

Data Hiding For Captioned Images Using Reversible Image Transformation and Bit Encoding

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I. INTRODUCTION

Images have transformed the way people share and document their lives. Moreover, captions and *hashtags* have become integral parts of images today, adding context and conveying vital information. With the storage of all these images being outsourced to the cloud, there are rising concerns over the security practices and reliability of image cloud services. There have been several security attacks such as the Dropbox hack, The iCloud 2017 data breach and more resulting in massive breach of privacy with sensitive images being exposed.

The threat of sensitive images being leaked in case of a data breach in today's time is a pertinent concern. Encrypting images through conventional means such as passwords and 3rd party software would mean attracting the *curious cloud* where attention is drawn to a particular encrypted image. For example, if a cloud provider were to attempt to embed certain metadata for its storage purposes, the encrypted image would block such an attempt due owing to insufficient permission access, raising signals in the system.

This paper proposes a novel algorithm which helps overcome the aforementioned problems. Sensitive host images are transformed, or *encrypted* in a sense, into plaintext images which acts as decoys with the captioned message data embedded inside. In case of a data breach, these images would seem like any other plain images, highly reducing exposure and unwanted attention. With plaintext images now being used, the cloud is free to write metadata information for storage purposes as well.

The algorithm uses a Reversible Image Transformation technique which takes a host image and a target image, converts the host image into a *encrypted* image, essentially a visually similar clone of the target image with metadata embedded within it. Following this, the captioned message string is embedded within the encrypted image using a Bit Encoding technique. A cryptographic key is generated and maintained. When this key is run on the encrypted image, it yields the hidden message. Following a series of steps, the original image is then retrieved from the by simply reversing the steps used to yield the encrypted image in the first place.

II. ALGORITHM

The Reversible Image Transformation(RIT) technique described here attempts to transform 2 spatial images, the target and the host images, which may be freely chosen, into a transformed image. For the purpose of demonstration, a single channel (grayscale) image is used but this can easily be extended to RGB images by applying the same process on every channel.

Consider a Host Image H and a Target Image T . Both the images are broken down into n non-overlapping blocks of size $k * k$ where k would typically be a small, single digit number since breaking into more blocks yields visually accurate results.

After breaking the images into blocks, every block from the host image is paired with a block from the target image, yielding a pairing of blocks $B(H_1, T_1), B(H_2, T_2), \dots, B(H_n, T_n)$. Now, each of these pairings $B(H_i, T_i)$ are converted into a transformed block T'_i , which will be visually similar to the target block T_i . After repeating this process for all blocks, all of the T'_i are sequentially put together to yield the transformed image T' .

- Process of Block Pairing

Pairing of the blocks $B(H_i, T_i)$ is crucial to make sure that only those blocks are paired which ultimately yield a transformed block T'_i most similar to the target block. To ensure this, the host block and target block having the closest Standard Deviation(SD) are paired.

If B is a block of pixels $p_1, p_2, p_3 \dots p_n$ then the Standard Deviation(SD) will be calculated as:

Mean: $u = (1/n) * \sum p_i$

SD: $sd = \sqrt{((1/n) * \sum (p_i - u)^2)}$

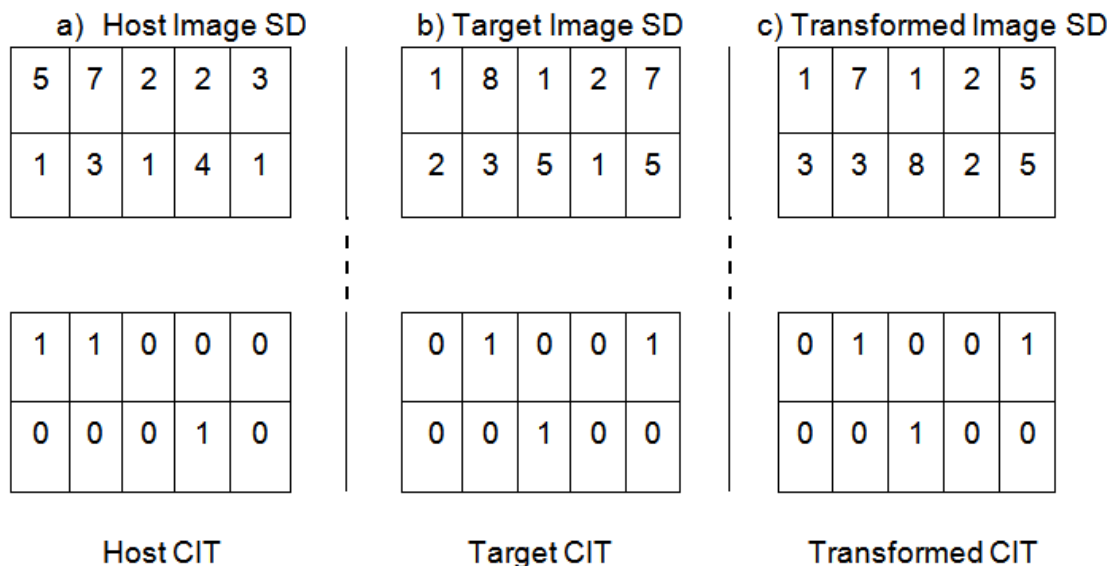
Note that to retrieve the host image from the transformed image, the position of the original blocks needs to be recorded and embedded in the transformed image as well. Simple calculation yields the fact that if an image would be divided into N blocks, $N * \log(N)$ bits would be needed to record block indices. N is chosen such that a large segment of information is not recorded in small regions across the transformed image, distorting the latter.

The blocks are classified according to their Standard Deviation (SD) before pairing them up for the purpose of compression. For most images, it is found that the SD of most blocks is concentrated in a small range near zero and quickly drops thereafter. So for the purpose of demonstration, blocks shall be of size 4x4 and be classified into *category 1* or *category 2* based on the quantile of their SD.

All images having their SD in a range of $SD_0 - SD_\beta$ fall under category 1 and the ones having SDs in a range of $SD_\beta - SD_{100}$ fall under category 2. Following this, the blocks are scanned from left to right and assigned their respective categories on the basis of their SD.

Finally, the blocks of both the host and target images are scanned in parallel, pairing category 0 host blocks with category 0 target blocks and category 1 host blocks with category 1 target blocks in the order they are encountered.

Consider an example below where host and target blocks are assigned their SDs. $N_{\beta=70}$ is set with the last 3 images having large SDs assigned *category 1* (C_1) and the others assigned *category 0* (C_0). Assigning categories for all blocks yields a Category Index Table(CIT) for the host and target images.



Pairings of blocks

| | | | | | | | | | | |
|-------------------------------|---|---|---|---|---|---|---|---|---|----|
| Block index of the host image | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| Block index of target image | 2 | 5 | 1 | 3 | 4 | 6 | 7 | 9 | 8 | 10 |

The pairing in the example happens as follows - The 1st block of the host gets paired up with the 2nd block of the target (both are the 1st blocks in C_1 , when scanned from left to right). Similarly, block 2 is paired with block 5, as they are the 2nd block to be encountered in C_1 . Block 3 and 4 of the host are paired with block 1 and 3 of the target following the same logic and this goes for all the blocks.

The advantage of the CIT is that the entire original image can be constructed from the transformed image by just knowing the original CIT itself, which is embedded in the transformed image itself. Additionally, the CIT can be efficiently compressed using mostly conventional techniques owing to the bias between the number of C_0 and C_1 blocks.

- Process of Block Transformation

Let a host image block be represented as $B = \{p_1, p_2, p_3 \dots p_n\}$ and the target block as $T = \{p'_1, p'_2, p'_3 \dots p'_n\}$, the transformed block $T' = \{p''_1, p''_2, p''_3 \dots p''_n\}$ can be constructed by applying *mean shifting* on every pixel of the host image. This is done to ensure that the transformed image and the target image blocks have the same mean. First, The rounded difference between the means of the host and target blocks ($\square u$) is calculated added to the original host pixel.

$$p''_i = p_i + \square u \text{ where } \square u = u_T - u_B; u_T = \text{mean}(T); u_B = \text{mean}(B)$$

p''_i should be a value between 0 and 255 as would be for any pixel. To handle the cases of underflow and overflow for pixel values, there are certain adjustments required. The maximum overflow pixel, OV_{max} , for $\square u \geq 0$ and the minimum overflow pixel, OV_{min} , for $\square u < 0$ are found for each block. Now, in case of over/under flow in blocks, it can fix this by adjusting the value of $\square u$ as follows:

$$\begin{aligned} \square u &= \square u + 255 - OV_{max} \text{ if } \square u \geq 0 \\ \square u &= \square u - OV_{min} \text{ if } \square u < 0 \end{aligned}$$

This value of $\square u$ is further compressed to preserve precious bits in the transformed image which could be better utilised to encode the secret message later. a quantisation variable, λ is introduced and $\square u$ is modified as follows:

$$\begin{aligned} \square u &= \lambda * \text{round}(\square u / \lambda) \text{ if } \square u \geq 0 \\ \square u &= \lambda * \text{floor}(\square u / \lambda) + \lambda / 2 \text{ if } \square u < 0 \end{aligned}$$

In which λ is an even parameter. Now, the variable to calculate and record simply becomes

$$\square u' = 2|\square u| / \lambda$$

where $\square u'$ is independent of the sign of $\square u$ and, reserving less space for bits, not recording the sign of $\square u$. The sign isn't required because when $\square u'$ is an even number, $\square u \geq 0$ and when it is odd, it follows that $\square u < 0$. There is also a decision to choose the value of λ for varying value of $\square u'$. The value $\lambda = 2$ has been set for demonstrating the idea and examples in this paper.

- Process of Block Rotation

To keep the target image as similar as possible, the transformed blocks are rotated in a direction θ , which is one of $0^\circ, 90^\circ, 180^\circ$ and 270° . This is done to compare the Root Mean Square Error (RMSE) of the transformed block (now rotated in either of these 4 directions) and the target block, picking the rotated transformed block giving *minimum* difference in RMSE.

- Generating the Encrypted Image

After completing the steps of Pairing, Transformation and Rotation, all the blocks T'_i are combined to yield the final transformed image T' . All the parameters, that are $\square u$, rotation directions and CIT are compressed, encrypted and then embedded into the transformed image T' to output the encrypted image $E(I)$, a visual clone of the target image.

- Embedding the Message into the Encrypted Image using a Bit Encoding Technique

The Message M , is now ready to be embedded inside of $E(I)$ to yield the final *embedded image* $E'(I)$. Given that an image is represented as a matrix, certain pixels in the image shall be modified to embed M . Three parameters are analysed, given a bit from M and pixel to be modified from the image matrix:

1. Value of a bit in M (1 / 0)
2. Column number of the image matrix the pixel belongs to (odd / even)
3. The value of the image pixel (odd / even ; lies between 0 and 256)

Based on these parameters, it is decided to either add a 0 or 1 to the image pixel chosen, hence modifying it. Here is the *Bit Encoding Table(ET)* describing the encoding process for every permutation of these parameters.

| S.No | Message Bit (1/0) | Column (O=odd / E=even) | Pixel Value (O=odd / E=even) | Value added (1 / 0) |
|------|-------------------|-------------------------|------------------------------|---------------------|
| 1. | 1 | O | O | 0 |
| 2. | 1 | E | E | 0 |
| 3. | 0 | O | E | 0 |
| 4. | 0 | E | O | 0 |
| 5. | 1 | O | E | 1 |
| 6. | 1 | E | O | 1 |
| 7. | 0 | O | O | 1 |
| 8. | 0 | E | E | 1 |

Now, while embedding Message *M* inside the encrypted image, a *message decoding key(DK)* is generated which when applied to the encrypted image yields *M* back.

The key is easily constructed with the aid of the bit-encoding table. Consider a *DK* of size same as the original image (say $x * y$). Record *1* in the pixel entry where a pixel in the transformed image had been modified while embedding *M*, and a *0* otherwise. This yields a *DK* consisting of 0s and 1s. The pixel value, column number and whether the pixel had been modified or not is now known, corresponding to the first 3 columns in the table. This allows to accurately get the original bit by simply reading the entry in the 1st column, on locating the row corresponding to the given parameters.

For eg, given *Column no = 124 (even)*, *Pixel Value = 245 (odd)*, *Value added = 1*, it can be see that this combination corresponds to the *6th* row in the table and the value of the original bit is *1*.

Let us consider a concrete example. Take the word *hi* as the Message *M* which is to be embedded, represented as *0100100001101001* in binary. Now, a host and target (and following this, transformed) images of size $1 * 16$ are picked. The following tabular example demonstrates embedding of *M* in *E(I)*:

| | | | | | | | | | | | | | | | | | |
|----|--------------------|----|----|-----|-----|----|----|-----|-----|----|----|----|-----|----|-----|-----|-----|
| 1. | Initial Image | 36 | 11 | 164 | 240 | 89 | 60 | 225 | 189 | 99 | 52 | 83 | 134 | 61 | 156 | 125 | 205 |
| 2. | Pixel (O/E) | E | O | E | E | O | E | O | O | O | E | O | E | O | E | O | O |
| 3. | Column value | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 |
| 4. | Column (O/E) | E | O | E | O | E | O | E | O | E | O | E | O | E | O | E | O |
| 5. | Binary message | 0 | 1 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1 | 1 | 0 | 1 | 0 | 0 | 1 |
| 6. | Decoding key / Add | 1 | 0 | 1 | 0 | 1 | 0 | 0 | 1 | 0 | 1 | 1 | 0 | 1 | 0 | 0 | 0 |
| 7. | Modified Image | 37 | 11 | 165 | 240 | 90 | 60 | 225 | 190 | 99 | 53 | 84 | 134 | 62 | 156 | 125 | 205 |

Row 1 represents the values of the pixels of the Initial Image, which in our case would be $E(I)$. Row 7 represents the modified transformed image with M encoded. Row 6 tells us whether a bit was added and essentially acts as the decoding key DK .

It may be possible that a particular pixel value experienced overflow when 1 was added to it while modifying it. To counter this, one more *overflow key (OFK)* is maintained which stores the locations of the pixels that were modified but experienced overflow. The position of the overflow pixel is marked 1 in OFK or 0 otherwise.

To ensure security, DK and OFK are both encrypted and possessed independently by the sender and the receiver. Hence, even if an attacker knew that the image was a decoy, there is practically no way the attacker could reverse engineer the original image and M , owing to astronomical number of possibilities to check if a brute force attack had to be run on the image.

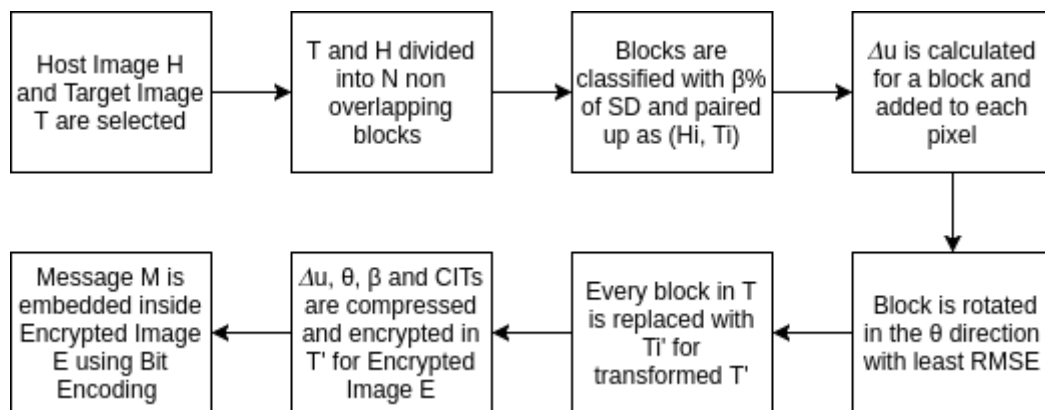
There are a few optimisations that can be made for the keys. JBIG2 compression can be applied on DK and OFK to reduce the space taken up by them.

• Reconstructing the Host image from the Encrypted image

The transformation procedures taking place in step 1 of the algorithm are all reversible. They need to be applied in the exact reverse order to obtain host image blocks and pair them up to yield the final host image.

Procedure of Transformation

Block Diagram for Transformation



Input: Host Image I , Secret Message M , Standard Encryption Key K , Bit-Encoding Table ET

Output: Embedded Image $E'(I)$, Message Decoding Key DK

- a. A Target Image T is selected from an Image Database having the same size as Host Image H
- b. H and T are divided into non-overlapping blocks of size 4×4 . Every image can be assumed to have N blocks with the the mean and SD calculate for each.
- c. The blocks are classified with $\beta\%$ quantile of SDs and CIT is generated for H and T . Blocks of H and T are paired up correspondingly
- d. For each block (H_i, T_i) , the mean difference Δu is calculated. Δu is added to each pixel of H_i and then rotated into the optimal direction θ_i ($\theta_i \in \{0^\circ, 90^\circ, 180^\circ, 270^\circ\}$) yielding a transformed block T'_i
- e. In the target image T , each block T_i is replaced with the corresponding transformed block T'_i for $1 \leq i \leq N$ and the transformed image T' is generated.
- f. All the Δu s and θ_i s for the block pairs are collected and compressed together with the CIT of H . The compressed sequence and the parameter β are encrypted by a standard encryption scheme with the key K . This yields Encrypted Image $E(I)$.
- g. The secret message M is embedded inside the $E(I)$ using the Bit-Encoding Technique described with the aid of Bit Encoding Table ET following which final Embedded Image $E'(I)$ and Message Decoding Key DK are generated.

Procedure of Anti-Transformation

Input: Embedded Image $E'(I)$, Decryption key K' for K , Message Decoding Key DK

Output: Host Image I , Secret Message M

- a. The secret message M is retrieved from $E(I)$ using DK which denotes the location of modified bits, thus reverting the bits to their original state and retrieving $E(I)$.
- b. The CIT of H , parameter β , α and θ are decrypted from $E(I)$ via K' and decompressed, yielding the transformed image T' .
- c. T' is divided into N non-overlapping blocks of size of 4×4 . The SDs of blocks are calculated and the the CIT of T' is generated according to the β quantile of SDs.
- d. The blocks of T' are rearranged as per the CITs of T' and H .
- e. For each block T'_i of T' for $1 \leq i \leq N$, T'_i is rotated in the anti-direction of θ , then α is subtracted from each pixel of T_i and the original host image H is retrieved.

III. RESULTS

The similarity between the Target Image T and the final Embedded Image $E'(I)$ is demonstrated as follows. From a dataset of images, random pairs of images are selected where one acts as the Host Image H and the other as the Target Image T . These pairs are now run through the algorithm described, yielding their respective $E'(I)$. Now with T and $E'(I)$ ready, they are subjected to various standard image comparison techniques, namely Mean Square Error (MSE), Peak Signal to Noise Ratio (PSNR), Structural Similarity (SSIM) Index and Mean Absolute Error (MAE).

MSE

Given an Image I and its noisy approximation K , MSE is defined as

$$MSE = \frac{1}{m \cdot n} \sum_{i=0}^{m-1} \sum_{j=0}^{n-1} [I(i, j) - K(i, j)]^2$$

PSNR

Given the MSE and Max Intensity in I as MAX_I

$$PSNR = 20 \cdot \log_{10}(MAX_I) - 10 \cdot \log_{10}(MSE)$$

SSIM

The SSIM index is calculated on various windows of an image. The measure between two windows x and y of common size is

$$SSIM(x, y) = \frac{(2\mu_x \mu_y + c_1)(2\sigma_{xy} + c_2)}{(\mu_x^2 + \mu_y^2 + c_1)(\sigma_x^2 + \sigma_y^2 + c_2)}$$

- μ_x the average of x ;
- μ_y the average of y ;
- σ_x^2 the variance of x ;
- σ_y^2 the variance of y ;
- σ_{xy} the covariance of x and y ;
- $c_1 = (k_1 L)^2$, $c_2 = (k_2 L)^2$ two variables to stabilize the division with weak denominator;
- L the dynamic range of the pixel-values (typically this is $2^{\#bits \text{ per pixel}} - 1$);
- $k_1 = 0.01$ and $k_2 = 0.03$ by default.

MAE

Given pixels of image x and y as x_i and y_i

$$MAE = \frac{\sum_{i=1}^n |y_i - x_i|}{n}$$

- **Image Dataset**

A heterogeneous dataset of grayscale images having dimensions 512×512 is constructed by randomly picking images from various, freely available standard datasets [1](#), [2](#), [3](#), [4](#), [5](#). The dataset constructed for the purpose of demonstration is available [here](#).

Entire code for algorithm, implementation and generation results: <https://github.com/bholagabbar/image-research-impl>

| | HOST IMG | TARGET IMG |
|----|--------------------|-------------------|
| 1 | Barbara | Butterflyfish |
| 2 | Gold Hill | Man |
| 3 | Truck | Zelda |
| 4 | Scenery | Mandrill |
| 5 | Lighthouse | House |
| 6 | Mosque | Heron |
| 7 | Golden Gate Bridge | Lena |
| 8 | Manhattan | Lake |
| 9 | Owl | Shack |
| 10 | Barn | Lakehouse |
| 11 | Acropolis | Airport Aerial |
| 12 | Plains | Dutchman Park |
| 13 | Elaine | Toys |
| 14 | Atmosphere | Bee |
| 15 | Sky | Boats |
| 16 | Water Transport | Sailboat |
| 17 | Office | SAR |
| 18 | Schooner | Cynthia |
| 19 | Salzburg | Anhinga |
| 20 | Crowd | Karlheinz |

Consider P as the maximum size for message M . Following are the results gotten by comparing these images on the aforementioned metrics using various payload values. Calculation Sheet available [here](#). PSNR measured in dB .

| 0.1P | | | | | 0.2P | | | | |
|------|----------|--------|---------|--------|------|----------|--------|---------|--------|
| | MSE | SSIM | PSNR | MAE | | MSE | SSIM | PSNR | MAE |
| 1 | 490.4311 | 0.5793 | 20.6622 | 0.0525 | 1 | 490.6262 | 0.5783 | 20.6605 | 0.0526 |
| 2 | 203.5047 | 0.7207 | 25.0451 | 0.0351 | 2 | 203.5873 | 0.7206 | 25.0433 | 0.0351 |
| 3 | 66.0135 | 0.7768 | 27.2405 | 0.0218 | 3 | 66.0966 | 0.7766 | 27.235 | 0.0218 |
| 4 | 490.6448 | 0.6096 | 20.3269 | 0.0596 | 4 | 490.7643 | 0.6096 | 20.3258 | 0.0596 |
| 5 | 194.3744 | 0.7955 | 24.535 | 0.031 | 5 | 194.4772 | 0.7952 | 24.5327 | 0.0311 |
| 6 | 105.6849 | 0.7623 | 25.9098 | 0.0248 | 6 | 105.7707 | 0.7622 | 25.9063 | 0.0248 |
| 7 | 91.8183 | 0.8343 | 28.154 | 0.0214 | 7 | 91.8994 | 0.8342 | 28.1502 | 0.0214 |
| 8 | 338.7721 | 0.6488 | 21.4701 | 0.0467 | 8 | 338.8432 | 0.6487 | 21.4691 | 0.0467 |
| 9 | 310.4014 | 0.6509 | 22.5757 | 0.0469 | 9 | 310.5048 | 0.6509 | 22.5743 | 0.047 |
| 10 | 190.7171 | 0.6254 | 25.05 | 0.0363 | 10 | 190.8194 | 0.6252 | 25.0477 | 0.0363 |
| 11 | 233.8674 | 0.6803 | 23.8418 | 0.0386 | 11 | 233.9283 | 0.6803 | 23.8407 | 0.0386 |
| 12 | 704.2222 | 0.5151 | 19.6537 | 0.0698 | 12 | 704.2514 | 0.515 | 19.6535 | 0.0698 |
| 13 | 98.8995 | 0.7423 | 27.7244 | 0.0253 | 13 | 98.9438 | 0.7421 | 27.7224 | 0.0254 |
| 14 | 74.2324 | 0.8077 | 28.8256 | 0.019 | 14 | 74.3437 | 0.8074 | 28.8191 | 0.0191 |
| 15 | 168.4978 | 0.7504 | 25.302 | 0.0303 | 15 | 168.5986 | 0.7501 | 25.2994 | 0.0303 |
| 16 | 187.0196 | 0.7586 | 24.7761 | 0.0331 | 16 | 187.1161 | 0.7585 | 24.7739 | 0.0331 |
| 17 | 915.4351 | 0.3894 | 18.5145 | 0.0887 | 17 | 915.6691 | 0.3894 | 18.5134 | 0.0887 |
| 18 | 128.1274 | 0.7947 | 25.4503 | 0.0266 | 18 | 128.2081 | 0.7946 | 25.4476 | 0.0267 |
| 19 | 366.8176 | 0.7732 | 22.4863 | 0.037 | 19 | 366.9056 | 0.7729 | 22.4853 | 0.0371 |
| 20 | 251.1946 | 0.8265 | 24.0623 | 0.0321 | 20 | 251.2913 | 0.8262 | 24.0606 | 0.0321 |

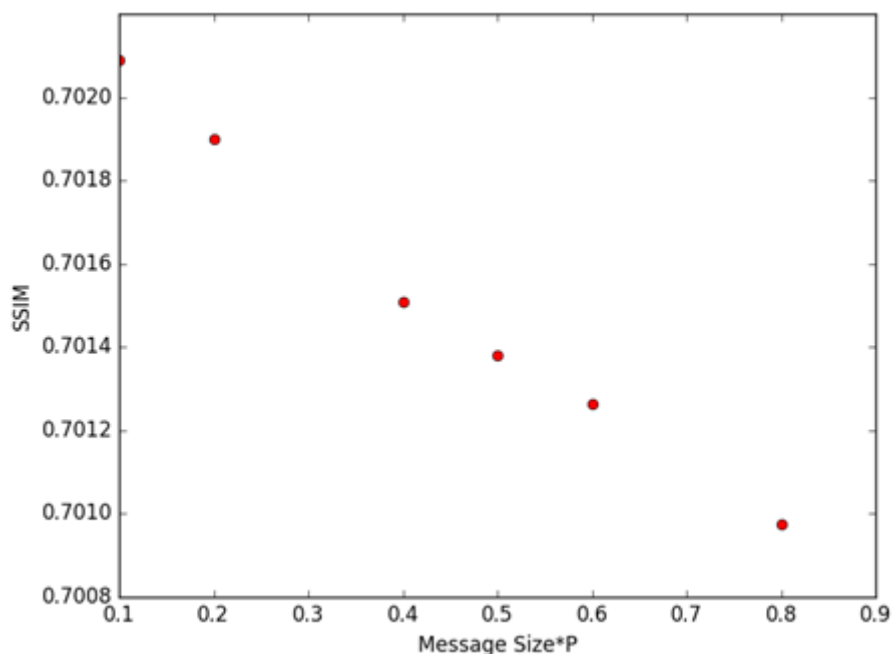
| 0.4P | | | | | 0.5P | | | | |
|------|----------|--------|---------|--------|------|----------|--------|---------|--------|
| | MSE | SSIM | PSNR | MAE | | MSE | SSIM | PSNR | MAE |
| 1 | 490.9925 | 0.5767 | 20.6572 | 0.0527 | 1 | 491.209 | 0.576 | 20.6553 | 0.0527 |
| 2 | 203.8528 | 0.7197 | 25.0376 | 0.0351 | 2 | 203.9625 | 0.7196 | 25.0353 | 0.0352 |
| 3 | 66.2284 | 0.7764 | 27.2264 | 0.0219 | 3 | 66.3234 | 0.7763 | 27.2202 | 0.0219 |
| 4 | 490.9026 | 0.6095 | 20.3246 | 0.0596 | 4 | 491.0252 | 0.6094 | 20.3235 | 0.0596 |
| 5 | 194.6796 | 0.7951 | 24.5282 | 0.0312 | 5 | 194.7508 | 0.795 | 24.5266 | 0.0312 |
| 6 | 105.9003 | 0.762 | 25.9009 | 0.0249 | 6 | 105.9994 | 0.7619 | 25.8969 | 0.0249 |
| 7 | 92.0976 | 0.8337 | 28.1408 | 0.0215 | 7 | 92.1847 | 0.8336 | 28.1367 | 0.0215 |
| 8 | 338.9503 | 0.6483 | 21.4678 | 0.0468 | 8 | 338.9937 | 0.6481 | 21.4672 | 0.0468 |
| 9 | 310.6901 | 0.6507 | 22.5717 | 0.047 | 9 | 310.8025 | 0.6507 | 22.5701 | 0.047 |
| 10 | 190.9812 | 0.6251 | 25.044 | 0.0363 | 10 | 191.0619 | 0.625 | 25.0422 | 0.0363 |
| 11 | 234.0916 | 0.6801 | 23.8377 | 0.0387 | 11 | 234.1545 | 0.68 | 23.8365 | 0.0387 |
| 12 | 704.3437 | 0.5149 | 19.653 | 0.0699 | 12 | 704.3891 | 0.5148 | 19.6527 | 0.0699 |
| 13 | 99.0481 | 0.7418 | 27.7178 | 0.0254 | 13 | 99.086 | 0.7417 | 27.7162 | 0.0254 |
| 14 | 74.5304 | 0.8071 | 28.8082 | 0.0192 | 14 | 74.6381 | 0.8069 | 28.8019 | 0.0193 |
| 15 | 168.7997 | 0.7496 | 25.2942 | 0.0304 | 15 | 168.9098 | 0.7496 | 25.2914 | 0.0304 |
| 16 | 187.2673 | 0.7582 | 24.7703 | 0.0331 | 16 | 187.3673 | 0.7582 | 24.768 | 0.0332 |
| 17 | 915.7505 | 0.3894 | 18.513 | 0.0887 | 17 | 915.9089 | 0.3893 | 18.5123 | 0.0888 |
| 18 | 128.5775 | 0.7943 | 25.4351 | 0.0267 | 18 | 128.4851 | 0.7944 | 25.4382 | 0.0267 |
| 19 | 367.0825 | 0.7723 | 22.4832 | 0.0372 | 19 | 367.1525 | 0.772 | 22.4823 | 0.0373 |
| 20 | 251.5069 | 0.8253 | 24.0569 | 0.0322 | 20 | 251.6506 | 0.8251 | 24.0544 | 0.0322 |

| 0.6P | | | | | 0.8P | | | | |
|------|----------|--------|---------|--------|------|----------|--------|---------|--------|
| | MSE | SSIM | PSNR | MAE | | MSE | SSIM | PSNR | MAE |
| 1 | 491.4791 | 0.5759 | 20.6529 | 0.0527 | 1 | 491.8759 | 0.5753 | 20.6494 | 0.0528 |
| 2 | 204.0617 | 0.7195 | 25.0332 | 0.0352 | 2 | 204.3787 | 0.7183 | 25.0264 | 0.0353 |
| 3 | 66.3951 | 0.7761 | 27.2155 | 0.0219 | 3 | 66.5478 | 0.7758 | 27.2055 | 0.022 |
| 4 | 491.0855 | 0.6094 | 20.323 | 0.0596 | 4 | 491.2973 | 0.6093 | 20.3211 | 0.0597 |
| 5 | 194.874 | 0.7949 | 24.5238 | 0.0312 | 5 | 195.0406 | 0.7948 | 24.5201 | 0.0313 |
| 6 | 106.0666 | 0.7619 | 25.8941 | 0.0249 | 6 | 106.2189 | 0.7616 | 25.8879 | 0.025 |
| 7 | 92.307 | 0.8334 | 28.131 | 0.0216 | 7 | 92.4679 | 0.8332 | 28.1234 | 0.0216 |
| 8 | 339.1227 | 0.648 | 21.4656 | 0.0468 | 8 | 339.3232 | 0.6479 | 21.463 | 0.0469 |
| 9 | 310.8666 | 0.6506 | 22.5692 | 0.047 | 9 | 311.0497 | 0.6505 | 22.5667 | 0.047 |
| 10 | 191.1827 | 0.625 | 25.0395 | 0.0363 | 10 | 191.2733 | 0.6248 | 25.0374 | 0.0364 |
| 11 | 234.2046 | 0.6799 | 23.8356 | 0.0387 | 11 | 234.3432 | 0.6797 | 23.833 | 0.0387 |
| 12 | 704.4995 | 0.5148 | 19.652 | 0.0699 | 12 | 704.6273 | 0.5148 | 19.6512 | 0.0699 |
| 13 | 99.1567 | 0.7415 | 27.7131 | 0.0254 | 13 | 99.283 | 0.7414 | 27.7076 | 0.0254 |
| 14 | 74.7269 | 0.8068 | 28.7968 | 0.0193 | 14 | 74.932 | 0.8064 | 28.7849 | 0.0195 |
| 15 | 168.9952 | 0.7495 | 25.2892 | 0.0305 | 15 | 169.1436 | 0.7493 | 25.2854 | 0.0305 |
| 16 | 187.4349 | 0.758 | 24.7665 | 0.0332 | 16 | 187.6103 | 0.7578 | 24.7624 | 0.0332 |
| 17 | 915.685 | 0.3894 | 18.5133 | 0.0888 | 17 | 916.0609 | 0.3893 | 18.5116 | 0.0888 |
| 18 | 128.742 | 0.7942 | 25.4295 | 0.0268 | 18 | 128.9064 | 0.794 | 25.424 | 0.0268 |
| 19 | 367.2092 | 0.7716 | 22.4817 | 0.0373 | 19 | 367.1014 | 0.7713 | 22.4829 | 0.0374 |
| 20 | 251.8788 | 0.8249 | 24.0505 | 0.0323 | 20 | 252.4231 | 0.824 | 24.0411 | 0.0323 |

As expected, the PSNR and SSIM go on decreasing as the message size increases as this would mean greater manipulation of the target image matrix. However, these changes remain constant up to 2 decimal places and the decrease in quality is diminutive.

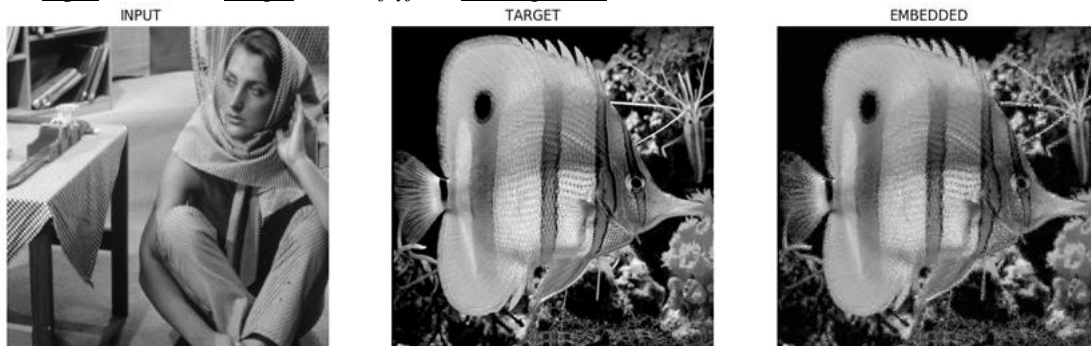
In any case, it can be seen that the Encrypted Images are able to maintain satisfactory visual quality. The average PSNR for these 20 randomly selected pairs having message size embedded 0.5P is 24.080315 dB which is acceptable.

A plot between the average SSIM against message size can be seen decreasing linearly. Again, these changes are miniscule nearly indistinguishable visually.



● Visual Samples

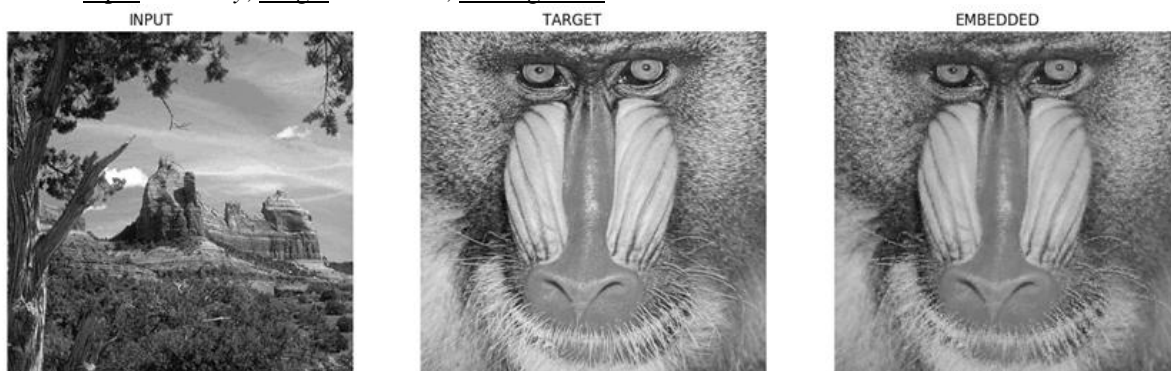
1. Input - Barbara, Target - Butterflyfish, Message Size - 0.2P



2. Input - Golden Gate Bridge, Target - Lena, Message Size - 0.5P



3. Input - Scenery, Target - Mandrill, Message Size - 0.8P



IV. CONCLUSION AND FUTURE WORK

In this paper, we demonstrated how sensitive images having additional textual data can be concealed discreetly in case of a data breach. It is nearly impossible for attackers to recognize the camouflage of sensitive images due to the decoy being an ordinary looking image and is also free from the notion of the curious cloud. With more and more services using the cloud for storing various assets and images, it is a necessity for them to employ all means possible and protect sensitive data and this algorithm fits the bill.

It would be interesting to see how the algorithm can be refined to further minimise artifacts and also implement a more advanced bit encoding technique. This algorithm could be extended to other multimedia formats such as audio, video as well.