AML_HW6

May 4, 2018

1 Task 1 [10 Points]

- Run a multilayer perceptron (feed forward neural network) with two hidden layers and rectified linear nonlinearities on the iris dataset using the keras Sequential interface.
- Include code for selecting regularization strength and number of hidden units using Grid-SearchCV and evaluation on an independent test-set.

```
In [2]: from sklearn import datasets
        from keras.datasets import mnist
        from keras.wrappers.scikit_learn import KerasClassifier
        from sklearn.model_selection import GridSearchCV, StratifiedShuffleSplit
        from keras.models import Sequential
        from keras.layers import Dense, Dropout, Flatten, Activation
        from keras.layers import Conv2D, MaxPooling2D
        from keras.layers import BatchNormalization
        import keras
        import scipy
        import numpy as np
        import matplotlib.pyplot as plt
        import pandas as pd
        from keras import regularizers
        import tensorflow as tf
        sess = tf.Session(config=tf.ConfigProto(log_device_placement=True))
```

Loading dataset:

```
In [3]: iris = datasets.load_iris()

X = iris['data']
y = iris['target']

num_classes = np.unique(y).shape[0]
```

StratifiedShuffleSplit of the dataset:

```
X_train = X[train_idx]
        X_test = X[test_idx]
        y_train = y[train_idx]
        y_test = y[test_idx]
In [5]: y_train = keras.utils.to_categorical(y_train, num_classes)
     y_test = keras.utils.to_categorical(y_test, num_classes)
  Model definition:
In [6]: def make_model( num_classes=3, input_shape=4,
                optimizer="adam", hidden_size_L1=32,
                hidden_size_L2=32, regularize=0.01):
        model = Sequential([
           Dense(hidden_size_L1,
                input_shape=(input_shape,),
                activation='relu',
               kernel_regularizer=regularizers.12(regularize)),
           Dense(hidden_size_L2,
                activation='relu',
               kernel_regularizer=regularizers.12(regularize)),
           Dense(num_classes,
                activation='softmax')
        1)
        model.compile(optimizer=optimizer,
                  loss="categorical_crossentropy",
                  metrics=['accuracy'])
        return model
In [7]: clf = KerasClassifier(make_model)
     param_grid = {'epochs': [10,20],
                'batch_size': [50],
                'regularize': [0.01,0.1,1],
                'hidden_size_L1':[32,64,128],
                'hidden_size_L2': [64,128,256]}
     grid = GridSearchCV(clf, param_grid=param_grid, cv=5)
     grid.fit(X_train, y_train)
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 2ms/step
108/108 [========= ] - 0s 60us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 10/10
27/27 [======== ] - Os 3ms/step
108/108 [========= ] - 0s 46us/step
Epoch 1/10
Epoch 2/10
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Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 3ms/step
108/108 [========== ] - 0s 49us/step
Epoch 1/10
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Epoch 3/10
Epoch 4/10
Epoch 5/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 3ms/step
108/108 [========= ] - Os 44us/step
Epoch 1/10
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Epoch 9/10
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Epoch 10/10
27/27 [=========] - 0s 4ms/step
108/108 [========== ] - Os 41us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 5/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 4ms/step
108/108 [========= ] - Os 63us/step
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 5ms/step
108/108 [========= ] - Os 44us/step
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - Os 5ms/step
108/108 [========= ] - 0s 48us/step
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 5ms/step
108/108 [========== ] - Os 48us/step
Epoch 1/10
Epoch 2/10
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Epoch 3/10
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Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 6ms/step
108/108 [======== ] - 0s 44us/step
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Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 6ms/step
108/108 [========== ] - 0s 46us/step
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Epoch 3/10
Epoch 4/10
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Epoch 5/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 6ms/step
108/108 [========== ] - Os 48us/step
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Epoch 6/10
Epoch 7/10
Epoch 9/10
Epoch 10/10
27/27 [========] - Os 7ms/step
108/108 [========== ] - 0s 58us/step
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Epoch 5/10
Epoch 6/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 7ms/step
108/108 [========= ] - Os 50us/step
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Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 8ms/step
108/108 [========= ] - Os 45us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 9/10
Epoch 10/10
27/27 [=======] - 0s 14ms/step
108/108 [========== ] - Os 54us/step
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Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - Os 9ms/step
108/108 [========= ] - Os 57us/step
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Epoch 10/10
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108/108 [========= ] - Os 45us/step
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 10ms/step
108/108 [========== ] - 0s 46us/step
Epoch 1/10
Epoch 2/10
Epoch 4/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 0s 10ms/step
108/108 [======== ] - 0s 67us/step
Epoch 1/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - Os 12ms/step
108/108 [========== ] - 0s 62us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 11ms/step
108/108 [========= ] - 0s 83us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 4/10
Epoch 5/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 12ms/step
108/108 [========== ] - Os 50us/step
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 12ms/step
108/108 [========== ] - 0s 47us/step
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Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 12ms/step
108/108 [========= ] - 0s 50us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 10/10
27/27 [======== ] - Os 13ms/step
108/108 [========== ] - Os 60us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 6/10
Epoch 7/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - Os 14ms/step
108/108 [========== ] - 0s 58us/step
Epoch 1/10
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Epoch 3/10
Epoch 4/10
Epoch 5/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 13ms/step
108/108 [========= ] - 0s 51us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
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Epoch 10/10
27/27 [========= ] - Os 15ms/step
108/108 [========= ] - 0s 51us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - Os 16ms/step
108/108 [========= ] - Os 52us/step
Epoch 1/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 16ms/step
108/108 [========= ] - Os 56us/step
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - Os 16ms/step
108/108 [========= ] - 0s 53us/step
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Epoch 2/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 16ms/step
108/108 [========== ] - Os 65us/step
Epoch 1/10
Epoch 2/10
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Epoch 3/10
Epoch 4/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - Os 18ms/step
108/108 [======== ] - 0s 56us/step
Epoch 1/10
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Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - Os 17ms/step
108/108 [========== ] - 0s 64us/step
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Epoch 2/10
Epoch 3/10
Epoch 4/10
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Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - Os 18ms/step
108/108 [========= ] - Os 62us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 1s 19ms/step
108/108 [========== ] - 0s 53us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=======] - 1s 20ms/step
108/108 [========= ] - Os 55us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 20ms/step
108/108 [========= ] - 0s 53us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
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Epoch 9/10
Epoch 10/10
27/27 [=======] - 1s 20ms/step
108/108 [========== ] - Os 64us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
108/108 [========= ] - Os 77us/step
Epoch 2/10
Epoch 3/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
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27/27 [========= ] - 1s 22ms/step
108/108 [========= ] - Os 67us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 23ms/step
108/108 [========== ] - 0s 60us/step
Epoch 1/10
Epoch 2/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 23ms/step
108/108 [======== ] - 0s 87us/step
Epoch 1/10
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Epoch 2/10
Epoch 3/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 24ms/step
108/108 [========== ] - 0s 67us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 25ms/step
108/108 [========= ] - Os 61us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 4/10
Epoch 5/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 25ms/step
108/108 [========= ] - Os 62us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 26ms/step
108/108 [========== ] - 0s 57us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 1s 26ms/step
108/108 [========= ] - 0s 60us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 10/10
27/27 [========] - 1s 27ms/step
108/108 [========== ] - Os 58us/step
Epoch 1/10
Epoch 2/10
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Epoch 6/10
Epoch 7/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 27ms/step
108/108 [========= ] - 0s 60us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 1s 28ms/step
108/108 [========= ] - Os 63us/step
Epoch 1/10
Epoch 2/10
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Epoch 8/10
Epoch 9/10
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Epoch 10/10
27/27 [========== ] - 1s 28ms/step
108/108 [========== ] - 0s 69us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 28ms/step
108/108 [========= ] - Os 59us/step
Epoch 1/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 31ms/step
108/108 [========= ] - Os 75us/step
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Epoch 1/10
Epoch 2/10
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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 1s 29ms/step
108/108 [==========] - 0s 62us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 30ms/step
108/108 [========= ] - Os 74us/step
Epoch 1/10
Epoch 2/10
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Epoch 3/10
Epoch 4/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 31ms/step
108/108 [======== ] - 0s 82us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 32ms/step
108/108 [========= ] - 0s 79us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
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Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 31ms/step
108/108 [========= ] - Os 58us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 1s 32ms/step
108/108 [========== ] - 0s 64us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=======] - 1s 33ms/step
108/108 [========= ] - 0s 86us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 35ms/step
108/108 [========= ] - Os 90us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
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Epoch 9/10
Epoch 10/10
27/27 [=======] - 1s 35ms/step
108/108 [========== ] - 0s 69us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========== ] - 1s 34ms/step
108/108 [========= ] - 0s 87us/step
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
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27/27 [========= ] - 1s 36ms/step
108/108 [========= ] - 0s 82us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 43ms/step
108/108 [========== ] - 0s 87us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 38ms/step
108/108 [======== ] - 0s 81us/step
Epoch 1/10
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Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 1s 37ms/step
108/108 [========== ] - 0s 96us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 45ms/step
108/108 [========= ] - Os 85us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 39ms/step
108/108 [========= ] - Os 70us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 41ms/step
108/108 [========= ] - 0s 66us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 40ms/step
108/108 [========== ] - 0s 72us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 10/10
27/27 [======== ] - 1s 41ms/step
108/108 [========== ] - 0s 80us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
```

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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 1s 47ms/step
108/108 [========= ] - 0s 71us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 1s 42ms/step
108/108 [========= ] - 0s 95us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
```

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Epoch 10/10
27/27 [========== ] - 1s 47ms/step
108/108 [========== ] - Os 88us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 1s 48ms/step
108/108 [========= ] - Os 71us/step
Epoch 1/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 45ms/step
108/108 [========= ] - Os 78us/step
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Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 44ms/step
108/108 [==========] - 0s 73us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 45ms/step
108/108 [========= ] - Os 92us/step
Epoch 1/10
Epoch 2/10
```

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Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 1s 47ms/step
108/108 [======== ] - 0s 92us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 57ms/step
108/108 [========== ] - 0s 101us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
```

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Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 49ms/step
108/108 [========= ] - Os 97us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 1s 52ms/step
108/108 [========= ] - 0s 87us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
```

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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 1s 49ms/step
108/108 [========== ] - 0s 110us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 1s 49ms/step
108/108 [========= ] - 0s 89us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
```

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Epoch 9/10
Epoch 10/10
27/27 [=======] - 1s 50ms/step
108/108 [========== ] - Os 76us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
108/108 [========= ] - 0s 85us/step
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
```

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27/27 [========= ] - 1s 55ms/step
108/108 [========= ] - 0s 89us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 1s 52ms/step
108/108 [==========] - 0s 97us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 1s 53ms/step
108/108 [======== ] - 0s 99us/step
Epoch 1/10
```

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Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 1s 55ms/step
108/108 [========== ] - 0s 86us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 53ms/step
108/108 [========= ] - Os 87us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
```

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Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 1s 55ms/step
108/108 [========== ] - 0s 82us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 2s 60ms/step
108/108 [========== ] - 0s 92us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 56ms/step
108/108 [========== ] - 0s 85us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 10/10
27/27 [========= ] - 2s 57ms/step
108/108 [========== ] - 0s 87us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
```

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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 57ms/step
108/108 [========== ] - 0s 79us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 58ms/step
108/108 [========= ] - Os 80us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
```

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Epoch 10/10
27/27 [========== ] - 2s 59ms/step
108/108 [========= ] - Os 90us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 2s 59ms/step
108/108 [========= ] - Os 91us/step
Epoch 1/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 2s 59ms/step
108/108 [========= ] - Os 85us/step
```

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Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 2s 62ms/step
108/108 [========== ] - 0s 83us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 61ms/step
108/108 [========== ] - Os 90us/step
Epoch 1/10
Epoch 2/10
```

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Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 63ms/step
108/108 [======== ] - 0s 90us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 62ms/step
108/108 [========== ] - 0s 96us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
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Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 2s 65ms/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 76ms/step
108/108 [========= ] - Os 95us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 2s 69ms/step
108/108 [========= ] - 0s 93us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 64ms/step
108/108 [=========] - Os 116us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
108/108 [================== ] - 0s 193us/step - loss: 9.8703 - acc: 0.8704
```

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Epoch 9/10
Epoch 10/10
27/27 [=======] - 2s 65ms/step
108/108 [========== ] - Os 97us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 70ms/step
108/108 [=========] - Os 117us/step
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
```

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27/27 [========= ] - 2s 65ms/step
108/108 [========= ] - 0s 84us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 2s 69ms/step
108/108 [========= ] - 0s 112us/step
Epoch 1/10
Epoch 2/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 72ms/step
Epoch 1/10
```

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Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 70ms/step
108/108 [========= ] - 0s 103us/step
Epoch 1/10
Epoch 2/10
108/108 [================== ] - 0s 143us/step - loss: 128.0263 - acc: 0.3704
Epoch 3/10
108/108 [================== ] - 0s 134us/step - loss: 120.9277 - acc: 0.3704
Epoch 4/10
Epoch 5/10
108/108 [================== ] - 0s 139us/step - loss: 107.2834 - acc: 0.3148
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 70ms/step
108/108 [=========] - 0s 102us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
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Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 70ms/step
108/108 [========= ] - Os 86us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 76ms/step
108/108 [=========] - 0s 107us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
```

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Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 71ms/step
108/108 [========= ] - 0s 95us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
108/108 [================== ] - 0s 129us/step - loss: 1.7248 - acc: 0.9444
Epoch 10/10
27/27 [========= ] - 2s 74ms/step
108/108 [========== ] - 0s 105us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
```

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Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 73ms/step
108/108 [========= ] - 0s 113us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 87ms/step
108/108 [=========] - Os 125us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
```

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Epoch 10/10
27/27 [========= ] - 2s 91ms/step
108/108 [========== ] - 0s 123us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=========] - 2s 78ms/step
108/108 [========= ] - Os 99us/step
Epoch 1/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 77ms/step
```

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Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 2s 84ms/step
108/108 [========= ] - 0s 138us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 2s 81ms/step
Epoch 1/10
Epoch 2/10
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Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========= ] - 2s 91ms/step
108/108 [======== ] - 0s 87us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 78ms/step
108/108 [========== ] - 0s 131us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
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Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [======== ] - 2s 80ms/step
108/108 [========== ] - 0s 107us/step
Epoch 1/10
Epoch 2/10
108/108 [================== ] - 0s 139us/step - loss: 166.8054 - acc: 0.3148
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 83ms/step
108/108 [========== ] - 0s 132us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
108/108 [================== ] - 0s 146us/step - loss: 124.7718 - acc: 0.3611
```

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Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [=======] - 2s 87ms/step
108/108 [========== ] - 0s 110us/step
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
27/27 [========] - 2s 83ms/step
108/108 [========= ] - 0s 97us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [=========] - 2s 82ms/step
108/108 [========= ] - Os 94us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 2s 84ms/step
108/108 [========== ] - 0s 115us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
```

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Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 2s 83ms/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
108/108 [================== ] - 0s 146us/step - loss: 1.1793 - acc: 0.9444
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
```

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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========] - 2s 83ms/step
108/108 [========== ] - 0s 95us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
```

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27/27 [========= ] - 2s 83ms/step
108/108 [=========] - Os 110us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========] - 2s 85ms/step
Epoch 1/20
Epoch 2/20
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Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========] - 3s 93ms/step
108/108 [========== ] - 0s 114us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 99ms/step
108/108 [=========] - Os 122us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
```

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Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [=========] - 2s 91ms/step
108/108 [========= ] - Os 91us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
```

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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 2s 88ms/step
108/108 [========== ] - 0s 101us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
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Epoch 15/20
Epoch 16/20
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Epoch 20/20
27/27 [========] - 2s 89ms/step
108/108 [========== ] - 0s 122us/step
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========] - 3s 93ms/step
108/108 [========== ] - 0s 143us/step
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27/27 [========= ] - 2s 92ms/step
108/108 [=========] - Os 132us/step
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Epoch 20/20
27/27 [======== ] - 3s 94ms/step
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Epoch 20/20
27/27 [========] - 2s 92ms/step
108/108 [========== ] - 0s 116us/step
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Epoch 20/20
27/27 [========= ] - 2s 91ms/step
108/108 [=========] - Os 141us/step
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Epoch 8/20
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Epoch 9/20
Epoch 10/20
Epoch 11/20
108/108 [================== ] - 0s 142us/step - loss: 1.0919 - acc: 0.7315
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
108/108 [================== ] - 0s 173us/step - loss: 0.8787 - acc: 0.6944
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [=========] - 3s 94ms/step
108/108 [========= ] - 0s 108us/step
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Epoch 10/20
Epoch 11/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
108/108 [================== ] - 0s 133us/step - loss: 0.9729 - acc: 0.8704
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 2s 93ms/step
108/108 [========= ] - 0s 101us/step
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Epoch 5/20
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Epoch 15/20
Epoch 16/20
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Epoch 20/20
27/27 [======== ] - 3s 96ms/step
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Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
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Epoch 8/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [=======] - 3s 113ms/step
108/108 [========== ] - 0s 114us/step
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Epoch 4/20
Epoch 5/20
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27/27 [========= ] - 3s 116ms/step
108/108 [=========] - 0s 105us/step
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 98ms/step
Epoch 1/20
Epoch 2/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 105ms/step
108/108 [========== ] - 0s 130us/step
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Epoch 3/20
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Epoch 20/20
27/27 [========= ] - 3s 110ms/step
108/108 [=========] - Os 132us/step
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 108ms/step
108/108 [========= ] - 0s 133us/step
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Epoch 20/20
27/27 [======== ] - 3s 112ms/step
108/108 [========= ] - 0s 126us/step
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Epoch 15/20
Epoch 16/20
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Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 101ms/step
108/108 [=========== ] - Os 116us/step
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 100ms/step
108/108 [========== ] - 0s 126us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
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27/27 [========= ] - 3s 102ms/step
108/108 [=========] - Os 119us/step
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Epoch 6/20
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Epoch 13/20
Epoch 14/20
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Epoch 16/20
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Epoch 18/20
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Epoch 20/20
27/27 [========= ] - 3s 103ms/step
Epoch 1/20
Epoch 2/20
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Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 110ms/step
108/108 [========== ] - 0s 129us/step
Epoch 1/20
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Epoch 13/20
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Epoch 17/20
Epoch 18/20
Epoch 19/20
108/108 [================== ] - 0s 157us/step - loss: 0.7300 - acc: 0.8241
Epoch 20/20
108/108 [================== ] - 0s 165us/step - loss: 0.7075 - acc: 0.9074
27/27 [========= ] - 3s 106ms/step
108/108 [=========] - Os 111us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
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Epoch 7/20
Epoch 8/20
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Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
108/108 [================== ] - 0s 199us/step - loss: 0.9447 - acc: 0.8333
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 106ms/step
108/108 [========= ] - 0s 107us/step
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Epoch 10/20
Epoch 11/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
108/108 [=================== ] - 0s 159us/step - loss: 0.8800 - acc: 0.8796
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 113ms/step
108/108 [========= ] - 0s 111us/step
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Epoch 15/20
Epoch 16/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 110ms/step
108/108 [========== ] - 0s 103us/step
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========] - 3s 110ms/step
108/108 [========== ] - 0s 144us/step
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27/27 [========= ] - 3s 117ms/step
108/108 [========== ] - 0s 161us/step
Epoch 1/20
Epoch 2/20
108/108 [=================== ] - 0s 246us/step - loss: 7.3624 - acc: 0.3241
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
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Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 112ms/step
Epoch 1/20
Epoch 2/20
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Epoch 3/20
Epoch 4/20
Epoch 5/20
108/108 [================== ] - 0s 163us/step - loss: 6.1192 - acc: 0.3704
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 114ms/step
108/108 [========== ] - 0s 162us/step
Epoch 1/20
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Epoch 3/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 112ms/step
108/108 [=========] - Os 128us/step
Epoch 1/20
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Epoch 9/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 112ms/step
108/108 [========= ] - 0s 109us/step
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Epoch 12/20
Epoch 13/20
Epoch 14/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 117ms/step
108/108 [========== ] - 0s 120us/step
Epoch 1/20
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Epoch 15/20
Epoch 16/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 118ms/step
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Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 16/20
Epoch 17/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 117ms/step
108/108 [========== ] - 0s 134us/step
Epoch 1/20
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Epoch 4/20
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Epoch 19/20
Epoch 20/20
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27/27 [========= ] - 4s 137ms/step
108/108 [=========] - 0s 113us/step
Epoch 1/20
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Epoch 6/20
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Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 122ms/step
Epoch 1/20
Epoch 2/20
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Epoch 3/20
Epoch 4/20
Epoch 5/20
108/108 [================== ] - 0s 159us/step - loss: 1.5733 - acc: 0.5185
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
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Epoch 16/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 125ms/step
108/108 [========== ] - 0s 108us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 6/20
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Epoch 16/20
Epoch 17/20
Epoch 18/20
108/108 [================== ] - 0s 154us/step - loss: 0.9811 - acc: 0.9444
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 4s 142ms/step
108/108 [=========] - Os 180us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 9/20
Epoch 10/20
Epoch 11/20
108/108 [================== ] - 0s 149us/step - loss: 1.1759 - acc: 0.7037
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 120ms/step
108/108 [========= ] - 0s 130us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
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Epoch 12/20
Epoch 13/20
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Epoch 16/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 3s 123ms/step
108/108 [========= ] - 0s 114us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 13/20
Epoch 14/20
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Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 121ms/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 16/20
Epoch 17/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 125ms/step
108/108 [========== ] - 0s 116us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
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Epoch 19/20
Epoch 20/20
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27/27 [========= ] - 4s 142ms/step
108/108 [=========] - Os 145us/step
Epoch 1/20
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Epoch 3/20
Epoch 4/20
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Epoch 6/20
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Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 126ms/step
Epoch 1/20
Epoch 2/20
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Epoch 3/20
Epoch 4/20
Epoch 5/20
108/108 [=================== ] - 0s 195us/step - loss: 7.2398 - acc: 0.8241
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
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Epoch 16/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 3s 127ms/step
108/108 [========== ] - 0s 137us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 6/20
Epoch 7/20
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27/27 [========= ] - 3s 126ms/step
108/108 [=========] - Os 157us/step
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27/27 [======== ] - 4s 130ms/step
108/108 [========= ] - 0s 120us/step
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27/27 [========= ] - 4s 136ms/step
108/108 [========= ] - 0s 118us/step
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27/27 [========= ] - 3s 128ms/step
108/108 [=========== ] - 0s 164us/step
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27/27 [========] - 4s 134ms/step
108/108 [=========== ] - 0s 118us/step
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108/108 [================== ] - 0s 229us/step - loss: 1.0997 - acc: 0.9444
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27/27 [========= ] - 3s 127ms/step
108/108 [=========] - Os 174us/step
Epoch 1/20
Epoch 2/20
108/108 [================== ] - 0s 211us/step - loss: 1.9609 - acc: 0.4907
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27/27 [========= ] - 4s 137ms/step
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27/27 [========= ] - 4s 132ms/step
108/108 [========== ] - 0s 131us/step
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27/27 [========= ] - 4s 133ms/step
108/108 [=========] - Os 120us/step
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27/27 [======== ] - 4s 138ms/step
108/108 [========= ] - 0s 115us/step
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27/27 [========= ] - 4s 145ms/step
108/108 [========= ] - 0s 133us/step
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27/27 [========= ] - 4s 134ms/step
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108/108 [==================== ] - 0s 192us/step - loss: 6.2519 - acc: 0.9444
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Epoch 20/20
27/27 [========= ] - 4s 151ms/step
108/108 [========== ] - 0s 129us/step
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27/27 [========= ] - 4s 138ms/step
108/108 [=========] - Os 148us/step
Epoch 1/20
Epoch 2/20
108/108 [=================== ] - 0s 179us/step - loss: 9.9559 - acc: 0.3426
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27/27 [========= ] - 4s 136ms/step
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27/27 [========= ] - 4s 139ms/step
108/108 [========== ] - 0s 146us/step
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27/27 [========= ] - 4s 141ms/step
108/108 [=========] - Os 125us/step
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27/27 [======== ] - 4s 141ms/step
108/108 [========= ] - 0s 125us/step
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27/27 [========= ] - 4s 142ms/step
108/108 [========== ] - 0s 145us/step
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27/27 [========= ] - 4s 140ms/step
108/108 [========== ] - 0s 129us/step
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27/27 [========= ] - 4s 144ms/step
108/108 [========== ] - 0s 135us/step
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108/108 [================== ] - 0s 156us/step - loss: 1.1554 - acc: 0.9444
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27/27 [========= ] - 4s 144ms/step
108/108 [=========] - 0s 252us/step
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108/108 [================== ] - 0s 192us/step - loss: 1.0223 - acc: 0.9444
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27/27 [======== ] - 4s 144ms/step
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27/27 [========= ] - 4s 147ms/step
108/108 [========== ] - 0s 132us/step
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108/108 [=========================== - 0s 159us/step - loss: 0.9865 - acc: 0.9444
Epoch 16/20
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Epoch 18/20
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Epoch 20/20
27/27 [========= ] - 4s 147ms/step
108/108 [=========] - Os 196us/step
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27/27 [======== ] - 4s 147ms/step
108/108 [========= ] - 0s 166us/step
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27/27 [========= ] - 4s 157ms/step
108/108 [========= ] - 0s 189us/step
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27/27 [========= ] - 4s 150ms/step
108/108 [========== ] - 0s 130us/step
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27/27 [========= ] - 4s 162ms/step
108/108 [=========== ] - 0s 188us/step
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27/27 [========= ] - 4s 155ms/step
108/108 [==========] - Os 190us/step
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27/27 [========= ] - 4s 157ms/step
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27/27 [========= ] - 4s 155ms/step
108/108 [========== ] - 0s 168us/step
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27/27 [========= ] - 4s 157ms/step
108/108 [==========] - Os 190us/step
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27/27 [======== ] - 4s 154ms/step
108/108 [========= ] - 0s 177us/step
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27/27 [========= ] - 4s 158ms/step
108/108 [========== ] - 0s 135us/step
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Epoch 15/20
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108/108 [================== ] - 0s 154us/step - loss: 1.0198 - acc: 0.8241
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 4s 154ms/step
108/108 [========== ] - 0s 132us/step
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Epoch 18/20
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Epoch 20/20
27/27 [========= ] - 5s 186ms/step
108/108 [========== ] - 0s 156us/step
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27/27 [========= ] - 4s 162ms/step
108/108 [==========] - Os 130us/step
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Epoch 17/20
108/108 [================== ] - 0s 189us/step - loss: 1.0043 - acc: 0.9444
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 4s 163ms/step
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27/27 [========= ] - 4s 157ms/step
108/108 [=========== ] - 0s 184us/step
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27/27 [========= ] - 4s 162ms/step
108/108 [=========] - Os 184us/step
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Epoch 9/20
Epoch 10/20
Epoch 11/20
108/108 [========================== ] - 0s 203us/step - loss: 6.6327 - acc: 0.6944
Epoch 12/20
Epoch 13/20
Epoch 14/20
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Epoch 20/20
27/27 [========= ] - 4s 163ms/step
108/108 [========= ] - 0s 142us/step
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27/27 [======== ] - 4s 163ms/step
108/108 [========= ] - 0s 148us/step
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Epoch 15/20
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27/27 [========= ] - 4s 165ms/step
108/108 [========== ] - Os 177us/step
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Epoch 18/20
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27/27 [========= ] - 4s 159ms/step
108/108 [========== ] - 0s 171us/step
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27/27 [========= ] - 4s 163ms/step
108/108 [=========] - Os 179us/step
Epoch 1/20
Epoch 2/20
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Epoch 19/20
Epoch 20/20
27/27 [========= ] - 4s 162ms/step
Epoch 1/20
Epoch 2/20
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Epoch 3/20
Epoch 4/20
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Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 167ms/step
108/108 [========== ] - Os 190us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 6/20
Epoch 7/20
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Epoch 14/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 4s 166ms/step
108/108 [=========] - Os 145us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 5s 170ms/step
108/108 [========= ] - 0s 177us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
108/108 [================== ] - 0s 223us/step - loss: 1.7193 - acc: 0.9444
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 5s 176ms/step
108/108 [========== ] - 0s 180us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
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Epoch 11/20
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Epoch 13/20
Epoch 14/20
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Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 172ms/step
108/108 [=========== ] - Os 190us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 6s 209ms/step
108/108 [=========== ] - 0s 184us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
108/108 [================== ] - 0s 328us/step - loss: 0.9648 - acc: 0.9444
```

```
27/27 [========= ] - 5s 176ms/step
108/108 [=========] - Os 152us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 5s 176ms/step
Epoch 1/20
Epoch 2/20
```

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Epoch 3/20
Epoch 4/20
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Epoch 7/20
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Epoch 14/20
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Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 175ms/step
108/108 [========== ] - 0s 138us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 175ms/step
108/108 [=========] - Os 158us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 5s 190ms/step
108/108 [========== ] - 0s 194us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 5s 180ms/step
108/108 [========= ] - 0s 192us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
```

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Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 177ms/step
108/108 [========== ] - 0s 192us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
```

```
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 192ms/step
108/108 [========== ] - 0s 157us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
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Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
```

```
27/27 [========= ] - 5s 179ms/step
108/108 [=========] - Os 199us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 184ms/step
Epoch 1/20
Epoch 2/20
```

```
Epoch 3/20
Epoch 4/20
Epoch 5/20
108/108 [=================== ] - 0s 233us/step - loss: 108.2574 - acc: 0.4537
Epoch 6/20
108/108 [=================== ] - 0s 176us/step - loss: 101.8079 - acc: 0.6481
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 183ms/step
108/108 [========== ] - 0s 149us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
108/108 [================== ] - 0s 195us/step - loss: 108.5764 - acc: 0.3519
```

```
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 183ms/step
108/108 [=========] - 0s 139us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
```

```
Epoch 9/20
Epoch 10/20
Epoch 11/20
108/108 [================== ] - 0s 172us/step - loss: 1.5262 - acc: 0.9074
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 5s 188ms/step
108/108 [========== ] - 0s 183us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
108/108 [================== ] - 0s 194us/step - loss: 1.2742 - acc: 0.8704
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 5s 186ms/step
108/108 [========== ] - 0s 194us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
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Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
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Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 196ms/step
108/108 [=========== ] - 0s 188us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
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Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [=======] - 5s 198ms/step
108/108 [========== ] - 0s 214us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
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Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
```

```
27/27 [========= ] - 5s 186ms/step
108/108 [=========] - 0s 216us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 195ms/step
Epoch 1/20
Epoch 2/20
```

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Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 6s 222ms/step
108/108 [========== ] - 0s 198us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 193ms/step
108/108 [=========] - 0s 208us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
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Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
108/108 [=================== ] - 0s 184us/step - loss: 7.1046 - acc: 0.8241
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 6s 206ms/step
108/108 [========= ] - 0s 160us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
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Epoch 11/20
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Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [======== ] - 6s 217ms/step
108/108 [========== ] - 0s 194us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
108/108 [================== ] - 0s 194us/step - loss: 156.2574 - acc: 0.5741
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
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Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 191ms/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
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Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 195ms/step
108/108 [========== ] - 0s 151us/step
Epoch 1/20
Epoch 2/20
108/108 [================== ] - 0s 210us/step - loss: 166.5396 - acc: 0.3704
Epoch 3/20
Epoch 4/20
108/108 [================== ] - 0s 180us/step - loss: 144.3163 - acc: 0.3704
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
```

```
27/27 [========= ] - 5s 193ms/step
108/108 [=========] - Os 187us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 5s 193ms/step
Epoch 1/20
Epoch 2/20
```

```
Epoch 3/20
Epoch 4/20
Epoch 5/20
108/108 [=================== ] - 0s 292us/step - loss: 134.5084 - acc: 0.6389
Epoch 6/20
108/108 [================== ] - 0s 197us/step - loss: 124.5909 - acc: 0.6944
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
27/27 [========= ] - 6s 213ms/step
108/108 [========== ] - 0s 181us/step
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
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Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
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Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Out[7]: GridSearchCV(cv=5, error_score='raise',
    estimator=<keras.wrappers.scikit_learn.KerasClassifier object at 0x7f462814e400>,
    fit_params=None, iid=True, n_jobs=1,
    param_grid={'epochs': [10, 20], 'batch_size': [50], 'regularize': [0.01, 0.1, 1],
    pre_dispatch='2*n_jobs', refit=True, return_train_score='warn',
    scoring=None, verbose=0)
```

Best model Parameters as per the grid serach:

Best Model performance on validation set:

```
In [9]: print("best validation score is {} ".format(grid.best_score_))
best validation score is 0.9481481552124024
```

Model performance on Test data:

2 Task 2 [30 Points]

- Train a multilayer perceptron on the MNIST dataset using the traditional train/test split as given by mnist.load_data in keras.
- Use a separate 10000 samples (from the training set) for model selection and to compute learning curves (accuracy vs epochs, not vs n_samples).
- Compare a "vanilla" model with a model using drop-out. Visualize learning curves for all models. As an estimate, you should expect each model to take less than 30 minutes to train on a CPU.

```
In [3]: sess = tf.Session(config=tf.ConfigProto(log_device_placement=True))
```

Preparing data:

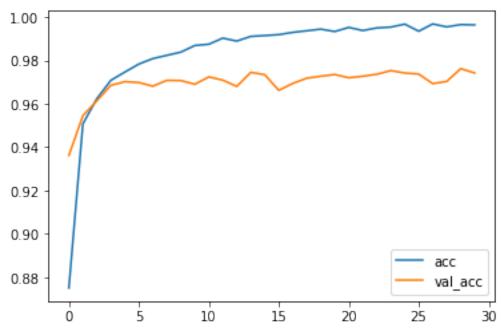
Separating a random sample of 10000 as validation set:

```
y_train_new = y_train[train_idx,:]
      X_val = X_train[val_idx,:]
      y_val = y_train[val_idx,:]
2.1 Vanilla Model:
In [6]: hidden_size_L1 = 50
      hidden_size_L2 = 100
      hidden_size_L3 = 200
      # hidden_size_L4 = 100
      hidden_size_L4 = 32
      hidden_size_L5 = 32
      mnist_model = Sequential([
            Dense(hidden_size_L1, input_shape=(X_train.shape[1],)),
            Activation('relu'),
            Dense(hidden_size_L2),
            Activation('relu'),
            Dense(hidden_size_L3),
            Activation('relu'),
            Dense(hidden_size_L4),
            Activation('relu'),
             Dense(hidden_size_L5),
      #
             Activation('relu'),
            Dense(10),
            Activation('softmax')
         ])
      mnist_model.compile("adam", "categorical_crossentropy", metrics=["accuracy"])
In [7]: mnist_model_obj = mnist_model.fit(X_train_new,
                                y_train_new,
                                batch_size=128,
                                verbose=1,epochs=30,
                                validation_data=(X_val,y_val))
Train on 50000 samples, validate on 10000 samples
Epoch 1/30
Epoch 2/30
50000/50000 [==============] - 2s 42us/step - loss: 0.1637 - acc: 0.9507 - val_l
Epoch 3/30
Epoch 4/30
Epoch 5/30
```

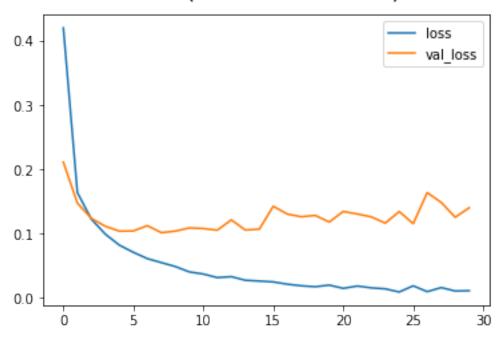
X_train_new = X_train[train_idx,:]

```
Epoch 6/30
Epoch 7/30
Epoch 8/30
Epoch 9/30
Epoch 10/30
Epoch 11/30
50000/50000 [==============] - 2s 43us/step - loss: 0.0369 - acc: 0.9875 - val_l
Epoch 12/30
50000/50000 [==============] - 2s 43us/step - loss: 0.0313 - acc: 0.9903 - val_l
Epoch 13/30
50000/50000 [=============] - 2s 43us/step - loss: 0.0328 - acc: 0.9889 - val_l
Epoch 14/30
50000/50000 [==============] - 2s 43us/step - loss: 0.0271 - acc: 0.9911 - val_l
Epoch 15/30
50000/50000 [==============] - 2s 42us/step - loss: 0.0259 - acc: 0.9915 - val_l
Epoch 16/30
Epoch 17/30
50000/50000 [==============] - 2s 41us/step - loss: 0.0210 - acc: 0.9929 - val_l
Epoch 18/30
Epoch 19/30
Epoch 20/30
Epoch 21/30
Epoch 22/30
Epoch 23/30
Epoch 24/30
50000/50000 [==============] - 2s 42us/step - loss: 0.0138 - acc: 0.9954 - val_l
Epoch 25/30
Epoch 26/30
50000/50000 [==============] - 2s 43us/step - loss: 0.0185 - acc: 0.9935 - val_l
Epoch 27/30
50000/50000 [=============] - 2s 43us/step - loss: 0.0094 - acc: 0.9968 - val_l
Epoch 28/30
Epoch 29/30
```

Accuracy (batchsize: 128)



Loss (batchsize: 128)



2.2 Dropout model:

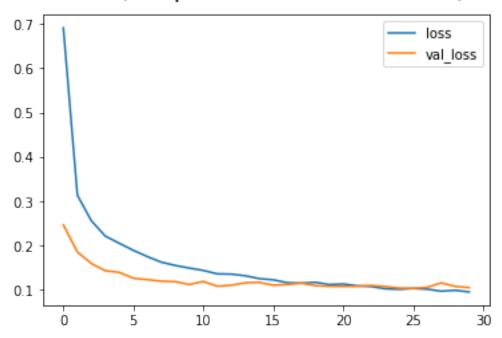
```
In [11]: dropout_L1 = 0.2
         dropout_L2 = 0.2
         dropout_L3 = 0.2
         dropout_L4 = 0.2
In [12]: mnist_model_dropout = Sequential([
                 Dense(hidden_size_L1, input_shape=(X_train.shape[1],)),
                 Activation('relu'),
                 Dropout(dropout_L1),
                 Dense(hidden_size_L2),
                 Activation('relu'),
                 Dropout(dropout_L2),
                 Dense(hidden_size_L3),
                 Activation('relu'),
                 Dropout(dropout_L3),
                 Dense(hidden_size_L4),
                 Activation('relu'),
                 Dropout(dropout_L4),
                 Dense(10),
                 Activation('softmax')
             ])
```

```
metrics=["accuracy"])
In [13]: mnist_model_dropout_obj = mnist_model_dropout.fit(X_train_new,
              y_train_new,
              batch_size=128,
              verbose=1,
              epochs=30,
              validation_data=(X_val,y_val))
Train on 50000 samples, validate on 10000 samples
Epoch 1/30
Epoch 2/30
Epoch 3/30
Epoch 4/30
Epoch 5/30
Epoch 6/30
Epoch 7/30
Epoch 8/30
Epoch 9/30
Epoch 10/30
Epoch 11/30
Epoch 12/30
Epoch 13/30
Epoch 14/30
Epoch 15/30
Epoch 16/30
Epoch 17/30
Epoch 18/30
50000/50000 [==============] - 2s 44us/step - loss: 0.1152 - acc: 0.9666 - val_l
Epoch 19/30
```

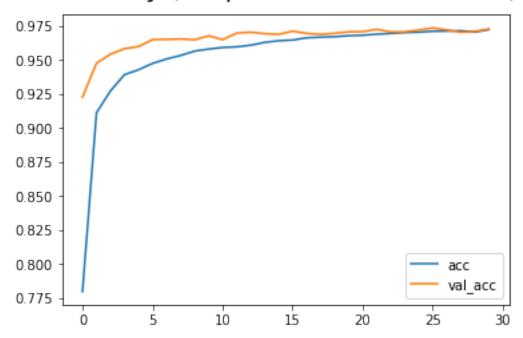
mnist_model_dropout.compile("adam","categorical_crossentropy",

```
Epoch 20/30
Epoch 21/30
Epoch 22/30
Epoch 23/30
Epoch 24/30
50000/50000 [==============] - 2s 48us/step - loss: 0.1027 - acc: 0.9700 - val_l
Epoch 25/30
50000/50000 [=============] - 2s 49us/step - loss: 0.1014 - acc: 0.9704 - val_l
Epoch 26/30
Epoch 27/30
50000/50000 [=============] - 2s 49us/step - loss: 0.1017 - acc: 0.9711 - val_l
Epoch 28/30
Epoch 29/30
Epoch 30/30
In [14]: print("Dropout Model Test Accuracy: \n")
   mnist_model_dropout.evaluate(X_test, y_test)
Dropout Model Test Accuracy:
10000/10000 [============ ] - 0s 49us/step
Out[14]: [0.10580891984964255, 0.9731]
In [15]: pd.DataFrame(mnist_model_dropout_obj.history)[['loss','val_loss']].plot()
   plt.suptitle("Loss (dropout - 0.3,0.4,0.3,0.5)",fontsize = 20)
   plt.show()
```

Loss (dropout - 0.3,0.4,0.3,0.5)



Accuracy (dropout - 0.3,0.4,0.3,0.5)



2.3 Model Comparison:

- The accuracy **without dropout** is: **0.9713**
- The accuracy with dropout is: 0.9731
- We see a clear gap between validation and train accuracy in the plots of the vanilla model which indicates that there is overfitting. Therefore, using dropout could improve generalization accuracy
- We applied dropout to the model and saw that the two curves converged to a nearly equal accuracy which represents that now the model is more generalizable.

3 Task 3 [30 Points]

- Train a convolutional neural network on the SVHN dataset in format 2 (single digit classification). You should achieve at least 85% test-set accuracy with a base model.
- Also build a model using batch normalization. Your final accuracy will be included in the grading.
- You can compare against other approaches reported here if you're curious. You shouldn't use the "extra" data. On a CPU, each epoch (pass through the training set) can take up to ~40 minutes.
- Hint: Make sure you are doing the reshape for the training set correctly. A direct reshape
 might give you garbled images. Display an image after reshaping to make sure they are
 correct.

```
In [3]: sess = tf.Session(config=tf.ConfigProto(log_device_placement=True))
```

data import:

data pre-processing:

3.1 Base model (Without Batch Normalization):

Model Building:

```
In [34]: conv_11 = 48
         conv 12 = 64
         conv_13 = 128
         conv_14 = 160
         dense_11 = 1024
         dense_12 = 512
         dropout = 0.2
In [35]: model = Sequential()
         model.add(Conv2D(conv_l1, kernel_size=(3,3),
                          input_shape = input_shape,
                          activation="relu",padding='same'))
         model.add(Dropout(dropout))
         model.add(MaxPooling2D(pool_size=(2,2)))
         model.add(Conv2D(conv_12, kernel_size=(3,3),
                          activation="relu",padding='same'))
         model.add(Dropout(dropout))
         model.add(MaxPooling2D(pool_size=(2,2)))
         model.add(Conv2D(conv_13, kernel_size=(3,3),
                          activation="relu",padding='same'))
         model.add(Dropout(dropout))
         model.add(MaxPooling2D(pool_size=(2,2)))
         # model.add(Conv2D(conv_l4, kernel_size=(3,3),
                            activation="relu", padding='same'))
         # model.add(Dropout(dropout))
         # model.add(MaxPooling2D(pool_size=(2,2)))
         model.add(Flatten())
         model.add(Dense(dense_l1, activation='relu'))
         model.add(Dropout(dropout))
         model.add(Dense(dense_12, activation='relu'))
         model.add(Dense(num_classes, activation='softmax'))
         model.compile("adam", "categorical_crossentropy",
                       metrics=["accuracy"])
In [36]: model.summary()
```

Layer (type)	Output Shape	Param #
conv2d_24 (Conv2D)	(None, 32, 32, 48)	1344
dropout_30 (Dropout)	(None, 32, 32, 48)	0
max_pooling2d_24 (MaxPooling	(None, 16, 16, 48)	0
conv2d_25 (Conv2D)	(None, 16, 16, 64)	27712
dropout_31 (Dropout)	(None, 16, 16, 64)	0
max_pooling2d_25 (MaxPooling	(None, 8, 8, 64)	0
conv2d_26 (Conv2D)	(None, 8, 8, 128)	73856
dropout_32 (Dropout)	(None, 8, 8, 128)	0
max_pooling2d_26 (MaxPooling	(None, 4, 4, 128)	0
flatten_7 (Flatten)	(None, 2048)	0
dense_19 (Dense)	(None, 1024)	2098176
dropout_33 (Dropout)	(None, 1024)	0
dense_20 (Dense)	(None, 512)	524800
dense_21 (Dense)	(None, 10)	5130
Total params: 2,731,018 Trainable params: 2,731,018 Non-trainable params: 0		
<pre>In [37]: model_hist = model.:</pre>	<pre>fit(X_train, y_train, batch_size=256, epochs=20, verbose=1, validation_split = .1)</pre>	

Train on 65931 samples, validate on 7326 samples

Epoch 1/20

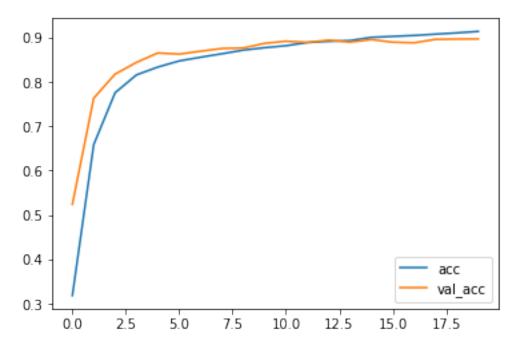
Epoch 2/20

194

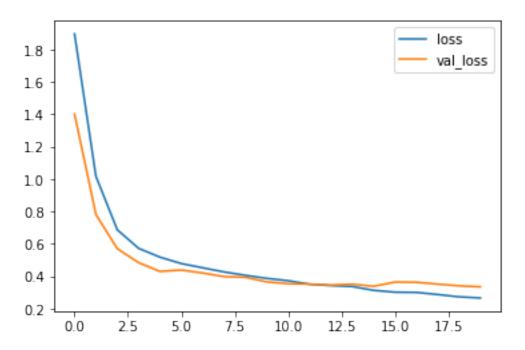
```
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
In [38]: print("Base Model Test Accuracy: \n")
 model.evaluate(X_test, y_test)
Base Model Test Accuracy:
26032/26032 [============= ] - 4s 148us/step
```

Out[38]: [0.3323163653173803, 0.90069913952059]

Accuracy (Without Batch Normalization)



Loss (Without Batch Normalization)



3.2 Model with Batch Normalization:

```
In [41]: sess = tf.Session(config=tf.ConfigProto(log_device_placement=True))
In [42]: model_bn = Sequential()
         model_bn.add(Conv2D(conv_l1,
                             kernel_size=(3,3),
                             input_shape = input_shape,
                             activation="relu",padding='same'))
         model_bn.add(BatchNormalization())
         model_bn.add(Dropout(dropout))
         model_bn.add(MaxPooling2D(pool_size=(2,2)))
         model_bn.add(Conv2D(conv_12, kernel_size=(3,3),
                             activation="relu",padding='same'))
         model_bn.add(BatchNormalization())
         model_bn.add(Dropout(dropout))
         model_bn.add(MaxPooling2D(pool_size=(2,2)))
         model_bn.add(Conv2D(conv_13, kernel_size=(3,3),
                             activation="relu",padding='same'))
         model_bn.add(BatchNormalization())
         model_bn.add(Dropout(dropout))
         model_bn.add(MaxPooling2D(pool_size=(2,2)))
         # model_bn.add(Conv2D(conv_l4, kernel_size=(3,3),
                               activation="relu",padding='same'))
```

In [43]: model_bn.summary()

Layer (type)	Output Shape	Param #
conv2d_27 (Conv2D)	(None, 32, 32, 48)	1344
batch_normalization_5 (Batch	(None, 32, 32, 48)	192
dropout_34 (Dropout)	(None, 32, 32, 48)	0
max_pooling2d_27 (MaxPooling	(None, 16, 16, 48)	0
conv2d_28 (Conv2D)	(None, 16, 16, 64)	27712
batch_normalization_6 (Batch	(None, 16, 16, 64)	256
dropout_35 (Dropout)	(None, 16, 16, 64)	0
max_pooling2d_28 (MaxPooling	(None, 8, 8, 64)	0
conv2d_29 (Conv2D)	(None, 8, 8, 128)	73856
batch_normalization_7 (Batch	(None, 8, 8, 128)	512
dropout_36 (Dropout)	(None, 8, 8, 128)	0
max_pooling2d_29 (MaxPooling	(None, 4, 4, 128)	0
flatten_8 (Flatten)	(None, 2048)	0
dense_22 (Dense)	(None, 1024)	2098176
dropout_37 (Dropout)	(None, 1024)	0
dense_23 (Dense)	(None, 512)	524800

```
______
Total params: 2,731,978
Trainable params: 2,731,498
Non-trainable params: 480
In [44]: model_bn_hist = model_bn.fit(X_train,
       y_train,
       batch_size=256,
       epochs=20,
       verbose=1,
       validation_split = .1)
Train on 65931 samples, validate on 7326 samples
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
```

5130

(None, 10)

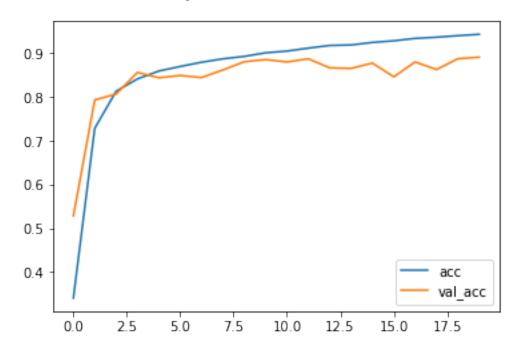
dense_24 (Dense)

Model with Batch Normalization Test Accuracy:

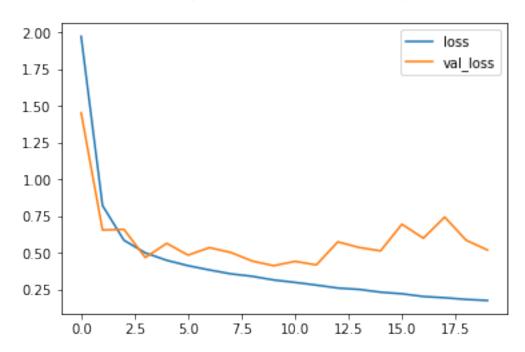
26032/26032 [===========] - 5s 177us/step

Out [45]: [0.5182511254915534, 0.8936693300553166]

Accuracy (With Batch Normalization)



Loss (With Batch Normalization)



4 Task 4 [30 points]

- Load the weights of a pre-trained convolutional neural network included in keras, see https://keras.io/applications/, and use it as feature extraction method to train a linear model or MLP (scikit-learn or keras are fine) on the pets dataset (http://www.robots.ox.ac.uk/~vgg/data/pets/).
- You should achieve at least 70% accuracy. It's recommended you store the extracted features on disk so you don't have to recompute them for model selection.
- We will be working with the 37 class classification task.

```
import PIL
from PIL import Image
from PIL.Image import core as _imaging
from sklearn.linear_model import LogisticRegressionCV
from sklearn.metrics import confusion_matrix

from keras.applications.inception_v3 import preprocess_input
from keras.applications.vgg16 import preprocess_input as preprocess_input_vgg
```

Data import

```
In [50]: images_dataset_dir = "images"
    ground_truth_dir = "annotations"
    test_file = open('annotations/test.txt')
    test_names_list = test_file.readlines()
    train_file = open('annotations/trainval.txt')
    train_names_list = train_file.readlines()

test_class_labels = [ name.split()[1] for name in test_names_list]
    test_class_names = [ name.split()[0] for name in test_names_list]
    test_name_label_dict = dict(zip(test_class_names,test_class_labels))

train_class_labels = [ name.split()[1] for name in train_names_list]
    train_class_names = [ name.split()[0] for name in train_names_list]
    train_name_label_dict = dict(zip(train_class_names,train_class_labels))
```

Data Preprocessing

- Reading in images into a numpy array
- Separating images to test and train sets based on image names given in trainval.txt file and test.txt file

```
interpolation='nearest')
             x = img_to_array(img)
             breed_name = imageName[:-4]
             if breed_name in train_class_names:
                 train_data.append(x)
                 train_labels.append(train_name_label_dict[breed_name])
             elif breed_name in test_class_names:
                 test_data.append(x)
                 test_labels.append(test_name_label_dict[breed_name])
             else:
                 print("Breed not found. Invalid image:", imageName, breed_name)
.mat error for file: Abyssinian_100.mat
.mat error for file: Abyssinian_101.mat
.mat error for file: Abyssinian_102.mat
Breed not found. Invalid image: Abyssinian_34.jpg Abyssinian_34
Breed not found. Invalid image: Abyssinian_82.jpg Abyssinian_82
Breed not found. Invalid image: Bombay_11.jpg Bombay_11
Breed not found. Invalid image: Bombay_189.jpg Bombay_189
Breed not found. Invalid image: Bombay_190.jpg Bombay_190
Breed not found. Invalid image: Bombay_192.jpg Bombay_192
Breed not found. Invalid image: Bombay_203.jpg Bombay_203
Breed not found. Invalid image: Bombay_206.jpg Bombay_206
Breed not found. Invalid image: Bombay_209.jpg Bombay_209
Breed not found. Invalid image: Bombay_210.jpg Bombay_210
Breed not found. Invalid image: Bombay_217.jpg Bombay_217
Breed not found. Invalid image: Bombay_22.jpg Bombay_22
Breed not found. Invalid image: Bombay_220.jpg Bombay_220
Breed not found. Invalid image: Bombay_32.jpg Bombay_32
Breed not found. Invalid image: Bombay_69.jpg Bombay_69
Breed not found. Invalid image: Bombay_85.jpg Bombay_85
Breed not found. Invalid image: Bombay_92.jpg Bombay_92
Breed not found. Invalid image: Bombay_99.jpg Bombay_99
Breed not found. Invalid image: Egyptian_Mau_129.jpg Egyptian_Mau_129
Breed not found. Invalid image: Egyptian_Mau_139.jpg Egyptian_Mau_139
Breed not found. Invalid image: Egyptian_Mau_145.jpg Egyptian_Mau_145
Breed not found. Invalid image: Egyptian_Mau_167.jpg Egyptian_Mau_167
Breed not found. Invalid image: Egyptian_Mau_177.jpg Egyptian_Mau_177
Breed not found. Invalid image: Egyptian_Mau_183.jpg Egyptian_Mau_183
Breed not found. Invalid image: Egyptian_Mau_191.jpg Egyptian_Mau_191
Breed not found. Invalid image: Egyptian_Mau_202.jpg Egyptian_Mau_202
Breed not found. Invalid image: Egyptian_Mau_41.jpg Egyptian_Mau_41
Breed not found. Invalid image: Egyptian_Mau_71.jpg Egyptian_Mau_71
Breed not found. Invalid image: Siamese_203.jpg Siamese_203
Breed not found. Invalid image: boxer_82.jpg boxer_82
Breed not found. Invalid image: english_cocker_spaniel_162.jpg english_cocker_spaniel_162
```

```
Breed not found. Invalid image: english_cocker_spaniel_163.jpg english_cocker_spaniel_163
Breed not found. Invalid image: english_cocker_spaniel_164.jpg english_cocker_spaniel_164
Breed not found. Invalid image: english_cocker_spaniel_179.jpg english_cocker_spaniel_179
Breed not found. Invalid image: keeshond_59.jpg keeshond_59
Breed not found. Invalid image: newfoundland_152.jpg newfoundland_152
Breed not found. Invalid image: newfoundland_153.jpg newfoundland_153
Breed not found. Invalid image: newfoundland_154.jpg newfoundland_154
Breed not found. Invalid image: newfoundland_155.jpg newfoundland_155
Breed not found. Invalid image: staffordshire_bull_terrier_2.jpg staffordshire_bull_terrier_2
Breed not found. Invalid image: staffordshire_bull_terrier_22.jpg staffordshire_bull_terrier_22
In [52]: train_labels_np = np.array(train_labels)
         test_labels_np = np.array(test_labels)
         train_data_np = np.array(train_data)
         test_data_np = np.array(test_data)
Model import
In [53]: model_inc = applications.inception_v3.InceptionV3(include_top=False,
                                                           weights='imagenet',
                                                           input_tensor=None,
                                                            input_shape=(150,150,3),
                                                           pooling=None, classes=1000)
In [54]: train_inc = preprocess_input(train_data_np)
         test_inc = preprocess_input(test_data_np)
         feat_train_inc = model_inc.predict(train_inc)
         X_train = feat_train_inc.reshape(feat_train_inc.shape[0], -1)
         y_train = np.array(train_labels_np,copy=True)
         feat_test_inc = model_inc.predict(test_inc)
         X_test = feat_test_inc.reshape(feat_test_inc.shape[0], -1)
         y_test = np.array(test_labels_np,copy = True)
  Saving the features data:
In [55]: import h5py
         with h5py.File('features-inc3_train.h5', 'w') as hf:
             hf.create_dataset("feat_train_inc", data=feat_train_inc)
         with h5py.File('features-inc3_test.h5', 'w') as hf:
             hf.create_dataset("feat_test_inc", data=feat_test_inc)
In [56]: y_train = y_train.astype(int)
        y_test = y_test.astype(int)
         y_{train}[y_{train} == 37] = 0
         y_test[y_test == 37] = 0
```

4.0.1 Running a classifier on the features data:

LinearSVC Classifier: