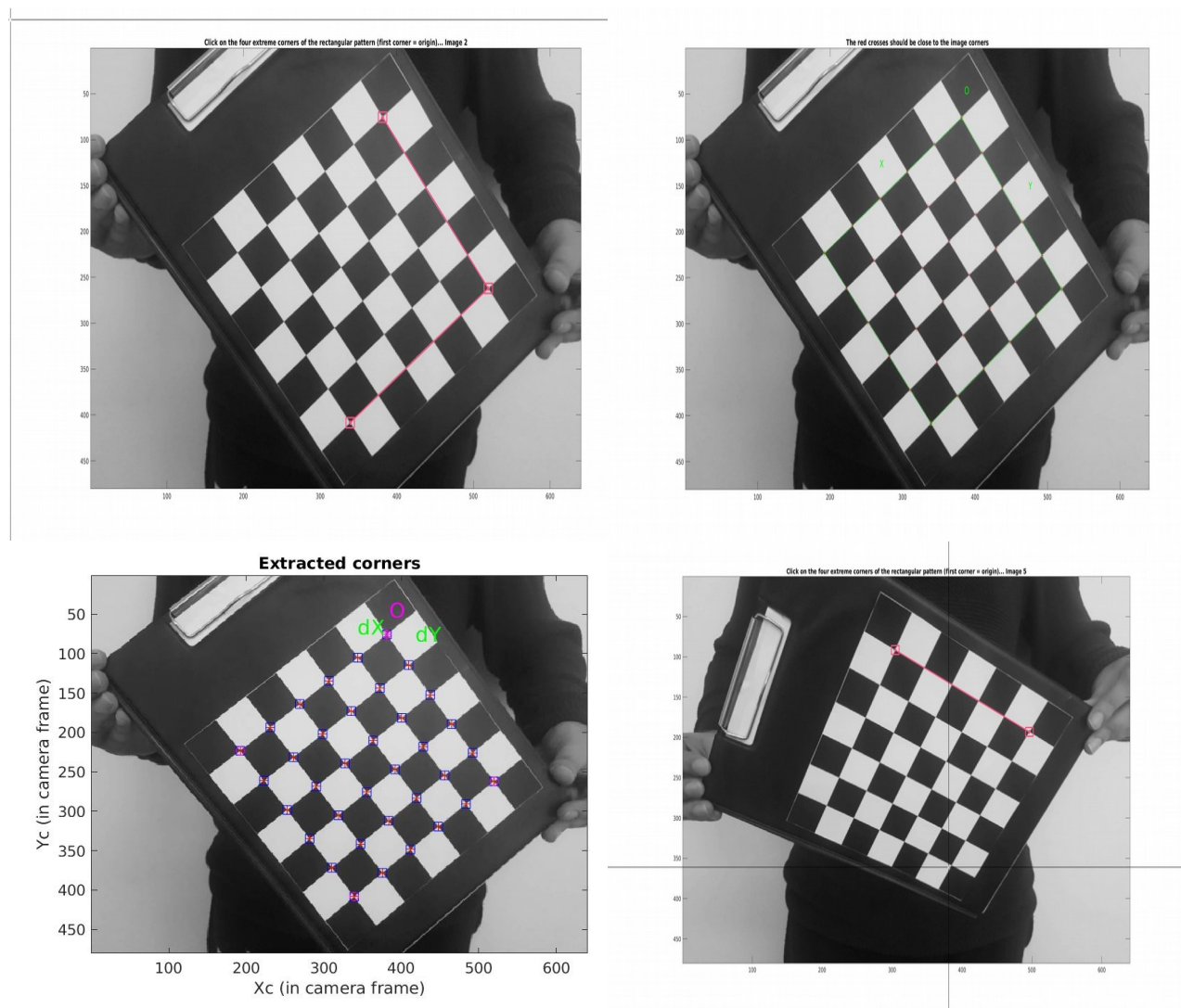


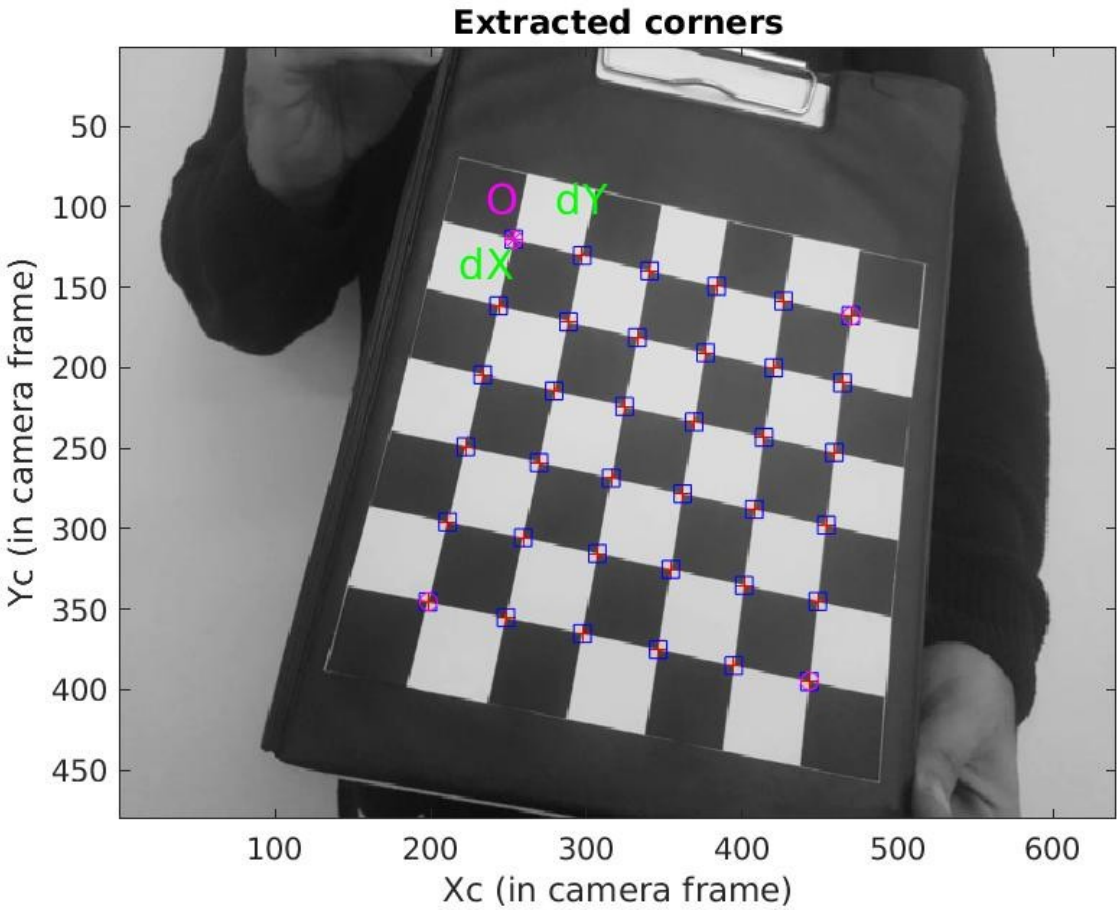
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In this assignment we need to complete the camera calibration toolbox in matlab which made by Caltech University based on total of 20 images of planar checkerboard. Our objective is to calculate parameters of camera calibration and optimizing them based on errors including distortions etc. Firstly, we need to read all images. In my implementation there are 20 + 5 images with bmp extension which shot by me. Below you find all 20+5 images in a mosaic form. Also, all images are attached in the zip file.

Extract the grid corners:

The first thing we need to do, is the extracting the grid corners. To achieve that we have to arrange `wintx` and `winty` values. It is selected by default 5 and we have enabled automatic square counting. First 20 images are included. Then we selected four corners in order for each image to calculate external and internal parameters. For some images, the real-world corners and calculated corners are not overlapped. Therefore we have to take into account the distortion coefficient. We need to arrange the distortion by estimating distortion coefficient for maximum correctness until we are satisfied. Please check the processes of this extracted grid corners. We did the same thing for the rest of the images and obtained `calib_data.mat` file which is attached in the zip file.





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After the corner extraction, we activated the main calibration process. There is two main process in this calibration step; first initialization and non-linear optimization. Initialization step computes the closed-form solution for external and internal parameters of calibration. The non-linear optimization minimized the total least square projection error. There are 129 parameters overall (9 for instructions and 6*20 for extrinsic). Below, the calibration parameters is given.

```
Command Window
New to MATLAB? See resources for Getting Started.

Focal Length:      fc = [ 516.71829   516.51998 ] +/- [ 3.59101   3.72525 ]
Principal point:   cc = [ 319.82396   233.15370 ] +/- [ 4.06686   3.67059 ]
Skew:              alpha_c = [ 0.00000 ] +/- [ 0.00000 ] => angle of pixel axes = 90.00000 +/- 0.00000 degrees
Distortion:        kc = [ 0.23428   -0.72183   0.00127   0.00934   0.00000 ] +/- [ 0.02852   0.14713   0.00335   0.00393   0.00000 ]
Pixel error:       err = [ 0.29418   0.29792 ]

Note: The numerical errors are approximately three times the standard deviations (for reference).

Number(s) of image(s) to show ([ ] = all images) =
Pixel error:      err = [0.29418   0.29792] (all active images)

Re-extraction of the grid corners on the images (after first calibration)
Window size for corner finder (wintx and winty):
wintx ([ ] = 5) =
winty ([ ] = 5) =
Window size = 11x11
Number(s) of image(s) to process ([ ] = all images) =
Use the projection of 3D grid or manual click ([ ]=auto, other=manual):
Processing image 1...2...3...4...5...6...7...8...9...10...11...12...13...14...15...16...17...18...19...20...
done

Aspect ratio optimized (est_aspect_ratio = 1) -> both components of fc are estimated (DEFAULT).
Principal point optimized (center_optim=1) - (DEFAULT). To reject principal point, set center_optim=0
Skew not optimized (est_alpha=0) - (DEFAULT)
Distortion not fully estimated (defined by the variable est_dist):
    Sixth order distortion not estimated (est_dist(5)=0) - (DEFAULT) .

Main calibration optimization procedure - Number of images: 20
Gradient descent iterations: 1...2...3...4...5...6...7...8...9...10...11...12...13...14...15...done
Estimation of uncertainties...done

Calibration results after optimization (with uncertainties):

Focal Length:      fc = [ 516.71602   516.51797 ] +/- [ 3.59028   3.72450 ]
Principal point:   cc = [ 319.82599   233.15492 ] +/- [ 4.06606   3.66993 ]
Skew:              alpha_c = [ 0.00000 ] +/- [ 0.00000 ] => angle of pixel axes = 90.00000 +/- 0.00000 degrees
Distortion:        kc = [ 0.23426   -0.72179   0.00127   0.00934   0.00000 ] +/- [ 0.02851   0.14710   0.00335   0.00393   0.00000 ]
Pixel error:       err = [ 0.29412   0.29786 ]

Note: The numerical errors are approximately three times the standard deviations (for reference).
```

Then, we reproject the calibration parameters on the previous images. Below, there are 3 sample image which are grid reprojected.

Image 1 - Image points (+) and reprojected grid points (o)

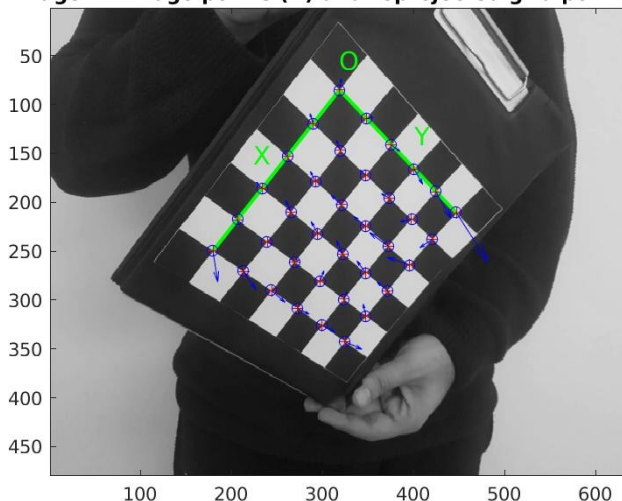


Image 5 - Image points (+) and reprojected grid points (o)

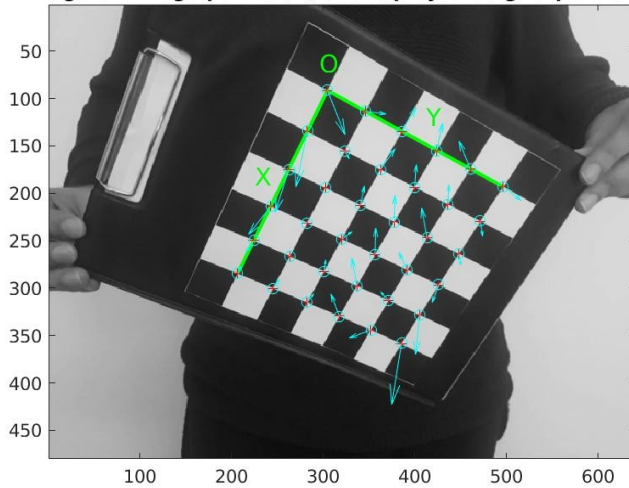
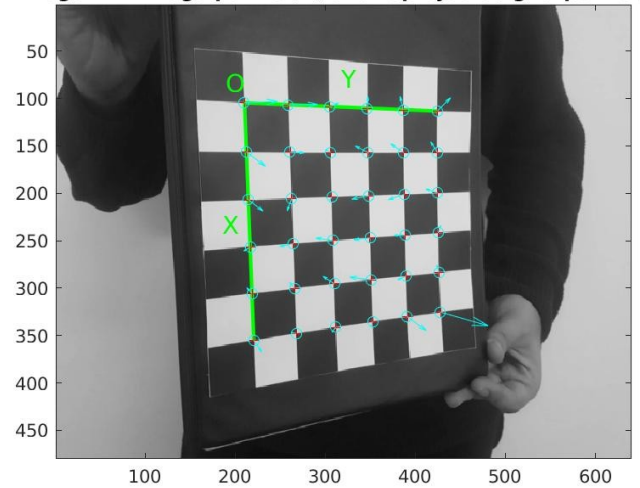
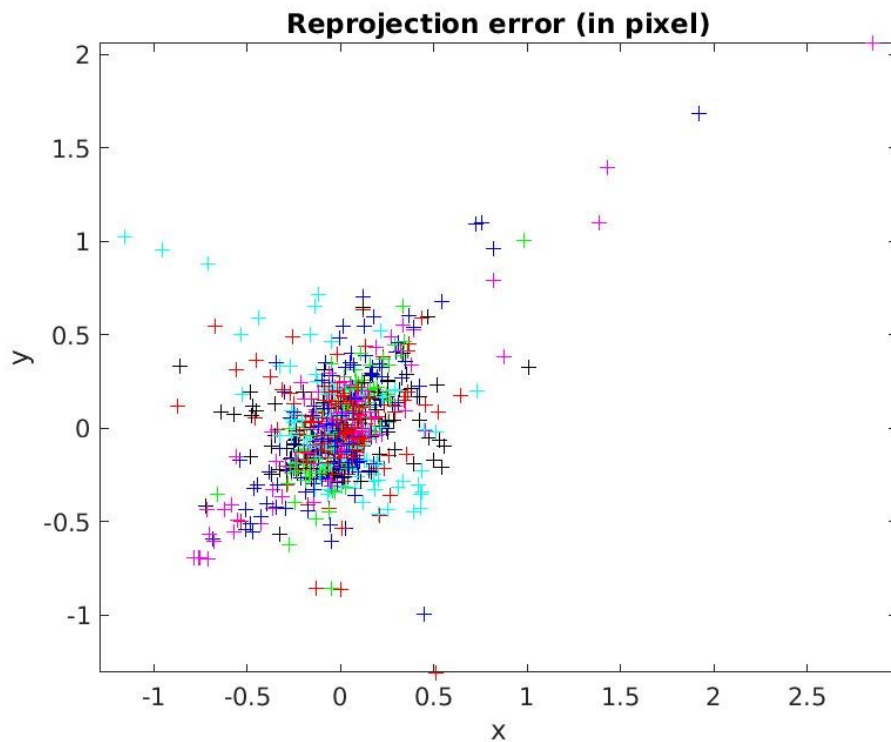


Image 17 - Image points (+) and reprojected grid points (o)

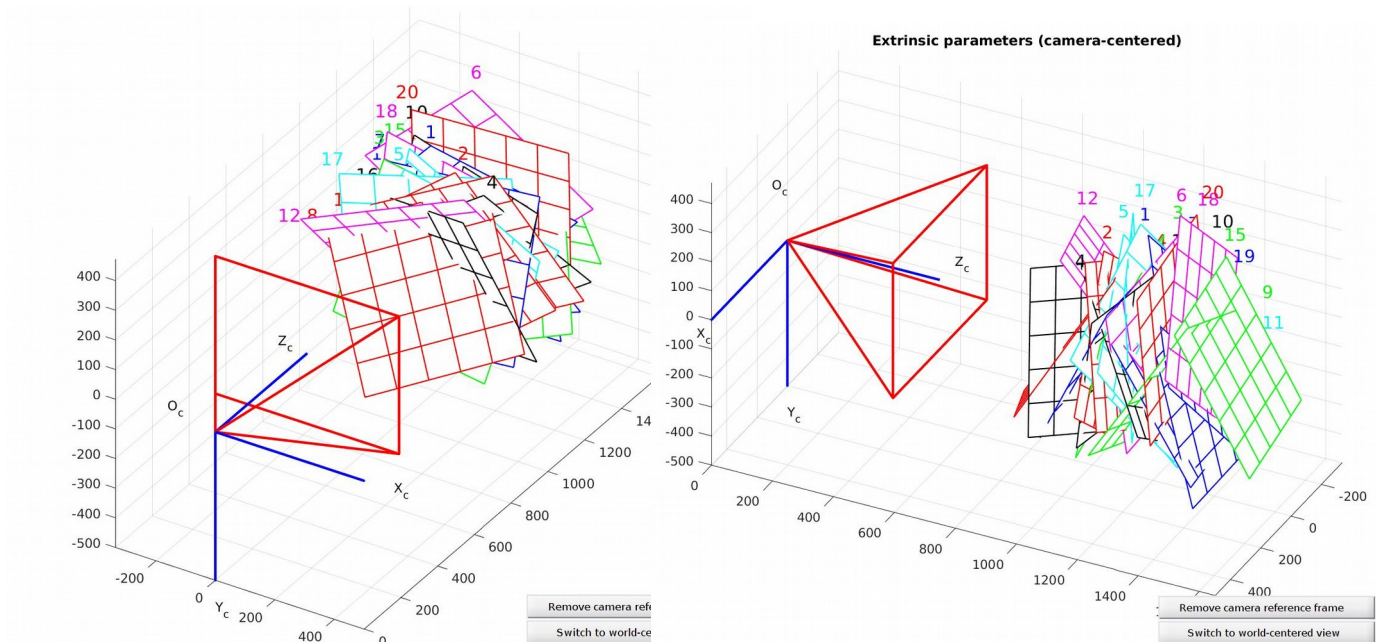


Also, we can see the figures which includes the extrinsic and error rates. As you can see for some image there are significant errors. The error rates in pixels is up to 2.5 pixel which is unacceptable. We need to re calibrate the image and optimize the errors.

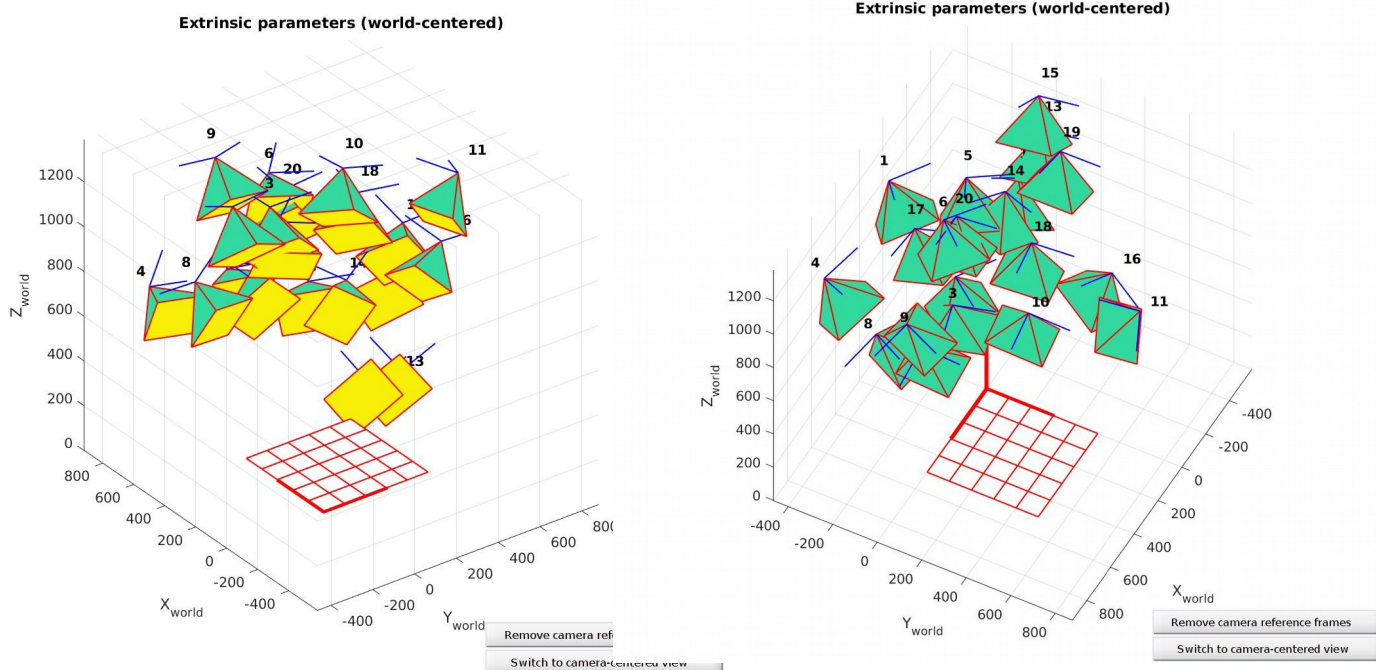


Below you can see the extrinsic parameters figure.

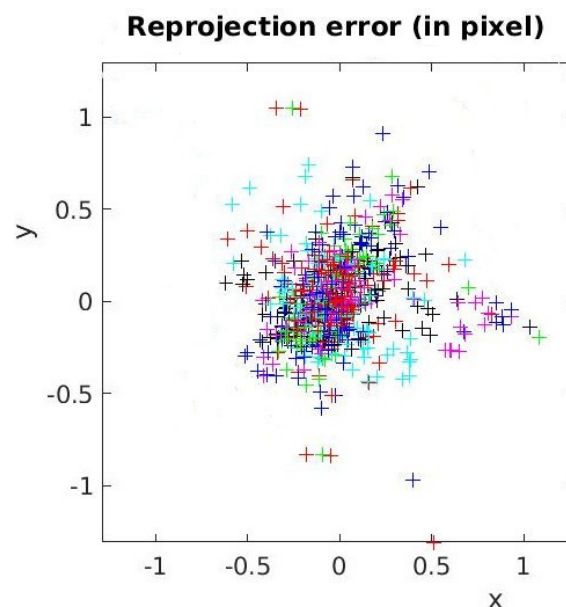
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Also, you can find the world-centered extrics in below.



As we already said, the recalibration process is required to minimize errors. Because notice that re projection error is very large across a large number of figures. To optimize that, we need click on Recomp.Corners. Still, all parameters like wintx winty is assigned by default. After we do the all calibration processes we will analyze the error again to see the optimization.



Note: The numerical errors are approximately three times the standard deviations (for reference).

Pixel error: err = [0.29412 0.29786] (all active images)

Then we can see the most errorous image by clicking the graph and watch the console.

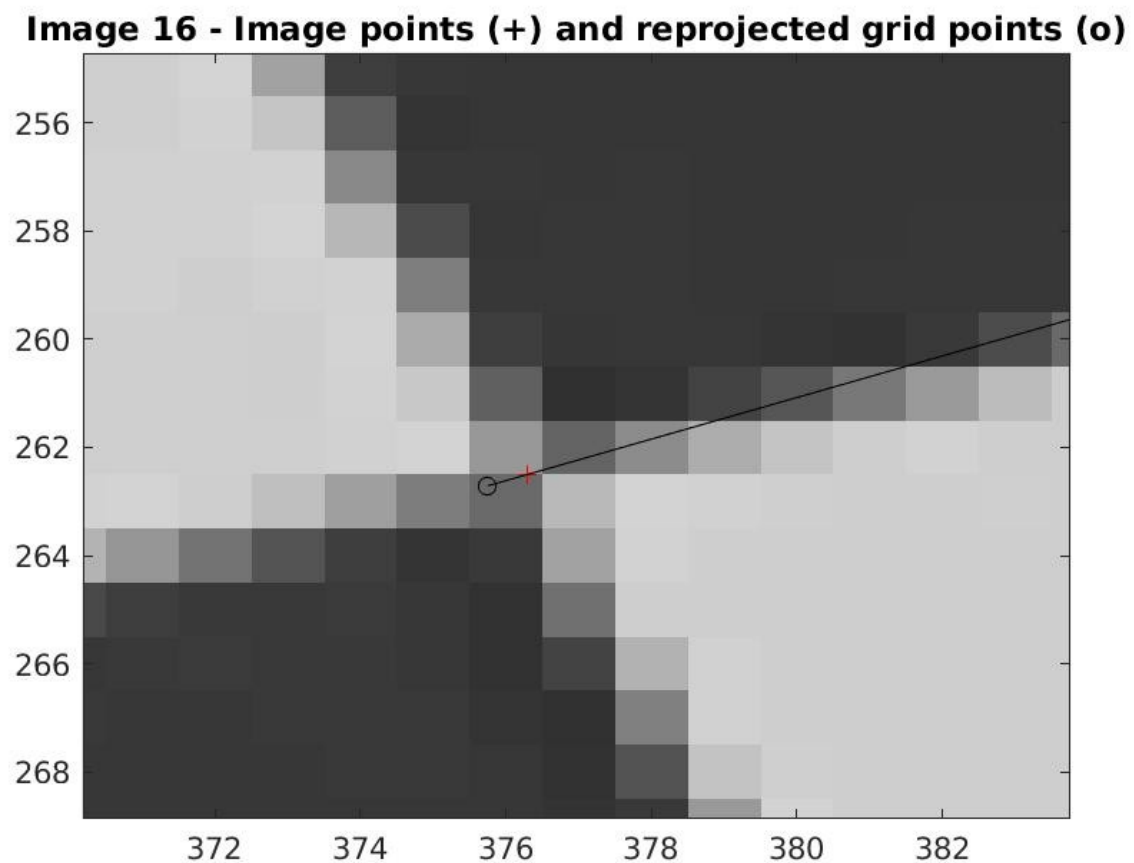
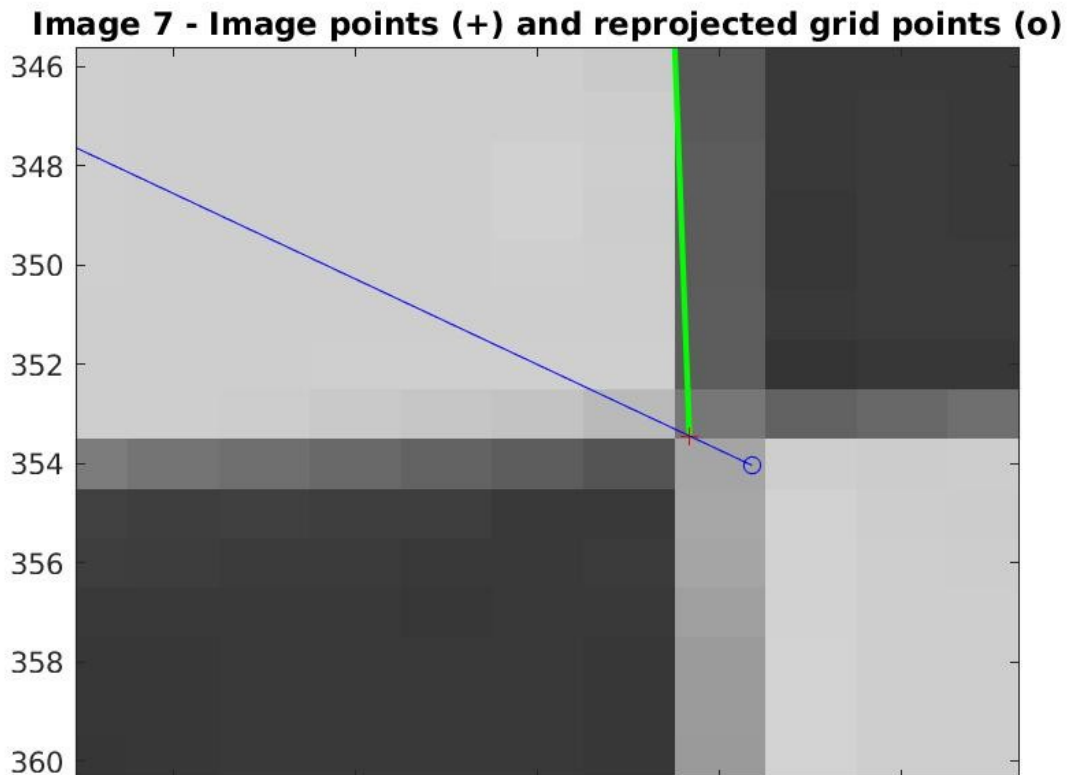
```
Window size: (wintx,winty) = (5,5)

Selected image: 12
Selected point index: 1
Pattern coordinates (in units of (dx,dy)): (X,Y)=(0,5)
Image coordinates (in pixel): (437.32,66.46)
Pixel error = (2.85269,2.05860)
Window size: (wintx,winty) = (5,5)

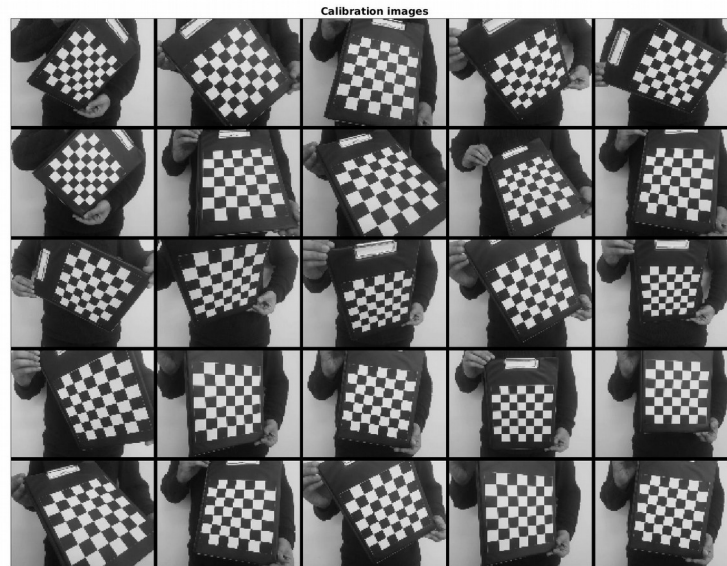
Selected image: 6
Selected point index: 16
Pattern coordinates (in units of (dx,dy)): (X,Y)=(3,3)
Image coordinates (in pixel): (332.23,213.28)
Pixel error = (-0.00251,0.01329)
Window size: (wintx,winty) = (5,5)

Selected image: 11
Selected point index: 1
Pattern coordinates (in units of (dx,dy)): (X,Y)=(0,5)
Image coordinates (in pixel): (296.39,78.52)
Pixel error = (-1.15969,1.02379)
Window size: (wintx,winty) = (5,5)
fx >>
```

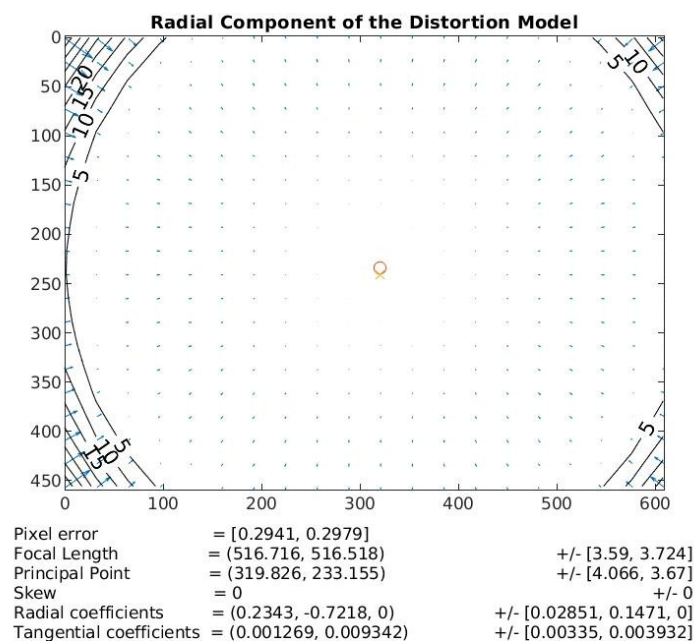
To deep analysis we also need to look the most incorrect calibrations. In below, there are 2 zoomed-in point to illustrate the figure.



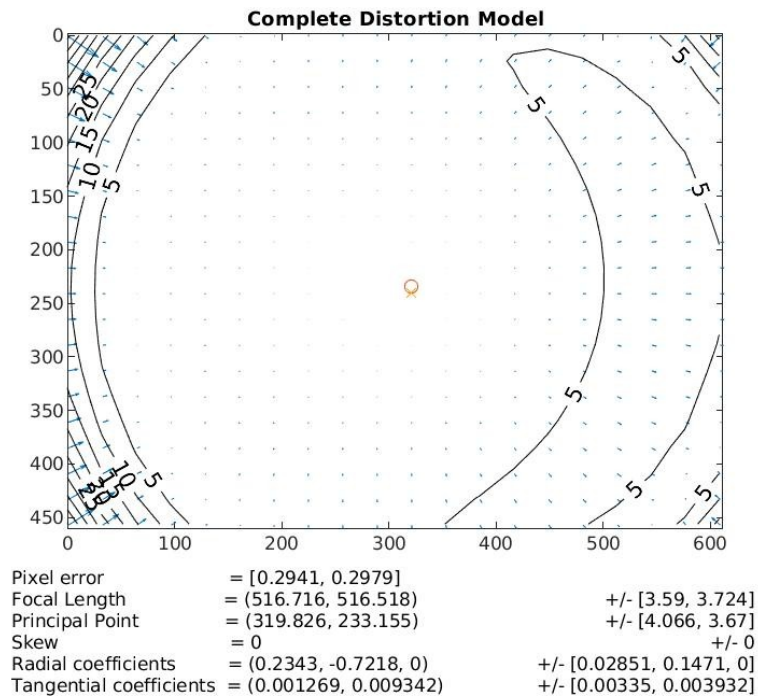
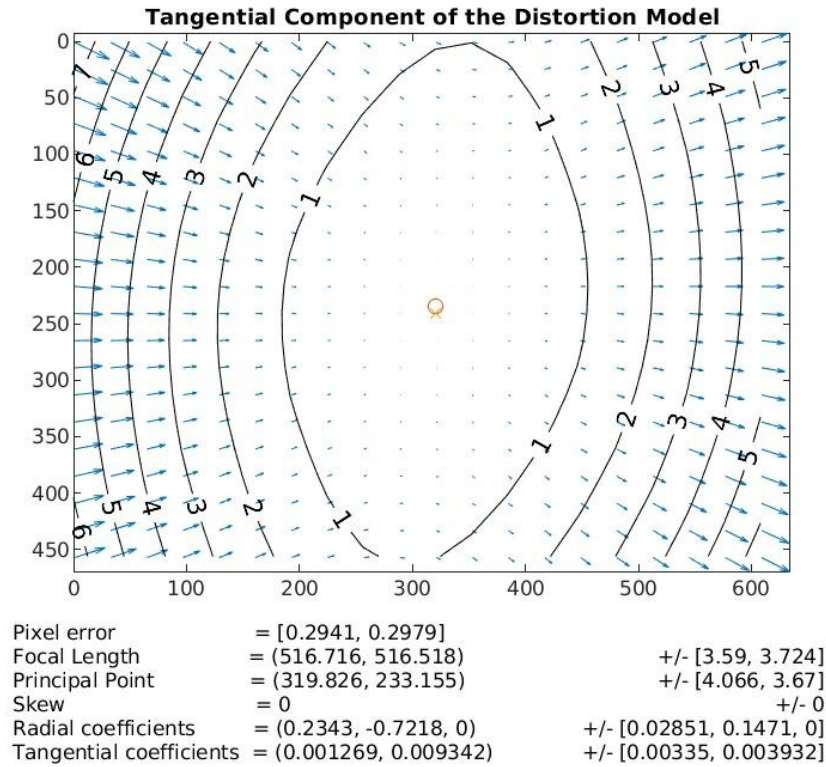
After we satisfied with the result and no more calibration is necessary. The all calibration is done and saved as `calib_results.mat`. Please notice that the previous calibration saved as `calib_result_old.mat` which you can find in the attachments. Then we can add 5 image and calibrate again. To see all images please see the mosaic figure below.



The next task we need to do is make a decision on the appropriate distortion model. To achieve that we need to run `visual_distortions.m`. Below, you can see the related figures.



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The all calibration process is done by now. Please check the all results in the attachments in detail.