I have structured the project into 5 key sections. Below, I will share with you the steps I took together with insights for each section.

- 1. Importing Input Data
- 2. Basic Pre-processing of Input Data
- 3. Basic Understanding of Input Data
- 4. Exploratory Data Understanding of Input Data
- 5. Data Preparation of Input Data
- 6. Derive black and white images from original color images 6.1. Import cifar-10 original colored images 6.2 Preprocess cifar-10 original colored images 6.3 Import cifar-10 original colored images 6.4 Data Preparation Convert the first 50 cifar-10 colored training images to black & white using Python Imaging Library) 6.5 Data Verification Verify the black and white values are identical to input dataset (black white images))

Note: Click on the links to go to the respective section

```
import pandas as pd
%matplotlib inline
import numpy as np
import matplotlib.pyplot as plt
from sklearn.model_selection import train test split
from six.moves import cPickle
import tensorflow as tf
import tensorflow.keras as keras
from keras.datasets import cifar10
from sklearn.model selection import GridSearchCV
from sklearn.preprocessing import label binarize
import matplotlib.image as mpimg
from PIL import ImageFont, Image
import cv2
import seaborn as sns
import matplotlib
import matplotlib.pyplot as plt
from sklearn.metrics import confusion matrix, classification report
import itertools
%matplotlib inline
```

1. Importing Input Data

```
test_batch1=pd.read_pickle("IT3312/test_batch1.pkl")
train_batch1=pd.read_pickle("IT3312/train_batch1.pkl")
train_batch2=pd.read_pickle("IT3312/train_batch2.pkl")
train_batch3=pd.read_pickle("IT3312/train_batch3.pkl")
```

```
train_batch4=pd.read_pickle("IT3312/train_batch4.pkl")
train_batch5=pd.read_pickle("IT3312/train_batch5.pkl")
```

2. Basic Pre-processing Input Data

As mentioned in the official website, the CIFAR-10 dataset consists of 5 batches, named data_batch_1, data_batch_2, etc. Hence, let's concat the training data into one single data frame as one training batch

```
train_data=pd.concat([train_batch1,train_batch2,train_batch3,train_bat
ch4,train_batch5])
test_data=test_batch1
```

Lets prepare the training and testing data for EDA and model training later

```
X_train=train_data.iloc[:,:-1]
y_train=train_data['label']

X_test=test_data.iloc[:,:-1]
y_test=test_data['label']
```

Before we start data understanding, lets concat the training and testing data together to form a full dataframem

```
data=pd.concat([train_data,test_data])
```

3. Basic Data Understanding of Input Data

data												
	0	1	2	3	4	5	6	7	8	9	 1015	
1016	1017	\										
0	61	45	48	57	78	96	113	117	123	126	 96	
103	94											
1	171	134	103	101	130	164	187	195	152	116	 46	
66	91											
2	255	253	253	253	253	253	253	253	253	253	 79	
76	65											
3	24	33	34	37	39	36	37	22	26	31	 65	
81	67											
4	179	177	185	192	194	192	194	193	193	193	 84	
81	78											
9995	84	84	85	85	84	86	86	86	87	89	 168	
158	205											
9996	63	74	81	86	90	95	93	98	102	110	 146	
150	155											

```
9997
        16
              15
                    14
                          14
                                 13
                                       12
                                             11
                                                   10
                                                          9
                                                                8
                                                                           118
59
       28
9998
        32
              26
                    33
                          23
                                 24
                                       48
                                             71
                                                   87
                                                        110
                                                              133
                                                                           121
120
       121
9999
        76
             103
                   105
                          82
                                 63
                                     153
                                            225
                                                  186
                                                        132
                                                              226
                                                                           105
105
       104
       1018
              1019
                      1020
                             1021
                                    1022
                                            1023
                                                   label
                                              99
0
         72
                 83
                       145
                              189
                                      124
                                                        6
1
        115
               130
                       134
                              137
                                      138
                                             137
                                                        9
2
                                                        9
         62
                 68
                        76
                               83
                                       83
                                              84
3
         75
                 75
                        58
                               47
                                       56
                                              65
                                                        4
4
         79
                 75
                        74
                               78
                                       74
                                              76
                                                        1
                                                        8
9995
        226
                230
                       221
                              216
                                      213
                                             213
9996
        156
               158
                       179
                              143
                                      166
                                             164
                                                        3
                                                        5
9997
         29
                        27
                                              25
                 28
                               26
                                       27
9998
        114
                112
                       110
                              110
                                      110
                                             107
                                                        1
9999
        112
                111
                       109
                              113
                                       65
                                              26
                                                        7
[60000 rows x 1025 columns]
data.shape
(60000, 1025)
```

3.1 Understanding the structure of data

As shown in the shape of the data, the data set consist of 60000 rows which would refer to 60000 images. Each row has 1025 where the first 1024 is the matrix of the image and the last row is named as the label of the image

Hence, lets convert the data to X as the images dataframe and Y as the label dataframe

```
X=data.iloc[:,:-1]
v=data['label']
print(X.shape, y.shape)
(60000, 1024) (60000,)
Χ
                                                             8
      0
                    2
                           3
                                  4
                                         5
                                               6
                                                      7
                                                                    9
1014
0
         61
                45
                      48
                             57
                                    78
                                           96
                                                 113
                                                        117
                                                               123
                                                                     126
93
1
        171
               134
                     103
                            101
                                   130
                                          164
                                                 187
                                                        195
                                                               152
                                                                     116
23
        255
              253
                                   253
                                          253
                                                 253
                                                               253
2
                     253
                            253
                                                        253
                                                                     253
74
```

3	24	33	34	37	39	36	37	22	26	31	
81 4 88	179	177	185	192	194	192	194	193	193	193	
9995 214	84	84	85	85	84	86	86	86	87	89	
9996 158	63	74	81	86	90	95	93	98	102	110	
9997 123	16	15	14	14	13	12	11	10	9	8	
9998 124	32	26	33	23	24	48	71	87	110	133	
9999 100	76	103	105	82	63	153	225	186	132	226	
0 1 2 3 4	1015 96 46 79 65 84	1016 103 66 76 81 81	1017 94 91 65 67 78	1018 72 115 62 75 79	1019 83 130 68 75 75	1020 145 134 76 58 74	1021 189 137 83 47 78	1022 124 138 83 56 74	1023 99 137 84 65 76		
9995 9996 9997 9998 9999	168 146 118 121 105	158 150 59 120 105	205 155 28 121 104	226 156 29 114 112	230 158 28 112 111	221 179 27 110 109	216 143 26 110 113	213 166 27 110 65	213 164 25 107 26		
		x 1024									

Lets, find out why X has 1024? According to the original http://www.cs.toronto.edu/~kriz/cifar.html website, it was mentioned that the CIFAR-10 dataset consists of 60000 32x32 colour images in 10 classes, with 6000 images per class. There are 50000 training images and 10000 test images. Hence the 1024 is derived from 32 X 32 = 1024 where 32 represents the width and height of each image.

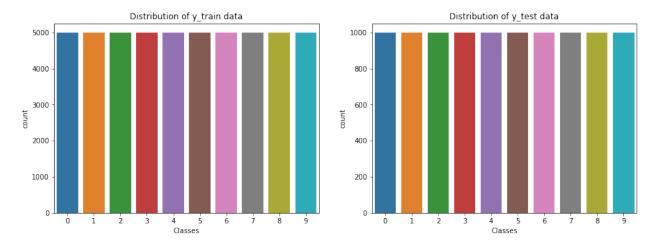
4. Exploratory Data Analysis of Input Data

4.1 Understanding distribution of classes

Now let's understand the distribution of classes across X_train, y_train, X_test, y_test to see whether the number of images for each classes are balanced

```
fig, axs = plt.subplots(1,2,figsize=(15,5))
# Count plot for training set
sns.countplot(y_train.ravel(), ax=axs[0])
axs[0].set_title('Distribution of y_train data')
```

```
axs[0].set xlabel('Classes')
# Count plot for testing set
sns.countplot(y test.ravel(), ax=axs[1])
axs[1].set title('Distribution of y test data')
axs[1].set xlabel('Classes')
plt.show()
C:\Users\JiaYi\anaconda3\envs\tf-gpu\lib\site-packages\seaborn\
decorators.py:36: FutureWarning: Pass the following variable as a
keyword arg: x. From version 0.12, the only valid positional argument
will be `data`, and passing other arguments without an explicit
keyword will result in an error or misinterpretation.
 warnings.warn(
C:\Users\JiaYi\anaconda3\envs\tf-gpu\lib\site-packages\seaborn\
decorators.py:36: FutureWarning: Pass the following variable as a
keyword arg: x. From version 0.12, the only valid positional argument
will be `data`, and passing other arguments without an explicit
keyword will result in an error or misinterpretation.
  warnings.warn(
```



As we can see, each classe contain exactly 6000 examples (5000 for training and 1000 for test).

The graph above is very important for the training, for example if we had just 1000 samples of label 1 that will be a problem, the model will find difficulties to detect label 1"less accuracy", so that's not going to happend everything look fine. It's important to know the distribution of dataset behind different classes because the goodness of our model depend on it.

Now let's doing some preprocessing.

The output variable have 10 posible values. This is a multiclass classification problem. We need to encode these lables to one hot vectors (ex: "bird" \rightarrow [0,0,1,0,0,0,0,0,0,0])

4.2 Understanding and Visualizing classes

Let's understand the labels and the different classes associated with the labels. In this dataset, classes are not stated. Hence, let's plot out the images for each label and do some statistical analysis

```
y.unique()
array([6, 9, 4, 1, 2, 7, 8, 3, 5, 0], dtype=uint8)
```

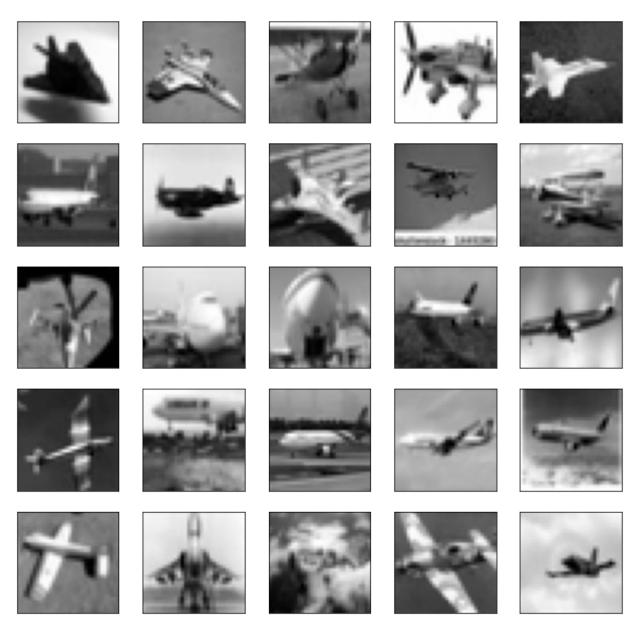
4.2.1 Class 0 - Airplanes

```
class_0=data[data['label']==0]
class_0.shape
(6000, 1025)
```

Before we plot, we would need to reshape the dataframe into matrix od 32 X 32 given the pixels format stated on the official website

```
import matplotlib.pyplot as plt

plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
    plt.imshow(class_0.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
    #plt.xlabel(class_names[y_train[i][0]])
plt.show()
```

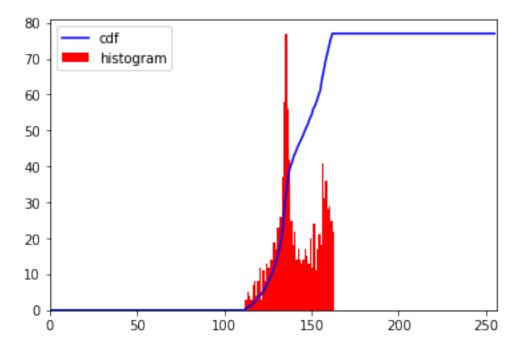


Now, lets visualize the avergae pixel of the class 0 and visualize on the histogram plot. I will be using cdf - Curmulative Distribution Function. It indicates the fraction of pixels with intensity less than or equal to i, assuming the image has N pixels.

class_0.iloc[:,:-1]											
	0	1	2	3	4	5	6	7	8	9	
1014	\										
29	203	203	205	207	209	210	211	213	214	216	
125											
30	119	116	120	120	123	123	125	126	123	125	
129											
35	250	246	246	247	248	247	247	247	248	247	

```
92
49
        255
               255
                      255
                            182
                                   180
                                          255
                                                 254
                                                        254
                                                               255
                                                                      255
206
         62
77
                65
                      69
                             75
                                    78
                                           78
                                                  78
                                                         79
                                                                79
                                                                       81
71
. . .
9973
        243
              242
                      243
                            241
                                   242
                                          244
                                                 242
                                                        238
                                                               236
                                                                      240
134
9980
        205
              207
                     209
                            209
                                   214
                                          219
                                                 220
                                                        216
                                                               211
                                                                      210
230
               157
                             89
                                           25
9983
        182
                     101
                                    65
                                                  34
                                                         38
                                                                27
                                                                       32
81
9987
        159
              158
                     148
                            150
                                          160
                                                 151
                                                               150
                                                                      149
                                   165
                                                        147
87
9991
        140
               141
                     142
                            142
                                   143
                                          143
                                                 144
                                                        144
                                                               144
                                                                      144
100
       1015
             1016
                    1017
                           1018
                                  1019
                                         1020
                                                1021
                                                       1022
                                                              1023
29
        147
               172
                      193
                            210
                                   224
                                          233
                                                 239
                                                        239
                                                               239
30
        129
               128
                      127
                            125
                                   124
                                          122
                                                 121
                                                        119
                                                               114
35
        102
               103
                      106
                            107
                                   108
                                          114
                                                 114
                                                        109
                                                               105
49
        244
               255
                      255
                            255
                                   255
                                          255
                                                 255
                                                        255
                                                               255
77
                       59
         67
                65
                             67
                                    62
                                           58
                                                  65
                                                         66
                                                                57
                                   . . .
                                                 . . .
                                          . . .
9973
        134
                      134
                            134
                                   135
                                                 134
                                                               134
               134
                                          135
                                                        133
9980
        232
               232
                      232
                            233
                                   234
                                          235
                                                 237
                                                        238
                                                               240
9983
         91
                89
                       78
                             67
                                    71
                                           74
                                                  89
                                                         97
                                                                93
                93
9987
         89
                       96
                            103
                                   106
                                           96
                                                  93
                                                        105
                                                               107
                             77
                                    77
                                                                 9
9991
         89
                81
                       78
                                           74
                                                  78
                                                         48
[6000 rows \times 1024 columns]
class 0.iloc[:,:-1].mean() #averaging the pixels across all columns
0
         158.878833
1
         157.808000
2
         158.500000
3
         159.227000
4
         159.962833
1019
         136.030333
1020
         135.797500
1021
         135.101333
         134.784667
1022
         135.146667
1023
Length: 1024, dtype: float64
hist, bins = np.histogram(class 0.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
```

```
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_0.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



The X-axis represents the pixel intensity levels of the image. The intensity level usually ranges from 0 to 255. For a gray-scale image, there is only one histogram, whereas an RGB colored image will have three 2-D histograms — one for each color. The Y-axis of the histogram indicates the frequency or the number of pixels that have specific intensity values.

Statistical Analysis of Class 0

For class 0, there is a sharp rise in cdf from 120 to 160 intensity level of the image. There is a sharp peak in middle which indicates the high frequency of 77 pixels between 120 to 150 intensity level of the image. There is also a second peak where there is the second highest frequency of 40 pixels for 160 intensity level of the image

4.2.2 Class 1 - Automobile

```
class_1=data[data['label']==1]
class_1.shape
(6000, 1025)
```

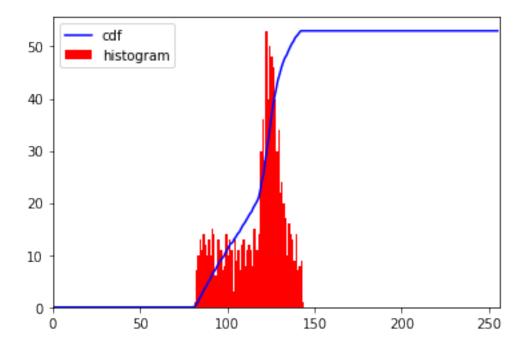
```
import matplotlib.pyplot as plt

plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
    plt.imshow(class_1.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
    #plt.xlabel(class_names[y_train[i][0]])
plt.show()
```



From the graph plotted, we can see that class 1 are all images of automobiles.

```
hist,bins = np.histogram(class_1.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_1.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



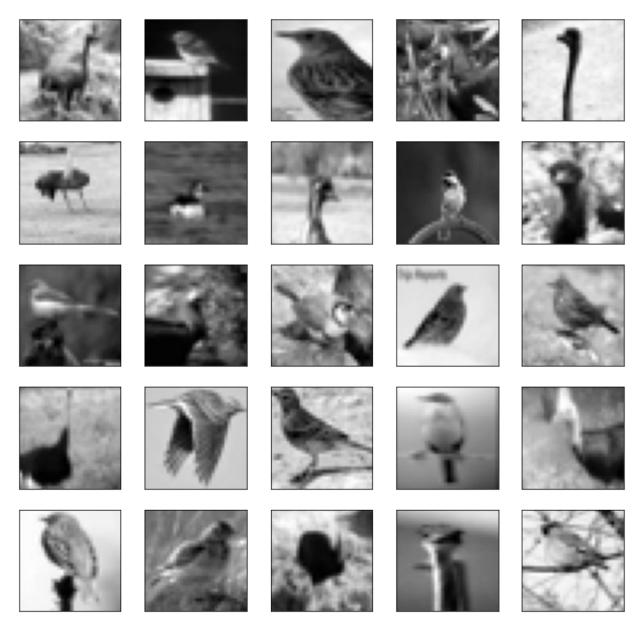
Statistical Analysis of Class 1

For class 1, there is a sharp rise in cdf from 80 to 140 intensity level of the image. From 80 to 130 intensity level of image, there is low frequency of pixels(~10 pixels). There is a sharp peak in middle which indicates the high frequency of ~50 pixels between 130 to 140 intensity level of the image.

4.2.3 Class 2 - Bird

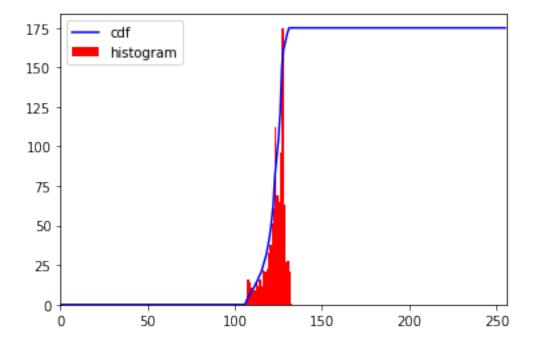
```
class_2=data[data['label']==2]
class_2.shape
(6000, 1025)
import matplotlib.pyplot as plt
```

```
plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
    plt.imshow(class_2.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
    #plt.xlabel(class_names[y_train[i][0]])
plt.show()
```



From the graph plotted, we can see that class 2 are all images of bird. There are in total 6000 images this class.

```
hist,bins = np.histogram(class_2.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_2.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



For class 2, there is a sharp rise from 10 to 175 pixels in cdf from 100 to 130 intensity level of the image.

4.2.4 Class 3 - Cat

```
class_3=data[data['label']==3]

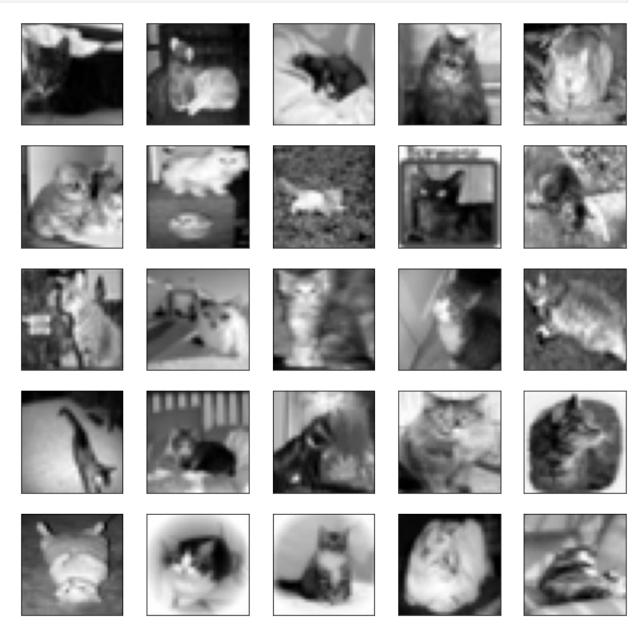
class_3.shape

(6000, 1025)

import matplotlib.pyplot as plt

plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
```

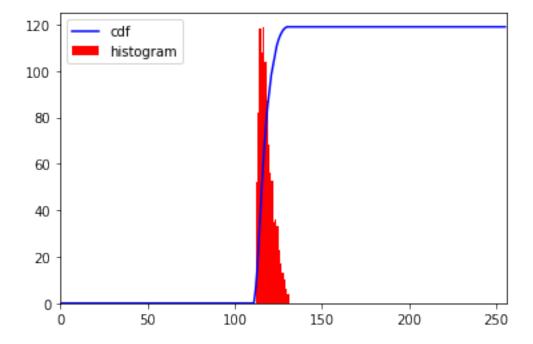
```
plt.yticks([])
  plt.grid(False)
  plt.imshow(class_3.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
    #plt.xlabel(class_names[y_train[i][0]])
plt.show()
```



From the graph plotted, we can see that class 3 are all images of cats. There are in total 6000 images this class.

```
hist,bins = np.histogram(class_3.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
```

```
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_3.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



For class 3, there is a sharp rise from in cdf from 10 to 175 pixels between 100 to 130 intensity level of the image.

4.2.5 Class 4 - Deer

```
class_4=data[data['label']==4]

class_4.shape

(6000, 1025)

import matplotlib.pyplot as plt

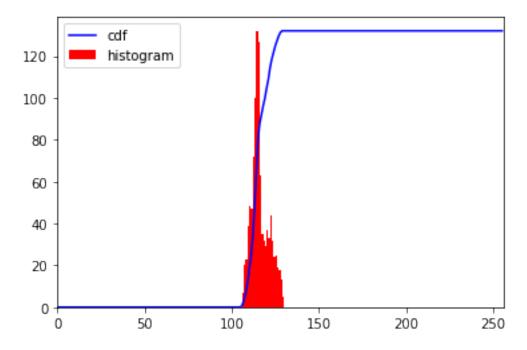
plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
```



From the graph plotted, we can see that class 4 are all images of deer. There are in total 6000 images this class.

```
hist,bins = np.histogram(class_4.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
```

```
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_4.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



For class 4, there is a sharp rise from in cdf from 0 to 130 pixels between 100 to 130 intensity level of the image.

4.2.6 Class 5 - Dog

```
class_5=data[data['label']==5]

class_5.shape

(6000, 1025)

import matplotlib.pyplot as plt

plt.figure(figsize=(10,10))

for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
    plt.imshow(class_5.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
```

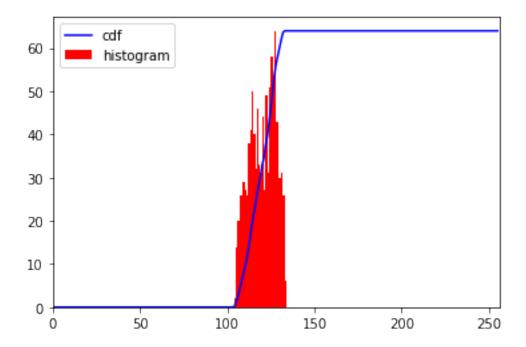
```
#plt.xlabel(class_names[y_train[i][0]])
plt.show()
```



From the graph plotted, we can see that class 5 are all images of deer. There are in total 6000 images this class

```
hist,bins = np.histogram(class_5.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_5.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
```

```
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



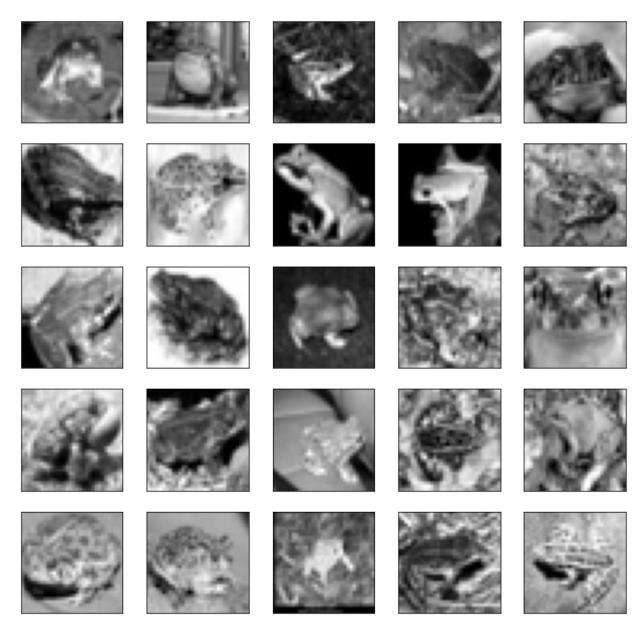
For class 5, there is a gradual rise from in cdf from 0 to 60 pixels between 100 to 130 intensity level of the image.

4.2.7 Class 6 - Frog

```
class_6=data[data['label']==6]

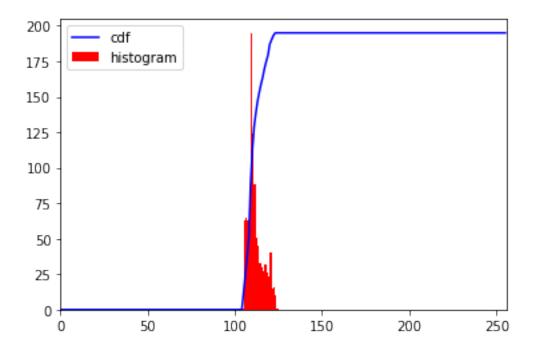
class_6.shape
(6000, 1025)
import matplotlib.pyplot as plt

plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
    plt.imshow(class_6.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
    #plt.xlabel(class_names[y_train[i][0]])
plt.show()
```



From the graph plotted, we can see that class 6 are all images of frog. There are in total 6000 images this class.

```
hist,bins = np.histogram(class_6.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_6.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



For class 6, there is a sharp rise from in cdf from 0 to 200 pixels between 100 to 130 intensity level of the image.

4.2.8 Class 7 - Horse

```
class_7=data[data['label']==7]

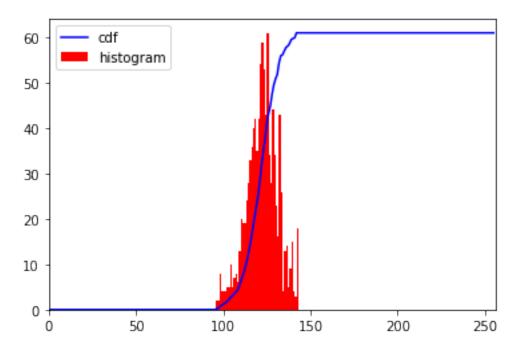
class_7.shape
(6000, 1025)
import matplotlib.pyplot as plt

plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
    plt.imshow(class_7.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
    #plt.xlabel(class_names[y_train[i][0]])
plt.show()
```



From the graph plotted, we can see that class 7 are all images of horse. There are in total 6000 images this class.

```
hist,bins = np.histogram(class_7.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_7.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



For class 7, there is a small rise and drop from in cdf from 0 to 60 back to 0 pixels between 100 to 150 intensity level of the image.

4.2.9 Class 8 - Ship

```
class_8=data[data['label']==8]

class_8.shape

(6000, 1025)

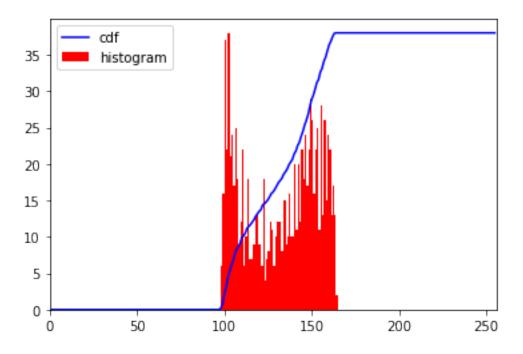
import matplotlib.pyplot as plt

plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
    plt.imshow(class_8.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
    #plt.xlabel(class_names[y_train[i][0]])
plt.show()
```



From the graph plotted, we can see that class 8 are all images of ship. There are in total 6000 images this class.

```
hist,bins = np.histogram(class_8.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_8.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```



For class 8, there is are 2 high peaks in the frequency of pixel (one at 35 pixels for 100 intensity level of the image. It then drops to 10 pixels and gradually increase to 25 pixels between the range of 110 to 160 intensity levels of the image

4.2.10 Class 9 - Truck

```
class_9=data[data['label']==9]

class_9.shape

(6000, 1025)

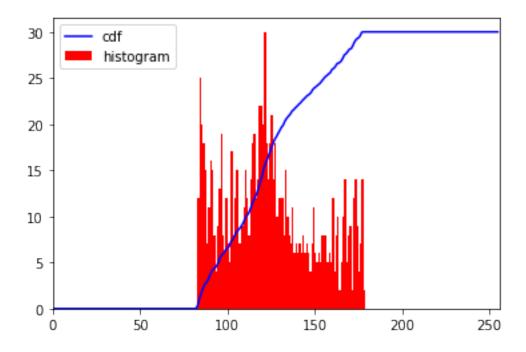
import matplotlib.pyplot as plt

plt.figure(figsize=(10,10))
for i in range(25):
    plt.subplot(5,5,i+1)
    plt.xticks([])
    plt.yticks([])
    plt.grid(False)
    plt.imshow(class_9.iloc[i,:-1].values.reshape(32,32),cmap="gray")
#reshaped matrix
    #plt.xlabel(class_names[y_train[i][0]])
plt.show()
```



From the graph plotted, we can see that class 9 are all images of trucks. There are in total 6000 images this class.

```
hist,bins = np.histogram(class_9.iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
cdf = hist.cumsum()
cdf_normalized = cdf * float(hist.max()) / cdf.max()
plt.plot(cdf_normalized, color = 'b')
plt.hist(class_9.iloc[:,:-1].mean().values.reshape(1,1024)[0],256,
[0,256], color = 'r')
plt.xlim([0,256])
plt.legend(('cdf','histogram'), loc = 'upper left')
plt.show()
```

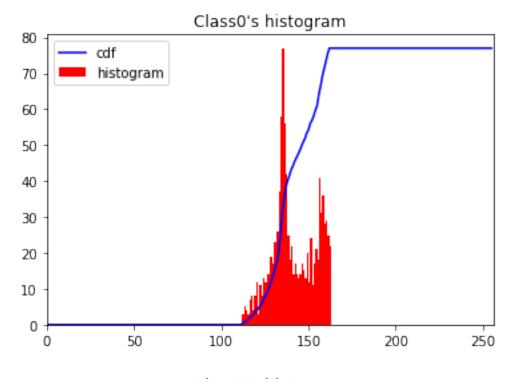


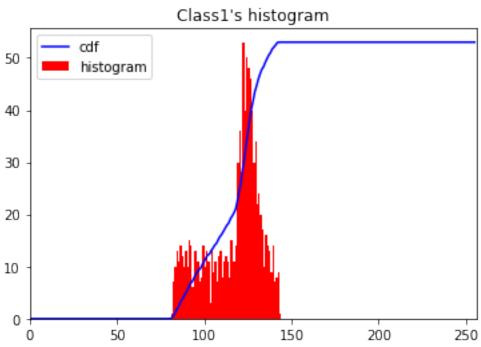
For class 9, there is wide spread of pixels between 80 to 170 intensity level of the image. There are 3 high peaks in the frequency of pixel:

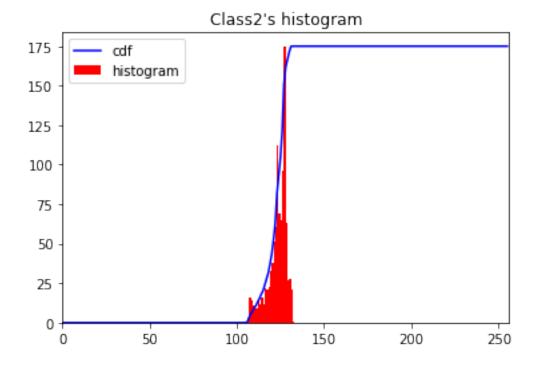
- 1st peak: 25 pixels at 80 intensity level of image
- 2nd peak: 30 pixel between 120 to 140 intensity level of image
- 3rd peak: 15 pixel between 150 to 170 intensity level of image

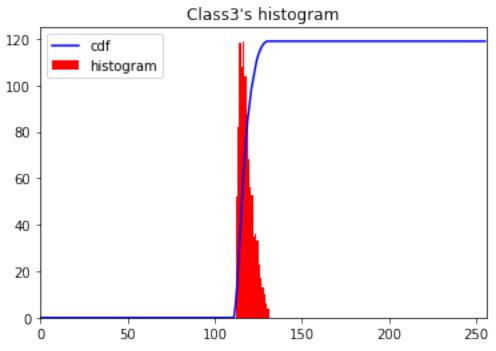
4.2.11 Classes comparison

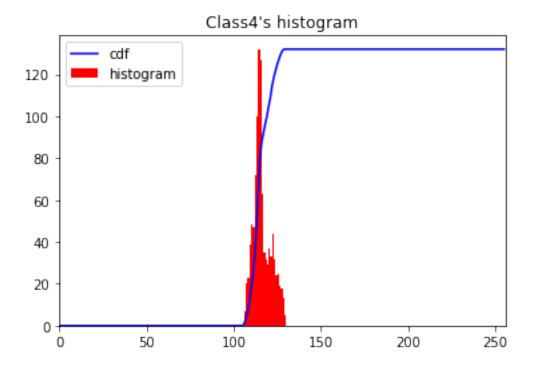
```
for i in range(10):
    hist,bins = np.histogram(data[data['label']==i].iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256])
    cdf = hist.cumsum()
    cdf_normalized = cdf * float(hist.max()) / cdf.max()
    plt.plot(cdf_normalized, color = 'b')
    plt.hist(data[data['label']==i].iloc[:,:-
1].mean().values.reshape(1,1024)[0],256,[0,256], color = 'r')
    plt.xlim([0,256])
    plt.legend(('cdf','histogram'), loc = 'upper left')
    plt.title("Class"+str(i)+"'s histogram")
    plt.show()
```

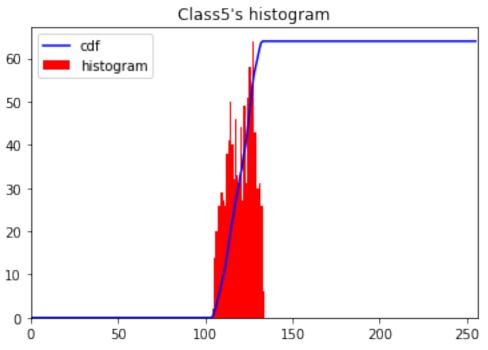


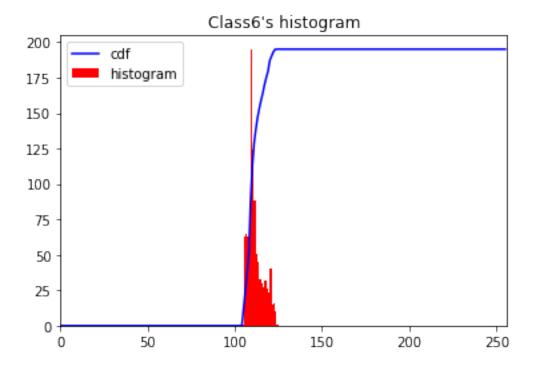


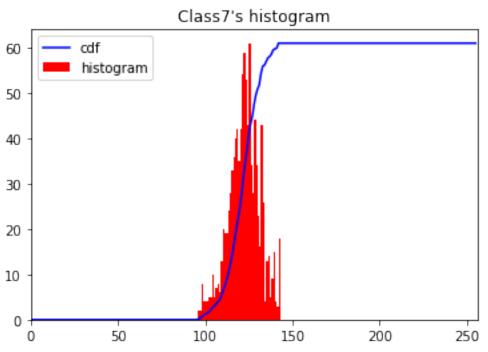


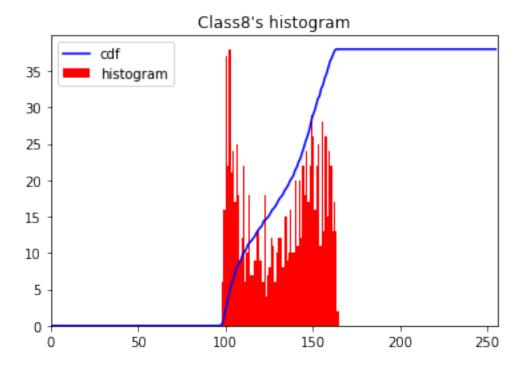


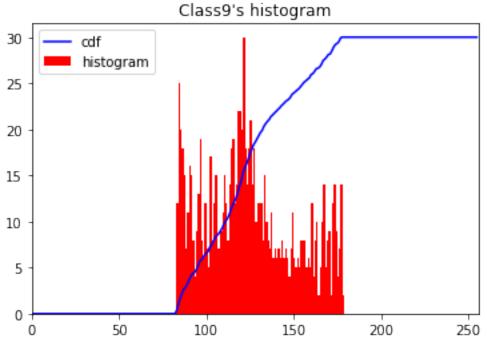












As shown in the table, i have summarised the statistical insights for each classes of image: Class Rise in Cdf Number of peaks Range of intensity level 0.0 to 0.

6 0 to 190 1 100 to 130

70 to 60 1 100 to 140

8 0 to 3 to 5 to 25 2 100 to 160 9 25 to 5 to 30 to 5 to 15 3 80 to 175

Insights:

- Classes with rise in cdf between intensity level 100 to 130 are classes 0,1,2,3,6,7,8
- Classes with 2 or more peaks classes 0,5,8,9
- Classes with similar-looking histograms classes 2,3,4,5,6,7 (shows that the pictures edges,cuts,shadow etc picture attributes are the same)
- 5. Data Preparation for Input Data

5.1 Data Normalization

Since our data is ready we now need to normalize the data, since normalizing the images in deep learning will produce very good results. Normalizing means we are bringing all the values in the data into a common scale 0-1. This will make out model converge fast and also we will not have any distrotions in the data.

For normalizing the pixel data (Image) we can simply divide the whole pixel values with 255 since pixel values ranges from 0-255. So if we divide them with 255 we automatically normalizee the data between 0-1.

```
# Normalizing
X_train=X_train/255
X_test=X_test/255
X=X/255
```

- 6. Derive black and white images from original color images
- 6.1 Import cifar-10 original colored images

```
import tarfile
tar = tarfile.open('cifar-10-python.tar.gz', "r:gz")
tar.extractall()
tar.close()

for i in tar:
    print(i)

<TarInfo 'cifar-10-batches-py' at 0x291e82e4880>
<TarInfo 'cifar-10-batches-py/data_batch_4' at 0x291e82e4e80>
<TarInfo 'cifar-10-batches-py/readme.html' at 0x291e82e4400>
<TarInfo 'cifar-10-batches-py/test_batch' at 0x291e82e4f40>
<TarInfo 'cifar-10-batches-py/data_batch_3' at 0x291e8351040>
<TarInfo 'cifar-10-batches-py/batches.meta' at 0x291e8351100>
<TarInfo 'cifar-10-batches-py/data_batch_2' at 0x291e8351280>
<TarInfo 'cifar-10-batches-py/data_batch_5' at 0x291e83511c0>
<TarInfo 'cifar-10-batches-py/data_batch_1' at 0x291e8351400>
```

6.2 Preprocess cifar-10 original colored images

```
def unpickle(file):
    import pickle
    with open(file, 'rb') as fo:
        dict = pickle.load(fo, encoding='bytes')
    return dict
unpickle('cifar-10-batches-py/data_batch_1')
{b'batch_label': b'training batch 1 of 5',
 b'labels': [6,
 9,
  9,
  4,
  1,
  1,
  2,
  7,
  8,
  3,
  4,
  7,
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  2,
  9,
 9,
  9,
  3,
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  6,
  4,
  3,
  6,
  6,
  2,
  6,
  3,
  5,
  4,
  0,
  0,
  9,
  1,
  3,
  4,
  0,
  3,
  7,
  3,
  3,
  5,
  2,
```

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3, 8, 0, 1, 6, 1, 1, 4, 1, 8, 3, 9, 6, 6, 1, 8, 5, 2, 9, 8, 1, 7, 7, 0, 0, 6, 9, 1, 2, 9, 2, 6, 6, 1, 9, 5, 0, 4, 7, 6, 7, 1, 8, 1, 2, 8,

1, 3, 6, 2, 4, 9, 9, 5, 4, 3, 7, 4, 6, 8, 5, 5, 3, 1, 8, 4, 7, 6, 0, 9, 5, 1, 3, 8, 7, 5, 3, 4, 1, 5, 7, 0, 4, 7, 5, 0, 9, 6, 9, 0, 9, 5, 8, 5, 2, 9, 8, 8, 0, 6, 9, 1, 1, 6, 3, 7, 6, 6, 0, 6, 6, 1, 7, 1, 5, 8, 3, 6, 8, 6, 8, 4, 6, 6, 1, 3, 8, 3, 4, 7, 1, 3, 8, 5, 1, 4, 0, 9, 3, 7, 4, 9, 2, 4, 9, 1, 0, 5, 9, 0, 8, 2, 2, 0, 5, 6,

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7, 6, 9, 8, 0, 6, 4, 0, 0, 5, 8, 2, 0, 2, 7, 6, 9, 7, 1, 5, 6, 6, 3, 6, 2,

4, 7, 0, 5, 6, 4, 5, 2, 6, 1, 6, 0, 4, 0, 3, 1, 8, 5, 4, 1, 7, 3, 7, 9, 7, 7, 2, 8, 4, 6, 6, 1, 2, 9, 0, 4, 8, 7, 3, 9, 8, 7,

```
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1,
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 0,
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 6,
2,
 8,
 5,
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 2,
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 3,
 5,
7,
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 5,
1,
3,
 5,
...],
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       [154, 126, 105, ..., 139, 142, 144],
       [255, 253, 253, ..., 83, 83, 84],
              60, 74, ..., 68, 69, 68],
       [250, 254, 211, ..., 215, 255, 254],
       [ 62, 61, 60, ..., 130, 130, 131]], dtype=uint8),
b'filenames': [b'leptodactylus_pentadactylus_s_000004.png',
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 b'american elk s 001521.png',
 b'station_wagon_s_000293.png',
 b'coupe s 001735.png',
 b'cassowary_s_001300.png',
 b'cow_pony_s_001168.png',
 b'sea_boat_s_001584.png',
 b'tabby_s_001355.png',
 b'muntjac_s_001000.png',
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```

```
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b'capreolus capreolus_s_000051.png',
b'tomcat s 000772.png',
b'pickerel frog_s_000446.png',
b'bufo s 001242.png',
b'cassowary s 001246.png',
b'toad s 001748.png',
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b'auto s 000609.png',
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b'pekinese s 001337.png',
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b'wagtail_s_001821.png',
b'dama dama s 000658.png',
b'domestic cat s 001970.png',
b'ambulance_s_003039.png',
b'convertible s 001763.png',
b'tank ship s 001229.png',
b'cassowary s 001055.png',
b'wagon s 001142.png',
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```
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b'moose s 002308.png',
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b'cruiser s 000774.png',
b'lippizan s 000359.png',
```

```
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b'amphibious aircraft s 000216.png',
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b'shooting_brake_s_000886.png',
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b'arabian s 001366.png',
b'auto s 000040.png',
b'cargo ship s 001063.png',
b'motorcar_s_000121.png',
b'motorcar s 000305.png'
b'anthus pratensis s 001071.png',
b'cruiser s 000294.png',
b'wagon_s_{000763.png'}
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b'tabby_cat_s_000825.png',
b'spadefoot_s_000051.png',
b'wagtail s 002075.png',
b'fallow deer s 001697.png',
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```

```
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6.3 Data Understanding of cifar-10 original colored images

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```

```
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```

```
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b'taxi s 000040.png',
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```

```
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b'dunnock s 001650.png',
b'dawn horse s 001127.png',
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b'wrecker \overline{s} 002\overline{3}2\overline{5}.png',
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b'automobile s 000327.png',
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b'leopard frog s 001231.png',
b'domestic cat_s_001066.png',
b'barking_frog_s_000840.png',
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```

```
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b'muntjac s 001738.png',
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b'fire engine s 001540.png',
b'gelding s 000640.png',
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b'appaloosa s 000342.png',
b'pipit s 001066.png',
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b'roe deer s 001014.png',
b'american toad s 001815.png',
b'bufo calamita s 000773.png',
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b'cassowary_s_000021.png',
b'lorry s 0\overline{0}\overline{1709}.png',
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b'capreolus capreolus s 000073.png',
b'motorboat s 000773.png',
b'lipizzan s 001658.png',
b'tabby_cat_s_000531.png',
b'truck s 000289.png',
b'speedboat s 001711.png',
b'quarter_horse_s_000557.png',
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b'jumbo jet s 001476.png',
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b'fallow deer s 001623.png',
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b'lark s 000550.png',
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```

```
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b'mutt_s_000188.png',
b'police_cruiser_s_000471.png',
b'true_cat_s_001598.png',
b'peke_s_000638.png',
...]}
```

6.3.1 Data Understanding of keys

```
data_batch1.keys()
dict_keys([b'batch_label', b'labels', b'data', b'filenames'])
```

The data_batches imported from the tar.gz file is in the form of dictionary with 4 keys namely, b'batch_label', b'labels', b'data', b'filenames'. Let's explore each key and the corresponding values

```
data batch1[b'batch label']
b'training batch 1 of 5'
data batch1[b'labels']
[6,
 9,
 9,
 4,
 1,
 1,
 2,
 7,
 8,
 3,
4,
7,
 7,
 2,
 9,
 9,
 9,
 3,
 2,
6,
 4,
 3,
 6,
 6,
```

2,63,54,0,0,13,4,0,3,7,3,3,5,2,2,7,1,1,2,2,0,9,5,7,9,2,2,5,2,4,3,1,1,8,2,1,1,4,9,7,8,5,9,6,

99,24,99,10,590,821,20,563,27,8860,794,564,211,21,5990,841,163,390

36,9304,051,0348547239767147,017318442022009096827740

81,007,75,62834,73901248186445,7139801,7582804189829927

32805514,56627017782922421116665117043371235556143

25,82027697155663624705646524616040318544173947973

```
7,
2,
8,
 4,
 6,
 6,
 1,
 2,
 9,
 0,
 4,
 8,
 7,
 3,
9,
8,
7,
 0,
 2,
 4,
 1,
 1,
 4,
 1,
 5,
 4,
 0,
 5,
 6,
 8,
 5,
 0,
 2,
 3,
 5,
 7,
 3,
 5,
 1,
 3,
 5,
. . . ]
data_batch1[b'data']
array([[ 59, 43, 50, ..., 140, 84, 72], [154, 126, 105, ..., 139, 142, 144],
```

```
[255, 253, 253, ..., 83, 83, 84],
       [ 71, 60, 74, ..., 68, 69, 68],
       [250, 254, 211, ..., 215, 255, 254],
       [ 62, 61, 60, ..., 130, 130, 131]], dtype=uint8)
data batch1[b'data'].shape
(10000, 3072)
data batch1[b'filenames']
[b'leptodactylus pentadactylus s 000004.png',
 b'camion s 000148.png',
 b'tipper truck s 001250.png',
 b'american elk s 001521.png',
 b'station wagon s 000293.png',
b'coupe s 001735.png',
 b'cassowary s 001300.png',
b'cow_pony_s_001168.png',
 b'sea boat s 001584.png',
 b'tabby s 001355.png',
 b'muntjac s 001000.png',
 b'arabian_s_001354.png',
 b'quarter_horse_s_000672.png',
 b'passerine s 000343.png',
 b'camion s 001895.png'
 b'trailer truck s 000335.png',
 b'dumper s 000821.png',
 b'alley_cat_s_000200.png',
 b'accentor_s_000677.png',
 b'frog s 001671.png',
 b'capreolus capreolus_s_000051.png',
b'tomcat_s_000772.png'
 b'pickerel frog s 000446.png',
 b'bufo s 001242.png',
 b'cassowary s 001246.png',
 b'toad s 001748.png',
 b'cat s 000081.png',
 b'chihuahua s 000825.png',
 b'alces alces s 000959.png',
 b'stealth bomber s 000554.png',
 b'twinjet_s_000663.png',
 b'trucking_rig_s_001402.png',
 b'auto s 000609.png',
 b'tabby_cat_s_000983.png',
 b'wapiti s 000416.png',
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 b'true cat s 000247.png',
 b'tennessee walker s 000486.png',
```

```
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b'house cat s 001196.png',
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b'ostrich s 001368.png',
b'ostrich s 001150.png',
b'stallion s 000046.png'
b'station waggon s 000041.png',
b'coupe s 001944.png',
b'estate car s 000580.png',
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b'emu novaehollandiae s 000795.png',
b'dive bomber s 001390.png',
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b'pekinese s 001093.png',
b'broodmare s 001463.png'
b'delivery truck s 000834.png',
b'songbird s 001052.png',
b'emu s 000692.png'
b'puppy s 000115.png',
b'wagtail s 001821.png',
b'dama dama s 000658.png',
b'domestic cat s 001970.png',
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b'convertible s 001763.png',
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b'cassowary_s_001055.png',
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b'capreolus capreolus s 001095.png',
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b'stallion s 000040.png',
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b'elk s 000920.png',
```

```
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b'station wagon s 002712.png'
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```

```
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```

```
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```
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b'cat s 000663.png'
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b'stag s 001458.png',
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b'mule deer s 000628.png',
b'tabby s 000410.png',
b'stud s 000099.png',
b'passenger ship s 001530.png',
b'scow s 000131.png',
b'tabby_s_001868.png',
b'bufo bufo s 002334.png',
b'bufo viridis s 000152.png',
b'passerine_s_001306.png',
b'house_cat_s_002116.png',
b'jetliner s 001188.png',
b'moving_van_s_001359.png',
b'wapiti s 000663.png',
b'felis catus s 000998.png',
b'sea boat s 001979.png',
b'fighter aircraft s 001776.png',
```

```
b'fighter aircraft s 001096.png',
b'shooting brake s 000774.png',
b'automobile s 001310.png',
b'pekingese s 001023.png',
b'american elk s 000455.png',
b'trucking_rig_s_001243.png',
b'house cat s 000877.png',
b'taxi s 000040.png',
b'pilot boat s 001100.png',
b'articulated lorry s 000223.png',
b'felis domesticus s 000164.png',
b'trucking_rig_s_001300.png',
b'tractor_trailer_s_000254.png',
b'flightless bird s 000142.png',
b'dump truck s 000939.png',
b'deer s 000967.png',
b'ship s 001904.png',
b'wagtail s 000309.png',
b'trailer truck_s_000815.png',
b'container ship s 002477.png',
b'guard boat s 000285.png',
b'estate car s 000446.png',
b'puppy_s_001621.png',
b'tabby cat s 000689.png',
b'american toad s 000650.png',
b'boat s 002381.png',
b'female_horse_s_000089.png'
b'bufo viridis s 001370.png',
b'ladder_truck_s_000044.png',
b'cargo ship s 001321.png',
b'twinjet s 000547.png',
b'cascades frog s 000061.png',
b'odocoileus hemionus s 001017.png',
b'attack aircraft s 001254.png',
b'airplane s 000006.png',
b'songbird_s_001232.png',
b'peke s 000388.png',
b'boat s 002143.png',
b'accentor s 001182.png',
b'dive bomber s 001066.png',
b'dunnock s 001650.png',
b'dawn horse s 001127.png',
b'european_toad_s_000359.png',
b'wrecker s 002325.png',
b'lipizzan s 000118.png'
b'automobile_s_000327.png',
b'pekinese s 002027.png',
b'maltese s 001913.png',
b'toad frog s 000836.png',
```

```
b'leopard frog s 001231.png',
b'domestic cat s 001066.png',
b'barking frog s 000840.png',
b'finch s 000038.png',
b'capreolus capreolus s 000257.png',
b'lippizan_s_000126.png',
b'attack aircraft s 000089.png',
b'mutt s 002278.png',
b'true toad s 000021.png',
b'capreolus capreolus s 000178.png',
b'bufo viridis s 000600.png',
b'chihuahua s 000097.png',
b'meadow pipit_s_001282.png',
b'red deer s 000008.png',
b'leopard_frog_s_001528.png',
b'estate car s 001220.png',
b'bullfrog s 000408.png',
b'stealth fighter s 001637.png',
b'capreolus capreolus_s_001669.png',
b'airbus_s_000736.png',
b'tabby s 000292.png',
b'station wagon s 002793.png',
b'boat s 000765.png',
b'english_toy_spaniel_s_000814.png',
b'european elk s 000265.png',
b'roe_deer s 000371.png',
b'convertible_s_000414.png',
b'cow pony s 000145.png',
b'tabby s 000126.png'
b'trucking_rig_s_001628.png',
b'muntjac s 001738.png',
b'broodmare s 000582.png'
b'fire engine s 001540.png',
b' gelding s 0\overline{00640}.png',
b'tabby cat s 002533.png',
b'appaloosa s 000342.png',
b'pipit s_001066.png',
b'speedboat s 000410.png',
b'roe_deer_s_001014.png',
b'american toad s 001815.png',
b'bufo calamita s 000773.png',
b'estate car s 000044.png',
b'cassowary_s_000021.png',
b'lorry s 001709.png',
b'amphibious_aircraft_s_000141.png',
b'capreolus_capreolus_s_000073.png',
b'motorboat s 000773.png',
b'lipizzan s 001658.png',
b'tabby cat s 000531.png',
```

```
b'truck s 000289.png',
b'speedboat s 001711.png',
b'quarter horse s 000557.png',
b'quarter horse s 000942.png',
b'jumbo jet s 001476.png',
b'struthio camelus s 001197.png',
b'fallow deer s 00\overline{1}6\overline{2}3.png',
b'compact car s 000850.png',
b'coupe s 001912.png',
b'roe deer s 000678.png',
b'car s 000674.png',
b'chihuahua s 001937.png',
b'red_deer_s_002698.png',
b'jumbojet s 001587.png',
b'toy spaniel_s_001692.png',
b'rana clamitans s 000766.png',
b'pipit s 000025.png',
b'cargo vessel s 001809.png',
b'pekingese s 001613.png',
b'dive_bomber_s_000707.png',
b'lark s 000550.png',
b'estate car s 000292.png',
b'tabby cat s 001853.png',
b'lapdog s 001963.png',
b'palfrey s 000300.png',
b'cat s 002298.png',
b'mutt s 000188.png'
b'police cruiser s 000471.png',
b'true cat s 001598.png',
b'peke s 000638.png',
. . . ]
```

From what was read from each key and the corresponding values, there are a total of 4 keys - b'batch_label', b'labels', b'data', b'filenames'

- 1. b'batch_label'- Batch label of the dataset (can be batch 1,2,3 etc)
- 2. b'labels' Label of classes
- 3. b'data' Images matrix
- 4. b'filenames' Images filename (.png format)

6.3.2 Data Understanding of data structure

```
print("Number of data samples:",len(data_batch1[b'data']))
Number of data samples: 10000
print("Number of columns:",len(data_batch1.keys()))
Number of columns: 4
```

```
print("Data
Shape: ",len(data_batch1[b'data']),",",len(data_batch1.keys()))
Data Shape: 10000 , 4
```

6.3.3 Data Understanding of data structure of b'data (images)

```
data batch1[b'data']
array([[ 59, 43, 50, ..., 140, 84, 72],
        [154, 126, 105, ..., 139, 142, 144],
       [255, 253, 253, ..., 83,
                                     83, 84],
              60, 74, ...,
                                68,
        [ 71,
                                     69,
                                           68],
        [250, 254, 211, ..., 215, 255, 254],
        [ 62, 61, 60, ..., 130, 130, 131]], dtype=uint8)
data batch1[b'data'].shape
(10000, 3072)
data colored = pd.DataFrame.from dict(data batch1[b'data'])
data_colored
      0
                          3
                                        5
                                              6
                                                                   9
3062
      \
        59
               43
                      50
                             68
                                   98
                                         119
                                                139
                                                      145
                                                             149
                                                                    149
59
                            102
1
       154
              126
                     105
                                  125
                                         155
                                                172
                                                      180
                                                             142
                                                                    111
22
2
       255
              253
                     253
                           253
                                  253
                                         253
                                                253
                                                      253
                                                             253
                                                                    253
78
3
        28
               37
                      38
                             42
                                   44
                                          40
                                                 40
                                                       24
                                                              32
                                                                     43
53
       170
              168
                                                             189
4
                     177
                            183
                                  181
                                         177
                                                181
                                                      184
                                                                    189
92
. . .
9995
        18
               18
                      21
                             23
                                   24
                                          23
                                                 24
                                                       25
                                                              22
                                                                     19
20
9996
       235
              240
                     249
                           253
                                  254
                                         253
                                                254
                                                      254
                                                             179
                                                                    108
75
9997
        71
               60
                      74
                             73
                                   87
                                         125
                                                179
                                                      231
                                                             250
                                                                    252
71
9998
       250
              254
                     211
                             64
                                   61
                                          60
                                                 55
                                                       54
                                                              55
                                                                     59
134
9999
               61
                      60
                             59
                                   94
                                         123
                                                140
                                                                     57
        62
                                                      105
                                                              58
131
                          3066
             3064
                    3065
                                               3069
                                                     3070
      3063
                                 3067
                                        3068
                                                            3071
0
        58
               65
                      59
                             46
                                   57
                                         104
                                                140
                                                       84
                                                              72
```

1	42	67	101	122	133	136	139	142	144
2	83	80	69	66	72	79	83	83	84
3	39	59	42	44	48	38	28	37	46
4	88	85	82	83	79	78	82	78	80
			41						
9995	24	33	41	45	39	39	39	34	37
9996	89	113	139	163	174	179	182	181	181
9997	70	67	66	70	81	78	68	69	68
9998	134	132	130	127	132	133	215	255	254
9999	131	131	131	131	130	130	130	130	131
[10000 rows x 3072 columns]									
data_colored.shape									
(10000, 3072)									

Lets, find out why X has 3072 columms? According to the original http://www.cs.toronto.edu/~kriz/cifar.html website, it was mentioned that the CIFAR-10 dataset consists of 60000 32x32 colour images in 10 classes, with 6000 images per class. There are 50000 training images and 10000 test images. Hence the 3072 is derived from 32 X 32 X 3= 1024 where 32 represents the width and height of each image. 3 represents the number of color channels which is only applicable for colored images as they have red, green and blue as the color combinations to form a colored images

6.4 Data Preparation - Convert the first 50 cifar-10 colored training images to black & white using Python Imaging Library

The original one batch data is (10000×3072) matrix expressed in numpy array. The number of columns, (10000), indicates the number of sample data. As stated in the CIFAR-10/CIFAR-100 dataset, the row vector, (3072) represents an color image of 32x32 pixels.

The dimension of the input tensor should be either (width x height x num_channel) or (num_channel x width x height).

Hence, we would need to reshape the numpy matrix

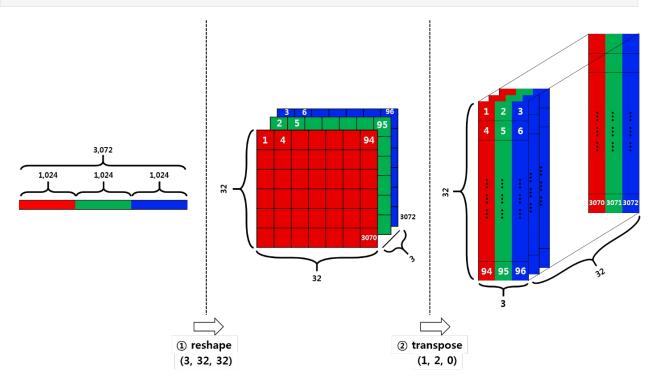
First, lets extract the first 50 images as only first 50 images is required in the conversion as stated in the assignment requirments

```
X_colored=data_batch1[b'data'][0:50]
data_batch1[b'data'].shape
(10000, 3072)
X_colored.shape
(50, 3072)
```

6.4.1 Reshaping cifar-10 original colored data numpy matrix

```
from IPython.display import Image

Image(filename =r"C:\Users\JiaYi\Downloads\Yr3Sem3 Assignment\
AI_TECH_Assignment\reshape_transpose.png")
```



Step 1: Reshape the numpy matrix from shape: (50,3072) to (50,3,32,32)

```
X_{colored}=X_{colored}. reshape (50,3,32,32)
X_colored
                 43,
                      50, ..., 158, 152, 148],
array([[[ 59,
                      18, ..., 123, 119, 122],
         [ 16,
                 0,
         [ 25,
                 16,
                      49, ..., 118, 120, 109],
         [208, 201, 198, ..., 160,
                                      56,
                                           53],
         [180, 173, 186, ..., 184,
                                      97,
         [177, 168, 179, ..., 216, 151, 123]],
        [[ 62,
                 46,
                      48, ..., 132, 125, 124],
                 0,
         [ 20,
                      8, ...,
                                      83,
                                88,
                                           87],
         [ 24,
                7,
                      27, ...,
                                 84,
                                      84,
                                           73],
         [170, 153, 161, ..., 133,
                                      31,
                                           34],
         [139, 123, 144, ..., 148,
                                      62,
                                           53],
         [144, 129, 142, ..., 184, 118,
                                           92]],
```

```
45,
               43, ..., 108, 102, 103],
 [[ 63,
  [ 20,
          0,
                0, ...,
                          55,
                               50,
                                     57],
  [ 21,
          0,
                8, ...,
                          50,
                               50,
                                     42],
  [ 96,
         34,
               26, ...,
                          70,
                                7,
                                     20],
               30, ...,
                          94,
                               34,
  [ 96,
         42,
                                     34],
  [116,
         94,
               87, ..., 140,
                               84,
                                     72]]],
                                     79],
[[[154, 126, 105, ...,
                          91,
                               87,
  [140, 145, 125, ...,
                               77,
                                     71],
                          96,
  [140, 139, 115, ...,
                          79,
                               68,
                                     67],
  [175, 156, 154, ...,
                          42,
                              61,
                                     93],
  [165, 156, 159, ..., 103, 123, 131],
  [163, 158, 163, ..., 143, 143, 143]],
 [[177, 137, 104, ...,
                          95,
                               90,
                                     81],
  [160, 153, 125, ...,
                          99,
                               80,
                                     73],
  [155, 146, 115, ...,
                          82,
                               70,
                                     69],
  . . . ,
                          34,
  [167, 154, 160, ...,
                               53,
                                   83],
  [154, 152, 161, ...,
                          93, 114, 121],
  [148, 148, 156, ..., 133, 134, 133]],
 [[187, 136, 95, ...,
                          71,
                               71,
                                     70],
  [169, 154, 118, ...,
                          78,
                               62,
                                     61],
  [164, 149, 112, ...,
                               55,
                          64,
                                     55],
  . . . ,
  [166, 160, 170, ...,
                          36,
                               57,
                                     91],
  [128, 130, 142, ...,
                          96, 120, 131],
  [120, 122, 133, ..., 139, 142, 144]]],
[[[255, 253, 253, ..., 253, 253, 253],
  [255, 255, 255, ..., 255, 255, 255],
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                          72,
                               72,
                                     72],
  [111, 104,
               99, ...,
                          68,
                               70,
                                     78],
  [106, 99,
              95, ...,
                          78,
                               79,
                                     80]],
 [[255, 253, 253, ..., 253, 253, 253],
  [255, 255, 255, ..., 255, 255, 255],
  [255, 254, 254, ..., 254, 254, 254],
                                     80],
  [120, 118, 112, ...,
                          81,
                               80,
  [118, 111, 106, ...,
                          75,
                               76,
                                     84],
  [113, 106, 102, ...,
                          85,
                               85,
                                     86]],
```

```
[[255, 253, 253, ..., 253, 253, 253],
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 [255, 254, 254, ..., 254, 254, 254],
  [112, 111, 106, ...,
                         80,
                               79,
                                    79],
  [110, 104,
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                         73,
                               75,
                                    82],
  [105,
         98,
              94, ...,
                         83,
                               83,
                                    84]]],
. . . ,
[[[ 77,
         76,
              78, ...,
                         68,
                               58,
                                    48],
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         67,
              69, ...,
                         57,
                               44,
 [ 55,
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              58, ...,
                         62,
                               53,
                                    48],
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              67, ...,
                         63,
                               58,
                                    55],
         91,
  [ 89,
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                         65,
                               68,
                                    66],
              92, ...,
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                                    77]],
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                                    84],
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                         93,
                               80,
                                    72],
 [ 91,
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              94, ...,
                         98,
                               89,
                                    84],
         92,
              97, ...,
                         97,
  [ 97,
                               92,
                                    89],
  [118, 116, 114, ...,
                         99, 102, 101],
  [129, 131, 119, ..., 104, 111, 112]],
[[137, 136, 139, ..., 128, 118, 108],
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  [136, 135, 136, ..., 122, 125, 124],
  [144, 147, 138, ..., 127, 134, 135]]],
[[[191, 190, 190, ..., 135, 142, 146],
  [187, 184, 179, ..., 147, 152, 153],
  [181, 176, 165, ..., 154, 162, 158],
  [220, 221, 222, ..., 211, 214, 224],
  [212, 220, 225, ..., 216, 216, 221],
  [201, 212, 217, ..., 220, 217, 217]],
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 [188, 187, 183, ..., 154, 158, 158],
  [183, 178, 169, ..., 161, 167, 163],
  . . . ,
```

```
[245, 245, 244, ..., 238, 240, 248],
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 [255, 252, 255, ..., 254, 254, 254],
 [255, 254, 254, ..., 254, 254, 254],
 [255, 253, 254, ..., 254, 254, 254],
 [255, 255, 255, ..., 255, 255, 255]]]], dtype=uint8)
```

Step 2: Transpose the numpy matrix

```
[[ 16,
         20,
               20],
 [ 0,
          0,
               0],
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          8,
                0],
  [123,
         88,
               55],
  [119,
         83,
               50],
  [122,
         87,
               57]],
 [[ 25,
         24,
               21],
         7,
27,
               0],
 [ 16,
                8],
  [ 49,
  [118,
         84,
               50],
               50],
  [120,
         84,
 [109,
         73,
               42]],
 . . . ,
 [[208, 170,
               96],
 [201, 153,
               34],
 [198, 161,
               26],
  [160, 133,
               70],
 [ 56, 31,
               7],
  [53, 34,
               20]],
 [[180, 139,
               96],
 [173, 123,
               42],
 [186, 144,
               30],
  [184, 148,
               94],
  [ 97, 62,
               34],
  [ 83, 53,
               34]],
 [[177, 144, 116],
               94],
 [168, 129,
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               87],
  . . . ,
  [216, 184, 140],
  [151, 118, 84],
  [123, 92, 72]]],
[[[154, 177, 187],
 [126, 137, 136],
  [105, 104, 95],
  . . . ,
  [ 91,
         95,
               71],
  [ 87,
         90,
               71],
  [ 79,
         81,
               70]],
```

```
[[140, 160, 169],
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 [125, 125, 118],
 [ 96,
         99,
              78],
 [ 77,
         80,
              62],
 [ 71,
         73,
              61]],
[[140, 155, 164],
 [139, 146, 149],
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  . . . ,
         82,
 [ 79,
              64],
         70,
 [ 68,
              55],
              55]],
 [ 67,
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. . . ,
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  [253, 253, 253],
 [253, 253, 253],
```

```
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  [255, 255, 255]],
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  [254, 254, 254],
  [254, 254, 254],
  . . . ,
  [254, 254, 254],
  [254, 254, 254],
  [254, 254, 254]],
 . . . ,
 [[113, 120, 112],
  [111, 118, 111],
  [105, 112, 106],
  . . . ,
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               80],
  [ 72,
         80,
               79],
  [ 72,
         80,
               79]],
 [[111, 118, 110],
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  [ 99, 106, 98],
  . . . ,
  [ 68,
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               73],
  [ 70,
         76,
               75],
               82]],
  [ 78,
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 [ 99, 106,
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  [ 95, 102,
               94],
  . . . ,
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```

```
[ 78, 114, 139],
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  [ 58,
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  [ 48, 84, 108]],
 [[ 71, 107, 131],
  [ 67, 102, 126],
  [ 69, 105, 130],
  [ 57,
         93, 116],
  [ 44,
         80, 104],
         72, 96]],
  [ 36,
         91, 115],
 [[ 55,
  [ 52,
         88, 112],
  [ 58,
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  [ 62,
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  [ 67,
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         97, 123],
  [ 63,
  [ 58,
         92, 118],
         89, 115]],
  [ 55,
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  [ 91, 116, 135],
  [ 89, 114, 136],
        99, 122],
  [ 65,
  [ 68, 102, 125],
  [ 66, 101, 124]],
 [[103, 129, 144],
  [107, 131, 147],
  [ 92, 119, 138],
  [ 69, 104, 127],
  [ 77, 111, 134],
  [ 77, 112, 135]]],
[[[191, 191, 168],
```

```
[190, 192, 172],
[190, 193, 174],
. . . ,
 [135, 143, 123],
[142, 149, 126],
[146, 150, 127]],
[[187, 188, 165],
[184, 187, 166],
[179, 183, 163],
 . . . ,
[147, 154, 134],
[152, 158, 135],
[153, 158, 134]],
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[176, 178, 157],
[165, 169, 148],
[154, 161, 140],
[162, 167, 143],
[158, 163, 139]],
. . . ,
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[224, 248, 203]],
[[212, 238, 190],
[220, 245, 198],
[225, 247, 204],
 [216, 242, 194],
[216, 241, 195],
 [221, 244, 201]],
[[201, 226, 178],
[212, 239, 190],
[217, 243, 196],
 [220, 242, 197],
[217, 240, 196],
 [217, 238, 195]]],
```

```
[[[255, 255, 255],
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  [255, 255, 255]],
[[255, 255, 255],
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  [254, 254, 254],
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[[255, 255, 255],
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  [254, 254, 254],
 [254, 254, 254],
 [254, 254, 254]],
. . . ,
[[255, 255, 255],
 [254, 254, 254],
 [254, 254, 254],
  [254, 254, 254],
  [254, 254, 254],
 [254, 254, 254]],
[[255, 255, 255],
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 [254, 254, 254],
  [254, 254, 254],
  [254, 254, 254],
  [254, 254, 254]],
[[255, 255, 255],
 [255, 255, 255],
 [255, 255, 255],
  [255, 255, 255],
  [255, 255, 255],
  [255, 255, 255]]]], dtype=uint8)
```

6.4.2 Save cifar-10 original colored images in a "rgbimages" file

```
import os
if not os.path.exists("rgbimages"):
    os.makedirs('rgbimages')

for i in range(0,50):
    plt.imshow(X_colored[i])
    plt.savefig("rgbimages/{0}.jpg".format(i))
    plt.close()
```

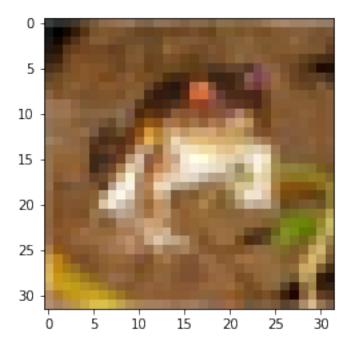
6.4.3 Convert colored images to blackwhite and save it in the "converted_blackwhiteimages" file

```
if not os.path.exists("converted_blackwhiteimages"):
    os.makedirs('converted_blackwhiteimages')

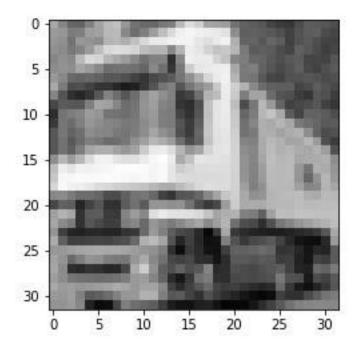
from PIL import Image
for i in range(0,50):
    img = Image.open('rgbimages/{0}.jpg'.format(i))
    imgGray = img.convert('L')
    imgGray.save('converted_blackwhiteimages/{0}.jpg'.format(i))
```

Let's see the original colored image

```
plt.imshow(X_colored[0])
<matplotlib.image.AxesImage at 0x2b2d7109d00>
```



Let's see the converted black white images

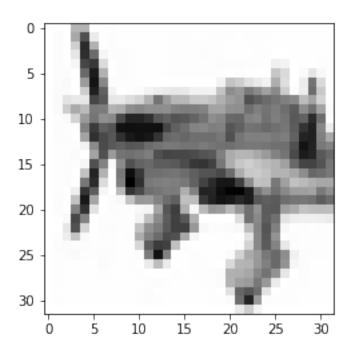


6.5 Data Verification - Verify the black and white values are identical to input dataset (black white images)

6.5.1. Save input dataset - train batch1 to "original_blackwhiteimages" directory

```
import os
if not os.path.exists("original_blackwhiteimages"):
    os.makedirs('original_blackwhiteimages')

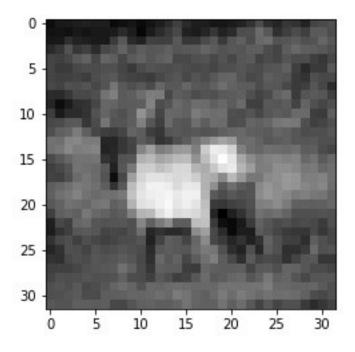
for i in range(0,50):
    plt.imshow(train_batch1.iloc[i,:-
1].values.reshape(32,32),cmap="gray")
    plt.savefig('original_blackwhiteimages/{0}.jpg'.format(i))
```



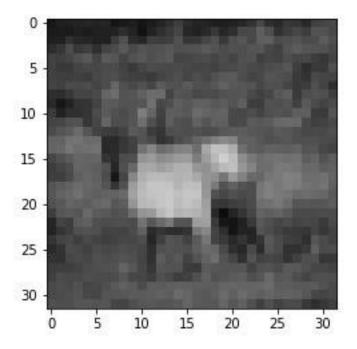
6.5.2 Compare images from original_blackwhiteimages and converted_blackwhiteimages directory

Let's take a look at the first data sample

```
original = Image.open('original_blackwhiteimages/3.jpg').convert('L')
converted =
Image.open('converted_blackwhiteimages/3.jpg').convert('L')
original
```



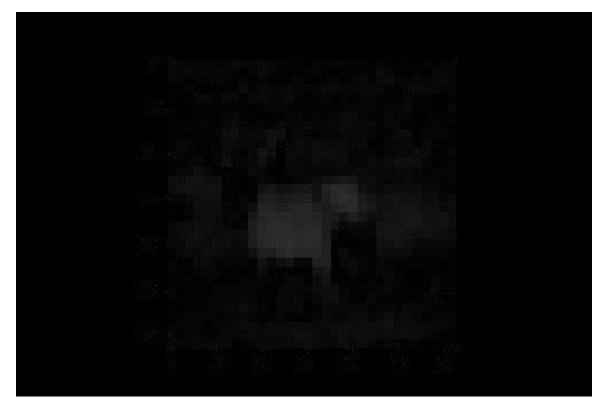
converted



Looks like there are no difference when spotted using the human eye. Now let's use the PIL imaging library to scrutinize the difference between the 2 images as they overlap

6.5.2.1 Compare with PIL imaging library

```
from PIL import Image, ImageChops
print("Difference in Images:")
ImageChops.difference(original, converted)
Difference in Images:
```



From the image above looks like there are some difference between both images given some white shade as shown in the centre of the picture

6.5.2.2 Spotting differences using PIL library

Now lets create a directory for the picturer used to identify the difference between the original input dataset and the converted blackwhite images

```
import os
if not os.path.exists("difference_blackwhiteimages"):
    os.makedirs('difference_blackwhiteimages')

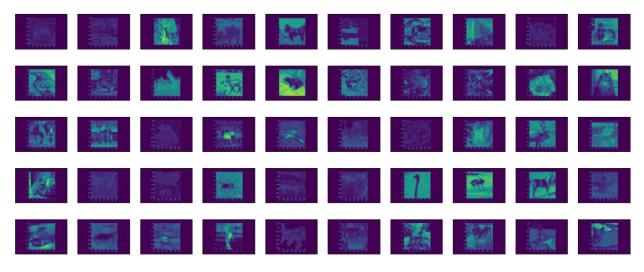
for i in range(50):
    img1 =
Image.open('original_blackwhiteimages/{0}.jpg'.format(i)).convert('L')
    img2 =
```

```
Image.open('converted_blackwhiteimages/{0}.jpg'.format(i)).convert('L'
)
    ImageChops.difference(img1,
img2).save('difference_blackwhiteimages/{0}.jpg'.format(i))
```

6.5.2.3 Plotting the differences between the original input dataset and the converted blackwhite images

Now let's plot the difference for all 50 pictures

```
path='difference blackwhiteimages'
images=os.listdir(path)
import glob
import matplotlib.pyplot as plt
import matplotlib.image as mpimg
%matplotlib inline
images = []
for img path in glob.glob('difference blackwhiteimages/*.jpg'):
    images.append(mpimg.imread(img path))
plt.figure(figsize=(20,10))
columns = 10
for i, image in enumerate(images):
    plt.subplot(len(images) / columns + 1, columns, i + 1)
    plt.imshow(image)
    plt.xticks([])
    plt.yticks([])
<ipython-input-397-bb15add23fdd>:13: MatplotlibDeprecationWarning:
Passing non-integers as three-element position specification is
deprecated since 3.3 and will be removed two minor releases later.
  plt.subplot(len(images) / columns + 1, columns, i + 1)
```

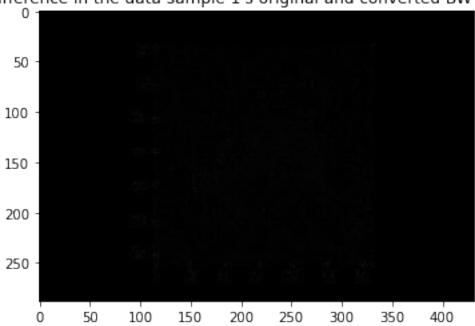


Now lets go into detail

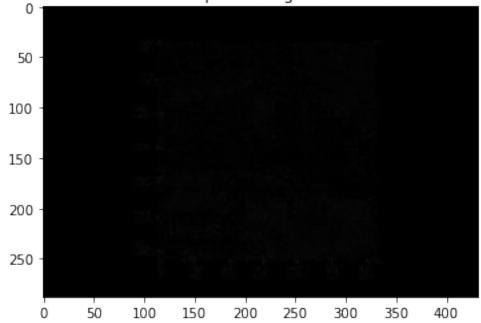
```
for img in images:
    img_arr=cv2.imread(os.path.join(path,img))
    plt.figure()
    plt.imshow(img_arr)
    plt.title('Difference in the data sample '+str(int(re.findall(r'\d+', img)[0])+1)+ "'s original and converted BW image")

<ipython-input-395-538b732d4bfe>:3: RuntimeWarning: More than 20
figures have been opened. Figures created through the pyplot interface
(`matplotlib.pyplot.figure`) are retained until explicitly closed and
may consume too much memory. (To control this warning, see the rcParam
`figure.max_open_warning`).
    plt.figure()
```

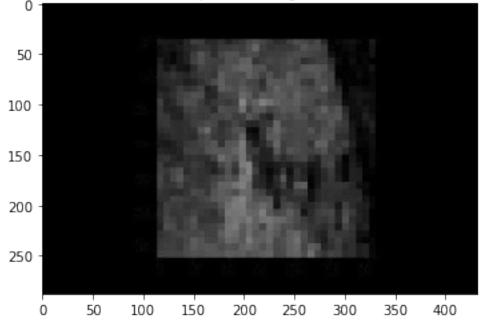
Difference in the data sample 1's original and converted BW image



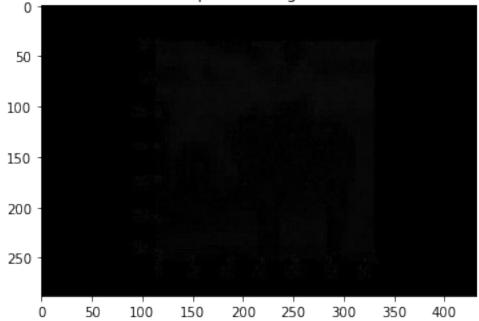
Difference in the data sample 2's original and converted BW image



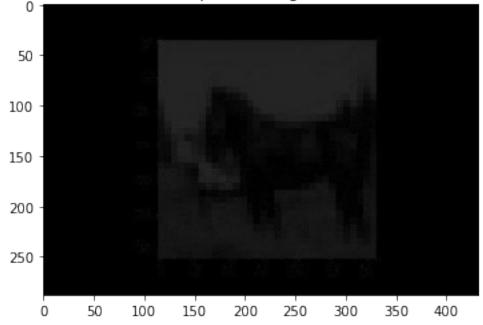
Difference in the data sample 11's original and converted BW image



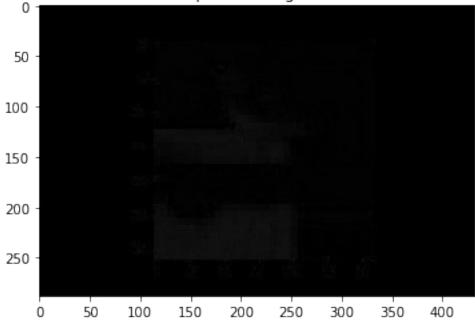
Difference in the data sample 12's original and converted BW image



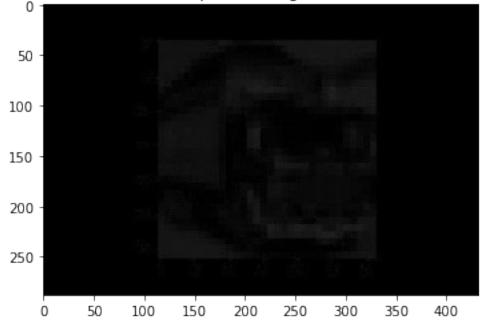
Difference in the data sample 13's original and converted BW image



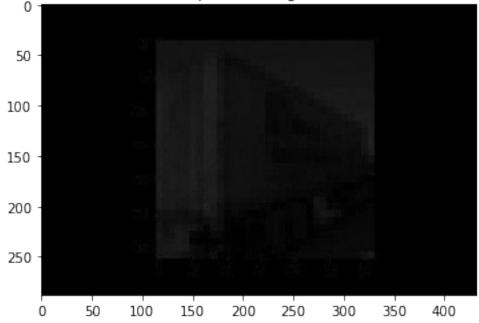
Difference in the data sample 14's original and converted BW image



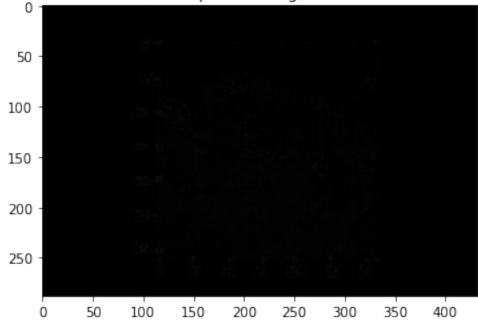
Difference in the data sample 15's original and converted BW image



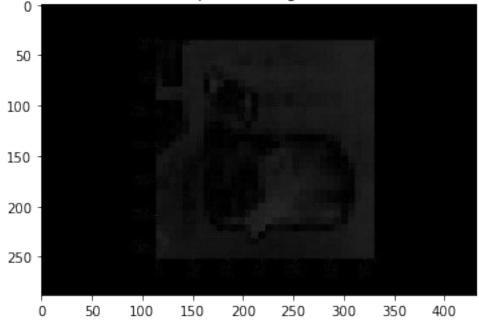
Difference in the data sample 16's original and converted BW image



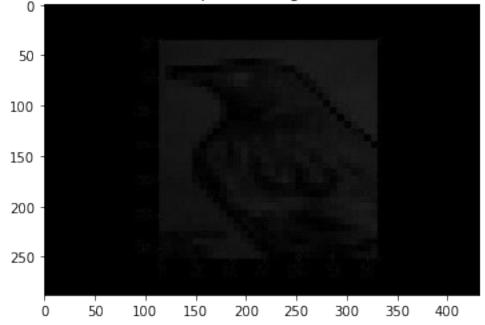
Difference in the data sample 17's original and converted BW image



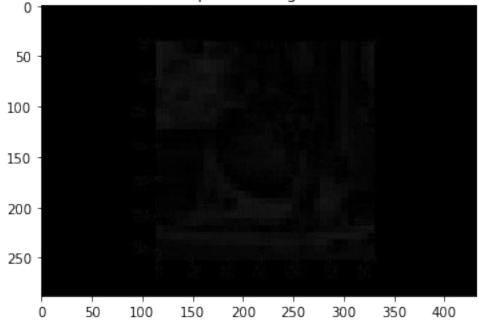
Difference in the data sample 18's original and converted BW image



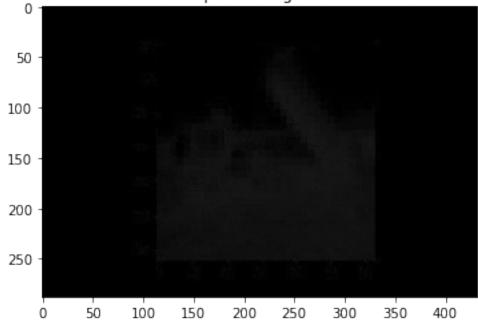
Difference in the data sample 19's original and converted BW image



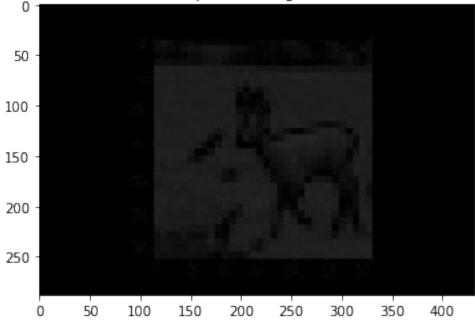
Difference in the data sample 20's original and converted BW image



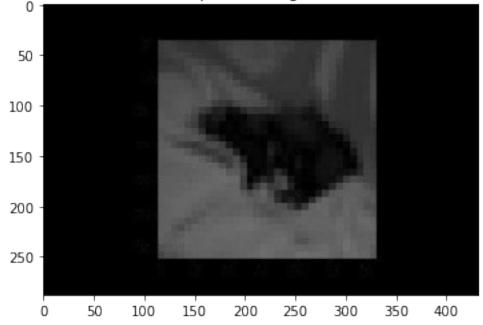
Difference in the data sample 3's original and converted BW image



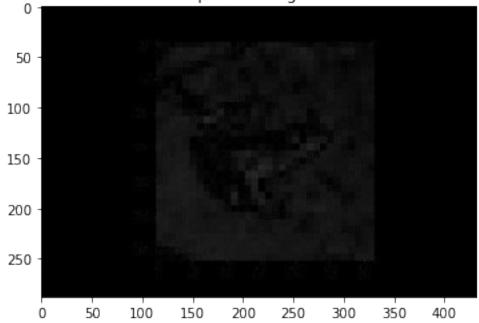
Difference in the data sample 21's original and converted BW image



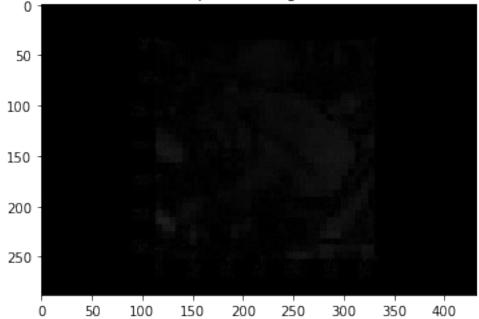
Difference in the data sample 22's original and converted BW image



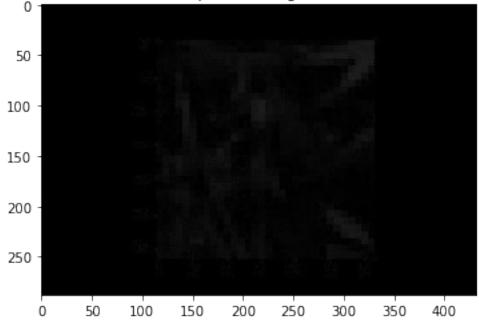
Difference in the data sample 23's original and converted BW image



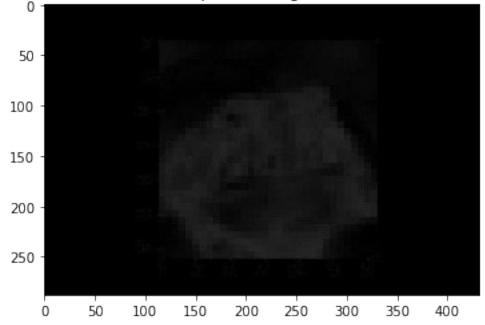
Difference in the data sample 24's original and converted BW image



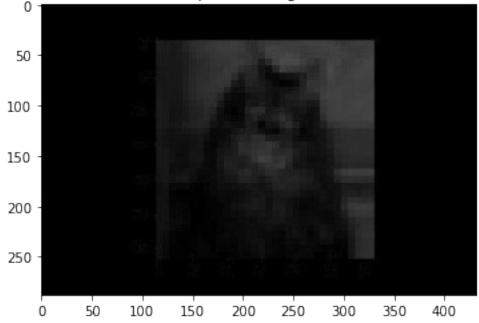
Difference in the data sample 25's original and converted BW image



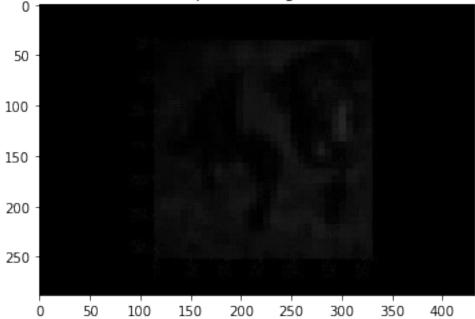
Difference in the data sample 26's original and converted BW image



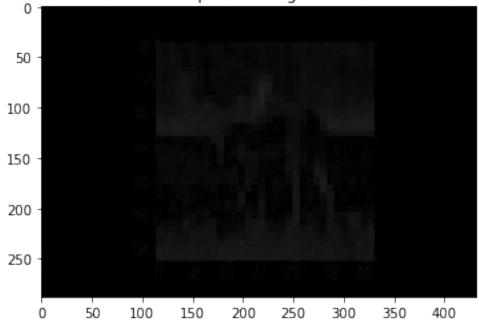
Difference in the data sample 27's original and converted BW image



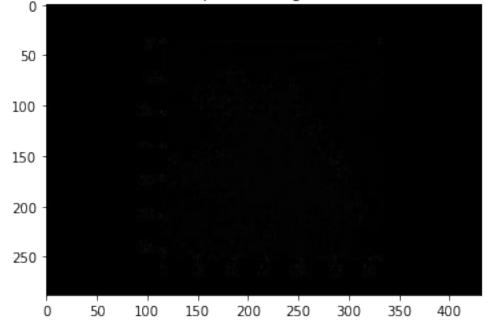
Difference in the data sample 28's original and converted BW image



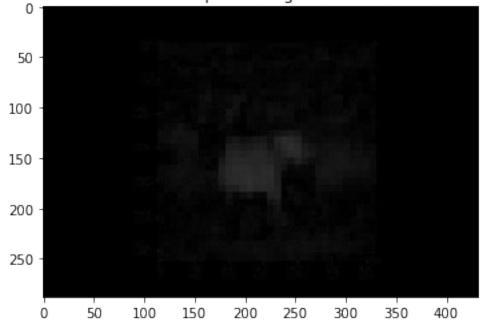
Difference in the data sample 29's original and converted BW image



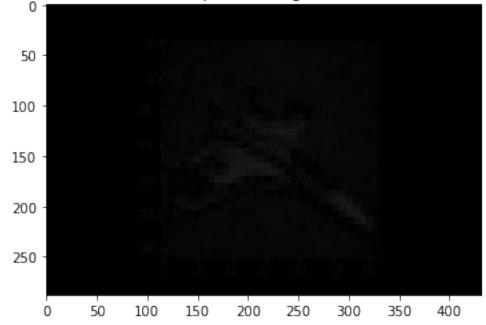
Difference in the data sample 30's original and converted BW image



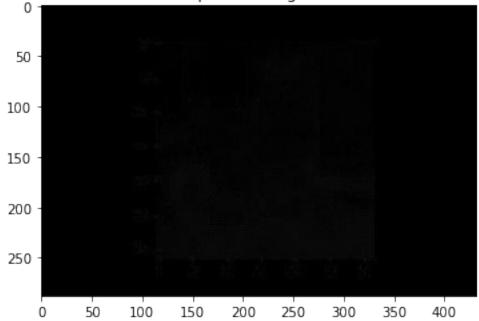
Difference in the data sample 4's original and converted BW image



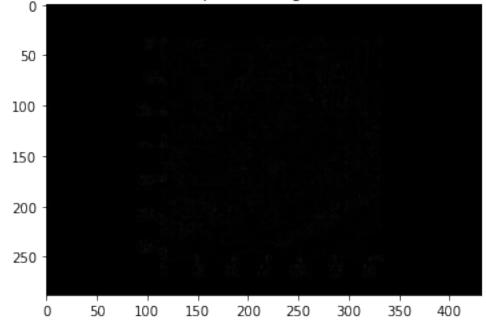
Difference in the data sample 31's original and converted BW image



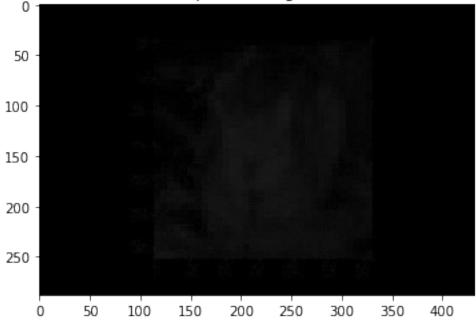
Difference in the data sample 32's original and converted BW image



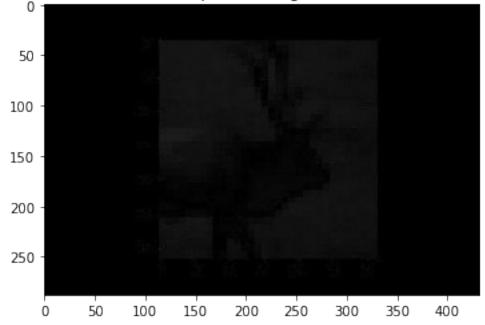
Difference in the data sample 33's original and converted BW image



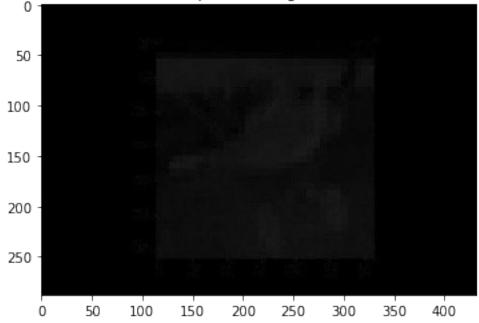
Difference in the data sample 34's original and converted BW image



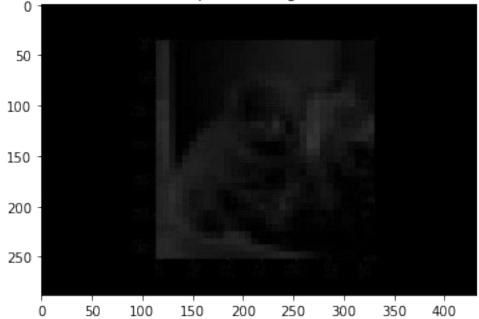
Difference in the data sample 35's original and converted BW image



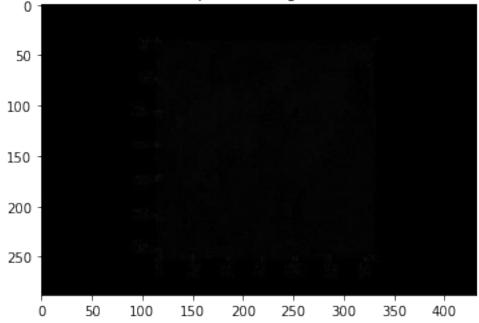
Difference in the data sample 36's original and converted BW image



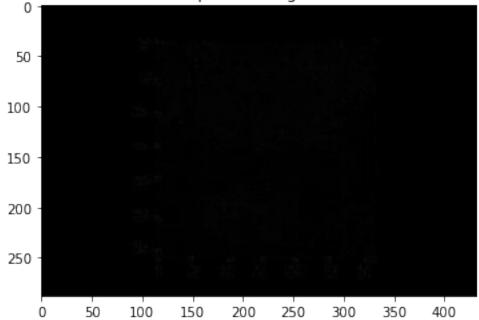
Difference in the data sample 37's original and converted BW image



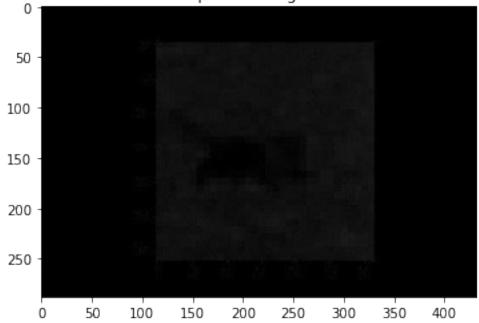
Difference in the data sample 38's original and converted BW image



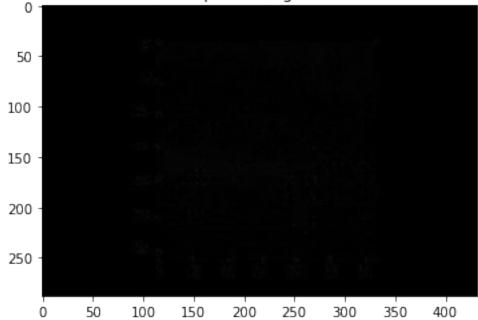
Difference in the data sample 39's original and converted BW image



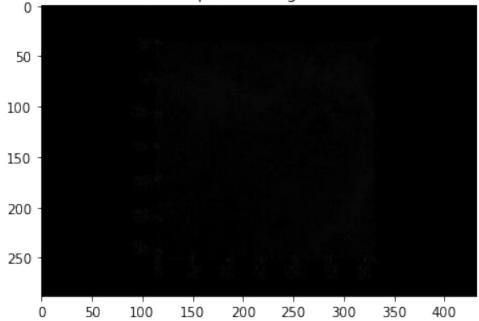
Difference in the data sample 40's original and converted BW image



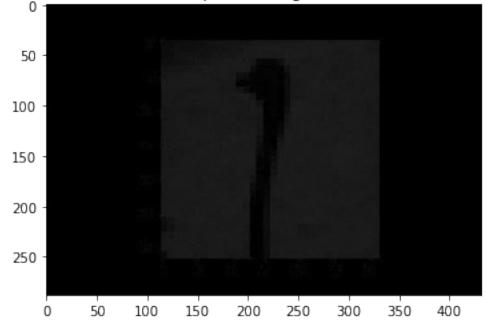
Difference in the data sample 5's original and converted BW image



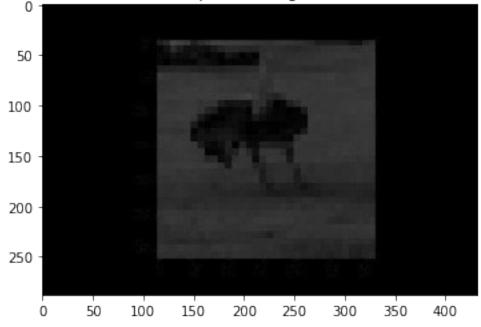
Difference in the data sample 41's original and converted BW image



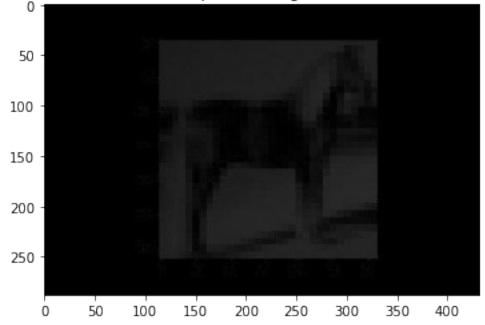
Difference in the data sample 42's original and converted BW image



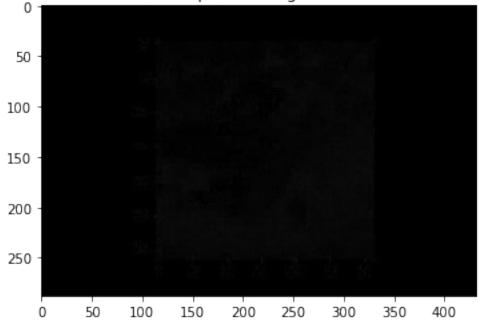
Difference in the data sample 43's original and converted BW image



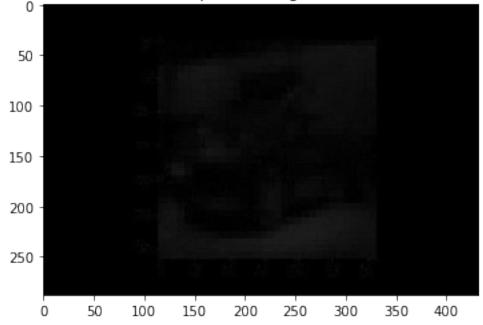
Difference in the data sample 44's original and converted BW image



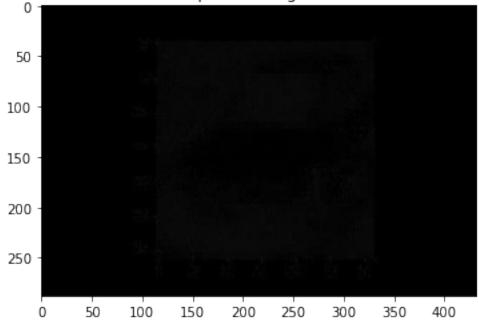
Difference in the data sample 45's original and converted BW image



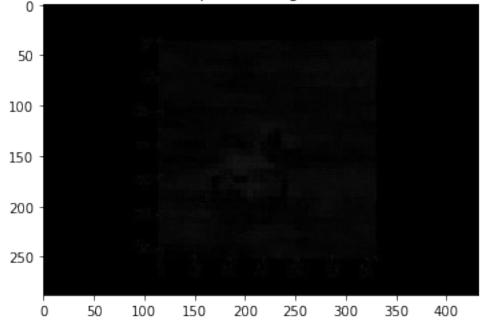
Difference in the data sample 46's original and converted BW image



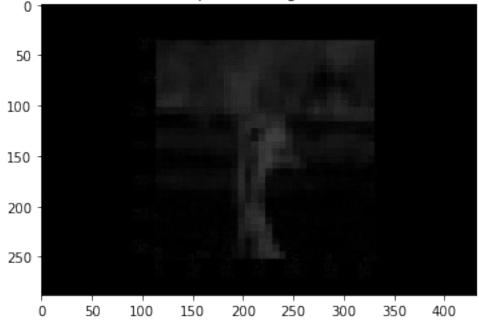
Difference in the data sample 47's original and converted BW image



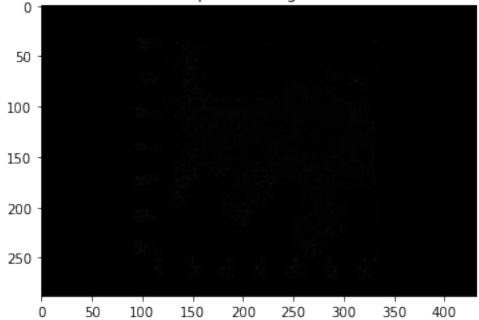
Difference in the data sample 48's original and converted BW image



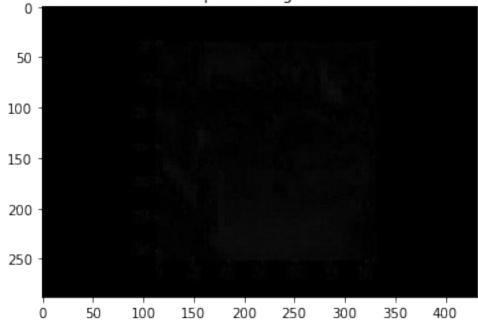
Difference in the data sample 49's original and converted BW image



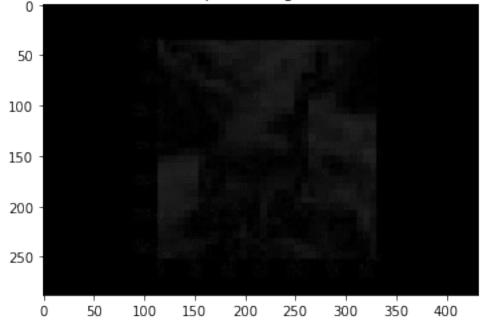
Difference in the data sample 50's original and converted BW image



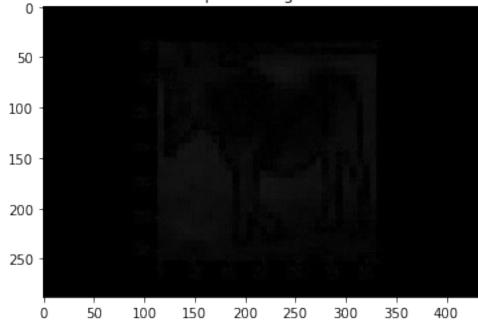
Difference in the data sample 6's original and converted BW image



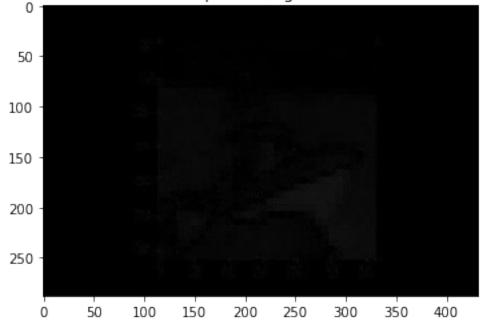
Difference in the data sample 7's original and converted BW image



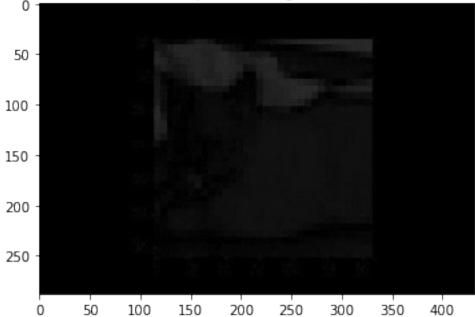
Difference in the data sample 8's original and converted BW image



Difference in the data sample 9's original and converted BW image







From the diagram plotted above, we can see that there are 34 data samples with difference reflected from the original input dataset versus the one that was converted to gray scale. The data sample number is listed as shown below

34 data samples with difference: 3,4,7,8,10 11,13,14,15,16,18,19,20 21,22,23,24,25,26,27,28,29 31,34,36,37,38,40 42,43,44,46,49,50

16 data samples with no difference: 1,2,5,6,9,12,17,40,32,33,35,39,41,45,47,48