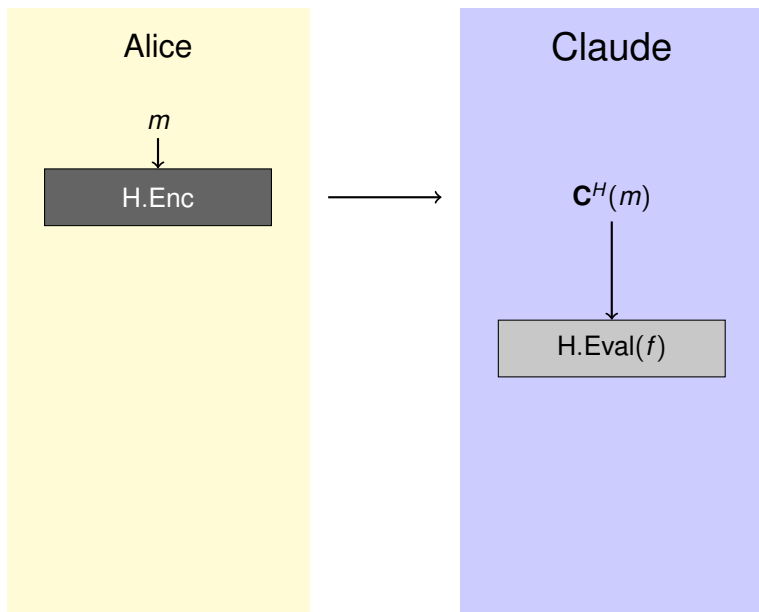
H.Enc

Claude

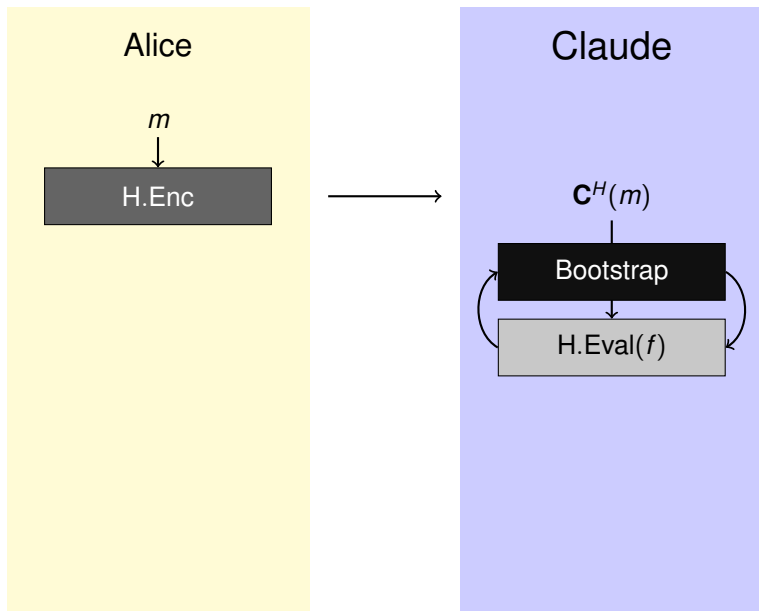
FHE Framework



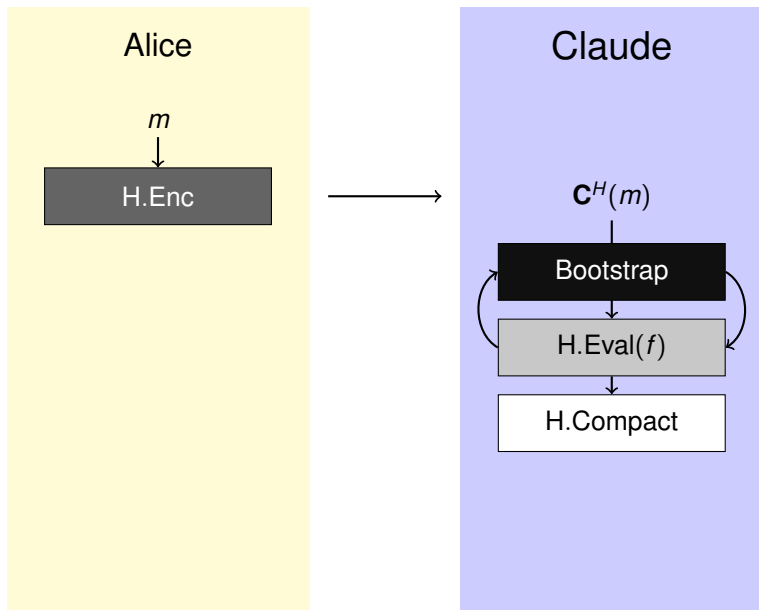
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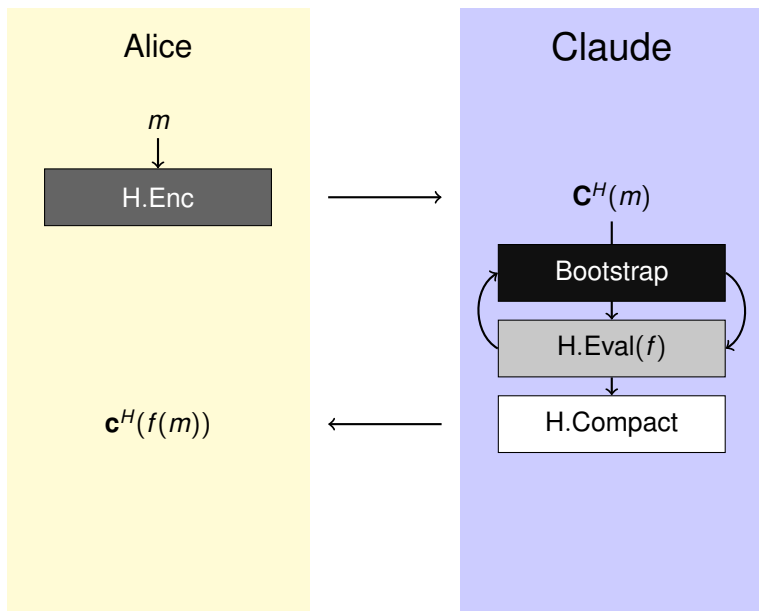
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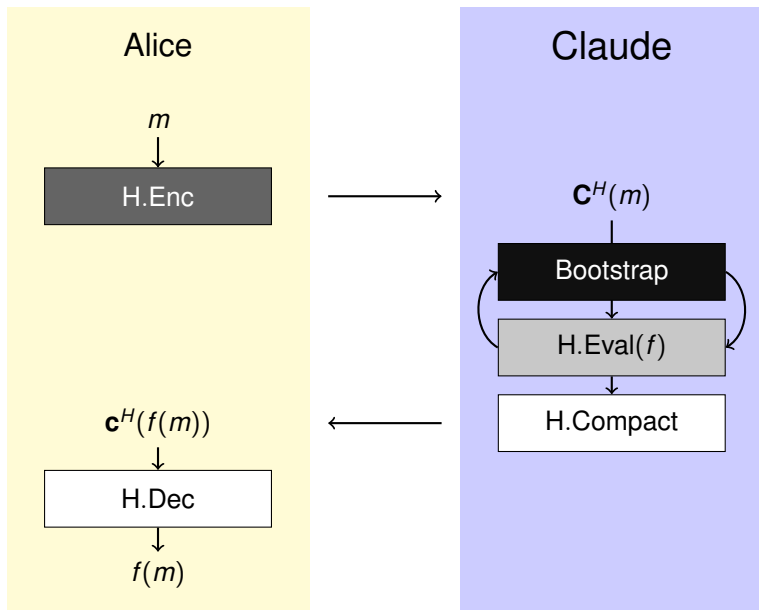
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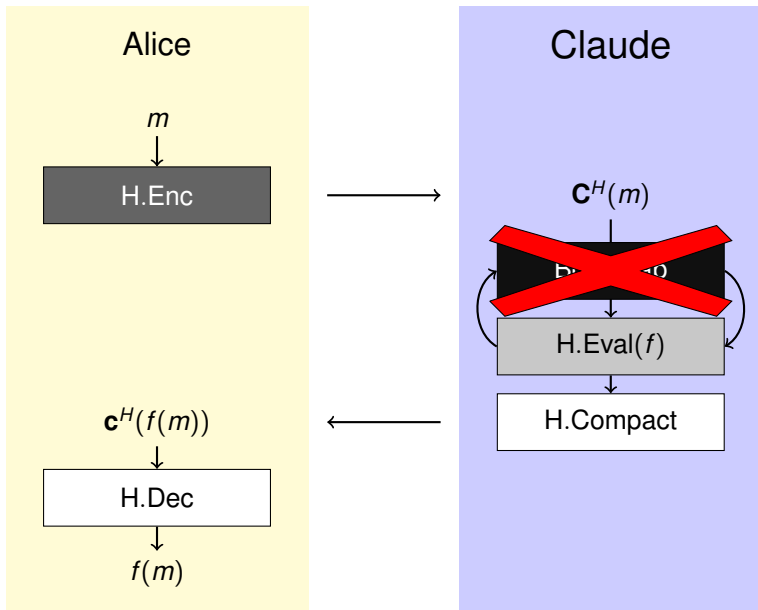
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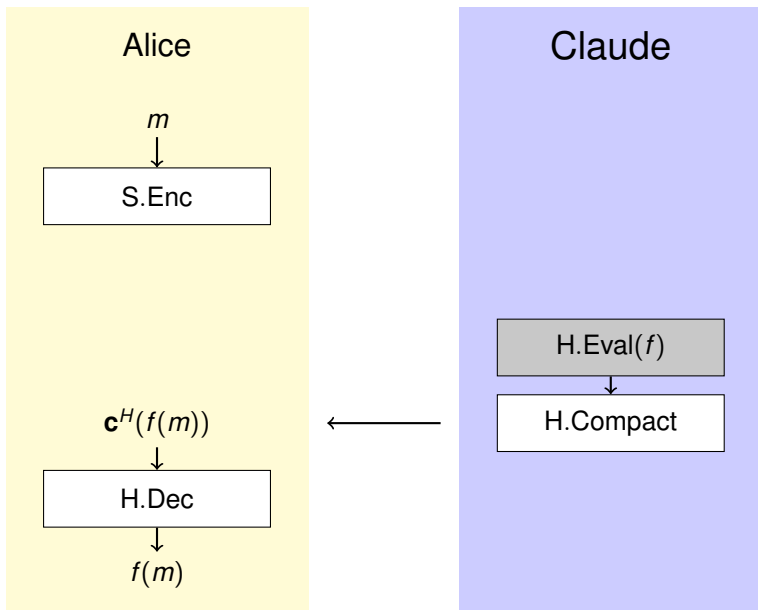
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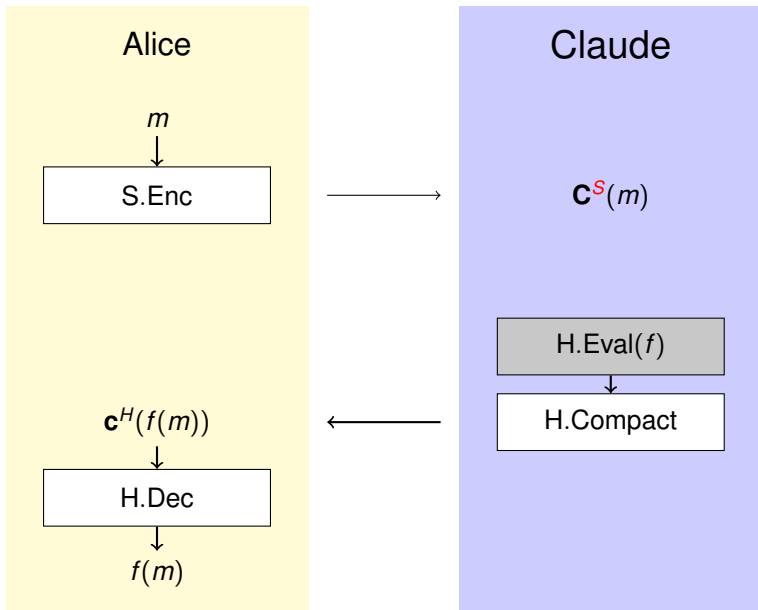
HE Framework



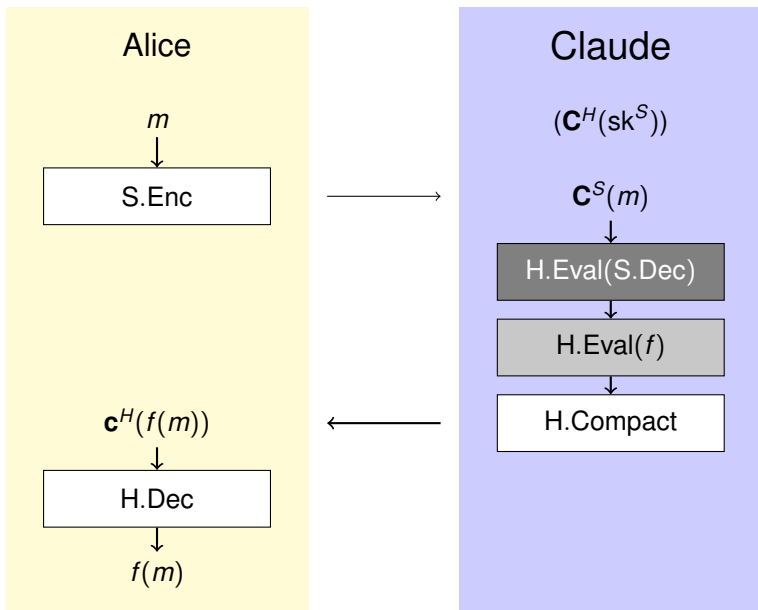
SE-HE Hybrid Framework



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SE-HE Hybrid Framework



Performance Metric (Intuition)

- ◇ Computational Cost

- ◇ Noise Increase

Performance Metric (Intuition)

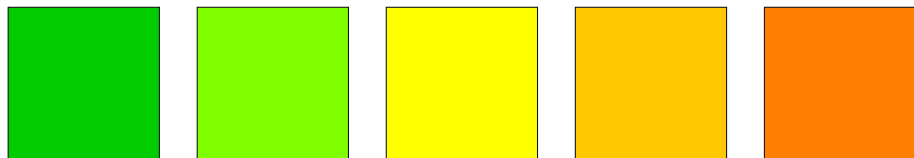
- ◇ Computational Cost \approx number of multiplications

- ◇ Noise Increase

Performance Metric (Intuition)

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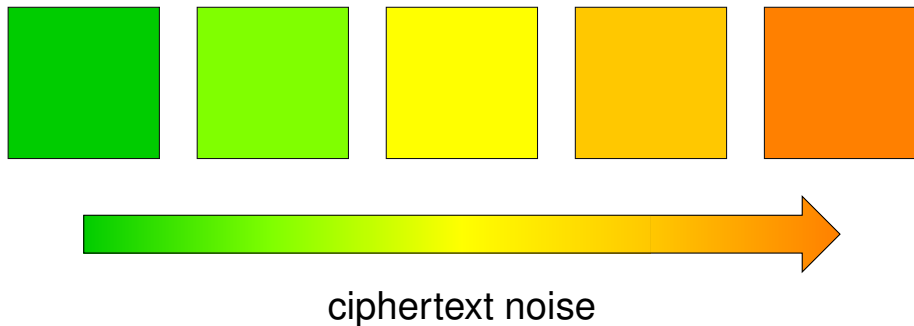
◇ Noise Increase



ciphertext noise

Performance Metric (Intuition)

- ◇ Computational Cost \approx number of multiplications
- ◇ Noise Increase \approx multiplicative depth



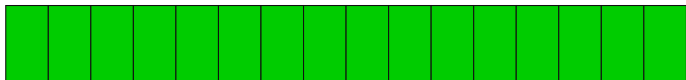
State of the Art



Internal State

State of the Art

Start



Internal State

Enc

Final CT



State of the Art: Block Ciphers

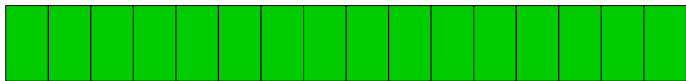
Start



Internal State

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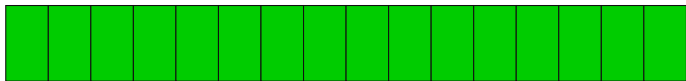


Round 1



State of the Art: Block Ciphers

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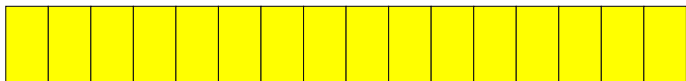


Round 1

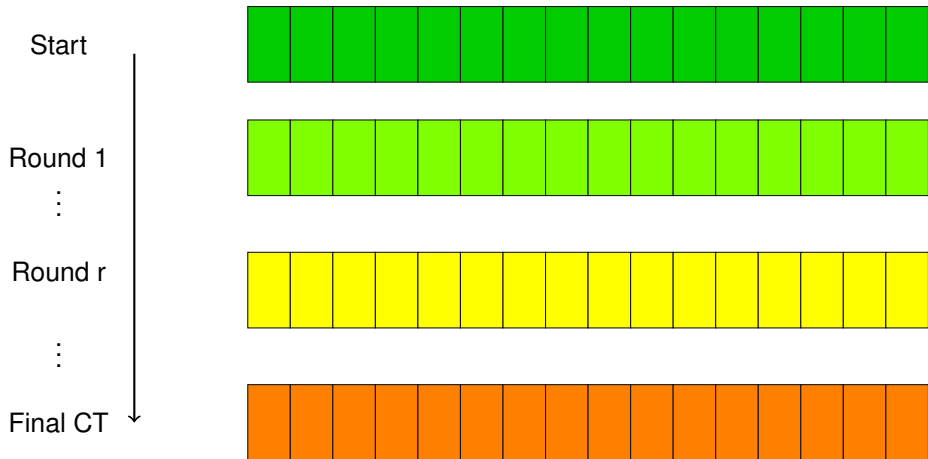


⋮

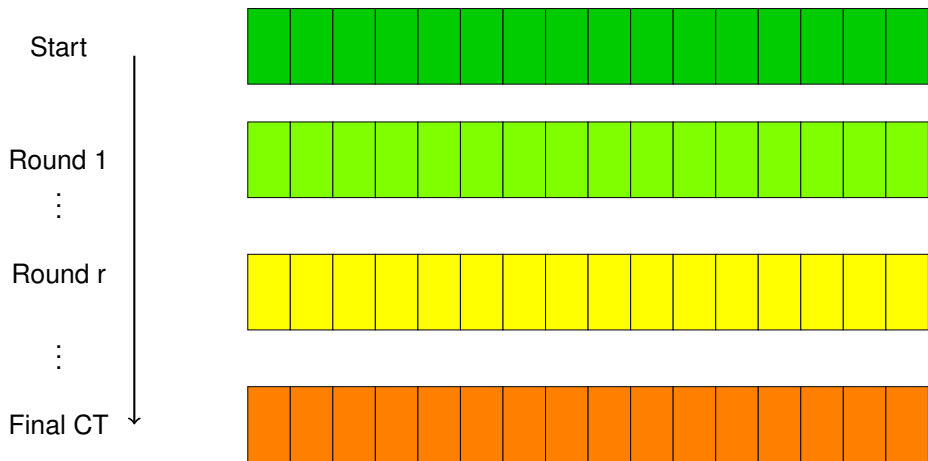
Round r



State of the Art: Block Ciphers



State of the Art: Block Ciphers



→ Constant but High Noise

AES[GHS12,CLT14], \dots , LowMC[ARS+15]

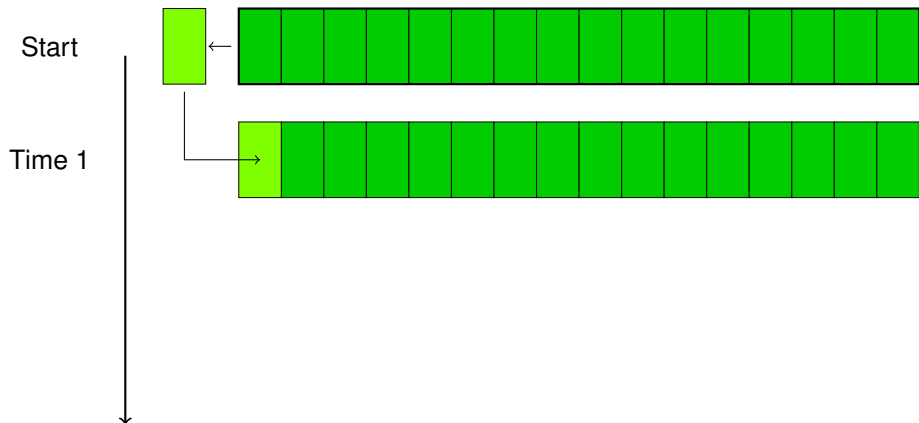
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Start

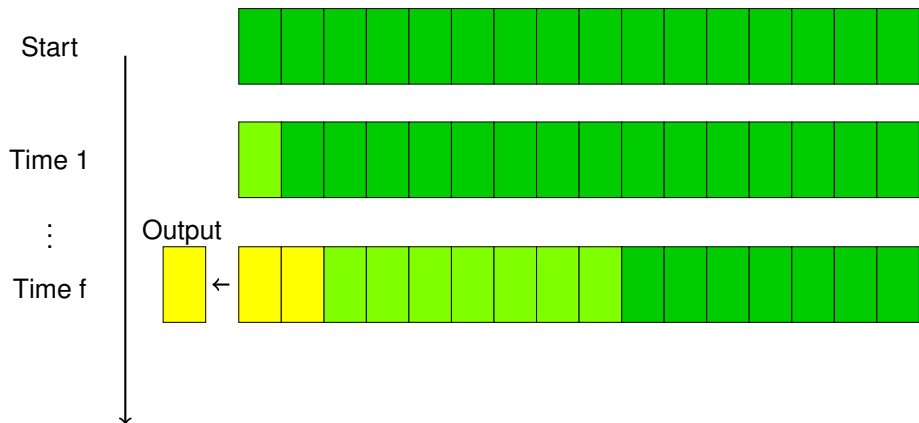


Internal State

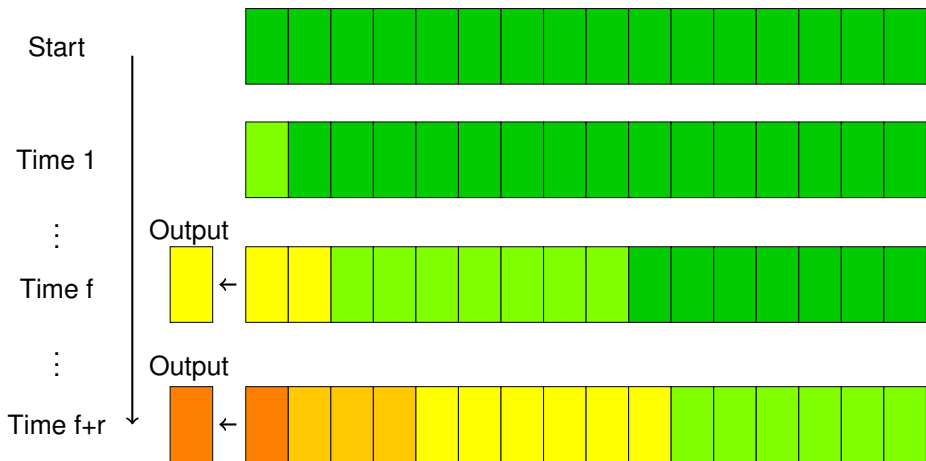
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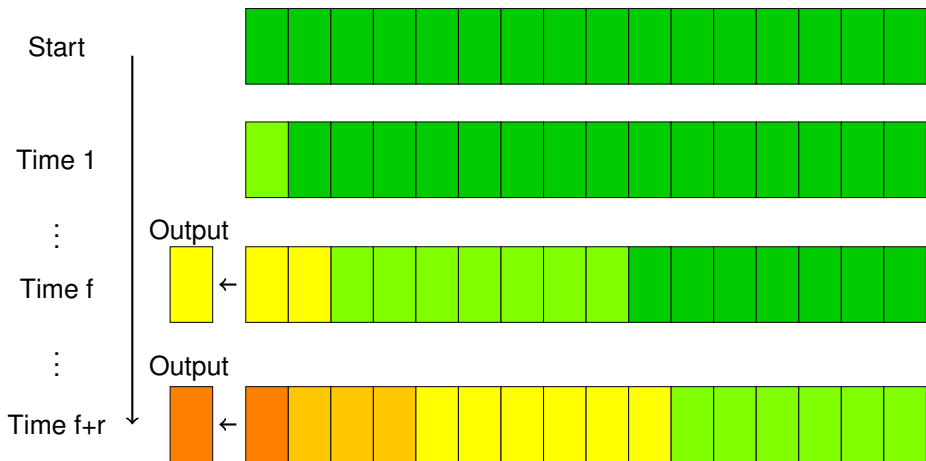
State of the Art: Stream Ciphers



State of the Art: Stream Ciphers



State of the Art: Stream Ciphers



→ Slowly Increasing Noise, Limited Output

Trivium, Kreyvium[CCF+15]

Our contributions

- ◇ Best of both worlds: Constant and Low noise increase

- ◇ Take advantage of 3rd generation FHE

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→ Filter Permutator

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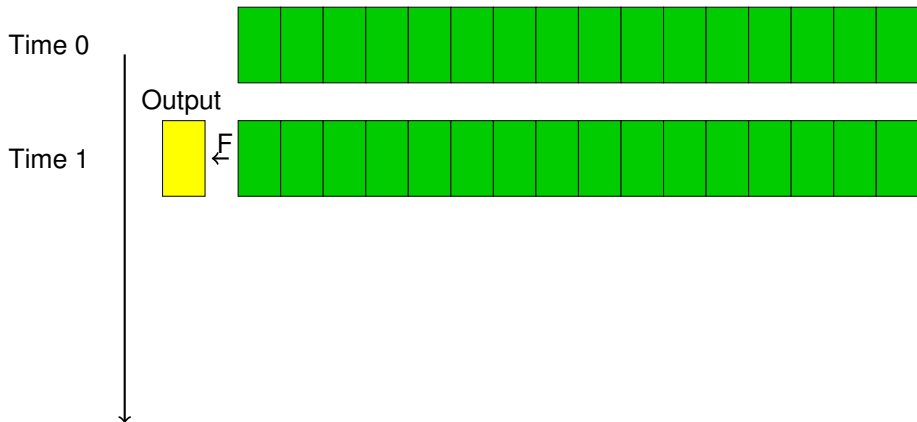
→ FLIP_F

Filter Permutator Error Increase

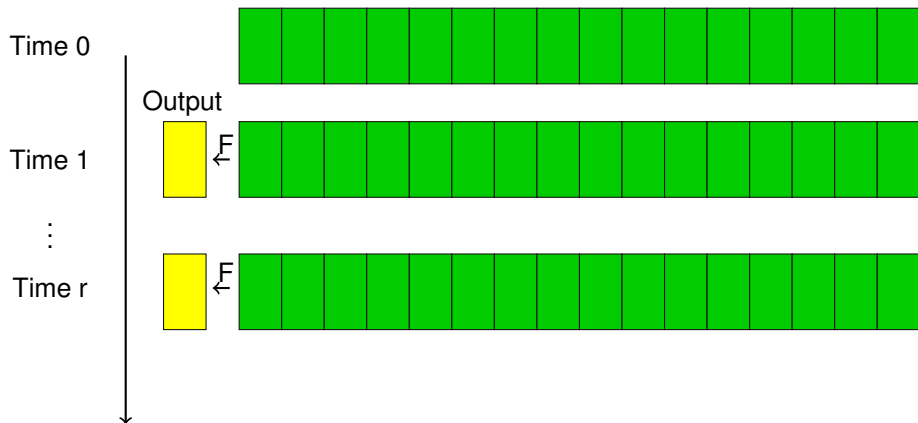
Time 0



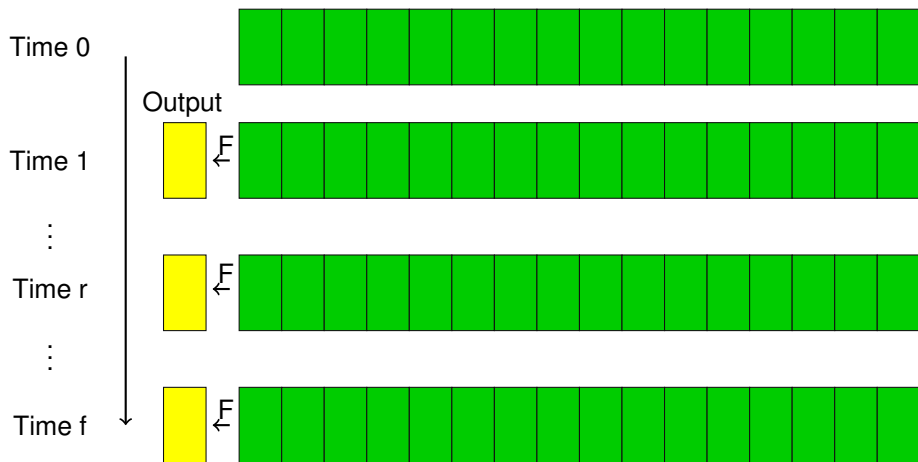
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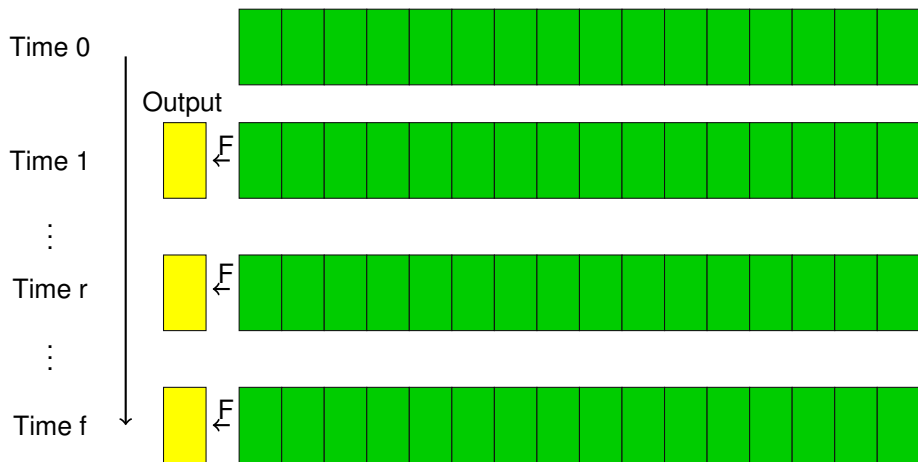
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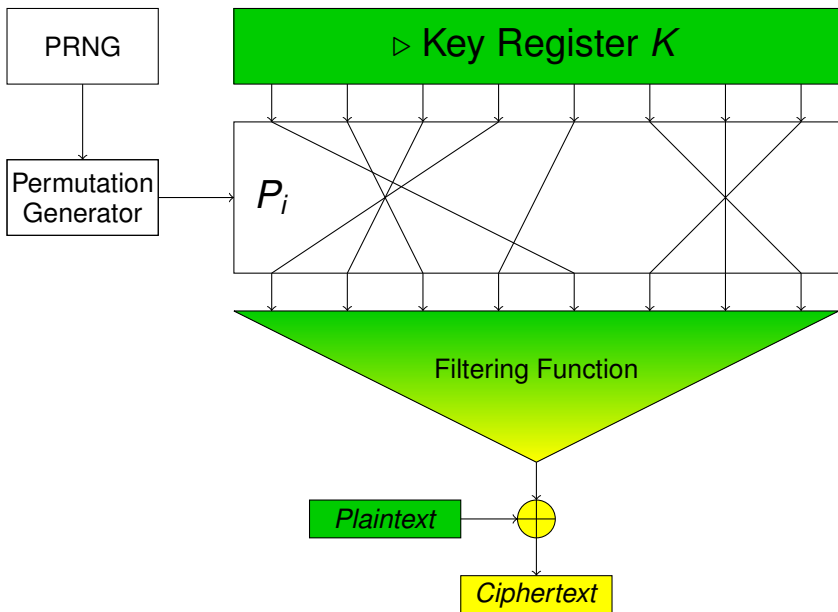


Filter Permutator Error Increase



→ Constant and Low Noise

Filter Permutator Construction



FLIP_F Construction

Components

- ▶ PRNG: forward secure PRNG based on AES-128
- ▶ Permutation Generator: Knuth Shuffle
- ▶ Filtering function $F = (n_1, n_2, \ell \Delta^h)$

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n_1 variables

x_1

\oplus

\vdots

\oplus

x_{n_1}

FLIP_F Construction

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- ▶ PRNG: forward secure PRNG based on AES-128
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n_2 variables

$$\begin{array}{r} x_1 \\ \oplus \\ \vdots \\ \oplus \\ x_{n_1} \end{array} \quad \begin{array}{r} y_1 y_2 \\ \oplus \\ \vdots \\ \oplus \\ y_{\frac{n_2}{2}-1} y_{\frac{n_2}{2}} \end{array}$$

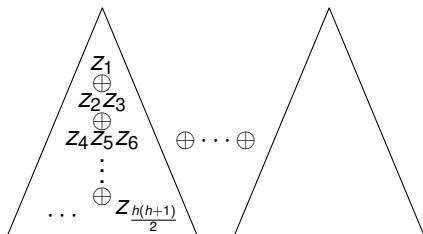
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x_1
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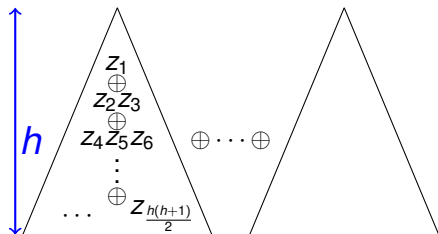
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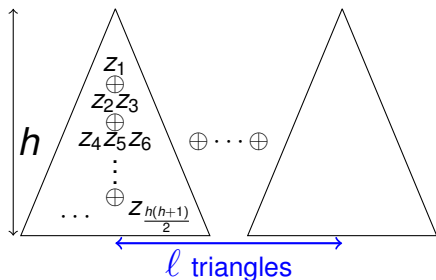


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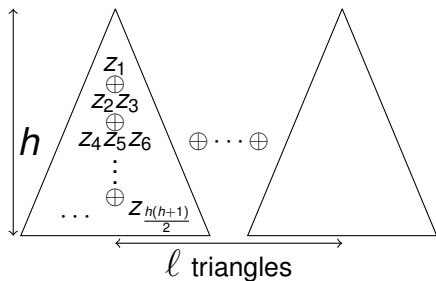
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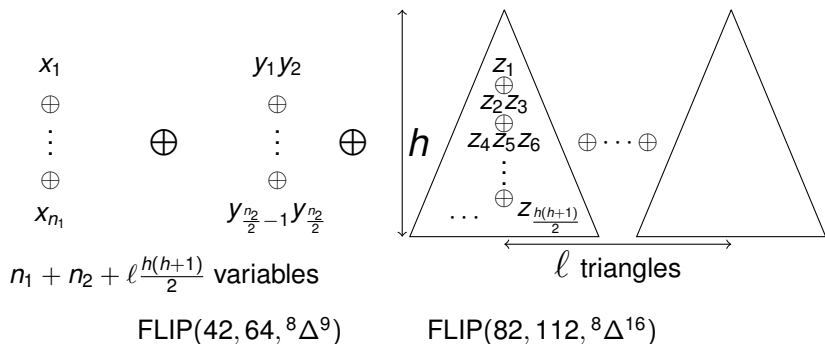
$n_1 + n_2 + \ell \frac{h(h+1)}{2}$ variables



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3rd generation FHE Ciphertexts (GSW)

$$\mathbf{sC} = \mu\mathbf{s} + \mathbf{e}$$

FLIP_F Homomorphic Behavior

3rd generation FHE Noise Growth

$$\begin{array}{l} \text{ciphertext (small)} \\ \swarrow \\ \mathbf{sC} \\ \nearrow \\ \text{secret key} \\ \approx \text{eigenvector} \end{array} = \begin{array}{l} \text{error (small)} \\ \swarrow \\ \mu \mathbf{s} \\ \nearrow \\ \text{plaintext} \\ \approx \text{eigenvalue} \end{array} + \mathbf{e}$$

3rd generation FHE Noise Growth

$$\mathbf{sC} = \mu\mathbf{s} + \mathbf{e}$$

H.Add : $\sum_{i=1}^k \mathbf{C}_i$ H.Mul : $\prod_{i=1}^k \mathbf{C}_i$

3rd generation FHE Noise Growth

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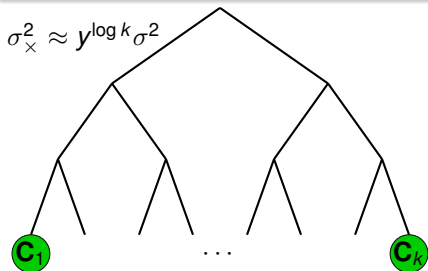
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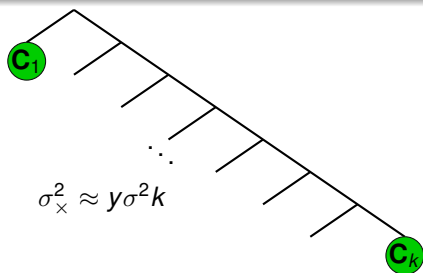
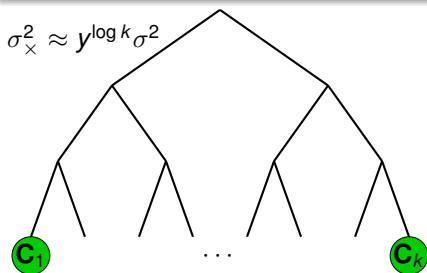
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3rd generation FHE Noise Growth: H.Eval(F)

$$\text{H.Eval}(F) \approx \text{H.Mul}$$

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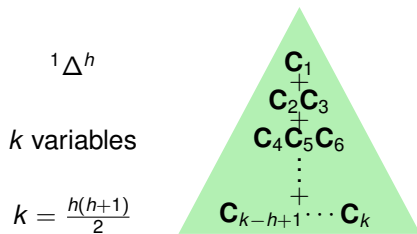
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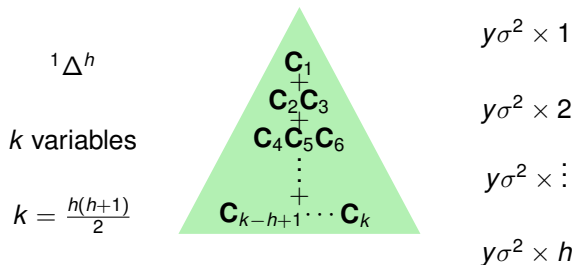


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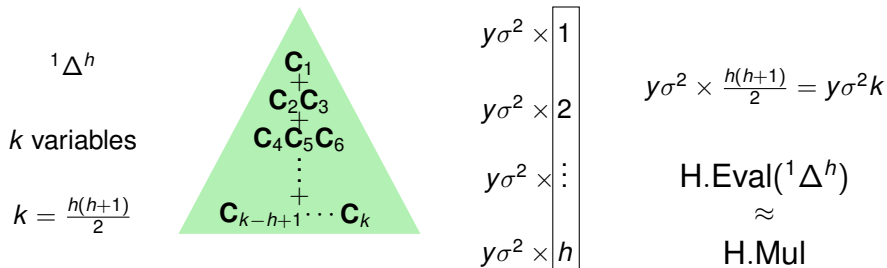
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FLIP_F Symmetric Behavior

Cryptanalysis Angle

"good" PRNG + "good" Shuffle \approx random Permutations; what about F ?

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Attacks on Filtering Function

- ▶ Algebraic
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- ▶ Correlation
- ▶ High Order Correlation
- ▶ G & D Attack [DLR16]
- ▶ etc

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Standard Criteria

- ▶ Algebraic Immunity
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- ▶ Resiliency
- ▶ Non Linearity

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Theorem (Triangular function and Algebraic Immunity)

$$\forall \ell \in \mathbb{N}^*, \forall k \in \mathbb{N}^* \quad \text{Al}(\ell \Delta^k) = k$$

Noise Increase Performances

- ◇ Tests on Ring-GSW (efficiency)
- ◇ Measure noise increase from fresh ciphertext to FLIP ciphertext:
 - ◇ Log of ciphertext error ($\log \sigma$)
 - ◇ Homomorphic capacity already used (%).

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Experimental error growth

Ring (n, ℓ)		FLIP	Fresh		H.Mul		H.Eval(FLIP)	
			$\log \sigma$	%	$\log \sigma$	%	$\log \sigma$	%
256	80	$42,128, {}^8\Delta^9$	13,07	17 %	19,82	25%	24,71	31%
512	120	$82,224, {}^8\Delta^{16}$	14,68	12 %	23,27	20%	28,77	24%

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→ FLIP evaluation \approx multiplication

→ Practical SE-HE framework.

Performances Comparisons

Error Increase Comparisons

Algorithm	Reference	Multiplicative Depth
AES-128	[GHS12]	40
SIMON-64/128	[LN14]	44
Prince	[DSE+14]	24
Kreyvium-12	[CCF+15]	12
LowMc-128	[ARS+15]	12
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Timing Comparisons

λ	Algorithm	L+7	Latency (sec)	Throughput (bits/min)
80	Trivium-13	20	11379.7	516.3
	FLIP(42, 128, $^8\Delta^9$)	12	17.39	2070.16
128	Kreyvium-12	19	4956.0	384.4
	LowMC-128	20	9977.1	739.0
	FLIP(82, 224, $^8\Delta^{16}$)	13	124.97	345.68

Filter Permutator

- ◇ New stream cipher family adapted to FHE
- ◇ Security of reduced degree and increased key size construction?
- ◇ Impact of design tweaks:
 - ◇ Whitening?
 - ◇ XOR of parallel Filter Permutator?

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- ◇ Optimal noise increase for 3rd generation FHE
- ◇ Efficient FHE framework
- ◇ Optimization for 2nd generation FHE?
- ◇ Refining security analysis:
 - ◇ Increasing/decreasing parameter sizes?
 - ◇ Boolean functions with fixed weight entries?

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