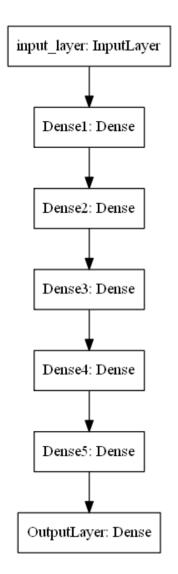
- 1. Download the data from here
- 2. Code the model to classify data like below image



- 3. Write your own callback function, that has to print the micro F1 score and AUC score after each epoch. \*\*DONE\*\*
- 4. Save your model at every epoch if your validation accuracy is improved from previous epoch. \*\* KINDA DONE\*\*

- 5. you have to decay learning based on below conditions
  - Cond1. If your validation accuracy at that epoch is less than previous epoch accuracy, you have to decrese the learning rate by 10%. DONE
  - Cond2. For every 3rd epoch, decay your learning rate by 5%.DONE
- 6. If you are getting any NaN values(either weigths or loss) while training, you have to terminate your training. DONE
- 7. You have to stop the training if your validation accuracy is not increased in last 2 epochs. DONE
- 8. Use tensorboard for every model and analyse your gradients. (you need to upload the screenshots for each model for evaluation)
- 9. use cross entropy as loss function
- 10. Try the architecture params as given below.

#### Model-1

- 1. Use tanh as an activation for every layer except output layer.
- 2. use SGD with momentum as optimizer.
- 3. use RandomUniform(0,1) as initilizer.
- 3. Analyze your output and training process.

### Model-2

- 1. Use relu as an activation for every layer except output layer.
- 2. use SGD with momentum as optimizer.
- 3. use RandomUniform(0,1) as initilizer.
- 3. Analyze your output and training process.

- 1. Use relu as an activation for every layer except output layer.
- 2. use SGD with momentum as optimizer.
- use he uniform() as initilizer.
- 3. Analyze your output and training process.

### Model-4

1. Try with any values to get better accuracy/f1 score.

```
%load ext tensorboard
!rm -rf ./logs/
pip install tensorflow-addons
     Collecting tensorflow-addons
       Downloading tensorflow addons-0.14.0-cp37-cp37m-manylinux 2 12 x86 64.manylinux2010 x86 64.whl (1.1 MB)
                                 1.1 MB 5.2 MB/s
     Requirement already satisfied: typeguard>=2.7 in /usr/local/lib/python3.7/dist-packages (from tensorflow-addons) (2.7.1)
     Installing collected packages: tensorflow-addons
     Successfully installed tensorflow-addons-0.14.0
import tensorflow as tf
import pandas as pd
from sklearn.model selection import train test split
import datetime
from tensorflow.keras.layers import Dense, Input, Activation
import keras
from tensorflow.keras.models import Model
import tensorflow addons as tfa
from keras import metrics
from tensorflow.keras.callbacks import EarlyStopping, LearningRateScheduler, ReduceLROnPlateau, TerminateOnNaN, ModelCheckpoint
import random as rn
```

```
import numpy as np
from keras.callbacks import Callback
from sklearn.metrics import confusion matrix, f1 score, precision score, recall score, roc auc score
data = pd.read csv('data.csv')
X = data[['f1', 'f2']]
v = data['label']
print(X.shape)
print(v.shape)
     (20000, 2)
     (20000,)
X train, X test, y train, y test = train test split(X, y, test size=0.33)
def changedLearningRate(epoch, lr):
  """In this function, we decrease the learning rate by 5% every third epoch"""
  if ((epoch+1)\%3 == 0):
   1r = 0.95 * 1r
  return float(lr)
class Metrics(Callback):
  def on train begin(self, logs={}):
    self.val f1s = []
    self.val recalls = []
    self.val precisions = []
    self.val aucs = []
  def on epoch end(self, epoch, logs={}):
    val predict = (np.asarray(self.model.predict(X test))).round()
   val_targ = y_test
    val f1 = f1 score(val targ, val predict)
    val recall = recall score(val targ, val predict)
   val precision = precision_score(val_targ, val_predict)
    _val_auc = roc_auc_score(val_targ, val_predict)
    self.val f1s.append( val f1)
    self.val recalls.append( val recall)
    self.val precisions.append( val precision)
```

```
self.val_aucs.append(_val_auc)

print("val_f1: %f - val_precision: %f - val_recall %f - val_auc %f" %(_val_f1, _val_precision, _val_recall, _val_auc))

return

metrics = Metrics()
#source: https://medium.com/@thongonary/how-to-compute-f1-score-for-each-epoch-in-keras-alacd17715a2
```

# Model 1

```
input laver = Input(shape=(2, ))
layer1 = Dense(784, activation='tanh', kernel initializer=tf.keras.initializers.random uniform(0, 1))(input layer)
layer2 = Dense(512, activation='tanh', kernel initializer=tf.keras.initializers.random uniform(0, 1))(layer1)
layer3 = Dense(256, activation='tanh', kernel initializer=tf.keras.initializers.random uniform(0, 1))(layer2)
layer4 = Dense(64, activation='tanh', kernel initializer=tf.keras.initializers.random uniform(0, 1))(layer3)
layer5 = Dense(32, activation='tanh', kernel initializer=tf.keras.initializers.random uniform(0, 1))(layer4)
output = Dense(1, activation='sigmoid', kernel initializer=tf.keras.initializers.random uniform(0, 1))(laver5)
model1 = Model(inputs = input layer, outputs = output)
optimizer = tf.keras.optimizers.SGD(learning rate=0.1, momentum=0.1, nesterov=True)
model1.compile(optimizer=optimizer, loss='binary crossentropy', metrics=['accuracy'])
log dir="logs/fit/model1/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")
tensorboard callback = tf.keras.callbacks.TensorBoard(log dir=log dir, histogram freq=1, write graph=True, write grads=True)
filepath = "model save/weights-{epoch:02d}-{val accuracy:.4f}.hdf5"
checkpoint = ModelCheckpoint(filepath=filepath, monitor='val accuracy', verbose=1, save best only=True, mode='max')
reduce lr = ReduceLROnPlateau(monitor = 'val accuracy', factor=0.9, patience=1, verbose=1, mode='auto')
terminate tr = TerminateOnNaN()
earlystop = EarlyStopping(monitor='val accuracy', patience=2, verbose=1, mode='max')
lrschedule = LearningRateScheduler(changedLearningRate, verbose=1)
model1.fit(X train, y train, epochs=10, validation data=(X test, y test), validation split=0.2, callbacks=[checkpoint, reduce lr, terminate tr,
     WARNING:tensorflow:`write grads` will be ignored in TensorFlow 2.0 for the `TensorBoard` Callback.
     Epoch 1/10
```

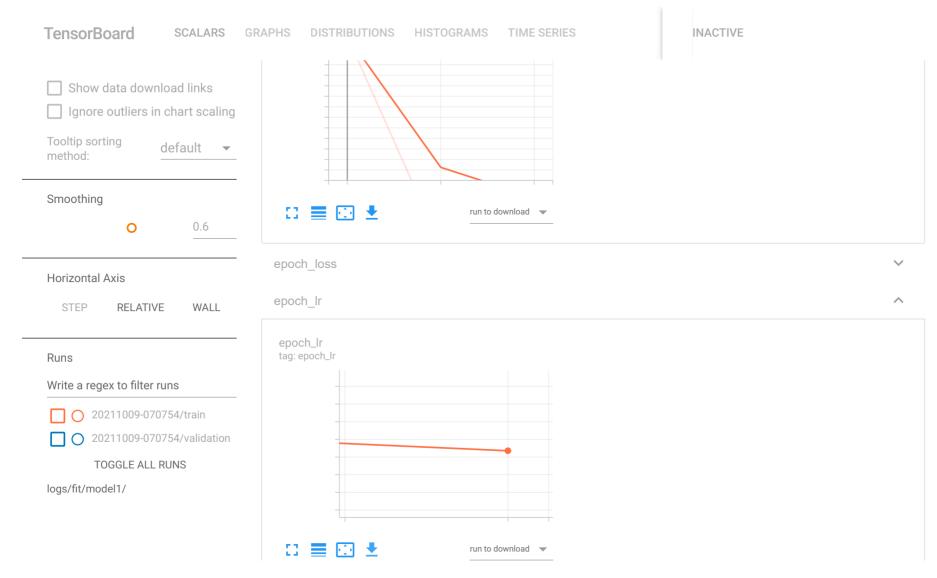
```
Epoch 00001: LearningRateScheduler setting learning rate to 0.10000000149011612.
    WARNING:tensorflow:Callback method `on train batch end` is slow compared to the batch time (batch time: 0.0048s vs `on train batch end` time: 0.0
   Epoch 00001: val accuracy improved from -inf to 0.50858, saving model to model save/weights-01-0.5086.hdf5
   val f1: 0.491618 - val precision: 0.491768 - val recall 0.491469 - val auc 0.494529
   Fnoch 2/10
   Epoch 00002: LearningRateScheduler setting learning rate to 0.10000000149011612.
   Epoch 00002: val accuracy did not improve from 0.50858
   Epoch 00002: ReduceLROnPlateau reducing learning rate to 0.09000000134110452.
   val f1: 0.491618 - val precision: 0.491768 - val recall 0.491469 - val auc 0.494529
   Epoch 3/10
   Epoch 00003: LearningRateScheduler setting learning rate to 0.08550000339746475.
   Epoch 00003: val accuracy did not improve from 0.50858
   Epoch 00003: ReduceLROnPlateau reducing learning rate to 0.07695000171661377.
   val f1: 0.491618 - val precision: 0.491768 - val recall 0.491469 - val auc 0.494529
   Epoch 00003: early stopping
   <keras.callbacks.History at 0x7fa011530c50>
%load ext tensorboard
   The tensorboard extension is already loaded. To reload it, use:
```

%reload ext tensorboard

%tensorboard --logdir logs/fit/model1/

/bin/bash: line 0: kill: (197) - No such process

!kill 197



## Model 2

```
input_layer = Input(shape=(2, ))

layer1 = Dense(784, activation='relu', kernel_initializer=tf.keras.initializers.random_uniform(0, 1))(input_layer)

layer2 = Dense(512, activation='relu', kernel_initializer=tf.keras.initializers.random_uniform(0, 1))(layer1)

layer3 = Dense(256, activation='relu', kernel_initializer=tf.keras.initializers.random_uniform(0, 1))(layer2)

layer4 = Dense(64, activation='relu', kernel_initializer=tf.keras.initializers.random_uniform(0, 1))(layer3)

layer5 = Dense(32, activation='relu', kernel_initializer=tf.keras.initializers.random_uniform(0, 1))(layer4)
```

```
TAYOF - DOING JAE, ACCEPACION- FOLD , ROFFICE INTERNITED -CLERCE AS.INTERNITED AND AUTHORITO HILLOTHICO, IJ//IAYOF -J
output = Dense(1, activation='sigmoid', kernel initializer=tf.keras.initializers.random uniform(0, 1))(laver5)
model2 = Model(inputs = input layer, outputs = output)
optimizer = tf.keras.optimizers.SGD(learning rate=0.1, momentum=0.9, nesteroy=True)
model2.compile(optimizer=optimizer, loss='binary crossentropy', metrics=['accuracy'])
log dir="logs/fit/model2/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")
tensorboard callback = tf.keras.callbacks.TensorBoard(log dir=log dir, histogram freg=1, write graph=True, write grads=True)
filepath = "model save/weights-{epoch:02d}-{val accuracy:.4f}.hdf5"
checkpoint = ModelCheckpoint(filepath=filepath, monitor='val accuracy', verbose=1, save best only=True, mode='max')
reduce lr = ReduceLROnPlateau(monitor = 'val accuracy', factor=0.9, patience=1, verbose=1, mode='auto')
terminate tr = TerminateOnNaN()
earlystop = EarlyStopping(monitor='val accuracy', patience=2, verbose=1, mode='max')
lrschedule = LearningRateScheduler(changedLearningRate, verbose=1)
model2.fit(X train, v train, epochs=10, validation data=(X test, v test), validation split=0.2, callbacks=[checkpoint, reduce lr, terminate tr,
    WARNING:tensorflow:`write grads` will be ignored in TensorFlow 2.0 for the `TensorBoard` Callback.
    Epoch 1/10
    Epoch 00001: LearningRateScheduler setting learning rate to 0.10000000149011612.
      3/335 [......] - ETA: 37s - loss: 271526528.0000 - accuracy: 0.5000WARNING:tensorflow:Callback method `on train batch b
    WARNING: tensorflow: Callback method `on train batch end` is slow compared to the batch time (batch time: 0.0039s vs `on train batch end` time: 0.0
    Epoch 00001: val accuracy improved from -inf to 0.49664, saving model to model save/weights-01-0.4966.hdf5
    val f1: 0.000000 - val precision: 0.000000 - val recall 0.000000 - val auc 0.500000
    Epoch 2/10
    Epoch 00002: LearningRateScheduler setting learning rate to 0.10000000149011612.
     16/335 [>......] - ETA: 1s - loss: 0.6947 - accuracy: 0.4824/usr/local/lib/python3.7/dist-packages/sklearn/metrics/ class
      warn prf(average, modifier, msg start, len(result))
    Epoch 00002: val accuracy did not improve from 0.49664
    Epoch 00002: ReduceLROnPlateau reducing learning rate to 0.09000000134110452.
    val f1: 0.000000 - val precision: 0.000000 - val recall 0.000000 - val auc 0.500000
    Epoch 3/10
    Epoch 00003: LearningRateScheduler setting learning rate to 0.08550000339746475.
     15/335 [>......] - ETA: 1s - loss: 0.6925 - accuracy: 0.5271/usr/local/lib/python3.7/dist-packages/sklearn/metrics/ class
      warn prf(average, modifier, msg start, len(result))
```

```
Epoch 00003: val accuracy improved from 0.49664 to 0.50336, saving model to model save/weights-03-0.5034.hdf5
val f1: 0.664238 - val precision: 0.497273 - val recall 1.000000 - val auc 0.500000
Epoch 4/10
Epoch 00004: LearningRateScheduler setting learning rate to 0.08550000190734863.
Epoch 00004: val accuracy did not improve from 0.50336
Epoch 00004: ReduceLROnPlateau reducing learning rate to 0.07695000171661377.
val f1: 0.664238 - val precision: 0.497273 - val recall 1.000000 - val auc 0.500000
Epoch 5/10
Epoch 00005: LearningRateScheduler setting learning rate to 0.07694999873638153.
Epoch 00005: val accuracy did not improve from 0.50336
Epoch 00005: ReduceLROnPlateau reducing learning rate to 0.06925499886274337.
val f1: 0.000000 - val precision: 0.000000 - val recall 0.000000 - val auc 0.500000
Epoch 00005: early stopping
/usr/local/lib/python3.7/dist-packages/sklearn/metrics/ classification.py:1272: UndefinedMetricWarning: Precision is ill-defined and being set to
 warn prf(average, modifier, msg start, len(result))
<keras.callbacks.Historv at 0x7fa011cd4a50>
/bin/bash: line 0: kill: (198) - No such process
```

!kill 198

%tensorboard --logdir logs/fit/model2/

С⇒

TensorBoard scalars graphs distributions histograms time series inactive



## Model 3

```
input_layer = Input(shape=(2, ))

layer1 = Dense(784, activation='relu', kernel_initializer=tf.keras.initializers.HeUniform)(input_layer)
layer2 = Dense(512, activation='relu', kernel_initializer=tf.keras.initializers.HeUniform)(layer1)
layer3 = Dense(256, activation='relu', kernel_initializer=tf.keras.initializers.HeUniform)(layer2)
layer4 = Dense(64, activation='relu', kernel_initializer=tf.keras.initializers.HeUniform)(layer3)
layer5 = Dense(32, activation='relu', kernel_initializer=tf.keras.initializers.HeUniform)(layer4)

output = Dense(1, activation='sigmoid', kernel_initializer=tf.keras.initializers.HeUniform)(layer5)

model3 = Model(inputs = input_layer, outputs = output)
optimizer = tf.keras.optimizers.SGD(learning_rate=0.1, momentum=0.9, nesterov=True)
```

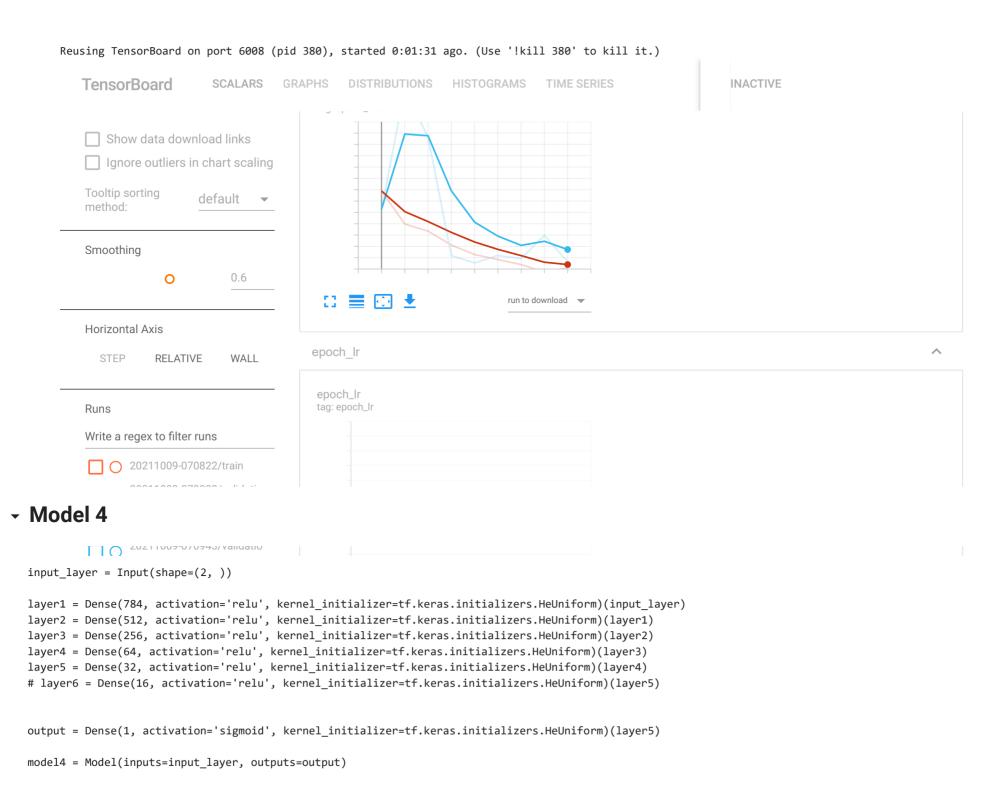
```
model3.compile(optimizer=optimizer, loss='binary crossentropy', metrics=['accuracy'])
log dir="logs/fit/model3/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")
tensorboard callback = tf.keras.callbacks.TensorBoard(log dir=log dir. histogram freg=1, write graph=True, write grads=True)
filepath = "model save/weights-{epoch:02d}-{val accuracy:.4f}.hdf5"
checkpoint = ModelCheckpoint(filepath=filepath, monitor='val accuracy', verbose=1, save best only=True, mode='max')
reduce lr = ReduceLROnPlateau(monitor = 'val accuracy', factor=0.9, patience=1, verbose=1, mode='auto')
terminate tr = TerminateOnNaN()
earlystop = EarlyStopping(monitor='val accuracy', patience=2, verbose=1, mode='max')
lrschedule = LearningRateScheduler(changedLearningRate, verbose=1)
model3.fit(X train, v train, epochs=10, validation data=(X test, v test), validation split=0.2, callbacks=[checkpoint, reduce lr, terminate tr,
    Epoch 00003: LearningRateScheduler setting learning rate to 0.09500000141561031.
    Epoch 00003: val accuracy did not improve from 0.58843
    Epoch 00003: ReduceLROnPlateau reducing learning rate to 0.08549999892711639.
    val f1: 0.679632 - val precision: 0.520311 - val recall 0.979586 - val auc 0.543138
    Epoch 4/10
    Epoch 00004: LearningRateScheduler setting learning rate to 0.08550000190734863.
    Epoch 00004: val accuracy improved from 0.58843 to 0.64552, saving model to model save/weights-04-0.6455.hdf5
    val f1: 0.665851 - val precision: 0.668407 - val recall 0.663315 - val auc 0.668909
    Epoch 5/10
    Epoch 00005: LearningRateScheduler setting learning rate to 0.08550000190734863.
    Epoch 00005: val accuracy improved from 0.64552 to 0.65037, saving model to model save/weights-05-0.6504.hdf5
    val f1: 0.688681 - val precision: 0.653709 - val recall 0.727605 - val auc 0.673176
    Epoch 6/10
    Epoch 00006: LearningRateScheduler setting learning rate to 0.0812250018119812.
    Epoch 00006: val accuracy did not improve from 0.65037
    Epoch 00006: ReduceLROnPlateau reducing learning rate to 0.07310250028967857.
    val f1: 0.618842 - val precision: 0.715142 - val recall 0.545399 - val auc 0.665255
    Epoch 7/10
    Epoch 00007: LearningRateScheduler setting learning rate to 0.07310250401496887.
```

```
Epoch 00007: val accuracy improved from 0.65037 to 0.65410, saving model to model save/weights-07-0.6541.hdf5
val f1: 0.663225 - val precision: 0.681453 - val recall 0.645948 - val auc 0.673637
Epoch 8/10
Epoch 00008: LearningRateScheduler setting learning rate to 0.07310250401496887.
Epoch 00008: val accuracy did not improve from 0.65410
Epoch 00008: ReduceLROnPlateau reducing learning rate to 0.06579225361347199.
val f1: 0.430323 - val precision: 0.802161 - val recall 0.294028 - val auc 0.611149
Epoch 9/10
Epoch 00009: LearningRateScheduler setting learning rate to 0.0625026423484087.
335/335 [============] - 1s 4ms/step - loss: 0.6209 - accuracy: 0.6587 - val loss: 0.6264 - val accuracy: 0.6511
Epoch 00009: val accuracy did not improve from 0.65410
Epoch 00009: ReduceLROnPlateau reducing learning rate to 0.05625238046050072.
val f1: 0.643550 - val precision: 0.698537 - val recall 0.596587 - val auc 0.670958
Epoch 00009: early stopping
<keras.callbacks.History at 0x7fa0e4de73d0>
```

### !kill 197

/bin/bash: line 0: kill: (197) - No such process

%tensorboard --logdir logs/fit/model3/



```
optimizer = tf.keras.optimizers.Adam(learning rate=0.01, beta 1=0.9, beta 2=0.999, epsilon=1e-07, amsgrad=False, name="Adam",)
model4.compile(optimizer=optimizer, loss='binary crossentropy', metrics=['accuracy'])
log dir="logs/fit/model4/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")
tensorboard callback = tf.keras.callbacks.TensorBoard(log dir=log dir, histogram freq=1, write graph=True, write grads=True)
filepath = "model save/weights-{epoch:02d}-{val accuracy:.4f}.hdf5"
checkpoint = ModelCheckpoint(filepath=filepath, monitor='val accuracy', verbose=1, save best only=True, mode='max')
reduce lr = ReduceLROnPlateau(monitor='val accuracy', factor=0.9, patience=1, verbose=1, mode='auto')
terminate tr = TerminateOnNaN()
earlystop = EarlyStopping(monitor='val accuracy', patience=2, verbose=1, mode='max')
lrschedule = LearningRateScheduler(changedLearningRate, verbose=1)
model4.fit(X train, v train, epochs=10, validation data=(X test, v test), validation split=0.2, callbacks=[checkpoint, reduce lr, terminate tr,
    w 2.0 for the 'TensorBoard' Callback.
     .009999999776482582.
    .4966 - accuracy: 0.5312WARNING:tensorflow:Callback method `on train batch begin` is slow compared to the batch time (batch time: 0.0050s vs `o
    ow compared to the batch time (batch time: 0.0050s vs `on train batch end` time: 0.0196s). Check your callbacks.
    : 0.7274 - accuracy: 0.5904 - val loss: 0.6610 - val accuracy: 0.5955
    ng model to model save/weights-01-0.5955.hdf5
    056 - val auc 0.579095
     .009999999776482582.
    : 0.6340 - accuracy: 0.6368 - val loss: 0.6334 - val accuracy: 0.6466
    aving model to model save/weights-02-0.6466.hdf5
    910 - val auc 0.633827
     .009499999787658453.
    : 0.6326 - accuracy: 0.6509 - val loss: 0.6178 - val accuracy: 0.6638
    aving model to model save/weights-03-0.6638.hdf5
    745 - val auc 0.673258
     .009499999694526196.
    : 0.6119 - accuracy: 0.6605 - val loss: 0.6070 - val accuracy: 0.6728
    aving model to model save/weights-04-0.6728.hdf5
    916 - val auc 0.684422
```

```
.00949999964526196.
: 0.6159 - accuracy: 0.6558 - val_loss: 0.6145 - val_accuracy: 0.6731

aving model to model_save/weights-05-0.6731.hdf5
602 - val_auc 0.664810

.009024999709799886.
: 0.6092 - accuracy: 0.6591 - val_loss: 0.6104 - val_accuracy: 0.6660

8122500032186508.
553 - val_auc 0.674970

.008122500032186508.
: 0.6084 - accuracy: 0.6582 - val_loss: 0.6056 - val_accuracy: 0.6724

73102500289678575.
721 - val_auc 0.678912
```

!kill 197

/bin/bash: line 0: kill: (197) - No such process

%tensorboard --logdir logs/fit/model4/

