

Efficient Image Processing for Increased Resolution and Color Correctness of CMOS Image Sensors

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Abstract. This paper describes fast demosaicing methods to quadruple the resolution of a CMOS camera. The resulting increase in accuracy in camera calibration and object detection is important for local vision robots, especially those that use computer vision as their only source of information about the state of the world. The paper describes two methods for demosaicing: interpolation and variance demosaicing. A comparison of three sample views is shown to demonstrate the increased resolution and the difference between the interpolation and variance demosaicing methods. Both demosaicing methods work well. Variance demosaicing performs better around edges in the image, but is computationally more expensive.

1 Introduction

This paper presents demosaicing, a well known technique in digital cameras and investigates its application to problem of computer vision in real-time, real world robotics. Demosaicing quadruples the resolution of CMOS sensors based on the Bayer pattern [1]. This increase in resolution leads to more accuracy in determining the camera calibration and feature locations. For example, the distance to the ball and the angle to the goal can be computed more accurately.

Given the limited amount of processing power available on most robotic platforms and the harsh constraints of the real world, the extra amount of memory required and the additional computational overhead is of interest. Both of these issues are investigated for the two described algorithms.

Section 2 gives a brief introduction into the geometry of a CMOS camera and the Bayer pattern that is most commonly used. Section 3 introduces demosaicing and presents two demosaicing methods: interpolated demosaicing and variance demosaicing. Conclusions are given in section 4.

2 CMOS Camera Hardware

This section describes the actual hardware that is used in most CMOS image sensors. The CMOS sensor is able to measure the intensity of incoming light only. Therefore, a color CMOS sensor uses at least three different image sensors to measure the brightness of the color signals: one red filter, one green filter, and one blue filter.

However, since multiples of three are awkward to manufacture, a common way of manufacturing a CMOS sensor is the so-called “Bayer” pattern. This pattern uses four image sensors as shown in Fig. 1.

R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B
R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B
R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B

Fig. 1. Bayer Pattern as used in CMOS Image Sensors. R, G, and B indicate a red, green, and blue filter sensor element.

It can easily be seen that for a single position only, a single color channel is available. That is pixel (0,0) can only measure the red channel of the signal. The sensor data needs to be further processed to create a RGB color image.

A standard method is to create a single color pixel from four adjacent image sensors. One problem is that there are two image sensors with green information. To speed up the processing, most systems simply discard one channel of green information. Another possibility is to use the average of the two green channels as green value for the pixel. Figure 2 is a graphical illustration of the algorithm used. In this example, a 164 by 124 image sensor produces a 82 by 62 image.

This is the standard method used by the CMOS cameras used by the Eyebot controllers, which are used in the 4 Stooges RoboCup team. A sample images obtained with this method is shown as original image in Fig. 4.

The obvious disadvantage of this method is that information is lost in the conversion process. The position of the pixel segments is not taken into consideration, and the resolution of the resulting image is only a quarter of that of the resolution of the CMOS sensor.

3 Demosaicing

The idea is to infer the missing values for the color information of all pixels by using information about adjacent or near-by pixels. This process is called demosaicing. Figure 3 is a graphical illustration of the main idea.

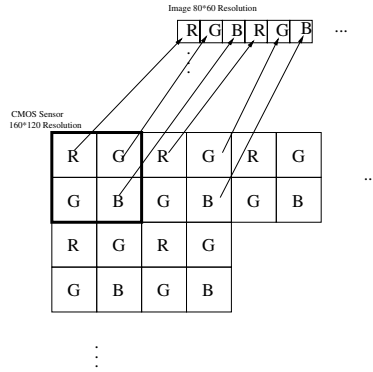


Fig. 2. Standard Processing of CMOS Sensor Data

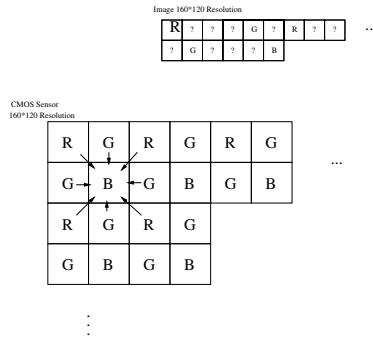


Fig. 3. Demosaicing of CMOS Sensor Data. Green and red information for the pixel (1,1) is inferred from neighboring pixels.

If we take the blue-filter image sensor at location (1,1) as an example, then we can see that the blue information at this pixel is known, but we do not know the values for the red and green channel. However, we do know the values of the red channel for four adjacent pixels and the values of the green channel for four other adjacent pixels.

Similarly the values for the green and blue channel are missing for red-filter sensor elements, and the green filter elements are missing the red and blue color information.

The process of inferring the missing color information is a topic often studied and well known in digital cameras [2,3].

3.1 Averaging

The simplest and fastest algorithm is a bilinear interpolation of the missing pixel values by averaging the values of adjacent pixels. It can be seen that for red and blue pixels four neighboring pixels are available to infer the missing color

information. For the green pixels, only two neighboring pixels are available for the red and blue color information.

This algorithm can be implemented by using three rows of pixels as temporary storage. The computational cost of this algorithm is not much more than the standard algorithm, but results in an image with four times the resolution.

The total cost of demosaicing is 8 Memory Read/Write + 6 Add/Sub + 2 Div/Mult operations per pixel. This algorithm was implemented and tested on the Eyebot controllers. On a 25 MHz 68332, the demosaicing routine took 170ms. This is about half the time required to read in the image. This means that the maximum frame rate of the video processing dropped from 15 to 10 frames per second.

A sample image is shown in Fig. 4. The images after interpolated demosaicing look quite natural and provide more information. More pixels are available to determine the center of the ball for example.

3.2 Variance Interpolation

A closer look at the output of interpolated demosaicing shows that it leads to blurring around the edges of objects. For example, the edges of the ball, the goal, or the track are blurred by this process.

To overcome this blurring, a more complex demosaicing algorithm, so called variance demosaicing is used to maintain the sharpness of edges. The main idea is to compute the amount of variance (that is the difference between this pixel and its neighboring pixels) and to assume that the variance is similar in all three color bands. So, if the current red pixel is much brighter than its neighboring pixels, then its green and blue channels are also increased. The algorithm is shown in Alg. 1. Algorithm 2 is used to compute the average brightness in the current color channel. In line 1, the difference between the current pixel and this average is computed. The missing color information (green and blue for a red pixel) is computed similarly to the interpolation algorithm. However, in lines 1 and 1, the computed difference is used to adjust these color values.

This algorithm requires more storage and more computation than the interpolation algorithm described in section. In fact, it requires temporary storage to hold five rows. Furthermore, the cost of computing the calcAverage is $4/1$ Memory Read/Write + 4 Add/Sub + 1 Div/Mult.

The average cost of computation for a pixel is 17 Memory Read/Write + 14 Add/Sub + 3 Div/Mult operations. In other words, this algorithm uses more than twice the number of memory accesses and add operations than the previously shown one. This result was verified by timing the implementation of both algorithms, where the variance demosaicing algorithm took sufficiently more time than interpolated demosaicing.

Some sample images with the output of the variance demosaicing algorithm are shown in Fig. 4. The images after variance demosaicing show that the edges around the ball, the cup, and the track are much clearer and not blurred.

Algorithm 1 Variance Algorithm for Demosaicing

```

1: for  $i=0$  to Height do
2:   for  $j=0$  to Width do
3:     if  $(i \bmod 2 = 0)$  AND  $(j \bmod 2=0)$  then
4:       red = pixel[ $i,j$ ] { // Red Pixel }
5:       redAvg = calcAverage( $i,j$ ,red)
6:       redDiff = red - redAvg
7:       green = (pixel[ $i - 1,j$ ] + pixel[ $i,j - 1$ ] + pixel[ $i + 1,j$ ]
+ pixel[ $i,j + 1$ ])/4
8:       green = green + redDiff
9:       blue = (pixel[ $i - 1,j + 1$ ] + pixel[ $i - 1,j - 1$ ] + pixel[ $i + 1,j - 1$ ]
+ pixel[ $i + 1,j + 1$ ])/4
10:      blue = blue + blueDiff
11:    else if  $(i \bmod 2 = 0)$  AND  $(j \bmod 2=1)$  then
12:      green = pixel[ $i,j$ ] { // Green Pixel 1 }
13:      greenAvg = calcAverage( $i,j$ ,green)
14:      greenDiff = green - greenAvg
15:      red = (pixel[ $i,j - 1$ ] + pixel[ $i,j + 1$ ])/2
16:      red = red + greenDiff
17:      blue = (pixel[ $i - 1,j$ ] + pixel[ $i + 1,j$ ])/2
18:      blue = blue + greenDiff
19:    else if  $(i \bmod 2 = 1)$  AND  $j \bmod 2=0$  then
20:      {Similar to processing of Green Pixel 1}
21:      {and omitted here}
22:    else if  $(i \bmod 2 = 1)$  AND  $j \bmod 2=1$  then
23:      {Similar to processing of Red Pixel}
24:      {and omitted here}
25:    end if
26:    image[ $i,j$ ] = (red, green, blue);
27:  end for
28: end for

```

Algorithm 2 calcAverage(x,y,c)

```

1: avg = (pixel[ $i - 2,j$ ] + pixel[ $i + 2,j$ ] + pixel[ $i,j - 2$ ]
+ pixel[ $i,j + 2$ ])/4;
2: return avg

```

We also created difference images to highlight the differences between the interpolated and variance algorithm. As can be seen, the result of the algorithms are very similar and only around the edges are the outputs different.

4 Conclusion

This paper describes two algorithms for the demosaicing of color images: the interpolation and variance demosaicing algorithms. Both algorithms are easy to implement and perform well in practice.

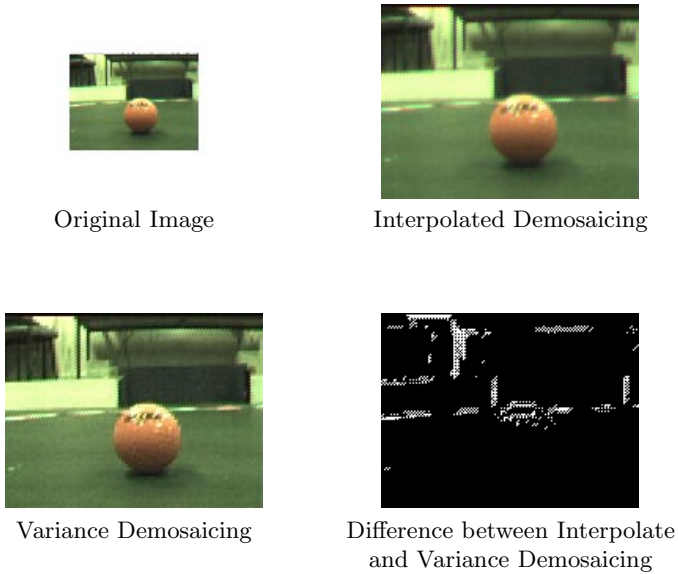


Fig. 4. Ball Scene: Comparison of the original image, the interpolate-demoaised image, and the variance-demoaised image. The difference between these two methods is also shown.

An empirical evaluation showed that the interpolation algorithm results in blurring around the edges and that the variance algorithm can overcome this problem.

However, the paper also showed that the computational cost of the variance algorithm is significantly more than that of interpolated demosaicing.

This trade-off depends then on the required accuracy of image features as well as the available processing power. We currently use only interpolated demosaicing in our Eyebot controllers, which allows us to maintain a framerate of 10 frames per second.

References

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3. Tadashi Sakamoto. Software pixel interpolation for digital still cameras suitable for a 32-bit mcu. *IEEE Transactions on Consumer Electronics*, 44(4):1342–1352, November 1998.