

A Novel Approach for Contrast Enhancement using Image Classification and Subdivision based Histogram Equalization

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Abstract

In the field of image processing, contrast enhancement is a vital area to enhance contrast of images which are having poor contrast. Histogram Equalization (HE) is the method used to increase contrast in images. To improve contrast in images several HE methods persist. By determining the Probability Density Function (PDF) and Cumulative Density Function (CDF), HE expands the distribution of pixels. The overall brightness would be altered while the histogram equalization is being applied is a one kind of disadvantage. The drawback which is mentioned here can be avoided by, classifying the image based on intensity exposure and is divided into sub images based on the median value. To minimize the over enhancement, the sub images are clipped using the threshold value. Equalization can be done separately for each sub images, and the equalized sub images are combined to form a single image. Thus, to keep the brightness and to bring limitation in enhancement rate the classification and subdivision based HE method was proposed which equalizes the image. For color images, this method of equalization performs better than gray scale images. The simulation results for several test images are obtained using Matlab software tool. The results show that the entropy of the proposed method is compared with the standard HE method and it determines the amount of information available in the image. The proposed method provides better enhancement than other methods of equalization by controlling the enhancement rate. Improvements can be done by selecting the threshold values for clipping and intensity exposure. Contrast enhancement is applied in the areas of photography, medical imaging and video surveillance systems to enhance quality in images and the image looks natural.

Keywords: Classification, Clipping, Contrast Enhancement, Entropy, Exposure, Histogram Equalization

1. Introduction

In image processing, different devices such as cameras, electron microscopes, scanners, X-ray devices and ultrasound are used for taking images indifferent fields like medical, industrial, military, civil and security. Image processing deals to bring the enhancement in the visual aspect of image for human perception. Image processing is used in the certain areas of image enhancement, image sharpening, pattern recognition, noise removal etc.

Image enhancement is one of the important techniques in image processing which improves the contrast of low quality images. There are two methods for enhancing contrast in images. By finding out the contrast parameter directly, the enhancement is done for the direct enhancement method. The technique by which the pixels are distributed is being referred to as indirect method of enhancement. Most of the indirect methods make use of histogram modification techniques¹.

The main aim of contrast enhancement is to bring improvement in the perceptual quality of images

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depending on the application². Contrast enhancement refers to the amount of gray or color differentiation in digital images. Contrast of images is defined as the ratio between the brighter and the darker pixel intensities³.

Contrast enhancement plays an effective role in the enhancement of perceptual quality for computer vision, pattern recognition and in the processing of images. Depends on the light exposure, the contrast of an image would be poor or bright. Due to the atmosphere lighting conditions, the aperture size and the shutter speed, the contrast changes may be happened⁴. By enhancing contrast this can be avoided. In some scenario, the requirement would be to adjust the overall brightness of an image. The pertinent method to adjust contrast suitably is the histogram equalization technique. Histogram equalization are applied in many areas such as medical image processing, texture analysis and synthesis, and in speech recognition⁵. However, this HE changes the overall contrast and making the images seems unnatural. This can be eliminated by utilizing different methods of histogram equalization which enhance the brightness level of an image⁶.

A method called Brightness preserving Bi-Histogram Equalization (BBHE) preserves the average brightness by increasing the contrast. In BBHE, the histogram of image can be segmented into sub histograms by calculating mean value. One of the sub image having values less than or equal to mean and the other one having values greater than the mean value. The two sub images are equalized separately and combined to form single image⁷.

The other method named Dualistic Sub Image Histogram Equalization (DSIHE) is same as BBHE but in some way it is better than BBHE in the way of maintaining the brightness in images. In this equalization, it also divides the histogram into two sub histograms based on median value and then equalization is done independently⁸. The image enhancement by adjusting the contrast mechanism facilities are not possible with these method and thereby the new technique of histogram subdivision is introduced which maintain the brightness level by limits the enhancement rate. Contrast enhancement finds application in medical imaging system, video surveillance system and digital photography⁹.

This paper is organized as follows. Section 2 describes image classification based on intensity exposure. Section 3 describes the image subdivision and Equalization. Section 4 describes the simulation results and Section 5 gives the conclusion.

2. Image Classification based on Intensity Exposure

2.1 Definition of Histogram

The allocation of the pixel intensity value of an image depicts the histogram of the given image. It can be plotted by taking into account the pixel intensity and the absolute number of pixels in an image. This is also expressed¹ as in the Equation (1),

$$h(j) = n_j \quad (1)$$

Where j is the gray level distributed and n_j is the number of pixels in the image³.

2.2 Exposure Threshold Calculation

Thresholding is the simplest way of dividing an image. This can be done by using a measure of intensity known as exposure. If the light exposure is poor, the images are being referred as under exposed images. If the light exposure is good, then the images are being classified as over exposed images. Low contrast images which are having low gray levels are named as under exposure. Images with maximum contrast and having higher gray levels are named as over exposed images. For the given image, the normalized exposure value will be in the range between 0 to 1. The under exposed images are having this value in the range between 0 to 0.5. The over exposed images are having this value in the range between 0.5 to 1. The equation (2) conveys the way to calculate the exposure of a given image as,

$$\text{Exposure} = \frac{1}{\text{Levels}} \sum_{j=1}^L \frac{h(j)j}{h(j)} \quad (2)$$

Where Levels is the total number of gray levels and $h(j)$ is the histogram of image¹⁰.

Another parameter denoted as X_a which splits the image as over and under exposed sub images is obtained from (3).

$$X_a = \text{Levels}(1 - \text{Exposure}) \quad (3)$$

2.3 Computing Median

After calculating X_a the two sub images are divided into four sub images based on median value. The median can be calculated using

$$X_{ml} = \text{median}(h(j)) \quad 0 \leq j \leq X_a \quad (4)$$

$$X_{mu} = \text{median}(h(j)) \quad T_c = \frac{1}{\text{Levels}} \sum_{j=1}^L h(j) \quad (5)$$

2.4 Clipping the Image Histogram

Clipping the histogram of an image avoids excessive enhancement by restricting the enhancement rate. This process of clipping is achieved by choosing an appropriate clipping threshold. The larger values in the histogram are to be clipped. Threshold can be computed as the mean of gray level occurrences in the image^{10,11}. The formula for clipping threshold is

$$T_c = \frac{1}{\text{Levels}} \sum_{j=1}^L h(j) \quad (6)$$

$$h_c(j) = T_c \quad \text{for } h(j) \geq T_c \quad (7)$$

3. Image Subdivision and Equalization

3.1 Histogram Subdivision and Equalization

Histogram subdivision splits the histogram of an image into two sub images named I_{lower} and I_{upper} based on intensity. The two sub images in the range 0 to X_a and X_a+1 to Levels-1 are divided into four sub images. The PDF of these four sub images are $P_{Ll}(j)$, $P_{Lu}(j)$, $P_{Ul}(j)$, $P_{Uu}(j)$ respectively¹¹.

$$P_{Ll}(j) = \frac{h_c(j)}{N_{Ll}} \quad \text{for } 0 \leq j \leq X_{ml} \quad (8)$$

$$P_{Lu}(j) = \frac{h_c(j)}{N_{Lu}} \quad \text{for } X_{ml} + 1 \leq j \leq X_a \quad (9)$$

$$P_{Ul}(j) = \frac{h_c(j)}{N_{Ul}} \quad \text{for } X_a + 1 \leq j \leq X_{mu} \quad (10)$$

$$P_{Uu}(j) = \frac{h_c(j)}{N_{Uu}} \quad \text{for } X_{mu} + 1 \leq j \leq \text{Levels} - 1 \quad (11)$$

Where N_{Ll} , N_{Lu} , N_{Ul} , N_{Uu} are the total number of pixels in the four sub images¹¹. After calculating the probability density function, CDF can be calculated separately for four sub images from 0 to L-1. $C_{Ll}(j)$, $C_{Lu}(j)$, $C_{Ul}(j)$, $C_{Uu}(j)$ are the corresponding CDF of the four sub images¹¹.

Next step is to perform equalization for all the four histograms of sub images individually. For equalization there is a need to compute transfer functions for these sub images. F_{Ll} , F_{Lu} , F_{Ul} , F_{Uu} , F_{Ll} are the transfer functions of four sub-images which are obtained by multiplying the lower median and the CDF C_{Ll} . F_{Lu} is calculated by adding the lower median and the exposure and multiplying by the CDF C_{Lu} . In the same way F_{Ul} and F_{Uu} are calculated by taking upper median and upper CDF¹¹. Finally the four sub images are combined to form a single image.

3.2 Image Classification and Subdivision based HE

The steps involved in image classification and subdivision based HE is as follows

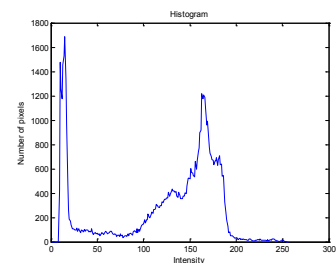
- Compute the histogram $h(j)$ of an image.
- Calculate exposure and threshold parameter X_a .
- Calculate the median value X_{ml} and X_{mu} based on the parameter X_a .
- Compute the clipping threshold T_c and segment the histogram.
- The given image histogram is divided into four sub-histograms depends upon the exposure value.
- Equalize the four histograms independently using the transfer function determined.
- Finally combine the four sub images into one image.

4. Simulation Results

The determination of the rate of image enhancement is being calculated by correlating the histogram equalization method with the classification based HE. A standard cameraman as test image is shown in Figure 1(a) along with the histogram as in Figure 1(b). Figure 1(c) and 1(d) shows the histogram equalized image and the corresponding histogram. This method can be compared with classification based HE. Figure 1(e) and (f) gives the classification based HE and its histogram. The test image, image after HE and the classification based HE of image is shown in Figure 2 and 3 for grayscale images.



(a)



(b)

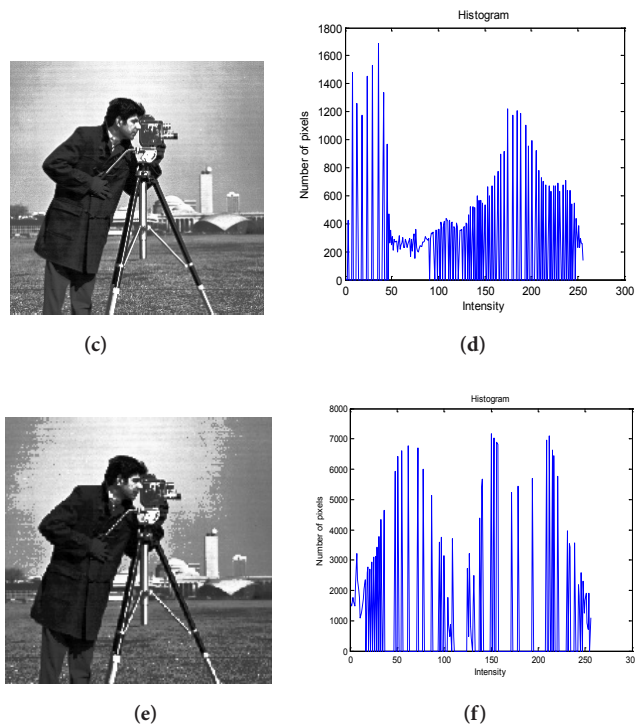


Figure 1. (a) “Cameraman” test image. (b) Histogram plot of the test image. (c) Conventional Histogram Equalization. (d) Histogram of the HE method. (e) Classification based HE. (f) Histogram of the classification based HE.

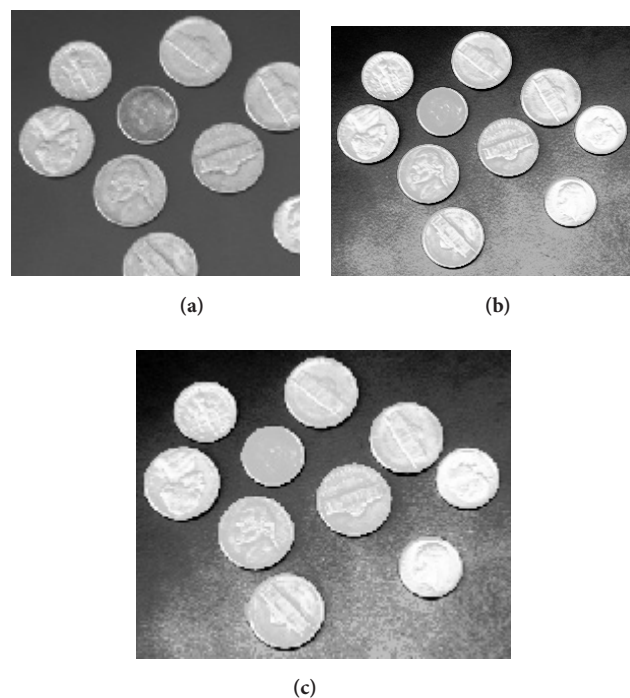


Figure 2. (a) “Coins” test image. (b) Conventional HE result. (c) Classification based HE result.

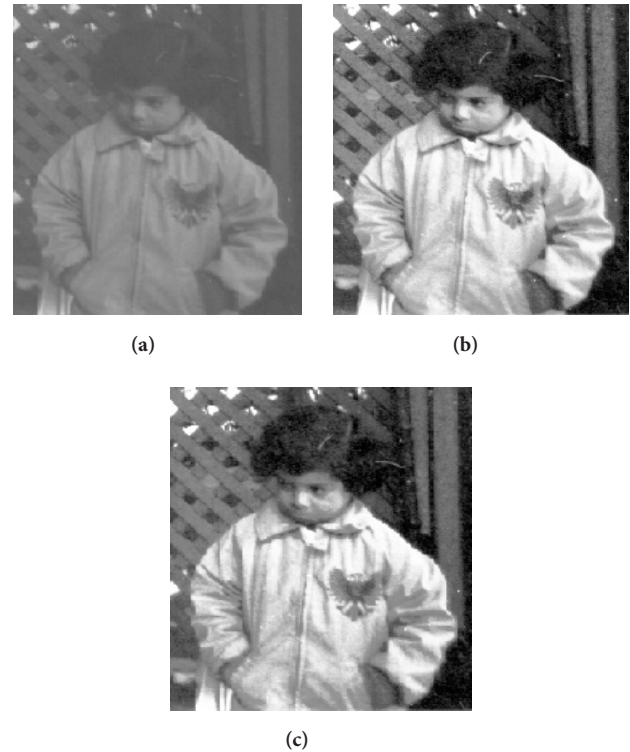


Figure 3. (a) “pout” test image. (b) Conventional HE result. (c) Classification based HE result.

The color conversion models are being used to perform histogram equalization with the color images. The simple model for converting a color to gray scale image is $R = G = B = (R+G+B)/3$. The other standard models such as YCbCr, NTSC, YUV can also be used to convert a color to gray scale image. The enhancement task can be applied to only luminance part, since the majority of the information would be available in the luminance part rather than Cb and Cr. These channels are not modified and can be used as it is to produce a color image again with better enhancement. The proposed method also using this approach to enhance color images. For color images, the test image, image after HE and the Classification based HE are shown in Figure 4 and 5.



(a)

(b)



(c)

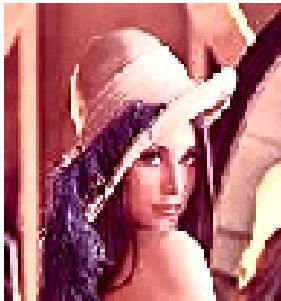
Figure 4. (a) “Onions” color test image. (b) Conventional HE result. (c) Classification based HE result.



(a)



(b)



(c)

Figure 5. (a) “Lena” color test image. (b) Conventional HE result. (c) Classification based HE result.

The simulation results are correlated by using a quality measure called entropy. The average amount of information content in an image can be defined by a measure of entropy. The determination of entropy gives the average information present in the image in bits per pixel¹². In this section, the entropy results of HE and the classification based HE are correlated and the results are tabulated. Entropy is determined using (12) as

$$\text{Entropy} = -\sum_{u=0}^{L-1} P(u) \log P(u) \quad (12)$$

Where $P(u)$ is the PDF of a image at particular intensity u and L is the total number of gray intensity levels in the image^{10,11}. Maximum value of entropy indicates

that maximum information content is there in the image. The entropy results of HE and classification based HE are compared and is shown in Table 1.

Table 1. Entropy results

Test images	Original image	HE	Image classification and subdivision based HE
Camerman	7.01	6.77	6.74
Coins	6.32	6.04	5.98
Pout	5.76	5.71	5.71
Tire	6.93	6.57	6.63
Eight	4.88	4.68	4.44
Rice	7.01	6.91	6.85
Circuit	6.94	6.92	6.91
Moon	5.51	5.06	4.96
Lifting body	6.49	6.19	6.03

5. Conclusions

In this study, an image can be classified as less and highly exposed images based on the value of exposure. Exposure and median calculation subdivides and equalize the sub images which enhance contrast in images and limits over enhancement. The entropy results show that proposed method provides maximum information which is closer to the original image. Compared with HE, the proposed method provides better enhancement and the image looks natural. Image classification and subdivision based HE method shows that it performs better than other HE methods in the way of maintaining brightness.

6. References

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