Restoration of Hazy Videos using Dark Channel Approach and Guided Filtering

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Abstract— **Restoration of weather degraded videos, especially hazy videos is important in computer vision/graphics. A method for de hazing of videos using dark channel method along with the use of guided filter is proposed. On the hazy video first dark channel approach is applied for transmission estimation and then for better enhancement guided filter is applied. Guided filter rely on a guidance or reference image. It has a better filtering capability and fast running time and gives us a clear haze free video. The proposed method will successfully be applied to videos; hence we can use this algorithm in even real time video applications.**

Keywords—Guided filter, Dark channel, Transmission estimation, Haze removal, Video processing

I. INTRODUCTION

The images or videos taken in bad weather conditions may degraded due to the presence of the turbid medium (e.g., particles and water droplets) in the atmosphere. They reduce the visibility of the scenes and lower the reliability of outdoor surveillance systems. So in bad weather the effect of such phenomenon needs to be removed, to recover clear haze free images or videos. Therefore, removing haze from frames of hazy videos is an important and widely demanded topic in computer vision and computer graphics areas. For this purpose we propose the method with, dark channel [2] calculation combined with guided filtering. In this method first the hazy video is divided into frames. The number of frames depends on the size of the video. Then each frame can be considered as similar to a single hazy image, and on each of those hazy images our method is applied.

Considering the case of hazy and haze free images; in haze free images, in almost all small image blocks of any of the color (RGB) channels, there may be some pixels that have very low intensity, approximate to zero. These dark pixels can be due to shadows, colourfulness, geometry, or other factors.While taking the same hazy image, the intensity of such pixels in that channel is mainly contributed by atmospheric light. Therefore by combining this dark channel[2] approach with an image model we can calculate the amount of transmission (amount of light reaches camera without attenuation divided by the amount of light reflected from the scene point) and recover haze free image. The clarity of haze free image can be enhanced by removing noise from image by using filters. Here we are using a guided filter. Guided filter works with a reference or guidance image. Here we are using initial haze free image, obtained from dark channel method as our input image and an image model as guidance image. It results in a better haze free image. By applying this method repeatedly on each frame in hazy video, we get all frames as haze free and finally combining these haze free frames we get our final haze free video.

Most of the de hazing methods proposed so far are for individual images. But many photographic and real-time videos also need to be de hazed. So, the method proposed here plays a good role in such applications. Fig. 1 shows an representationof such a video dehazing.
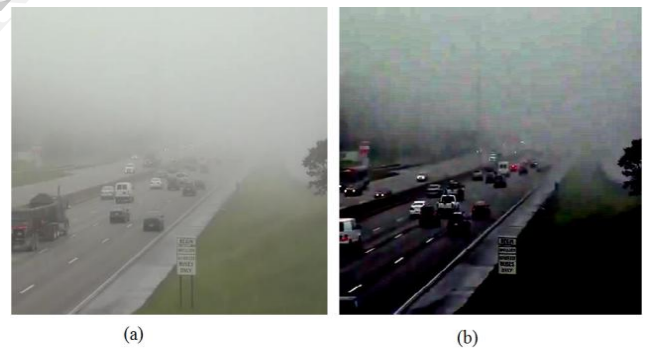

Fig. 1: (a) Hazy video (b)Haze free video

With the target of haze removal, multiple image haze removal methods are first introduced. In the multiple image haze removal method take two or more images of the same scene. This strategy increases the number of known variables, at the same time it brings more unknown so special settings must be needed to avoid too many unknown being introduced. The dichromatic method[7], takes multiple images of the same scene, under different atmospheric conditions . The main problem of this method is that weather may remain unchanged in several minutes or even hours. Polarization based method[8] is another multiple image haze removal technique. Its main problem is its settings that is, Capturing two strictly aligned polarized images is trouble.. To overcome the limitation of multiple image haze removal another strategy, single image haze removal[1,2,6] introduced. It is based on some assumption or knowledge. This strategy become more

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popular since, it requires only one image. Besides of quality and speed our new method, combining dark channel with guided filtering [9,10,11] in video dehazing is introduced. So, it is practically applicable to real time video applications.

II.   BASIC METHODS

Here we explain how our proposed method works. We know video can divided into frames and each frame is equivalent to a single image. So our hazy video is first divided into hazy frames and upon each such frame our method for haze removal is applied to obtain haze free frames. Finally by combining all these frames a haze free video is obtained.

In our proposed haze removal method each frame undergoes two phases; transmission estimation and guided filtering[9,10,11]. It is depicted in fig. 2.
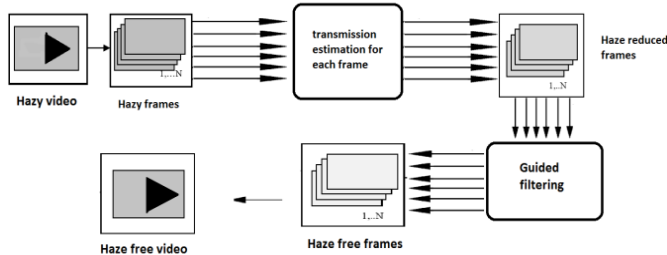

Fig 2 : General overview of proposed method

The method need to apply on each frame is explained in detail below:

A. Haze image equation

Degraded hazy image can be defined by the following equation:

$$I(x) = J(x)t(x) + A(1-t(x))\qquad(1)$$

Where I(x) is an observed intensity, J(x) is the actual intensity reflected from the scene point, t(x) transmission or transparency [6] of haze and A denotes the atmospheric light [1].

B. Atmospheric light

Atmospheric light[1] is considered as the color of   the atmosphere, horizon or sky. The dark channel of a hazy image can be calculated as follows:

$$Dark\,channel\,(x) = \min_{c\in\{r,g,b\}}(\min_{y\in\Omega(x)} I^c(y))\qquad(2)$$

Where I^c color hazy input image, $\Omega(x)$ is local patch centered at x.

The most brightest local region of a dark channel is considered as atmospheric light, since it appears as most opaque. In haze free image, most of the local area, which do not cover sky has very low intensity value in at least one of the color channel red, green and blue. Since the most opaque region gives the estimation of atmospheric light, region that

has the high value in the dark channel is taken as the constant atmospheric light . while taking the concept of dark channel it is clear that in almost all local region which do not cover sky has very low intensity value and its tends zero. Therefore dark channel of image J becomes zero:

$$J \longrightarrow 0\qquad(3)$$

C. Transmission Estimation

Transmission is the part of light reaches camera without attenuation from the part of light reflected from the scene point. Since it is a fraction its, value ranges between 0 and 1. The value of 0 means its completely haze and nontransparent, 1 means no haze and completely clear, value in between 0 and 1 means semitransparent. Using the above described equations 1 and 3 and by above calculated A^c we can easily estimate the transmission value as follows; normalize haze image equation 1 by A^c:

$$\frac{I^c(x)}{A^c} = t(x)\frac{J^c(x)}{A^c} + 1 - t(x)\qquad(4)$$

Applying dark channel method on the above equation 4, then it becomes:

$$Dark\,channel\left(\frac{I^c(x)}{A^c}\right) = Dark\,channel\left(\frac{J^c(x)}{A^c}\right)t(x) + (1-t(x))\quad(5)$$

By equating equation 3, on equation 4 it will give final transmission estimation [2] as follows:

$$t(x) = 1 - w * Dark\,channel\left(\frac{I^c(x)}{A^c}\right)\qquad(6)$$

We can optionally introduce a constant parameter $w(0 < w \le 1)$, its value depends on the application to keep a very small amount of haze since if we remove the haze thoroughly, the image may seem unnatural.

D. Haze Free Image

From the above calculated parameters actual image intensity J can be calculated as:

$$J(x) = \left(\frac{I^c(x) - A^c}{t(x)}\right) + A^c\qquad(7)$$

E. Guided Filtering

On the above obtained haze free image J, apply an image filter here. We are using a guided filter so we get a better restored image. Let q be the output of guided filtering that is our required restored image, and I and J be the two images used for filtering. Guided filtering works on input image I under the guidance of another reference image J. Here we are taking initial hazy image I as input image that is filtered under the guidance of image J, that is obtained as the haze free image in above section. Based on the application both input image and guidance image[9] can be same.

The output image can be represented as a linear transform of guidance image J as:

$$q_i = a_k J_i + b_k \, , \, i \in w_k \qquad (8)$$

Here (a_k, b_k) are linear coefficients assumed to be constant in window w_k, considering square window of radius r. We model the q by subtracting noise components n from p by:

$$q_i = I_i - n_i \qquad (9)$$

We aim a solution that minimizes the difference between q and p and at the same time maintaining linear model. So our needs is to minimize the following cost function:

$$E(a_k, b_k) = \sum_{i \in w_k} (a_k J_i + b_k - I_i)^2 + \in a_k^2 \qquad (10)$$

Here, $\in$ is a regularization parameter avoiding large a_k.

Its solution is given by the appropriate calculation of a_k and b_k as follows:

$$a_k = \frac{1}{\sigma_k^2 + \in} \frac{1}{|w|} \sum_{i \in w_k} J_i I_i - \mu_k \overline{p_k} \qquad (11)$$

$$b_k = \overline{p_k} - a_k \mu_k \qquad (12)$$

Here, μ_k and σ_k^2 are the mean and variance of J in window w_k ; $|w|$ is the number of pixels in the window w_k. On averaging final filtering output is given by:

$$q_i = \overline{a_i} J_i + \overline{b_i} \qquad (13)$$

Here, $\overline{a_i} = \frac{1}{|w|} \sum_{k \in w_k} a_k$ and $\overline{b_i} = \frac{1}{|w|} \sum_{k \in w_k} b_k$

The above discussed guided filtering process can be concluded in the following steps:

Algorithm
Input: filtering input image I, guidance image J, regularization ε, radius r.
Output: filtering output q

1.a) Calculate mean value of guidance image J

$$mean_J = \frac{1}{|w|} \sum_{i \in w_k} J_i$$

b) Calculate mean value of input image I

$$mean_I = \frac{1}{|w|} \sum_{i \in w_k} I_i$$

c) Calculate correlation of guidance image J

$$corr_J = \frac{1}{|w|} \sum_{i \in w_k} (J_i .* J_i)$$

d) Calculate correlation of input image I and guidance image J

$$corr_{IJ} = \frac{1}{|w|} \sum_{i \in w_k} (I_i .* J_i)$$

2.a) Calculate variance of guidance image J
$$var_J = corr_J - mean_J .* mean_J$$

b) Calculate the covariance between input image I and Guidance image J
$$cov_{IJ} = corr_{IJ} - mean_I .* mean_J$$

3.Calculate the parameters a and b
$$a_k = cov_{IJ} ./ (var_J + \in)$$

$$b_K = mean_I - a_k .* mean_J$$

4.Calculate mean of a and b

a) $$mean_a = \frac{1}{|w|} \sum_{k \in w_i} a_k$$

b) $$mean_b = \frac{1}{|w|} \sum_{k \in w_i} b_k$$

5.Final filtering output q

$$q = mean_a .* J + mean_b$$

From the above all operations, we will got a collection of haze free frames , that is, the frames obtained from the hazy video are turned to haze free and clear frames. By combining all those frames back we get final video as haze free one.

III. RESULTS AND DISCUSSION

In this section, we are discussing about the experimental results and its comparison with various methods. The fig. 3 shows input hazy image and its dark channel obtained. From

the dark channel the most opaque region is taken as atmospheric light. From which we can easily estimate transmission and recover haze free image.
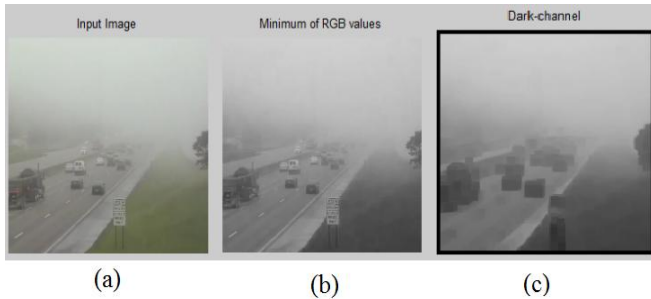

Fig. 3: (a)Input hazy image   (b)minimum of RGB valued (c) Dark channel

The difference of hazy and haze free image can be cleared by its appearance. That is, haze free images are more cleared haze are removed. So, it can be used in various applications. Such a hazy and haze free image is shown in fig. 4.

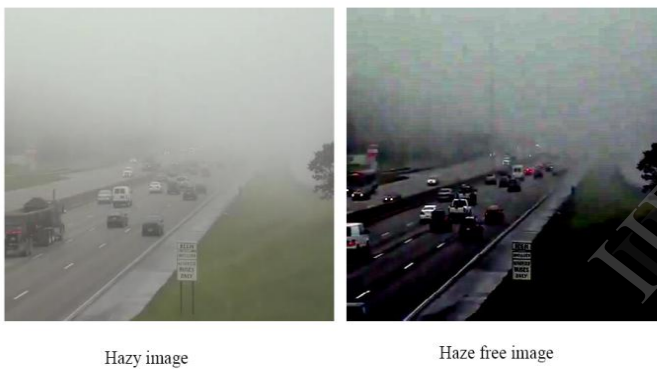Hazy image   Haze free image

Fig. 5. Shows, the output obtained by various filters such as imfilter, hybrid median filter and guided filter when applied on our hazy image. They show the improvement by various filters. The input hazy image becomes clearer by the effect of each filter, and the effects by different filters are different. The differences in effect can be analyzed by its appearance and also by visibility metric value. Analysis of visibility metric values are shown in table also:

Fig. 5: Haze free image of different filters

Table 1: comparison of visibility Metric value for different methods

Methods	Visibility Metric Value
Previous method	17.9988
HM filter	21.9353
IM filter	20.3109
Guided filter	30.3657

From the table 1 and from fig. 4 it is clear that the guided filter has higher visibility value so, it provides better enhancement and results. Due to its better enhancing property, guided filter is combined with dark channel method for video dehazing. The resultant dehazed video representation is given in fig. 6.
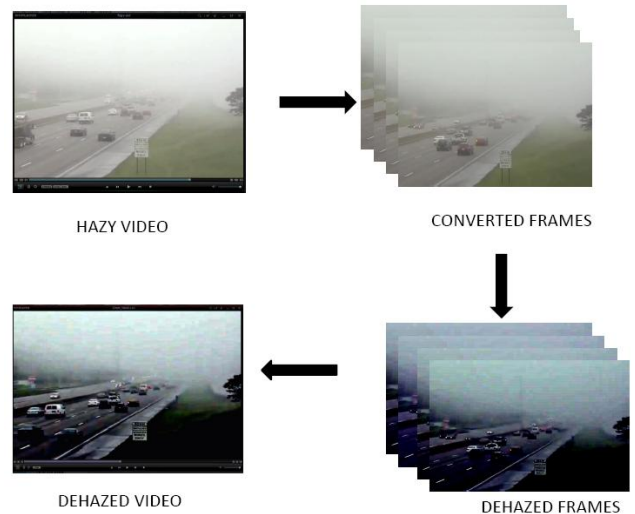

HAZY VIDEO   CONVERTED FRAMES

DEHAZED VIDEO   DEHAZED FRAMES

Fig. 6: Dehazing Video

IV. CONCLUSION

This paper proposed a method for dehazing video. This method have better advantages over existing methods. Existing methods mainly focus on image dehazing . But here our proposed method explaines how can we perform video dehazing.

In addition to the video dehazing mainly highlighted in this paper, it shows the quality of restored image using Visibility Metric Value. For better enhancement, we use guided filter in this method. From other existing filters it has better restoration capacity(better noise removal) and requires only less computational time. So, our proposed method provides better restoration in hazy video.

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