Camera calibration using adaptive segmentation and ellipse fitting

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Abstract: We describe an algorithm that Detects the control points in the raw images for camera calibration for ring calibration patterns. The algorithm was implemented in c++11 and using opency library. The proposed algorithm for finding the control points consist of four parts, Apply a mask that encloses the control points in order to reduce the work area, Apply adaptive threshold in order segment the image, find contours and find ellipses. We also implemented an algorithm for drawing lines(independent of rotation), in a specific order, starting from the top-left to the top-right and going down. We have conducted an set of experiments with recorded videos and with two cameras in real time.

Keywords: Camera calibration, threshold, integral image, contours, ellipse.

1. INTRODUCTION

In many machine vision applications, a crucial step is to accurately determine the relation between the image of the object and its physical dimension by performing a calibration process. Over time, various calibration techniques have been developed. Nevertheless, the existing methods cannot satisfy the ever-increasing demands for higher accuracy performance. In this paper, we propose an algorithm for control points detection that is used in the first stages of camera calibration techniques. We use a ring calibration patterns (Fig. 1). The proposed algorithm for finding the control points consist of four parts, Apply a mask that encloses the control points in order to reduce the work area, Apply adaptive threshold in order segment the image, find contours and find ellipses. We also implemented an algorithm for drawing lines (independent of rotation), in a specific order, starting from the top-left to the top-right and going down.

We run our algorithm in 4 videos recorded with 5 different cameras (kinnect v2, mslifecam, ps3eyecam and real sense) and two of them was used to test in real time. In order to implement this algorithm we read some theory about Zhang [2000], Datta et al. [2009], and taken Prakash and Karam [2012] as a base for the creating the algorithm. Additionally we made some test of real time pattern detection using the Ps3EyeCam and MsLifeCam getting an average of 48 pfs.

2. ALGORITHM

The camera calibration algorithm for ring calibration patterns implemented in c++ 11 and opency library. The proposed algorithm for finding the control points consist of four parts, Apply a mask that encloses the control points in order to reduce the work area, Apply adaptive threshold in order segment the image, find contours and find ellipses. We also implemented an algorithm for drawing lines (independent of rotation), in a specific order, starting

from the top-left to the top-right and going down. Those ordered control points will be used later to calibrate the camera. We will describe both algorithms in detail in the next two subsections.

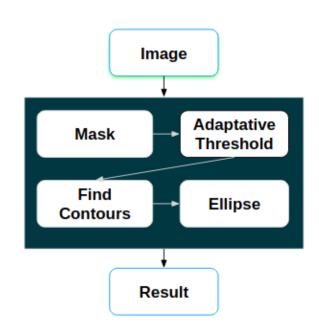


Fig. 1. Workflow for finding control points

$2.1 \; Mask$

Apply a mask that encloses the control points in order to reduce the work area. This mask is computed and applied to the input image after we have found 20 control points, we computed this mask using minAreaRect(opency function), this function return a rotated rectangle, we use this a mask.

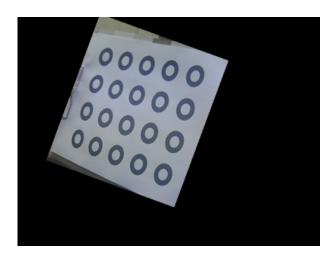


Fig. 2. Good masking after found the 20 pattern points

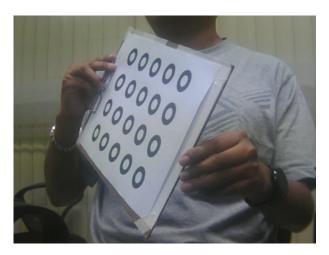


Fig. 3. If we didnt find the 20 pattern points, open the mask.

2.2 Adaptative Threshold

Preprocess the input image/video by usign adaptive thresholding using the integral image based on Bradley and Roth [2007].

In the paper cited above doesn't say what we should do with the image borders so we usse the opency threshold to complete that information.

Additionally we calculate the adaptive threshold using opency to complement the information of the edges with the obtained by the threshold implemented previously.

We have some troubles when the pattern is moved fast or the camera doesn't focus the pattern correctly.

2.3 Find contours

We use the function of openCV findContours to get all the contours from the segmented image in a hierarchy of contours, which will allow us to filter the ellipses in the next step.

Its an important step because if we don't found all pattern ellipses the next step will fail.



Fig. 4. Thresholding keeping good image information.

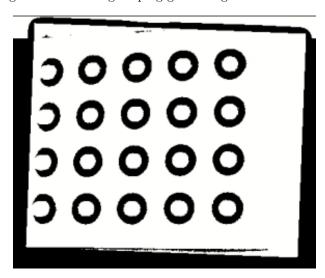


Fig. 5. Thresholding error cause by fast movement



Fig. 6. Thresholding error cause by focus error

2.4 Find ellipse

- From the found contours we look for all the ellipses that have a father and a son, besides that the center of the son is very close to his own.
- From the set of ellipses found we verified that we have at least 2 ellipses near us at a distance no greater than

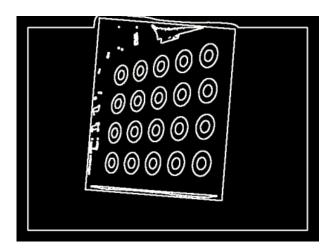


Fig. 7. Good contours improved by thresholding.

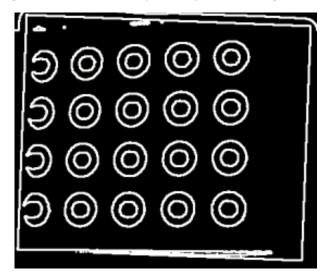


Fig. 8. Bad contours caused by a fast movement.

5 times the radius of the ellipse with which we make the comparison.

• If we have more than 20 ellipses we look for mode based on the hierarchy of the father of each ellipse and we eliminate all those who have a different father.

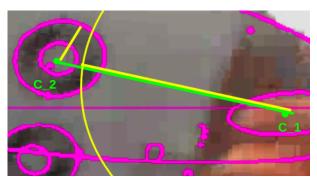


Fig. 9. Comparison between two ellipses to check if the ellipse c1 belong to the control point, the small Yellow line is the radio of the ellipse c2, the large Yellow line is five times the radio of the ellipse c2. We can see that condition distance(c1, c2) < 5 * radio C2, does not hold, therefore the ellipse c1 does not belong to the control points.



Fig. 10. Discard false positive using the father mode.

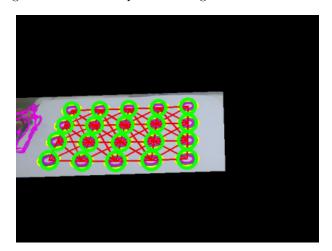


Fig. 11. Good patter points recognition.

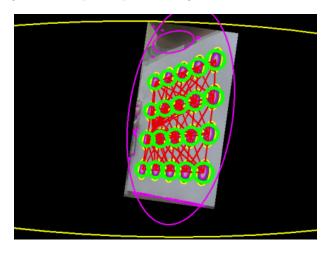


Fig. 12. Good patter points recognition.

2.5 Line representation

After we have found the rings of the pattern in the image we start to build the lines representation of the pattern. If we lost the pattern we need to order the points again using the next algorithm and if we doesn't lost the pattern we perform the tracking process described in the next subsection.

- Using each pair of points we make a line and determine the line equation.
- Using the line equation count the number of points near to the line and store these points in a aux vector.



Fig. 13. Ellipse not detected correctly cause by a poor image definition.

- If there are 5 points in the aux vector, order these points using the x coordinate and check the distance between the first and last elements if the distance is lower than the radio of circles then sort the aux vector again using the y coordinate
- Draw a line between the first and last elements of the aux vector.
- Keep the last point got from the process described before.
- Remove the points and continue searching process to find the next line until we found the 4 lines.

Whit the ordered points we only need to draw lines from the 0 point to 4 point, 5 point to 9 point etc.

2.6 Tracking

To keep the order obtained in the previous process we perform a tracking process. From the points found in the previous frame we search in the new points some one that is nearly to these one using the radio as boundary. When the 20 points was found we check if any one has distance bigger than the radio to its near point if this is true we discard old point and consider the pattern was lost.

2.7 Camera calibration

To perform the camera calibration we select some frames where the pattern was found and use these points to perform the calibration, in our experiments we have found good results using every frame multiple of 10, and using 20 frames getting a reprojection error of 0.15688 for the Ps3 video.

After the calibration process we found the next parameters:

| Parameter | Lifecam | PS3 | PS3 own test |
|------------------|----------|----------|--------------|
| Reprojection e | 0.207939 | 0.283131 | 0.15688 |
| Focal length x | 491.4405 | 981.5524 | 619.8529 |
| Focal length y | 495.4743 | 985.5674 | 623.7464 |
| Optical center x | 327.9785 | 321.6473 | 317.8602 |
| Optical center y | 161.9086 | 249.7668 | 257.8088 |

2.8 Reprojection error

| | Reprojection error | | |
|---------------|--------------------|----------|--------------|
| Center point | PS3 | Life cam | PS3 own test |
| Average | 0.283131 | 0.207939 | 0.152955 |
| Outer ellipse | 0.276882 | 0.203329 | 0.152029 |
| Inner ellipse | 0.319041 | 0.232213 | 0.185229 |

2.9 Average of collinearity

In addition to the reprojection error we evaluate the distance from every inner line point to its main line to get the average of collinearity value and we made some comparisons whit the original and undistorted video, the results are shown in the next tables.

| | PS3: Average of collinearity | | |
|---------------|------------------------------|-------------------|--|
| Center point | Original video | Undistorted video | |
| Average | 0.2815 | 0.1344 | |
| Outer ellipse | 0.2711 | 0.1383 | |
| Inner ellipse | 0.3110 | 0.1667 | |

| | LifeCam :Average of collinearity | | |
|---------------|----------------------------------|-------------------|--|
| Center point | Original video | Undistorted video | |
| Average | 0.1040 | 0.0989 | |
| Outer ellipse | 0.0998 | 0.0980 | |
| Inner ellipse | 0.1302 | 0.1246 | |

2.10 Undistort image

Using the camera matrix and the distortion coefficients we can transform the image input to correct the distortion.

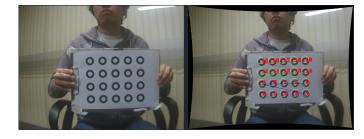


Fig. 14. Image with no distortion using the camera parameters and the distortion coefficients

3. CALIBRATION USIGN OPENCV

3.1 Camera calibration (OpenCV - Chessboard pattern)

| Parameter | Lifecam | PS3 |
|------------------|---------|---------|
| Reprojection e | 0.3059 | 0.3130 |
| Focal length x | 301.24 | 1204.97 |
| Focal length y | 301.24 | 1204.97 |
| Optical center x | 320 | 320 |
| Optical center y | 180 | 240 |

3.2 Camera calibration (OpenCV - Asymmetric circles pattern)

| Parameter | Lifecam | PS3 |
|------------------|---------|---------|
| Reprojection e | 0.3178 | 0.3294 |
| Focal length x | 723.61 | 109.897 |
| Focal length y | 723.61 | 109.897 |
| Optical center x | 320 | 320 |
| Optical center y | 180 | 240 |

4. RESULTS

We perform some tests of the algorithm in real time using the Ps3 eye camera and the Microsoft life cam getting an average of 48 fps and a success rate off 82.21.

As we can see in the following figures, we obtain a good performance in images with high rotation.

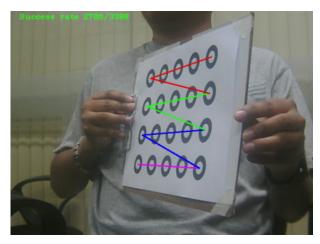


Fig. 15. Results after applying our algorithm on ps3eyecam video.

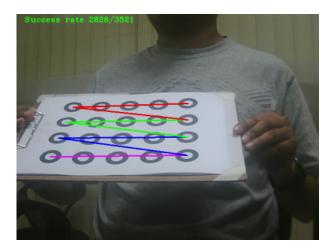


Fig. 16. Results after applying our algorithm on ps3eyecam video.

5. CONCLUSIONS

- It is important to clean irrelevant information in the videos in order to capture relevant characteristics.
- The algorithm needs to be further improved to get better performance on other videos.

- The algorithm depends on how well the ellipses of the calibration pattern are detect. Depends basically on fitEllipse method of opency.
- For the camera calibration process is important to perform a good tracking algorithm to keep the order of the points.
- The frames selected for the calibration process should have good quality to improve the results.

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