# Hitchhiker's Guide to a Practical Automated TFHE Parameter Setup for Custom Applications

Jakub Klemsa

jakub.klemsa@eurecom.fr



## **Motivation**

TFHE cipher is instantiated with 8 parameters:

- determine **security level** and plaintext/evaluation **error rate** 
  - $\Rightarrow$  parameters are **application-specific**,
- vast impact on **performance**  $\Rightarrow$  optimization problem,

 $\Rightarrow$  need for a tool for TFHE parameter setup.

Given application specifications:

- + fully automated TFHE parameter setup,
- + optimized for **best performance**,
- + unified approach  $\Rightarrow$  allows to **compare** different parameters:
  - $\circ\,$  same target security & error rates, aim for best parameters,
  - $\circ$  e.g., different homomorphization in digit-based arithmetics [1].

# **Application Specifications**

Specify application needs (security & error rates) by **three parameters**:

## Parameter Restrictions

Goal: bound the noise of a fresh(ly bootstrapped) sample, s.t. i. limited number of additions can be performed (cf.  $2^{2\Delta}$ ); and ii. the noise can be refreshed correctly during bootstrapping.  $2^{\pi}$  cleartext values  $\Rightarrow$  max error  $\stackrel{!}{<} \frac{1}{2^{\pi+1}} \dots$  by  $3\sigma$ -rule:  $V_{\max} \leq 2^{2\Delta}V_0 + V_{round} \stackrel{!}{\leq} \frac{1}{3^2 \cdot 2^{2\pi+2}}, \quad \text{where } V_{round} = \frac{n+1}{48N^2}.$  (4)  $V_0$  depends on implementation, for plain TFHE [3]:  $V_0 \leq 2nlN2^{2(\gamma-1)}V_{\mathsf{BK}}(N) + n(1+N)2^{-2(\gamma l+1)} + \mathsf{Var}(\mathsf{Err}(u,v)) + \frac{(\bullet)}{(\bullet)} = 0$  $+ tN2^{2(\kappa-1)}V_{\mathsf{KS}}(n) + \frac{2^{-2(\kappa t+1)}N}{(\bullet)}.$  (5)

To derive **good TFHE** parameters, we need to:

- i. satisfy the bound (4) (error budget), using (5); and
- ii. check their quality in terms of **bootstrapping time**.

- A. **bit-security level** denoted  $\lambda$ ;
- B. requested **cleartext space bit-precision** denoted  $\pi$ ; and
- C. bound on the number of homomorphic additions before the sample gets bootstrapped, denoted  $2^{2\Delta}$ , referred **quadratic weights**;

 $\Rightarrow$  input parameters for our TFHE parameter setup tool.

#### A. Bit-Security Level $\lambda$

Observation 1. At fixed security  $\lambda$ , the logarithm of stddev of LWE noise (den.  $\alpha$ ), is roughly linear in the LWE dimension n (with factor den.  $s_{\lambda}$ ):

$$-\log_2(\alpha) \approx s_\lambda \cdot n; \tag{1}$$

cf. Figure 1. Due to the **collision attack**, the relation is limited to  $n \ge 2\lambda$ , also the behavior changes for  $-\log_2(\alpha) > \tau$  with  $\tau$  the torus precision.



Figure 1: LWE bit-security level  $\lambda$  as estimated by the *LWE Estimator* by Albrecht et al. [2]. For  $\lambda = 128$  bits,  $s_{\lambda} \approx 0.0235$ .

#### **B.** Cleartext Space Bit-Precision $\pi$

Before selecting an appropriate  $\pi$ , bare in mind:

- i. complexity of TFHE bootstrapping is roughly **exponential** in  $\pi$ ,
  - practical times for up to  $\pi \approx 6$  bits (cf. Figure 2),

	$\mathbb{Z}/16\mathbb{Z}$ Demo: $\pi = 6, 2^{2\Delta} = 2$		Repo with
	Orig. param's [4]	New param's	exp. code
$N,n \ ; \ \gamma,l$	$2048,750\ ;\ 7,3$	$2048,766\ ;\ 21,1$	
$\kappa, t; \log(\alpha_{BK,KS})$	2,7; -52, -18	3,5; -48, -18	FF C
$\lambda \ ; \ t_{BS}$	$128.2$ ; $199.6 \mathrm{ms}$	$131.2$ ; $124.6 \mathrm{ms}$	
$\eta_C, \eta_m[\%]$	86.0, 85.5	91.2, 90.5	

Table 1: Original and newly identified TFHE parameters for the  $\mathbb{Z}/16\mathbb{Z}$  demo [4] with  $\pi = 6$  bits. 500 runs with Concrete [5] on Intel Core i7-7800X.  $\eta_C$  and  $\eta_m$  stand resp. for the usage of the  $3\sigma_{\max}$  error budget as calculated by Concrete and as measured after decryption. Experimental code at https://gitlab.eurecom.fr/fakub/tfhe-param-testing.



ii. bootstrapping Look-Up Table (LUT) is inherently **negacyclic**:  $LUT(2^{\pi-1}+m) = -LUT(m), \quad m \in [0, 2^{\pi-1}].$  (2)

#### C. Quadratic weights $2^{2\Delta}$

Observation 2. LWE noises accumulate with each homomorphic addition: for indep. TLWE samples  $\mathbf{c}_i$  with equal noise variance denoted  $V_0$ :

$$/\operatorname{ar}\left(\operatorname{Err}\left(\sum w_{i} \cdot \mathbf{c}_{i}\right)\right) = \underbrace{\sum w_{i}^{2}}_{2^{2\Delta}} \cdot \underbrace{\operatorname{Var}(\operatorname{Err}(\mathbf{c}_{i}))}_{V_{0}}, \quad w_{i} \in \mathbb{Z}.$$
 (3)

To ensure **correct LUT evaluation** during bootstrapping:

- **bound** on  $2^{2\Delta}$  before a sample gets bootstrapped (refresh noise),
- $2^{2\Delta}$  ... sum of squared weights;  $\Delta$  ... bits of stddev of addit'l noise.

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Figure 2: Bootstrapping times of best TFHE parameters with  $\eta_C < 100\%$  for various scenarios, chosen automatically. The width of the bars represents  $l \in [\![1,4]\!]$ . Hatched bars represent incorrect results, presumably due to  $\log(\alpha) < -64$  being out of Concrete's v0.1.11 supported range.

#### References

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