

# BIKE

## Bit-flipping Key Encapsulation

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# Agenda

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- BIKE Overview

- Key Features
- Performance
- Specification
- Security
- Modes of usage

- BIKE Decoding

- Improved Results



# Key Features

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- Competitive performance
  - “*BIKE has **the most competitive performance** among the non-lattice based KEMs*” [NIST-IR8413]
- Robust security
  - Based on **well-known** coding-theory problems
  - Foundational cryptosystem was proposed **more than a decade ago** [MTSB'13]
- Simple implementation
  - Polynomial ring arithmetic
  - Bit flipping decoding



# BIKE Performance

## Security Level 1

	Communication Bandwidth (bytes)		Speed (kcycles)		
	Public Key	Ciphertext	Key Generation	Encapsulation	Decapsulation
<b>BIKE</b>	1,540	1,572	589	97	1,135
<b>HQC</b>	2,249	4,497	187	419	833
<b>Classic McEliece</b>	261,120	128	140,870	46	137
<b>Kyber</b>	800	768	123	155	289

BIKE performance numbers from Drucker, Gueron, Kostic, "Additional implementation of BIKE (Bit Flipping Key Encapsulation)".  
<https://github.com/aws-labs/bike-kem>



# BIKE Performance

## Security Level 3

	Communication Bandwidth (bytes)		Speed (kcycles)		
	Public Key	Ciphertext	Key Generation	Encapsulation	Decapsulation
<b>BIKE</b>	3,082	3,114	1,823	223	3,887
<b>HQC</b>	4,522	9,042	422	946	1,662
<b>Classic McEliece</b>	524,160	188	441,517	83	273
<b>Kyber</b>	1,184	1,088	213	249	275

BIKE performance numbers from Drucker, Gueron, Kostić, "Additional implementation of BIKE (Bit Flipping Key Encapsulation)".  
<https://github.com/aws-labs/bike-kem>



# BIKE Overview

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- Niederreiter-based KEM instantiated with QC-MDPC codes.
- Leverage Fujisaki-Okamoto Transform [DGKP'21].
- **[New]** State-of-the-art QC-MDPC Decoding Failure Rate analysis.
- **[New]** BIKE-Flip Decoder with strengthened resilience to weak keys.



# BIKE Overview

- Block circulant matrices are isomorphic to  $\mathcal{R} = \mathbb{F}_2[x]/(x^r - 1)$ .
- Index 2 Quasi-Cyclic codes admit a parity check matrix ( $n = 2r$ )

$$H = \begin{array}{|c|c|} \hline h_0 & h_1 \\ \hline \circlearrowleft & \circlearrowleft \\ \hline \end{array} \quad \text{with } (h_0, h_1) \in \mathcal{R}^2$$

- QC-MDPC if  $w = |h_0| + |h_1| \approx \sqrt{n}$ .
- Decoding: find  $(e_0, e_1) \in \mathcal{R}^2$  s.t.  $s = e_0 h_0 + e_1 h_1$  for small  $t = |e_0| + |e_1|$ .
- Bit-flipping decoders succeed (i.e.  $(e_0, e_1) = \text{decode}(e_0 h_0 + e_1 h_1, h_0, h_1)$ ) with high probability if  $t \approx w \approx \sqrt{n}$ .

# BIKE Specification

<b>KeyGen</b> : $() \mapsto (h_0, h_1, \sigma), h$ Output: $(h_0, h_1, \sigma) \in \mathcal{H}_w \times \mathcal{M}, h \in \mathcal{R}$ 1: $(h_0, h_1) \xleftarrow{\mathcal{D}} \mathcal{H}_w \triangleright (1)$ 2: $h \leftarrow h_1 h_0^{-1}$ 3: $\sigma \xleftarrow{\$} \mathcal{M}$	<b>Encaps</b> : $h \mapsto K, c$ Input: $h \in \mathcal{R}$ Output: $K \in \mathcal{K}, c \in \mathcal{R} \times \mathcal{M}$ 1: $m \xleftarrow{\$} \mathcal{M}$ 2: $(e_0, e_1) \leftarrow \mathbf{H}(m)$ 3: $c \leftarrow (e_0 + e_1 h, m \oplus \mathbf{L}(e_0, e_1))$ 4: $K \leftarrow \mathbf{K}(m, c)$
<b>Decaps</b> : $(h_0, h_1, \sigma), c \mapsto K$ Input: $((h_0, h_1), \sigma) \in \mathcal{H}_w \times \mathcal{M}, c = (c_0, c_1) \in \mathcal{R} \times \mathcal{M}$ Output: $K \in \mathcal{K}$ 1: $e' \leftarrow \text{decoder}(c_0 h_0, h_0, h_1) \triangleright e' \in \mathcal{R}^2 \cup \{\perp\}$ 2: $m' \leftarrow c_1 \oplus \mathbf{L}(e') \triangleright \text{with the convention } \perp = (0, 0)$ 3: <b>if</b> $e' = \mathbf{H}(m')$ <b>then</b> $K \leftarrow \mathbf{K}(m', c)$ <b>else</b> $K \leftarrow \mathbf{K}(\sigma, c)$	

## Parameters

$r$  : block length  
 $w$  : row weight  
 $t$  : error weight  
 $\ell$  : shared secret size  
 $\mathcal{M}$  : message space in  $\{0, 1\}^\ell$   
 $\mathcal{K}$  : key space in  $\{0, 1\}^\ell$

## NOTATION

$\mathbb{F}_2$ :	Binary finite field.
$\mathcal{R}$ :	Cyclic polynomial ring $\mathbb{F}_2[X]/(X^r - 1)$ .
$\mathcal{H}_w$ :	Private key space $\{(h_0, h_1) \in \mathcal{R}^2 \mid  h_0  =  h_1  = w/2\}$
$\mathcal{E}_t$ :	Error space $\{(e_0, e_1) \in \mathcal{R}^2 \mid  e_0  +  e_1  = t\}$
$ g $ :	Hamming weight of a binary polynomial $g \in \mathcal{R}$ .
$u \xleftarrow{\$} U$ :	Variable $u$ is sampled uniformly at random from the set $U$ .
$\oplus$ :	exclusive or of two bits, componentwise with vectors

## Functions

- $\mathbf{H} : \mathcal{M} \rightarrow \mathcal{E}_t$ .
- $\mathbf{K} : \mathcal{M} \times \mathcal{R} \times \mathcal{M} \rightarrow \mathcal{K}$ .
- $\mathbf{L} : \mathcal{R}^2 \rightarrow \mathcal{M}$





# BIKE Security

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- **Assumption 1.** Hardness of  $QCSD_{r,t}$
- **Assumption 2.** Hardness of  $QCCF_{r,w}$
- **Assumption 3.** Correctness of the decoder.

BIKE is proven IND-CPA secure under assumptions 1 and 2.

BIKE is proven IND-CCA secure under assumptions 1, 2, and 3.



# BIKE Security

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$QCSD_{(r,t)}$ : Quasi-Cyclic Syndrome Decoding.

Instance:  $(h, s) \in \mathcal{R}_{odd} \times \mathcal{R}_{p(t)}$  an integer  $t > 0$ .

Property: There exists  $(e_0, e_1) \in \mathcal{E}_t$  such that  $e_0 + e_1 h = s$ .

$QCCF_{(r,w)}$ : Quasi-Cyclic Codeword Finding

Instance:  $h \in \mathcal{R}_{odd}$ , an even integer  $w > 0$ , with  $w/2$  odd.

Property: There exists  $(h_0, h_1) \in \mathcal{H}_w$  such that  $h_1 + h_0 h = 0$ .

**Decoding correctness:** refers to [HHK'17] where a KEM is  $\delta$ -correct if the decapsulation fails with probability at most  $\delta$  on average over all keys and messages. Similarly, a decoder will be  $\delta$ -correct if its failure rate is at most  $\delta$  on average when the input is drawn uniformly.



# BIKE Practical Security

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- The best techniques to solve codeword finding and syndrome decoding:
  - Variants of Prange's Information Set Decoding (ISD) [Pran62]
- Work factor of any ISD variant  $A$  to decode  $t$  errors in a  $(n, k)$ -binary code:

$$WF_A(n, k, t) = 2^{ct(1+o(1))}$$

- The quasi-cyclic case
  - Codeword finding and decoding are a bit easier for quasi-cyclic codes.
  - Adversary gains a factor  $r$  for codeword finding and factor  $\sqrt[r]{r}$  for decoding
- The best quantum attack against BIKE
  - Grover's algorithm [Gro96] applied to ISD



# BIKE - Modes of Usage

- **BIKE can use different decoders without affecting interoperability.**
  - The decoder must be implementable in constant-time to avoid side-channel attacks, and its DFR must be low enough to match the security requirement.
- **BIKE ephemeral keys usage.**
  - The party that initiates a session needs to: a) Generate a fresh private/public key pair for every session; b) Refuse to decapsulate more than one incoming ciphertext with that key.
  - The IND-CPA security property suffices for this type of usage.
- **BIKE long-term static keys usage.**
  - This usage requires IND-CCA security and therefore a low enough DFR for the specified decoder (see next discussion). However, this usage model implies the loss of forward secrecy.

*Nicolas' Slides on Decoding and DFR recent results.*



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- [DGK]: Drucker, Gueron, Kostic, "Additional implementation of BIKE (Bit Flipping Key Encapsulation)". <https://github.com/awslabs/bike-kem>.
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- [GHJ'22]: Qian Guo, Clemens Hlauschek, Thomas Johansson, Norman Lahr, Alexander Nilsson, and Robin Leander Schröder. Don't reject this: Key-recovery timing attacks due to rejection-sampling in HQC and BIKE. IACR Trans. Cryptogr. Hardw. Embed. Syst., 2022(3):223–263, 2022.
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- [MTSB'13]: Misoczki, Rafael, Jean-Pierre Tillich, Nicolas Sendrier, and Paulo SLM Barreto. "MDPC-McEliece: New McEliece variants from moderate density parity-check codes." In 2013 IEEE international symposium on information theory, pp. 2069-2073. IEEE, 2013.
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# Questions?

<https://bikesuite.org>



# BIKE Decoding Failure

## Weak Keys & Error Floors

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NIST PQC Seminars, September 27, 2024



# **Introduction:**

## **BIKE Security & DFR**

## QC-MDPC (Quasi-Cyclic Moderate Parity Check) Codes

Block circulant  $r \times r$  binary matrices are isomorphic to  $\mathcal{R} = \mathbb{F}_2[x]/(x^r - 1)$

—

Index 2 QC codes admit a parity check matrix ( $n = 2r$ )

$$H = \begin{array}{|c|c|} \hline \boxed{h_0} & \boxed{h_1} \\ \hline \text{⤿} & \text{⤿} \\ \hline \end{array} \quad \text{with } (h_0, h_1) \in \mathcal{R}^2$$

QC-MDPC if  $w = |h_0| + |h_1| \approx \sqrt{n}$

—

Decoding: find  $(e_0, e_1) \in \mathcal{R}^2$  s.t.  $s = e_0 h_0 + e_1 h_1$  for small  $t = |e_0| + |e_1|$

Bit-flipping decoding succeeds\* with high probability if  $t \approx w \approx \sqrt{n}$

\*successful decoding means  $(e_0, e_1) = \text{decode}(e_0 h_0 + e_1 h_1, h_0, h_1)$



# BIKE

McEliece (Niederreiter) scheme with index 2 binary QC-MDPC codes

$$\mathcal{R} = \mathbb{F}_2[x]/(x^r - 1)$$

$$\mathcal{H}_w = \{(h_0, h_1) \in \mathcal{R}^2 \mid |h_0| = |h_1| = d = w/2\}$$

$$\mathcal{E}_t = \{(e_0, e_1) \in \mathcal{R}^2 \mid |e_0| + |e_1| = t\}$$

**Secret:**  $(h_0, h_1) \in \mathcal{H}_w$

**Public:**  $h = h_0^{-1}h_1 \in \mathcal{R}$

**Encrypt:**  $(e_0, e_1) \in \mathcal{E}_t \mapsto c = e_0 + he_1$

**Decrypt:**  $c \mapsto (e_0, e_1) = \text{decode}(h_0c, h_0, h_1)$

Security	$\lambda$	$r$	$d$	$t$
Level 1	128	12 323	71	134
Level 3	192	24 659	103	199
Level 5	256	40 973	137	264



## Decoding Failure Rate

$$\mathcal{R} = \mathbb{F}_2[x]/(x^r - 1)$$

$$\mathcal{H}_w = \{(h_0, h_1) \in \mathcal{R}^2 \mid |h_0| = |h_1| = d = w/2\}$$

$$\mathcal{E}_t = \{(e_0, e_1) \in \mathcal{R}^2 \mid |e_0| + |e_1| = t\}$$

*Decoding Failure Rate:*

$$\text{DFR} = \Pr((e_0, e_1) \neq \text{decode}(e_0 h_0 + e_1 h_1, h_0, h_1))$$

with  $(e_0, e_1)$  and  $(h_0, h_1)$  uniformly distributed in  $\mathcal{E}_t$  and  $\mathcal{H}_w$



## DFR & CCA Security

IND-CCA reduction [HHK17]: breaking BIKE requires a computational effort

$$\geq \min \left( \frac{1}{\text{DFR}}, 2^{\lambda_{\text{CPA}}} \right)$$

$2^{\lambda_{\text{CPA}}}$ : “hardness of decoding”

Proving  $\text{DFR} \leq 2^{-\lambda}$  (e.g.  $\lambda = 128$ ) by simulation is out of reach

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High DFR allows failure attacks:

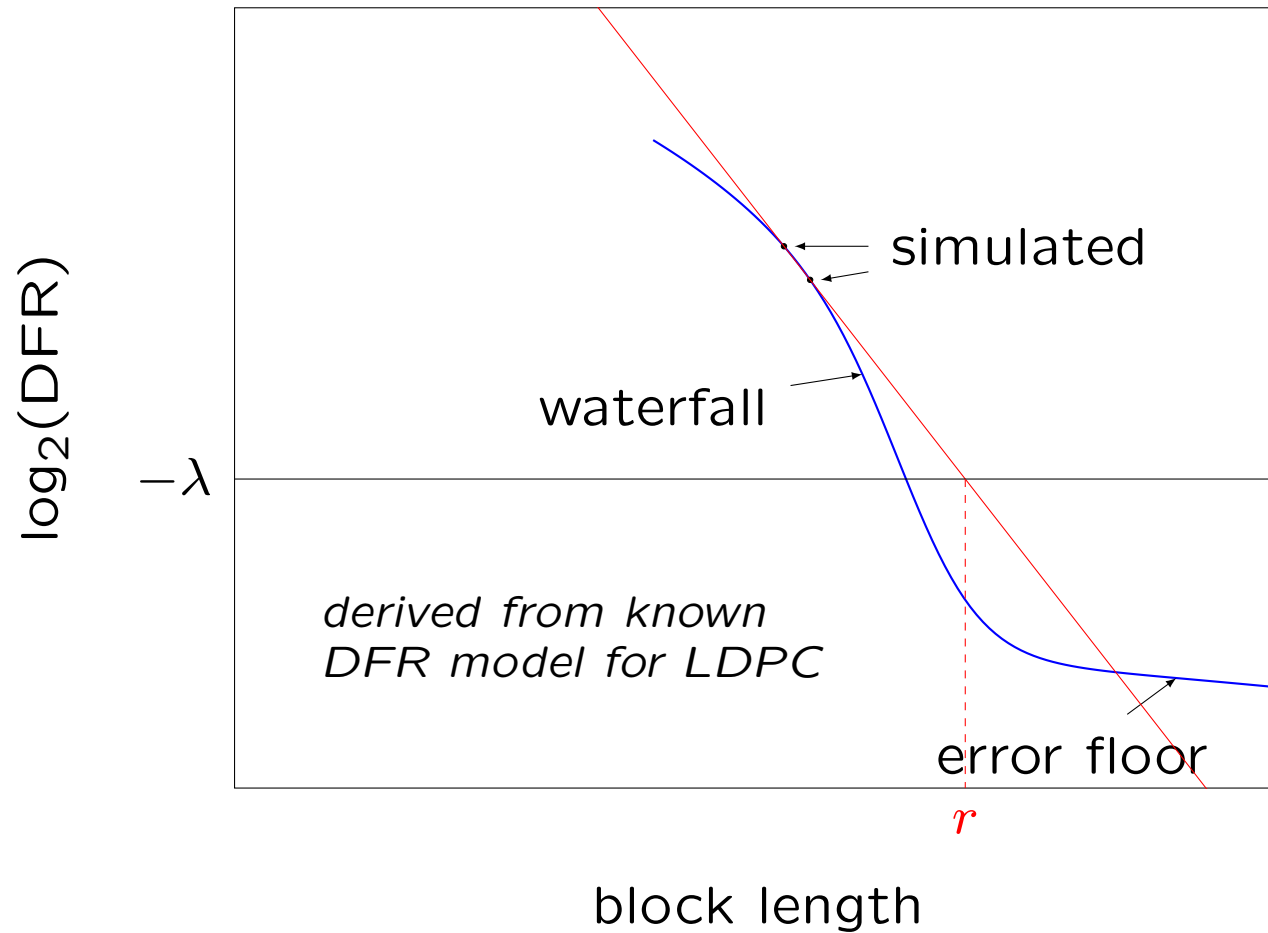
[Guo, Johansson, Stankovski, Asiacrypt 2016]

[Wang, Wang, Wang, Crypto 2023]

[HHK17] Hofheinz, Hövelmanns, Kiltz, *A modular analysis of the Fujisaki-Okamoto transformation*, TCC 2017



## BIKE DFR Estimates (1)

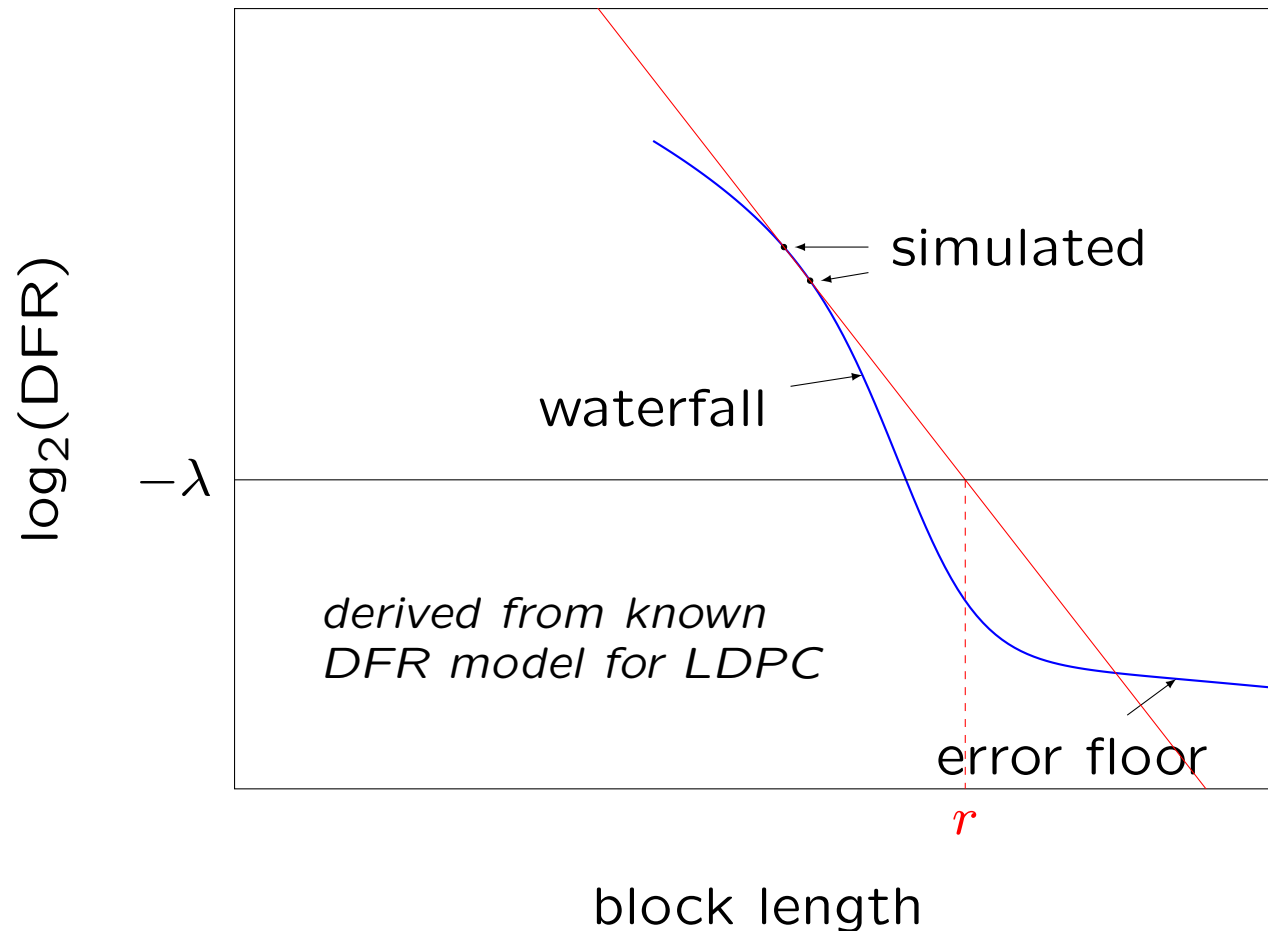


Fix the row weight  $w$  and the error weight  $t$

The failure rate can be measured for small block length  $r$



## BIKE DFR Estimates (2)



There are models for the waterfall region allowing extrapolation:  
asymptotic [Tillich, 2018], Markovian [Sendrier, Vasseur, 2019]

There are works in progress to model the error floor region



# Roadmap

Introduction: BIKE Security & DFR

**I.** Coordinate Distance Spectrum

**II.** Weak Keys

**III.**  $m$ -gathering Weak Keys

**IV.1**  $m$ -gathering Key Spectrum

**IV.2** Bogus Positions

**IV.** New BIKE Decoder

**V.** Weak Keys and Error Floors: Perspectives and Open Questions





# **I. Coordinate Distance Spectrum**

# Coordinate Distance Spectrum and Multiplicity

[Guo, Johansson, Stankovski, Asiacrypt 2016]

Distance spectrum,  $h \in \mathcal{R} = \mathbb{F}_2[x]/(x^r - 1)$

$$\text{Sp}(h) = \{d(i, j) \mid h_i = h_j = 1\}.$$

Coordinate distance

$$d(i, j) = \min(i - j \bmod r, j - i \bmod r), \quad 0 \leq d(i, j) \leq \lfloor r/2 \rfloor,$$

Multiplicity

$$\mu(\delta, h) = \left| \{(i, j) \mid h_i = h_j = 1, 0 \leq i \leq j < r, d(i, j) = \delta\} \right|.$$



## Spectrum Model

Model: draw  $d(d-1)/2$  elements uniformly in  $\{1, \dots, (r-1)/2\}$  with repetition.

Ex:  $(r, d) = (12323, 71)$   $h \in \mathcal{R}$  uniform of weight  $d$

	Model	Simulation
$ \text{Sp}(h) $	2045.1	2054.4
$\mu = 1$	1660.4	1675.4
$\mu = 2$	334.8	332.1
$\mu = 3$	44.98	42.64
$\mu = 4$	4.53	3.99
$\mu = 5$	0.36	0.29
$\mu = 6$	0.024	0.017

$$\frac{r-1}{2} = 6161$$

$$\frac{d(d-1)}{2} = 2485$$

(each row gives the average number of distances with multiplicity  $\mu$ )

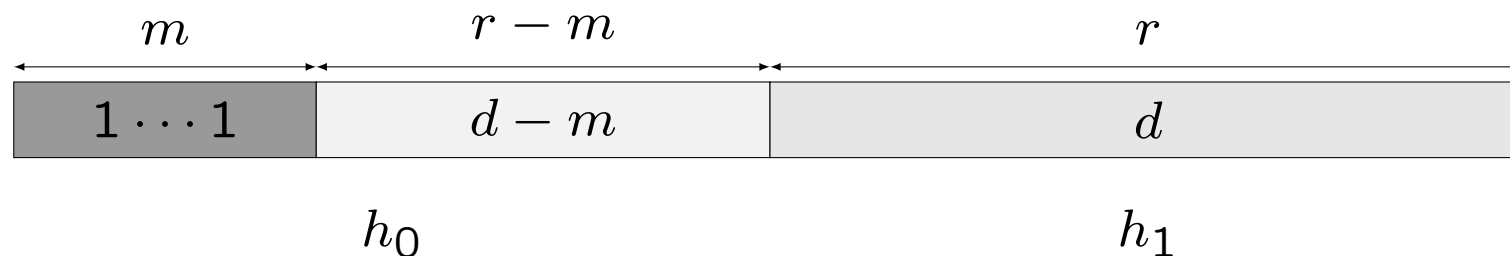


## II. Weak Keys

## Known Weak Keys

Parameter  $m > 0$ ,  $m < d$ , typical value 10 to 30

**Type I:** [Drucker, Gueron, Kostic, 2019]



+ blockwise rotation + isomorphisms  $x \mapsto x^i$ ,  $0 \leq i < r$

→ multiplicities  $m - 1, m - 2, \dots$  appear once

**Type II:** [Vasseur, 2021] one distance has multiplicity  $\geq m$

**Type III:** [Vasseur, 2021] one inter-block distance has multiplicity  $\geq m$

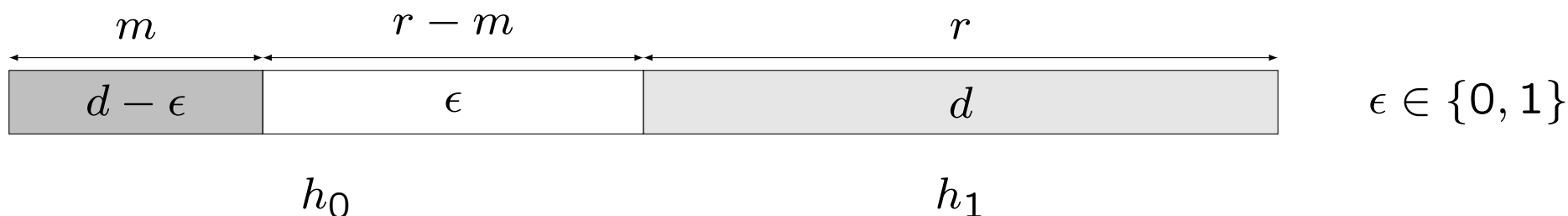
No indication that  $\text{DFR}(\mathcal{W}) \cdot \text{density}(\mathcal{W}) \geq 2^{-\lambda}$  if  $\mathcal{W}$  is one of those sets



## $m$ -gathering Weak Keys

[Wang, Wang, Wang, Crypto 2023]

$h_0$  and  $h_1$  of weight  $d$  in  $\mathbb{F}_2[x]/(x^r - 1)$  a BIKE secret key



Generalize by applying rotations and isomorphisms  $x \mapsto x^i$ ,  $0 < i < r$

e.g.  $(m, \epsilon) = (4000, 1)$ , density is  $2^{-87.28}$  and the DFR is  $2^{-29.33}$

→ contribution to the average DFR is  $\geq 2^{-117}$

→ successful attack with  $2^{117}$  Decaps queries

The same paper shows a second attack in  $2^{98}$  with message reuse  
It is canceled by binding the key to the message as in Kyber

[Drucker, Gueron, Kostić, 2021], Binding BIKE Errors to a Key Pair, LNCS 12716



### III. $m$ -gathering Weak Keys

## Observations on $m$ -gathering Failures

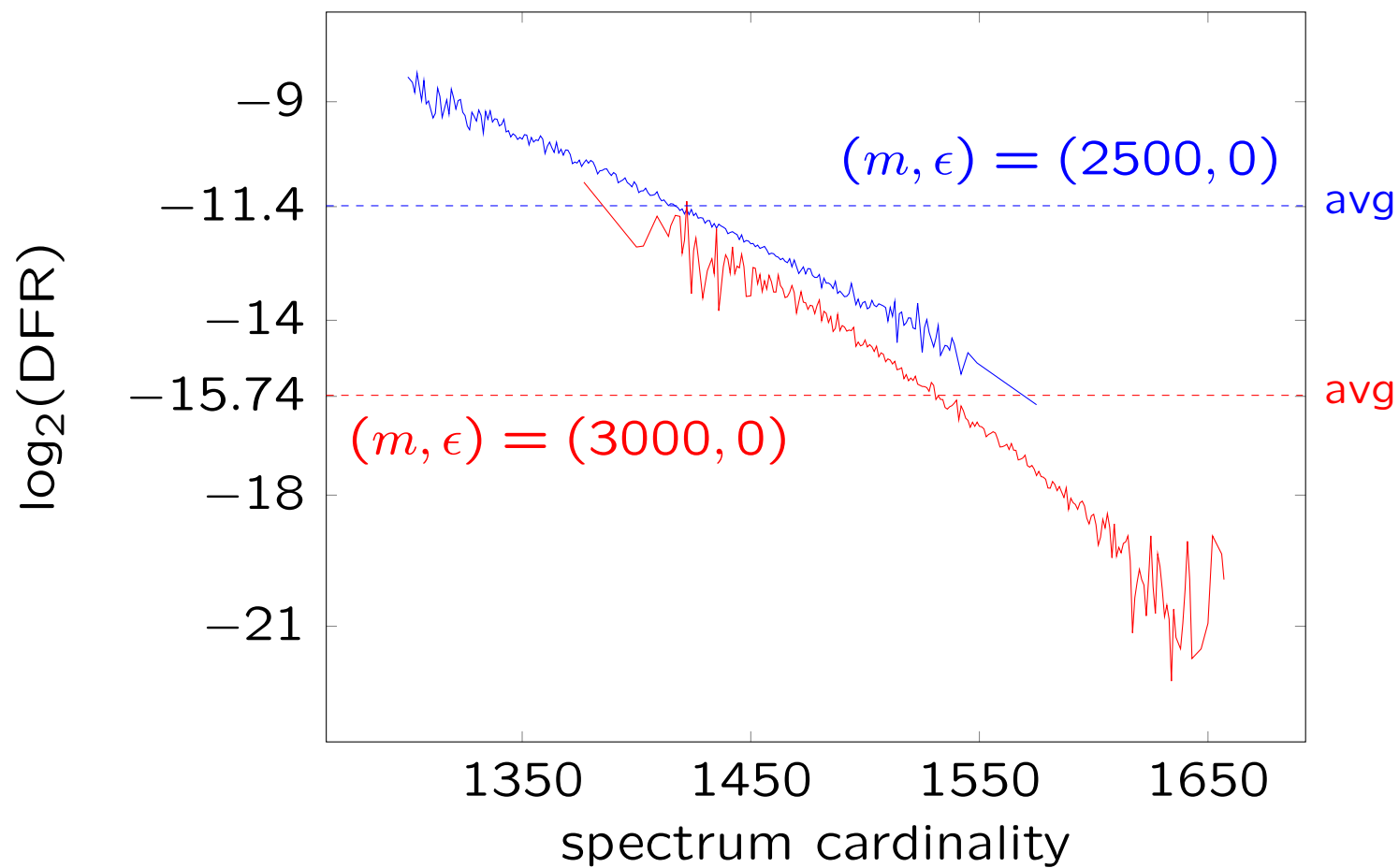
1. Failure probability is strongly correlated with the spectrum cardinality.
2. The bit-flipping decoder features *bogus positions*: positions which are correct but look like errors.





## IV.1 $m$ -gathering Key Spectrum

## Spectrum Cardinality vs DFR for $m$ -gathering Keys



(the spectrum cardinality of a typical element of  $\mathcal{R}$  is 2050)

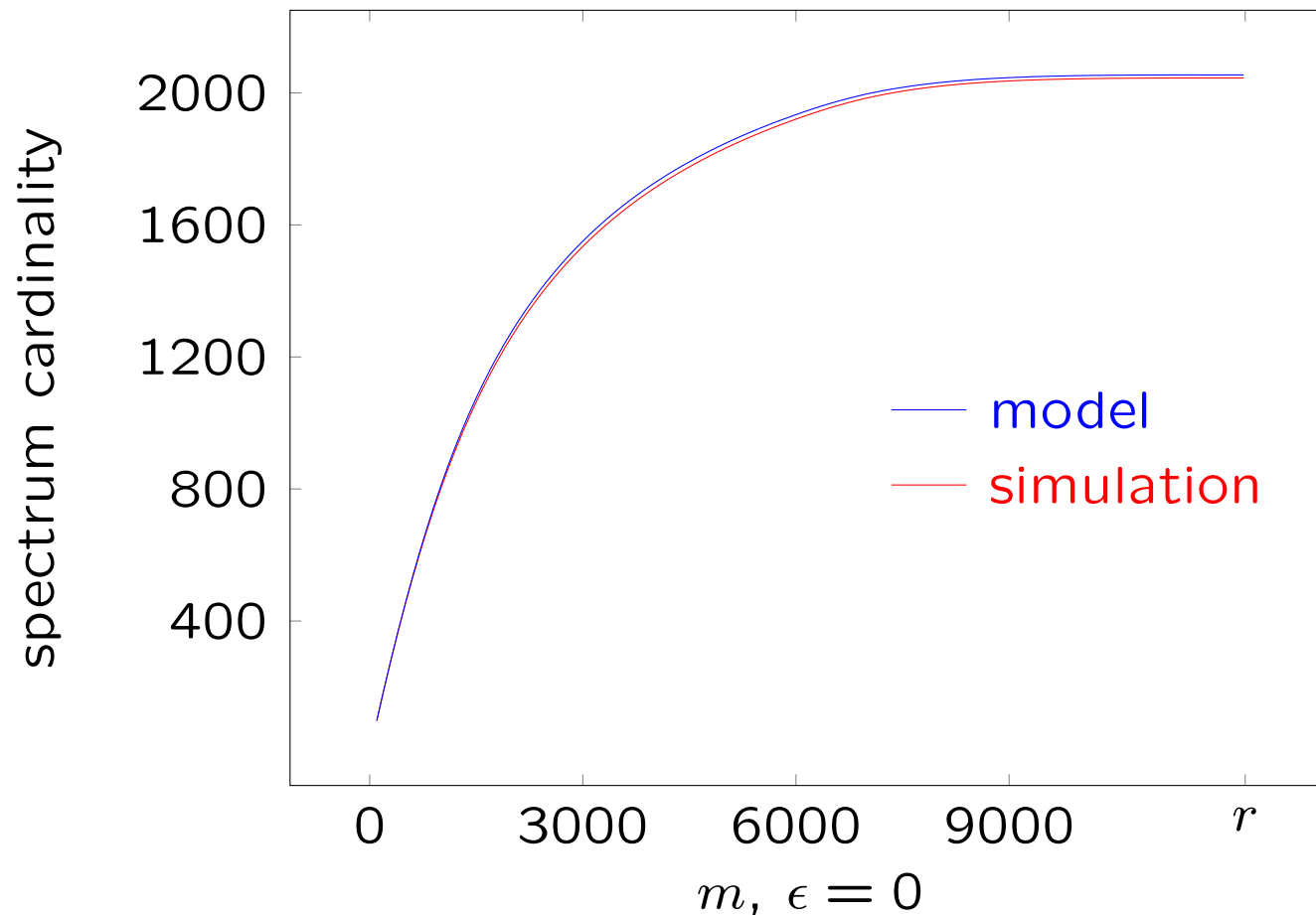


## Spectrum Model for $m$ -gathering Keys

Model: (for  $\epsilon = 0$ ,  $m < r/2$  before applying  $x \mapsto x^i$ )

draw  $d(d-1)/2$  elements in  $\{1, \dots, m-1\}$  with repetition according to

the distribution:  $\Pr(\delta) = \frac{2(m-\delta)}{m(m-1)}, 1 \leq \delta < m$



## Distance Multiplicity for $m$ -gathering Keys

	$(m, \epsilon)$						
	(2000, 0)		(4000, 0)		(6000, 0)		uniform
	model	simul	model	simul	model	simul	model
$\mu = 1$	571.0	579.5	1 135.5	1 154.6	1 459.2	1 479.2	1 660.4
$\mu = 2$	364.1	374.2	418.1	421.7	373.6	372.5	334.8
$\mu = 3$	192.6	195.7	120.9	117.7	73.92	70.45	44.98
$\mu = 4$	85.99	84.37	28.65	26.20	11.87	10.54	4.53
$\mu = 5$	33.01	30.52	5.73	4.80	1.60	1.29	0.36
$\mu = 6$	11.07	9.39	0.99	0.74	0.19	0.13	0.024
$\mu = 7$	3.29	2.49	0.15	0.097	0.019	0.012	0.0014
$\mu = 8$	0.88	0.57	0.020	0.011	0.0017	0.0008	0.000071
$\mu > 0$	1 262.2	1 277.0	1 710.1	1 725.8	1 920.4	1 934.1	2 045.1

Expected number of distances of multiplicity  $\mu$  for various gathering parameters



## IV.2 Bogus Positions

## Bit-Flipping Decoding

```
Input:  $s \in \mathbb{F}_2^r$ ,  $H \in \mathbb{F}_2^{r \times n}$   
   $\tilde{e} \leftarrow 0^n$  ;  $\tilde{s} \leftarrow s$   
  while  $\tilde{s} \neq 0$  do  
     $T \leftarrow \text{THRESHOLD}(\text{context})$   
    for  $j = 0, \dots, n - 1$  do  
       $\sigma_j \leftarrow \text{ctr}(H, \tilde{s}, j)$   
    for  $j = 0, \dots, n - 1$  do  
      if  $\sigma_j \geq T$  then  
         $\tilde{e}_j \leftarrow \tilde{e}_j \oplus 1$   
         $\tilde{s} \leftarrow \tilde{s} - \text{col}(H, j)$   
  
  return  $\tilde{e}$ 
```

$\text{ctr}(H, \tilde{s}, j)$  number of unsatisfied equations involving position  $j$   
a.k.a. **counter** of  $j$



## Binomial Model for Counters – Threshold for BIKE

Binomial model\* for the counter value:

$$\begin{cases} \text{correct position: } \sigma_j \sim \text{Bin}(d, \pi_0) \\ \text{error position: } \sigma_j \sim \text{Bin}(d, \pi_1) \end{cases}$$

Typically  $d = 71$ ,  $\pi_0 \approx 0.4$  and  $\pi_1 \approx 0.6$ , with an exact value depending on the parameters and on the syndrome weight  $S$ .

For given parameters  $(r, d, t)$ , the optimal threshold ([Chaulet 2017]) is well approximated by an affine function

$$\text{e.g. } (r, d, t) = (12323, 71, 134) \rightarrow T = f_t(S) = 0.006258 \cdot S + 11.094.$$

$$*\sigma \sim \text{Bin}(d, \pi) \Leftrightarrow \Pr(\sigma = i) = \binom{d}{i} \pi^i (1 - \pi)^{d-i}$$



## BIKE Bit-Flipping Decoding

Input:  $s \in \mathbb{F}_2^r$ ,  $H \in \mathbb{F}_2^{r \times n}$

$\tilde{e} \leftarrow 0^n$  ;  $\tilde{s} \leftarrow s$

**for**  $i = 1, \dots, \text{NbIter}$  **do**

$T \leftarrow f_t(|\tilde{s}|) + \delta$

**for**  $j = 0, \dots, n - 1$  **do**

$\sigma_j \leftarrow \text{ctr}(H, \tilde{s}, j)$

**for**  $j = 0, \dots, n - 1$  **do**

**if**  $\sigma_j \geq T$  **then**

$\tilde{e}_j \leftarrow \tilde{e}_j \oplus 1$

$\tilde{s} \leftarrow \tilde{s} - \text{col}(H, j)$

**return**  $\tilde{e}$

▷  $\text{NbIter} = 7$  for security level 1

▷  $\delta = 3$ ,  $t$  is the initial error weight

The real BIKE decoder is more complex and features so-called black and gray steps which do not essentially change what is coming next





## $m$ -gathering Bogus Positions

In-depth monitoring of  $m$ -gathering decoding failure instances reveals the following fact:

*When the decoding fails, we observe at the second (sometimes the third) iteration that two things happen concomitantly*

- *a few correct positions (a dozen or so) have an extremely high counter value\*, the **bogus positions**;*
- *the syndrome weight, and thus the threshold, is much lower than expected (given the remaining error weight at that point).*

*The bogus positions are thus flipped, become errors and irreparably spoil the decoding process.*

Presumably, bogus positions are related to the existence of high multiplicity distances in the key spectrum

\*near to impossible in the binomial model for counters



## IV. New BIKE Decoder

## New BIKE Decoder

For BIKE parameter  $(r, d, t)$

Input:  $s \in \mathbb{F}_2^r$ ,  $H \in \mathbb{F}_2^{r \times n}$

$\tilde{e} \leftarrow 0^n$  ;  $\tilde{s} \leftarrow s$

**for**  $i = 1, \dots, \text{NbIter}$  **do**

$T \leftarrow \text{max}(T_i + \delta, f_t(|\tilde{s}|))$

**for**  $j = 0, \dots, n - 1$  **do**

$\sigma_j \leftarrow \text{ctr}(H, \tilde{s}, j)$

**for**  $j = 0, \dots, n - 1$  **do**

**if**  $\sigma_j \geq T$  **then**

$\tilde{e}_j \leftarrow \tilde{e}_j \oplus 1$

$\tilde{s} \leftarrow \tilde{s} - \text{col}(H, j)$

**return**  $\tilde{e}$

$$T_1 = f_t(|s|)$$

$$T_4 = (d + 1)/2$$

$$T_2 = (2T_1 + T_4)/3$$

$$T_3 = (T_1 + 2T_4)/3$$

$$T_i = T_4, i > 4$$

$f_t(x) = 0.006258 \cdot x + 11.094, \delta = 3, \text{NbIter} = 7$  (security level 1)



## New Decoder DFR – Waterfall

$r$	10 620	10 650	10 680	10 700
#samples	$4.4 \cdot 10^9$	$13.3 \cdot 10^9$	$56.2 \cdot 10^9$	$38.2 \cdot 10^9$
#failures	16 222	7 756	3 183	870
$\log_2(\text{DFR})$	-18.04	-20.71	-23.46	-25.39

“Waterfall DFR extrapolation”:

- Level 1,  $(r, d, t) = (12\,323, 71, 134)$ ,  $\delta = 3$ , NbIter = 7  $\rightarrow 2^{-181}$
- Level 3,  $(r, d, t) = (24\,659, 103, 199)$ ,  $\delta = 5$ , NbIter = 7  $\rightarrow 2^{-266}$
- Level 5,  $(r, d, t) = (40\,973, 137, 264)$ ,  $\delta = 6$ , NbIter = 7  $\rightarrow 2^{-343}$



## New Decoder DFR – $m$ -gathering Simulation (1/4)

$(m, \epsilon)$	(1600, 0)	(1700, 0)	(1800, 0)	(1900, 0)	(2000, 0)	(2100, 0)
#samples	$9.5 \cdot 10^9$	$9.6 \cdot 10^9$	$9.6 \cdot 10^9$	$9.6 \cdot 10^9$	$15.7 \cdot 10^9$	$9.4 \cdot 10^9$
#failures	79913	32596	13153	5293	3383	763
$\log_2(\text{DFR})$	−16.86	−18.16	−19.48	−20.79	−22.15	−23.56
$\log_2(\text{density})$	−188.41	−182.15	−176.26	−170.69	−165.41	−160.40
sum	−205.27	−200.31	−195.74	−191.48	−187.56	−183.96

$(m, \epsilon)$	(2200, 0)	(2300, 0)	(2400, 0)	(2500, 0)	(2600, 0)	(2700, 0)
#samples	$9.4 \cdot 10^9$	$15.8 \cdot 10^9$	$19.1 \cdot 10^9$	$25.5 \cdot 10^9$	$59.8 \cdot 10^9$	$7.9 \cdot 10^9$
#failures	270	177	81	40	31	0
$\log_2(\text{DFR})$	−25.06	−26.41	−27.81	−29.25	−30.84	—
$\log_2(\text{density})$	−155.62	−151.06	−146.70	−142.51	−138.50	−134.63
sum	−180.68	−177.47	−174.51	−171.76	−169.34	—



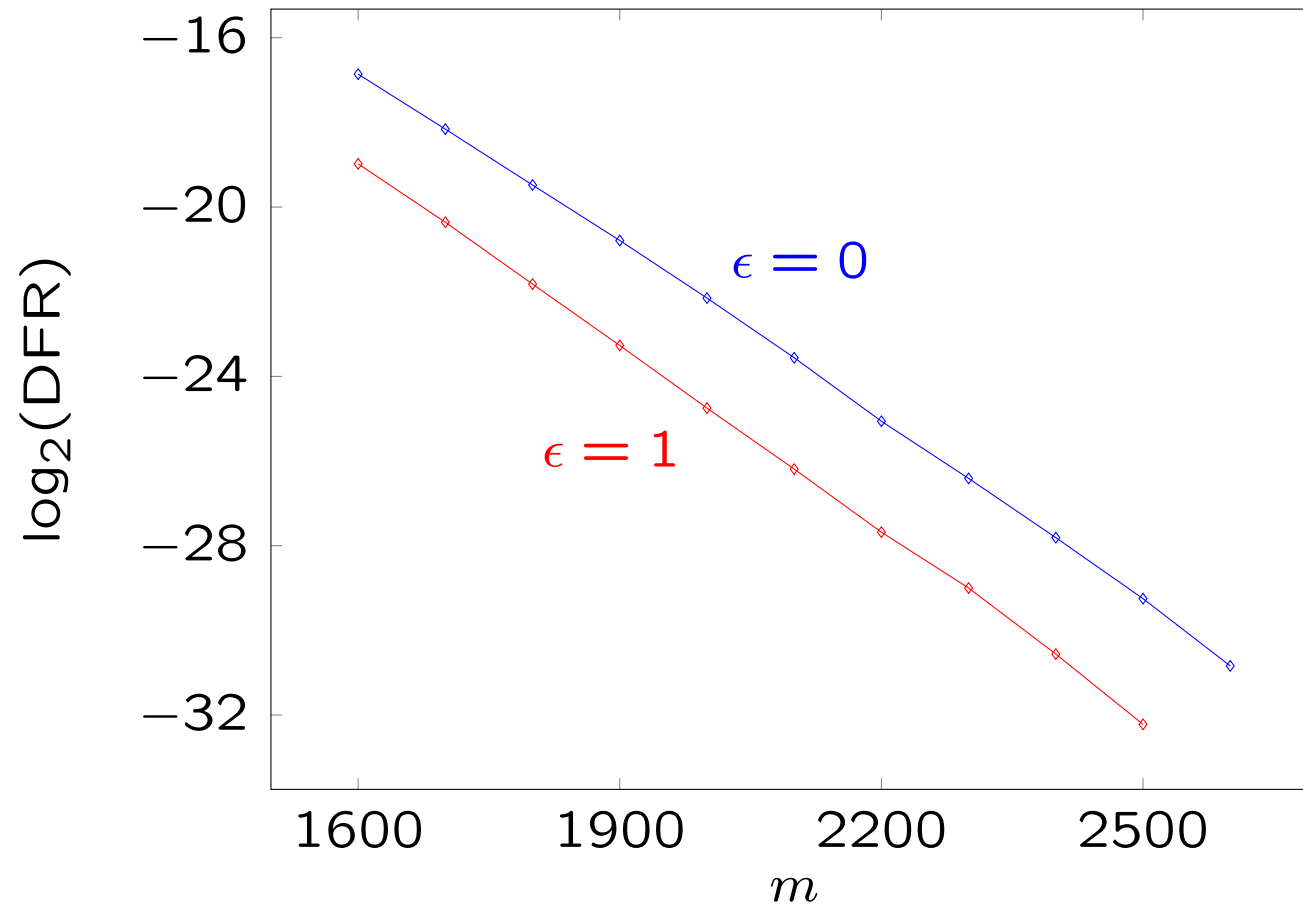
## New Decoder DFR – $m$ -gathering Simulation (2/4)

$(m, \epsilon)$	(1600, 1)	(1700, 1)	(1800, 1)	(1900, 1)	(2000, 1)
#samples	$9.3 \cdot 10^9$	$9.3 \cdot 10^9$	$9.3 \cdot 10^9$	$9.3 \cdot 10^9$	$13.6 \cdot 10^9$
#failures	17916	6904	2524	921	482
$\log_2(\text{DFR})$	−18.98	−20.36	−21.82	−23.27	−24.75
$\log_2(\text{density})$	−179.47	−173.31	−167.52	−162.05	−156.86
sum	−198.45	−193.67	−189.34	−185.31	−181.61

$(m, \epsilon)$	(2100, 1)	(2200, 1)	(2300, 1)	(2400, 1)	(2500, 1)
#samples	$10.1 \cdot 10^9$	$20.1 \cdot 10^9$	$25.2 \cdot 10^9$	$25.3 \cdot 10^9$	$59.9 \cdot 10^9$
#failures	132	94	47	16	12
$\log_2(\text{DFR})$	−26.19	−27.68	−29.00	−30.56	−32.22
$\log_2(\text{density})$	−151.93	−147.24	−142.76	−138.47	−134.36
sum	−178.12	−174.91	−171.76	−169.03	−166.58



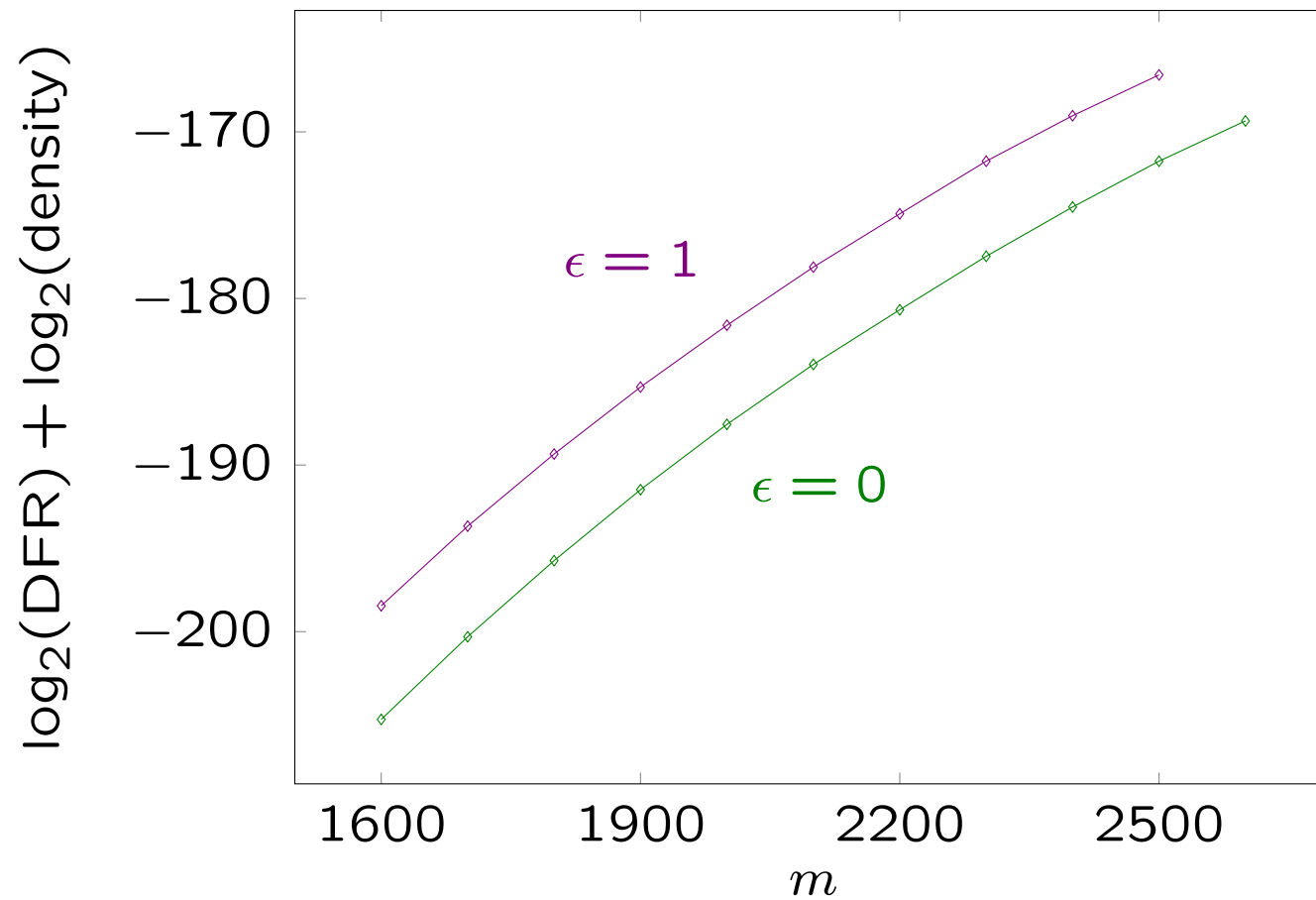
## New Decoder DFR – $m$ -gathering Simulation (3/4)



Old decoder:  $\text{DFR} = 2^{-29.33}$  for  $(m, \epsilon) = (4000, 1)$ , density  $2^{-87.28}$



## New Decoder DFR – $m$ -gathering Simulation (4/4)



Old decoder: for  $(m, \epsilon) = (2500, 1)$ ,  $\text{DFR} \cdot \text{density} = 2^{-145.8}$





## New Decoder – Features

- Larger thresholds
- Similar algorithmic cost
- Simpler logic, and hopefully simpler analysis
- Decoding failure rate:
  - Same behavior in the waterfall region: fast exponential decrease
  - Better behavior against weak keys



# V. Weak Keys & Error Floors

Perspectives and Open Questions

## Weak Keys and the New Decoder

- weak keys have abnormally high **multiplicities**\*
- higher **multiplicities** trigger more decoding failures
- bogus positions occur with weak keys and trigger decoding failures
- bogus positions are handled by increasing the thresholds
- higher thresholds reduce the weak key DFR by orders of magnitude

\*multiplicities of values in the coordinate distance spectrum of the secret key



## Error Floor Estimates

- distance to the closest **near-codeword**<sup>\*</sup> is the dominant factor for the error floor estimation
- **multiplicities** are meaningful to estimate error floors  
relates to Tanner graphs and **near-codewords** (a.k.a. trapping sets)
- new models for **counters**<sup>†</sup>, straying from the typical case as the error pattern gets closer to a **near-codeword**

Work in progress, Markovian model taking into account near-codewords:

[Arpin, Billingsley, Lau, Perlner, Robinson, Tillich, Vasseur]

<sup>\*</sup>a small set (of linear cardinality) of low weight words with low weight syndromes

<sup>†</sup>number of unsatisfied parity equations involving a position



## New Model for Counters

$\mathbf{e} \in \mathbb{F}_2^n$  the error pattern (Hamming weight  $t$  at start)

$\mathbf{x} \in \mathbb{F}_2^n$  the closest near-codeword (Hamming weight  $d = w/2$ )

$u$  the number of error positions in  $\mathbf{x}$  ( $u = |\mathbf{e} \star \mathbf{x}| \geq 1$ )

For a position in the support of  $\mathbf{x}$ : \*

$$\begin{cases} \text{correct position: } \sigma_j \sim \text{Bin}(d - u, \pi_0) + \text{Bin}(u, \pi_1) \\ \text{error position: } \sigma_j \sim \text{Bin}(d - u + 1, \pi_1) + \text{Bin}(u - 1, \pi_0) \end{cases}$$

For other positions:

$$\begin{cases} \text{correct position: } \sigma_j \sim \text{Bin}(d, \pi_0) \\ \text{error position: } \sigma_j \sim \text{Bin}(d, \pi_1) \end{cases}$$

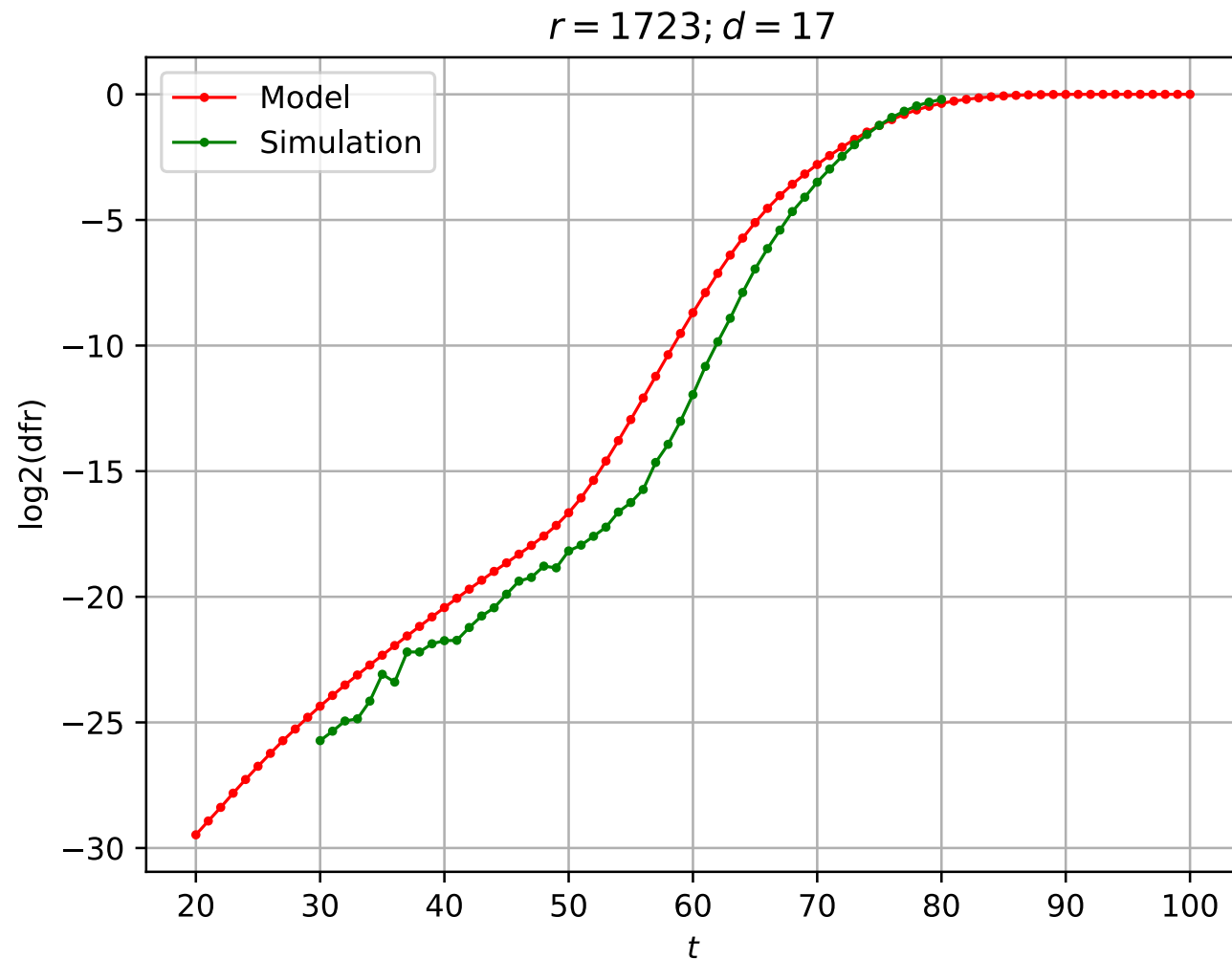
Recall that typically  $d = 71$ ,  $\pi_0 \approx 0.4$ ,  $\pi_1 \approx 0.6$

counter = number of unsatisfied parity equations

\*[Arpin, Billingsley, Lau, Perlner, Robinson]



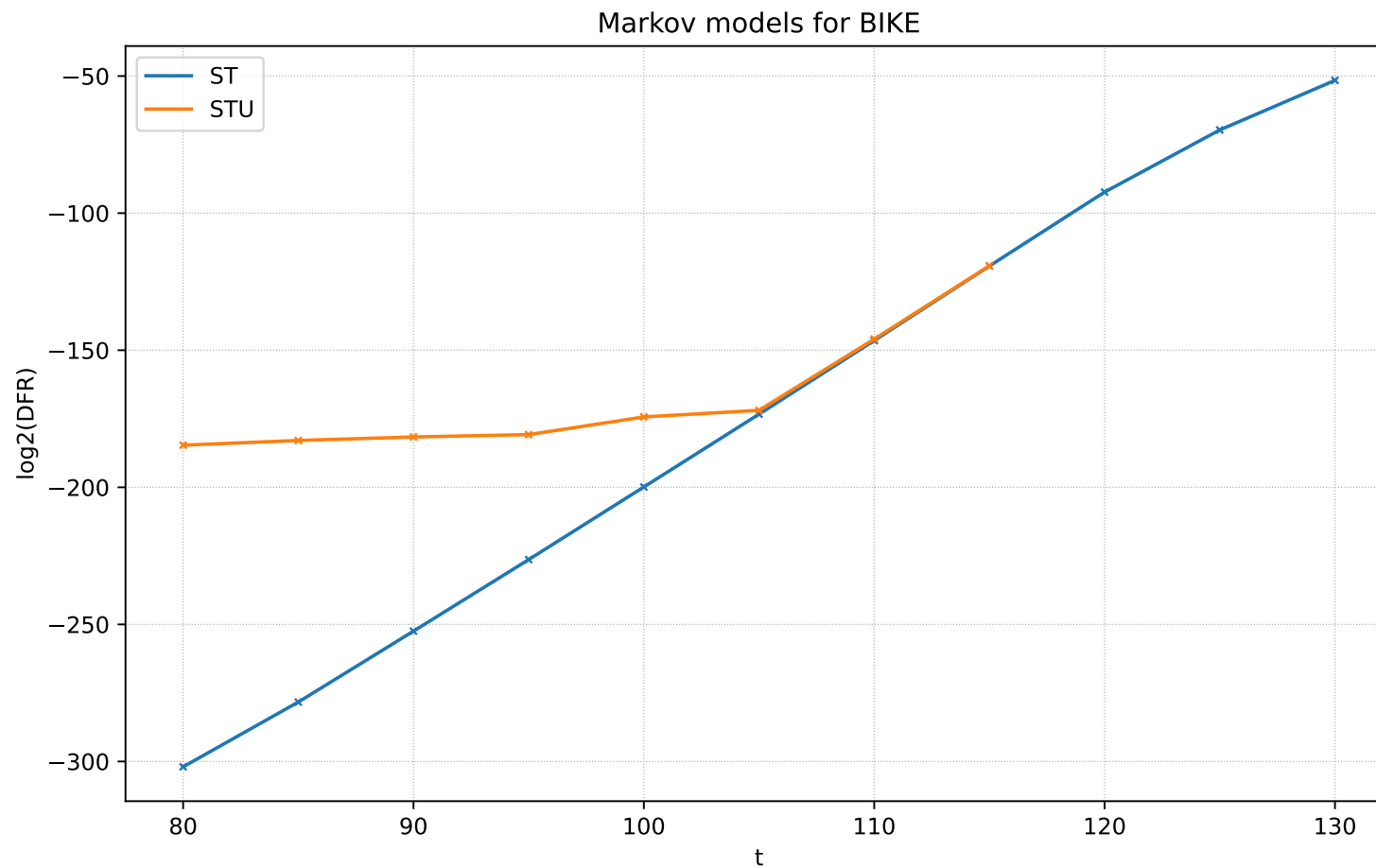
# Markovian Model Matching the Error Floor (Perfect Keys)



[Tillich, Vasseur, 2024] model matches simulation for a toy example



# Markovian Models (for Sequential Bit-Flipping)



[Sendrier, Vasseur, 2019] state :  $(|e|, |s|)$

[\*, ongoing]

state :  $(|e|, |s|, u)$

\* [Arpin, Billingsley, Lau, Perlner, Robinson, Tillich, Vasseur]



## Weak Keys vs. Error Floors – Connections & Perspectives

- Some correct positions may have higher counter values (and some erroneous positions may have lower counter values)

consistent with bogus positions

- Near-codewords exist for all keys, their impact on error floors (and thus on decoding failures) depends on multiplicities

consistent with a higher DFR for weak keys

Open Questions:

- Do all weak keys have untypical multiplicities? Converse?
- Are weak keys dominant for the average DFR/Error Floor?





# Conclusion

## Conclusions – BIKE DFR

Summing up ( $\lambda$  the security parameter, e.g.  $\lambda = 128$ ):

- Waterfall

DFR decreases exponentially in  $O(\lambda^2)$  (block size)

- Error Floor (preliminary, work in progress)

The new Markovian model predicts the error floor

DFR seems to decrease exponentially in  $O(\lambda)$  (error weight)

Perspectives to reduce the DFR

- improve the threshold schedule (with guaranties from the model)
- filter out keys with untypical spectrum (weak keys)
- increase the parameters

