

# ENHANCING X-RAY IMAGES BASED ON DUAL TREE COMPLEX WAVELET TRANSFORM

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**Abstract**— Conventionally, radiographic images have low contrast due to less illumination of the light. X-Ray imaging is one of the least expensive, easy to read method used by most of the doctors and radiologists. A method based on dual tree complex wavelet transform (DTCWT), contrast limited adaptive histogram equalization (CLAHE) and Wiener filter is proposed for enhancing the visual quality of the X-Ray images. Quantitative analysis of proposed algorithm is done by evaluating MSE, PSNR, SNR and Contrast Ratio (CR).

**Index Terms**— *Dual Tree Complex Wavelet Transform (DTCWT); resolution enhancement; contrast enhancement.*

## I. INTRODUCTION

Medical images require enhancement, for improving the visual quality. Radiographic images such as X-Ray need to be enhanced for providing better and effective medication to the patient. The procedure of conducting the X-Ray is simple, less time taking and as far as cost is concerned from patient point of view, it is cheap as compared to MRI, CT scan.

While doing the X-Ray, noise can be included in the X-Ray film due to patient's motion or due to low illumination of the light. This will make doctors and radiologists to read the X-Ray film in a difficult mode. So, this requires improvement of the visual quality of the film.

With time, various methods are available for enhancement of medical images. These methods are applied depending on the radiographic image considered for diagnosing the patient. These methods are divided depending on whether pixels are considered or the image is transformed. Spatial domain method considers pixels for enhancement whereas Frequency domain based method perform enhancement on orthogonal transformation of the image instead of original image itself.

Some of the common methods for enhancing the contrast of the image are Histogram Equalization (HE) [6] [7], Adaptive Histogram Equalization (AHE) [6] [11] [12], Contrast Limited Adaptive Histogram Equalization (CLAHE) [12] and these methods are Spatial domain based method. Frequency domain methods are fourier transform, wavelet transform, curvelet transform and contourlet transform. For enhancing the X-Ray image, combination of frequency domain and spatial domain based method is proposed here.

*Manuscript received June , 2015.*

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Resolution enhancement based on Dual tree complex wavelet transform (DTCWT) [2] [4] is proposed, which has the property of nearly shift invariance. DTCWT uses two trees, one for the rows of the image and other for the columns of the image. If two filters used in both trees are different, then one will provide real coefficients and other will provide imaginary coefficients. Apart from DTCWT, there are various transforms such as stationary wavelet transform (SWT) [3], which uses un-decimated decomposition for obtaining high frequency wavelet coefficients whereas discrete wavelet transform (DWT) produce artifacts due to shift variance property and requires proper filtering of the coefficients to overcome this problem.

## II. PRELIMINARIES

This paper is divided in two sections, resolution enhancement and contrast enhancement of radiographic image. Resolution enhancement is done in frequency domain, which requires transformation of the input image in frequency/transform domain. To fulfill this requirement, wavelet transform is used.

### A. Wavelet Transform

A wavelet is a small wave of short duration of a signal, which is considered stationary during that duration. In speech processing, as signal varies continuously with time, small duration of signal is considered stationary for analyzing the speech. These are classified as

1) *Continuous Wavelet Transform* : Signal having finite energy needs to be projected on frequency bands of continuous family. Some of commonly used continuous wavelet transform are Shannon wavelet, Morlet wavelet, Poisson wavelet, Meyer wavelet etc.

2) *Discrete Wavelet Transform (DWT)*: If the wavelet series expansion is expanded in sequence of numbers, than resulting wavelet transform is discrete wavelet transform.

3) *Stationary Wavelet Transform (SWT)* : This type of wavelet transform is designed to overcome the flaws of discrete wavelet transform. DWT does not have translation-invariance property. This property is achieved in SWT by removing downsamplers and upsamplers from DWT and upsampling the coefficients of filter by  $2^{(j-1)}$  in  $j^{\text{th}}$  level of algorithm. SWT is digitally implemented using following flow diagram in Fig. 1

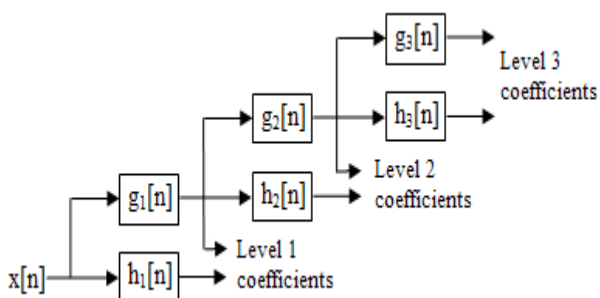


Fig. 1 Implementation of SWT

In Fig. 1, filters used in each stage are upsampled version of the filter used in previous stage.

1) *Dual Tree Complex Wavelet Transform (DTCWT)*: It has the property of nearly shift-invariance. This property overcomes the problem related with DWT, that it produces artifacts. Fig. 2 shows, two trees for performing the wavelet transform. If filters used in both trees are different, than upper filter provide real coefficients and lower tree provide imaginary coefficients.

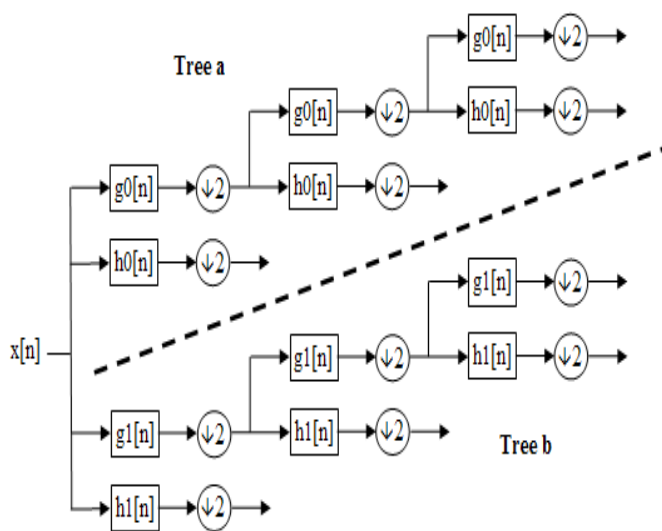


Fig. 2 Implementation of DTCWT

For enhancing the contrast of the input image, various techniques are used based on histogram

**B. Histogram Processing**

To enhance the brightness or contrast of the image, histogram is the process of adjusting the intensity values. Histogram is used to define the intensity distribution of the image.

1) *Histogram Equalization*: Intensities of the image are distributed well in histogram. This help to improve the intensity distribution of the image in local areas. Histogram equalization deals with the probability of occurrence of the gray level values to be equal.

2) *Adaptive Histogram Equalization (AHE)*: In this case, each image is divided into several subsections. For each subsection, histogram is designed. Then, these histograms are used to improve the contrast of the image locally.

3) *Contrast Limited Adaptive Histogram Equalization (CLAHE)*: Due to AHE, noise gets over amplified. To prevent this situation, CLAHE is designed. This is used to improve the contrast globally.

**I. PROPOSED WORK**

To enhance the resolution and contrast of the radiographic image such as X-Ray image, a combination of spatial domain and frequency domain based technique is proposed. Block diagram describing the proposed work is shown in Fig. 3.

Input image is decomposed using dual tree complex wavelet transform (DTCWT). By decomposing the image we get low subband image through low pass filtering and high subband image through high pass filtering. Due to low pass filtering, high frequency components are lost, which contain information of edges, fine line details etc. So, interpolation is performed on high frequency components.

For interpolating the coefficients, lanczos interpolation is used. This type of interpolation is not linear, but it is sinc function type interpolation. Advantage of using the sinc function type interpolation that it varies with the change in the signal information so better reconstruction can be achieved.

For improving the contrast of the image, adaptive histogram equalization is proposed. While using the adaptive histogram equalization (AHE), certain input parameters are used such as clip limit and distribution.

Further the AHE image is applied to singular value decomposition (SVD) block. SVD [2] [9] is a decomposition tool, which decompose the input image into three (S, U and V) equal size image. U and V image are orthogonal to each other whereas S image is a diagonal image, on its diagonal there are intensity values of respective pixels. By considering the SVD, a weighting function is evaluated.

**A. Image Decomposition**

Wavelet transform is a frequency domain based technique, used for decomposition of input image. There are various wavelet transform available for such operation. Stationary wavelet transform (SWT) [3] based method is used for fingerprint enhancement. In this the parameters used are , mean, standard deviation, smoothness, uniformity and entropy.

Combination of discrete wavelet transform (DWT) and SWT [13] is proposed. Subbands are interpolated using lanczos interpolation which provides better results. But artifacts are present while using the DWT, so filtering is required.

**B. Coefficient Filtering**

After decomposing the image by wavelet transform, wavelet coefficients need to be interpolated. As DWT produce artifacts, dual tree complex wavelet transform (DTCWT) [2], can be used for evaluating the wavelet coefficients.

To reduce the artifacts, high frequency subband images need to be interpolated and then filtered. Wiener filter [7] , Non Local Mean (NLM) [2] filter, Gaussian filter , Median filter can be used for this purpose.

These filters have their own pros and cons and have to be used depending on the images (medical image, satellite image etc.) considered, their dimension, class etc.

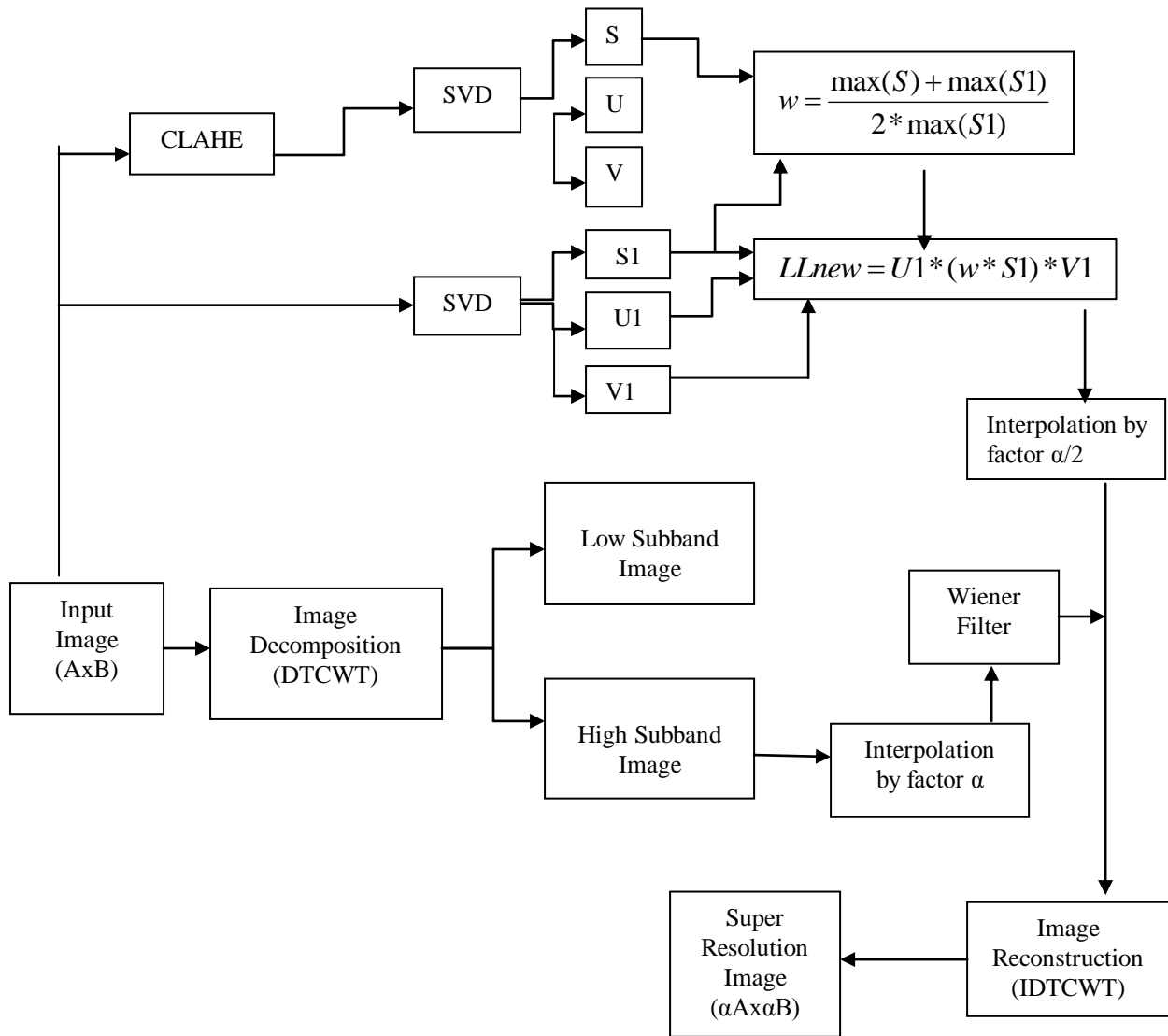


Fig. 3 Block Diagram of Proposed Work

C. Image Reconstruction

To enhance the input image, image reconstruction is required. This is done using inverse of the wavelet transform used for image decomposition. The output enhanced image, has higher pixel count which increases by the factor used for interpolation.

III. RESULTS AND DISCUSSION

To simulate the proposed algorithm, grayscale images of 8 patients is collected from hospital. These images are reduced to size 512x512.

A. Parameter Calculation

Analysis of proposed algorithm is done qualitatively and quantitatively. For quantitative analysis, certain parameters are calculated

$$PSNR = 10 * \log\left(\frac{MAX_I^2}{MSE}\right)$$

based on the following formulas. To calculate the Peak signal-to-noise ratio, Eq. 1 is used,

$$(1)$$

where, MAX<sub>I</sub> is the maximum value of intensity present in the image, by default it is 255 in case of 8 bits per pixel.

This is evaluated in terms of decibels (dB). MSE in Eq. 1 is mean square error, which is the difference between input image and reconstructed image as shown in Eq. 2.

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

$$(2)$$

Here  $I(i,j)$  is the input image and  $K(i,j)$  is reconstructed image.

Contrast ratio (CR) is defined as the ratio of difference between the maximum and minimum intensity value of reconstructed image  $K(i,j)$  to the sum of maximum and minimum intensity value of  $K(i,j)$  image as shown in Eq. 3.

$$CR = \frac{\max[K(i, j)] - \min[K(i, j)]}{\max[K(i, j)] + \min[K(i, j)]} \quad (3)$$

### B. Discussion

For enhancing the medical image, DTCWT-CLAHE-Wiener filter based algorithm is proposed. To evaluate the results, chest PA view X-Ray image of 8 patients is collected from hospital.

To improve the contrast of the image, contrast limited adaptive histogram equalization (CLAHE) and SVD based technique is proposed here. To enhance the resolution of the image DTCWT and Wiener filter is used.

Due to lanczos interpolation by factor  $\alpha$ , size of the enhanced output image is 4 times that of the input image. As DTCWT is nearly shift invariant, it provides better result as compared to DWT and SWT. While using DTCWT, artifacts appear, to remove these artifacts Wiener filter is used. Non Local Mean (NLM) filter can also be used for filtering the coefficients and to remove the artifacts, but it increases the complexity of the algorithm by more time consumption. So, Wiener filter is proposed to filter the coefficients.

### C. Simulated Results

Chest PA view X-Ray image is enhanced using proposed method. The result is shown in Fig. 4. Proposed algorithm result is compared with the other methods to show the comparison among proposed method and those methods.

Histogram equalization (HE), can be used for improving the contrast of the image, but this provides less resolution as well as parameters such as PSNR, CR, MSE and SNR is also less.

Adaptive histogram equalization (AHE) along with wavelet transform can be used for improving the contrast of the image, but it produces artifacts.

Fig. 4(a), shows the input image of size 512x512. Fig. 4(b), shows the histogram equalized image. Fig. 4(c) shows the adaptive histogram equalized image (AHE). Fig. 4(d) shows DTCWT-HE-NLM based algorithm result and it has low resolution and contrast, also it takes 10630.4 sec. of computational time which is larger than other methods. Fig. 4(e) shows the DTCWT-AHE-NLM method for enhancing the visual quality of the image. Fig. 4(f) shows result of DTCWT-CLAHE-Wiener filter based proposed algorithm, which outperforms other methods. These results are simulated on MATLAB R2014b, i5 processor.

For quantitative analysis, Table I shows comparative results of various methods used. Five different methods for improving the contrast and resolution are compared based on different parameters such as peak signal-to-noise ratio (dB), signal-to-noise ratio (SNR) (dB), mean square error (MSE), contrast ratio (CR) and total time required for computation of respective algorithms.

Computational time of HE and AHE is less as compared to proposed method, but resolution and contrast of the proposed method is improved. DTCWT-HE-NLM and DTCWT-AHE-NLM takes large time but their results are better than HE and AHE.

Proposed algorithm DTCWT-CLAHE-Wiener produces better result as compared to other methods. PSNR is 42.35 dB, SNR is 35.144 dB, MSE is 0.0001, contrast ratio is 1.0322 but computational time is 5.965 sec. which is quiet high than HE and AHE method.

## IV. CONCLUSION

X-Ray images need to be enhanced for better visual interpretation. Resolution could be enhanced using DWT, SWT and DTCWT. Contrast can be improved using histogram equalization (HE), adaptive histogram equalization (AHE), contrast limited adaptive histogram equalization (CLAHE).

Proposed algorithm DTCWT-CLAHE-Wiener shows that it outperforms other conventional method for improving visual quality of the X-Ray image. Wiener filter takes less time as compared to NLM filter, which is the advantage in emergency situations.

## V. FUTURE SCOPE

The enhancement method is proposed here for the purpose of medical image enhancement has considered some transform techniques, also some medical images such as X-Ray, Ultrasound and MRI. But with the ever increasing technology, new methods will be introduced in the market and that may provide better results than this proposed work. So, with the increasing time, new transforms and images will be tested for providing more benefit to various areas of interests.

In the proposed work, for enhancing the contrast, contrast limited adaptive Histogram Equalization (CLAHE) is used and it showed better results. Other techniques such as Local Histogram Equalization, Generalized Histogram Equalization can be used for enhancing the results. Resolution is improved using dual tree complex wavelet. etc.

TABLE I. Comparison of proposed method with other methods

	MSE	PSNR (dB)	SNR (dB)	CR	Time (sec.)
HE	0.0244	16.1247	8.8609	0.849	1.687
AHE	0.0202	16.9360	9.6722	0.972	1.754
DTCWT-HE-NLM	0.0060	22.2259	16.1994	0.864	10630.4

<b>DTCWT-AHE-NLM</b>	0.0027	25.6958	19.2123	0.874	9255.78
<b>DTCWT-CLAHE-Wiener</b>	0.0001	42.3519	35.1446	1.032	5.965

#### ACKNOWLEDGMENT

I sincerely thanks ECE department of Ajay Kumar Garg Engineering College, Ghaziabad for providing the opportunity and guidance for research work.

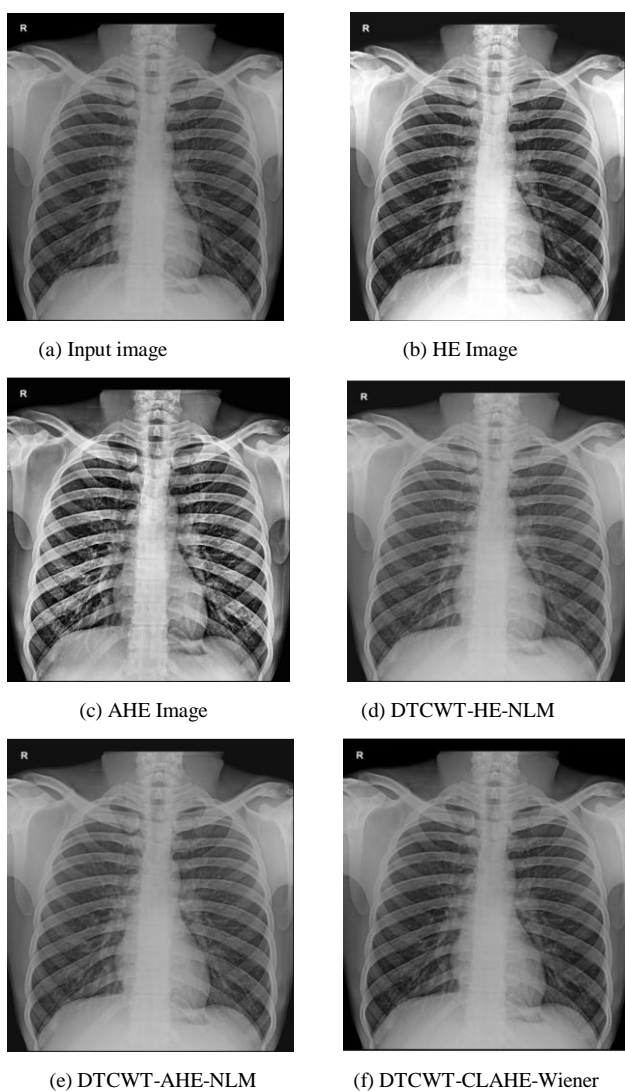


Fig. 4 (a) Input Image, (b) Histogram Equalized Image, (c) Adaptive histogram equalized Image, (d) DTCWT-HE-NLM Image, (e) DTCWT-AHE-NLM, (f) DTCWT-CLAHE-Wiener.

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