ABSTRACT

In this paper, we propose a new semi-fragile watermarking scheme in the frequency domain for surveillance video authentication. Our system starts operating by generating a binary watermark based on a novel watermark construction process. This latter combines Speeded Up Robust Features (SURF) and Maximally Stable Extremal Regions (MSER) detectors to extract frames relevant features that can resist common attacks while being fragile to intentional manipulations. Furthermore, the watermark security is improved using torus automorphism mapping. For the embedding process, Regions of Interest (ROI) are detected and then used as watermark holders. These regions are decomposed into different frequency sub-bands using Singular Value Decomposition (SVD) as well as Discrete Wavelet Transform (DWT). Then, the watermark is embedded in selected bands following an additive method. A blind detection is conducted to extract the hidden signature from the watermarked video. Evaluation results show that the proposed scheme is suitable for authentication purpose since it efficiently discriminates malicious manipulations from non-malicious ones. Besides, it preserves a high level of perceptual quality.

Keywords
Video authentication, semi-fragile watermarking, discrete wavelet transform, singular value decomposition.

1. INTRODUCTION

Recently, the ever-evolving multimedia technology and communication makes surveillance system installation further flexible as well as more cost effective. Accordingly, video surveillance cameras are broadly used for security purposes by recording daily activities in several places such as airports, hospitals and train stations [Kha15, Abe14, Ben14]. However, the progress in digital technologies field leads also to the development of powerful video processing tools that facilitate the recorded videos content illegal modification by fraud person. As a result, content-authentication becomes an increasingly important requirement for video security protecting especially in surveillance context where video can be involved as a legal proof in forensic investigations.

Video watermarking has emerged as an appropriate technique to tackle this issue. Fundamentally, this authentication approach consists in embedding a secret information, which is referred as a watermark in the host video [Bpa14, Jos17, Mko12]. When needed, the embedded information is extracted from the watermarked video to check whether it has been tampered or not, thereby to verify its content integrity and authenticity. An efficient watermarking technique should provide a trade-off between several
Taking into account the above highlighted advantages and drawbacks of each watermarking category, we propose in this paper a ROI based semi-fragile watermarking scheme in the frequency domain using SVD and DWT for video authentication. The rest of this paper arrangement is as follows: section 2 provides a detailed description of the proposed watermarking scheme. Next, we present and discuss the obtained results in section 3. Finally, section 4 concludes this work.

2. PROPOSED SCHEME

The proposed video watermarking scheme involves three main components namely the watermark construction, the watermark embedding and the watermark extraction. These processes mechanisms are discussed in the following subsections. The originality of this work includes:

1) The proposed watermark construction strategy that allows to obtain a to-be-embedded watermark that can resist common attacks while being fragile to intentional manipulations. This is achieved thanks to the use of two efficient features detectors Speeded Up Robust Feature (SURF) and Maximally Stable Extremal Regions (MSER).

2) The suitable choice of the more appropriate regions ROI for signature insertion since they are the most targeted regions by malicious attacks in a video frame and each forgery on their content will be detectable.

3) The proposed frequency domain embedding process used to conceal the signature into the host video that involves two different domain transform techniques namely the SVD and the DWT. This watermark insertion method is designed upon the balance amongst the imperceptibility and the semi-fragility requirements consideration.

2.1 Watermark Construction Process

In the proposed scheme, the host video is initially divided into sequences of N frames. N is used as a first watermarking key and set to the number of frames per second (FPS) in each video. Then, as illustrated in Figure 1, an authentication watermark is generated from the first frame in the considered sequence using relevant features extracted from video frames. Next, regions of Interest (ROI) are detected. Indeed, moving objects are identified as the most important regions in the frame especially in video surveillance context [Ker17, Tbo12]. A technique that involves an adaptive improved version of Gaussian Mixture Model (GMM) [Cst19] for background subtraction and several morphological filters is used to accurately isolate the moving objects in every video frame [Abe13, Ben13].

Key points are further extracted from these ROI using SURF detector which is invariant to geometrical transformations and additive noise [Hba08]. To enhance the watermark robustness, we opt for
combining the SURF detector and the MSER one [Jma04]. MSER detector allows to determine connected pixels with intensity values that exhibit a negligible variation over several thresholds ranges. MSER regions are immune to illumination variation, rotation, scaling and translation [Ali18]. After performing MSER, only SURF key points hold in MSER sets are selected for the further steps and the remainder points are discarded. Considered points coordinates are converted to binary codes and then concatenated in one sequence. To increase the scheme security, this latter is scrambled using one dimensional Torus isomorphic mapping [Fzh19] which is a typical chaotic map operating following the formula:

\[ X' = (K \times X) \mod (L) + 1 \]  

Where mod denotes the modulus function. \( X' \) and \( X \) are the original bit position and the encrypted one. \( K \) is the second watermarking key, which should be a prime integer, and \( L \) is the binary sequence length. Finally, the encrypted binary sequence is used as a watermark.

### 2.2 Watermark Embedding Process

The embedding procedure framework is presented in Figure 2. As already mentioned, the host video is decomposed in sequences containing \( N \) frames and a watermark is constructed for every sequence and embedded within each frame of the given sequence following the described procedure below. To start with, the RGB frame is converted to the YUV space color and its three constituent planes namely \( Y \), \( U \) and \( V \) are separated. Only \( Y \) component is selected for the watermarking since it is more difficult to perceptually notice changes on luminance component as compared to chrominance ones. Following, the watermark is hidden in each ROI, recognized as already described in the previous subsection, which is an efficient choice for the authentication purpose as these regions hold on the most relevant information in the frames and every forgery on their content will be detectable; thus, each ROI is split into non-overlapping blocks.

To enhance the watermarking capacity, we adopt the \( 4 \times 4 \) size instead of the generally used \( 8 \times 8 \) size since one watermark bit is hidden in each block.

![Figure 1. The proposed watermark construction process schematic framework.](image1)

![Figure 2. The proposed watermark construction process schematic framework.](image2)
As the proposed watermarking scheme operates in the frequency domain, each block undergoes one level DWT. This to avoid the visual degradation and the complexity cost yielded by multilevel DWT using. Providing the best compromise between the robustness and the imperceptibility makes the mid frequency sub bands the most appropriate for the watermark insertion. Hence, SVD is applied to these sub-bands. Due to its stable nature, the singular values matrix S is the most convenient location for watermarking. Finally, the watermark embedding is achieved by exploiting an additive blind method [Ham19]. This method allows the watermark strength control and optimization in order to well establish the trade-off between the robustness and the imperceptibility using the following equations:

If \( W = 0 \)

\[
\begin{align*}
S'(0,0) &= S(0,0) + ka \\
S'(1,1) &= S(0,0)
\end{align*}
\]

Otherwise

\[
\begin{align*}
S'(0,0) &= S(1,1) + k \beta \\
S'(1,1) &= S(1,1)
\end{align*}
\]

With

\[
\begin{align*}
ka &= \frac{S(0,0) + S(1,1)}{\alpha} \\
k \beta &= \frac{S(0,0) + S(1,1)}{\beta}
\end{align*}
\]

With \( W \) is the to-be-embedded bit, S and S' are the original and the watermarked versions of S matrix. \( \alpha \) and \( \beta \) are two scaling factors. Their values are fixed based on several experiments which demonstrate that the couple (2, 4) gives the best compromise between the imperceptibility and the robustness [Ham19]. Hence \( \alpha = 2 \) and \( \beta = 4 \) are the used values in this work. Finally, the inverse of each used function is performed to obtain the watermarked frame.

2.3 Watermark Extraction Process

The general architecture of the blind detection process is depicted in Figure 3. It starts operating with the same steps of the embedding process. After decomposing the watermarked video in sequences using the same watermarking key \( K \), the frame is converted to YUV space and the Y plane is extracted. Once the ROI are detected and divided into 4x4 blocks, DWT and SVD are applied. The resulting singular values matrix coefficients are then scanned to extract the embedded information according to the following equation:

If \( S''(0,0)-S'(1,1) > \frac{k_a + k \beta}{2} \)

\( W'' = 0 \)

Otherwise

\( W'' = 1 \)

Where \( S'' \) and \( W'' \) denoted the extracted singular values matrix and the extracted watermark bit. Hence, from each frame \( F_j \) in a given sequence a watermark denoted \( W_{F_j} \) will be extracted.

Let denote \( \Omega = \{W_{F_1}, W_{F_2}, \ldots, W_{F_N}\} \) a sample space.

With \( W_{F_j} \) is the i-th bit in \( W_{F_j} \). A global watermark \( W_E \) is built by determining each of its bits \( W_E \) as follows:

If \( p ( W_{F_j}=1 ) > p ( W_{F_j}=0 ) \)

\( W_E = 1 \)

Otherwise

\( W_E = 0 \)

With \( p \) the probability function.

Besides, the generation process is performed under the first watermarked frame in the given sequence in order to obtain the reconstructed watermark \( W_R \). \( W_R \) and \( W_E \) are compared to verify the watermarked video authenticity.

Figure 3. The proposed watermark extraction process schematic framework.

3. EVALUATION RESULTS

The proposed scheme performance is investigated in terms of imperceptibility and robustness. Various surveillance as well as common videos that comprise at least one moving object are used. These videos include test.avi, camera2.avi, video1.avi, akiyo.avi, news.avi and coastguard.avi. The first three sequences belong to PETS benchmark datasets. The last three videos are often employed to evaluate previous existing approaches.
3.1 Imperceptibility Assessment

To evaluate the visual distortion yielded by the watermarking scheme, the Peak Signal to Noise Ratio (PSNR) is used (Nta18, Kad16). The PSNR values corresponding to every test video are calculated using equation (8) and presented in Figure 4.

\[
\text{PSNR} = 10 \log \left( \frac{255^2}{\text{MSE}} \right)
\]  

Where MSE designed the Mean Square Error.

As clear from Figure 4, the obtained PSNR values vary between 48.7431 dB and 73.425 dB which indicates the high similarity between the original videos and the watermarked ones. Moreover, the original frames and the corresponding watermarked ones, illustrated in Figure 5, confirm that the two frames versions are perceptually identical. In fact, the suitable choice of the ROI as well as the selection of the singular values matrix of the SVD transform allow guarantying this high invisibility level.

![Figure 4. PSNR values for several watermarked videos.](image)

![Figure 5. Samples of (A) Original frames and their (B) watermarked versions from different used videos. (a) test.avi, (b) camera2.avi, (c) video1.avi, (d) akiyo.avi, (e) news.avi, (f) coastguard.avi.](image)
3.2 Robustness Assessment

Bit error rate (BER), which is calculated via equation (9), is the metric used to evaluate the robustness of the technique and its ability to verify the content authentication (Asi15).

\[
\text{BER} = \frac{\sum_{i=1}^{m} \sum_{j=1}^{n} W_R(i,j) \oplus W_E(i,j)}{m \times n}
\]  

(9)

With \( W_R \) and \( W_E \) are the extracted watermark and the reconstructed one.

The proposed scheme is designed to be capable to discriminate between unintentional attacks and intentional ones. To achieve this purpose, a threshold \( T \) is required. Since small BER values reflect the high immunity to a considered attack, the threshold \( T \) value is empirically fixed to 0.1.

The authentication decision is done based on the following assumptions:

- If BER < \( T \): The video is authentic.
- Otherwise: The video is intentionally tampered.

As already mentioned, the scheme robustness is tested against two sets of attacks i.e. unintentional attacks and intentional ones. Table 1 exhibits the BER values obtained under unintentional attacks including (noise adding, filtering, rotation, MJPEG compression and brightness and contrast variation). From this table, it is evident that the proposed approach is immune to Gaussian noise as well as salt and pepper attacks since the obtained BER values are below the preset threshold \( T=0.1 \). The combination of SURF and MSER detectors as well as using the DWT, which are noises immune, guarantee this high resilience.

Furthermore, our watermarking scheme exhibits a good robustness against rotation attack. In fact, the obtained BER values vary between 0.0006 and 0.0537 for different rotation degrees. This robustness is achieved due to the utilization of SURF detector when designing the watermark and the involvement of SVD during the embedding process which are both rotation invariant. For median filter attack, the resulting BER values are ranged between 0.0004 and 0.0390 thereby inferior to \( T \). Thus, the proposed scheme can withstand this kind of attack.

According to the BER values tabulated in Table 1, the embedded information is successfully extracted after applying MJPEG compression attack. The watermark insertion in the DWT mid frequency sub bands, which allows to avoid information loss during compression process, explains this high robustness. The last non-malicious considered attack is the brightness and contrast adjustment. Again, the BER values obtained by varying the brightness as well as the contrast ratios prove the robustness of our watermarking scheme since they are inferior to threshold \( T \). This resilience is reached thanks to the use of MSER detector, which is immune to illuminance changes.

Similarly, the proposed scheme robustness is investigated under malicious attacks including (cropping, objects deletion and objects insertion attacks). For cropping attack, resulting BER values are displayed in Table 2. As can be seen from this table, The BER values, which are superior to the threshold \( T=0.1 \), demonstrate that the watermarked video is deliberately manipulated.

Concerning object manipulations attacks, we intentionally delete or add an object to the frames content of randomly chosen sequences as shown in Figure 6. BER values relative to object deletion and object insertion are respectively presented in Figure 7 and Figure 8. According to these figures, resulting BER values are significantly higher than the threshold 0.1. Therefore, the proposed scheme can effectively detect these two malicious attacks. This efficient ability is provided owing to the choice of the moving object as watermarking best location.

From all results, it can be concluded that our proposed scheme is suitable for authentication purpose where the discrimination between content preserving manipulations and content changing attacks is a prominent requirement.

| Window size | Video | Test | Camera2 | Video1 | Akiyo | News | Coastguard |
|-------------|-------|------|---------|--------|-------|------|------------|
| [20*20]     | 0.3484| 0.2656| 0.3840  | 0.1066 | 0.2502| 0.1203|
| [40*40]     | 0.3608| 0.3626| 0.3840  | 0.1133 | 0.1984| 0.1240|
| [60*60]     | 0.3884| 0.4019| 0.3840  | 0.1305 | 0.2233| 0.1223|
| [80*80]     | 0.3531| 0.4159| 0.3840  | 0.1590 | 0.1378| 0.1245|
| [100*100]   | 0.2712| 0.41104| 0.3840  | 0.1814 | 0.2700| 0.1325|

Table 2. The BER values under cropping attack with different window sizes
3.3 Comparative Study

This section provides a comparison between the proposed watermarking scheme performance and the techniques proposed in Refs [Far16] and [Bha18] under different attacks. The technique presented in [Far16] operates using DCT by inserting the watermark into DCT coefficients. In [Bha18], a LWT based scheme is proposed where the watermark bits are concealed in the LH3 coefficients. Table 3 depicts BER values obtained after carrying out various attacks on the two watermarked videos versions resulting from the application of our approach and the technique presented in [Far16] to news.avi. Table 3 analysis reveals that the proposed system outperforms the technique in [Far16] in terms of robustness against all attacks listed in this table. The reason behind the proposed scheme robustness is the utilization of two domain transform techniques DWT and SVD instead...
of one unique transformation which allows to better strengthen the resilience to common manipulations. Furthermore, the proposed watermark construction process which involves two noises immune features detectors namely SURF and MSER yields a signature characterized by a high survival level against several attacks. Performances comparison outcomes with [Bha18] are displayed in Table 4. Based on BER values reported in this table, it can be inferred that our technique exhibits better robustness compared to the work of [Bha18]. Concerning the imperceptibility performances, our watermarking scheme exceeds the method in [Bha18] as indicate the PSNR values given in Table 4. The main reason for this higher perceptual quality is the suitable choice of the watermark holders. In fact, the exploitation of SVD characteristics and DWT sub-bands ones to conceal watermark bits into the frame areas where human eye is less sensitive to the change preserves better output watermarked video quality.

| Attacks                | Ref [Far16] | Proposed scheme |
|------------------------|-------------|-----------------|
| Gaussian noise(0.01)   | 0.0581      | 0.0053          |
| Gaussian noise(0.02)   | 0.0598      | 0.0061          |
| MJPEG compression      | 0.0244      | 0.0009          |
| Brightness (+10%)      | 0.0466      | 0.0061          |
| Brightness (+20%)      | 0.0628      | 0.0062          |

Table 3. Robustness comparison with Ref [Far16]

| Attacks                | News         | Akiyo          |
|------------------------|--------------|---------------|
|                        | Ref [Bha18]  | Proposed scheme | Ref [Bha18]  | Proposed scheme |
|                        | PSNR=41.5(dB)| PSNR=50.42(dB)| PSNR=41.2(dB)| PSNR=56.66(dB) |
| Gaussian noise (0.01)  | 0.0791       | 0.0053        | 0.0742       | 0.0330          |
| Salt & pepper          | 0.0303       | 0.0106        | 0.0322       | 0.0315          |
| Median Filter (3x3)    | 0.0117       | 0.0058        | 0.0098       | 0.0268          |
| Median Filter (5x5)    | 0.0371       | 0.0088        | 0.0371       | 0.0192          |
| MJPEG compression      | 0.0009       | 0.0009        | 0.0009       | 0.0009          |

Table 4. Imperceptibility and robustness comparison with Ref [Bha18]

4. CONCLUSIONS AND FUTURE SCOPE
In this paper, a semi-fragile watermarking approach is proposed for video content authentication. It initially involves a content based authentication signature generation process using both of SURF and MSER detectors. After that, the watermark bits are hidden in the host video frames following a ROI-SVD-DWT based embedding method. The proposed technique ensures a high imperceptivity level. Moreover, the simulation results prove that the proposed semi-fragile scheme appropriately suits the content authentication goal. In fact, it successfully detects content changes attacks while tolerating incidental manipulations. In coming future works, we will extend the proposed approach to handle temporal attacks and forgery localization.

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