

Assignment 1

For assignment 1 I utilized Python 3.7 alongside opencv2 and numpy in order to read images and perform histogram equalization on them. Additionally, I used pyplot for more attractive and readable histogram plots for verifying my algorithm was performing as expected. After performing and applying my histogram equalization each image was then stacked beside the original as well as a perfect example of histogram equalization performed by `cv2.equalizeHist()`.

For each image I began by reading in two copies, one standard and one in grayscale for use with `cv2.equalizeHist()` for comparison. For example, with image 309:

```
image_b = cv2.imread('resources/Fig0309(a)(washed_out_aerial_image).tif')  
image_b2 = cv2.imread('resources/Fig0309(a)(washed_out_aerial_image).tif', 0)
```

All remaining image processing code was placed in a function in order to remove the necessity of repeat code, and so this function was then called on each image. This function reads in two image objects: the standard for my algorithm, and the grayscale for the comparison image. It then resizes both images in order to shrink them for later concatenation and display using the `cv2.resize()` function:

```
image = cv2.resize(im1, (0, 0), None, .70, .70)  
image2 = cv2.resize(im2, (0, 0), None, .70, .70)
```

Next, the type of the grayscale image is corrected to `uint8` and is used to create the comparison image:

```
image2 = image2.astype(numpy.uint8)  
equ = cv2.equalizeHist(image2)
```

The example is now stored in `equ` and is left along until displaying at the end. Following this, I flattened the image down into a 1D array using `numpy.flatten()`. I then displayed the histogram using `pyplot.hist()` in order to compare the image's prior values to the equalized ones:

```
flatimage = image.flatten() # flatten to 1D  
plot.hist(flatimage, bins=256) # create histogram  
plot.xlim(0, 256) # prevent cutoff  
plot.title('first')  
plot.show()
```

This plot can be seen here:

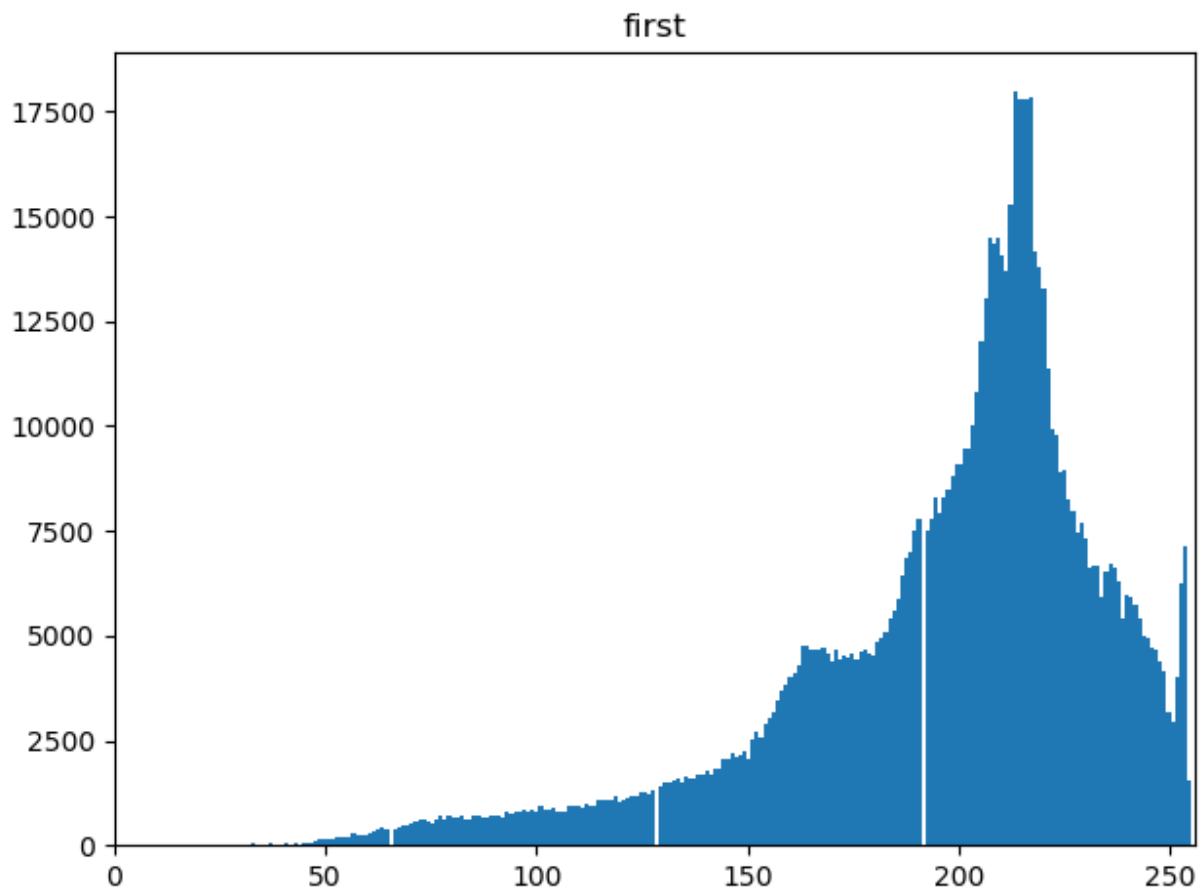


Figure 1 image 309 initial histogram

I then created and used my own histogram function to obtain an array containing the histogram values for the image. This array is then used to obtain the cumulative sum:

```
csum = 0 # holds current cumulative sum  
cumusum = numpy.zeros(len(histogram)) # array for holding cumulative sum steps
```

```
# get cumulative sum  
for i in range(0, len(histogram)):  
    csum = csum + histogram[i]  
    cumusum[i] = csum
```

I then plotted the cumulative sum:

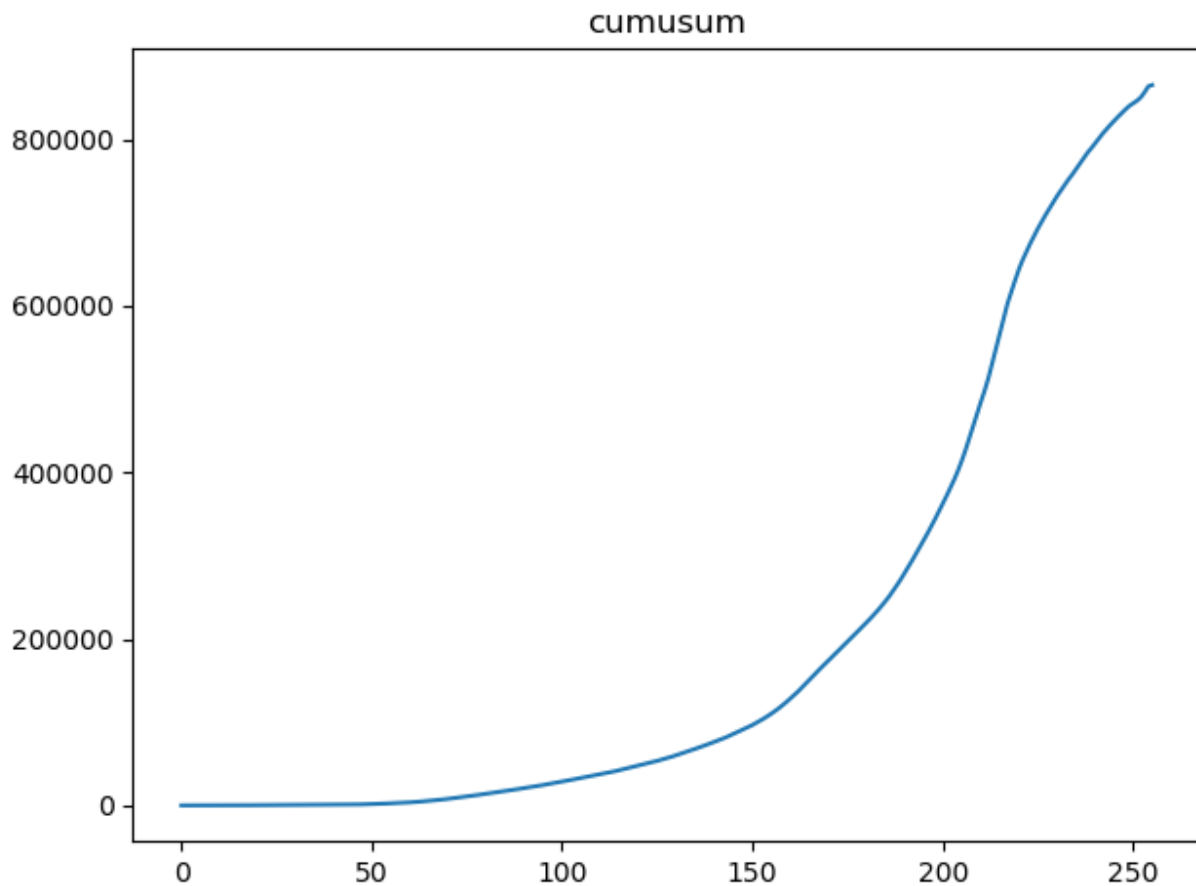


Figure 2 Image 309 Cumulative Sum

I then normalized the cumulative sum for the image. Here I ran into a number of issues, however I found the Wikipedia page on histogram equalization quite helpful, especially the part on implementation. The url is https://en.wikipedia.org/wiki/Histogram_equalization#Implementation . The logic can be seen here, followed by the plot:

```
num = (cumusum - cumusum.min()) * 255  
denom = cumusum.max() - cumusum.min()  
cumusum = num / denom
```

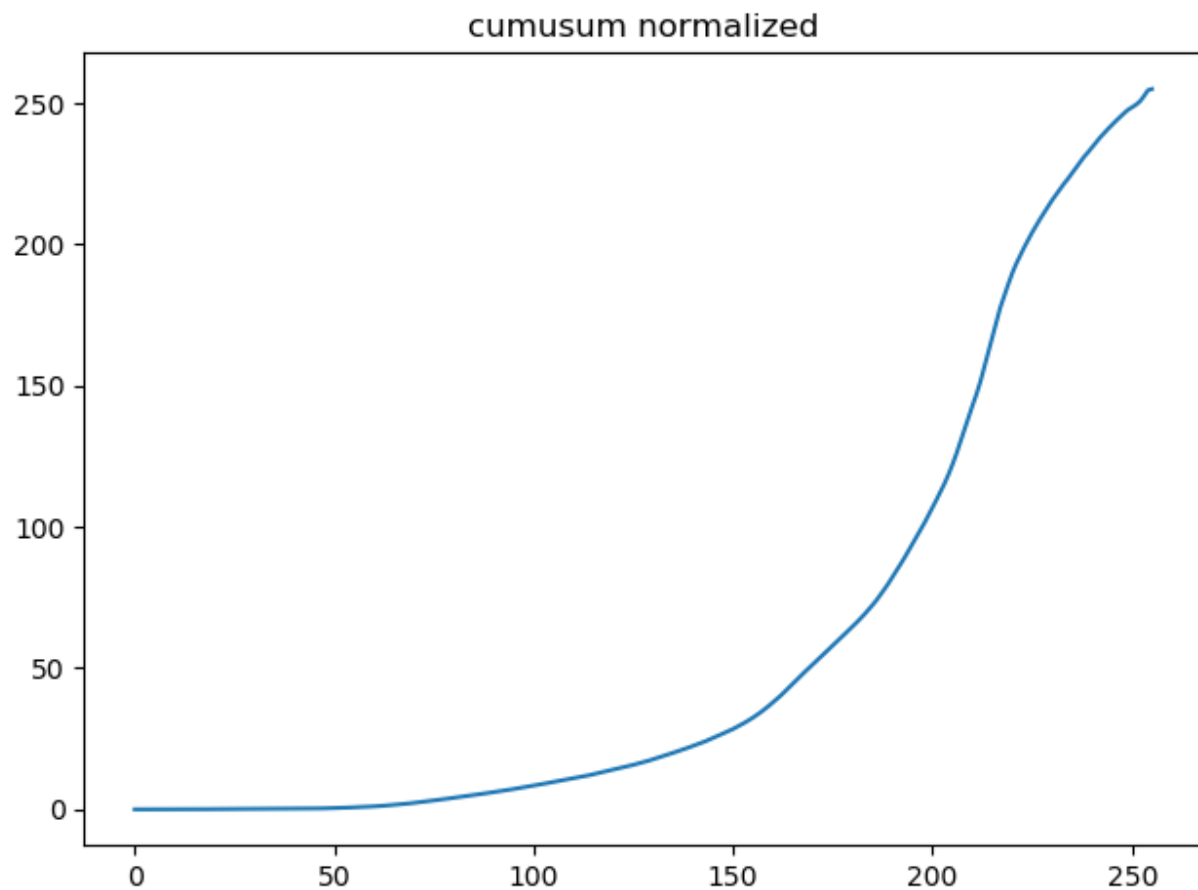


Figure 3 Image 309 Normalized Cumulative Sum

As can be seen in the image, the cumulative sum now appears to be normalized between 0 and 255. Next, I corrected the type of the cumulative sum before using it to create a new image and plotting its histogram:

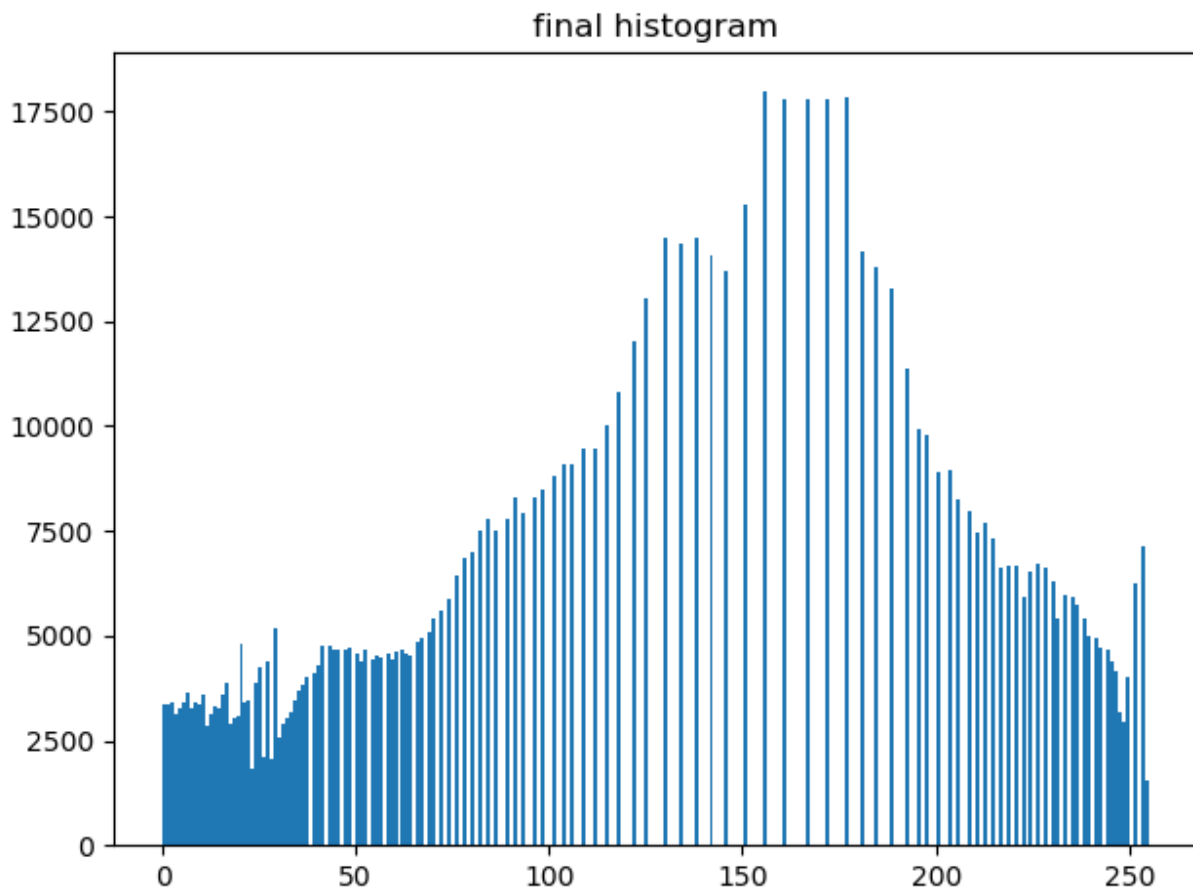


Figure 4 Image 309 Equalized Histogram

As can be seen by comparing this image to the earlier histogram, the values are far more spread out and the differences less drastic. Finally, I reshaped the new image back into proper dimensions using `numpy.reshape()`:

```
img_new = numpy.reshape(img_new, image.shape)
```

Additionally, I altered the channels of the 'ideal' comparison image to match the original and my equalized image:

```
equ_3_channel = cv2.cvtColor(equ, cv2.COLOR_GRAY2BGR)
```

This allowed me to concatenate them for display:

```
res = numpy.hstack((image, equ_3_channel, img_new)) # concatenate images for display  
cv2.imshow('test', res) # show stacked images  
cv2.waitKey(0) # wait for button press to close window
```

Left to right, the images are the original, the ideal equalized image from `cv2.histEqualize()`, and my equalized image.

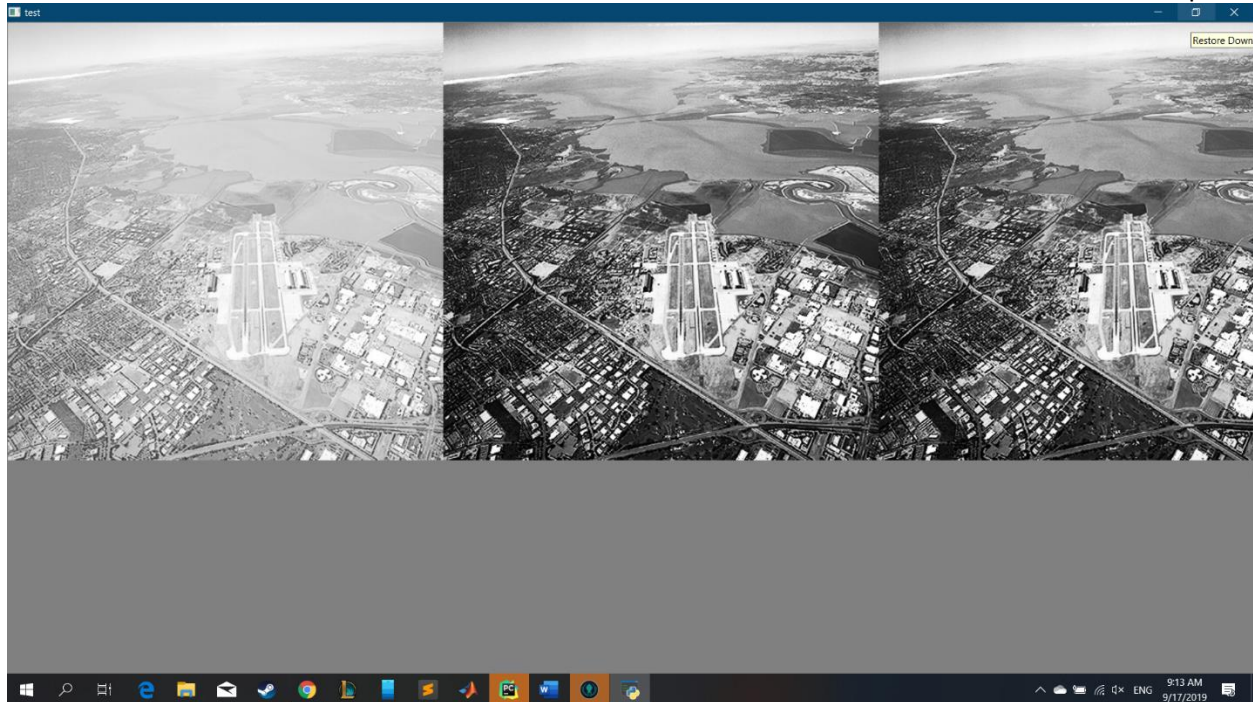


Figure 5 Image 309 left to right: original, equalizeHist() example, personal algorithm

Using the same code, the following results were achieved for image 308

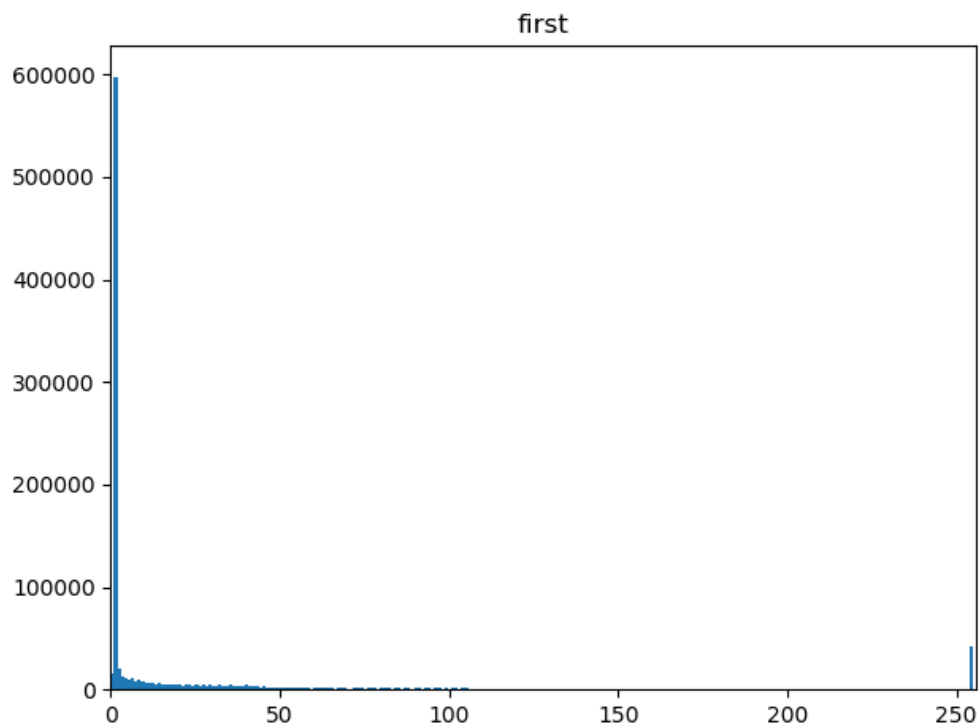


Figure 6 Image 308 Initial Histogram

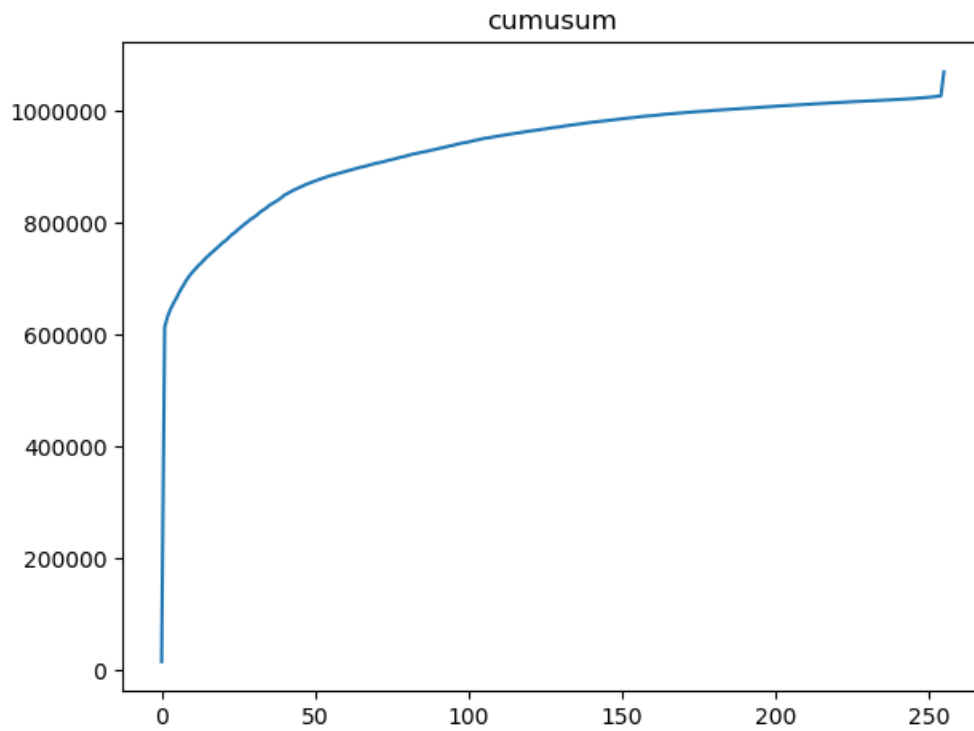


Figure 7 Image 308 Cumulative Sum

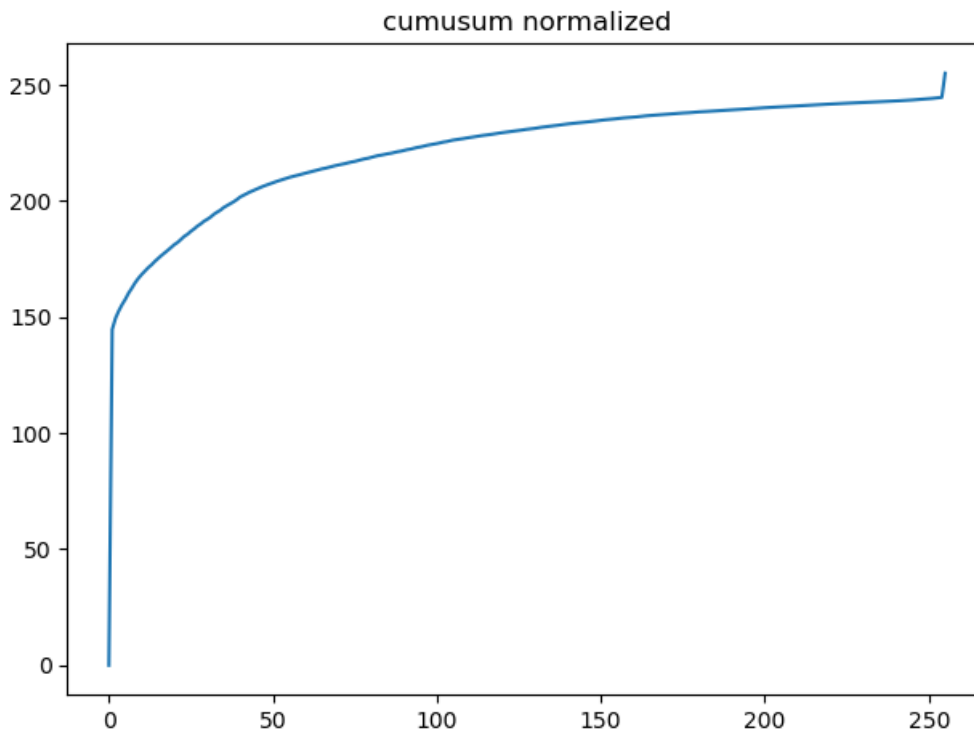


Figure 8 Image 308 Normalized Cumulative Sum

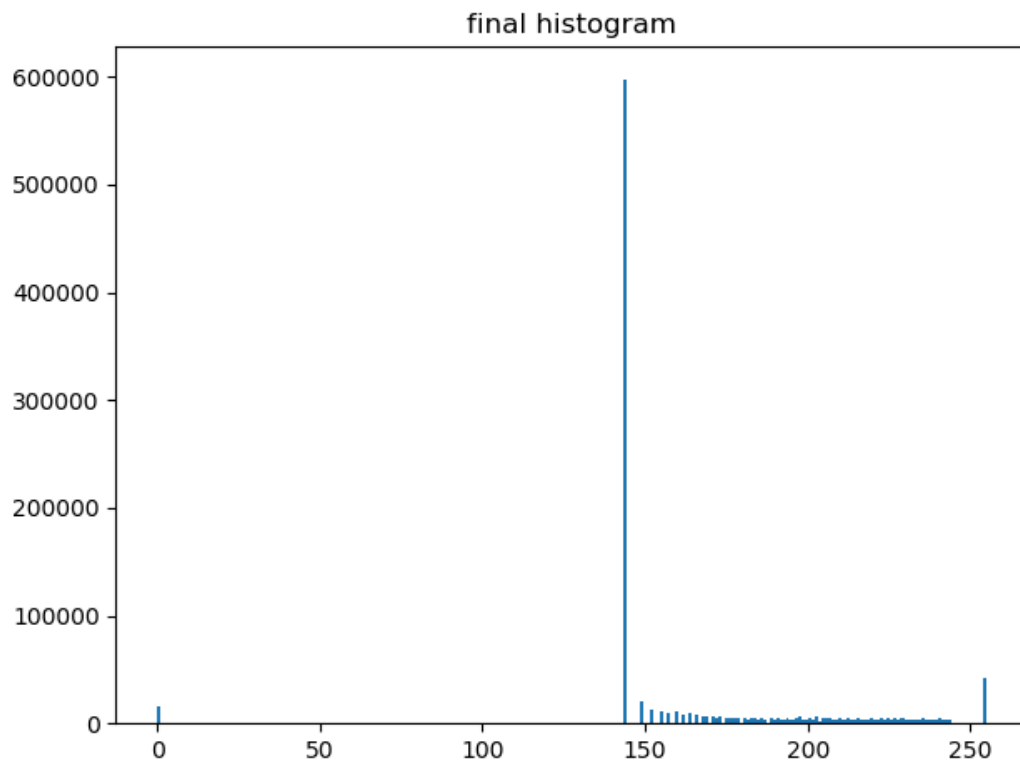


Figure 9 Image 308 Equalized Histogram



Figure 10 Image 308 left to right: original, cv2.equalizeHist(), personal algorithm

And for image 316(2):

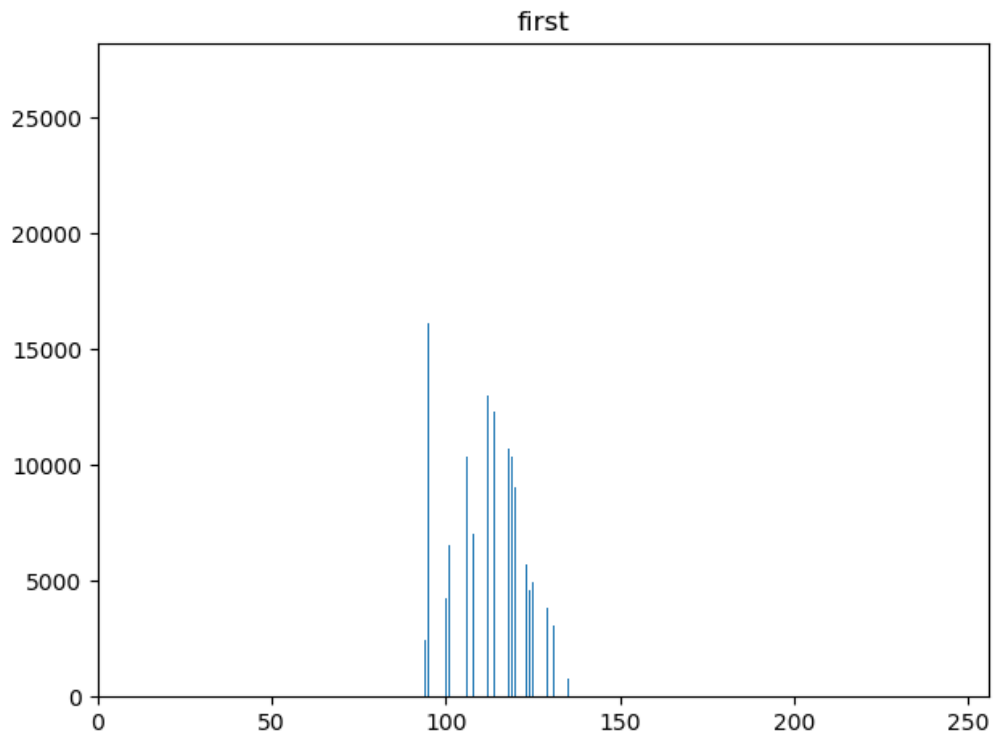


Figure 11 image 316 Initial Histogram

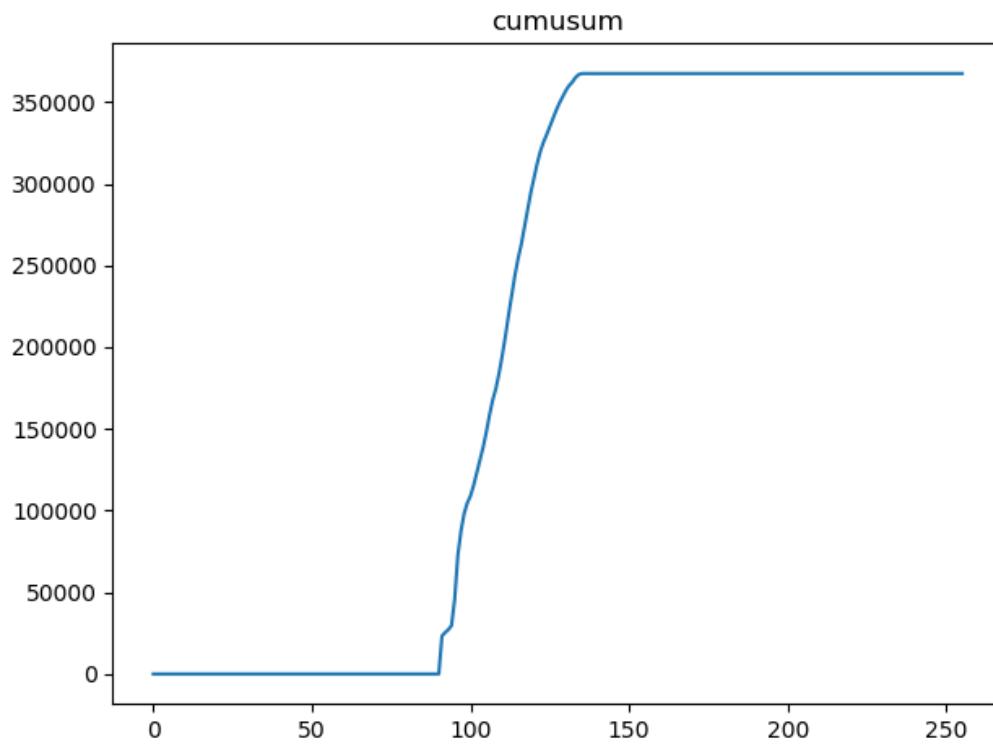


Figure 12 Image 316 Cumulative Sum

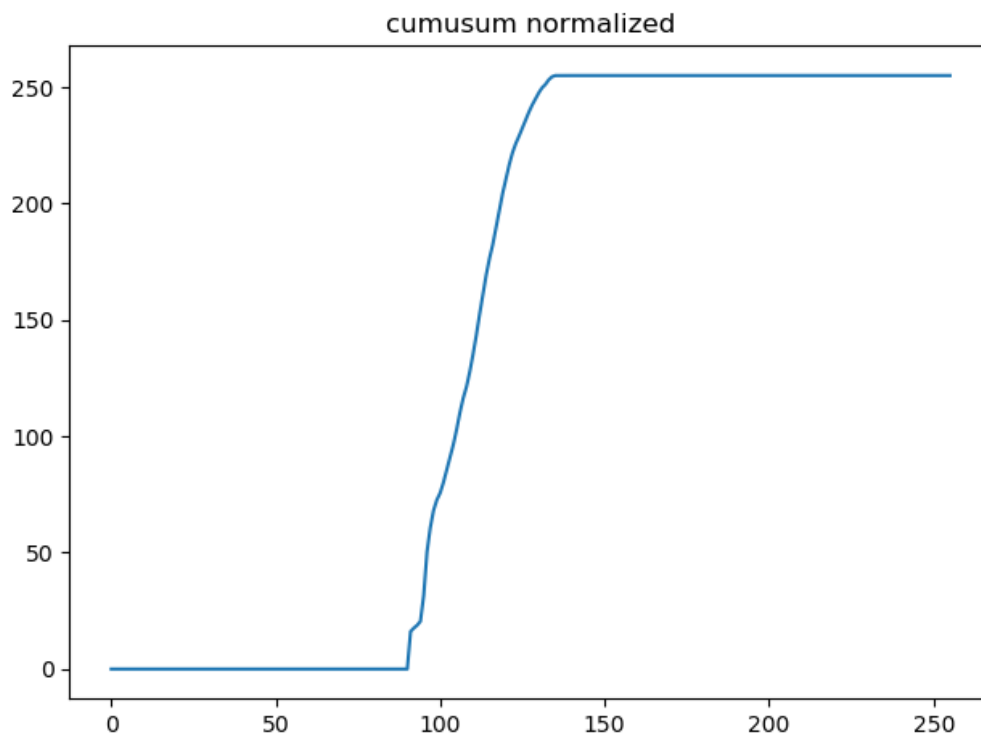


Figure 13 Image 316 Normalized Cumulative Sum

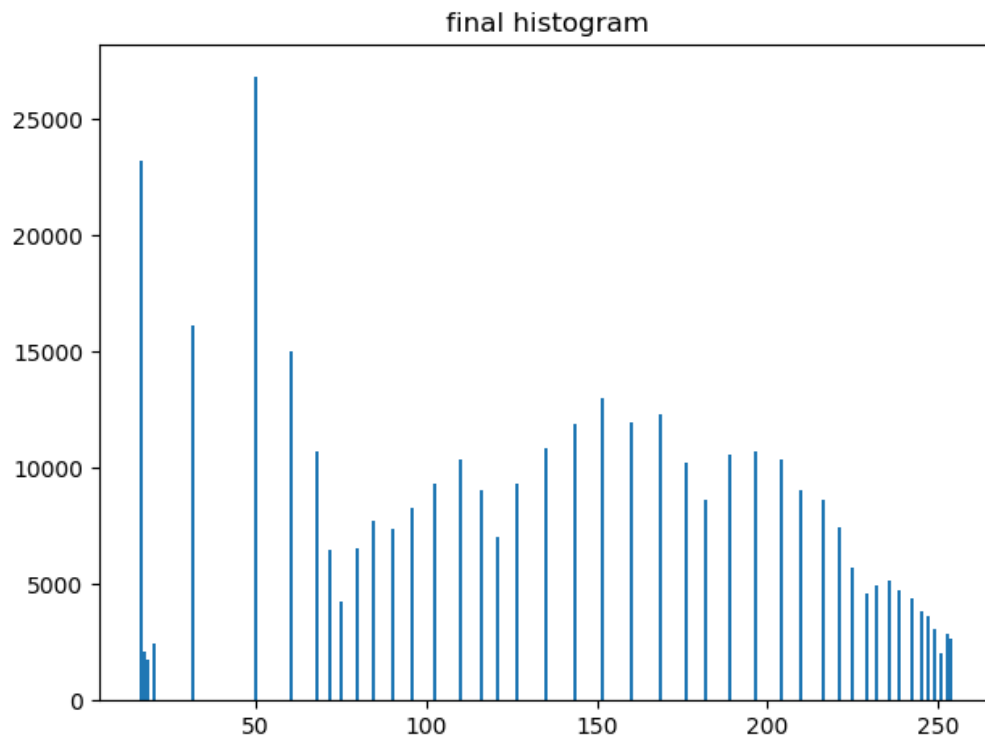


Figure 14 Image 316 Equalized Histogram

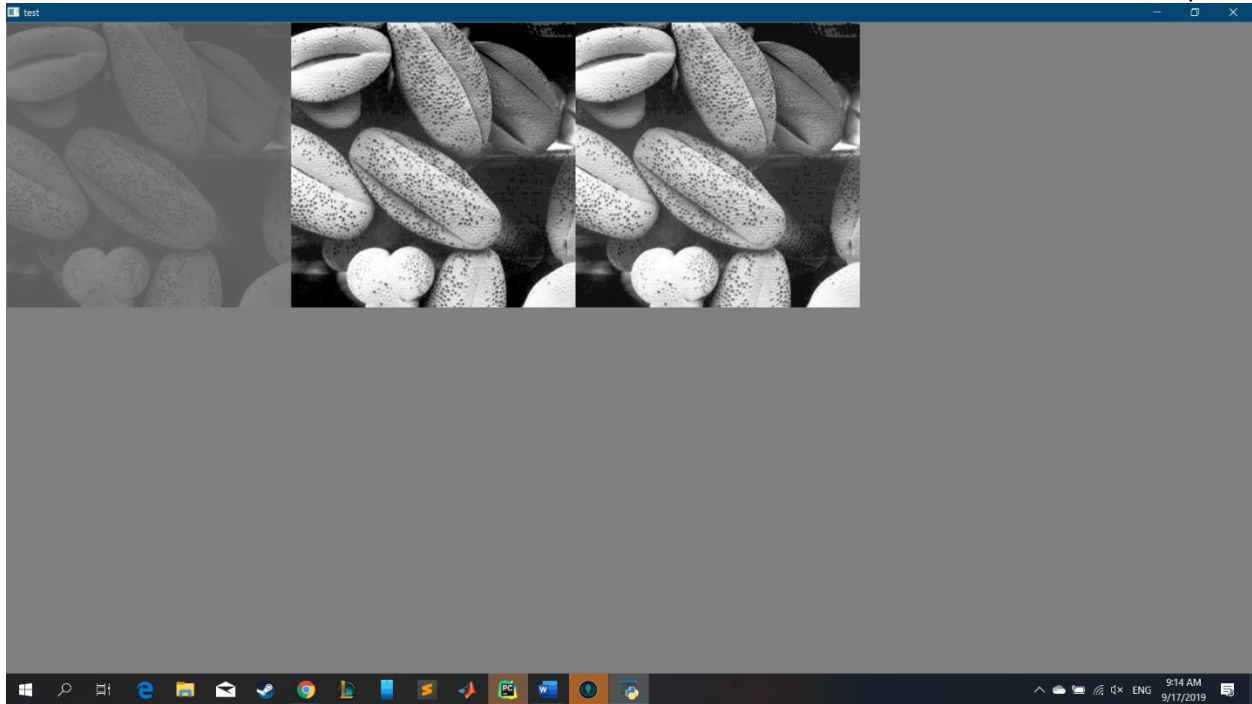


Figure 15 Image 316 Results left to right: original, cv2.equalizationHist(), personal algorithm

Overall, my results were quite satisfactory and compared well to the ideal end result. As can be seen by the results from image 308, the results of histogram equalization utilizing all pixels is not necessarily an improvement in all cases.