

CO543 - Image Processing

E/17/219

Lab 2

```
In [2]: #importing libraries
import numpy as np
import cv2 as cv
import matplotlib.pyplot as plt

# #imporot the patch for the google colab
from google.colab.patches import cv2_imshow
```

```
In [3]: #specifying the folder in the google drive
folder_name = '/content/drive/MyDrive/CO543-Image Processing/Lab2/'
```

1. Image thresholding

Lab Task 01

Write a function to perform image thresholding using point processing taking the image file and the threshold value from the user.

```
In [4]: #function definition
def img_thresholding(img,thresholdvalue):
    ret,result = cv.threshold(img,thresholdvalue,255,cv.THRESH_BINARY)

    return result
```

```
In [5]: #lets import an image from the google drive
img = cv.imread(folder_name + 'high_contrast.tif',0)
img
```

```
Out[5]: array([[ 0,  0,  0, ..., 102, 102,  89],
 [ 0,  0,  0, ...,  94,  97,  81],
 [ 0,  0,  0, ...,  71,  75,  57],
 ...,
 [ 24,  0,  0, ..., 201, 193, 192],
 [ 32, 11,  0, ..., 192, 187, 176],
 [ 45, 23,  0, ..., 184, 183, 162]], dtype=uint8)
```

```
In [6]: #display the loaded img
cv2_imshow(img)
```





```
In [7]: #lets apply the function to the image  
threshold_img = img_thresholding(img,127)  
threshold_img
```

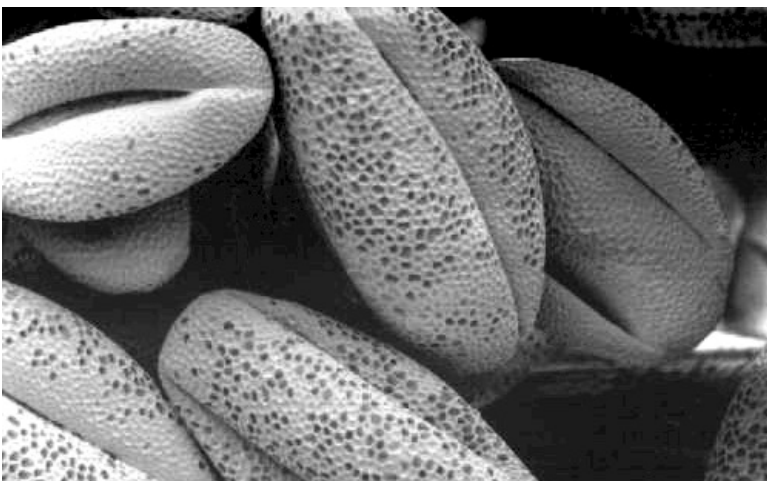
```
Out[7]: array([[ 0,  0,  0, ...,  0,  0,  0],  
          [ 0,  0,  0, ...,  0,  0,  0],  
          [ 0,  0,  0, ...,  0,  0,  0],  
          ...,  
          [ 0,  0,  0, ..., 255, 255, 255],  
          [ 0,  0,  0, ..., 255, 255, 255],  
          [ 0,  0,  0, ..., 255, 255, 255]], dtype=uint8)
```

```
In [8]: #view the image  
cv2_imshow(threshold_img)
```



```
In [9]: #comparison between the input and the output  
print("This is the input")  
cv2_imshow(img)  
print("\nThis is the output")  
cv2_imshow(threshold_img)
```

This is the input





This is the output



2. Image arithmetic operations

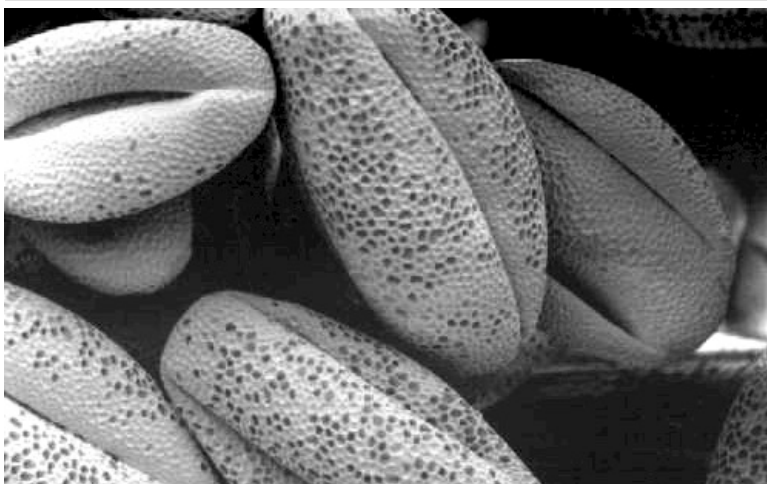
Lab Task 02

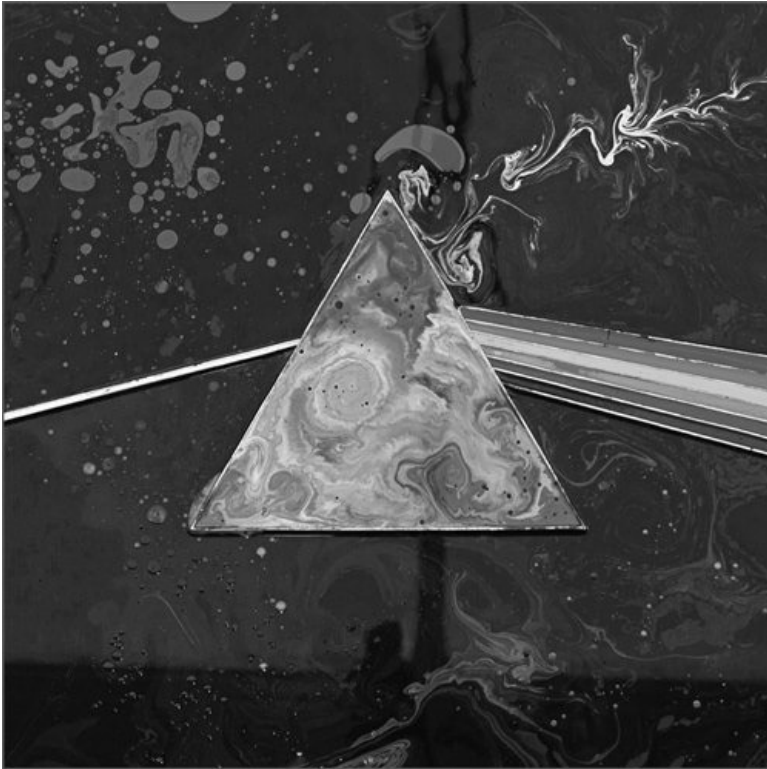
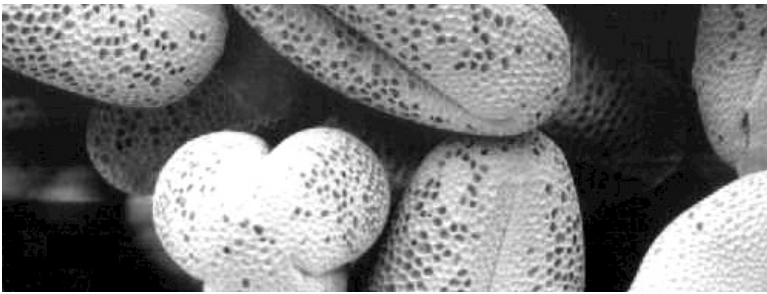
Read two images and perform addition and subtraction.

```
In [10]: #loading two images
img_1 = cv.imread(folder_name + 'high_contrast.tif',0)
img_2 = cv.imread(folder_name + 'prism.jpg',0)

#display two images
cv2.imshow(img_1)
cv2.imshow(img_2)

#inspect the values in the first two rows
img_1[0,:10],img_2[0,:10]
```





Out[10]: (array([0, 0, 0, 0, 0, 0, 0, 0, 0, 0], dtype=uint8),
array([105, 96, 97, 102, 99, 97, 99, 100, 100, 96], dtype=uint8))

In [11]: `#addition using normal matrix addition`
`add_img = img_1 + img_2`

`#inspect the values in the first two rows`
`add_img[0,:10]`

Out[11]: array([105, 96, 97, 102, 99, 97, 99, 100, 100, 96], dtype=uint8)

In [12]: `#subtraction using normal matrix subtraction`
`sub_img = img_1 - img_2`

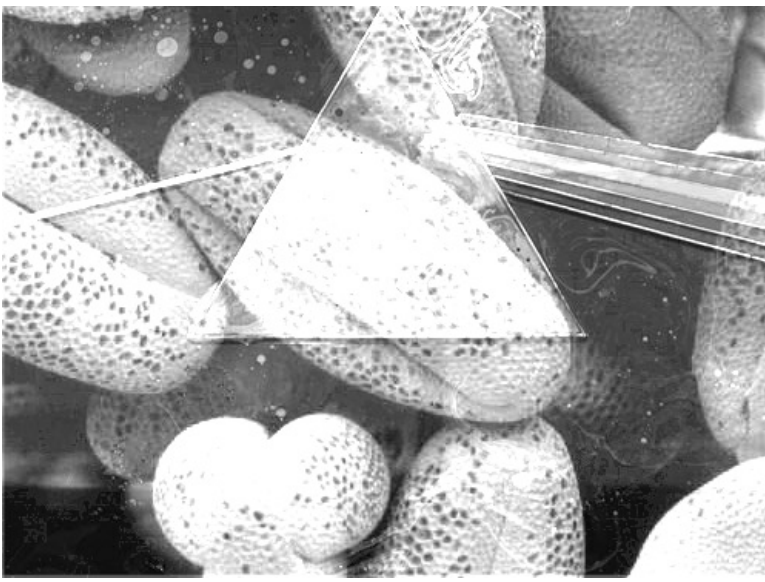
`#inspect the values in the first two rows`
`sub_img[0,:10]`

Out[12]: array([151, 160, 159, 154, 157, 159, 157, 156, 156, 160], dtype=uint8)

In [13]: `#use inbuilt functions`
`inbuilt_add = cv.add(img_1,img_2)`
`cv2_imshow(inbuilt_add)`

`inbuilt_sub = cv.subtract(img_1,img_2)`
`cv2_imshow(inbuilt_sub)`





Note : There is a difference between in-built addition and the normal matrix addition.

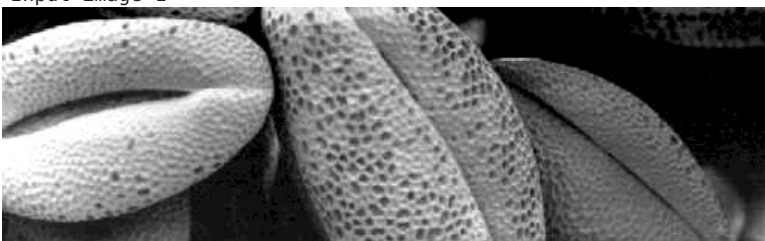
- 1.If we use normal addition, if the addition is greater than 255, then the resulting pixel will have addition-255 value(so the modulus of the addition by 255 is taken). This is because, matrix is typecasted to have uint8. That means only values from 0 to 255 are allowed.
- 2.If we use in-built method, if the addition is greater than 255, the resulting pixel will always have the intensity as 255.

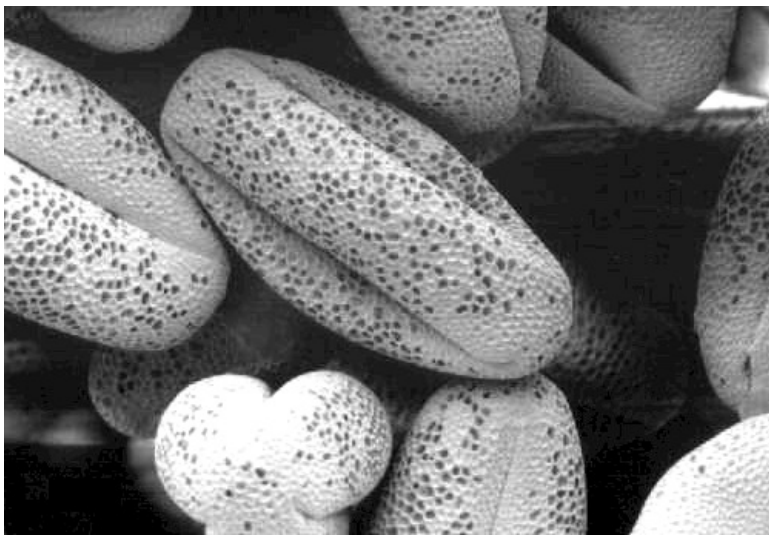
This is also the case for subtraction as well.

In [14]:

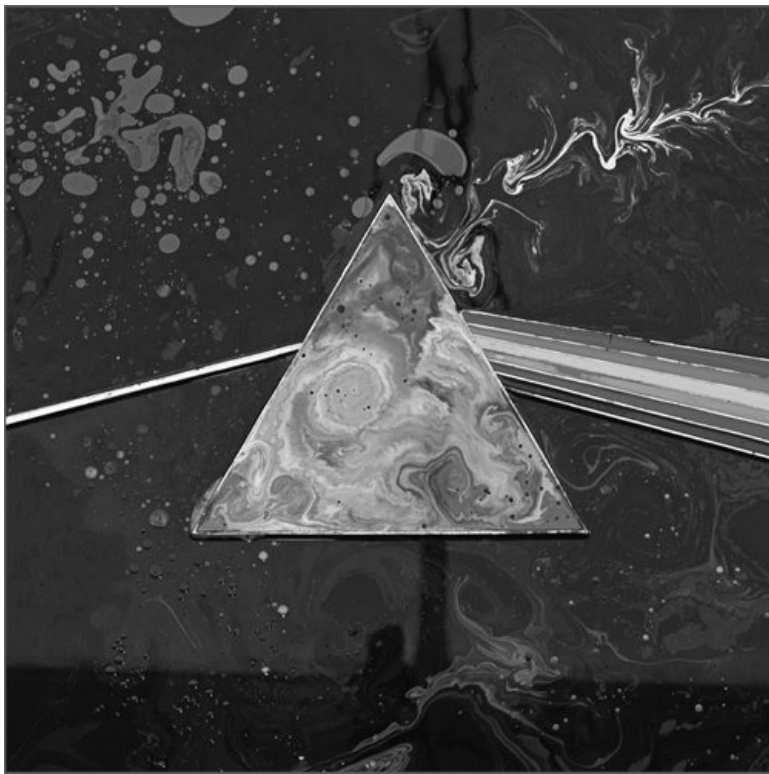
```
#lets compare inputs and outputs
print("Input image 1")
cv2_imshow(img_1)
print("\nInput image 2")
cv2_imshow(img_2)
print("\nAddition of the inputs")
cv2_imshow(inbuilt_add)
print("\nSubtraction of the outputs")
cv2_imshow(inbuilt_sub)
```

Input image 1





Input image 2



Addition of the inputs



Substraction of the outputs



3. Spatial Processing

1. Write simple programs to demonstrate the following. Show the original and resultant images in the same figure to compare them easily.
 - a. Log transformation
 - b. Power transformation
 - c. Contrast Stretching
 - d. Gray level slicing
 - e. Bit plane slicing

1.Log transformation

```
In [15]: #function definition
def log_transform(img):
    c = 255 / np.log(1+np.max(img))
    log_img = c * (np.log(img)+1)

    log_img = np.array(log_img,dtype=np.uint8)

    return log_img
```

```
In [16]: #apply the transform to the image
log_img = log_transform(img_2)

#lets compare the image and the results
log_img,img_2
```

/usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:4: RuntimeWarning: divide by zero encountered in log
after removing the cwd from sys.path.

```
Out[16]: (array([[ 4, 255,  0, ..., 255,  2,  4],
        [255, 245, 238, ..., 240, 247, 253],
        [255, 238, 220, ..., 232, 245, 253],
        ...,
        [254, 229, 200, ..., 213, 235, 253],
        [ 3, 250, 246, ..., 244, 251,  3],
        [ 1, 253, 254, ..., 255,  1,  4]], dtype=uint8),
```

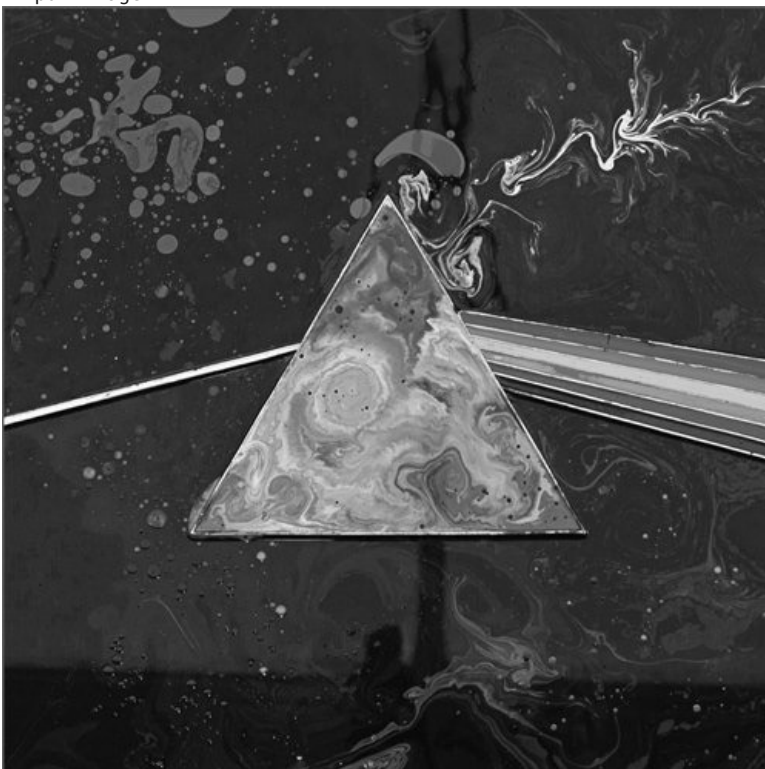
```
array([[105, 96, 97, ..., 95, 101, 106],
       [ 94, 76, 66, ..., 69, 80, 90],
       [ 96, 66, 44, ..., 57, 76, 91],
       ...,
       [ 93, 54, 29, ..., 38, 61, 91],
       [103, 85, 78, ..., 74, 87, 103],
       [ 99, 91, 92, ..., 94, 100, 106]], dtype=uint8))
```

```
In [17]: #display the result
cv2_imshow(log_img)
```

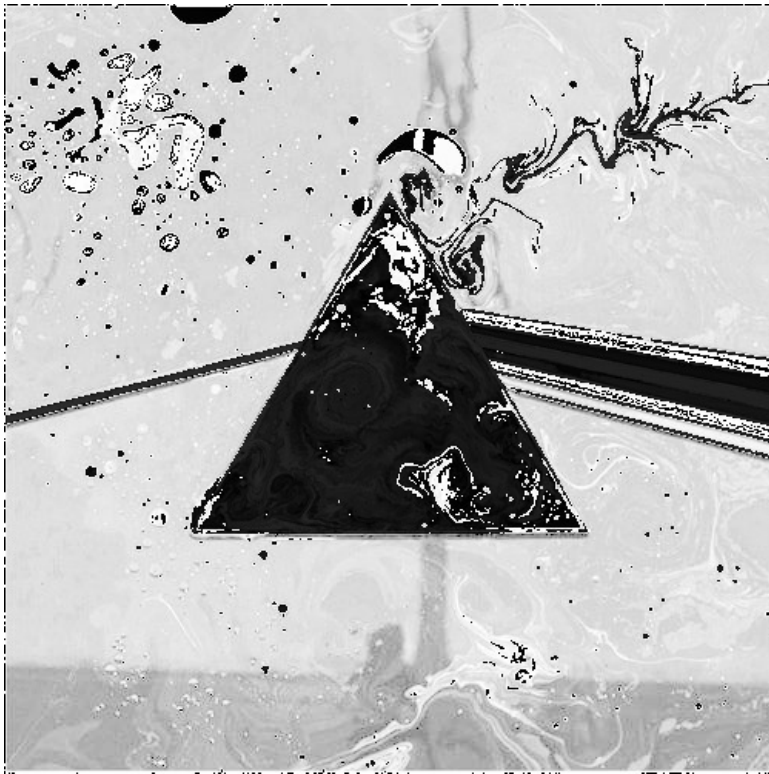


```
In [18]: #lets compare inputs and outputs
print("Input image")
cv2_imshow(img_2)
print("\nOutput image")
cv2_imshow(log_img)
```

Input image



Output image



2.Power transformation

```
In [66]: #function definition
def powerTransformation(img, gamma):

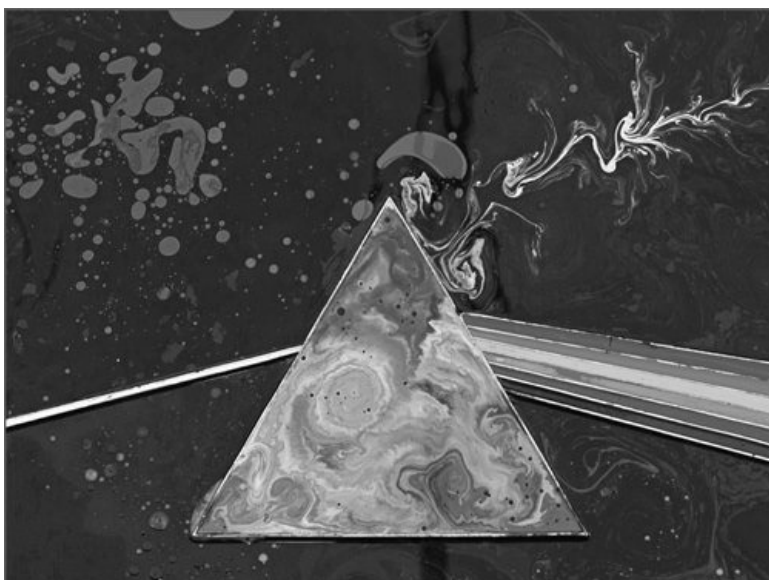
    #stores the lookuptable
    lookUpTable = np.empty((1,256), np.uint8)

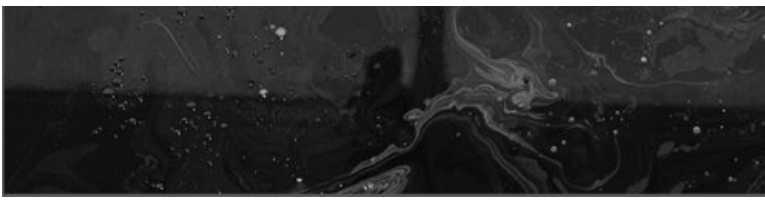
    #assign values to lookup table
    for i in range(256):
        #np.clip will clip values from 0 to 255
        lookUpTable[0,i] = np.clip(pow(i / 255.0, gamma) * 255.0, 0, 255)

    #return the resulting function after applying look-up table
    return cv.LUT(img, lookUpTable)
```

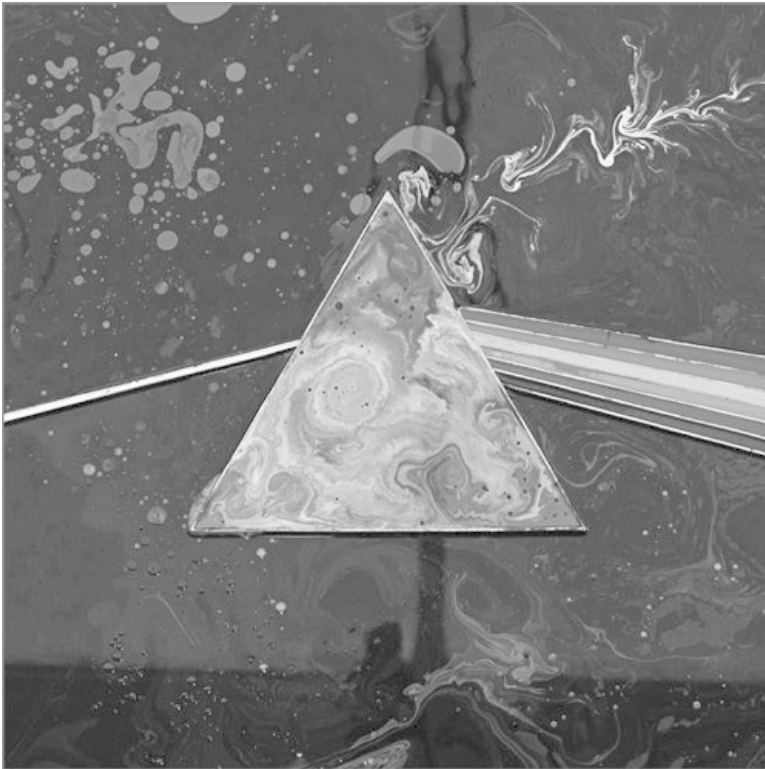
```
In [68]: #lets compare inputs and outputs
print("Input image")
cv2_imshow(img_2)
print("\nOutput image")
cv2_imshow(powerTransformation(img_2,0.5))
```

Input image





Output image



3. Contrast Stretching

```
In [71]: #function definition for contrast stretching each pixel
def contrastStretching(pixel_value, r1, s1, r2, s2):

    #using the first linear function
    if (0 <= pixel_value and pixel_value <= r1):
        return int((s1 / r1) * pixel_value)

    #using the second linear function
    elif (r1 < pixel_value and pixel_value <= r2):
        return int(((s2 - s1)/(r2 - r1)) * (pixel_value - r1) + s1)

    #using the third linear function
    else:
        return int(((255 - s2)/(255 - r2)) * (pixel_value - r2) + s2)

#function definition for contrast stretching an image
def contrast_streching(img, r1, s1, r2, s2):
    #vectorizing
    vector_for_contrast_stretching = np.vectorize(contrastStretching)

    #apply image
    contrastStretchedImg = vector_for_contrast_stretching(img_2, r1, s1, r2, s2)

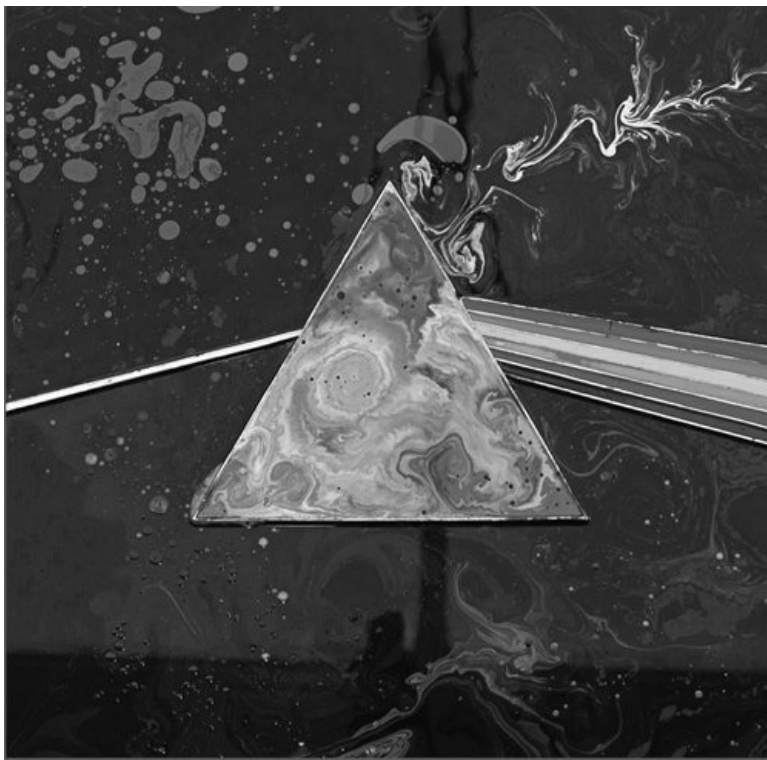
    return contrastStretchedImg
```

```
In [77]: #applying functions
contrast_streched_img = contrast_streching(img_2, 80, 10, 100, 200)
```

```
In [78]: #lets compare inputs and outputs
print("Input image")
cv2_imshow(img_2)
print("\nOutput image")
cv2_imshow(contrast_streched_img)
```

Input image





Output image



4. Grey Level Slicing

```
In [79]: #function definition for grey slicing each pixel
def greySlicing(pixel, A, B, T):

    #if the pixel is within the given period
    #increase it by given height
    if(A <= pixel <= B):
        return pixel + T

    #otherwise return without incrementing
    return pixel

#wrapper function to apply that to an image
def grey_slicing(img,A,B,T):
```

```
# Vectorising
vector = np.vectorize(greySlicing)

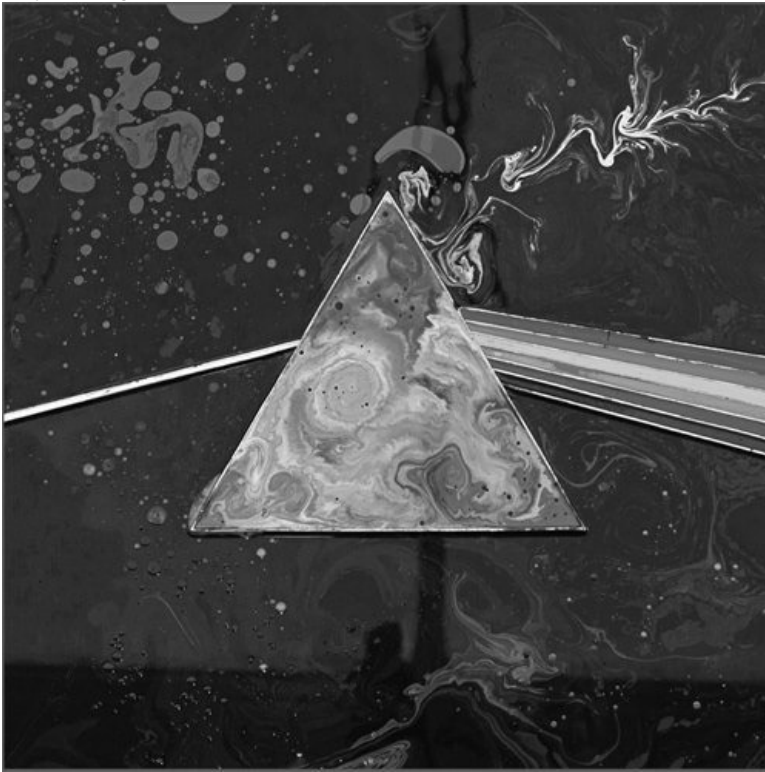
#Applying for the image
grey_sliced_img = vector(img, A, B, T)

return grey_sliced_img
```

```
In [82]: #applying functions
grey_sliced_img = grey_slicing(img_2, 80, 150,150)
```

```
In [83]: #lets compare inputs and outputs
print("Input image")
cv2_imshow(img_2)
print("\nOutput image")
cv2_imshow(grey_sliced_img)
```

Input image



Output image



5.Bit Plane Slicing

```
In [85]: # function definition for biplane slicing each pixel
def bitPlaneSlicing(pixel, bit):

    #checking if the given pixel have 1 in the given bit
    if( pixel & (1 << (bit - 1))):
        return pixel

    #if not return 0
    return 0

#wrapper function to apply that to an image
def bit_plane_slicing(img,bit):

    # Vectorising
    vector = np.vectorize(bitPlaneSlicing)

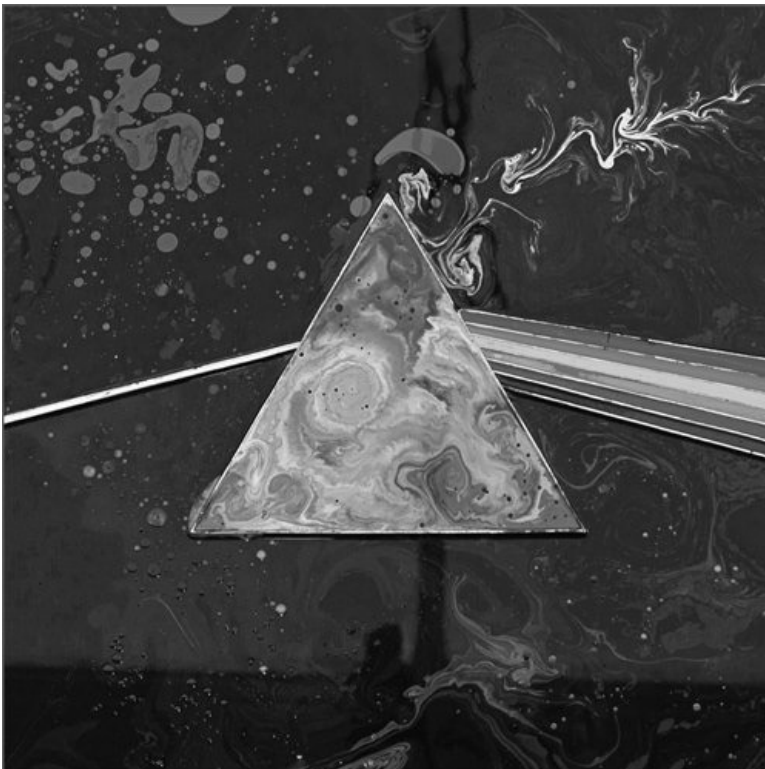
    #Applying for the image
    bit_plane_sliced_img = vector(img,bit)

    return bit_plane_sliced_img
```

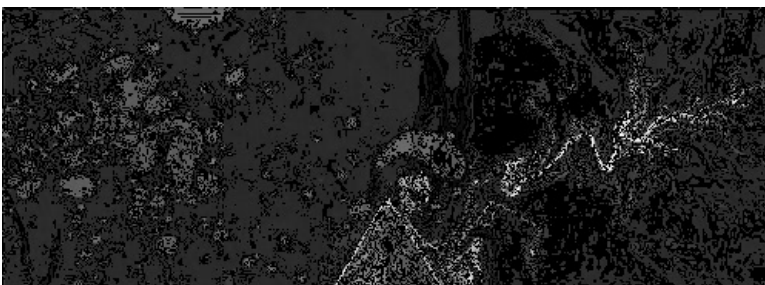
```
In [86]: #applying functions
bit_plane_sliced_img = bit_plane_slicing(img_2,4)
```

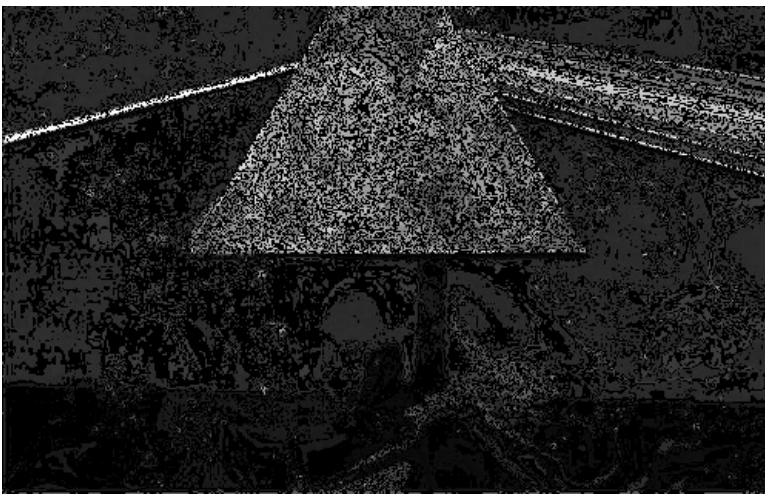
```
In [87]: #lets compare inputs and outputs
print("Input image")
cv2_imshow(img_2)
print("\nOutput image")
cv2_imshow(bit_plane_sliced_img)
```

Input image



Output image





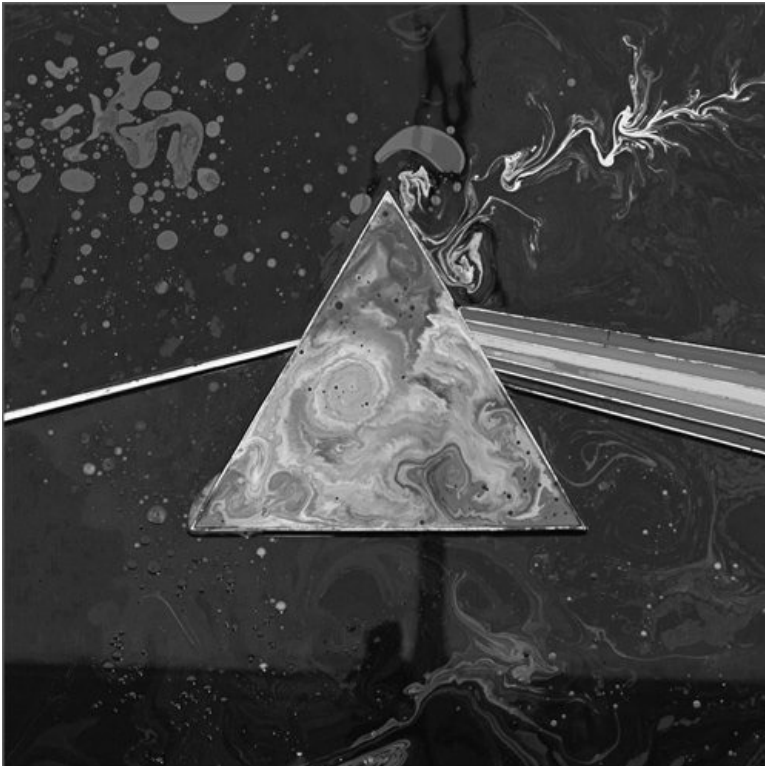
Consider the graph for a typical transformation function used for Contrast Stretching in the given figure and determine the behavior of the function with respect to given changes.

a. When $r_1 = s_1$ and $r_2 = s_2$

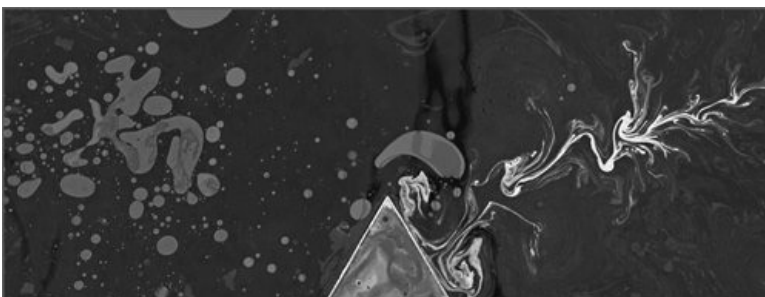
```
In [88]: #apply the transformation
contrast_streched_img = contrast_strehing(img_2, 80, 80, 100, 100)

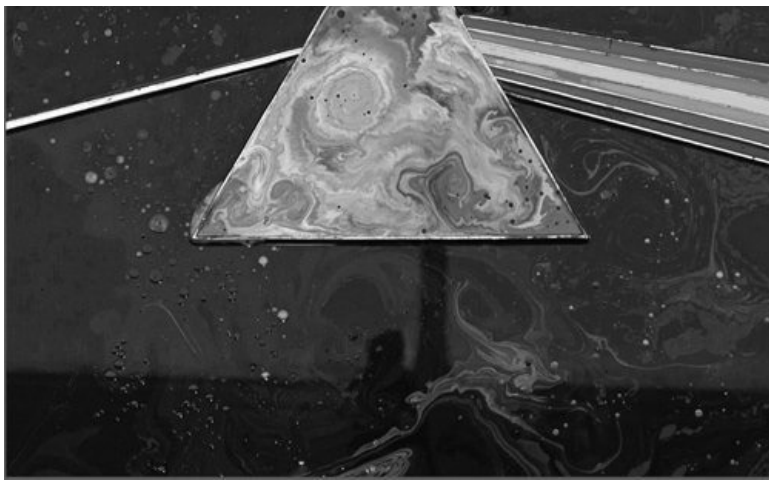
#see the changes
print("Input image")
cv2_imshow(img_2)
print("\nOutput image")
cv2_imshow(contrast_streched_img)
```

Input image



Output image





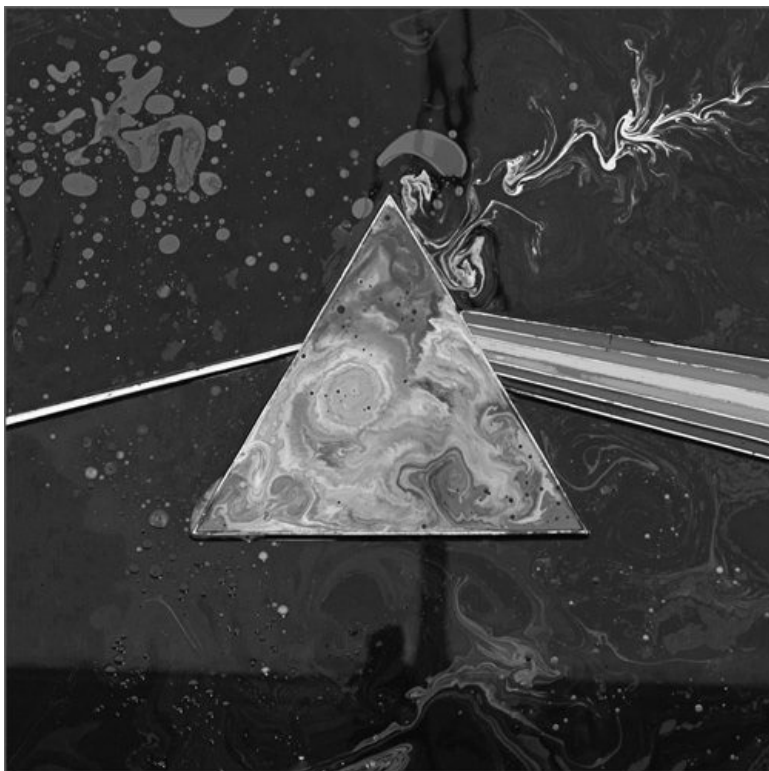
Therefore , when $r_1=s_1$ and $r_2=s_2$ since the two points matches with each other this will not do any effects to the original image

b. When $r_1=r_2$, $s_1=0$ and $s_2=L-1$

```
In [89]: #apply the transformation
contrast_streched_img = contrast_strehing(img_2, 80, 0, 80, 255)

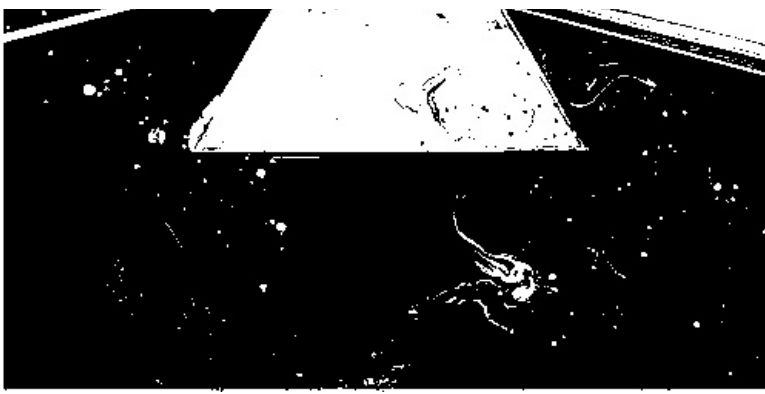
#see the changes
print("Input image")
cv2_imshow(img_2)
print("\nOutput image")
cv2_imshow(contrast_streched_img)
```

Input image



Output image



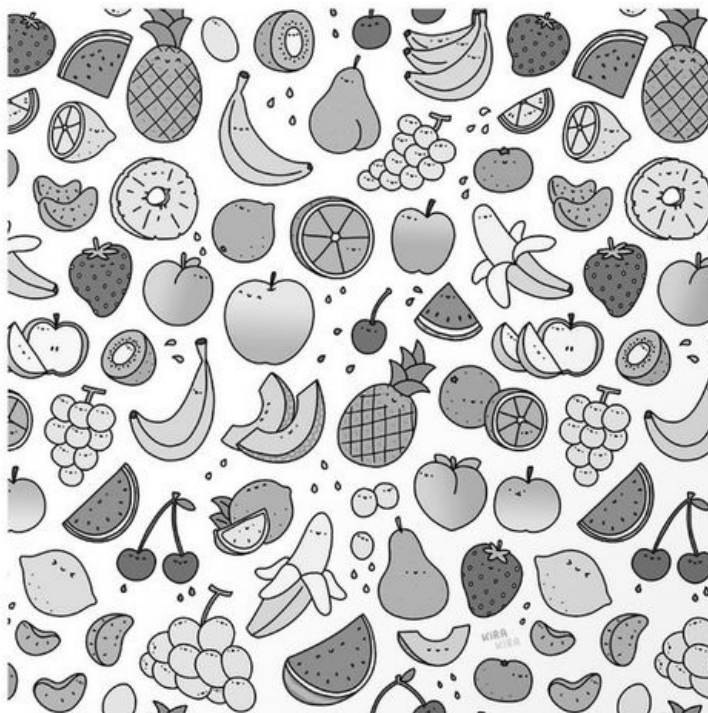


Therefore when $r1=r2$, $s1=0$ and $s2=L-1$, the image intensity values changes between a certain range. This is similar to thresholding.

4.Masking

Write a program to read any image, resize it to 256x256. Apply the masks shown in following figures so that only the middle part of the image is visible.

```
In [21]: #lets load an image for this task
fruits_img = cv.imread(folder_name + 'fruits.jpg',0)
cv2_imshow(fruits_img)
```



```
In [22]: #implementation of the rectangular mask
def rect_masking(img,thickness):

    #resizing the original image to 256x256
    resized_img = cv.resize(img,(256,256))

    #applying the rectangle mask to the image
    rect_image = cv.rectangle(resized_img, (0,0), (256,256), color=0, thickness=thickness)

    return rect_image
```

```
In [23]: #see the results of rect_masking()
rect_img = rect_masking(fruits_img,50)
```



```
cv2_imshow(rect_img)
```



In [24]:

```
#implementation of the circular mask
def circular_masking(img):

    #resizing the original image to 256x256
    resized_img = cv.resize(img,(256,256))

    #applying the circular mask to the image
    circular_image = cv.circle(resized_img, (128,128), radius=175, color=0, thickness=100)

    return circular_image
```

In [25]:

```
#see the results of circular_masking()
circular_img = circular_masking(fruits_img)
cv2_imshow(circular_img)
```

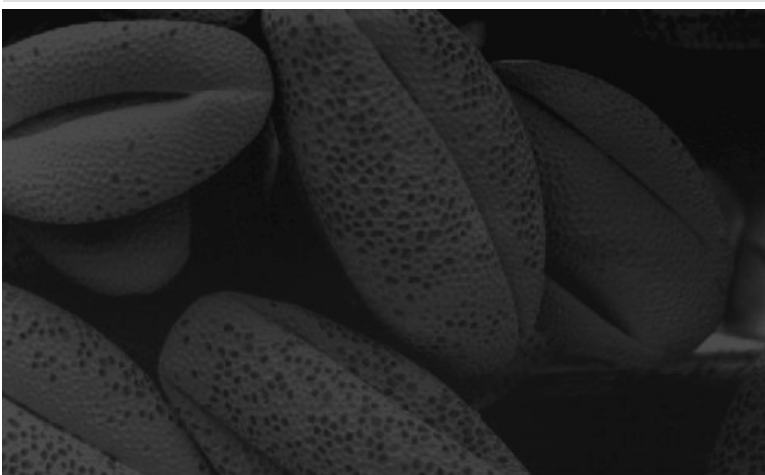


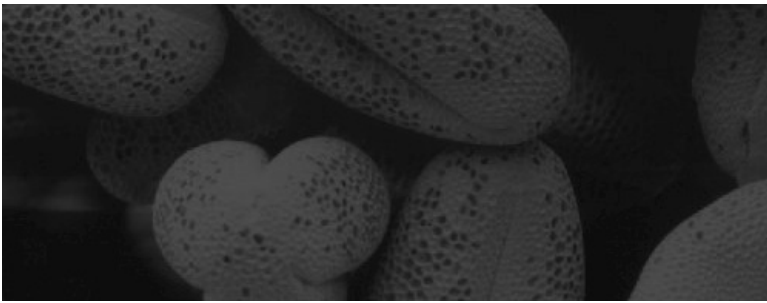
5.Brightness

Write your own Python OpenCV function `addbrightness()` and use it to increase brightness of a given image.(Hint: Use Image arithmetic operations)

In [26]:

```
#lets load an image for this task
dark_img = cv.imread(folder_name + 'dark.tif',0)
cv2_imshow(dark_img)
```





```
In [27]: #implementation of the addbrightness()
def addbrightness(img,brightness_level):
    output_img = []
    for i in img:
        row = []
        for j in i:
            newValue = j + brightness_level
            if (newValue >=255):
                newValue = 255
            row.append(newValue)
        output_img.append(np.array(row))
    return np.array(output_img)
```

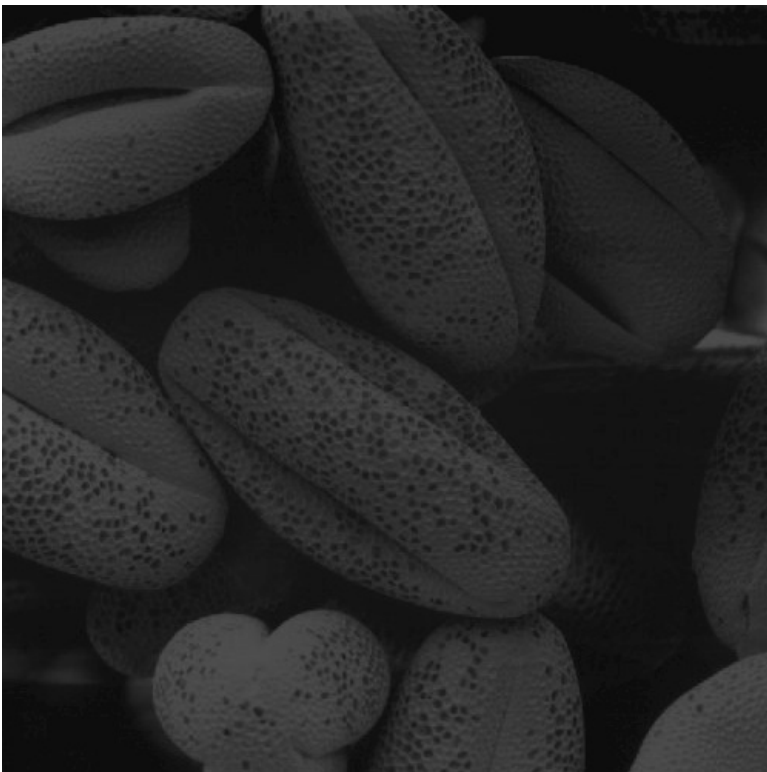
```
In [28]: #show the results
print("Original Image")
cv2_imshow(dark_img)

print("\nOutput when brightness level is 20")
cv2_imshow(addbrightness(dark_img,20))

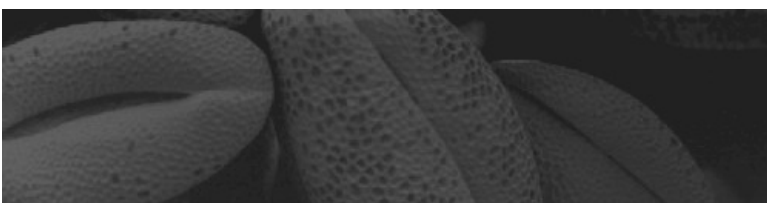
print("\nOutput when brightness level is 50")
cv2_imshow(addbrightness(dark_img,50))

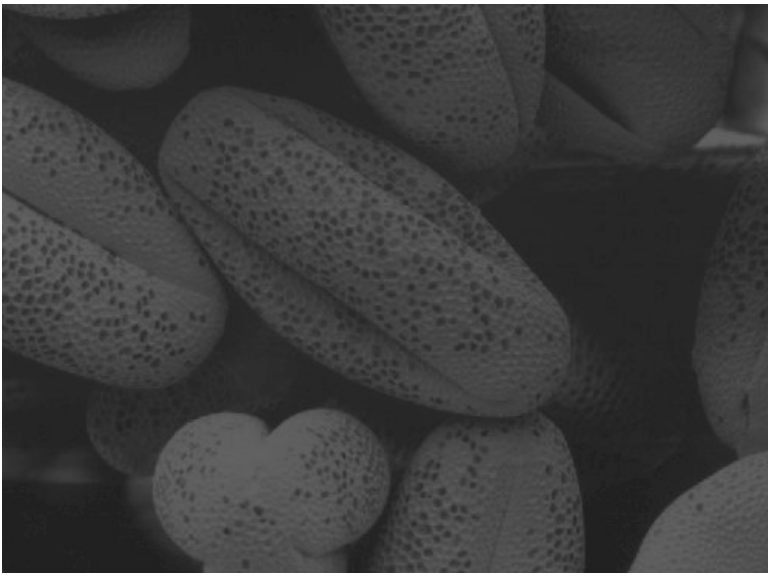
print("\nOutput when brightness level is 100")
cv2_imshow(addbrightness(dark_img,100))
```

Original Image

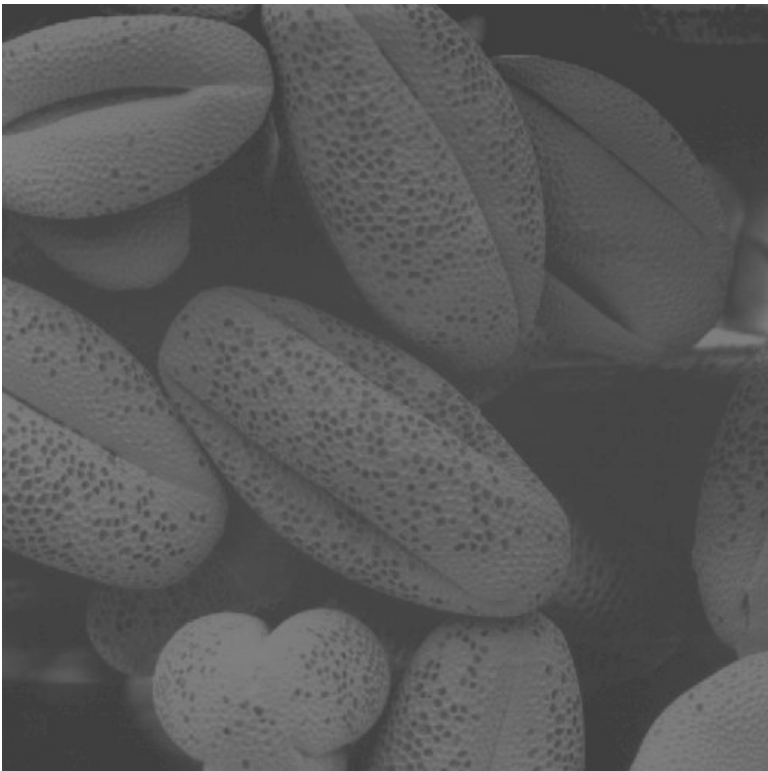


Output when brightness level is 20

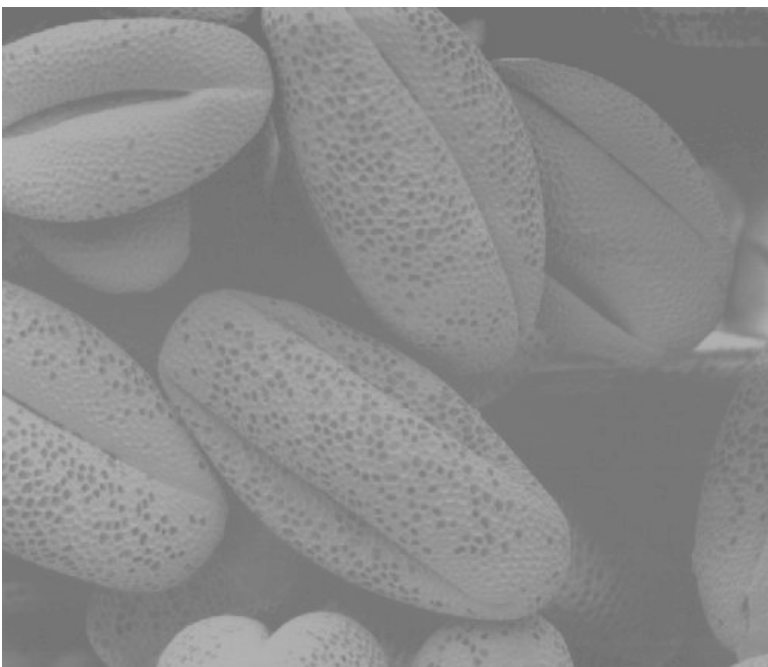




Output when brightness level is 50



Output when brightness level is 100

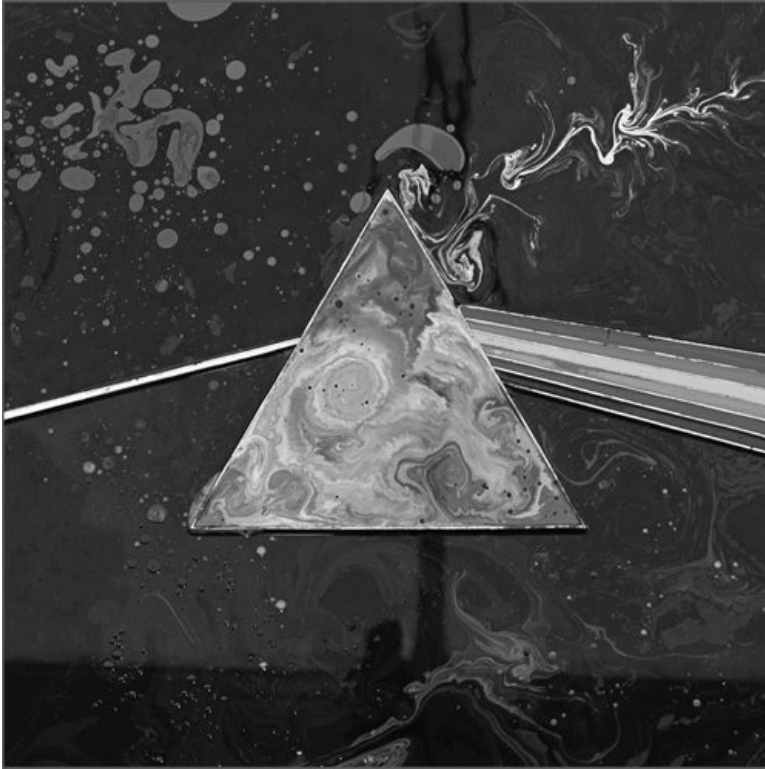


6. Histogram Processing

1. Histogram Calculation in OpenCV

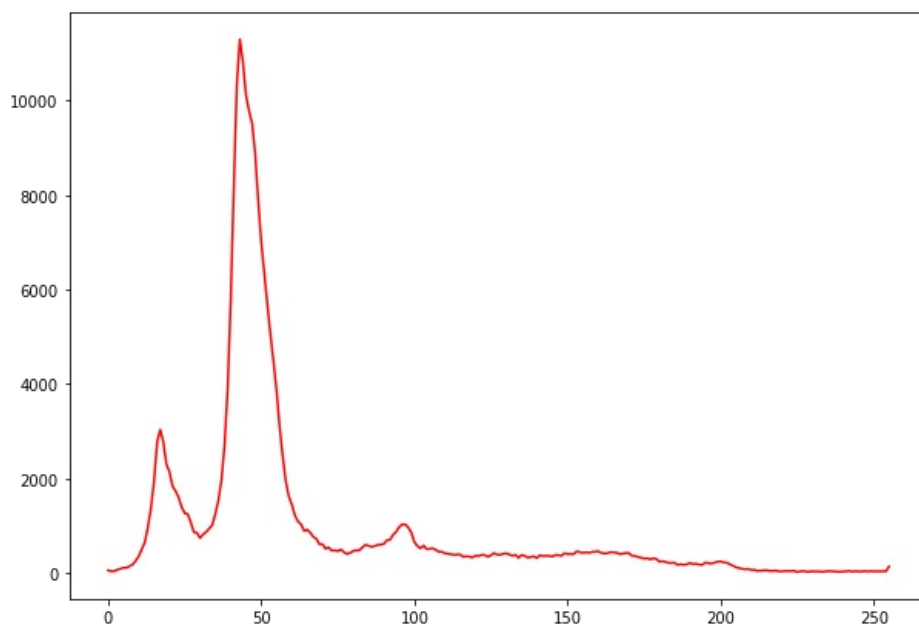
Use inbuilt OpenCV `cv2.calcHist()` function to display the histogram of a given image.

```
In [29]: #below is the image for this  
cv2.imshow('img_2')
```



```
In [30]: #showing the histogram using calcHist  
plt.figure(figsize=(10,7))  
histogram = cv.calcHist([img_2],[0],None,[256],[0,256])  
plt.plot(histogram,c='red')
```

```
Out[30]: [<matplotlib.lines.Line2D at 0x7f13089b1bd0>]
```

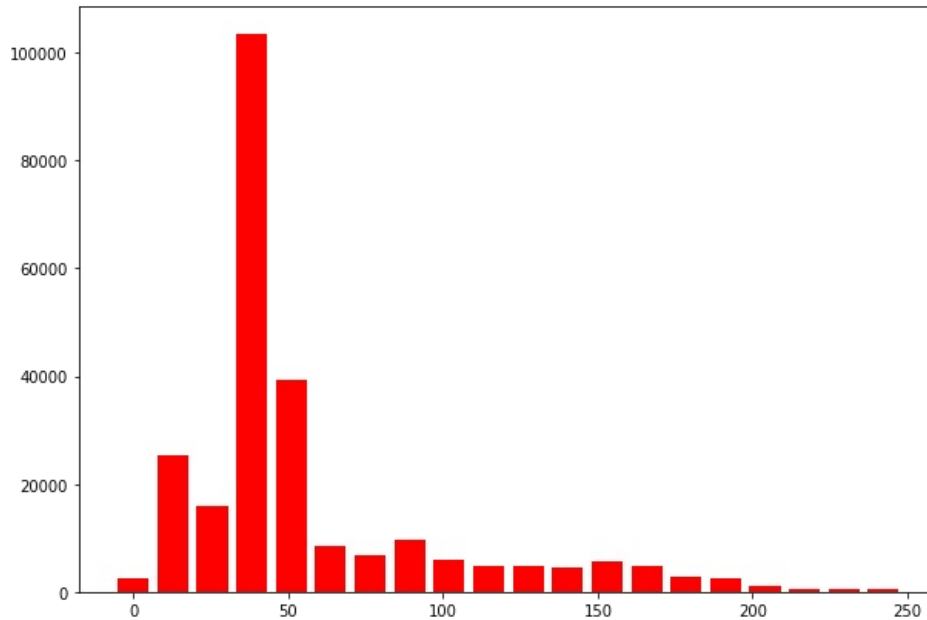


1. Histogram Calculation in Numpy

Use inbuilt numpy `np.histogram()` function to display the histogram of a given image.

```
In [31]: #showing the histogram using numpy histogram
plt.figure(figsize=(10,7))
frequency, bin = np.histogram(img_2, bins=20, range=None, normed=None, weights=None, density=None)
plt.bar(bin[:-1],frequency,width=10,color='red')
```

Out[31]: <BarContainer object of 20 artists>



1. Then write your own histogram functions for the following scenarios

- Show a histogram plot for a grayscale image.
- Show three histograms for a given RGB image.

Part a

```
In [32]: #implementation for greyscale image histogram
def plot_hist_gryescale(img,number_of_bins):
    """
    This function calculates the bin array and the frequency array of a grey
    scaled image.

    img : the image which is to be find the histogram
    number_of_bins : bin number in the histogram

    """

    #first calculate the bin array

    #get the size of one bin
    sizeOfBin = 255 / number_of_bins

    #this array stores the range of each bin
    bin_Array = np.zeros(number_of_bins+1)

    #assgin ranges of bins to the array
    for i in range(len(bin_Array)):
        bin_Array[i] = sizeOfBin*i

    #then calculate the frequency array

    #this array stores the frequency of each range
    frequency = np.zeros(number_of_bins,dtype='uint')

    #iterate through every pixel value in the image
    for i in img:
        for j in i:

            #if the pixel intensity is 255, that pixel belongs to the last bin
            if j == 255:
                frequency[-1] += 1
```

```

        continue

    #for every other intensity value,
    #compare with each range and assign accordingly
    for counter in range(len(bin_Array)-1):
        if bin_Array[counter] <= j < bin_Array[counter+1]:
            frequency[counter] += 1
            continue

    #return the bin array and the frequency
    return bin_Array,frequency

```

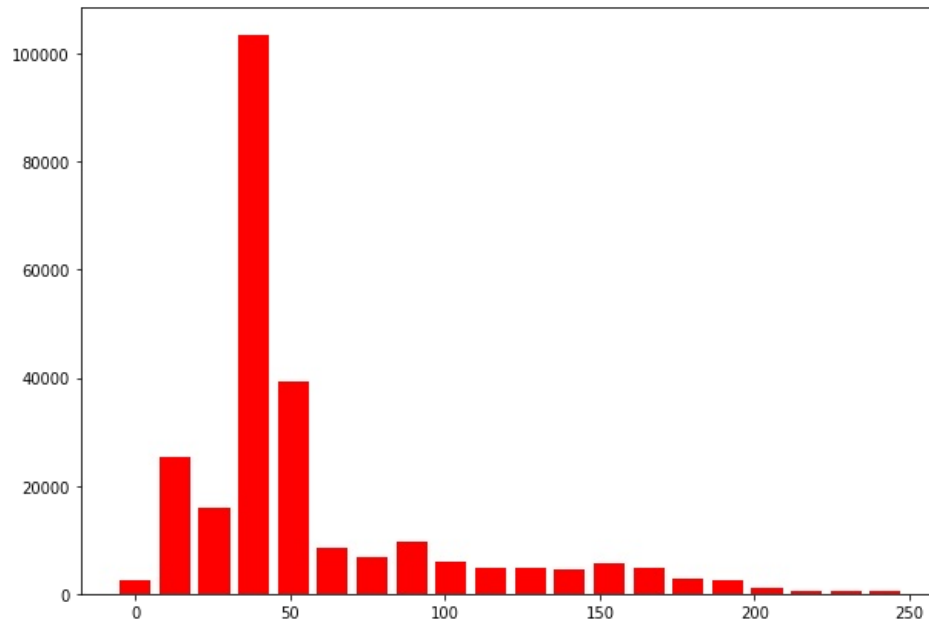
```

In [33]: #get the bins and the frequencies
bin, frequency = plot_hist_gryescale(img_2,number_of_bins=20)

#showing the histogram
plt.figure(figsize=(10,7))
plt.bar(bin[:-1],frequency,width=10,color='red')

```

Out[33]: <BarContainer object of 20 artists>



Part b

```

In [34]: #implementation for rgb image histogram
def plot_hist_rgb(img,number_of_bins):
    """
    This function calculates the bin array and the frequency array of a
    rgb image.

    img : the image which is to be find the histogram
    number_of_bins : bin number in the histogram

    """

    #first calculate the bin array

    #get the size of one bin
    sizeOfBin = 255 / number_of_bins

    #this array stores the range of each bin
    bin_Array = np.zeros(number_of_bins+1)

    #assgin ranges of bins to the array
    for i in range(len(bin_Array)):
        bin_Array[i] = sizeOfBin*i

    #then calculate the frequencies of r,g,b

    #this array stores the frequency of each range
    frequency_r = np.zeros(number_of_bins,dtype='uint')
    frequency_g = np.zeros(number_of_bins,dtype='uint')
    frequency_b = np.zeros(number_of_bins,dtype='uint')

    #iterate through every pixel value in the image
    for i in img:
        for j in i:

```

```

#get each color
red = j[0]
green = j[1]
blue = j[2]

#if the pixel intensity is 255, that pixel belongs to the last bin
if red == 255:
    frequency_r[-1] += 1

elif green == 255:
    frequency_g[-1] += 1

elif blue == 255:
    frequency_b[-1] += 1

#for every other intensity value,
#compare with each range and assign accordingly
for counter in range(len(bin_Array)-1):

    if bin_Array[counter] <= red < bin_Array[counter+1]:
        frequency_r[counter] += 1

    if bin_Array[counter] <= green < bin_Array[counter+1]:
        frequency_g[counter] += 1

    if bin_Array[counter] <= blue < bin_Array[counter+1]:
        frequency_b[counter] += 1

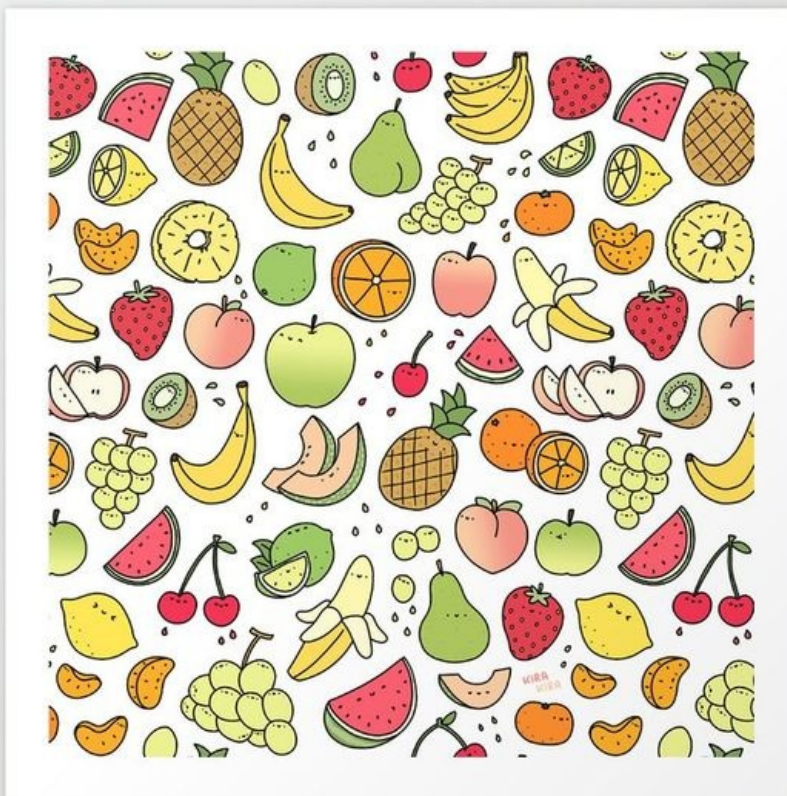
#return the bin array and the frequencies of each color
return bin_Array,frequency_r,frequency_g,frequency_b

```

```

In [35]: #let's load an image for this task
fruits_img = cv.imread(folder_name + 'fruits.jpg',1)
cv2_imshow(fruits_img)

```



```

In [41]: #get values after applying the function
bins, red_frequency, green_frequency, blue_frequency = plot_hist_rgb(fruits_img,number_of_bins=15)

```

```

In [52]: #plotting each histogram
plt.figure(figsize=(10,10))

plt.subplot(3,1,1)
plt.title("Red Histogram")
plt.bar(bins[:-1],red_frequency,width=15,color='red')

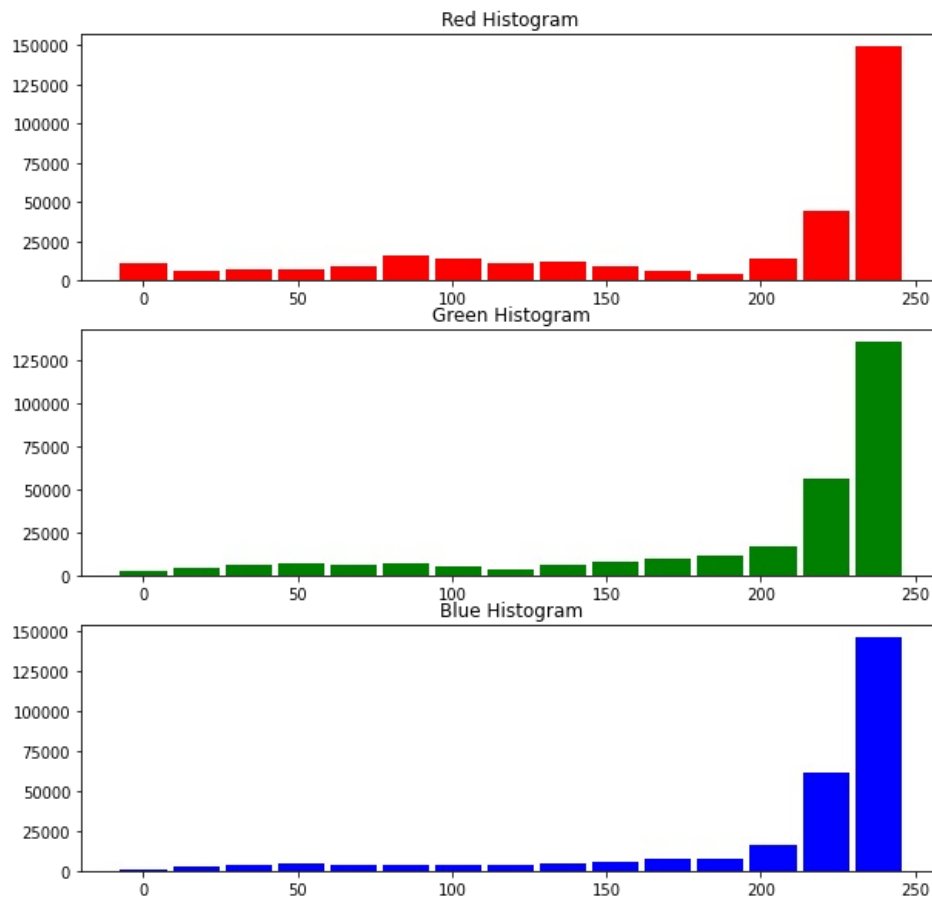
plt.subplot(3,1,2)

```

```
plt.title("Green Histogram")
plt.bar(bins[:-1],green_frekuensi,width=15,color='green')

plt.subplot(3,1,3)
plt.title("Blue Histogram")
plt.bar(bins[:-1],blue_frekuensi,width=15,color='blue')
```

Out[52]: <BarContainer object of 15 artists>

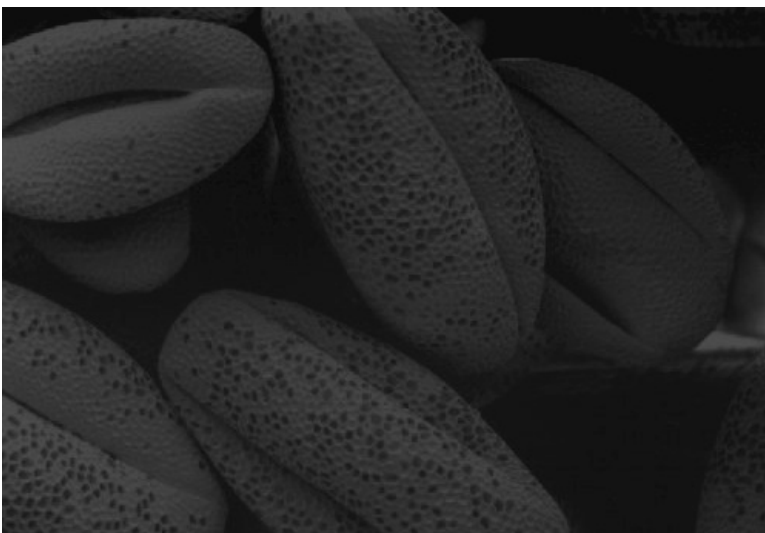


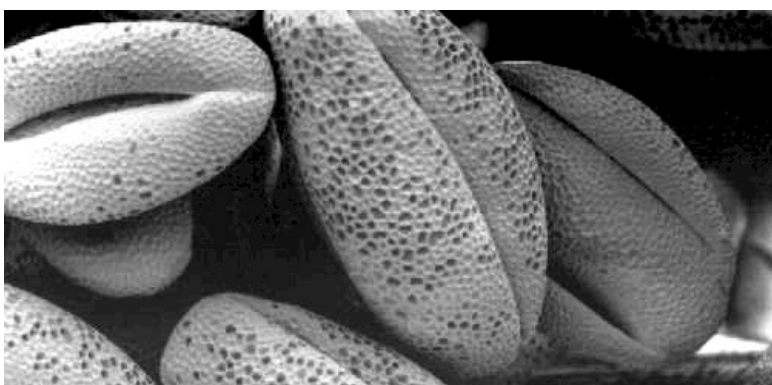
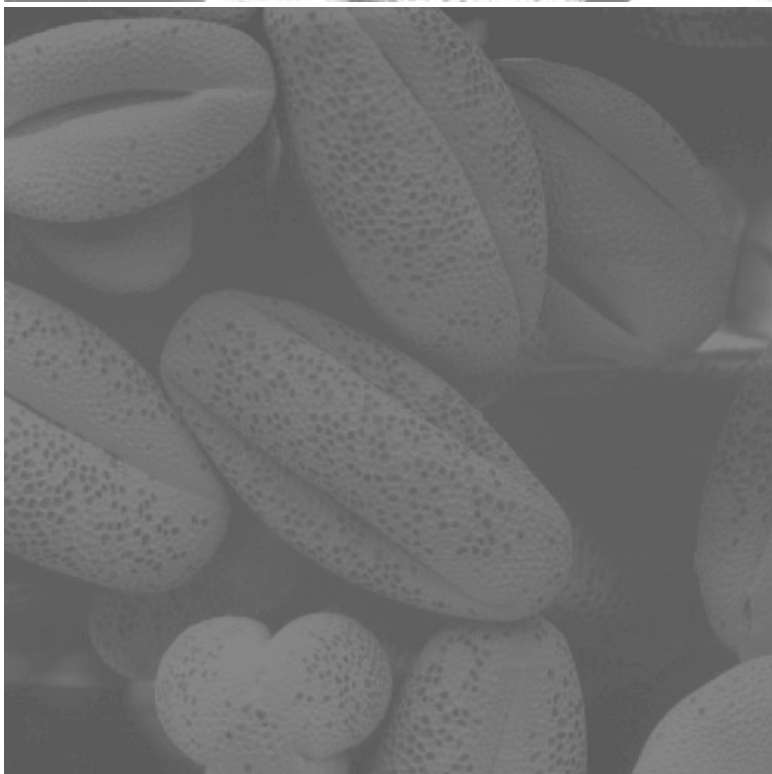
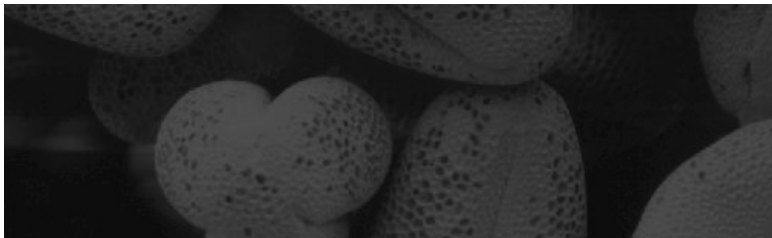
1. Consider the four images given in the resources folder. Plot the histogram for each image. Perform Histogram Equalization on each image and plot the histograms of the resultant images. Comment on the results you have obtained.

In [55]:

```
#first of all, let's load images from google drive
dark_img = cv.imread(folder_name + 'dark.tif',0)
bright_img = cv.imread(folder_name + 'bright.tif',0)
low_contrast_img = cv.imread(folder_name + 'low_contrast.tif',0)
high_contrast_img = cv.imread(folder_name + 'high_contrast.tif',0)

#displaying images
cv2.imshow('dark_img',dark_img)
cv2.imshow('bright_img',bright_img)
cv2.imshow('low_contrast_img',low_contrast_img)
cv2.imshow('high_contrast_img',high_contrast_img)
```







```
In [64]: #plotting histogram for each image
plt.figure(figsize=(14,14))

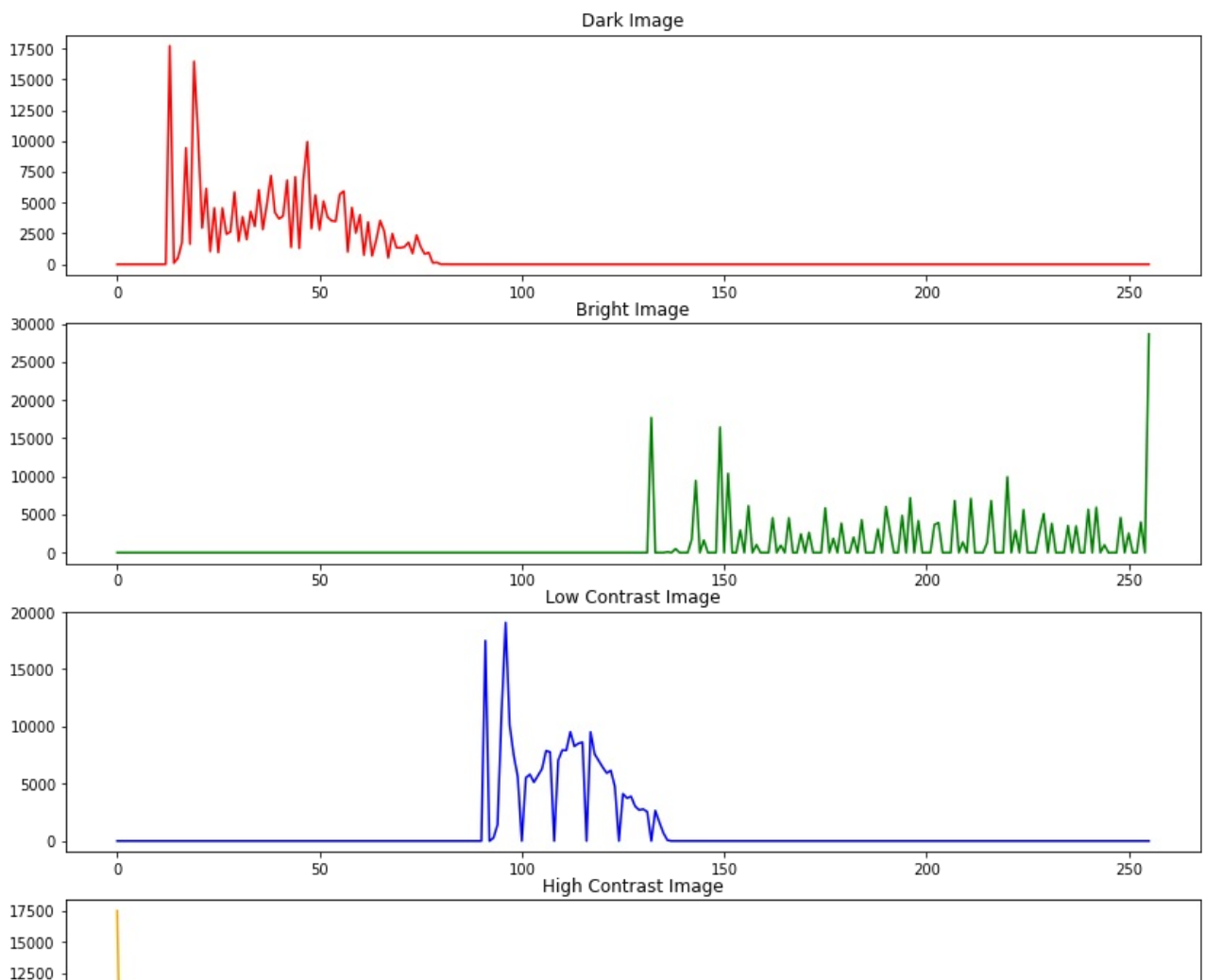
plt.subplot(4,1,1)
plt.title("Dark Image")
histogram1 = cv.calcHist([dark_img],[0],None,[256],[0,256])
plt.plot(histogram1,c='red')

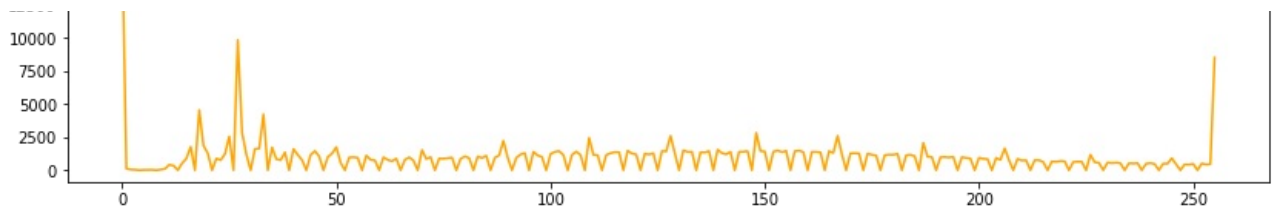
plt.subplot(4,1,2)
plt.title("Bright Image")
histogram2 = cv.calcHist([bright_img],[0],None,[256],[0,256])
plt.plot(histogram2,c='green')

plt.subplot(4,1,3)
plt.title("Low Contrast Image")
histogram3 = cv.calcHist([low_contrast_img],[0],None,[256],[0,256])
plt.plot(histogram3,c='blue')

plt.subplot(4,1,4)
plt.title("High Contrast Image")
histogram4 = cv.calcHist([high_contrast_img],[0],None,[256],[0,256])
plt.plot(histogram4,c='orange')
```

Out[64]: [<matplotlib.lines.Line2D at 0x7f1305383590>]





In [60]:

#performing equalization and plotting input and output after performing equalization

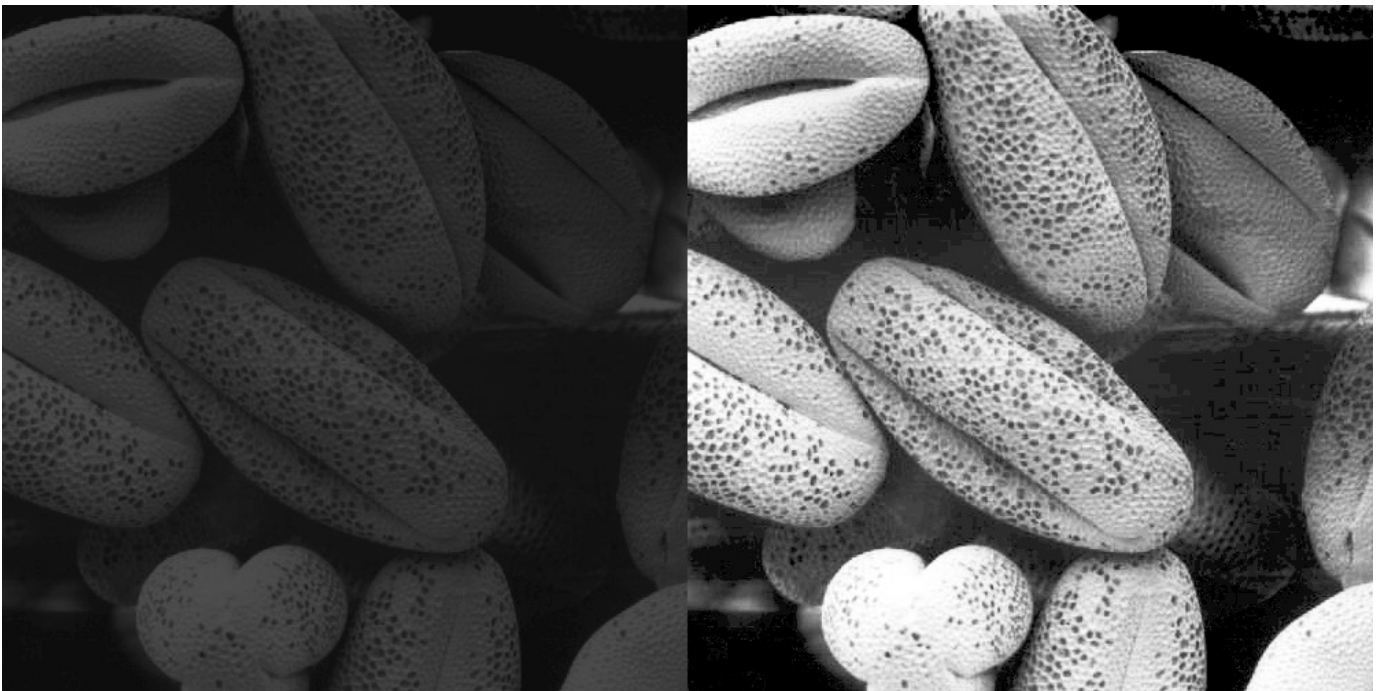
```
print("Performing equalization on the dark image")
equalized_dark = cv.equalizeHist(dark_img)
result1 = np.hstack((dark_img, equalized_dark))
cv2_imshow(result1)

print("\nPerforming equalization on the bright image")
equalized_bright = cv.equalizeHist(bright_img)
result2 = np.hstack((bright_img, equalized_bright))
cv2_imshow(result2)

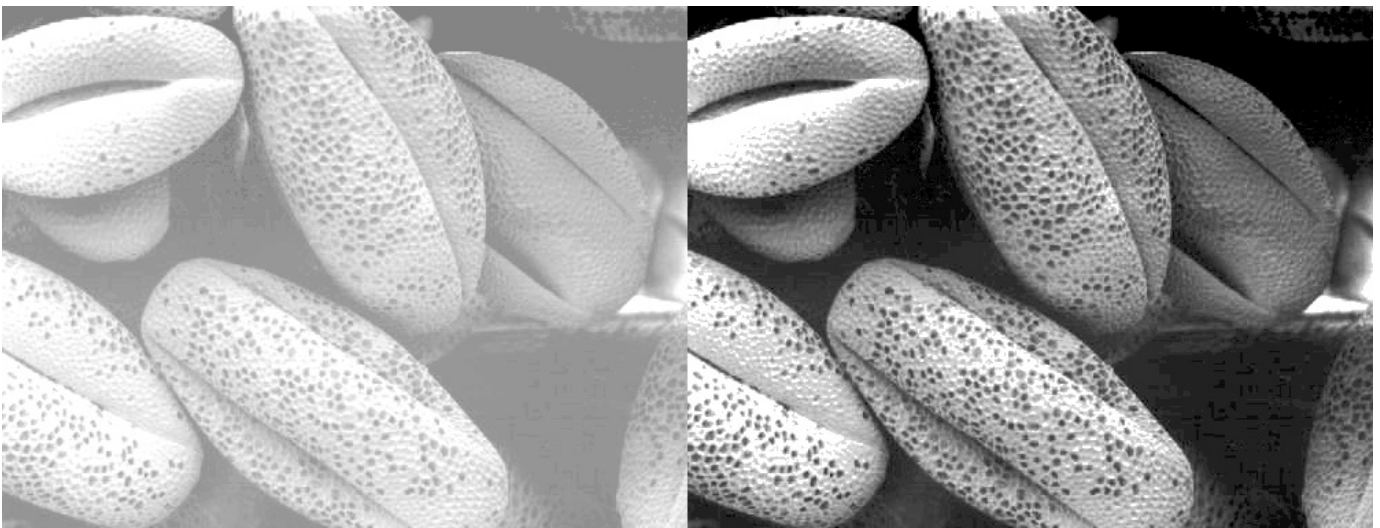
print("\nPerforming equalization on the low contrast image")
equalized_low_contrast = cv.equalizeHist(low_contrast_img)
result3 = np.hstack((low_contrast_img, equalized_low_contrast))
cv2_imshow(result3)

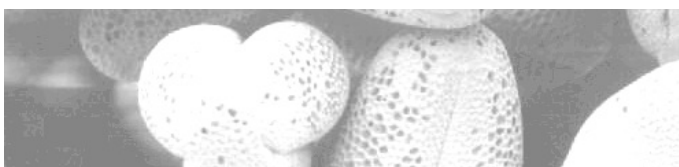
print("\nPerforming equalization on the high contrast image")
equalized_high_contrast = cv.equalizeHist(high_contrast_img)
result4 = np.hstack((high_contrast_img, equalized_high_contrast))
cv2_imshow(result4)
```

Performing equalization on the dark image

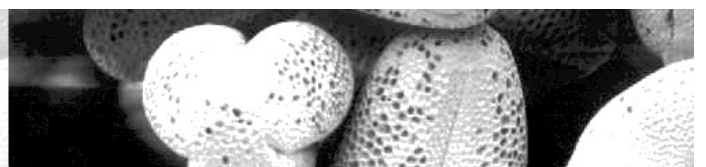
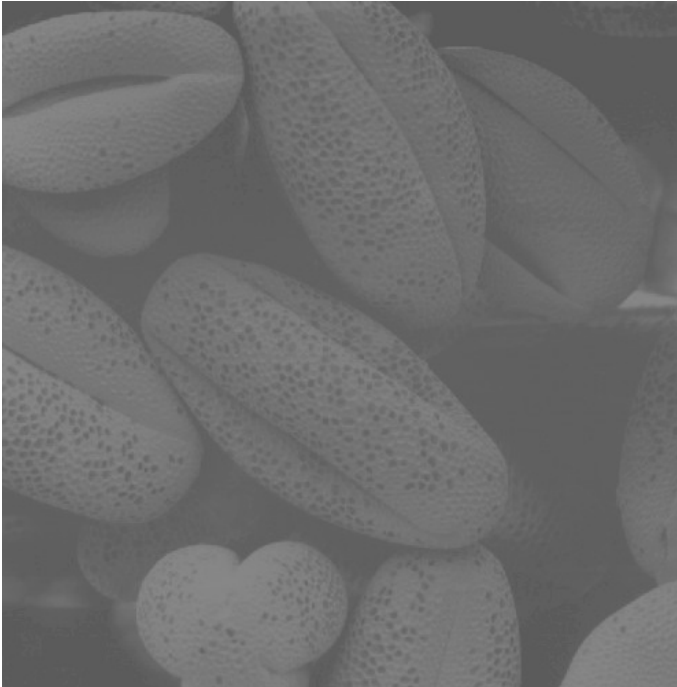


Performing equalization on the bright image





Performing equalization on the low contrast image



Performing equalization on the high contrast image



```
In [65]: #plotting histogram for each image after applying image equalization
plt.figure(figsize=(14,14))

plt.subplot(4,1,1)
plt.title("Dark Image")
histogram1 = cv.calcHist([equalized_dark],[0],None,[256],[0,256])
plt.plot(histogram1,c='red')

plt.subplot(4,1,2)
plt.title("Bright Image")
histogram2 = cv.calcHist([equalized_bright],[0],None,[256],[0,256])
plt.plot(histogram2,c='green')

plt.subplot(4,1,3)
plt.title("Low Contrast Image")
```



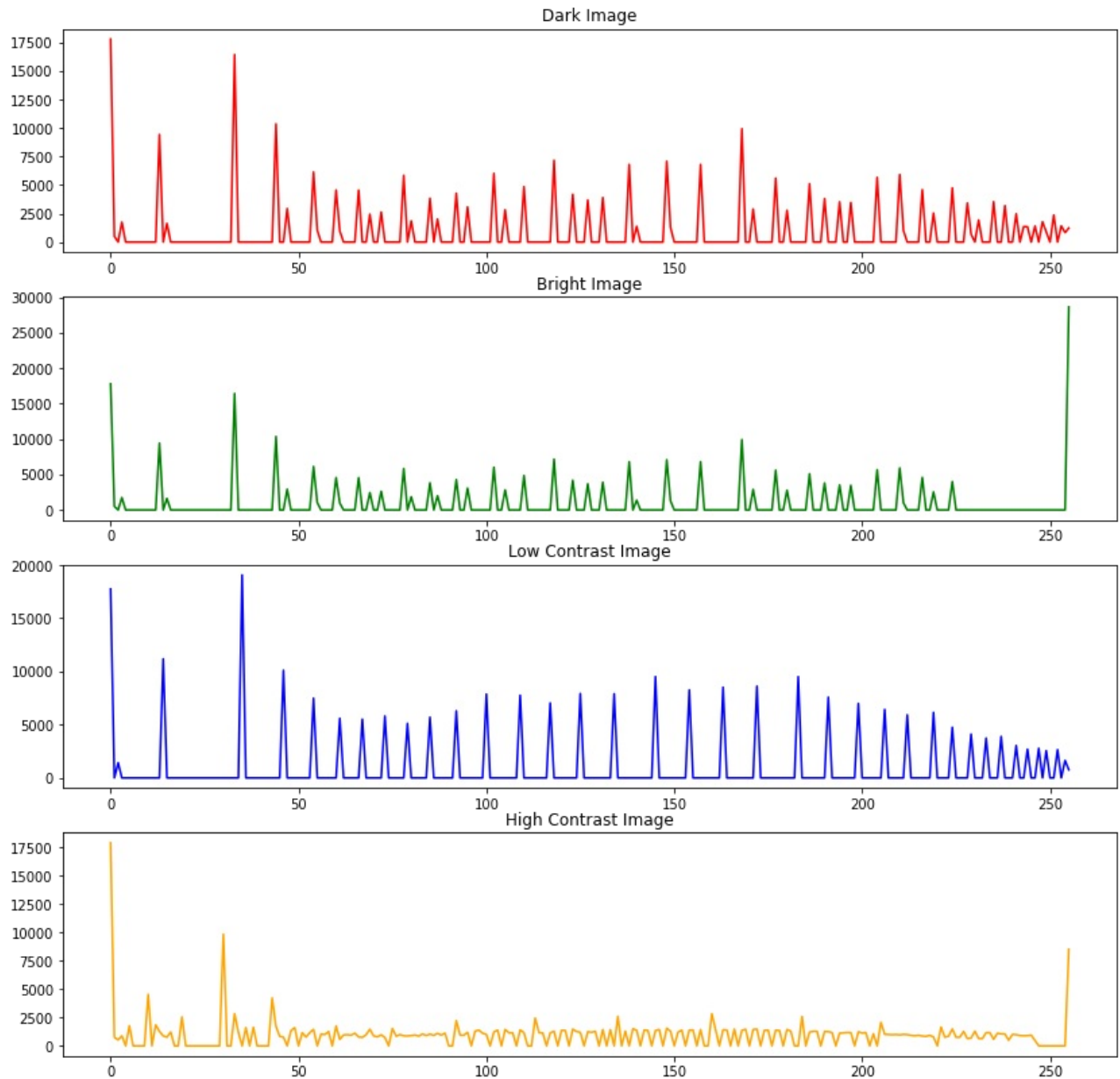
```

histogram3 = cv.calcHist([equlized_low_contrast],[0],None,[256],[0,256])
plt.plot(histogram3,c='blue')

plt.subplot(4,1,4)
plt.title("High Contrast Image")
histogram4 = cv.calcHist([equlized_high_contrast],[0],None,[256],[0,256])
plt.plot(histogram4,c='orange')

```

Out[65]: [



Observations

Before equalizing, images had colors which is limited to only a portion of the histogram.

But after performing the equalization, the resulting images have histograms with well spread frequencies over the full range of the histogram. This will result in much better contrast in the output image.