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Article

Two Phases GC-LDPC Decoding Aided with Early Termination and Forced Convergence

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Abstract: The fast decoding of low-density parity-check (LDPC) is crucial for its future applications. In this paper, we propose to use Early Termination (ET) and Force Convergence (FC) techniques to accelerate the decoding of two new local/global two-phases decoding algorithms to reduce the Globally Coupled (GC) LDPC codes. Specifically, ET is applied in the local decoding phase of two-phases decoding of GC-LDPC codes to skip the local decoding which is highly likely to fail and avoid the unnecessary iterations. FC is applied in global decoding phase where converged variable nodes are identified and removed from Tanner graph and the decoding can be speed up shrinking parity check matrices. Two variants are proposed for the ET operation in local decoding phase. ET-1 merely stops iteration if it meets the stopping criterion while in ET-1, the iteration number saved in local decoding is added up in global decoding to improve the decoding performance. The simulation results show that the ET-1-FC scheme can save up to 42% decoding time complexity in the low SNR region while keeping the error rate performance nearly unchanged, the ET-2-FC can improve the error rate performance by 0.18dB at bit error rate 0.001 or 0.23dB at frame error rate 0.01. In the waterfalling region of BER/FER curves, both schemes can save about 25% decoding time complexity.

Keywords: globally-coupled LDPC code; local/global two-phases decoding; early termination; force convergence; low complexity

1. Introduction

In recently years, the Globally-Coupled (GC) Low-Density-Parity-Check (LDPC) code attracts the many attention for its special structure and decoding algorithm [1–4]. This code performs well in both AWGNC and BEC. The GC-LDPC code consists of several individual local LDPC codes and the global coupling part. The global coupling part connects these local codes, enlarging the size of the code and improving connectivity. These local codes can be decoding individually, which is called local phase decoding. If the local decoding cannot makes the local codes convergence, the global decoding should step in the final decoding process. This kind of decoding algorithm is called local/global two-phases decoding[1]. Thanks to the two-phases decoding algorithm, the decoding time delay can be reduced by parallel local decoding. In the hardware implement, the GC-LDPC code leads the system more efficient and larger throughput [5–7]. In MIMO system, GC-LDPC code improves throughput by 4 and 5 times for code rates of 0.49 and 0.66[8]. To make GC-LDPC code design more flexible, many paper provide several constructions[9–13]. To design the GC-LDPC code with better performance, [14] gives the protograph-based construction by P-Extrinsic Information Transfer (EXIT) chart, performs better than previous GC-LDPC code, converts the general global coupling part to the tail-biting structure can also improve the code's performance[15]. The free-ride code is utilized as the implicit global coupling part [16]. This kind of GC-LDPC code gets same code rate as the local codes, and gets more than 0.8dB gain than the local codes. In most cases, finite fields or finite geometry is used to build the QC-GC-LDPC code, and the girth is limited to 6. The short cycles always produce the trapping sets, which leads the *error – floor* phenomenon to LDPC codes with the *message – passing* decoding[17]. The girth of GC-LDPC code is extended from 6 to 8 with Greatest Common Divisor (GCD) criterion[18].

The Early Termination (ET) algorithm is the conventional method to save the decoding complexity[19–24]. The ET technology is consisted by Early Give Up (EGU) and Early Success (ES)[22]. The main

propose of EGU is stopping the nonconvergent code early to save the decoding complexity. The ES stops the decoding process if it is converged to a valid result. The method of determining whether the code converges is very important, which decides the final performance of the code. [21,22] study the decision theory of ET. The Receiver Operating Characteristic (ROC) curve is a useful tool to analyze the sensitivity of detector to build a accuracy judge condition [22].

Same as ET, the Force Convergence (FC) algorithm is utilized as a conventional method to save decoding complexity[25–30]. By monitoring the nodes in real time, FC determines the node satisfying the convergence condition in advance and removes the node in the rest iterations. In most cases, the amplitude of each node is utilized to judge the reliability.

This paper firstly adopted the ET algorithm into the local phase decoding. The proposed ET-1 decoding scheme saves 40 – 42% decoding time complexity compared with the conventional two-phases decoding scheme in low SNR region, without performance degradation. The ET-2 decoding scheme improves the code's performance with the same decoding time complexity with the conventional two-phases decoding. Then, the FC scheme is used to the global phase decoding to further save the decoding time complexity. In the ET-1-FC decoding algorithm, the FC scheme saves more time complexity in the waterfall region, with the same final performance as other decoding algorithm. The ET-2-FC decoding algorithm improves 1.8dB in waterfall region in BER and 2.3dB in FER. Meanwhile, in this algorithm, the FC scheme saves 25% decoding time complexity in the waterfall region.

2. GC-LDPC Code

Let the GC-LDPC code is consisted by t local codes $\mathbf{H}_L^i, i \in [0, t - 1]$, and the global coupling part is \mathbf{H}_X . The general structure of GC-LDPC code is shown as equation (1).

$$\mathbf{H}_{GC} = \left[\begin{array}{cccc} \mathbf{H}_L^0 & & & \\ & \mathbf{H}_L^1 & & \\ & & \ddots & \\ & & & \mathbf{H}_L^{t-1} \\ \hline & & & & \mathbf{H}_X \end{array} \right]. \quad (1)$$

In this paper, we consider \mathbf{H}_L^i with same size. Setting n as the code length of \mathbf{H}_{GC} , the local code length is n/t . The global coupling part make the global code rate r_G is lower than the local code rate r_L .

2.1. Construct Method

The main construction idea of GC-LDPC code is to form the code structure \mathbf{H}_{GC} by deformation of the matrix with good girth. Therefore, the design method of the matrix is the most important step in the construction process.

The first construction method of GC-LDPC code is based on finite fields. Let α be a prime element in $\text{GF}(q)$. The non-zero elements in $\text{GF}(q)$ constitute the sequence $\alpha^0 = 1, \alpha^1, \dots, \alpha^{q-2}, \alpha^{q-1} = \alpha^0 = 1$. A $(q-1) \times (q-1)$ cyclic matrix \mathbf{B}_1 can be constructed from this cyclic sequence [1]:

$$\mathbf{B}_1 = \begin{bmatrix} \alpha^0 - 1 & \alpha - 1 & \cdots & \alpha^{q-3} - 1 & \alpha^{q-2} - 1 \\ \alpha^{q-2} - 1 & \alpha^0 - 1 & \cdots & \alpha^{q-4} - 1 & \alpha^{q-3} - 1 \\ \vdots & \vdots & \ddots & \vdots & \vdots \\ \alpha - 1 & \alpha^2 - 1 & \cdots & \alpha^{q-2} - 1 & \alpha^0 - 1 \end{bmatrix}. \quad (2)$$

Any two rows $0 \leq i < j \leq q - 1$ and two columns $0 \leq k < l \leq q - 1$ can be related to a 2×2 sub-matrix $\mathbf{M}_1 = \begin{bmatrix} \alpha^{i-k} - 1 & \alpha^{j-k} - 1 \\ \alpha^{i-l} - 1 & \alpha^{j-l} - 1 \end{bmatrix}$. At the same time, a matrix \mathbf{B}_2 satisfy the 2×2 -SM constraint can be constructed as

$$\mathbf{B}_2 = \begin{bmatrix} 1 & 1 & 1 & \cdots & 1 \\ 1 & \beta & \beta^2 & \cdots & \beta^{p-1} \\ 1 & \beta^2 & (\beta^2)^2 & \cdots & (\beta^2)^{p-1} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 1 & \beta^{p-1} & (\beta^{p-1})^2 & \cdots & (\beta^{p-1})^{p-1} \end{bmatrix}. \quad (3)$$

The method based on RS (Reed-Solomn) code can also design GC-LDPC code with girth of at least 6 [10,12]. This code has remarkable performance for correcting random errors, random short phased bursts of erasures and long bursts of erasures. Let α be the prime factor of $\text{GF}(2^s)$. If $2^s - 1$ is not a prime number and n is a factor of it, $2^s - 1 = cn$. Let $\beta = \alpha^c$, there is an n ordered sequence $\mathbf{S} = \{1, \beta, \beta^2, \dots, \beta^{n-1}\}$, called the multiplicative group of $\text{GF}(2^s)$. Take \mathbf{S} as the root to get the following matrix,

$$\mathbf{B}_{\text{RS}(d,n)} = \begin{bmatrix} 1 & \beta & \beta^2 & \cdots & \beta^{n-1} \\ 1 & \beta^2 & (\beta^2)^2 & \cdots & (\beta^2)^{n-1} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 1 & \beta^d & (\beta^d)^2 & \cdots & (\beta^d)^{n-1} \end{bmatrix}. \quad (4)$$

Let p_s be the smallest prime factor of n and d be a positive integer less than or equal to p_s , $1 \leq d \leq p_s$. When $c = 1$, $\mathbf{B}_{\text{RS}(d,n)}$ primitive RS code, otherwise it is nonprimitive RS code, and $\mathbf{B}_{\text{RS}(d,n)}$ is a matrix that satisfies the 2×2 -SM constraint. Now, the matrix (1) can be constructed by \mathbf{B}_1 , \mathbf{B}_2 or $\mathbf{B}_{\text{RS}(d,n)}$ through PEM (partition, edge-spreading, mask) operations. A special design scheme is proposed in [13], namely the RS-liked construction method. In this scheme, the local code and the global part can be designed independently. The RS-liked construction method simplifies the search for design parameters in algebraic construction, making it easier to determine parameters such as p and the t . This construction method can be based on any $\text{GF}(\gamma^s)$, γ is prime, breaking the traditional RS code based on $\text{GF}(2^s)$ setting. Local code set $\mathbf{RS}_1(t, p, d_1)$ global part for $\mathbf{RS}_2(1, tp, d_2)$.

$$\mathbf{RS}(a, b, d) = \begin{bmatrix} \beta^0 & \beta^a & \beta^{2a} & \cdots & \beta^{a(b-1)} \\ \beta^0 & \beta^{2a} & \beta^{4a} & \cdots & \beta^{2a(b-1)} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ \beta^0 & \beta^{ad} & \beta^{2ad} & \cdots & \beta^{ad(b-1)} \end{bmatrix}. \quad (5)$$

This design can flexibly design local codes of different sizes. Suppose you want to construct two different size of local code $\mathbf{RS}_{1,1}$ and $\mathbf{RS}_{1,2}$. Decomposing $\gamma^s - 1$ as $\gamma^s - 1 = t_1 t_2 p e$. Constructed of two local codes respectively $\mathbf{RS}_{1,1} = \text{RS}(t_1, p, d_{1,1})$ and $\mathbf{RS}_{1,2} = \text{RS}(t_2, p, d_{1,2})$, The global part is RS code $\mathbf{RS}_2 = \text{RS}(1, t_1 t_2 p, d_2)$. $d_{1,1} < \lfloor p/t_1 \rfloor, d_{1,2} < \lfloor p/t_2 \rfloor$, and $d_2 < \min\{t_1, t_2\}$.

The previous construction methods can only ensure the girth 6 for GC-LDPC code. In [18], we propose the GCD-based construction method to raise the girth to 8. The (J, L) GCD-based full-length row multiplier (FLRM) matrix is :

$$\mathbf{E} = \begin{bmatrix} a_0 b_0 & a_0 b_1 & \cdots & a_0 b_{L-1} \\ a_1 b_0 & a_1 b_1 & \cdots & a_1 b_{L-1} \\ \vdots & \vdots & \ddots & \vdots \\ a_{J-1} b_0 & a_{J-1} b_1 & \cdots & a_{J-1} b_{L-1} \end{bmatrix}, \quad (6)$$

where a_i , and b_i are integers with $0 \leq a_0 < a_1 < \cdots < a_{J-1}$ and $0 \leq b_0 < b_1 < \cdots < b_{L-1}$. Each $a_i, b_j, i \in [0, J), j \in [0, L)$ is exponential factor for $P \times P$ sized CPM. The row coefficient vector is

$\mathbf{a} = (a_0, a_1, \dots, a_{J-1})$, and in common way the column coefficients vector is $\mathbf{b} = (b_0, b_1, \dots, b_{L-1}) = (0, 1, \dots, L-1)$. In conventional GCD-based LDPC code, the minimum bound of P is $P_{\min}^* = (a_{J-1} - a_0)(L-1) + 1$. We discover the new lower bound of the GCD-FLRM to make the design of GC-GCD-LDPC code more flexible[31]. For the GC-GCD-LDPC code have better performance than other kinds, this paper takes GC-GCD-LDPC code as the main analysis object.

2.2. Local/Global Two-Phases Decoding

The local/global two-phases decoding scheme is the most interest characteristic of GC-LDPC code. Each bit in the codeword belongs to the local code as well as the global code. Therefore, decoding and parity-check can be processed within the local code, also in the global code. The decoding flow chart is shown Figure 1.

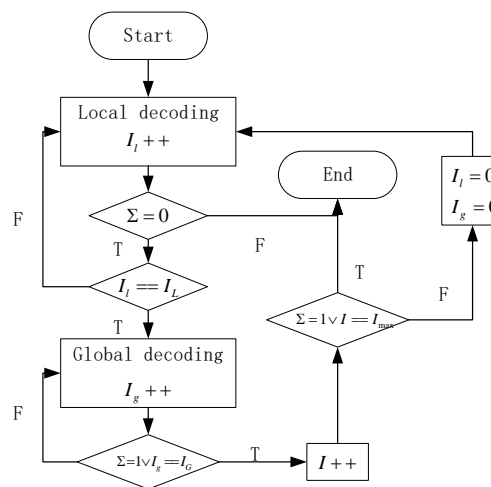


Figure 1. Local/global two-phases decoding

I_L and I_G defines maximum number of iterations for local and global decoding, respectively. And I_{max} defines the maximum times of switch between two phases. (I_L, I_G, I_{max}) defines a two-phases decoding process. If the global decoding does not back to local decoding, $I_{max} = 0$, the scheme is called global/local two levels decoding[2], which is determined by (I_L, I_G) . These two kind of decoding algorithm have similar limit performance. The decoding complexity can be effectively reduced by the reasonable design of two-phases decoding. For simplicity, this paper considers the local/global two level decoding as the decoding scheme. In the high SNR region, local decoding can carry out independent decoding so as to reduce the amount of computation in the process of decoding. It is foreseeable that, designing different levels of local code can be applied to techniques such as unequal protection and multilevel code.

For the local codes are mutually independent, the codes in the local phase decoding can be decoded in parallel. Therefore, the time complexity of the local decoding iteration can be regarded as the decoding complexity of the largest local code. In this paper, the local codes have the same size. The time complexity of local decoding is defined as $L_t = L_c/t$, which L_c is the decoding complexity of all local codes. Defining g_c as the decoding complexity of global coupling part, the global decoding complexity is $G_c = L_c + g_c$, provided that the nodes are not deleted or frozen during iterations. For per-iteration, the local decoding costs less than $1/t$ time of the global decoding.

3. Early Termination Algorithm

3.1. Decision Theory

In the initial ET scheme, the variable node reliability (VNR) is defined as equation 7[23].

$$VNR = \sum_{\forall i} |L_i| \quad (7)$$

The L_i is the log-likelihood ratios (LLR) of i^{th} variable node. In [22] gives three indicators of judgment, which is defined as $v_0 - v_2$ in 8, to monitor convergence behavior of iterative decoding.

$$\begin{aligned} & v_0 \\ &= \|L\|_1/n \\ & v_1 \\ &= 1 - \|s\|_0/(n-k) \\ & v_2 \\ &= |\{L_i : |L_i| > \theta\}|/n \end{aligned} \quad (8)$$

v_0 is the mean magnitude of LLR of all variable nodes. v_1 is the fraction of satisfied check nodes, $s = \hat{x} \cdot \mathbf{H}^T$, and \hat{x} is the hard judge value of L . v_2 is the fraction of large amplitude of variable nodes, and the judgment threshold is θ .

Through the above three indicators, the respective criterion is designed as $C_0 - C_2$.

1. C_0 if $v_0^l < v_0^{l-1}$ appears T times, terminate decode, $l < I_L$.
2. C_1 if $v_1^l < v_{1,min}$, $I_l > l_{1,min}$, the $v_{1,min}$ is the v_1 value in $l_{1,min}$ iteration, terminate decode. Or, when successive $v_1^l \leq v_1^{l-1}$ occur T times, stop decode.
3. C_2 if $v_2^l < v_{2,min}$ occurs when $I_l \geq l_{2,min}$, terminate decode. $v_{2,min}$ is the v_2 value in $l_{2,min}$ iteration.

C_0 and C_2 are both limitations of variable nodes, and C_2 works better than C_0 . Thus, in this paper, C_1 and C_2 are utilized in the local decoding in the meantime.

To choose the proper parameters in C_1 and C_2 , [22] use the ROC curve to select these parameters. Let $\Sigma = 0, 1$ represents decoding nonsuccess or success, respectively. And $\hat{\Sigma} = 0, 1$ represents the predict result of decoding nonsuccess or success, respectively. Thus, the False-Positive Rate (FPR) P_{FP} and True-Positive Rate (TPR) P_{TP} are

$$\begin{aligned} P_{FP} &= Pr\{\hat{\Sigma} = 1 | \Sigma = 0\} \\ P_{TP} &= Pr\{\hat{\Sigma} = 1 | \Sigma = 1\} \end{aligned} \quad (9)$$

ROC curve is the relation of P_{FP} and P_{TP} is defined as

$$P_{TP} := f_{TP}(P_{FP}) \quad (10)$$

The area under ROC curve $A_{ROC} = \int_0^1 f_{TP}(p) dp$ is an effective quantitative judgment index. A larger A_{ROC} indicates a more accurate prediction and a more reasonable setting of parameters. If the parameters are set perfectly, $A_{ROC} = 1$.

3.2. ET-Two-Phases Decoding

The purpose of introducing ET scheme to GC-LDPC decoding in this paper is to reduce the unnecessary iteration complexity of local decoding at low SNR. Therefore, the ET scheme is only used to local decoding process. Thus, we propose the ET-1 scheme as figure 2.

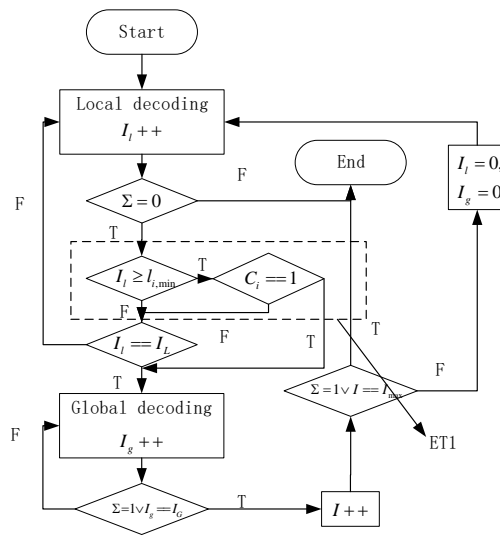


Figure 2. flow chart of ET-1

The processes in dotted box is the ET decision. An well designed parameters save lot of unnecessary iteration of local decoding. In $C_1, l_{1,min}$ or T is the key parameter. To facilitate the simulation, this paper adopts the second way. In $C_2, l_{2,min}$ and $v_{2,min}$ should be selected to optimize the ET scheme.

To allocate the decoding complexity more reasonably, We propose ET-2 to assign the decoding complexity adaptively. The number of decoding iterations saved by ET1 translates into I_G^T , which is the additional number of global decoding iterations. The process of ET-2 is show in figure 3.

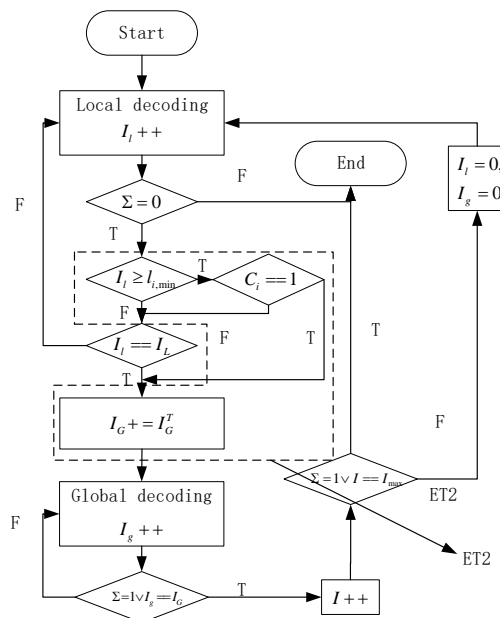


Figure 3. flow chart of ET-2

In low SNR region, the ET-2 two-phases decoding adaptively increases the number of iterations in global decoding. Thus, the performance if GC-LDPC code in low SNR region has been effectively improved. It is worth to mention, the ET scheme is aim to improve the GC-LDPC code's performance in low SNR region. With the SNR increase, the impact of ET-1 and ET-2 decreases gradually.

4. Force Convergence Algorithm

To further save the decoding, FC scheme is introduced into the two-phases decoding to save bit-level complexity. In modern communication system, the high order Quadrature Amplitude Modulation (QAM) is a popular method to improve the throughput. For example, the 5G communication has expanded 256QAM from 64QAM in 4G. However, the reliability difference between bits becomes larger as the modulation order increases. The actual communication system is more complex and the reliability difference between bits inevitably becomes larger. In the iteration of LDPC code, the higher reliability converge earlier than others. Stopping the node iteration corresponding to the convergent bit in time can effectively reduce the decoding complexity. The well designed FC scheme can not only save decoding complexity, but also slightly improve the code's performance.

4.1. Basic of FC Algorithm

The original conception of FC, the reliability of variable and check nodes are defined as equation (11).

$$R_{j,i} = \prod_{i',j' \neq i} \text{sgn}(Q_{i',j'}) \Phi \left(\sum_{i',j' \neq i} \Phi(Q_{i',j'}) \right) \quad (11)$$

The $\Phi(x) = \log \frac{e^x + 1}{e^x - 1}$, and $Q_{i,j}$ is the message exchanged through i^{th} check node to j^{th} variable node in log domain. The "aggregate messages" B_i for variable node and C_j for check node.

$$\begin{aligned} B_v^i &= L_i + \sum R_{j,i} \\ C_c^j &= \sum \Phi(|Q_{i',j}|) \end{aligned} \quad (12)$$

The judgement threshold of variable and check nodes are t_v and t_c . When $B_v^i > t_v$ and $C_c^j < t_c$, the node is deactivated for the rest of the iteration. To simplify the judgment process, [18] uses the adjacent deactivated variable nodes to judge the check node instead of directly judging the check node information. This scheme is called Simplified Forced Convergence (SFC). In MinSum decoding scheme, the check nodes' operation in SFC is shown as equation (13).

$$C_c^{i,j} = \prod_{j' \in \Psi_i \setminus j} \text{sign}(Q_{i,j'}) \min_{j' \in \Psi_i \setminus (j,k)} (|Q_{i,j'}|) \quad (13)$$

The Ψ_i denotes the set of variable nodes adjacent to i^{th} check node, and k is the freezed variable node. The i^{th} check nodes only be deactivated when the nodes in Ψ_i are all freezed. Comparing with the original FC, using the method of judging only variable nodes can significantly reduce the computational complexity and memory accesses resulting in low power consumption[31], which is called Simplified Force Convergence (SFC). [29] propose an Adaptive Forced Convergence (AFC) algorithm. The dynamic threshold value is set as equation (14).

$$t_v = t_0 - (\Delta t \times i) \quad (14)$$

Where Δt is the constant dynamic value of threshold, i is the index of iteration and t_0 is the initial threshold. To forbid the wrong judgement of nodes, the freezed check nodes, which is unsatisfied the rest iterations, should be re-active.

5. Simulation and Analysis

5.1. Code Construction

Firstly, we construct a GCD-based GC-LDPC code, which is called GC-1[18]. Building a GCD-FLRM sized 4×13 , the first three rows consist the exponential matrix of local code, and the global part is built with three replication of last row. The Z-factor of the exponential matrix is $P = 169$. The code length is $n = 6591$, and the code rate is $r = 0.751934$.

In order to reflect the advantages of the proposed decoding, the 5G-LDPC code is used as the comparison code in this paper. The code rate of 5G-LDPC code is $r = 0.751$, and the information length is $k = 4956$. In these parameters, the BG-2 matrix should be selected as the exponential matrix, and the Z-factor is $P = 240$. The transmission code length of 5G-LDPC is $n = 6600$. However, the channel source should be unrate matching before the decoder. Thus, in decoder the length of the code participating in the iteration is $N = 16320$. The 5G-LDPC code in this paper is called 5G-1.

5.2. ET-Two-Phases Decoding

Firstly, we use the ROC curve to optimize the parameters in ET scheme.

From Figure 4 the local code of GC-1 cannot decode successful in 4 iterations. The C_2 is used in local decoding in 4 iterations. When the SNR is lower than 2.4dB, the local code can hardly decode successfully by itself. The local phase decoding in this region is almost unnecessary. When the SNR is higher than 3dB, the curve of success probability of the local decoding is flattens out at 20 iterations.

The local decoding has a probability of convergence after 10 iterations. Therefore, C_1 works with a large probability after 10 iterations. The ROC curves of $v_{2,min}$ in Figure 5. The threshold of the hard decision is predefined as $\theta = 5$.

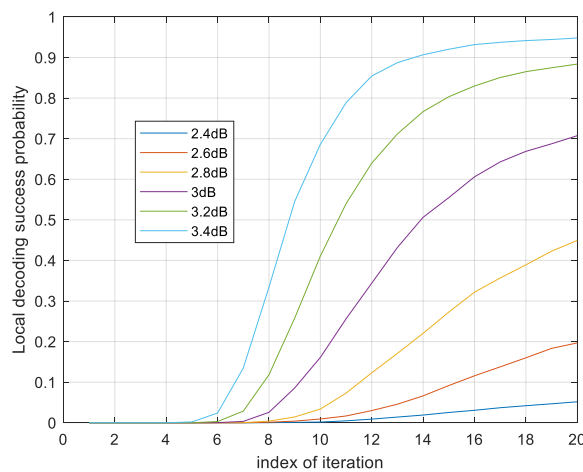


Figure 4. Probability of successful local decoding in 20 iterations with different SNR

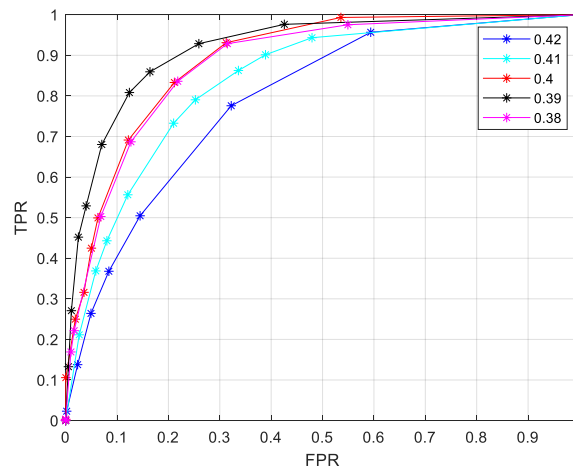


Figure 5. ROC curves in different value of $v_{2,min}$

In Figure 5, it is easy to see $v_{2,min} = 0.39$ is the best selection because it maximized A_{ROC} . $v_{1,min}$ and $v_{2,min}$ is optimized in the same way. To avoid repeating the elaboration of the optimization process, we give the TABLE 1 as the summation of ET schemes.

Table 1. optimized parameters of C_1 and C_2

C_1	C_2
$T=1$	$\theta = 5$
$l_1^{thr} = 10$	$l_2^{thr} = 4$
$v_1^{thr} = 0.8$	$v_2^{thr} = 0.39$

The GC-1 is simulated in AWGNC with QPSK modulation. For the sake of statistics, each time of the node participate the iterations is account to 1 time complexity. As front mentioned, the local codes are decoded in parallel, the time complexity of local decoding is $L_t = L_c/t$. The maximum number of the local iterations is set as $I_L = 40$. To make the global decoding has equally decoding time complexity, the maximum number of global iterations is set as $I_G = 10$.

Firstly, the ET-1 schemes are used to GC-1. The comparison result of the complexity of ET-1 is given in Figure 6.

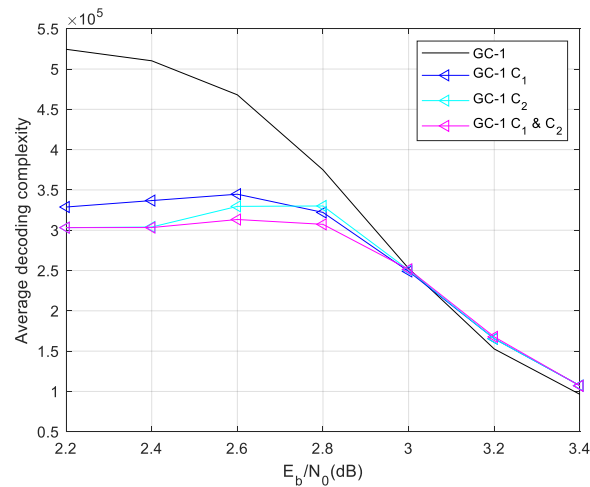


Figure 6. complexity of GC-1 in different ET-1 schemes

The result shows the ET-1 schemes saves much complexity in lower SNR region. In higher SNR region, the ET-1 schemes have similar time complexity with the normal local/global two level decoding. This result demonstrate the misjudgment probability of the designed ET scheme is extremely low. While the ET schemes misjudgment leads early termination of the data, thus entering the global decoding, it will lead to a large increase in the decoding time complexity. The C₁ & C₂ scheme saves more decoding time complexity than others. While SNR is 2.2dB, C₁ & C₂ scheme save 42.19% time complexity than regular two level decoding.

Then we give the performance of GC-1 as the Figure 7. The designed ET-1 schemes have similar BER and FER performance with the normal local/global two level decoding.

The complexity statistic and performance demonstrate the proposed C₁ & C₂ ET-1 scheme saves lot of

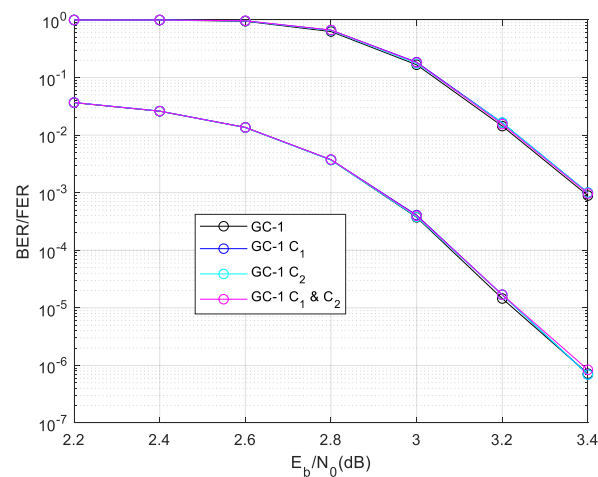


Figure 7. performances of GC-1 in different ET-1 schemes

decoding time complexity in lower SNR region without perform degradation. Afterward, the we use the ET-2 in these codes. For the proposed C₁ & C₂ scheme performs better than others, the C₁ and C₂ schemes are no longer simulated in follow cases. The complexity of ET-2 decoding scheme is shown as the Figure 8 .

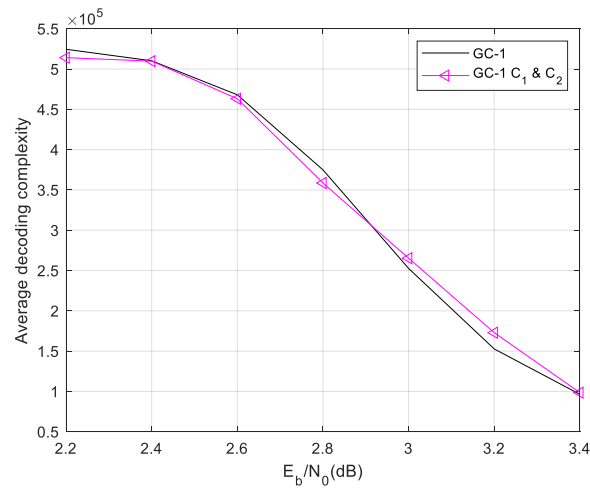


Figure 8. complexity of GC-1 in different ET-2 scheme

The result shows the ET-2 scheme does not save the decoding complexity. The performance result is showing as the figure 9.

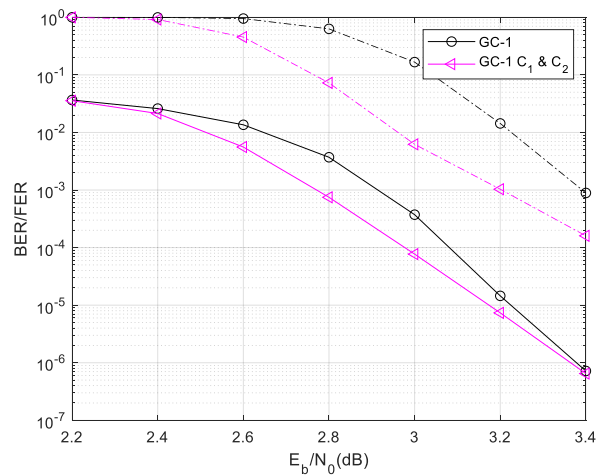


Figure 9. performance of GC-1 in different ET-2 scheme

The result proves that, the ET-2 scheme makes the GC-1's 0.18dB gain in BER and 2.3dB gain in FER. In the low SNR region, the failure probability of local decoding is higher. The average of I_G^T is higher. However, with the SNR increase the average of I_G^T decreasing. The performance of ET-2 based GC-1 gradually approaching the conventional decoding performance. The premise of improving the performance is that the decoding complexity and the number of global decoding is limited. If the number of global decoding I_G is set high enough, ET-2 scheme is difficult to bring performance gain.

Overall, the ET-1 scheme saves lots of decoding time complexity without performance degradation. The ET-2 scheme improves decoding performance without increasing the decoding complexity, when I_G is limited.

5.3. ET-FC-Two-Phases Decoding

To get a better decoding performance, we combine the ET and FC schemes in the two-phases decoding of GC-LDPC code. In global phase decoding, the nodes converge better than the shorter local codes. So the FC scheme is more suitable to be utilized in the global phase decoding process. In the proposed decoding algorithm, the ET-1 C_1 & C_2 scheme is utilized in the local phase decoding process and the AFC scheme is used in the global decoding process. The parameters of the FC scheme are optimized by the ROC curve as before. The final FC parameters are $t_0 = 20$ $\delta = 0.75$. The performance and decoding complexity are shown in Figure 10 and Figure 11.

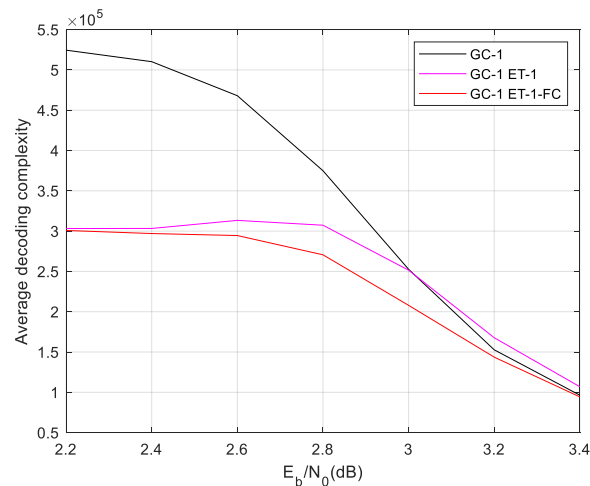


Figure 10. performance of GC-1 in ET-1-FC decoding scheme

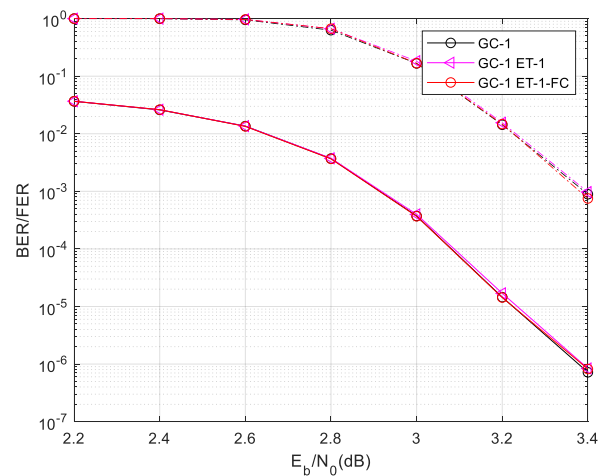


Figure 11. complexity of GC-1 in ET-1-FC decoding scheme

The ET-1-FC decoding scheme further saves the complexity than the ET-1 scheme in most situations. In the lower SNR region, the speed of convergence is slower, the effect of the FC scheme is weaker. In the waterfall region, the probability of nodes' convergence is higher, the FC scheme saves a lot of decoding complexity. And the ET-1-FC two-phases decoding algorithm does not bring any performance degradation in BER/FER, as well as the ET-1 scheme.

Then, the FC scheme is also used in the ET-2 two-phases decoding algorithm. The complexity and performance of ET-2-FC two-phases decoding is shown as the Figure 12 and Figure 13.

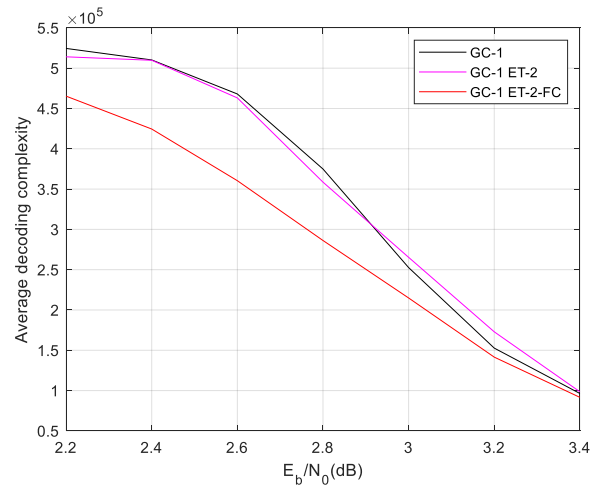


Figure 12. performance of GC-1 in ET-2-FC decoding scheme

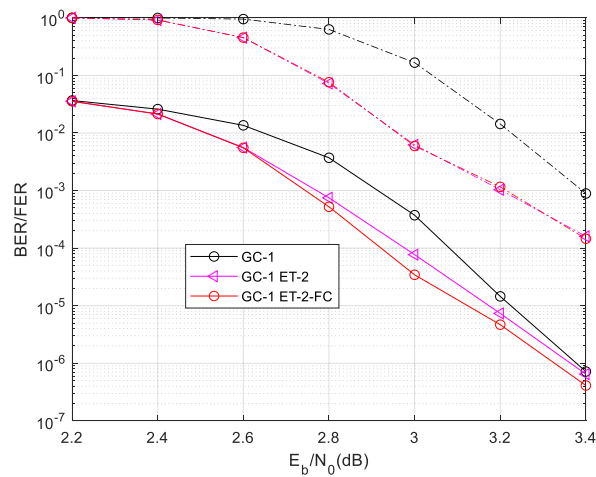


Figure 13. complexity of GC-1 in ET-2-FC decoding scheme

The ET-2 scheme extend the iterations of the globally decoding, which leads the FC scheme saves more complexity than the ET-1 based two-phases decoding. In the waterfall region, the ET-2-FC two-phases decoding algorithm saves about 25% decoding time complexity. And the FC scheme also slightly improve the BER performance.

6. Conclusions

This paper gives two new two-phases decoding algorithms aiming to further save the decoding time complexity of GC-LDPC code. The ET and FC scheme is used into the decoding algorithm to save the decoding complexity. With the reasonable application of ET and FC techniques, the decoding results of GC-LDPC codes can reduce the complexity of GC-LDPC codes with almost no performance loss. The proposed ET-1-FC decoding algorithm saves 42% decoding time complexity in the low SNR region, without performance degradation. The ET-2-FC improves the BER/FER performance when

the number of global iterations with the decoding complexity is constrained. In the papers' case, the ET-2-FC decoding algorithm improve 1.8dB in BER and 2.3dB in FER, with 25% decoding time complexity reduction in the waterfall region.

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