

OpenCV Report 2

Robotics and Automation 282 762

Marc Alexander Sferrazza
12164165 *†

May 15, 2017



Abstract

A brief report on OpenCV object and colour detection. Each step was tested and an out image saved to the local folder when running the program to ensure a best rendered results, and easy debugging; these results can be tuned with the given functions in the program.

*This work was not supported by any organization

†Faculty of Mechatronics Engineering, Massey University, Albany, Auckland, New Zealand Progress of project:
<https://github.com/alex1v1a/Robotics-and-Automation/>

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1 INTRODUCTION

OpenCV (Open Source Computer Vision Library) is an open source machine learning library for visual components. It has been widely accepted as one of the worlds most used image processing tools, and has the capability of static and dynamic comprehension. Some of the basic features available in OpenCV are capable mapping environments to be used in demonstration such as self driving cars lane detection.

The process in this project to achieve is to design a program in the Visual Studio environment, using the OpenCV library that will detect an objects location and colour, in this case, red, blue, and yellow tennis balls. OpenCV is a powerful tool for image processing with more then 2500 algorithms available in its library; by using several functions within the OpenCV library, a processed image will produce these values.

2 METHOD

An image has been provided of different colour tennis balls on a table. The process will involve filtering this image to a workable standard in which detection can be made of the circular objects and their respected colours.

As there are five images the option to run the process with all outputs was first made, but then the decision of what images to check was implemented using the case keys 1, 2, 3, 4, 5, esc - A prompt will be given to the user to select which image to process and find the balls with their colours; the user can cycle back to the main image selection and select another image to process. The program can be closed by selecting the esc key from the prompt menu. The image is then loaded to memory and with each step through the detection the image is saved for easy debugging.

After the user has selected a desired image to process the location function is called to preform the action. The sequence begins with the original image as shown below (set one from the five images are used for demo purposes in this report)



Figure 1: Original Image

A full break down of the process has been attached and can be found in the code in the appendix. The following code is the process for user input and the function call for location.

```

int main() {
    cout << "Choose an image to locate the tennis ball: 1, 2, 3, 4, 5...\n\
        npress esc to quit\n\n
        \
        n" << endl;
    while (1) {
        namedWindow("User_Select", CV_WINDOW_AUTOSIZE);
        switch (waitKey(0)) {
            case 27: // Exit prompt "esc"
                return 0;
            case 49: // Image 1 selected
                setpoint = 1;
                name = "1.jpg";
                location();
                break;
            case 50: // Image 2 selected
                setpoint = 2;
                name = "2.jpg";
                location();
                break;
            case 51: // Image 3 selected
                setpoint = 3;
                name = "3.jpg";
                location();
                break;
            case 52: // Image 4 selected
                setpoint = 4;
                name = "4.jpg";
                location();
                break;
            case 53: // Image 5 selected
                setpoint = 5;
                name = "5.jpg";
                location();
                break;
        }
    }
    return 0;
}

```

2.1 BGR to HSV conversion

After the location function has been called, the image is read into memory and resized for processing. The aspect ratio of the first image was different then the others so it has been scaled accordingly. Complications arose from background colours when a ball was near another similar colour object such as the ice cream container, cup and exercise book, which is why the range needed to be limited.

In order to make the process more definite a conversion to HSV is necessary, this will make the process more robust by converting a BGR; The 8 bit 3 colour channel is converted to the hue, saturation and value which can be analysed more specifically easier in the provided functions. The HSV conversion is ready to begin, using the `cvtColor` function to convert the image to HSV (BGR2HSV) will help in the detection processing; the image is then saved for debugging.

```
// Read the image to memory and resize
image = imread(name);
if (setpoint != 1) {
    resize(image, image, Size(), 0.3, 0.3);
}
// Note that the aspect ratio of image 1 is significantly different than
// the others, these values provide better results
else if (setpoint = 1) {
    resize(image, image, Size(), 0.5, 0.5);
}

// Copy original image for end results edit
imageFinal = image;

// Step 1, Convert BGR to HSV
cvtColor(image, hsv, COLOR_BGR2HSV);

// After conversion save for reference
//imshow("HSV", hsv); //Debugging feature
nameh << namehsv << setpoint << ".jpg";
imwrite(nameh.str(), hsv);
```

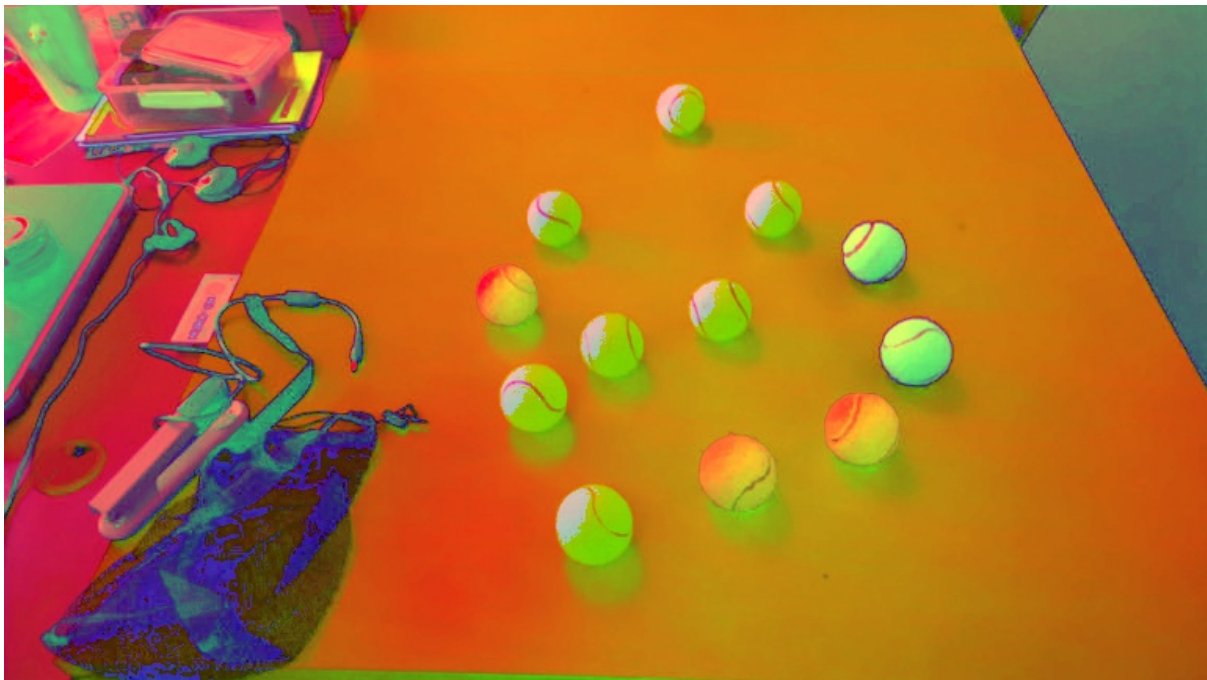


Figure 2: BGR to HSV conversion

2.2 Thresholding

When calculating the threshold, the range is found from the HSV image checking with 2 pass through arrays. The output will be a binary and help in detecting the edges of each ball like the first assignment with the canny function. As HSV has a specific range it is easily identifiable in each part however the image hue range (0-179) and saturation, value (0-255) may adjust with respect to lighting and depth, surrounding variables and factors to consider such as reflections and so on.

The array values given are scalar and are formed from the colours horizontal, vertical and scale values; when the range is found it writes to the output colour respectively then is added together and assigned to the image thres. Choosing only the selected colours we want from the image, yellow, red and blue; bearing in mind the hsv format of the image is the key step for this.

The range and effected variables are difficult to establish, and while the paint colour detection tool is a standard feature on most computers nowadays it is not a practical method to address this solution; Luckily OpenCV provides a method to adjust these control levels to help find the limits for each image without too much fuss.

When performing the tasks on each image the values may differ, therefore a multi-dimensional array has been set up to handle processing values for each image, making it simpler to process all the images in a more dynamic sense, these have been called through in different parts beginning here as the r-values. The rval's are read into each set of numeracies for the specific image when the location function is called, depending on what Image was chosen the corresponding pre-determined values are used. These have been found by using create trackers to measure the best values for high and low thresholds, hsv values, etc.

After the limits are found for the hsv for the tennis balls, the range limits are then set for thresholding. After each range has been completed the image will only show for that selected hsv value, so after finding the yellow, blue, and red ranges for the balls the image is merged to one range image with all there values; as the only known function to do this takes 2 arrays at a time the values are added twice.

```
// Step 2, Thresholding
// Check to find if arrays are in range
Mat blue , red , yellow;
inRange(hsv , Scalar(bHzLo, BSLow, bVrLo) , Scalar(bHzHi, bScHi, bVrHi) ,
        blue);
inRange(hsv , Scalar(rHzLo, RSLow, rVrLo) , Scalar(rHzHi, rScHi, rVrHi) ,
        red);
inRange(hsv , Scalar(yHzLo, yScLo, yVrLo) , Scalar(yHzHi, yScHi, yVrHi) ,
        yellow);

// Calculate the sum for 2 arrays twice
add(blue , red , thres);
add(thres , yellow , thres);

// After thresholding save for reference
//imshow("Thresholding", thres); //Debugging feature
namet << namethres << setpoint << ".jpg";
imwrite(namet.str() , thres);
```



Figure 3: The process effect of thresholding

2.3 Dilation & Erosion

Using the dilation function the image begins to form more solid shapes and removes discrepancies to better form solid filled in shapes, by adding pixels to the boundaries found of objects and shapes in a greyscale image. The erosion function then emphasises those shapes making it easier for the shape identifier later on by removing pixels from the boundaries of objects. The best values found for the size of the morphological operations are as shown below.

```
// Step 3, Dilation and erosion used for multi level channel processing
dilate(thres , dilation , getStructuringElement(MORPH_ELLIPSE, Size(11, 11)
));
erode(dilation , erosion , getStructuringElement(MORPH_ELLIPSE, Size(3, 3)
));

// After dilation save for reference
//imshow("Dilation", dilation); //Debugging feature
named << namedilation << setpoint << ".jpg";
imwrite(named.str() , dilation);

// After erosion save for reference
//imshow("Erosion", erosion); //Debugging feature
namee << nameerosion << setpoint << ".jpg";
imwrite(namee.str() , erosion);
```

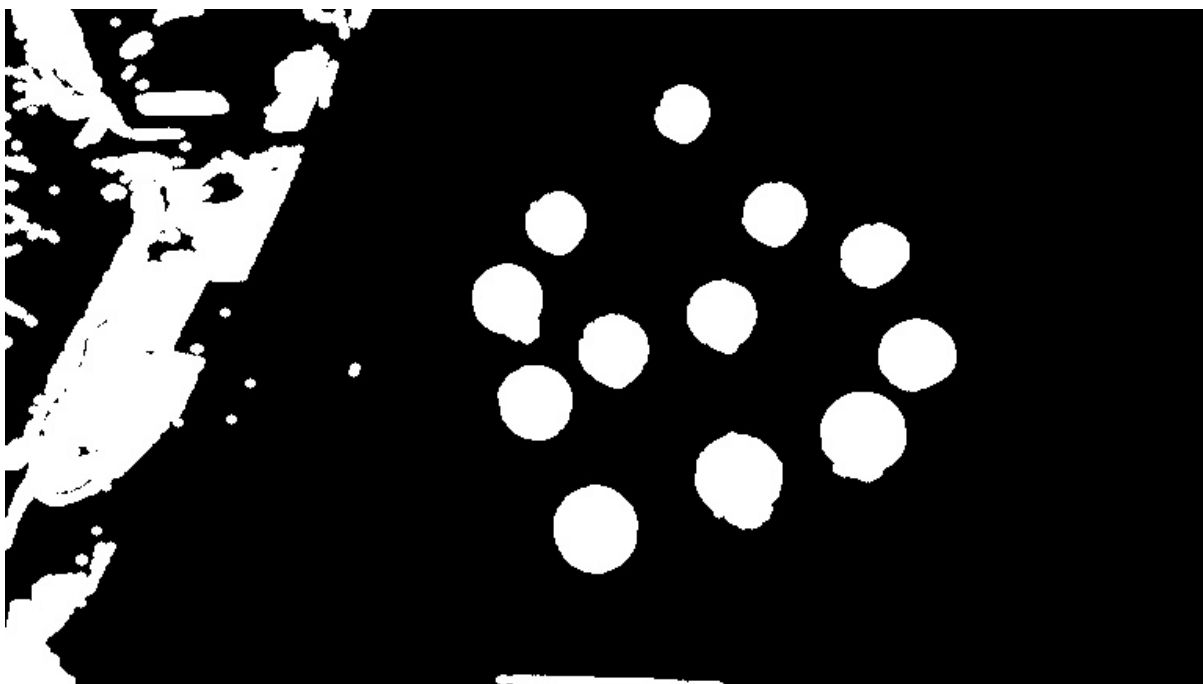


Figure 4: The process effect of dilation

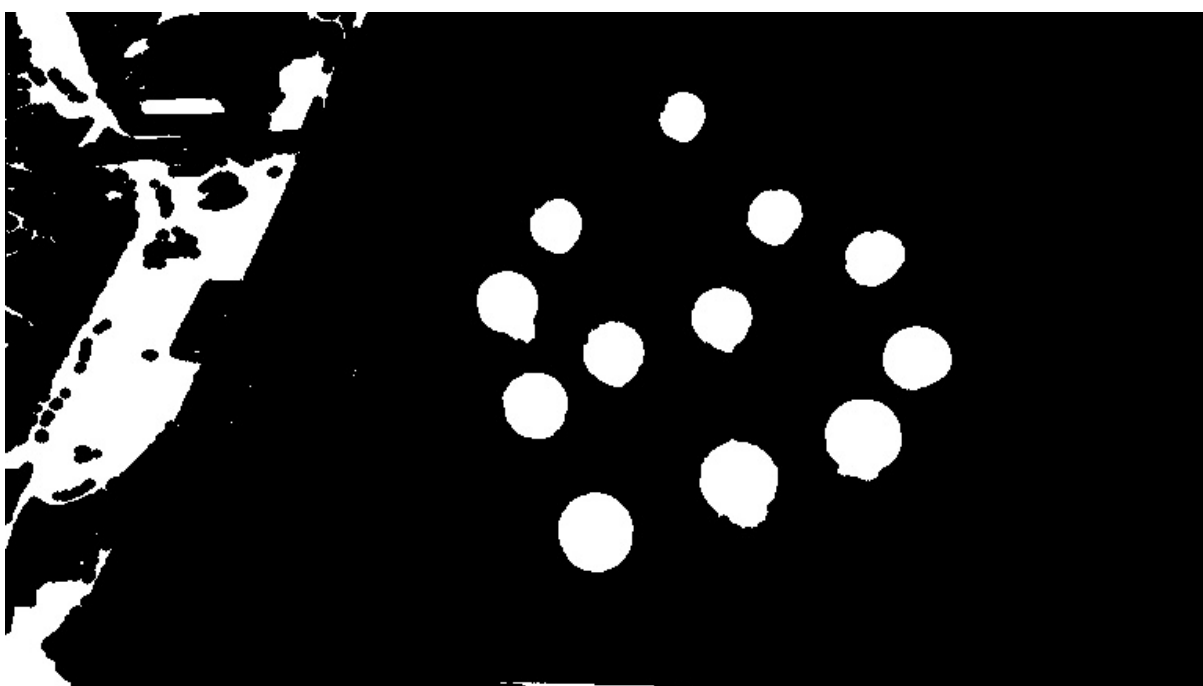


Figure 5: The process effect of erosion

2.4 Gaussian Blur

The Gaussian blur is used to reduce the noise of the image and smoothing the edges to help eliminate any external influences when finding the shape and give a more accurate average of the pixels. The function will transform the image using convolution matrix Gaussian kernel, and will give a result based on each pixel and it's surrounding pixels to contour and blur while maintaining the edges integrity.

After the Gaussian process, the image is finally ready to be searched and labeled. The best values for the Gaussian have found to be a 7x7 kernel matrix with a 2.5 standard deviation. The image is saved for reference and then assigned to a new image for final searching and editing.

```
// Step 4, Preform Gaussian blur to further filter image and reduce noise  
to better detect the around point for the circles  
GaussianBlur(erosion , blur , Size(7, 7) , 2.5 , 2.5);  
  
// After Gaussian blur save for reference  
//imshow("Gaussian Blur", blur); //Debugging feature  
nameb << nameblur << setpoint << ".jpg";  
imwrite(nameb.str() , blur);
```

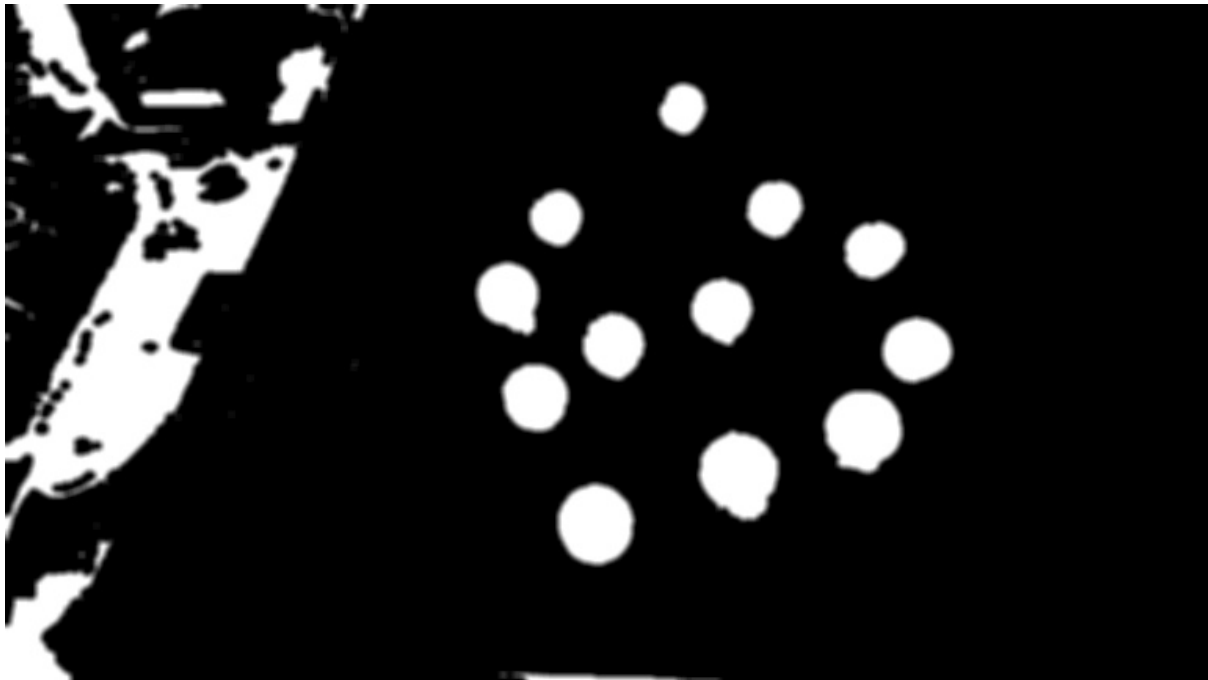


Figure 6: Noise reduction with Gaussian Blur

2.5 Hough Circles and Region of Interest

Using the HoughCircles function to properly identify the tennis ball radius and thus the position of the center points of each tennis ball. Originally the Blob function was used, however the Hough method gave better results as the edges were detected pixel by pixel around the edge of each ball. The Hough algorithm works by voting on the shapes found with the parameters space local maxima to find certain shapes, in this case a circle thus HoughCircles. The pass through variables to the function for any image is given as an 8 bit single channel (greyscale), an output 3 element float vector with position and radius, the inverse ratio of the accumulator resolution to image resolution for this example being half. The minimum distance between each circle which changes depending on the image, the high and low threshold values typically being scaled by 3 from each other with the lower being more sensitive to edges and in turn allowing more detection of possible shapes; the final parameters are the minimum and maximum circle radius.

Complications arose from background colours when a ball was near another similar colour object such as the ice cream container, cup and exercise book. The problem was looked at but a solution for distinguishing these objects from one another could not be established without partial circle, or more specific shadow filtering with correct proportion size. There is lots of noise on the left of the image due to some regions and the similar colours or threshold values, unfortunately it is unable to automatically ignore this sector so to simply cut it out the region of interest is set so only the tennis balls in this sector (the table) are recognised.

A loop is then preformed to import the coordinates of the circles to location and colour matching, then the pixels are averaged from the surrounding pixels to assess the correct colour of each ball to match the colour to the positions.

```
// Step 5, Using the HoughCircles function to identify the tennis ball
radius
// Originally used the Blob function however this method gave better
results
HoughCircles(readyImage, ball, CV_HOUGH_GRADIENT, 2, dis, hThres, lThres,
minRad, maxRad);
for (size_t k = 0; k < ball.size(); k++) {
    Point center(cvRound(ball[k][0]), cvRound(ball[k][1]));
    // Establish and mark the center points
    int y = center.y, x = center.x;

    // Step 6, Meeting the criteria for the region of interest, ignore rest
    if ((roiXmin < x) && (x < roiXmax) && (roiYmin < y) && (y < roiYmax)) {
        for (int m = x - 5; m < x + 5; m++) {
            for (int n = y - 5; n < y + 5; n++) {
                Vec3b colorr = imageFinal.at<Vec3b>(n, m);
                meanr.val[0] = (colorr.val[0] + meanr.val[0]) / 2;
                meanr.val[1] = (colorr.val[1] + meanr.val[1]) / 2;
                meanr.val[2] = (colorr.val[2] + meanr.val[2]) / 2;
            }
        }
    }
}
```

2.6 Labelling the targets found

After looping through and finding all positions and colours the tennis balls are now ready for labelling. The `putText` and `circle` functions are used to briefly label each tennis balls center point, outer path and defined colour red, yellow, or blue. The coordinates are stored with the `vec3f` for reference so that only the colour referencing needs access to write the placements. Due to the enclosing area having breaks the average area of the ball is counted for the placement only, this means it will ignore then lines on the ball and take the basic shape.

The comparisons are made and the image is colour matched correctly with corresponding colours and locations, then the default drawing function is used to draw a circle enclosing the ball. The colours enclosing and text will match each tennis ball.

```
// Step 7, Font formatting and placement, standard fonts originating
// from center point of each ball
// Marking of each ball with center points
int font = FONT_HERSHEY_SIMPLEX, thick = 1;
float scale = 0.5;
Point org(x, y);
string colour;

int radius = int(ball[k][2]);
if ((meanr.val[0] > b1 && meanr.val[1] < b2 && meanr.val[2] < b3)
    || (meanr.val[0] == 1 && meanr.val[1] == 252 && meanr.val[2] ==
        251)) {
    // Label each target found
    colour = "Blue";
    putText(imageFinal, colour, org, font, scale, Scalar(255, 0, 0),
            thick, 5);
    // Highlight each target with designating colour and mark the
    // center points
    circle(imageFinal, center, radius, Scalar(255, 0, 0), 0, 5, 0);
    circle(imageFinal, center, 3, Scalar(255, 0, 0), 0, 5, 0);
}
if (meanr.val[0] < y1 && meanr.val[1] > y2 && meanr.val[2] > y3
    && (meanr.val[0] != 1 && meanr.val[1] != 252 && meanr.val[2] !=
        251)) {
    // Label each target found
    colour = "Yellow";
    putText(imageFinal, colour, org, font, scale, Scalar(0, 255, 255),
            thick, 5);
    // Highlight each target with designating colour and mark the
    // center points
    circle(imageFinal, center, radius, Scalar(0, 255, 255), 0, 5, 0);
    circle(imageFinal, center, 3, Scalar(0, 255, 255), 0, 5, 0);
}
if (meanr.val[0] < r1 && meanr.val[1] < r2 && meanr.val[2] > r3) {
    // Label each target found
    colour = "Red";
    putText(imageFinal, colour, org, font, scale, Scalar(0, 0, 255),
            thick, 5);
    // Highlight each target with designating colour and mark the
    // center points
    circle(imageFinal, center, radius, Scalar(0, 0, 255), 0, 5, 0);
    circle(imageFinal, center, 3, Scalar(0, 0, 255), 0, 5, 0);
}
}
}
```

3 RESULTS

After the processing is complete the original image is displayed with the labels for each tennis ball found. The final result is shown below, the process is now successfully completed and the demonstration is complete. The user can now press any key to go back and select another image, or after closing the image hit the "esc" key to exit the program.

A sample of the results can be seen below.

```
cout << "Congradulations!_Processing_complete_here_are_the_tennis_balls_
      found_with_their_respected_colours!\n\npress_any_key_to_go_back_to_
      main_menu, _or_hit_esc_twice_to_quit\n\n
```

```
      n" << endl;
// Step 8, After processing and locating tennis balls and colours
      complete, display final results, and save for reference
namer << nameready << setpoint << ".jpg";
imwrite(namer.str(), imageFinal);
imshow(name, imageFinal);
// Wait for key press before returning to main menu
waitKey(0);
destroyAllWindows();
```

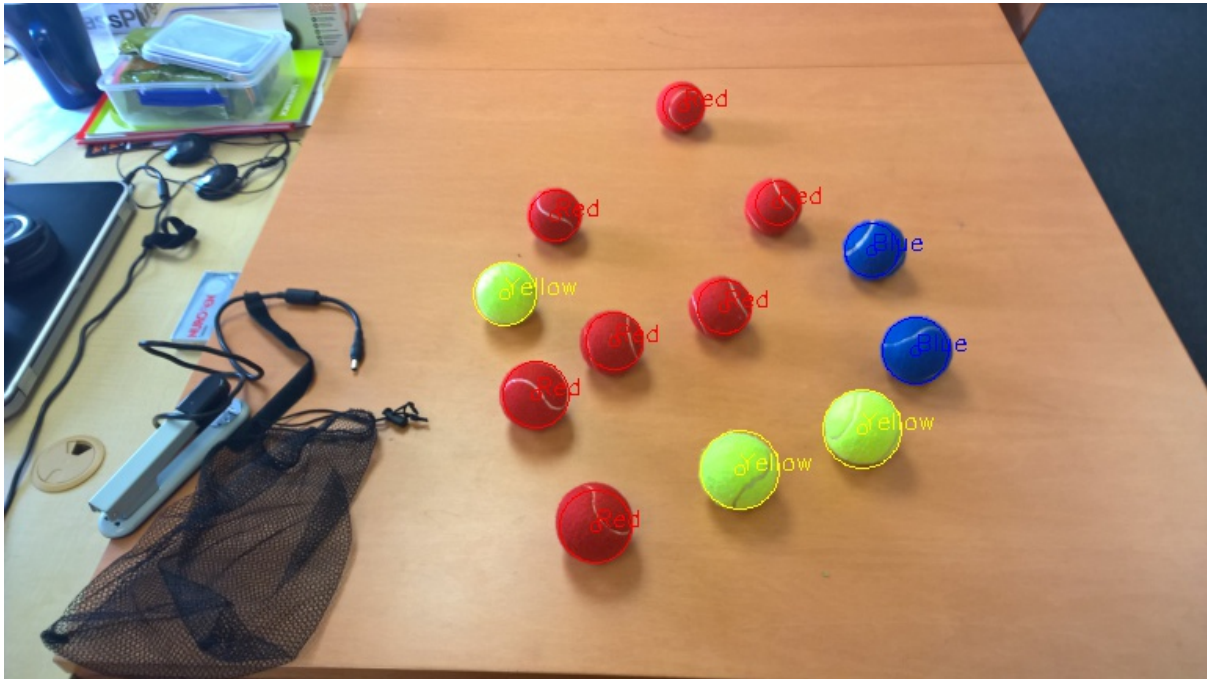


Figure 7: The final image is given with detected results

3.1 Fine Tuning

While the process is straight forward and consists of step by step operations, the procedure in which required fine tuning. This involves checking the matrix at different points like the threshold values, dilation and erosion, the Gaussian blur, as well as the HoughCircles and region of interest.

The specific values were fiddled with to find the best combination and then tested.

3.2 Testing

Ensure the target of finding the location of every tennis ball in each image is achieved, and that the colour of each ball is given.

Each step has an output image saved to check the processes respectively. The images are checked to make sure each stage is completing the task correctly, if not the code is then referred to and further revisions are made.

Every image was tested with the values for recognition and tweaked in the fine tuning process to get the best possible results.

3.3 Finalising

Making the program stable and concise, and as robust as possible builds for a good design. Checking over the functions and any redundant code, ensure a good user interface is easily workable and the outputs are all correct.

4 CONCLUSIONS

The final detection of the tennis balls has been produced from several steps. This method provides basic filtering similar to that from assignment one before the processing locations are to be found. The filtering is to provide more accurate and stable results, and the HoughCircles detection was found better than the Blob function when tested. There were still some discrepancies with the output when processing the tennis balls with similar colour backgrounds.

The object detection was a success in sense but limited to that of this projects constraints. To better match solutions in the real world further algorithms would need to be acquired that are higher in focus, resolution, and more adaptive with environmental features for dynamic or moving objects with changing scenery and backgrounds, or if the camera is moving also.

References

- [1] <http://docs.opencv.org/2.4/>, “Opencv resources,” 2015.
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- [4] M. C. Ramon, “Using opencv,” in *Inteltextregistered Galileo and Inteltextregistered Galileo Gen 2*, pp. 319–400, Springer, 2014.
- [5] A. E. Frascarelli, “Object detection for high productivity,” 3345, 2015.
- [6] H. Myint, P. Wong, L. Dooley, and A. Hopgood, “Tracking a table tennis ball for umpiring purposes,” in *Machine Vision Applications (MVA), 2015 14th IAPR International Conference on*, pp. 170–173, IEEE, 2015.
- [7] D. Budden, S. Fenn, J. Walker, and A. Mendes, “A novel approach to ball detection for humanoid robot soccer,” in *Australasian Joint Conference on Artificial Intelligence*, pp. 827–838, Springer, 2012.

APPENDIX

```
// Marc Alexander Sferrazza 12164165
// Referenceing from http://docs.opencv.org/2.4/
```

```
#include <opencv2\opencv.hpp>
#include <opencv2\core.hpp>
#include <opencv2\imgcodecs.hpp>
#include <opencv2\highgui.hpp>
#include <iostream>
#include <string>
#include <stdio.h>
#include <stdlib.h>
#include <sstream>

using namespace cv;
using namespace std;

void location();

int setpoint;
string name;

int main() {
    cout << "Choose an image to locate the tennis ball: 1, 2, 3, 4, 5... \n\
    npress esc to quit \n\n";
    n" << endl;
    while (1) {
        namedWindow("User_Select", CV_WINDOW_AUTOSIZE);
        switch (waitKey(0)) {
            case 27: // Exit prompt "esc"
                return 0;
            case 49: // Image 1 selected
                setpoint = 1;
                name = "1.jpg";
                location();
                break;
            case 50: // Image 2 selected
                setpoint = 2;
                name = "2.jpg";
                location();
                break;
            case 51: // Image 3 selected
                setpoint = 3;
                name = "3.jpg";
                location();
                break;
            case 52: // Image 4 selected
                setpoint = 4;
                name = "4.jpg";
                location();
                break;
            case 53: // Image 5 selected
                setpoint = 5;
                name = "5.jpg";
                location();
                break;
        }
    }
}
```

```

    }
}
return 0;
}

void location() {
    Mat image, hsv, thres, dilation, errosion, blur, readyImage, imageFinal;

    int yHzLo, yHzHi, yScLo, yScHi, yVrLo, yVrHi;
    int rHzLo, rHzHi, RSLow, rScHi, rVrLo, rVrHi;
    int bHzLo, bHzHi, BSLow, bScHi, bVrLo, bVrHi;
    int roiXmin, roiXmax, roiYmin, roiYmax;
    int r1, r2, r3, b1, b2, b3, y1, y2, y3;
    int hThres, lThres, dis, minRad, maxRad;

    // Naming the saved output files for reference
    ostringstream nameh, namet, named, namee, nameb, namer;
    string namehsv, namethres, namedilation, nameerrosion, nameblur,
        nameready;
    // Image save locations
    namehsv = "Output/1.HSV_Image_";
    namethres = "Output/2.Thresholding_Image_";
    namedilation = "Output/3.Dilation_Image_";
    nameerrosion = "Output/4.Errosion_Image_";
    nameblur = "Output/5.GaussianBlur_Image_";
    nameready = "Output/6.Final_Result_Image_";

    // Read the image to memory and resize
    image = imread(name);
    if (setpoint != 1) {
        resize(image, image, Size(), 0.3, 0.3);
    }
    // Note that the aspect ratio of image 1 is significantly different than
    the others, these values provide better results
    else if (setpoint = 1) {
        resize(image, image, Size(), 0.5, 0.5);
    }

    // Copy origional image for end results edit
    imageFinal = image;

    // Step 1, Convert BGR to HSV
    cvtColor(image, hsv, COLOR_BGR2HSV);

    // After conversion save for reference
    //imshow("HSV", hsv); //Debugging feature
    nameh << namehsv << setpoint << ".jpg";
    imwrite(nameh.str(), hsv);

    int rval[5][36] = {
        { 31, 0, 142, 60, 255, 255, 0, 186, 69, 179, 213, 255, 53, 206, 51,
          179, 255, 255, 300, 700, 50, 470, 100, 100, 100, 90, 50, 30, 100,
          100, 100, 150, 50, 30, 10, 40 },
        { 153, 148, 128, 179, 227, 255, 90, 121, 0, 114, 255, 255, 22, 63, 148,
          89, 198, 255, 260, 700, 170, 470, 110, 100, 100, 100, 130, 50, 140,
          180, 110, 150, 50, 30, 10, 40 },
        { 21, 142, 146, 43, 255, 255, 0, 148, 75, 7, 255, 255, 92, 178, 8, 150,
          255, 225, 260, 700, 50, 470, 50, 40, 70, 20, 30, 20, 10, 160, 160,

```

```

    126, 42, 30, 5, 40 },
    { 18, 194, 57, 35, 255, 255, 0, 190, 69, 6, 255, 255, 107, 176, 45,
      112, 255, 255, 260, 700, 50, 470, 60, 65, 67, 34, 85, 88, 100, 100,
      100, 82, 34, 30, 10, 40 },
    { 17, 190, 99, 49, 255, 255, 0, 144, 81, 8, 215, 190, 105, 168, 24,
      157, 255, 204, 260, 600, 170, 470, 100, 100, 100, 66, 70, 61, 100,
      100, 100, 100, 33, 30, 10, 40 }
};

int *propd[36] = {
    &yHzLo, &yScLo, &yVrLo, &yHzHi, &yScHi, &yVrHi,
    &rHzLo, &RSLow, &rVrLo, &rHzHi, &rScHi, &rVrHi,
    &bHzLo, &BSLow, &bVrLo, &bHzHi, &bScHi, &bVrHi,
    &roiXmin, &roiXmax, &roiYmin, &roiYmax,
    &r1, &r2, &r3, &b1, &b2, &b3, &y1, &y2, &y3,
    &hThres, &lThres, &dis, &minRad, &maxRad
};

// Set random numbers to the array
for (int k = 0; k < 36; k++) {
    *propd[k] = rval[setpoint - 1][k];
}

// Step 2, Thresholding
// Check to find if arrays are in range
Mat blue, red, yellow;
inRange(hsv, Scalar(bHzLo, BSLow, bVrLo), Scalar(bHzHi, bScHi, bVrHi),
    blue);
inRange(hsv, Scalar(rHzLo, RSLow, rVrLo), Scalar(rHzHi, rScHi, rVrHi),
    red);
inRange(hsv, Scalar(yHzLo, yScLo, yVrLo), Scalar(yHzHi, yScHi, yVrHi),
    yellow);

// Calculate the sum for 2 arrays twice
add(blue, red, thres);
add(thres, yellow, thres);

// After thresholding save for reference
//imshow("Thresholding", thres); //Debugging feature
namet << namethres << setpoint << ".jpg";
imwrite(namet.str(), thres);

// Step 3, Dilation and erosion used for multi level channel processing
dilate(thres, dilation, getStructuringElement(MORPH_ELLIPSE, Size(11, 11)
));
erode(dilation, erosion, getStructuringElement(MORPH_ELLIPSE, Size(3, 3)
));

// After dilation save for reference
//imshow("Dilation", dilation); //Debugging feature
named << namedilation << setpoint << ".jpg";
imwrite(named.str(), dilation);

// After erosion save for reference
//imshow("Erosion", erosion); //Debugging feature
namee << nameerosion << setpoint << ".jpg";
imwrite(namee.str(), erosion);

```



```

// Step 4, Perform Gaussian blur to further filter image and reduce noise
// to better detect the round point for the circles
GaussianBlur(errosion, blur, Size(7, 7), 2.5, 2.5);

// After Gaussian blur save for reference
//imshow("Gaussian Blur", blur); //Debugging feature
nameb << nameblur << setpoint << ".jpg";
imwrite(nameb.str(), blur);

// Assign the filtered image to readyImage for location processing
readyImage = blur;
vector<Vec3f> ball;
Vec3b meanr;

// Step 5, Using the HoughCircles function to identify the tennis ball
// radius
// Originally used the Blob function however this method gave better
// results
HoughCircles(readyImage, ball, CV_HOUGH_GRADIENT, 2, dis, hThres, lThres,
    minRad, maxRad);
for (size_t k = 0; k < ball.size(); k++) {
    Point center(cvRound(ball[k][0]), cvRound(ball[k][1]));
    // Establish and mark the center points
    int y = center.y, x = center.x;

    // Step 6, Meeting the criteria for the region of interest, ignore rest
    if ((roiXmin < x) && (x < roiXmax) && (roiYmin < y) && (y < roiYmax)) {
        for (int m = x - 5; m < x + 5; m++) {
            for (int n = y - 5; n < y + 5; n++) {
                Vec3b colorr = imageFinal.at<Vec3b>(n, m);
                meanr.val[0] = (colorr.val[0] + meanr.val[0]) / 2;
                meanr.val[1] = (colorr.val[1] + meanr.val[1]) / 2;
                meanr.val[2] = (colorr.val[2] + meanr.val[2]) / 2;
            }
        }

        // Step 7, Font formatting and placement, standard fonts originating
        // from center point of each ball
        // Marking of each ball with center points
        int font = FONT_HERSHEY_SIMPLEX, thick = 1;
        float scale = 0.5;
        Point org(x, y);
        string colour;

        int radius = int(ball[k][2]);
        if ((meanr.val[0] > b1 && meanr.val[1] < b2 && meanr.val[2] < b3)
            || (meanr.val[0] == 1 && meanr.val[1] == 252 && meanr.val[2] ==
                251)) {
            // Label each target found
            colour = "Blue";
            putText(imageFinal, colour, org, font, scale, Scalar(255, 0, 0),
                thick, 5);
            // Highlight each target with designating colour and mark the
            // center points
            circle(imageFinal, center, radius, Scalar(255, 0, 0), 1, 5, 0);
            circle(imageFinal, center, 3, Scalar(255, 0, 0), 1, 5, 0);
        }
        if (meanr.val[0] < y1 && meanr.val[1] > y2 && meanr.val[2] > y3

```

```

    && (meanr.val[0] != 1 && meanr.val[1] != 252 && meanr.val[2] !=
        251)) {
        // Label each target found
        colour = "Yellow";
        putText(imageFinal, colour, org, font, scale, Scalar(0, 255, 255),
            thick, 5);
        // Highlight each target with designating colour and mark the
            center points
        circle(imageFinal, center, radius, Scalar(0, 255, 255), 1, 5, 0);
        circle(imageFinal, center, 3, Scalar(0, 255, 255), 1, 5, 0);
    }
    if (meanr.val[0] < r1 && meanr.val[1] < r2 && meanr.val[2] > r3) {
        // Label each target found
        colour = "Red";
        putText(imageFinal, colour, org, font, scale, Scalar(0, 0, 255),
            thick, 5);
        // Highlight each target with designating colour and mark the
            center points
        circle(imageFinal, center, radius, Scalar(0, 0, 255), 1, 5, 0);
        circle(imageFinal, center, 3, Scalar(0, 0, 255), 1, 5, 0);
    }
}
}
cout << "Congradulations!_Processing_complete_here_are_the_tennis_balls_
    found_with_their_respected_colours!\n\npress_any_key_to_go_back_to_
    main_menu,_or_hit_esc_twice_to_quit\n\n
    _____\n" << endl;
// Step 8, After processing and locating tennis balls and colours
    complete, display final results, and save for reference
namer << nameready << setpoint << ".jpg";
imwrite(namer.str(), imageFinal);
imshow(name, imageFinal);
// Wait for key press before returning to main menu
waitKey(0);
destroyAllWindows();
}

```