

Not Just Regular Decoding: Asymptotics and Improvements of Regular Syndrome Decoding Attacks

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Regular Syndrome Decoding

Definition: We say that $\mathbf{e} \in \mathbb{F}_2^n$ with Hamming weight w is **regular** if

$$\mathbf{e} = (\mathbf{e}_1, \mathbf{e}_2, \dots, \mathbf{e}_w),$$

where each \mathbf{e}_i has length $b = \frac{n}{w}$ and Hamming weight one.



Regular Syndrome Decoding (RSD)

Given $\mathbf{H} \in \mathbb{F}_2^{r \times n}$, $\mathbf{s} \in \mathbb{F}_2^r$ and $w \in \mathbb{N}$, find $\mathbf{e} \in \mathbb{F}_2^n$ such that

- $\text{wt}(\mathbf{e}) = w$
- \mathbf{e} is regular
- $\mathbf{H}\mathbf{e} = \mathbf{s}$

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- Post-quantum signatures (Carozza et al., 2023, Hongrui et al., 2024)

Uniqueness bound

Random RSD instance:

- sample uniformly random $\mathbf{H} \in \mathbb{F}_2^{r \times n}$
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Average number of solutions: $S_{RSD} = \max \left\{ 1 ; \left(\frac{n}{w} \right)^w 2^{-r} = b^w 2^{-r} \right\}$

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Let $r = (1 - \kappa) \cdot n$, with $\kappa \in [0; 1]$ being the **code rate**



Uniqueness bound

Let $w = \omega n$ with $\omega \in [0 ; 0.5]$, $\omega = \frac{1}{b}$ and $b \in \mathbb{N}$.

We have $S_{RSD} = 1$ if

$$-\omega \cdot \log_2(\omega) \leq 1 - \kappa.$$

Analogue of Gilbert-Varshamov (GV) bound for the standard Syndrome Decoding (SD)

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Analogue of Gilbert-Varshamov (GV) bound for the **standard Syndrome Decoding (SD)**

Solving RSD

Information Set Decoding (ISD) is known to be the best solver for SD

Hazay et al., 2018: even if tailored to the RSD setting, ISD obtains about the same complexity as direct SD attacks

Liu et al., 2022: standard ISD attacks perform best for most of the suggested parameters

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Our contributions

Regular-ISD algorithms



- Design of **new algorithms** (Perm, Enum, Rep, Rep-MO)
- **Fastest solvers** for worst case RSD instances
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- Identification of regimes in which **RSD is harder than SD**
- Worst case RSD is **harder** than worst case SD

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Artifact

- **Estimator** for concrete and asymptotics costs
- **Proof-of-concept implementation** of Perm and Enum

Regularity-encoding parity-check equations

Technique already used in [Briaud and Øyngarden, 2023](#) and [Carozza, Couteau, Joux, 2023](#)

Any RSD instance $\{\mathbf{H}, \mathbf{s}, \mathbf{w}\}$ can be transformed into a **new RSD instance** $\{\mathbf{H}', \mathbf{s}', \mathbf{w}\}$ by encoding regularity:

$$\mathbf{H}' = \left(\begin{array}{c|c|c|c} & & \mathbf{H} & \\ \hline 1 & 1 & \dots & 1 \\ \hline & 1 & 1 & \dots & 1 \\ \hline & & \ddots & & \\ \hline & & & 1 & 1 & \dots & 1 \\ \hline \end{array} \right)$$

$\longleftarrow b \qquad \longleftarrow b \qquad \qquad \qquad \longleftarrow b$

$$\mathbf{s}' = \begin{pmatrix} \mathbf{s} \\ 1 \\ 1 \\ \vdots \\ 1 \end{pmatrix} \quad \begin{array}{c} \uparrow \\ w \end{array}$$

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New code dimension: $k' = n - r - w$

New code rate: $\kappa' = \max \left\{ \kappa - \frac{w}{n} ; 0 \right\}$ (with large probability)

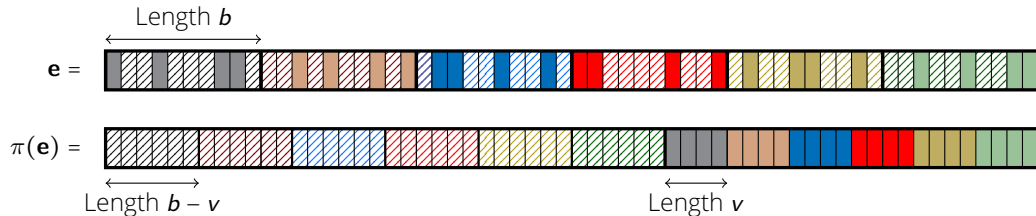
Regular permutations

Definition: Let $\mathbf{e} = (\mathbf{e}_1, \dots, \mathbf{e}_w) \in (\mathbb{F}_2^b)^w$. For an integer $v \leq b$ and a permutation matrix \mathbf{P} let

$$\mathbf{P}\mathbf{e} = (\mathbf{e}'_1, \dots, \mathbf{e}'_w, \mathbf{e}''_1, \dots, \mathbf{e}''_w),$$

with $\mathbf{e}'_i \in \mathbb{F}_2^{b-v}$ and $\mathbf{e}''_i \in \mathbb{F}_2^v$. We call \mathbf{P} a **v-regular permutation** if each \mathbf{e}'_i and each \mathbf{e}''_i are formed only by coordinates from \mathbf{e}_i .

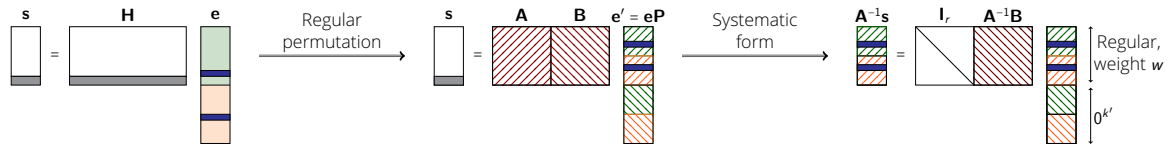
Example: $w = 6, b = 10, v = 4$



Perm: Permutation-Based Regular ISD

Adaptation of Prange's ISD to the regular setting, using regularity encoding parity-checks and regular permutation

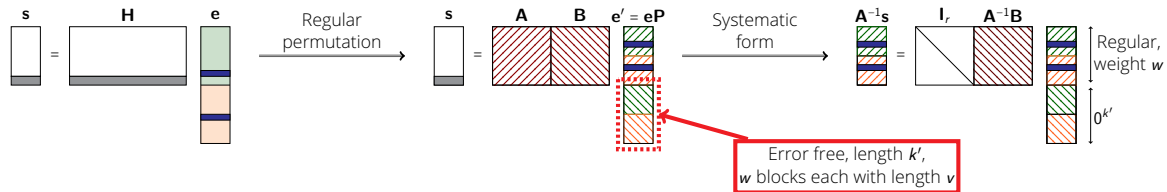
The information set is constituted by sampling $\mathbf{v} := \frac{k'}{w} = \frac{n-r-w}{w}$ coordinates from each block



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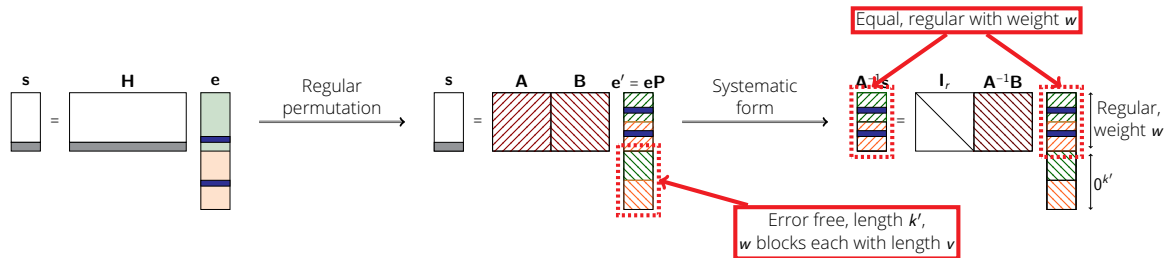
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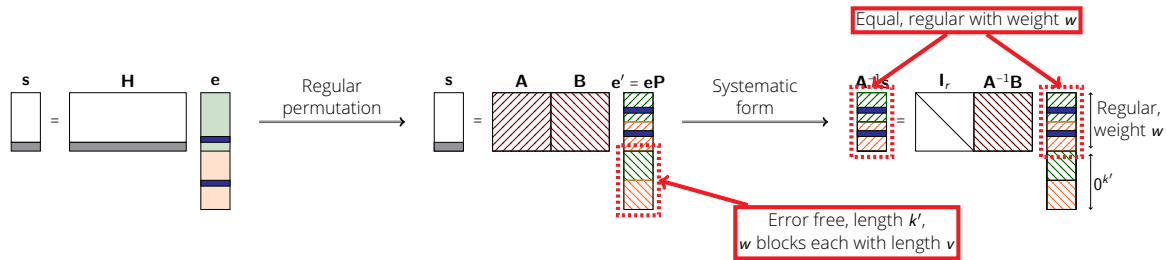
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Rounding issues: if v is not integer: select $\lfloor v \rfloor$ from some blocks, $\lceil v \rceil$ from the other blocks. Very mild impact on complexity

Advanced Regular ISD algorithms

Translation of **advanced techniques** from the SD setting. Rounding issues have mild impact on complexity

Best solvers for worst case RSD instances (asymptotic time complexity expressed as $T = 2^{cn}$):

- CCJ-MO: $c = 0.1281$
- Rep-MO: $c = 0.1117$ (0.1119 after resolving rounding issues)

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For many RSD-based schemes, regular-ISD algorithms result in the fastest attacks

source	(n, k, w)	previous best	regular-ISD
<u>Hazay et al., 2018</u>	(1280, 860, 80)	132	114
	$(2^{10}, 652, 57)$	90	76
	$(2^{10}, 652, 106)$	129	113
<u>Liu et al., 2024</u>	$(2^{12}, 1589, 172)$	132	109
	$(2^{14}, 3482, 338)$	135	118
	$(2^{16}, 7391, 667)$	139	126
<u>Carozza et al., 2024</u>	(1842, 825, 307)	183	153

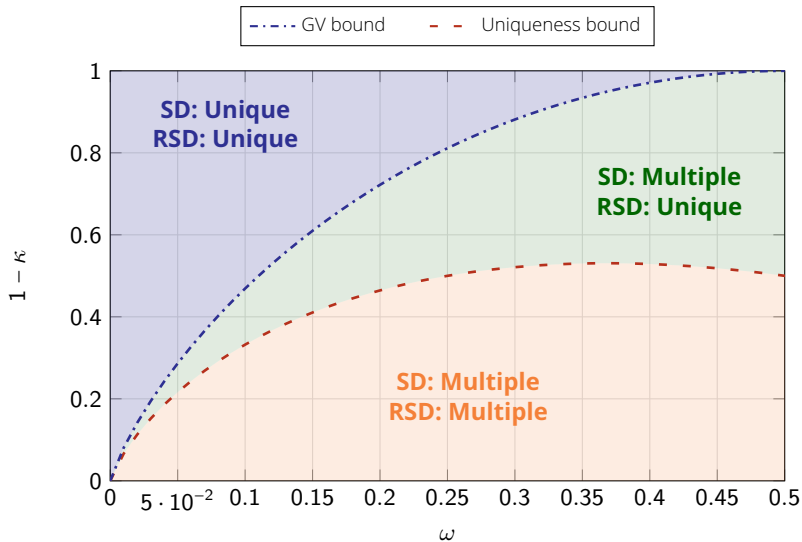
Table: Bit security for selected instances considering regular-ISD in comparison to previous best approaches.

Hardness classification: SD vs RSD

Comparison of hardness to solve SD and RSD with same parameters (n, κ, ω)

Number of solutions:

SD is harder than RSD when solution is unique

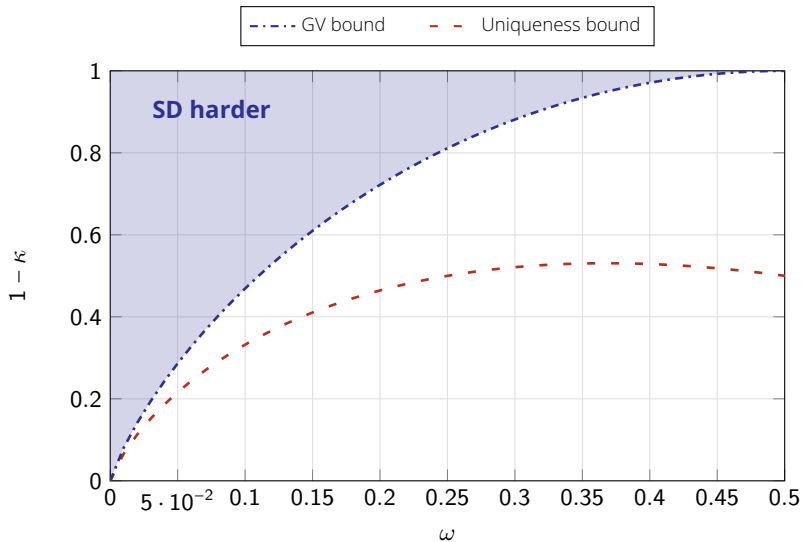


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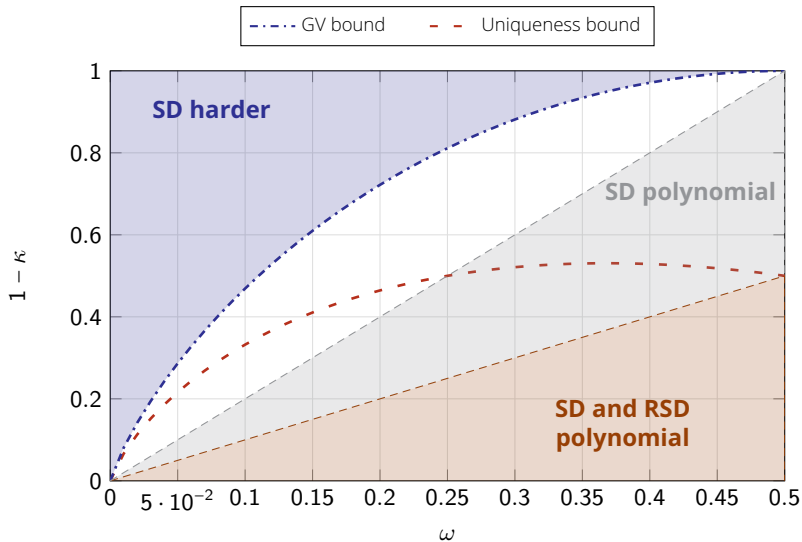
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Easy RSD Regimes

- $\kappa \geq \frac{1}{2}$ and $\omega \geq 1 - \kappa$:
Exponentially many solutions



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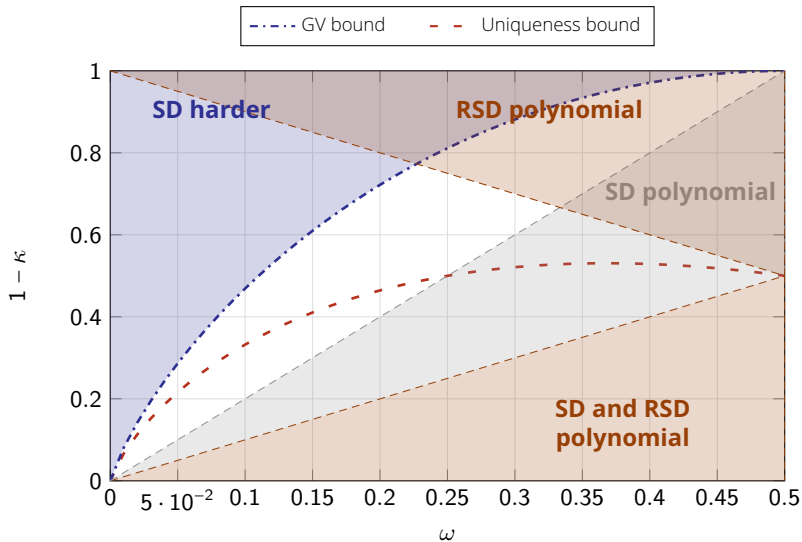
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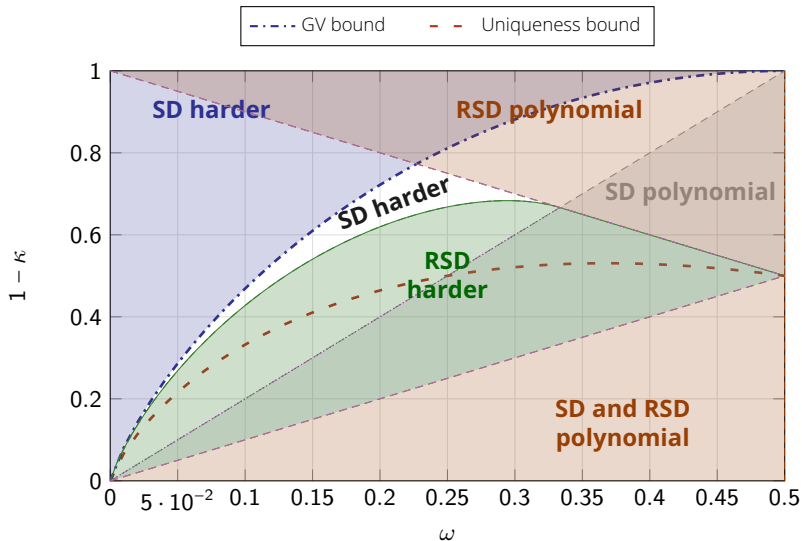
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Hardness classification: worst case RSD instances

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Worst case RSD is harder than worst case SD

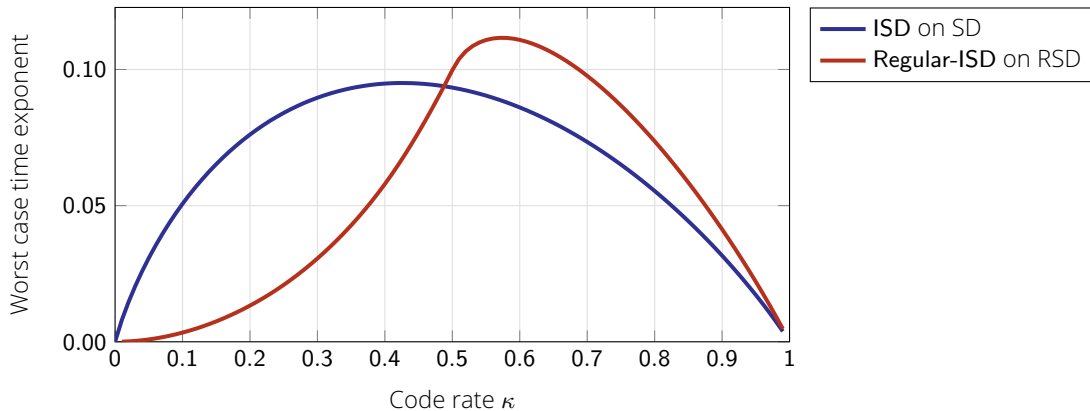


Figure: Comparison of running time of best ISD algorithm on worst case SD instances and best regular-ISD algorithms on RSD worst case instances

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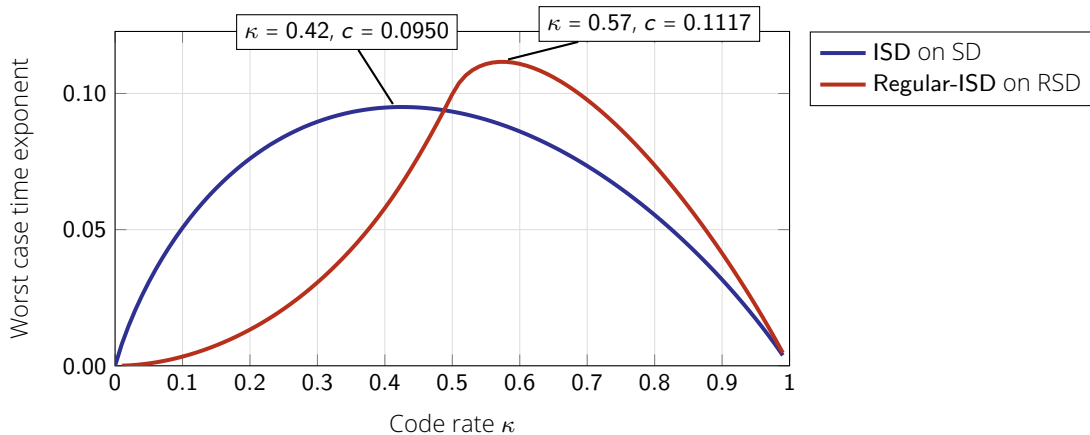


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Conclusions

Regular-ISD: translation of ISD from the standard case to the regular case

Regular-ISD algorithms setting are the best solvers for RSD in many concrete applications and for worst case instances

Hardness classification for RSD and how to choose worst case RSD instances

Worst case RSD are harder-to-solve than worst case SD for all code rates approximately ≥ 0.5

Full version: **Eprint** 2023/1568

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