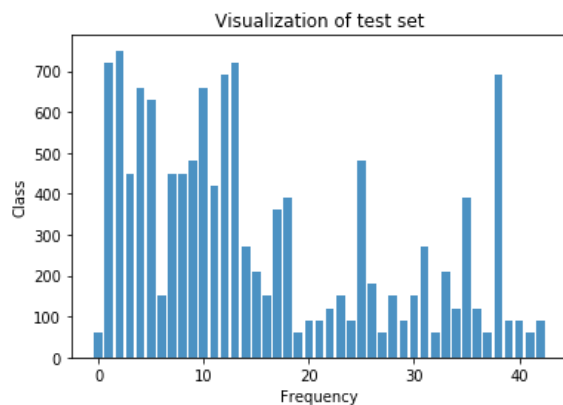
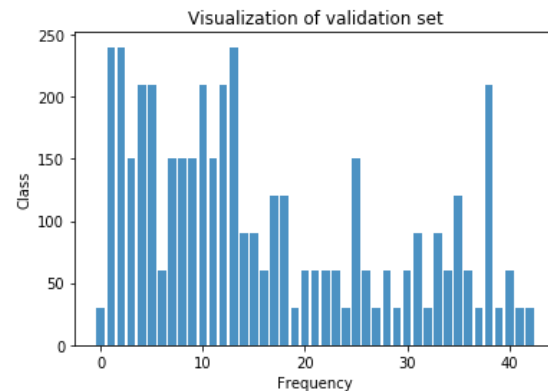
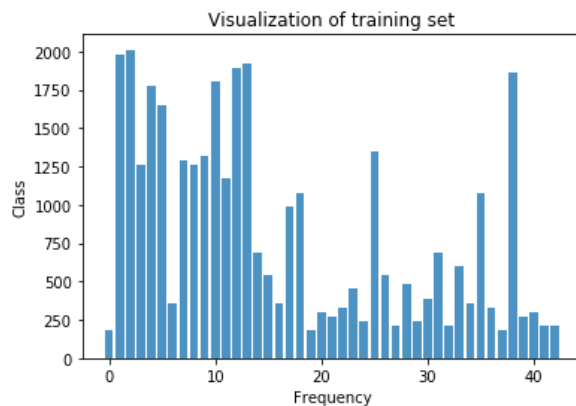


I address the rubric points as follows:

- Provide a basic summary of the data set. In the code, the analysis should be done using python, numpy and/or pandas methods rather than hard coding results manually.
  - I converted the datasets into numpy arrays and calculated the size as follows.  
Size of training set: 34799  
Size of testing set: 12630  
Size of validation set: 4410  
Shape of traffic sign image: 32\*32\*3  
Number of classes: 43
- Visualization of the datasets”  
The following bar graphs show the number of examples for each class in the three datasets.



- Preprocessing of images.  
I preprocessed the images in the following two steps
  1. Converted the pixel values to zero mean and equal variance by subtracting 128 and dividing by 128.

2. Converted into grayscale.

- Model Architecture

Input: 32\*32\*1 grayscale image

Convolution layer 1, 1\*1 stride, valid padding, outputs: 28\*28\*6

Relu activation

Max pool layer, 2\*2 stride, ksize=2\*2, outputs 14\*14\*6

Convolution layer 2: 1\*1 stride, valid padding, outputs: 10\*10\*16

Relu activation

Max pool layer: 2\*2 stride, ksize=2\*2, outputs: 5\*5\*16

Flatten layer: output: 400

Fully connected layer: output 120

Dropout, keep probability=0.5

Relu activation

Fully connected: output 84

Relu activation

Fully connected: output 43(the number of classes)

- Training the model.

Optimizer used: Adam's optimizer

Hyperparameters

- Weights were initialized from a normal distribution with mean zero and standard deviation 0.1
- Number of epoch: 50
- Batch size: 50
- Learning rate: 0.001

- Final results

- Validation set accuracy: 93.9%
- Test set accuracy: 91.99%
- Train set accuracy: 99.06%

Discussion: I used the Lenet architecture, which was giving me an accuracy of about 85% with the number of epochs as 10 and batch size as 128. I changed these parameters to 50 and 50 respectively to get accuracy value above 93%.

- Testing the model on new images.

I used the following five images from the web.



My model identified 1/5 images correctly. Hence, the accuracy was 20%.

