

# Pyramid Based Image Fusion

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**Abstract:** Many images are degraded by the bad weather conditions due to smoke, fogs, dust and ash which are obstacle in clarity of images. Image processing techniques improve the quality of an image and enhance the maximum information from the degraded image. It is the process of combining two or more images into a single image; method is a fusion-based strategy that derives from two original hazy images inputs by applying a white balance and contrast enhancing procedure. The method performs in a pyramidal method, which is straightforward to implement. Then the resulting image will be more clear and enhanced from the prior. This thesis reports a detailed study performed over a set of image fusion algorithms regarding their implementation. The thesis demonstrates the utility and effectiveness of a fusion-based technique for dehazing based on a single degraded image.

**Keywords:** Single image dehazing, Weight maps, Fusion Method, Pyramid Technique.

## 1. Introduction

Images of outdoor scenes often contain haze, fog, or other types of atmospheric degradation caused by particles in the atmospheric medium absorbing and scattering light as it travels from the source to the observer. Image Fusion is a mechanism to improve the quality of information from a set of images. By the process of image fusion the good information from each of the given images is fused together to form a resultant image whose quality is superior to any of the input images. This is achieved by applying a sequence of operators on the images that would make the good information in each of the image prominent. The resultant image is formed by combining such magnified information from the input images into a single image [1]. The term fusion in general means, the process is to integrate multisensory or multi-view or multifocal information into a new image that contains better quality features and is more observable. Image fusion is called Pan sharpening used to integrate the geometric details of the high resolution images and colour of the low resolution or multispectral (MS) images. Image fusion finds application in various fields such as satellite imaging, medical sciences, military applications digital cameras multi-focus imaging etc.

Image fusion methods can be broadly classified into spatial domain and transform domain fusion Brovey method, Principal Component analysis (PCA), IHS (intensity hue saturation) and High pass filtering methods fall in the spatial domain

fusion techniques. Spatial image fusion work by combining the pixel values of the two or more images. The simplest is averaging the pixel values of the input images wavelet transform[2] and Laplacian transform[1] come in the transform domain. In the transform domain method the multi-scale decomposition of the images is done and the composite image is constructed by using the fusion rule. Then Image Fusion finds its application in vast range of areas. It is used for medical diagnostics and treatment. A patient's images in different data formats can be fused. These forms can include magnetic resonance image (MRI), computed tomography (CT), For example, CT images are used more often to ascertain differences in tissue density while MRI images are typically used to diagnose brain tumours.

## 2. Review of Literature

In [12], Fattal proposed an algorithm based on independent component analysis. This algorithm estimates the surface shading and the medium under the assumption transmissions which are locally uncorrelated, and gets the image local albedo and restore image contrast. However, a distinct lack of enough color in heavily haze images makes heavily haze images cannot be handled well. In [14], Tarel proposed an improved image defogging algorithm based on bilateral filtering. Tan [11] developed a system for estimating depth from a single weather degraded input image. Motivated by

the fact that contrast is reduced in a foggy image, Tan divided the image into a series of small patches and postulated that the corresponding patch in image should have a higher contrast (where contrast was quantified as the sum of local image gradients). In [13], He proposed a simple but effective image prior-dark channel to remove haze from a single input image. However, as the haze imaging model assumes common transmission for all color channels, this method may fail to recover the haze images. Fattal [12] assumed every patch has uniform reflectance, and that the appearance of the pixels within the patch can be expressed in terms of shading and transmission. He considered the shading and transmission signals to be unrelated and used independent component analysis to estimate the appearance of each patch. Significant progress in single image haze removal has been made in recent years. Tan[11] made the observation that a haze-free image has higher contrast than a hazy image, and was able to obtain good results by maximizing contrast in local regions of the input image. However, the final results obtained by this method are not based on a physical model and are often unnatural looking due to over-saturation. Fattal [12] was able to obtain good results by assuming that transmission and surface shading are locally uncorrelated. With this assumption, he obtains the transmission map through independent component analysis. This is a physically reasonable approach, but this method has trouble with very hazy regions where the different components are difficult to resolve. Lastly, a simple but powerful approach proposed by He [13] uses dark pixels in local windows to obtain a coarse estimate of the transmission map followed by a refinement step using an image matting technique. Their method obtains results on par with or exceeding other state-of-the-art algorithms, and is even successful with very hazy scenes.

### 3. Theoretical Level

#### 3.1 Discrete Wavelet Transform

The discrete wavelet transform (DWT) of image signal produces image representations which provides better spatial and spectral localization of image formation compared with other multi scale representations such as Gaussian and Laplacian pyramid [4]. Recently, DWT has attracted more and more interest in image fusion. An image can be decomposed into a sequence of different spatial resolution images using DWT [5].

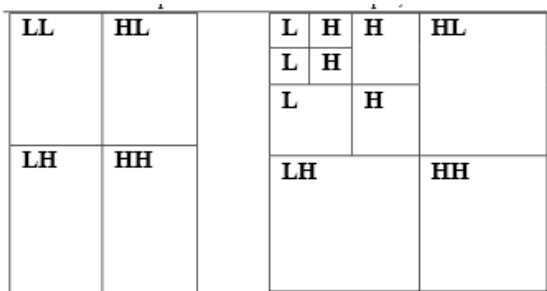


Figure 1: Pixel Level

Image fusion technique [2] is a powerful tool for extracting high quality information from large number of remotely sensed images and limiting redundancy among these images.

Image fusion technique, with an image fusion engine to organize, join, and combine multi source and multitemporal data, provides a powerful tool for these data processing problems [9]. Wavelet transform is first performed on source images. Then a fusion decision map is generated based on a set of fusion rules. Then fused wavelet coefficient map can be constructed from the wavelet coefficients of the source images according to the fusion decision map. Finally the fused image is obtained by performing the inverse wavelet.

#### 3.2 Pixel Level Fusion

This section focuses on the so-called pixel level fusion process, where a composite image has to be built of several input images [1]. In pixel-level image fusion, some generic requirements can be imposed on the fusion result:

- a) The fusion process should preserve all relevant information of the input imagery in the composite image (pattern conservation)

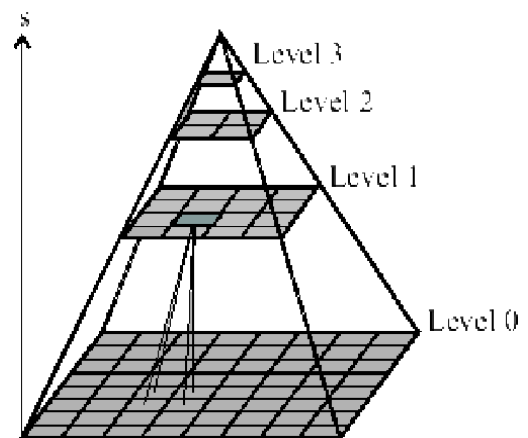


Figure 2: Laplacian Method

- b) The fusion scheme should not introduce any artifacts or inconsistencies which would distract the human observer or following processing stages [1].

- c) Image fusion takes place at three different levels i.e. pixel, feature and decision. Image fusion methods can be broadly classified into two that is special domain fusion and transform domain fusion. Averaging, Brovey method, Principal Component Analysis (PCA), based methods are special domain methods. But special domain methods produce special distortion in the fused image. This problem can be solved by transform domain approach. The multi-resolution analysis has become a very useful tool for analysing images. The discrete wavelet transform has become a very useful tool for fusion. The images used in image fusion should already be registered. Pixel level fusion technique is used to increase the special resolution of the multi-spectral image. Application of image fusion include improving geometric correction, enhancing certain features not visible in either of the single data alone, change detection using temporal data sets and enhancing provide a complete information for Diagnosis [2].

### 4. Fusion Process

The images are first decomposed using a Laplacian

Pyramid decomposition of the original image into a hierarchy of images such that each level corresponds to a different band of image frequencies [1]. The Laplacian pyramid decomposition is a suitable MR decomposition for the present task as it is simple, efficient and better mirrors the multiple scales of processing in the HVS. The next step is to compute the Gaussian pyramid of the weight map. Blending is then carried out for each level separately [1] [2].

### A. Inputs

As mentioned previously, the input generation process seeks to recover optimal region visibility in at least one of the images. In practice, there is no enhancing approach that is able to remove entirely the haze effects of such degraded inputs. Therefore, considering the constraints stated before, since we process only one captured image of the scene, the algorithm generates from the original image only two inputs that recover color and visibility of the entire image. The first one better depicts the haze-free regions while the second derived input increases visible details of the hazy regions. Inherently inspired by the previous dehazing approaches such as Tan [11], Tarel and Hautiere [14] and He et al. [13], we searched for a robust technique that will properly white.

### B. Weight Maps

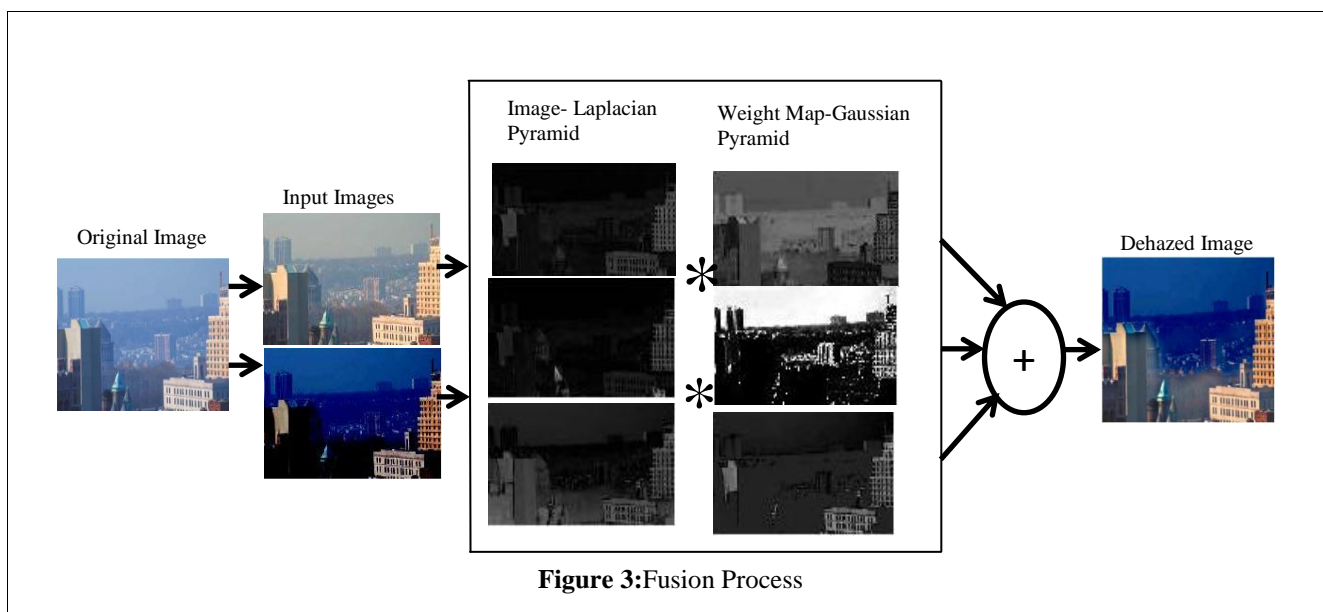
As can be seen in figures by applying only these enhancing

the entire image. In order to overcome this limitation, we introduce three measures (weight maps). These maps are designed in a per-pixel fashion to better define the spatial relations of degraded regions. Our weight maps balance the contribution of each input and ensure that regions with high contrast or more saliency from a derived input, receive higher values [1].

The **luminance weight map** measures the visibility of each pixel and assigns high values to regions with good visibility and small values to the rest. Since hazy images present low saturation, an effective way to measure this property is to evaluate the loss of colorfulness. This weight is processed based on the RGB color channel information. We make use of the well-known property that more saturated colors yield higher values in one or two of the color channels [1].

## 5. Results and discussion

Image Fusion aims to enhance the information apparent in the images as well as to increase the reliability of the interpretation by integrating disparate images. This leads to more clear data and increased visualisation in application fields like medical imaging, foggy images, etc. This paper discusses different techniques for pixel level image fusion and their performance evaluation parameters. Depending

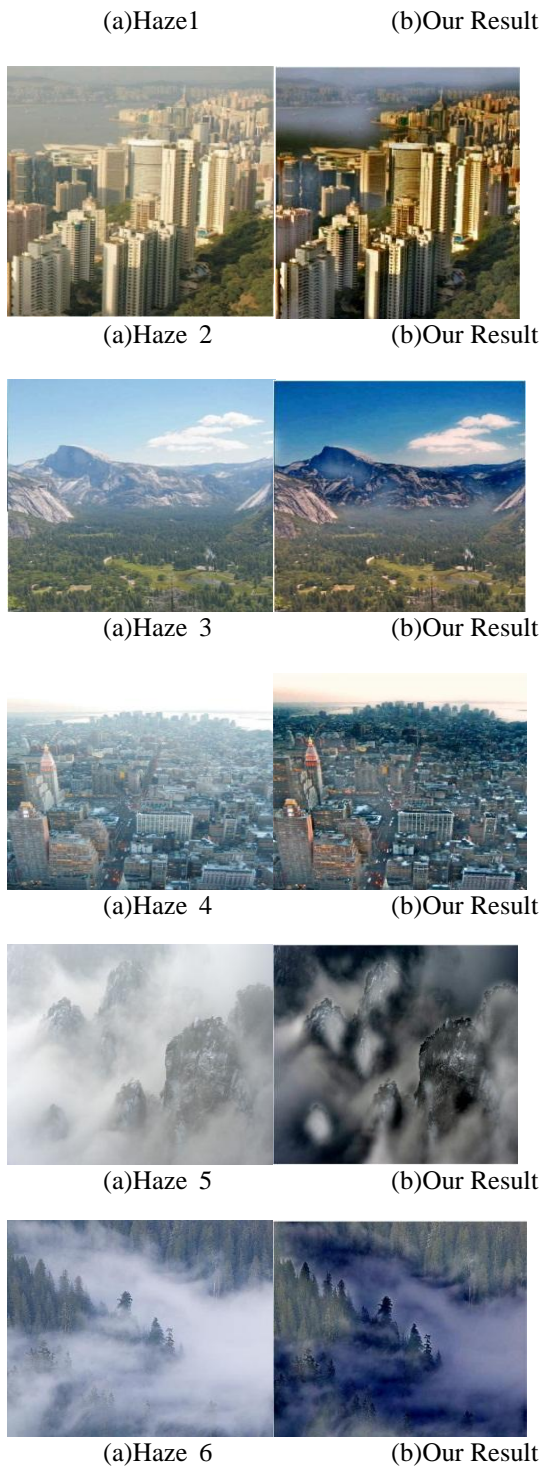


operations, the derived inputs still suffer

from low visibility mainly in those regions dense haze and low light conditions. The idea that global contrast enhancement techniques are limited to dealing with hazy scenes has been remarked previously by Fattal [12]. This is due to the fact that the optical density of haze varies across the image and affects the values differently at each pixel. Practically, the limitation of the general contrast enhancement operators (e.g. gamma correction, histogram equalization, white balance) is due to the fact that these techniques perform (constantly) the same operation across

upon the use of the given application, some users may wish a fusion outcome that would show more color details, some may desire more analysis or mapping; while some may want improved accuracy of application; and some others may wish for a visually beautiful and appealing fused color image, solely for visualization purposes. Thus, we can conclude that fusion algorithm with pixel level and weight maps. A combination of weight maps including luminance map, chromatic map, saliency map





**Figure 4:**Output Result of Many Hazy Images.

Which increase the clarity of foggy image this approach may be the correct way to find out which fusion algorithm is most appropriate for an application.

## References

[1] Codruta Orniana Ancuti and Cosmin Ancuti—single image dehazing by multi- scale fusion *ieee transactions on image processing*, vol. 22, no. 8, august 2013.  
 [2] Paresh Rawat, Sapna Gangrade, Pankaj Vyas—Implementation of Hybrid Image Fusion Technique Using Wavelet Based Fusion Rules *(IJCTEE)* Volume 1, Issue 1 July 12, 2011.

[3] Jin-Hwan Kim, Jae-Young Sim, and Chang-Su Kim—single image dehazing based on contrast enhancement *ieeee* 2011.  
 [4] Yoav Y. Schechner, Srinivasa G. Narasimhan and Shree K. Nayar—Instant Dehazing of Images Using Polarization *Proc. Computer Vision & Pattern Recognition* Vol. 1, pp. 325-332 (2001).  
 [5] Pengli LU, Qiang ZHANG—Single Image Dehazing Method, *Journal of Computational Information Systems* 10: 4 (2014) 1581–1588.  
 [6] Peter Carr, Richard Hartley—Improved Single Image Dehazing using Geometry *Australian National University and NICTA Canberra, Australia*.  
 [7] A. Ben Hamzaa, Yun Heb, Hamid Krimc, and Alan Willskyd —A approach to pixel-level image Fusion *Integrated Computer-Aided Engineering* 12 (2005) 135–146.  
 [8] Yufeng Zheng, —Multi-scale Fusion Algorithm Comparisons: Pyramid, DWT and Iterative DWT *12th International Conference on Information Fusion Seattle, WA, USA, July 6-9, 2009*.  
 [9] N. INDHUMADHI, G. PADMAVATHI Enhanced Image Fusion Algorithm Using Laplacian Pyramid and Spatial frequency Based Wavelet Algorithm *International Journal of Soft Computing and Engineering (IJSCE)* ISSN: 2231-2307, Volume-1, Issue-5, November 2011.  
 [10] Yufeng Zheng, Edward A. Essock and Bruce C. Hansen—An Advanced Image Fusion Algorithm Based on Wavelet Transform Incorporation with PCA and Morphological Processing.  
 [11] R. T. Tan, —Visibility in bad weather from a single image, *in Proc. IEEE Conf. Comput. Vis. Pattern Recognit*, Jun. 2008, pp. 1–8.  
 [12] R. Fattal, —Single image dehazing, *ACM Trans. Graph., SIGGRAPH*, vol. 27, no. 3, p. 72, 2008.  
 [13] K. He, J. Sun, and X. Tang, —Single image haze removal using dark channel prior, *in Proc. IEEE Conf. Comput. Vis. Pattern Recognit.*, Jun. 2009, pp. 1956–1963.  
 [14] J. Tarel, N. Hauti, Fast visibility restoration from a single color or gray level image, *Proceedings of IEEE International Conference on Computer Vision (ICCV)*, Kyoto, Japan: IEEE Computer Society, 2009, pp. 2201-2208.  
 [15] Amina Saleem, Azeddine Beghdadi and Boualem Boashash, 'Image fusion-based contrast enhancement' *Saleem et al. EURASIP Journal on Image and Video Processing* 2012.  
 [16] M.A. Mohamed and B.M. El-Den Implementation of Image Fusion Techniques Using FPGA *IJCSNS International Journal of Computer Science and Network Security*, VOL.10 No.5, May 2010.  
 [17] Dr. H.B. Kekre et al. review on image fusion techniques and performance evaluation parameters *International Journal of Engineering Science and Technology (IJEST)* Vol. 5 No.04 April 2013.  
 [18] Zheng Liu —Objective Assessment Of Multiresolution Image Fusion Algorithms For Context enhancement in Night Vision: A Comparative Study, *IEEE transaction*, vol 34, no.1 January 2012.  
 [19] Shutao Li, Bin Yang Multifocus image fusion using region segmentation and spatial frequency accepted 31

October 2007. [www.sciencedirect.com](http://www.sciencedirect.com) Image and Vision Computing 26 (2008) 971–979.

- [20] S.M.Mukane<sup>1</sup>, Y.S.Ghodake<sup>2</sup> and P.S.Khandagle  
Image enhancement using fusion by wavelet transform and Laplacian Pyramid IJCSI International Journal of Computer Science Issues, Vol. 10, Issue 4, No 2, July 2013.

- [21] E. H. Adelson, C. H. Anderson, J. R. Bergen  
Pyramid methods in image processing | RCA Engineer • 29-6 • Nov/Dec 1984.