

New efficient techniques to catch lowest weights in large Quadratic Residue codes

Issam Abderrahman JOUNDAN, Said NOUH and Abdelwahed NAMIR

Abstract—For a large Quadratic Residue (QR) code C , the problem of finding the minimum weight d is NP-hard and many research techniques have been developed to attack its hardness such as simulated annealing, Multiple Impulse Method, Ant Colony Optimization, Zimmermann algorithms and MIM-FSI method. The true value of the minimum weight in QR codes is known for only lengths less than or equal to 223. In this work, we propose new efficient schemes to catch lowest weights codewords in QR codes. The first proposed scheme Zimmermann-FSI uses the Zimmermann algorithm for searching lowest weights in the sub code SubEQR fixed by a self invertible element of the projective special linear group. The code SubEQR has a small dimension comparing to C itself. This reduction of the dimension permits to reduce considerably the research space size and it is behind the success of the Zimmermann-FSI scheme. This good result has encourages us to continue on reducing again the dimension of SubEQR and to propose the second scheme Zimmermann-FSI-RSC which uses the Zimmermann algorithm to catch lowest weights in a list of sub codes of small dimensions randomly extracted from the sub code SubEQR. The two proposed schemes are validated on all QR codes of known minimum weight. The comparison between MIM-FSI, Zimmermann-FSI and Zimmermann-FSI-RSC on many large QR codes proves the efficiency of the two latest ones in terms of run time reduction and the results quality. The proposed methods performed very well in comparison to previously known results and they yield to some new ones for lengths up to 601.

Keywords—Automorphism group, projective special linear group, Quadratic Residue codes, minimum distance, minimum weight, Multiple Impulse Method, Zimmermann’s algorithm, MIM-FSI method.

I. Introduction

The channel coding technique permits to detect and correct errors by adding redundancy in original data before transmission. In reception, the selected decoder uses the added information in correction. Each linear error correcting code $C(n,k,d)$ can be generated by a binary generator matrix of k rows and n columns. k is called the dimension and n is the length of C .

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The weight of a word is the number of ones it contains. The error-correcting capability of a linear code is equal to its lowest non-zero weight.

For each prime n of the form: $n \equiv \pm 1 \pmod{8}$, the Quadratic Residue code $QR(n)=QR(n,(n+1)/2,d)$ of length n is generated by the polynomial $g(x) = \prod_{i \in Q} (x - \beta^i)$ where Q is the collection of all nonzero quadratic residue integers modulo n : $Q = \{j^2 \pmod{n} : 1 \leq j \leq n-1\}$ and β is a primitive n^{th} root of unity in $GF(2^m)$, where m is the smallest positive integer such that n divides $2^m - 1$. Each QR code can be extended to a $EQR(n+1,(n+1)/2,d+1)$ code whose codewords are obtained by adjoining a parity-check bit to a fixed position ∞ of every codeword of the $QR(n)$ code.

QR codes are a family of powerful error correcting codes, they have potential applications in modern communication systems and digital signal processing systems and they are recently decoded by fast and efficient methods [1-5]. They are used to construct quantum synchronizable codes [6]. In [7], authors have generalized QR codes over Galois rings using the Galois Theory. In [8], a self-dual code and a formally self-dual code are obtained from extended QR codes.

In this paper our work will focused on finding the minimum distance of large Quadratic Residue codes which is a NP-complete problem as proved in [9].

The Pless identity [10] permits to write the following equality:

$$\text{for } j \leq (n-1)/2 : 2j.A_{2j} = (n - (2j-1)).A_{2j-1} \quad (2)$$

With A_i denotes the number of codewords of weight i in $QR(n)$ code and E_i denotes the number of codewords of weight i in $EQR(n)$.

The definition of EQR codes and (2) permit to write the following equality:

$$\text{for } j \leq \frac{n-1}{2} : E_{2j} = \frac{n+1}{n+1-2j} A_{2j} = \frac{n+1}{2j} A_{2j-1} \quad (3)$$

The formula (2) proves that:

$$d(QR(n)) = d(EQR(n)) - 1 \quad (4)$$

PSL_2 is a part of the automorphism group of Quadratic Residue codes. It is the set of permutations over $\{0,1,2,\dots,n-1,\infty\}$, of the form $y \rightarrow (ay+b)/cy+d$ where a, b, c and d are elements of $GF(n)$ verifying : $ad-bc=1$. For all values of n , the binary $EQR(n)$ code is invariant under PSL_2 [11].

For a prime $n \equiv -1 \pmod{8}$, the minimum distance d of a $QR(n)$ code is related to its length by the following Krasikov inequality [12]:

$$d+1 \leq 0.166315 n \quad (5)$$

In [13], the likelihood weight enumerators of some quadratic residue codes are found.

The remainder of this paper is organized as follows. The next section presents some background on Quadratic Residue codes, the projective special linear group PSL_2 and the main related works. The section 3 presents the proposed schemes: Zimmermann-FSI and Zimmermann-FSI-RSC. The section 4 presents the main results. The conclusion and the possible future directions of this research are outlined in section 5.

II. Related works

The determination of the minimum weight d in a linear block code $C(n,k,d)$ permits to know its capability in detecting and in correcting errors or erasures. When the dimension k increases, the size of the search space becomes prohibitively large and exhaustive search becomes not feasible. In [14-21] authors have used many techniques to find the true value of the minimum distances of QR codes for all lengths less than or equal to 223. For more lengths, this metric is still unknown. This section summarizes the most important previous works.

Wallis and Houghten [22] have applied many heuristic search techniques for BCH codes. They concluded that genetic algorithms with a large population size significantly outperformed hill-climbing, tabu search and hybrid techniques (GA – Hill climbing and GA - Tabu Search). In [23] the authors had improve some parameter of GA and get best result for BCH code compared to wallis and simulated Annealing [24] and applied this GA to QR codes of length up to 223.

Instead the turbo decoder used in [25], the MIM method (Multiple Impulse Method) [23] uses the OSD decoder of order 3 and injects errors in many positions. This method has permits to find good results in terms of time and precision.

Leon [26] has proposed an efficient probabilistic method based on information sets and the automorphism group and applied this method to QR codes of length up to 521.

Aylaj and Belkasm [27] have proposed a new simulated annealing by using new mechanism of moving the search in different regions of solution space by degeneration of energy. They obtained new lower bounds for some linear codes.

Zimmerman algorithm [28] is a general algorithm for computing the minimum distance of a linear code. It is implemented in GAP (package Guava) [29] over fields F_2 and F_3 . It is also implemented, in Magma over any finite field. The method by Zimmerman is outlined in Algorithm 1. It is based on the so called information sets. Given a linear code C with parameters $[n, k, d]$ and a generator matrix G , an information set $S = \{i_1, \dots, i_k\} \subset \{1, \dots, n\}$ is a subset of k indices such that the corresponding columns of G are linearly independent. Therefore, after permutation of columns and elementary row operations we get a systematic matrix $\Gamma_1 = (I_k | A_1)$. Assume that we are able to find $m-1$ disjoint information sets $(S_1 \cap \dots \cap S_{m-1} = \emptyset)$, then we get $m-1$ different matrices $\Gamma_j = (I_k | A_j)$. Notice that there still may be left $n - k(m - 1)$ positions, so that the corresponding columns of G do not have rank k but $k_m < k$, then after

applying column permutations and row operations, one gets $\Gamma_m = \begin{pmatrix} I_k & A \\ 0 & B \end{pmatrix}$. In overall, the number of Γ matrices is m : The first $m - 1$ will have full rank k , and the last one will have a rank strictly smaller than k .

The idea is to consider an upper bound U , initialized to $n - k + 1$, and a lower bound L , initialized to 1. Then, both bounds are updated after enumerating codewords, and it is checked whether $L \geq U$; if so, the minimum weight is U .

The codewords are enumerated as follows: consider all the linear combinations $i \cdot \Gamma_j$ for $j = 1, \dots, m$, where $i = (i_1, \dots, i_k)$ and $wt(i) = 1$. After computing any linear combination, if the new weight is smaller than U , then U is updated with the new weight. Moreover, after finishing with all linear combinations $i \cdot \Gamma_j$ for $j = 1, \dots, m$, the lower bound is increased in $m - 1$ units (actually one after each Γ_j) for the disjoint information sets. Now the same procedure is repeated for linear combinations $i \cdot \Gamma_j$ for $j = 1, \dots, m$ and $wt(i) = 2$. Then, the same is done for $wt(i) = 3$, and so on until $L \geq U$ is obtained.

Algorithm 1 (Minimum weight for a linear code C)

Input: The generator matrix G of the linear code C with parameters $[n, k, d]$.

Output: d The minimum weight of C .

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L := 1;
U := n - k + 1;
w := 1;
while w ≤ k and L < U do
    for j = 1, . . . , m do
        U := min{U, min{wt(iΓj) : i ∈ Fk2 | wt(i) = w}};
    end for
    L := (m - 1)(w + 1) + max{0, w + 1 - k + km};
    w := w + 1;
end while
return U;
    
```

In [30], we have used an efficient scheme to compute the minimum distance for linear codes. This method is based on reduction of the code dimension and the use of the MIM method on a given sub code fixed by a self invertible permutation σ of the projective special linear group of Extended Quadratic Residue codes. The dimension of this sub code is very low comparing to the dimension of C itself. In the next section we will apply the Zimmermann algorithm on this sub code.

III. The proposed schemes

This section presents the Zimmermann-FSI method for finding the lowest weight in large QR codes. The first proposed scheme Zimmermann-FSI works as follows:

Inputs: - n a prime : $n \equiv \pm 1 \pmod{8}$
 - A generator matrix G of $EQR(n+1)$
Step 1: find an element $\sigma \in PSL_2(n)$: $\sigma^2 = 1$ (self invertible)
Step 2: find the sub code:
SubEQR(n+1,σ) = {c ∈ EQR(n): σ(c) = c} fixed by σ by

solving the following system (S) of two fundamental equations:

$$(S) = \begin{cases} \sigma(c) = c \\ c = (Inf, Red) = Inf * G \end{cases}$$

Step 3: find the estimated minimum distance d of SubEQR(n+1,σ) by using the Zimmermann method.
Output: d-1 as estimated minimum distance of QR(n)

The second proposed scheme Zimmermann-FSI-RSC (on Random Sub codes) works as follows:

Inputs: - n a prime : $n \equiv \pm 1(mod 8)$

- A generator matrix G of EQR(n+1)
- N, the number of random sub codes

Step 1: find an element $\sigma \in PSL_2(n)$: $\sigma^2=1$ (self invertible)
Step 2: find the sub code SC:
SC={c ∈ EQR(n): $\sigma(c)=c$ } fixed by σ by solving the following system (S) of two fundamental equations:

$$(S) = \begin{cases} \sigma(c) = c \\ c = (Inf, Red) = Inf * G \end{cases}$$

Step 3:
 $d \leftarrow n$
For i=1 to N do

- Randomly extract a sub code SSC of SC
- find the minimum distance d' of SSC by using the Zimmermann method.
- if (d' < d) then
 $d \leftarrow d'$

end If
End For
Output: d-1 as estimated minimum distance of QR(n)

IV. Results and Discussions

This section presents a validation of the proposed method on all binary quadratic residue codes of known minimum distance and its application for finding the minimum distance of some unknown minimum distance.

In the comparison of Zimmermann-FSI with other method, we define the weight gain WG as the difference between the lowest weight obtained by the Zimmermann-FSI scheme and that obtained by other method: WG=d(Zimmermann-FSI)-d(Other).

All results have been done using a simple configuration machine: Intel(R) Core(TM) i3-4005U CPU @1.70GHz.

A. Validation of Zimmermann-FSI Method:

In order to validate the proposed method, it is applied on all QR codes of known minimum distance presented in [14-21]. The TABLE I summarizes the obtained results, it shows that the minimum weight found by the Zimmermann-FSI method is equal to the true value of the minimum distance of all QR codes of known minimum distance. Then the Zimmermann-FSI method is validated for length less than or equal to 223. This table shows that the proposed scheme

gives the lowest weight codeword in a very short time.

B. Comparison between Ant Colony Optimization (ACO) and Zimmermann-FSI:

The TABLE II compares Ant Colony Optimization (ACO) Method [21] with Zimmermann-FSI. This table shows that Zimmermann-FSI outperforms very well the ACO method in finding the true value of the minimum distance for Quadratic Residue codes of length up to 199.

C. Comparison between Aylaj's SA and Zimmermann-FSI:

The TABLE III compares Aylaj's SA algorithm [27] with Zimmermann-FSI. This table shows that Zimmermann-FSI outperforms very well the Aylaj's SA in finding lowest weight codewords in Quadratic Residue codes.

D. Comparison between MIM and Zimmermann-FSI:

The TABLE IV compares MIM Method [23] with Zimmermann-FSI. This table shows that Zimmermann-FSI outperforms MIM in finding lowest weight codewords for Quadratic Residue codes.

E. Comparison between Zimmermann-FSI scheme and Zimmermann method:

In order to compare the Zimmermann-FSI scheme with the Zimmermann method [28-29], their applications on some QR codes are made. The TABLE V gives the obtained results. It shows that the Zimmermann-FSI scheme greatly outperforms the Zimmermann method on finding lowest weight codewords. The run time of the two methods is 24 hours in the same configuration machine given above.

F. Comparison between MIM-FSI and Zimmermann-FSI:

The TABLE VI compares and summarizes the total run time and the result quality of the two methods MIM-FSI and Zimmermann-FSI. This table shows that Zimmermann-FSI outperforms MIM-FSI in both total run time and in the results quality.

G. Comparison between Zimmermann-FSI and Zimmermann-FSI-RSC methods:

The TABLE VII compares and summarizes the minimum distance found by the two methods Zimmermann-FSI and Zimmermann-FSI-RSC. This TABLE shows that Zimmermann-FSI-RSC outperforms Zimmermann-FSI especially for large codes.



TABLE I. Validation of Zimmermann-FSI method

QR Codes		True value of the minimum distance	d(Zimmermann-FSI)	d(Zimmermann-FSI-RSC)
n	k			
17	9	5	5	5
41	21	9	9	9
73	37	13	13	13
89	45	17	17	17
97	49	15	15	15
113	57	15	15	15
137	69	21	21	21
193	97	27	27	27
31	16	7	7	7
47	24	11	11	11
71	36	11	11	11
79	40	15	15	15
103	52	19	19	19
127	64	19	19	19
151	76	19	19	19
167	84	23	23	23
191	96	27	27	27
199	100	31	31	31
223	112	31	31	31

TABLE II. Comparison between Zimmermann -FSI and ant colony optimization (ACO) algorithm of Bland

Codes QR		True value of the minimum distance	d(Zimmermann-FSI)	d(ACO)	weight gain WG
n	k				
113	57	15	15	16	1
137	69	21	21	21	0
193	97	27	27	38	11
151	76	19	19	19	0
191	96	27	27	35	8
199	100	31	31	40	9

TABLE III. Comparison between Zimmermann-FSI and Aylaj's SA algorithm

Codes QR		d(SA)	d(Zimmermann-FSI)	weight gain WG
n	k			
383	192	63	47	16
431	216	75	47	28
463	232	79	59	20
479	240	83	55	28
409	205	68	47	21
433	217	76	37	39
449	225	76	55	21
439	220	72	47	25

TABLE IV. Comparison between ZIMMERMANN-FSI and MIM methods

Codes QR		d(Zimmermann-FSI)	d(MIM)	weight gain WG
n	k			
313	157	39	39	0
337	169	39	39	0
353	177	41	41	0
401	201	41	61	20
409	205	47	63	16
433	217	37	67	30
449	225	55	67	12
311	156	35	35	0
359	180	39	55	16
367	184	47	59	12

383	192	47	59	12
431	216	47	67	20
439	220	47	67	20

TABLE V. Comparison between Zimmermann-FSI and Zimmermann methods

Codes QR		d(Zimmermann-FSI)	d(Zimmermann)	Total Run Time of Zimmermann-FSI	Run Time of Zimmermann	WG
n	k					
439	220	47	67	332	2853	20
569	285	59	91	54268	12422	32
631	316	75	103	19944	48447	28

TABLE VI. Comparison between Zimmermann-FSI and MIM-FSI methods

QR Codes		d(Zimmermann-FSI)	d(MIM-FSI)	Total Run Time of MIM-FSI	Total Run Time of Zimmermann-FSI
n	k				
439	220	47	47	438	332
487	244	55	55	86672	553
503	252	55	55	42084	9084
521	261	53	53	226045	709
569	285	59	75	88518	54268
607	304	83	83	129550	1384
631	316	75	87	732833	19944

TABLE VII. Comparison between Zimmermann-FSI and Zimmermann-FSI-RSC methods

QR Codes		d(Zimmermann-FSI)	d(Zimmermann-FSI-RSC)
n	k		
463	232	55	55
487	244	55	55
503	252	55	55
521	261	53	53
569	290	59	59
601	301	79	77

V. Conclusion and perspectives

In this paper we have proposed new efficient schemes to find the minimum weight in large Quadratic Residue codes. These schemes permits to catch codewords of very smallest weight comparing to other known powerful methods. In the perspectives we have to adapt and use these methods to find the minimum weight in other linear codes like BCH codes, Low Density Parity Check codes (LDPC) and convolutional codes.

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