```
drive.mount('/content/drive')
```

Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.mount("/content/drive)

Importing Data

```
import pandas as pd

path = '/content/drive/My Drive/Major_project/IMPLEMENTATION1/'
path_s='/content/drive/My Drive/Major_project/IMPLEMENTATION1/sample/'

trainLabels = pd.read_csv(path + "trainLabels.csv")
trainLabels.head()
```

С→		image	level
	0	10_left	0
	1	10_right	0
	2	13_left	0
	3	13_right	0
	4	15_left	1

```
!ls '/content/drive/My Drive/Major_project/IMPLEMENTATION1/sample'
```

 \Box

```
      10003_left.jpeg
      10162_left.jpeg
      1162_right.jpeg
      1563_left.jpeg

      10003_right.jpeg
      10162_right.jpeg
      1165_left.jpeg
      1563_right.jpeg

      10007_left.jpeg
      10163_left.jpeg
      1165_right.jpeg
      1569_left.jpeg

      10007_right.jpeg
      10163_right.jpeg
      1170_left.jpeg
      1569_right.jpeg

      10009_left.jpeg
      10166_left.jpeg
      1170_right.jpeg
      1574_left.jpeg

      10000_night_jpeg
      10166_night_jpeg
      1170_left_jpeg
      1574_night_jpeg
```

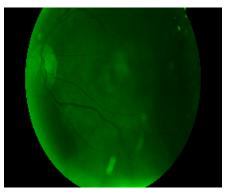
```
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                  τωτοο ι.τάμι. Thea
                                     11/δ_1eTι.Jpeg
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from PIL import Image
from keras.preprocessing import image
import os
import numpy as np
# resize the image to (256, 256)
img_rows, img_cols = 256, 256
listing = os.listdir(path_s)
#listing.remove("trainLabels.csv")
#listing.remove("sampleSubmission.csv")
#listing.remove("sample_data")
immatrix = []
imlabel = []
for file in listing:
    base = os.path.basename(path_s+file)
    fileName = os.path.splitext(base)[0]
    imlabel.append(trainLabels.loc[trainLabels.image==fileName, 'level'].values[0])
    im = Image.open(path_s+file)
    img = np.array(im.resize((img_rows,img_cols)))
    # convert to green channel only #(Because human eye is more sensitive to green than other colors)
    img[:,:,[0,2]] = 0
    immatrix.append(img)
```

Using TensorFlow backend.

```
print("level:",imlabel[1])
im
```

L→ level: 0

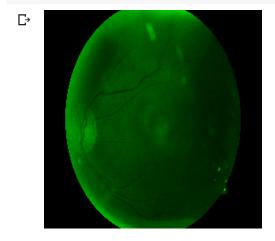


```
# define transformation methods
def horizontal_flip(image_array):
    return image_array[:, ::-1]

def vertical_flip(image_array):
    return image_array[::-1,:]

def random_transform(image_array):
    if random.random() < 0.5:
        return vertical_flip(image_array)
    else:
        return horizontal_flip(image_array)</pre>
```

```
im = Image.fromarray(vertical_flip(immatrix[1]),'RGB')
im
```



```
length = len(immatrix)
for i in range(length):
    if random.random() < 0.1:
        immatrix.append(random_transform(immatrix[i]))
        imlabel.append(imlabel[i])

print("Size of image array before augmentation: ", length)
print("Size fo image array after augmentation: ", len(immatrix))</pre>
```

Size of image array before augmentation: 549
Size fo image array after augmentation: 603

```
from sklearn.utils import shuffle

data,label = shuffle(immatrix, imlabel, random_state=42)
train_data = [data,label]

"""import matplotlib.pyplot as plt
```

```
plt.hist(label)
plt.show()"""
```

'import matplotlib.pyplot as plt\n\nplt.hist(label)\nplt.show()'

Input Data Parameters

```
from sklearn.model_selection import train_test_split

x_train, x_test, y_train, y_test = train_test_split(train_data[0], train_data[1], test_size = 0.1, random

print(np.array(x_train).shape)

print(np.array(y_train).shape)
```

```
[→ (542, 256, 256, 3)
(542,)
```

```
from keras.utils import np_utils

y_train = np_utils.to_categorical(np.array(y_train), 5)
y_test = np_utils.to_categorical(np.array(y_test), 5)

x_train = np.array(x_train).astype("float32")/255.
x_test = np.array(x_test).astype("float32")/255.

print(np.array(y_train).shape)
```

MODEL

```
import keras
from keras.models import Sequential
from keras layers import Dense, Dropout, Flatten, Conv2D, MaxPooling2D, BatchNormalization
model = Sequential()
model.add(Conv2D(32,\ (3,\ 3),\ padding='same',\ activation='relu',\ input\_shape=x\_train[0].shape)) \#\ 32=filter
model.add(Conv2D(32, (3, 3), activation='relu'))
model.add(MaxPooling2D())# Takes max value in each stride(Dimension of image is reduced to 128*128)
model.add(Dropout(0.25))
model.add(Conv2D(64, (3, 3), padding='same', activation='relu'))
model.add(Conv2D(64, (3, 3), activation='relu'))
model.add(MaxPooling2D())
model.add(Dropout(0.25))
model.add(Conv2D(64, (3, 3), padding='same', activation='relu'))
model.add(Conv2D(64, (3, 3), activation='relu'))
model.add(MaxPooling2D())
model.add(Dropout(0.25))
model.add(Flatten())
model.add(Dense(512, activation='relu'))
model.add(Dropout(0.5))
model.add(Dense(activation='softmax', units=5))
model.compile(loss='categorical_crossentropy', optimizer = keras.optimizers.SGD(lr=0.0001, momentum=0.9),
```

С⇒

```
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/tensorflow/python/framework/op_def_
Instructions for updating:
Colocations handled automatically by placer.
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow_backend.py
model.summary()
```

Layer (type)	Output	Shape	Param #
conv2d_1 (Conv2D)	(None,	256, 256, 32)	896
conv2d_2 (Conv2D)	(None,	254, 254, 32)	9248
max_pooling2d_1 (MaxPooling2	(None,	127, 127, 32)	0
dropout_1 (Dropout)	(None,	127, 127, 32)	0
conv2d_3 (Conv2D)	(None,	127, 127, 64)	18496
conv2d_4 (Conv2D)	(None,	125, 125, 64)	36928
max_pooling2d_2 (MaxPooling2	(None,	62, 62, 64)	0
dropout_2 (Dropout)	(None,	62, 62, 64)	0
conv2d_5 (Conv2D)	(None,	62, 62, 64)	36928
conv2d_6 (Conv2D)	(None,	60, 60, 64)	36928
max_pooling2d_3 (MaxPooling2	(None,	30, 30, 64)	0
dropout_3 (Dropout)	(None,	30, 30, 64)	0
flatten_1 (Flatten)	(None,	57600)	0
dense_1 (Dense)	(None,	512)	294917

Total params: 29,633,701 Trainable params: 29,633,701 Non-trainable params: 0

dropout_4 (Dropout)

dense_2 (Dense)

Training DATA

model.fit(x_train, y_train, batch_size = 64, epochs=10, shuffle=True, verbose=2)

(None, 512)

(None, 5)

₽

 $WARNING: tensorflow: From \ /usr/local/lib/python 3.6/dist-packages/tensorflow/python/ops/math_ops.py: 3.6/dist-packages/tensorflow/python/ops/math_ops.py: 3.6/dist-packages/tensorflow/python/ops/math_ops.python/ops.python/ops.python/ops/math_ops.python/ops.python$ Instructions for updating: Use tf.cast instead. Epoch 1/10

- 13s - loss: 1.5997 - acc: 0.3266

Enach 2/10

```
Epoch 2/10
- 3s - loss: 1.5807 - acc: 0.5627
Epoch 3/10
- 3s - loss: 1.5558 - acc: 0.6734
Epoch 4/10
- 3s - loss: 1.5161 - acc: 0.7066
```

Prediction

```
predictions = model.predict(x_test)
predictions
```

₽

```
[0.57340983 , 0.10068357, 0.15825234, 0.0929853 , 0.09398045], [0.5540983 , 0.09685867, 0.15825234, 0.0929853 , 0.09398045], [0.56842035, 0.09685867, 0.15424848, 0.08938818, 0.09108431], [0.63747054, 0.07936095, 0.13894136, 0.07111991, 0.0731073 ], [0.55499196, 0.10064775, 0.15781179, 0.0928616 , 0.09368689], [0.6187889 , 0.08380418, 0.14248215, 0.07641768, 0.07850713], [0.5734024 , 0.09540585, 0.1547461 , 0.08769451, 0.08875114],
```

Evaluating

L.....,,,,,,,

```
score = model.evaluate(x_test, y_test, verbose=0)
print(score)
```

[1.0605540549168821, 0.6721311446096077]

```
[0.57346255, 0.09567214, 0.15429991, 0.08780926, 0.08875608],
[0.54547805, 0.10306647, 0.15986879, 0.09521086, 0.09637579],
[0.5703307, 0.0965352, 0.15499993, 0.08823699, 0.08989722],
[0.53750473, 0.10535413, 0.16145022, 0.09744503, 0.09824588],
[0.58499366, 0.09311945, 0.15111734, 0.08494262, 0.0858269],
[0.55215514, 0.10195999, 0.15838398, 0.0928552 , 0.0946457 ],
[0.59032387, 0.09142389, 0.15026626, 0.08347742, 0.08450855],
[0.5414829 , 0.10431808, 0.1607477 , 0.09640978, 0.09704151],
[0.5850711 , 0.09231877, 0.15195675, 0.08456452, 0.08608889],
          , 0.09989772, 0.1563495 , 0.0912514 , 0.09296136],
[0.57830584, 0.09449593, 0.1530922 , 0.08584143, 0.08826451],
[0.52740777, 0.10789976, 0.16272292, 0.10057264, 0.10139691],
\hbox{\tt [0.57274294, 0.09660713, 0.15261352, 0.08875547, 0.08928099],}
\hbox{\tt [0.55115414, 0.10138675, 0.15900691, 0.09376634, 0.09468593],}
\hbox{\tt [0.51517737, 0.11127628, 0.16602981, 0.10336532, 0.10415129],}
\hbox{\tt [0.63652766, 0.07950936, 0.13930337, 0.0713691, 0.07329047],}\\
[0.53549206, 0.10572834, 0.162062 , 0.09789051, 0.09882706],
[0.57073045, 0.09661161, 0.15411708, 0.08875508, 0.08978578],
[0.5591984, 0.09944284, 0.15680209, 0.09181578, 0.09274086],
[0.58070874, 0.09370738, 0.15260474, 0.08635961, 0.0866195],
[0.5370737, 0.1054162, 0.16147982, 0.09781758, 0.09821282],
[0.5833239, 0.09293648, 0.15139017, 0.08529577, 0.08705372],
[0.615677, 0.08403347, 0.1446909, 0.07678344, 0.07881525],
[0.61998755, 0.08288613, 0.14265195, 0.0756042, 0.07887018],
[0.6606859 , 0.07359168 , 0.13168226 , 0.0655616 , 0.0684786 ],
[0.5916723 , 0.09062289, 0.15028825, 0.08299875, 0.08441782],
[0.6023731 , 0.08804872, 0.14682542, 0.08040732, 0.08234541],
[0.61404794, 0.08505619, 0.14474675, 0.07745178, 0.07869732],
[0.5631176, 0.0977737, 0.15569997, 0.09075908, 0.0926496],
[0.5683451 . 0.09702868 . 0.15472263 . 0.08947407 . 0.09042953] .
```