



# Extremely-Large Key-Space Color Image Encryption Scheme using Combined Memristive Chaotic System

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## Abstract

The security level and robustness of memristive image encryption techniques depend on the order and dynamics complexity of the memristive system. The grid multi-double-scroll (GMDS) chaotic system (CS) offers extremely rich dynamics but the implementation of high-order chaos needs large computation time. To overcome this limitation, researchers have proposed the use of multi-lower-order CSs to assist the encryption process individually. This scenario may reduce the security level since the non-friendly user may attack each involved CS independently. This paper proposes an effective six-dimensional (6D) memristive chaotic system constructed by combining 5D, 5D, and 7D GMDS chaotic systems. Each of the six chaotic sequences is generated from three sequences corresponding to two or three of the basic CSs. The combined CS shares the same total key parameters (initial values and design parameters associated with the three basic CSs) and this leads to a key space of  $2^{2392}$ , the highest among the reported image encryption techniques. The combined CS is used to assist the operation of a proposed color image encryption scheme consisting of four sequential stages that perform compressive sensing, scrambling, DNA encoding, and diffusion, respectively. Simulation results validate the feasibility and robust security of the proposed encryption scheme.

**Keywords:** Color Image Encryption; Memristive Chaotic Encryption; Combined Memristive Chaotic System

مخطط تشفير صور ملونة بمساحة مفتاحية كبيرة للغاية باستخدام نظام ميموريستر

فوضوي مدمج

سبي عبد الكاظم عبد الحسن، رعد سامي فياض

الخلاصة:

يعتمد مستوى الأمان وقوة تقنيات تشفير الصور التي تستخدم نظام الميموريستر الفوضوي (Memristive Chaotic System) على تعقيد النظام الميمريستي وديناميكيته. يقدم نظام الفوضى المتعدد التمريرات المزدوجة الشبكي (Grid multi-double-scroll (GMDS)) ديناميكية غنية جداً، ولكن تنفيذ الفوضى عالية المرتبة يتطلب وقتاً طويلاً للحسابات. للتغلب على هذا القيد، اقترح الباحثون استخدام أنظمة فوضوية منخفضة المرتبة لدعم عملية التشفير بشكل فردي، مما قد يؤدي إلى انخفاض مستوى الأمان حيث يمكن للمهاجم استهداف كل نظام فوضوي على حدة. يقترح هذا البحث نظاماً فوضوياً ميمريستيقاً فعالاً من المرتبة السادسة، يتم إنشاؤه من دمج ثلاثة أنظمة فوضوية ذات خمسة وستة وسبعة مراتب. يتم توليد كل سلسلة فوضوية من ثلاثة تسلسلات تعتمد على اثنين أو ثلاثة من الأنظمة الأساسية. يشترك النظام المدمج على نفس المعلمات المفتاحية (القيم الأولية ومعلمات تصميم الأنظمة الأساسية الثلاث)، مما يؤدي إلى مساحة مفاتيح بحجم  $2^{2392}$ ، وهي الأكبر بين تقنيات تشفير الصور المبلغ عنها في الأدبيات العلمية. تم استخدام هذا النظام الفوضوي لدعم خوارزمية مقترحة لتشفير الصور الملونة، والتي تتكون من أربع مراحل متتالية تشمل التحسس الانضغاطي (Compressive sensing)، التشويش

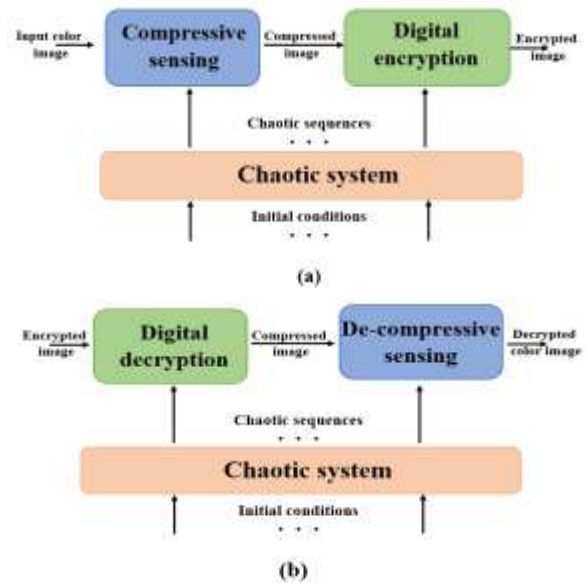


(Scrambling)، الترميز باستخدام الحمض النووي (DNA encoding)، والانتشار (Diffusion). أثبتت نتائج المحاكاة جدوى وقوة أمان الخوارزمية المقترحة.

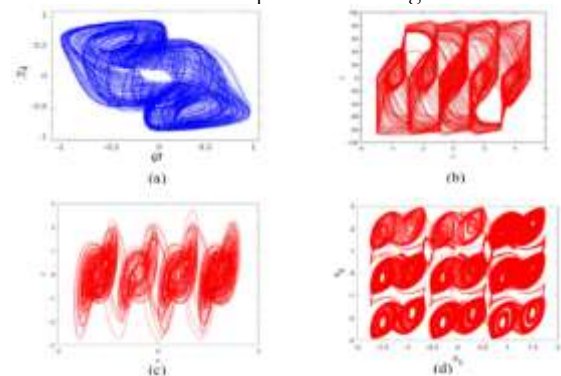
## 1. Introduction

The security level and robustness of image encryption techniques can be enhanced strongly by adopting chaotic system (CS) rather than pseudo random number generator (PRNG) [1][2][3]. The CS has nonlinear dynamical behavior which is highly sensitive to initial conditions; tiny changes in initial conditions can lead to significant variations in long-term behavior [4][5]. Although, the CSs follow deterministic rules, where their state equations fully describe their dynamics without involving randomness, they have unpredictable behavior. Generally, the CS-assisted image encryption technique uses two identical CSs (same configuration and same initial conditions), one for the encryption process and the other for the decryption process as illustrated in Fig. 1 [6][7]. The efficiency of using CS in encryption techniques depends on the richness and strength of its nonlinear dynamics which are function of its dimension (order) [8][9] and its configuration (state space equations) [10][11].

Recently, there is increasing interest in using a memristive chaotic system (MCS) in image encryption techniques due to its highly-complex and extremely rich dynamical behavior [12][13][14][15]. The MCS combines the principles of chaos theory and the unique properties of memristors. In electrical circuits, the memristor is considered as the fourth basic passive element which acts as a nonlinear resistor that can remember the amount of charge that has previously flowed through it. This leads to nonlinear behavior and can give rise to chaotic dynamics [16][17]. A typical MCS can be described by a set of differential equations that incorporate the memristor's behavior and can be designed with high dimensions. For example, four-dimensional (4D) [18], 5D [19], 6D [20][21], and 7D [22] MCSs were designed by different research groups to realize highly secure image encryption systems. The design of these chaotic systems has been extended further to produce multi-scroll (MS) [23][24][25][26], multi-double-scroll (MDS) [27][28], grid MS (GMS) [29], and grid multi-double-scroll (GMDS) attractors [30]. The shapes of these attractors are illustrated in Fig. 2. The multi-scroll attractor is a complex chaos phenomenon having irregular scroll trajectories which offer higher tunability and complexity than single scroll attractors [23]. These features can be developed further by adopting GMS and GMDS chaotic systems. Lin et al. presented 5D, 6D, and 7D chaotic systems that are characterized by GMDS attractors extending in one, two, and three dimensions, respectively [30]. Their results showed that GMDS chaotic system offers extremely rich and very complex dynamics which makes it very efficient to realize high-secure and high-robust encryption techniques. These findings were deduced by applying the 6D GMDS chaotic system for the encryption of gray images.



**Figure (1):** Basic block diagrams of chaotic image encryption (a) and decryption (b) techniques designed with compressive sensing



**Figure (2):** Examples of chaotic attractors (a) single scroll attractor [23], (b) multi-scroll attractor [26], (c) grid multi-scroll attractor [29], (d) grid multi-double-scroll attractor [30].

One approach to enhance further the security level and robustness of chaotic encryption techniques is to use a high-order CS [31]. This approach generally faces the challenge of increasing computation times required to generate the chaotic sequences used in the associated encryption and decryption processes. To solve this challenge, researchers proposed to use multi-lower-order CSs with each CS shares partially the encryption (decryption) process [3][32]. The main limitation of this approach is that the attacker may deal with individual lower-order CS rather than the main high-order one which may lead to reduce the security level. To overcome this limitation, researches proposed recently the design of effectively low-order CS with increasing number of chaotic parameters, and hence with enhanced nonlinear dynamical behavior, by combining multi-low-order CS [33][34].



This paper proposes a 6D combined memristive chaotic system for color image encryption/decryption scheme. The MCS is generated by combining 5D, 6D, and 7D GMDS chaotic systems which are characterized by extremely rich and complex dynamics. The proposed scheme is implemented digitally by cascading four chaotic assisted-sub-schemes (compressive sensing, scrambling, DNA encoding, and diffusion). The proposed CS has 45 key-shared parameters (18 initial values plus 27 basic chaotic systems parameters) leading to a key space  $S = 2^{2392}$  which is highest value reported in the literature for digital image encryption.

The remainder of this paper is organized as follows. Section 2 introduces the proposed CS and gives some of its dynamical and randomness characteristics. The proposed image encryption/decryption scheme is described in Section 3 and its simulation results are presented in Section 4. Comparison with related work is given in Section 5. A summary is given at the end of the paper in Section 6.

## 2. Proposed Combined Memristive Chaotic System

This section describes the construction of the proposed combined CS and examines its dynamical behavior. The proposed CS is constructed by linear combination of the three memristive grid multi-double-scroll chaotic systems described in [30] as illustrated in Fig. 3. Here,  $\mathbf{x}(t)$ ,  $\mathbf{y}(t)$ , and  $\mathbf{z}(t)$  present the state space vectors of the 5D, 6D, and 7D GMDS systems, respectively. The chaotic sequences of these three CSs are combined as described by Eq. 1 to yield the output 6D sequences  $q_1$ - $q_6$

$$q_i = p_x x_i + p_y y_i + p_z z_i \quad i=1, 2, \dots, 5 \dots (1a)$$

$$q_6 = p_x x_6 + p_y y_6 + p_z z_6 \quad (1b)$$

where  $p_x$ ,  $p_y$ , and  $p_z$  are the combining proportionality constants of the three systems, respectively. The dynamics of these systems are described by [30]

$$\begin{aligned} \dot{x}_1 &= -x_1 + 0.5 \tanh(x_2) + 0.1 \tanh(x_4) \\ &\quad + 0.2 \tanh(x_1) \\ \dot{x}_2 &= -x_2 + 10 \tanh(x_3) + W_1 \tanh(x_1) \\ \dot{x}_3 &= -x_3 + \tanh(x_4) - 4 \tanh(x_1) \\ \dot{x}_4 &= -x_4 + 18 \tanh(x_2) + d_1 \tanh(x_1) + \tanh(x_4) \\ \dot{x}_5 &= b_1 \tanh(x_1) - c_1 g(x_5) \end{aligned} \quad (2)$$

$$\begin{aligned} \dot{y}_1 &= -y_1 + 0.5 \tanh(y_2) + 0.1 \tanh(y_4) \\ &\quad + 0.2 \tanh(y_1) \\ \dot{y}_2 &= -y_2 + 10 \tanh(y_3) + W_2 \tanh(y_1) + W_3 \tanh(y_2) \\ \dot{y}_3 &= -y_3 + \tanh(y_4) - 4 \tanh(y_1) \\ \dot{y}_4 &= -y_4 + 18 \tanh(y_2) + d_2 \tanh(y_1) + \tanh(y_4) \\ \dot{y}_5 &= b_2 \tanh(y_1) - c_2 g(y_5) \\ \dot{y}_6 &= b_3 \tanh(y_2) - c_3 g(y_6) \end{aligned} \quad \dots \quad (3)$$

$$\begin{aligned} \dot{z}_1 &= -z_1 + 0.5 \tanh(z_2) + 0.1 \tanh(z_4) \\ &\quad + 0.2 \tanh(z_1) \\ \dot{z}_2 &= -z_2 + 10 \tanh(z_3) + W_4 \tanh(z_1) + W_5 \tanh(z_2) \\ &\quad + W_6 \tanh(z_3) \\ \dot{z}_3 &= -z_3 + \tanh(z_4) - 4 \tanh(z_1) \\ \dot{z}_4 &= -z_4 + 18 \tanh(z_2) + d_3 \tanh(z_1) + \tanh(z_4) \\ \dot{z}_5 &= b_4 \tanh(z_1) - c_4 g(z_5) \\ \dot{z}_6 &= b_5 \tanh(z_2) - c_5 g(z_6) \\ \dot{z}_7 &= b_6 \tanh(z_3) - c_6 g(z_7) \end{aligned}$$

The control parameters of this chaotic system are  $(a_1, \dots, a_6)$ ,  $(b_1, \dots, b_6)$ ,  $(k_1, \dots, k_6)$ ,  $(c_1, \dots, c_6)$ , and  $(d_1, d_2, d_3)$ . Further,  $W_1 = a_1 + k_1 \sin(C_5)$ ,  $W_2 = a_2 + k_2 \sin(C_{10})$ ,  $W_3 = a_3 + k_3 \sin(C_{11})$ ,  $W_4 = a_4 + k_4 \sin(C_{16})$ ,  $W_5 = a_5 +$

$k_5 \sin(C_{17})$ ,  $W_6 = a_6 + k_6 \sin(C_{18})$ . The function  $g$  is defined by  $g(\phi) = \phi - f(\phi)$ . Note that  $f(\phi)$  is the attractor function that is given by  $f(\phi) = m[\sum_{i=0}^M \tanh(n(\phi + (1+2i)m)) + \sum_{i=0}^M \tanh(n(\phi - (1+2i)m))] \dots (5)$

The dynamics of the q-chaotic system is governed by

$$\frac{dq_i}{dt} = p_x \frac{dx_i}{dt} + p_y \frac{dy_i}{dt} + p_z \frac{dz_i}{dt} \quad i = 1, 2, \dots, 5 \dots (6a)$$

$$\frac{dq_6}{dt} = p_y \frac{dy_6}{dt} + p_z \frac{dz_6}{dt} + p_x \frac{dz_7}{dt} \dots (6b)$$

Figures 4 a-c show examples of the phase portraits of the chaotic attractors of the 5D, 6D, and 7D memristive GMDS chaotic systems, respectively. The values of the initial conditions and chaotic system parameters used in the simulation are taken from [30]. Note that the double-scroll attractor extends in one, two, and three dimensions, respectively. All the three systems are characterized by very complex dynamical behavior which is an essential requirement to design high-secure encryption scheme. The phase trajectories of the attractors of the proposed chaotic system on the planes  $q_1$ - $q_i$  ( $i=2, 3, \dots, 6$ ) are depicted in Figs. 5a-5e, respectively, which reflect enhanced dynamical complexity compared to the results of Fig. 4. The time response of the chaotic sequences  $q_1$ - $q_6$  are displayed in Fig. 6 which ensure chaotic behavior. In Fig. 5,  $p_x$ ,  $p_y$ , and  $p_z$  are set to 1 in the simulation.

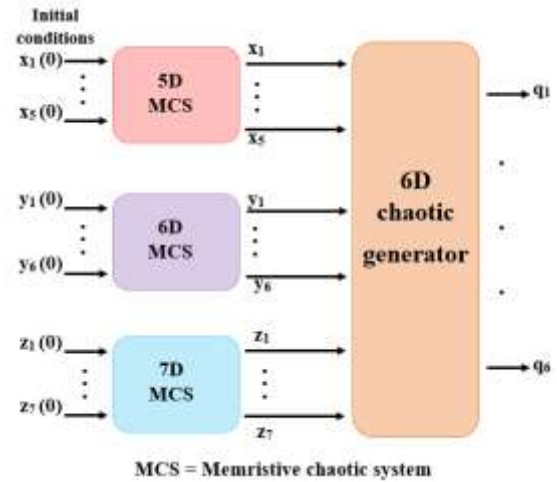


Figure (3): Block diagram of the proposed combined chaotic system.

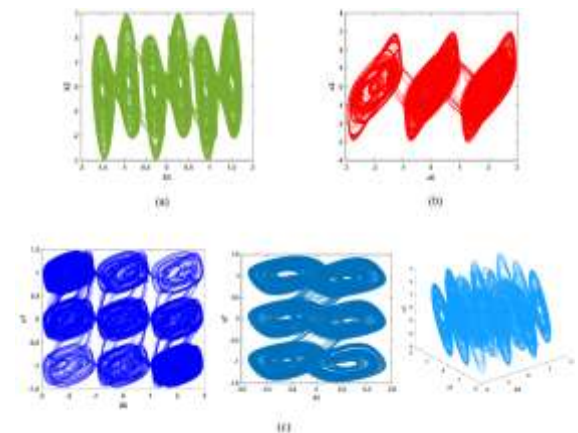
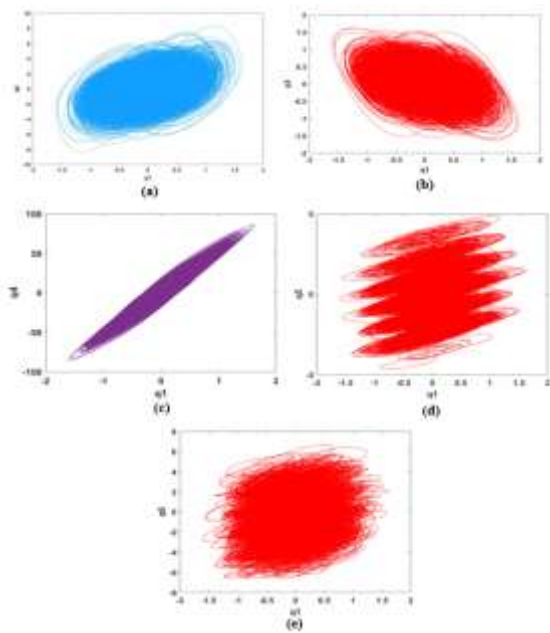


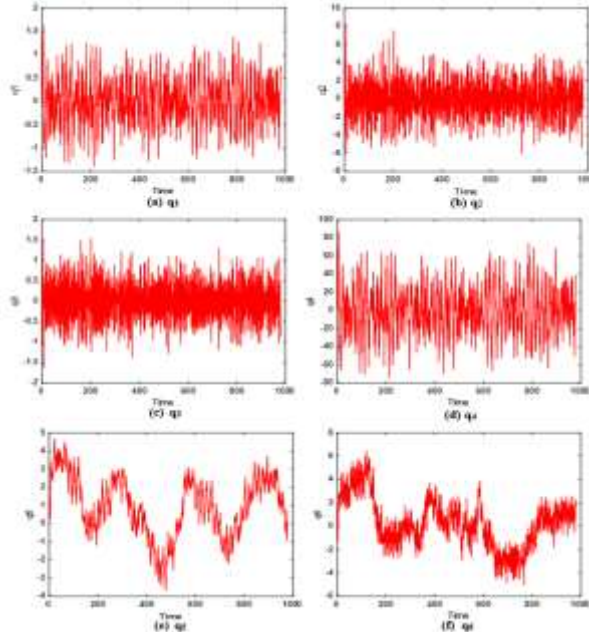
Figure (4): Phase portraits of the chaotic attractors of the 5D (a), 6D (b), and 7D (c) memristive GMDS chaotic systems.





**Figure (5):** Phase trajectories of the attractors of the proposed chaotic system on the planes  $q_1$ - $q_i$ . ( $i=2, 3, \dots, 6$ ).

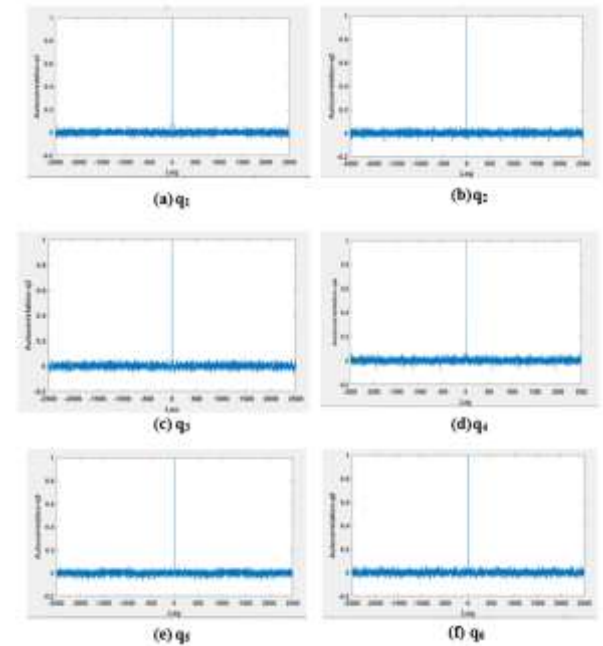
The autocorrelation is a measure for the similarity between a sequence and a shifted version of itself. If the chaotic sequences are used for generating encryption keys, then ideal sequences should have delta-autocorrelation functions. The plots of the autocorrelation functions of the six  $q$ -chaotic sequences are displayed in Fig. 7 which shows the delta-function behavior that indicates efficient results in terms of encryption security. This is because the plot shows very little correlation between each sequence and a shifted version of itself, even at very small lags, which is a desirable property for image encryption.



**Figure (6):** Time response of the chaotic sequences  $q_1$ - $q_6$ .

The randomness of the  $q$ -chaotic sequences is evaluated using the National Institute of Standards and Technology (NIST) SP800-22 test suite. Data stream of bits is obtained from the proposed memristive CS

which put into the NIST test set. The test results are displayed in Table 1 which show that all the  $p$ -values are greater than 0.01. This indicates that the system passes the NIST test and hence it can be well applied in the field of image encryption.



**Figure (7):** Plots of the autocorrelation functions of the six  $q$ -chaotic sequences.

It is worth to mention here that the combined 6D. CS is appeared as a virtual 18D CS but needs less and higher computation times compared with conventional 6D and 18D GMDS memristive systems, respectively. To discuss this point, let the symbol  $T_N$  denotes the computation time corresponding to  $N$ th-order GMDS memristive CS. The simulation results reveal that  $T_5/T_6 = 0.94$  and  $T_7/T_6 = 1.028$ . Assuming  $T_N/T_6$  obeys the relation " $a \exp(bN)$ ", then  $a = 0.4344$  and  $b = 0.15437$ . This leads to  $T_{18}/T_6 = 6.99$  (assuming that the 18D GMDS memristive CS is designed using the same procedure adopted to design 5D, 6D, and 7D counterparts [30]). The simulation results also reveal that the relative computation time of the proposed CS  $T_{\text{proposed}}/T_6 = 3.35$ . Thus  $T_{\text{proposed}} = 0.48 T_{18}$ . Note that  $T_{\text{proposed}} = T_5 + T_6 + T_7 + T_{\text{combining}}$ , where  $T_{\text{combining}}$  is the computation time associated with the combining process. Hence  $T_{\text{combining}}/T_6 = 0.124$ .

### 3. Proposed Memristive Image Encryption and Decryption Schemes.

The proposed encryption scheme deals with a color image (RGB image) and its operation is assisted by the sequences generated by the proposed combined memristive chaotic system. The input color image is encrypted after passing it through four cascaded stages that perform compressive sensing, scrambling, DNA encoding, and diffusion (see Fig.8). The DNA encoding is implemented separately on the three color components [ Red (R), Green (G), Blue (B)] and assisted by the chaotic sequences  $q_3$ ,  $q_4$ , and  $q_5$ , respectively. The other encryption stages operate directly on the RGB domain and assisted by the chaotic sequences  $q_1$ ,  $q_2$ , and  $q_6$ , respectively.



**Table (1):** NIST analysis of the proposed 6D chaotic sequences.

Test	q <sub>1</sub>	q <sub>2</sub>	q <sub>3</sub>	q <sub>4</sub>	q <sub>5</sub>	q <sub>6</sub>	Result
Frequency	0.73991	0.16260	0.83430	0.53415	0.91141	0.00936	Pass
Block Frequency	0.06688	0.83430	0.16260	0.73991	0.53414	0.27870	Pass
Cumulative Sums forward	0.91141	0.73531	0.96429	0.63992	0.73991	0.00936	Pass
Cumulative Sums reverse	0.99146	0.96429	0.63711	0.91141	0.53414	0.63711	Pass
Runs	0.12232	0.87429	0.43726	0.53414	0.91141	0.43727	Pass
Longest Run	0.73991	0.27870	0.53726	0.27871	0.21330	0.83430	Pass
Rank	0.39048	0.02519	0.63771	0.31451	0.33414	0.83430	Pass
FFT	0.45044	0.63711	0.63711	0.73109	0.39048	0.02565	Pass
Non-Overlapping Template	0.21330	0.43712	0.27370	0.12232	0.21223	0.16260	Pass
Overlapping Template	0.73414	0.16260	0.43637	0.53414	0.91146	0.00936	Pass
Approximate Entropy	0.53414	0.02597	0.63718	0.39048	0.12232	0.43727	Pass
Serial1	0.12233	0.00196	0.43897	0.91141	0.73991	0.01263	Pass
Serial2	0.39048	0.43727	0.63712	0.06688	0.21330	0.27870	Pass
Linear Complexity	0.73992	0.83431	0.43771	0.73991	0.73991	0.96429	Pass



**Figure (8):** Proposed memristive color image encryption scheme.

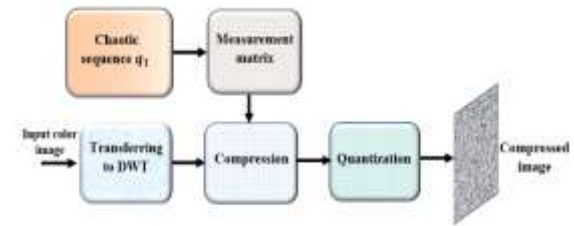
The compressive sensing is achieved through four steps as illustrated in Fig. 9

- Transfer the image to the discrete wavelet transform (DWT).
- Create the 2D measurement matrix using the chaotic sequence  $q_1$ .
- Compress the transferred image by using the measurement matrix.
- Quantize the result of step iii to produce the required compressed image.

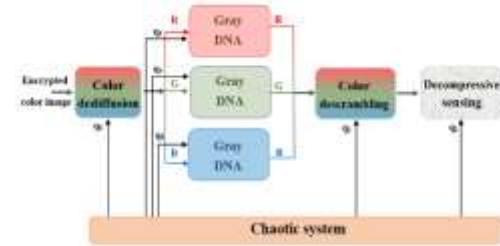
The scrambling is based on 2D mapping of the compressed image with a chaotic image having the same size and created by using the chaotic sequence  $q_2$ . The process rearranges each pixel in the compressed image based on the index corresponding to it in the 2D memristive chaotic map generated by  $q_2$ . It sends each channel pixel value of the compressed image to a different pixel in scrambling image. The main advantage of the scrambling method is to make the encrypted image more resistant to various attacks such as brute-force attacks and statistical analysis. After the end of scrambling, the scrambled image passes to the DNA operation.

The DNA encoding stage splits the color scrambling image into three color channels (R, G, and B). The three channels are encrypted individually using the chaotic sequences  $q_3$ ,  $q_4$ , and  $q_5$ , respectively. The DNA encryption of each channel is done in three steps. The first step is the DNA coding which encodes the image channel by using the principles of DNA (A, T, C, G) for each pixel value in the image. The second

step is the rule operation which shuffles the DNA principles with complementary rule. The third step is encrypting the resulting image with XOR operation based on one of the chaotic sequences ( $q_3$ ,  $q_4$ , and  $q_5$ ). The final operation is merging the three channels into one color image and passing it to the diffusion operation.



**Figure (9):** Compressive sensing algorithm.



**Figure (10):** Proposed memristive color image decryption scheme.

The diffusion stage is the last part of the encryption scheme. After getting the DNA encrypted image, it creates 2D memristive chaotic image with same size of image using  $q_6$  from the chaotic sequences. The operation defuses the entire image by taking each pixel with the index corresponding to it in the 2D memristive chaotic image generator in Bitwise XOR operation. This mechanism operates at the bit level, where each bit of the original data deals with a corresponding memristive chaotic bit generated in the 2D chaotic image. The main advantage of the diffusion method is enhancing the security by dispersing information widely and preventing the extraction of meaningful patterns from the encrypted data.

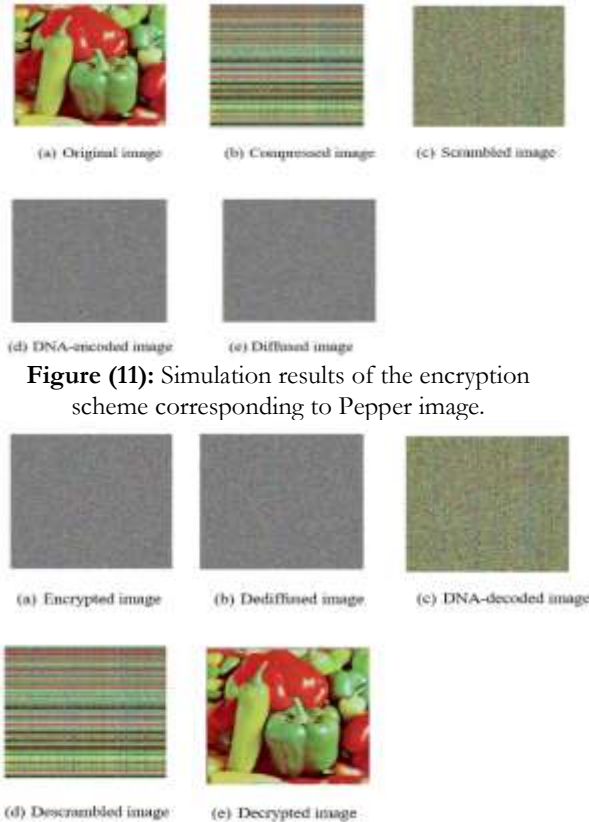
A block diagram of the proposed image decryption scheme is illustrated in Fig. 10 and uses four decryption stages corresponding to the four encryption stages used in the encryption scheme. The encryption image goes through dediffusion, DNA decoding, descrambling, and the decompressive sensing stages. The operation of these stages are assisted by the chaotic sequences  $q_6$ , ( $q_5$ ,  $q_4$ ,  $q_3$ ),  $q_2$ , and  $q_1$ , respectively. Note that perfect decrypting process requires the use of  $q$ -chaotic sequence generation whose configuration and initial values match perfectly that used for the chaotic sequence generation adapted in the encryption scheme.

#### 4. Results for the proposed Color Image Encryption/ Decryption Scheme

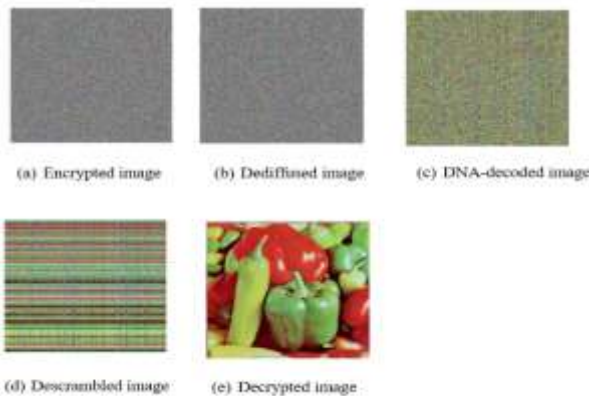
Simulation results corresponding to Pepper color image are presented in Figures 11 and 12 to characterize the operations of the proposed digital encryption and digital decryption, respectively. Simulation results related to other  $256 \times 256$  color images are given in Fig. 13. The encryption scheme contains four sequential stages; the corresponding images at the four outputs are shown in Fig. 11. The

first stage is the compressive sensing assisted by the chaotic sequence  $q_1$ . The next three stages are scrambling, DNA encoding, and diffusion which are assisted by the chaotic sequences  $q_2$ ,  $(q_3, q_4, q_5)$ , and  $q_6$ , respectively.

The decryption algorithm is processed as done in the encryption algorithm but in reverse order and the results are shown in Fig. 12.



**Figure (11):** Simulation results of the encryption scheme corresponding to Pepper image.



**Figure (12):** Simulation results of the encryption scheme corresponding to Pepper image.

Figure 13 shows the encryption/decryption simulation results for other color images (Lena, Baboon, Airplane, and Fruits).

## 4.2 Performance Evaluation Metrics

A security analysis is provided to evaluate the algorithm's performance. Unless otherwise stated, Pepper color image is used as the plain image to demonstrate the efficiency and security of the proposed scheme.

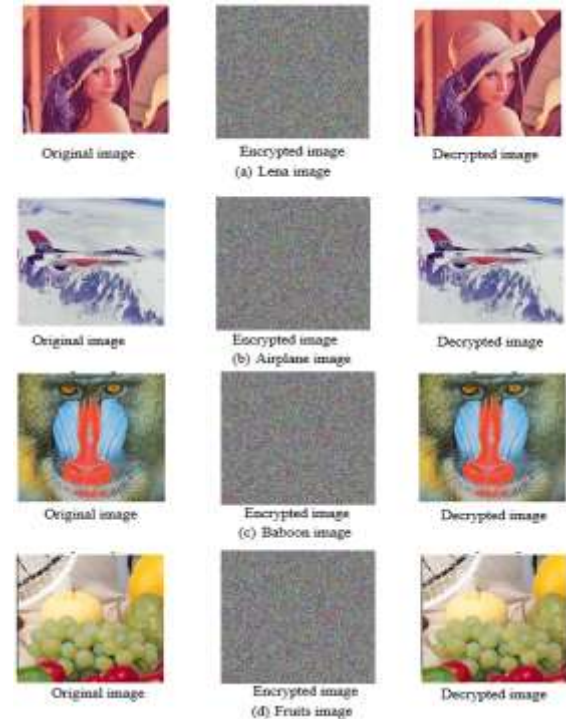
### 4.2.1 Histogram Analysis

The histogram analysis corresponding to the operation with Pepper input image is depicted in Fig. 14. It can be seen that the histogram of the encrypted image is quite uniform and significantly dissimilar to the histogram of the plaintext image. This prevents an attacker from learning anything about the plain image from its encrypted version. Note also that the histogram of the decrypted image almost matches that of the input image. This remark is also noticed for other input images as displayed in Fig. 15

### 4.2.2. Information Entropy

The performance of the proposed encryption scheme is tested through entropy measures. The entropy for the three-color channels of the final encrypted color images are presented in Table 2. These values in this table are very close to 8, which

corresponds to the entropy of ideal encryption;  $\log_2 256 = 8$ , where 256 corresponding to the number of discrete intensity levels in each assuming color 8-bit system.



**Figure (13):** Simulation results when the proposed encryption/decryption scheme operates with a color input (plain) image of Lena, Baboon, Airplane, and Fruits images.

### 4.2.3 Correlation Coefficient Analysis

A correlation coefficient measures the similarity or difference between adjacent image pixels in the three directions: vertically (V), horizontally (H), and diagonally (D). In order to have an image encryption system which is cryptographically secure, a strong correlation between the adjacent pixels in all directions should be eliminated. The value of the correlation coefficient ranges from  $-1$  to  $1$ , such that  $-1$  means that it has a negative correlation,  $+1$  means that it has a positive correlation, whereas  $0$  corresponds to no correlation. Therefore, the encrypted image must have a correlation coefficient close to  $0$  between the adjacent pixels in all the directions so it would resist statistical attacks. Figures 16 and 17 display graphically the correlation analysis results of original and encrypted Pepper image in three directions and for the three-color channels, respectively. Table 3 lists the three-direction correlation coefficients for the RGB components of different original and encrypted images. The results in this table reveals that horizontal, vertical, diagonal correlation coefficients of the encrypted images are almost zero.

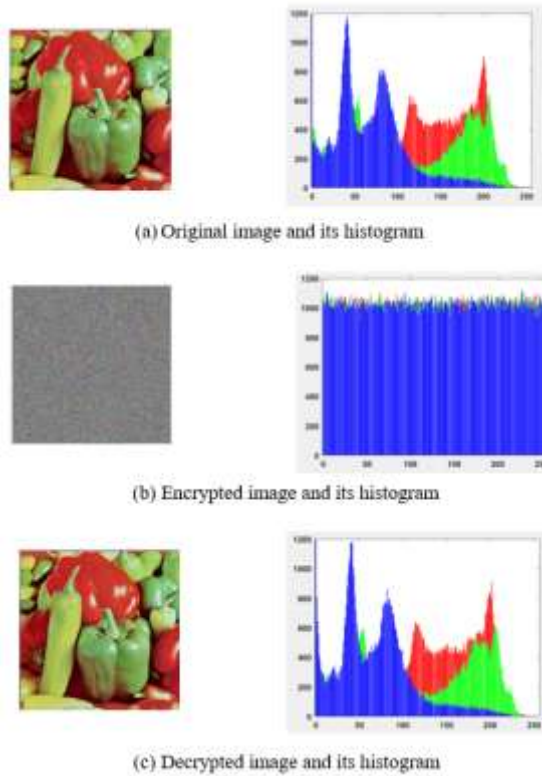
### 4.2.5 Key Space Analysis

The key space of the proposed encryption algorithm can be estimated as follows. Let the algorithm uses double-precision numbers with  $10^{-16}$  calculation precision. The key space  $S$  is estimated as  $S = (10^{16})^K$ , where  $K$  is the total number of keys involved in the encryption operation [34]. The algorithm uses 45 keys coming from the 18 initial values of the sequences plus 27 chaotic system

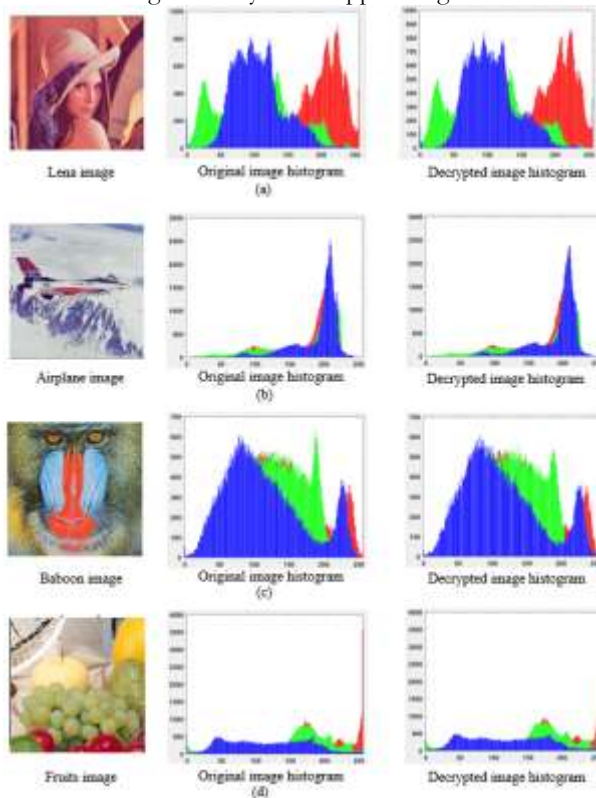




parameters  $[(a_1, \dots, a_6), (b_1, \dots, b_6), (c_1, \dots, c_6), (d_1, d_2, d_3), \text{ and } (k_1, \dots, k_6)]$ . Thus  $S = (10^{16})^{45} = 10^{720} \approx 2^{2392}$ . Encryption algorithm with key space  $> 2^{100}$  is proved to be secure [27]. Thus, the proposed algorithm has sufficient large key space which ensures its high resistance to all types of brute-force attacks.



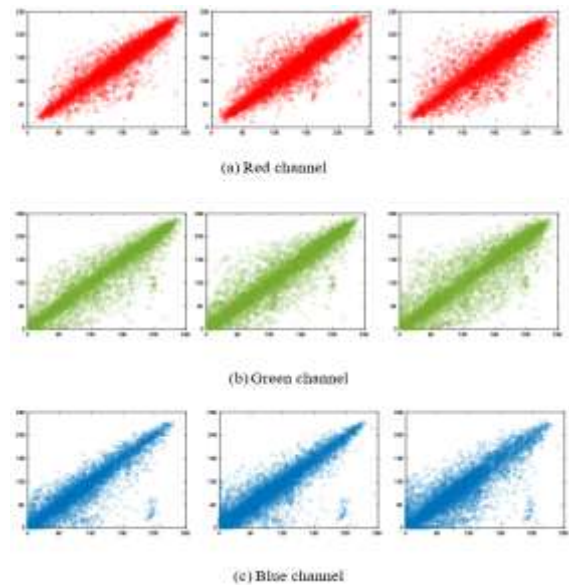
**Figure (14):** Simulation results of applying the histogram analysis to Pepper image.



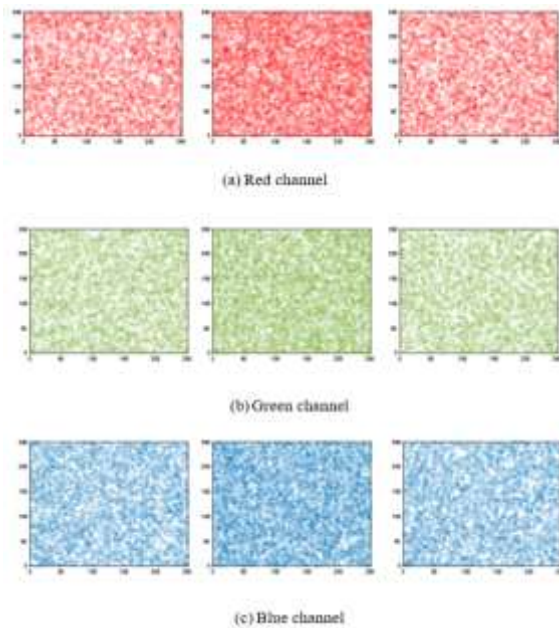
**Figure (15):** Simulation results of applying the histogram analysis to other images (Lena, Baboon, Airplane, and Fruits).

**Table (2):** Information entropy of different images.

Image	RGB channels	Entropy values	
		Original	Encrypted
Pepper	Red	7.3762	7.9994
		7.6395	7.9993
	Green	7.1346	7.9993
		7.9993	7.9993
	Blue	7.3508	7.9993
		7.6217	7.9994
Lena	Red	7.1294	7.9993
		7.9993	7.9993
	Green	6.8271	7.9992
		6.8696	7.9993
	Blue	6.4582	7.9993
		7.9993	7.9993
Airplane	Red	7.6295	7.9994
		7.3200	7.9993
	Green	7.6276	7.9993
		7.9993	7.9993
	Blue	7.1835	7.9992
		7.9992	7.4587
Baboon	Red	7.4587	7.9993
		7.9993	7.7574
	Green	7.7574	7.9992
		7.9992	7.9992
	Blue	7.9992	7.9992
		7.9992	7.9992
Fruits	Red	7.9992	7.9992
		7.9992	7.9992
	Green	7.9992	7.9992
		7.9992	7.9992
	Blue	7.9992	7.9992
		7.9992	7.9992



**Figure (16):** Correlation distribution test results for the original Pepper image.



**Figure (17):** Correlation distribution test results for the encrypted Pepper image.

**Table (3):** Three-direction correlation coefficients of RGB color components of the original and encrypted images.

Image	Image Type	Channel	Horizontal	Vertical	Diagonal
Lena	Original	Red	0.93504	0.94772	0.88727
		Green	0.92763	0.96216	0.89509
		Blue	0.87152	0.92669	0.81233
	Encrypted	Red	-0.00047	0.00309	-0.00118
		Green	0.00101	-0.00465	-0.00559
		Blue	-0.00428	0.00501	0.00141
Baboon	Original	Red	0.94384	0.91705	0.89278
		Green	0.91335	0.87271	0.83453
		Blue	0.94571	0.92795	0.90049
	Encrypted	Red	-0.00172	0.00147	-0.00114
		Green	0.00503	-0.00605	-0.00687
		Blue	-0.00707	0.00488	0.00727
Pepper	Original	Red	0.95992	0.96766	0.92911
		Green	0.97651	0.98344	0.95930
		Blue	0.95019	0.96594	0.917256
	Encrypted	Red	-0.00056	0.00314	0.00016
		Green	0.00256	-0.00085	-0.00993
		Blue	-0.00349	0.005126	0.00636
Airplane	Original	Red	0.94105	0.92919	0.88115
		Green	0.95182	0.94040	0.90156
		Blue	0.91577	0.88973	0.82729
	Encrypted	Red	0.00036	0.00448	-0.00319
		Green	0.00302	-0.00331	-0.00691
		Blue	-0.00149	0.00910	0.00442
Fruits	Original	Red	0.94552	0.96090	0.91343
		Green	0.96108	0.971467	0.93871
		Blue	0.96574	0.97395	0.94515
	Encrypted	Red	-0.00115	0.00409	0.00019
		Green	0.00424	-0.00197	-0.00729
		Blue	-0.00304	0.00399	0.00378

#### 4.2.4 Peak Signal-to-Noise Ratio

Table 4 lists the peak signal-to-noise ratio (PSNR) of the decrypted images. Note that the PSNR is almost image dependent. Among the five images considered in this work, the Baboon image has the lowest PSNR ( $\approx 32.3$  dB). The other four images have PSNR values between 39.2 and 41.7 dB.

**Table (4):** Peak signal-to-noise ratio results for five different images.

Image	Lena	Baboon	Pepper	Airplane	Fruits
PSNR (dB)	41.7	32.3	40.3	39.6	39.2

#### 4.2.6 Key Sensitivity Analysis

Many simulation tests are performed to address the sensitivity of the encryption process to initial











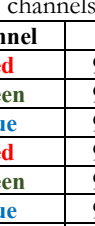
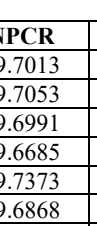
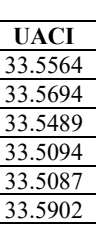
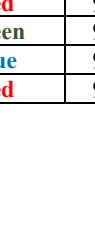
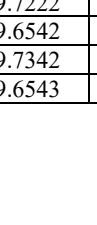
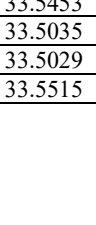



conditions of the chaotic sequences. The results indicate that the decryption process completely fails when the initial value of any sequence is subjected to a very small variation in the decryption system from its value in the encryption system. Table 5 shows examples of the simulation results where the decrypted image corresponding to Pepper input image is recorded when the decryption system initial condition of one of the sequences  $q_1$ - $q_6$  deviates by a tiny value of  $10^{-15}$ ,  $10^{-20}$  or  $10^{-25}$ , from its encryption system value.

#### 4.2.7 Differential Attack Analysis

For efficient encryption process the number of pixels change rate (NPCR) should be greater than 99% and the unified average change intensity (UACI) should also be greater than 33.35%. It is close to it. As a result, any slight difference in the plain image would result in a significant difference in the encrypted image. The NPCR and UACI of the proposed encryption scheme are calculated for different input images and the results are listed in Table 6. Note that the NPCR value is  $> 99\%$  and the UACI value  $> 33.35\%$ , which means that the system is efficient in terms of the differential attacks.

**Table (5):** Decrypted images corresponding to

Pepper input image in the presence of tiny mismatch between the encryption/decryption initial values of one of the chaotic sequences  $q_1$ - $q_6$ .

Correct Key			$+10^{-15}$	$+10^{-20}$	$+10^{-25}$
	$q_1$				
	$q_2$				
	$q_3$				
	$q_4$				
	$q_5$				
	$q_6$				

**Table (6):** NPCR and UACI of different color image channels.

Image	Channel	NPCR	UACI
Pepper	Red	99.7013	33.5564
	Green	99.7053	33.5694
	Blue	99.6991	33.5489
Lena	Red	99.6685	33.5094
	Green	99.7373	33.5087
	Blue	99.6868	33.5902
Baboon	Red	99.7222	33.5453
	Green	99.6542	33.5035
	Blue	99.7342	33.5029
Airplane	Red	99.6543	33.5515





Fruits	Green	99.6700	33.5858
	Blue	99.7078	33.5084
	Red	99.6708	33.5041
	Green	99.6844	33.5964
	Blue	99.6651	33.5066

## 5. Performance Comparison with Related Work

This section presents performance comparison between the proposed encryption system and some recently published chaos-based encryption systems. All the systems are assumed to deal with a single input image. Table 7 reflects performance comparison related to correlation coefficient of adjacent pixels, key space, information entropy, and PSNR of the decrypted image. Gray input images are considered in this table with Pepper gray image is adopted for our work. Investigating the results in this table highlights the following finding

- The vertical correlation coefficient of the proposed work is closer to zero. The horizontal and diagonal correlation coefficients are almost negligible and lie within the limits offered by other encryption

systems. These results indicate that the proposed system is effective in disrupting strong correlations in images.

- The proposed system has the largest key space, indicating its ability to withstand exhaustive attacks.
- The proposed system offers the higher ciphertext entropy and closer to 8. Thus, the information in the ciphertext is more chaotic, better concealed, and more disorganized.
- The highest PSNR is achieved with the proposed system which is higher than 40.35 dB. This indicates that this system achieves excellent reconstruction and visualization results.

The next step is to compare the resistance of the encryption systems to differential attacks. The results are presented in Table 8 where number of pixels change rate (NPCR) and unified average change intensity (UACI) are used as measures. Note that the proposed system has NPCR and UACI values closer to the ideal values than other encryption systems, which indicates the effective resistance to differential attacks.

**Table (7):** Comparison with other related work corresponding to a single-image encryption.

Ref.	Encryption Techniques	Correlation Coefficient of Adjacent Pixels			Key Space	Entropy	PSNR (dB)	Chaos Type and Degree
		Horizontal	Vertical	Diagonal				
[35]	Digital/Optical (CS, DRPE with FrFT, Confusion/Diffusion)	- 0.0019	0.0051	- 0.0078	$2^{400}$	7.9984	34.1	4D Memristive
[36]	Digital Scrambling and Diffusion	0.0039	0.0049	- 0.0027	$2^{456}$	7.9990	-	4D Memristive
[37]	Digital/Optical (Convolutional Neural Network (CNN) with Dynamic Adaptive Diffusion and Dual-Channel Bit-Level Fusion)	0.0086	0.0042	0.0216	$2^{624}$	7.9986	9.6	5D Hamiltonian Conservative
[38]	Digital (Bidirectional Bit-Level Cyclic Shift and Dynamic DNA-Level Diffusion)	- 0.0036	- 0.0012	0.0024	$2^{128}$	7.9994	-	3D Memristive
[39]	Digital (Compressive Sensing, Premutation, and Bidirectional Z-Shaped Diffusion)	- 0.0015	-0.0072	0.0007	$2^{399}$	7.9987	33.6	4D Based on The Continuous Hopfield Neural Network Model
[40]	Digital (CBC Mode and Reversible Steganography with Premutation and Diffusion)	- 0.0105	0.0137	0.0152	$2^{199}$	7.9992	-	3D (Logistic Map, Chen)
[41]	Digital (Premutation and Diffusion)	- 0.0014	0.0038	- 0.0083	$2^{144}$	7.9973	10.1	4D Grid-scroll Memristive
[42]	Digital (Confusion and Diffusion)	0.0023	- 0.0024	- 0.0008	$2^{512}$	7.9973	27.7	5D (Aizawa, Ricker, Sine-Circle, Chirikov)
This Work	Digital	0.0009	- 0.0027	0.0026	$2^{2392}$	7.9998	40.3	6D GMDS Memristive

**Table (8):** NPCR and UACI Comparison with other related work.

Ref.	NPCR %	UACI %
[35]	99.6300	33.5700
[37]	99.6033	33.4519
[38]	99.6173	33.4528

[39]	99.6101	33.8414
[40]	99.6000	33.4400
[41]	99.6063	33.4607
[42]	99.6100	33.4000
This work	99.7019	33.5582



## 6. Conclusions

A 6D memristive chaotic system has been proposed by combining three grid multi-double-scroll memristive CSs of dimensions 5, 6, and 7 and used to assist the operation of a proposed color image encryption/decryption scheme. The combined CS passes successfully the NIST randomness test and offers an encryption key space of  $2^{2392}$  which is the highest compared with that reported in the literature. The encryption scheme adopts chaos-assisted four sequential digital stages which improves the security level of image data significantly. This is done by exploiting the unique characteristics of the proposed CS to produce encryption patterns that are difficult to predict and, therefore, more resistant to various types of attacks.

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