Case Study 7 Report:

Loss Minimizing Classifier

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Abstract

The team has been provided a dataset from an anonymous source. The goal is to create a model that predicts the classroom accurately to minimize monetary losses.

1. Introduction

1.1 Business Understanding

A client provided the team with a dataset from an anonymous source for the team to create a model to apply to their business. The objective for this study is to minimize the monetary losses of a company by engineering highly accurate algorithms.

The monetary losses is as follows:

- Class 0 misclassification = \$25
- Class 1 misclassification = \$100

As detailed above, the client can lose a significant amount each time a wrong classification is predicted and can sum up to major monetary losses.

1.2 Data Meaning Type

To create an algorithm that highly predicts the correct class, an anonymous source provided a large dataset to the team. The dataset comprises 160,000 records, 50 independent features and 1 classifying feature shown in Figure 1.2.a.

<clas< th=""><th>ss 'panda</th><th>as.core.frame.Dat</th><th>aFrame'></th><th>23</th><th>x23</th><th>159953 no</th><th>on-null</th><th>float64</th></clas<>	ss 'panda	as.core.frame.Dat	aFrame'>	23	x23	159953 no	on-null	float64
Range	eIndex: :	160000 entries, 0	to 159999	24	x24	159972 no	on-null	object
Data	columns	(total 51 column	s):	25	x25	159978 no	on-null	float64
#	Column	Non-Null Count	Dtype	26	x26	159964 no	on-null	float64
				27	x27	159970 no	on-null	float64
0	x0	159974 non-null	float64	28	x28	159965 no	on-null	float64
1	x1	159975 non-null	float64	29	x29	159970 no	on-null	object
2	x2	159962 non-null	float64	30	x30	159970 no	on-null	object
3	x3	159963 non-null	float64	31	x31	159961 no	on-null	float64
4	x4	159974 non-null	float64	32	x32	159969 no	on-null	object
5	x5	159963 non-null	float64	33	x33	159959 no	on-null	float64
6	x6	159974 non-null	float64	34	x34	159959 no	on-null	float64
7	x7		float64	35	x35	159970 no	on-null	float64
-		159973 non-null		36	x36	159973 no	on-null	float64
8	x8	159979 non-null	float64	37	x37	159977 no	on-null	object
9	x9	159970 non-null	float64	38	x38	159969 no	on-null	float64
10	x10	159957 non-null	float64	39	x39	159977 no	on-null	float64
11	x11	159970 non-null	float64	40	x40	159964 no	on-null	float64
12	x12	159964 non-null	float64	41	x41	159960 no	on-null	float64
13	x13	159969 non-null	float64	42	x42	159974 no	on-null	float64
14	x14	159966 non-null	float64	43	x43	159963 no	on-null	float64
15	x15	159965 non-null	float64	44	x44	159960 no	on-null	float64
16	x16	159974 non-null	float64	45	x45	159971 no	on-null	float64
17	x17	159973 non-null	float64	46	x46	159969 no	on-null	float64
18	x18	159960 non-null	float64	47	x47	159963 no	on-null	float64
19	x19	159965 non-null	float64	48	x48	159968 no	on-null	float64
20	x20	159962 non-null	float64	49	x49	159968 no	on-null	float64
21	x21	159971 non-null	float64	50	У	160000 no	on-null	int64
22	x22	159973 non-null	float64	dtyp	es: flo	pat64(45),	int64(1),	, object(5)

Figure 1.2.a- Feature Descriptions

Glancing at the features, the team saw that most of the features were numeric with the exception of five features (x24, x29, x30, x32 and x37). These features may require more attention and will be analyzed later.

2. Methods

2.1 Data Preprocessing

To prepare the data for analyzing, the team first looked at the five aforementioned non-numeric features. The fields contained the following data:

- x24 Continent Names
- x29 Months
- x30 Days
- x32 Unknown rate
- x37 Unknown type of monetary value

For x29, the team noted that some of the month names were not uniformed so these were updated. Then, the days for x30 were changed to abbreviations. Next, the x32 rate was transformed by removing the percentage and changing the value type to float64. Lastly, x37's "\$" was removed and changed to the value type of float64.

Next, the team checked the dataset for missing values and found that all the columns had less than 3% of missing values each as shown in Figure 2.1a. There were many options, but the team chose to fill columns x24, x29 and x30 missing values with "unknown".

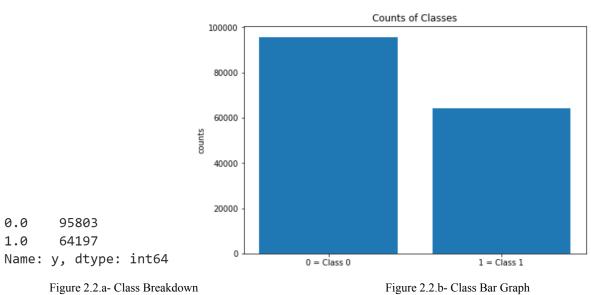
	column_name	percent_missing	x26	x26	0.022500	x45	x45	0.018125
У	у	0.000000	x12	x12	0.022500	x30	x30	0.018750
x8	x8	0.013125	х3	x3	0.023125	x29	x29	0.018750
x25	x25	0.013750	x5	x5	0.023125	x27	x27	0.018750
x37	x37	0.014375				х9	x9	0.018750
x39	x39	0.014375	x47	x47	0.023125	x11	x11	0.018750
x1	x1	0.015625	x43	x43	0.023125	x35	x35	0.018750
х0	x0	0.016250	x2	x2	0.023750	x32	x32	0.019375
x16	x16	0.016250	x20	x20	0.023750	x46	x46	0.019375
x42	x42	0.016250	x31	x31	0.024375	x13	x13	0.019375
x4	x4	0.016250	x41	x41	0.025000	x38	x38	0.019375
х6	x6	0.016250	x18	x18	0.025000	x48	x48	0.020000
х7	x7	0.016875	x44	x44	0.025000	x49	x49	0.020000
x22	x22	0.016875				x14	x14	0.021250
x36	x36	0.016875	x33	x33	0.025625	x19	x19	0.021875
x17	x17	0.016875	x34	x34	0.025625	x15	x15	0.021875
x24	x24	0.017500	x10	x10	0.026875	x28	x28	0.021875
x21	x21	0.018125	x23	x23	0.029375	x40	x40	0.022500

Figure 2.1.a- Missing Data

Using one hot encoding, the team transformed the categorical variables (x24, x29 and x30) in the dataset to numeric values to improve the prediction accuracy. Then, the numeric features and newly transformed categorical features were concatenated together. This made the dataset uniformed by only utilizing number values. The dataset was ready for an exploratory data analysis at this point.

2.2 Exploratory Data Analysis

Starting the exploratory data analysis, the team saw that class 0 (95,830 records) and class 1 (64,197 records) had a 30,000 record difference as seen in Figure 2.2.a and 2.2.b. This disparity could cause complications in the accuracy of the model, therefore the team chose to downsample the class 0 to the size of class 1.



After downsampling class 1, both class 0 and class 1 had 64,197 records each within the dataset as shown in Figure 2.2.c and Figure 2.2.d.



Figure 2.2.c- Class Breakdown After Downsampling

Figure 2.2.d- Class Bar Graph After Downsampling

Lastly, the team did a 67/33 split to randomly divide the dataset into train and test subsets using the train_test_split function from the sklearn model_selection package. The model is ready to run.

2.3 Models

2.3.1 Model 1: Random Forest

For the team's first model, they decided to utilize a random forest model to better accommodate the categorical and numerical data. After choosing the learning method, the team decided to further automate the model building process with a random search. The random search was chosen as it is known to give improved results from a grid search. The team selected a wide range of parameters for the search to test which included: n_estimators, criterion, min_samples_split, and max_features. The selected parameters were given 3-5 options and all unmentioned parameters were kept at the default setting. Thus, the model was set to run. The search was completed in around 2 hours from there we learned the parameters of the chosen best random forest model. The parameters of it contained: n_estimators = 100, criterion = entropy, min_samples_split = 5, and max_features = sqrt. Using these parameters the team continued on to predicting. The predictions were run using the designated best model of the grid search; this model did perform well on the data however the team wished to continue running further tests.

2.3.2 Model 2: Dense Neural Network

For the second model, the team decided to go in a different direction from the initial attempt and thus utilized a neural networks algorithm, as the data contains a mixture of categorical and numerical information, and a grid search. To build the model the team started with a model containing 3 layers, the layers consisted of the activation methods tanh, relu, and linear. The optimizer was set to Adam, and most other parameters were left in the default state. The team decided to feature the parameters of batch_size, nb_epoch, and unit in the grid search. Then, the GridSearchCV function was setup with the above and a cv set to 10. After this the fit was run and accuracies stayed at around 50% with a range up and down of 10%. This is less than ideal and the best model achieved was only 65% while using batch_size = 20, nb_epoch = 200, and unit = 15. Because of this model being less than satisfactory the team decided to continue on with the random forest model.

3. Results

3.1 Best Model

3.1.1 Random Forest

As stated in the previous section, the model did perform well on the test data. The accuracy gained is very good however the ensuing classification report did cause some concern. The team has taken this consistency to be a result of the previous downsampling combined with the randomized train/test split. The team decided not to change the random state for a different report as that would compromise the integrity of the results. As the model is reported we have a very balanced model that appears to predict evenly with great accuracy. This is supported by the accompanying confusion matrix. That said, according to the overall goal of this paper the team has produced a model that will limit monetary loss for the company to \$202,720.

	precision	recall	f1-score	support
class 0 class 1	0.92 0.92	0.92 0.92	0.92 0.92	21336 21035
	0.32	0.32		
accuracy macro avg	0.92	0.92	0.92 0.92	42371 42371
weighted avg	0.92	0.92	0.92	42371

Figure 3.1.1.a-The model's classification Report

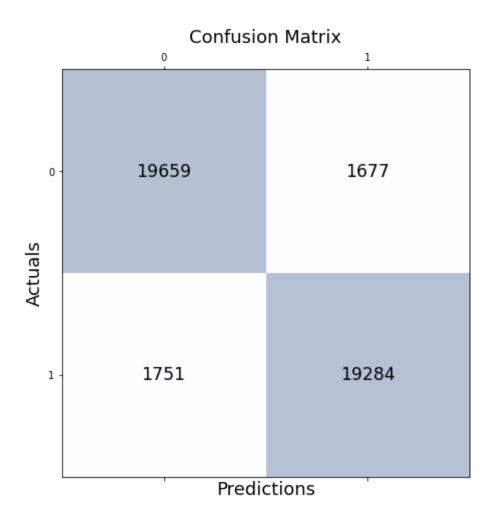


Figure 3.1.1.b-The model's confusion matrix

4. Conclusion

The team was able to classify the records as class 0 or 1 by utilizing the given records and processing them through a variety of random forest models. The last model reached an accuracy of 92% and a class 0/1 precision of 92%. Thus, the team believes that as of now this is the best method for an automated classifier. At this time, the team does not believe that it can further improve the model with more time.

5. Code

MSDS7333 (/github/Alexy-Mor/MSDS7333/tree/main)

/ CaseStudy7 (/github/Alexy-Mor/MSDS7333/tree/main/CaseStudy7)

```
In [ ]:
             #import libraries
             from __future__ import print_function
             import pandas as pd
             import numpy as np
             import tensorflow as tf
             import cv2
             from tensorflow.python import keras
             from tensorflow.python.keras.utils.np_utils import to_categorical
             import matplotlib.pyplot as plt
             import keras
             from keras.models import Sequential
             from tensorflow.keras import layers
             from keras.layers import Dense, Dropout, Activation, Flatten
             from keras.layers import Conv2D, MaxPooling2D
             from keras import backend as K
             from keras.wrappers.scikit learn import KerasClassifier
             from sklearn.preprocessing import StandardScaler
             from sklearn.preprocessing import OneHotEncoder
             from sklearn import metrics
             from sklearn.model selection import RandomizedSearchCV, train test split, Gr
             from sklearn.ensemble import RandomForestClassifier
             from sklearn.metrics import classification report
             from sklearn.metrics import PrecisionRecallDisplay
```

In []: #Mount drive from google.colab import drive drive.mount('/content/drive/')

Mounted at /content/drive/

#Load up data and show.
df = pd.read_csv('/content/drive/MyDrive/CS7-Final/final_project(5).csv')
df.head()

Out[]:

	x0	x1	x2	х3	x4	x 5	х6	х7	
0	-0.166563	-3.961588	4.621113	2.481908	-1.800135	0.804684	6.718751	-14.789997	-1.0
1	-0.149894	-0.585676	27.839856	4.152333	6.426802	-2.426943	40.477058	-6.725709	1.0
2	-0.321707	-1.429819	12.251561	6.586874	-5.304647	-11.311090	17.812850	11.060572	5.0
3	-0.245594	5.076677	-24.149632	3.637307	6.505811	2.290224	-35.111751	-18.913592	-0.;
4	-0.273366	0.306326	-11.352593	1.676758	2.928441	-0.616824	-16.505817	27.532281	1.

5 rows × 51 columns



Random forest and Neural network

df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 160000 entries, 0 to 159999
Data columns (total 51 columns):

νατα	columns	•	51 COTUMNS	•
#	Column	Non-Nu	ll Count	Dtype
0	x0	159974	non-null	float64
1	x1	159975	non-null	float64
2	x2	159962	non-null	float64
3	x3	159963	non-null	float64
4	x4	159974	non-null	float64
5	x5	159963	non-null	float64
6	х6	159974	non-null	float64
7	x7	159973	non-null	float64
8	x8	159979	non-null	float64
9	x9	159970	non-null	float64
10	x10	159957	non-null	float64
11	x11	159970	non-null	float64
12	x12	159964	non-null	float64
13	x13	159969	non-null	float64
14	x14	159966	non-null	float64
15	x15	159965	non-null	float64
16	x16	159974	non-null	float64
17	x17	159973	non-null	float64
18	x18	159960	non-null	float64
19	x19	159965	non-null	float64
20	x20	159962	non-null	float64
21	x21	159971	non-null	float64
22	x22	159973	non-null	float64
23	x23	159953	non-null	float64
24	x24	159972	non-null	object
25	x25	159978	non-null	float64
26	x26	159964	non-null	float64
27	x27	159970	non-null	float64
28	x28	159965	non-null	float64
29	x29	159970	non-null	object
30	x30	159970	non-null	object
31	x31	159961	non-null	float64
32	x32	159969	non-null	object
33	x33	159959	non-null	float64
34	x34	159959	non-null	float64
35	x35	159970	non-null	float64
36	x36	159973	non-null	float64
37	x37	159977	non-null	object
38	x38	159969	non-null	float64
39	x39	159977	non-null	float64
40	x40	159964	non-null	float64
41	x41	159960	non-null	float64
42	x42	159974	non-null	float64
43	x43	159963	non-null	float64
44	x44	159960	non-null	float64
45	x45	159971	non-null	float64
46	x46	159969	non-null	float64
47	x47	159963	non-null	float64
48	x48	159968	non-null	float64
49	x49	159968	non-null	float64
50	у	160000	non-null	int64
20	,			

dtypes: float64(45), int64(1), object(5)

```
memory usage: 62.3+ MB
In [ ]:
              df['x24'].value_counts()
Out[]:
                         138965
              asia
                          16538
              euorpe
              america
                           4469
              Name: x24, dtype: int64
In [ ]:
              df['x29'].value counts()
Out[ ]:
              July
                         45569
              Jun
                         41329
                         29406
              Aug
             May
                         21939
              sept.
                         10819
              Apr
                          6761
                          2407
              0ct
             Mar
                          1231
                           337
              Nov
              Feb
                           140
              Dev
                            23
              January
                             9
              Name: x29, dtype: int64
In [ ]:
              df['x29'] = df['x29'].replace(['July'], 'Jul')
              df['x29'] = df['x29'].replace(['sept.'], 'Sep')
              df['x29'] = df['x29'].replace(['Dev'], 'Dec')
              df['x29'] = df['x29'].replace(['January'], 'Jan')
In [ ]:
              df['x30'].value_counts()
Out[ ]:
             wednesday
                           101535
                            29429
              thurday
                            27954
              tuesday
              friday
                              564
              monday
                              488
              Name: x30, dtype: int64
              df['x30'] = df['x30'].replace(['wednesday'], 'wed')
In [ ]:
              df['x30'] = df['x30'].replace(['thurday'], 'thu')
              df['x30'] = df['x30'].replace(['tuesday'], 'tue')
              df['x30'] = df['x30'].replace(['friday'], 'fri')
              df['x30'] = df['x30'].replace(['monday'], 'mon')
```

```
In [ ]:
              df['x32'].value_counts()
Out[ ]:
              0.01%
                        40767
              -0.01%
                         34094
              0.0%
                        33923
              -0.0%
                         30492
              -0.02%
                         9924
              0.02%
                         7987
              -0.03%
                          1727
              0.03%
                           855
              -0.04%
                           138
              0.04%
                            55
              -0.05%
                             6
              0.05%
                             1
              Name: x32, dtype: int64
In [ ]:
              df['x32'] = df['x32'].astype(str)
              df['x32'] = df['x32'].str.replace('%', '')
In [ ]:
              df['x32'].head()
Out[]:
              0
                     0.0
              1
                   -0.02
              2
                   -0.01
              3
                    0.01
              4
                    0.01
              Name: x32, dtype: object
In [ ]:
              df['x32'] = df['x32'].astype('float64')
In [ ]:
              df['x37'].value_counts()
Out[]:
              $-311.26
                            6
              $-336.77
                            6
              $237.4
                            6
              $72.42
              $341.26
              $-505.21
                            1
              $770.07
                            1
              $74.62
                            1
              $-1082.96
                            1
              $-1229.34
              Name: x37, Length: 129198, dtype: int64
In [ ]:
              df['x37'] = df['x37'].astype(str)
```

<ipython-input-10-7a1d49381926>:1: FutureWarning: The default value of regex
 df['x37'] = df['x37'].str.replace('\$', '')

→

Out[]: 0 1313.96

1 1962.78

2 430.47

3 -2366.29 4 -620.66

Name: x37, dtype: object

In []: df['x37'] = df['x37'].astype('float64')

In []: df.describe()

Out[]:

	х0	x1	x2	х3	x4	
count	159974.000000	159975.000000	159962.000000	159963.000000	159974.000000	159963.000
mean	-0.001028	0.001358	-1.150145	-0.024637	-0.000549	0.013
std	0.371137	6.340632	13.273480	8.065032	6.382293	7.670
min	-1.592635	-26.278302	-59.394048	-35.476594	-28.467536	-33.822
25%	-0.251641	-4.260973	-10.166536	-5.454438	-4.313118	-5.148
50%	-0.002047	0.004813	-1.340932	-0.031408	0.000857	0.014
75%	0.248532	4.284220	7.871676	5.445179	4.306660	5.190
max	1.600849	27.988178	63.545653	38.906025	26.247812	35.550

8 rows × 48 columns



df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 160000 entries, 0 to 159999
Data columns (total 51 columns):

рата	columns		51 COTUMNS	5):
#	Column	Non-Nu	ll Count	Dtype
0	x0	159974	non-null	float64
1	x1	159975	non-null	float64
2	x2	159962	non-null	float64
3	x3	159963	non-null	float64
4	x4	159974	non-null	float64
5	x5	159963	non-null	float64
6	x6	159974	non-null	float64
		159973		
7	x7		non-null	float64
8	x8	159979	non-null	float64
9	x9	159970	non-null	float64
10	x10	159957	non-null	float64
11	x11	159970	non-null	float64
12	x12	159964	non-null	float64
13	x13	159969	non-null	float64
14	x14	159966	non-null	float64
15	x15	159965	non-null	float64
16	x16	159974	non-null	float64
17	x17	159973	non-null	float64
18	x18	159960	non-null	float64
19	x19	159965	non-null	float64
20	x20	159962	non-null	float64
21	x21	159971	non-null	float64
22	x22	159973	non-null	float64
23	x23	159953	non-null	float64
24	x24	159972	non-null	object
25	x25	159978	non-null	float64
26	x26	159964	non-null	float64
27	x27	159970	non-null	float64
28	x28	159965	non-null	float64
29	x29	159970	non-null	object
30	x30	159970	non-null	object
31	x31	159961	non-null	float64
32	x32	159969	non-null	float64
33	x33	159959	non-null	float64
34	x34	159959	non-null	float64
35	x35	159970	non-null	float64
36	x36	159973	non-null	float64
37	x37	159977	non-null	float64
38	x38	159969	non-null	float64
		159977		
39	x39		non-null	float64
40	x40	159964	non-null	float64
41	x41	159960	non-null	float64
42	x42	159974	non-null	float64
43	x43	159963	non-null	float64
44	x44	159960	non-null	float64
45	x45	159971	non-null	float64
46	x46	159969	non-null	float64
47	x47	159963	non-null	float64
48	x48	159968	non-null	float64
49	x49	159968	non-null	float64
50	у	160000	non-null	int64
	-			

dtypes: float64(47), int64(1), object(3)

memory usage: 62.3+ MB

missing_value_df

Out[]:

	column_name	percent_missing
у	у	0.000000
x8	x8	0.013125
x25	x25	0.013750
x37	x37	0.014375
x39	x39	0.014375
x1	x1	0.015625
x0	x0	0.016250
x16	x16	0.016250
x42	x42	0.016250
х4	x4	0.016250
x6	х6	0.016250
x7	x7	0.016875
x22	x22	0.016875
x36	x36	0.016875
x17	x17	0.016875
x24	x24	0.017500
x21	x21	0.018125
x45	x45	0.018125
x30	x30	0.018750
x29	x29	0.018750
x27	x27	0.018750
х9	x9	0.018750
x11	x11	0.018750
x35	x35	0.018750
x32	x32	0.019375
x46	x46	0.019375
x13	x13	0.019375
x38	x38	0.019375
x48	x48	0.020000
x49	x49	0.020000
x14	x14	0.021250
x19	x19	0.021875
x15	x15	0.021875
x28	x28	0.021875
x40	x40	0.022500

	column_name	percent_missing
x26	x26	0.022500
x12	x12	0.022500
х3	х3	0.023125
х5	x5	0.023125
x47	x47	0.023125
x43	x43	0.023125
x2	x2	0.023750
x20	x20	0.023750
x31	x31	0.024375
x41	x41	0.025000
x18	x18	0.025000
x44	x44	0.025000
x33	x33	0.025625
x34	x34	0.025625
x10	x10	0.026875
x23	x23	0.029375

```
In [ ]:
             df.shape
Out[]:
             (160000, 51)
In [ ]:
             #No column has more than 3% can either drop or use mean/median?
             #will go with median fill
             #Maybe Leave it?
             def func(df):
                 df = df.copy()
                 for col in df:
                      # select only integer or float dtypes
                      if df[col].dtype in ("int", "float"):
                          df[col] = df[col].fillna(df[col].mode()[0])
                 return df
             df = func(df)
In [ ]:
             df['x24'] = df['x24'].fillna('unknown')
             df['x29'] = df['x29'].fillna('unknown')
```

df['x30'] = df['x30'].fillna('unknown')

```
In [ ]:
               category = df.select dtypes(exclude='number')
               category.head(5)
Out[ ]:
                     x24
                          x29
                               x30
                  euorpe
                           Jul
                                tue
                1
                     asia
                          Aug
                               wed
                2
                     asia
                           Jul
                               wed
                3
                           Jul
                               wed
                     asia
                4
                     asia
                           Jul
                                tue
In [ ]:
               cat = OneHotEncoder().fit_transform(category)
               cat
Out[ ]:
               <160000x23 sparse matrix of type '<class 'numpy.float64'>'
                        with 480000 stored elements in Compressed Sparse Row format>
In [ ]:
               cat2 = pd.DataFrame.sparse.from spmatrix(cat)
In [ ]:
               numeric = df.select dtypes(include='number')
               numeric.head(5)
Out[ ]:
                         x0
                                  x1
                                             x2
                                                       х3
                                                                x4
                                                                           x5
                                                                                      x6
                                                                                                 x7
                  -0.166563 -3.961588
                                        4.621113 2.481908 -1.800135
                                                                      0.804684
                                                                                6.718751
                                                                                         -14.789997
                                                                                                    -1.0
                  -0.149894
                            -0.585676
                                       27.839856 4.152333
                                                           6.426802
                                                                     -2.426943
                                                                               40.477058
                                                                                           -6.725709
                                                                                                     0.8
                                                                               17.812850
                2 -0.321707 -1.429819
                                       12.251561 6.586874
                                                          -5.304647 -11.311090
                                                                                           11.060572
                                                                                                     5.:
                  -0.245594
                             5.076677
                                      -24.149632
                                                3.637307
                                                                               -35.111751
                                                                                          -18.913592
                                                           6.505811
                                                                      2.290224
                                                                                                    -0.;
                4 -0.273366
                             0.306326 -11.352593 1.676758
                                                           2.928441
                                                                     -0.616824
                                                                              -16.505817
                                                                                          27.532281
                                                                                                     1.
               5 rows × 48 columns
In [ ]:
               frames = [cat2,numeric]
               df2 = pd.concat(frames)
               df2.shape
Out[ ]:
               (320000, 71)
```

df2.info()

<class 'pandas.core.frame.DataFrame'>
Int64Index: 320000 entries, 0 to 159999
Data columns (total 71 columns):

νατα	columns	(total	/1 columns	5):	
#	Column	Non-Nu	ll Count	Dtype	
	0	160000		 Cnames [6] and 64	Δ1
0	0	160000		Sparse[float64,	0]
1	1	160000		Sparse[float64,	0]
2	2	160000		Sparse[float64,	0]
3	3	160000		Sparse[float64,	0]
4	4	160000		Sparse[float64,	0]
5	5	160000		Sparse[float64,	0]
6	6	160000	non-null	Sparse[float64,	0]
7	7	160000		Sparse[float64,	0]
8	8	160000		Sparse[float64,	0]
9	9	160000		Sparse[float64,	0]
10	10	160000		Sparse[float64,	0]
11	11	160000		Sparse[float64,	0]
12	12	160000	non-null	Sparse[float64,	0]
13	13	160000	non-null	Sparse[float64,	0]
14	14	160000	non-null	Sparse[float64,	0]
15	15	160000	non-null	Sparse[float64,	0]
16	16	160000	non-null	Sparse[float64,	0]
17	17	160000	non-null	Sparse[float64,	0]
18	18	160000	non-null	Sparse[float64,	0]
19	19	160000	non-null	Sparse[float64,	0]
20	20	160000	non-null	Sparse[float64,	0]
21	21	160000	non-null	Sparse[float64,	0]
22	22	160000	non-null	Sparse[float64,	0]
23	x0	160000	non-null	float64	_
24	x1	160000	non-null	float64	
25	x10	160000	non-null	float64	
26	x11	160000	non-null	float64	
27	x12	160000	non-null	float64	
28	x13	160000	non-null	float64	
29	x14	160000	non-null	float64	
30	x15	160000	non-null	float64	
31	x16	160000	non-null	float64	
32	x17	160000	non-null	float64	
33	x18	160000	non-null	float64	
34	x19		non-null	float64	
35	x2		non-null	float64	
36	x20	160000		float64	
37	x21	160000		float64	
38	x22	160000		float64	
39	x23	160000		float64	
40	x25	160000		float64	
41	x26	160000		float64	
42	x27	160000		float64	
43	x28	160000		float64	
44	x3	160000		float64	
45	x31	160000		float64	
46	x32	160000	non-null	float64	
47	x33	160000		float64	
48	x34	160000		float64	
46 49	x34		non-null	float64	
50	x36	160000		float64	
51	x37	160000	non-null	float64	

```
52
    x38
             160000 non-null
                              float64
53
    x39
             160000 non-null
                              float64
 54
    х4
             160000 non-null
                              float64
 55
    x40
             160000 non-null
                              float64
    x41
             160000 non-null
                              float64
 56
 57
    x42
             160000 non-null
                              float64
 58
    x43
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    x44
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    x45
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    x46
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                              float64
    x47
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62
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             160000 non-null
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    х5
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    х6
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    x7
                              float64
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                              float64
68
    x8
             160000 non-null
             160000 non-null
69
    x9
                              float64
70
             160000 non-null float64
    У
dtypes: Sparse[float64, 0](23), float64(48)
```

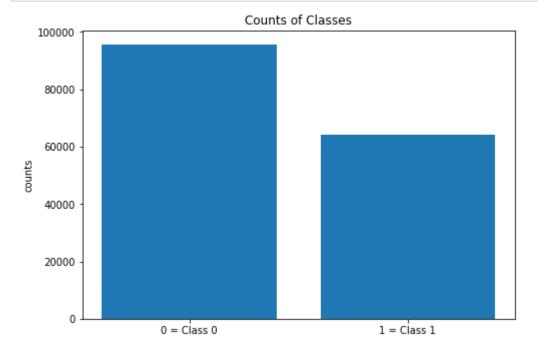
memory usage: 167.2 MB

```
In [ ]:
              #Count values in label
              df2['y'].value_counts()
```

Out[]: 0.0 95803 64197 1.0

Name: y, dtype: int64

```
#class 1 misclassification is $100 penalty, class 0 misclassification is $20
#Should downsample for more accuracy
fig = plt.figure()
ax = fig.add_axes([0,0,1,1])
labels = ["0 = Class 0", "1 = Class 1"]
ax.bar(labels,df2["y"].value_counts())
plt.ylabel("counts")
plt.title('Counts of Classes')
plt.show()
```

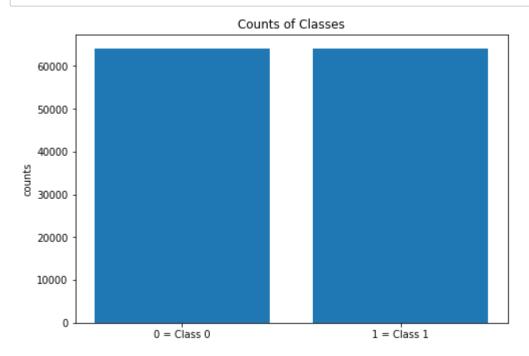


```
In [ ]:
              #code to downsample class 1
              # Separate majority and minority classes
              from sklearn.utils import resample
              df_{class0} = df2[df2['y']==0]
              df_{class1} = df2[df2['y']==1]
              # Downsample majority class
              class0_downsampled = resample(df_class0,
                                                                  # sample without replacen
                                               replace=False,
                                               n samples=64197,
                                                                     # to match minority cl
                                               random_state=444) # reproducible results
              # Combine minority class with downsampled majority class
              df downsampled = pd.concat([class0 downsampled, df class1])
              # Display new class counts
              df_downsampled['y'].value_counts()
Out[ ]:
              0.0
                     64197
```

Out[]: 0.0 64197 1.0 64197

Name: y, dtype: int64

```
In []: #class 1 misclassification is $100 penalty, class 0 misclassification is $20
fig = plt.figure()
ax = fig.add_axes([0,0,1,1])
labels = ["0 = Class 0", "1 = Class 1"]
ax.bar(labels,df_downsampled["y"].value_counts())
plt.ylabel("counts")
plt.title('Counts of Classes')
plt.show()
```



n_iter=number_of_iterations)

```
In [ ]:
             #https://www.relataly.com/using-random-search-to-tune-the-hyperparameters-of
             X=df downsampled.loc[:,df downsampled.columns !='y'] # Features
In [ ]:
             y=df_downsampled['y'] # Labels
In [ ]:
             X = X.fillna(0)
In [ ]:
             X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.33, ra
In [ ]:
             # Define the Estimator and the Parameter Ranges
             rf = RandomForestClassifier()
             n = [50, 100, 200]
             criterion=['gini', 'entropy', 'log_loss']
             min_samples_split = [5, 10, 20, 50]
             max_features = ['log2', 'sqrt']
             number_of_iterations = 20
             # Define the param distribution dictionary
             param_distributions = dict(n_estimators = n_estimators,
                                        criterion = criterion,
                                        min samples split=min samples split,
                                        max features=max features)
In [ ]:
             # Build the gridsearch
             grid = RandomizedSearchCV(estimator=rf,
                                       param distributions=param distributions,
```

In []: grid_results = grid.fit(X_train, y_train)

Summarize the results in a readable format
print("Best params: {0}, using {1}".format(grid_results.cv_results_['mean_teresults_df = pd.DataFrame(grid_results.cv_results_)

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- /usr/local/lib/python3.8/dist-packages/sklearn/model_selection/_validation.p 45 fits failed out of a total of 100.
- The score on these train-test partitions for these parameters will be set to If these failures are not expected, you can try to debug them by setting err

Below are more details about the failures:

```
45 fits failed with the following error:
Traceback (most recent call last):
 File "/usr/local/lib/python3.8/dist-packages/sklearn/model selection/ vali
    estimator.fit(X_train, y_train, **fit_params)
 File "/usr/local/lib/python3.8/dist-packages/sklearn/ensemble/ forest.py",
   trees = Parallel(
 File "/usr/local/lib/python3.8/dist-packages/joblib/parallel.py", line 108
   if self.dispatch one batch(iterator):
 File "/usr/local/lib/python3.8/dist-packages/joblib/parallel.py", line 901
   self. dispatch(tasks)
 File "/usr/local/lib/python3.8/dist-packages/joblib/parallel.py", line 819
    job = self._backend.apply_async(batch, callback=cb)
 File "/usr/local/lib/python3.8/dist-packages/joblib/ parallel backends.py"
   result = ImmediateResult(func)
 File "/usr/local/lib/python3.8/dist-packages/joblib/ parallel backends.py"
    self.results = batch()
 File "/usr/local/lib/python3.8/dist-packages/joblib/parallel.py", line 288
    return [func(*args, **kwargs)
 File "/usr/local/lib/python3.8/dist-packages/joblib/parallel.py", line 288
   return [func(*args, **kwargs)
 File "/usr/local/lib/python3.8/dist-packages/sklearn/utils/fixes.py", line
   return self.function(*args, **kwargs)
 File "/usr/local/lib/python3.8/dist-packages/sklearn/ensemble/ forest.py",
   tree.fit(X, y, sample_weight=curr_sample_weight, check_input=False)
 File "/usr/local/lib/python3.8/dist-packages/sklearn/tree/_classes.py", li
   super().fit(
 File "/usr/local/lib/python3.8/dist-packages/sklearn/tree/ classes.py", li
    criterion = CRITERIA CLF[self.criterion](
KeyError: 'log loss'
 warnings.warn(some_fits_failed_message, FitFailedWarning)
/usr/local/lib/python3.8/dist-packages/sklearn/model selection/ search.py:96
0.89984072 0.90422329 0.91016355 0.90661797
                                                    nan
                   nan 0.90038709 0.90758288 0.9077921 0.91107028
       nan
                   nan]
       nan
 warnings.warn(
/usr/local/lib/python3.8/dist-packages/sklearn/utils/validation.py:1688: Fut
 warnings.warn(
/usr/local/lib/python3.8/dist-packages/sklearn/utils/validation.py:624: User
 warnings.warn(
Best params: [0.90708299]
                                           nan 0.91134926
                                                                 nan 0.90156
                                nan
0.89984072 0.90422329 0.91016355 0.90661797
                                                               nan
                   nan 0.90038709 0.90758288 0.9077921 0.91107028
       nan
                   nan], using {'n estimators': 100, 'min samples split': 5,
       nan
```

In []:

```
best_model = grid_results.best_estimator_
y_pred = best_model.predict(X_test)
```

/usr/local/lib/python3.8/dist-packages/sklearn/utils/validation.py:1688: Fut warnings.warn(
/usr/local/lib/python3.8/dist-packages/sklearn/utils/validation.py:624: User

/usr/local/lib/python3.8/dist-packages/sklearn/utils/validation.py:624: User
warnings.warn(



•

In []: #Classification Report

target_names = ['class 0', 'class 1']

print(classification_report(y_test, y_pred, target_names=target_names))

	precision	recall	f1-score	support
class 0	0.92	0.92	0.92	21336
class 1	0.92	0.92	0.92	21035
accuracy			0.92	42371
macro avg	0.92	0.92	0.92	42371
weighted avg	0.92	0.92	0.92	42371

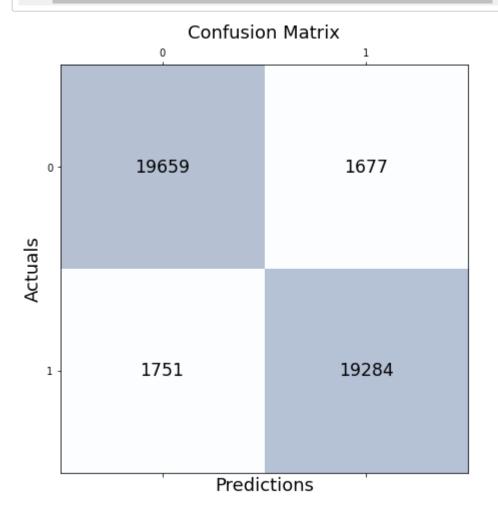
plt.show()

```
In []: #Confusion Matrix
    from sklearn.metrics import confusion_matrix

conf_matrix = confusion_matrix(y_true=y_test, y_pred=y_pred)

fig, ax = plt.subplots(figsize=(7.5, 7.5))
    ax.matshow(conf_matrix, cmap=plt.cm.Blues, alpha=0.3)
    for i in range(conf_matrix.shape[0]):
        for j in range(conf_matrix.shape[1]):
            ax.text(x=j, y=i,s=conf_matrix[i, j], va='center', ha='center', size

plt.xlabel('Predictions', fontsize=18)
    plt.ylabel('Actuals', fontsize=18)
    plt.title('Confusion Matrix', fontsize=18)
```





```
775/775 [================ ] - 3s 3ms/step - loss: 3.7399 - accu
775/775 [=============== ] - 3s 3ms/step - loss: 4.4361 - accu
87/87 [============== ] - 0s 2ms/step - loss: 4.1987 - accura
775/775 [=============== ] - 3s 3ms/step - loss: 4.3380 - accu
775/775 [============= ] - 3s 3ms/step - loss: 7.0354 - accu
87/87 [============== ] - 0s 2ms/step - loss: 4.4615 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.4478 - accu
775/775 [============= ] - 3s 3ms/step - loss: 4.5307 - accu
775/775 [============== ] - 3s 3ms/step - loss: 0.9728 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8474 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.8346 - accura
775/775 [============== ] - 3s 3ms/step - loss: 7.7347 - accu
```

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87/87 [============== ] - 0s 2ms/step - loss: 0.7128 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.8650 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.1953 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8042 - accura
775/775 [============== ] - 3s 3ms/step - loss: 2.1559 - accu
87/87 [==============] - 0s 2ms/step - loss: 0.7299 - accura
87/87 [============= ] - 0s 2ms/step - loss: 0.7602 - accura
87/87 [============= ] - 0s 2ms/step - loss: 0.8693 - accura
87/87 [===============] - 0s 2ms/step - loss: 0.7782 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.8773 - accura
775/775 [================ ] - 3s 3ms/step - loss: 0.9415 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8548 - accura
775/775 [============== ] - 3s 3ms/step - loss: 0.9790 - accu
87/87 [============= ] - Os 2ms/step - loss: 0.7411 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.8338 - accura
```

```
87/87 [============== ] - 0s 2ms/step - loss: 0.7891 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.8079 - accura
775/775 [============== ] - 3s 3ms/step - loss: 3.0436 - accu
775/775 [==============] - 3s 3ms/step - loss: 2.2933 - accu
87/87 [============== ] - 0s 2ms/step - loss: 4.0350 - accura
775/775 [=============== ] - 3s 3ms/step - loss: 4.4396 - accu
775/775 [============== ] - 3s 3ms/step - loss: 1.2016 - accu
775/775 [============== ] - 3s 3ms/step - loss: 1.8874 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.7730 - accura
775/775 [============== ] - 3s 3ms/step - loss: 5.7312 - accu
87/87 [============== ] - 0s 2ms/step - loss: 4.2904 - accura
```

```
87/87 [============== ] - 0s 2ms/step - loss: 0.8422 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.6801 - accura
775/775 [============== ] - 3s 3ms/step - loss: 5.7877 - accu
87/87 [============== ] - Os 2ms/step - loss: 4.1337 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.2049 - accu
775/775 [================ ] - 3s 3ms/step - loss: 2.3005 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8846 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.1501 - accu
87/87 [============== ] - 0s 2ms/step - loss: 4.2733 - accura
87/87 [===============] - 0s 2ms/step - loss: 0.7807 - accura
775/775 [============== ] - 3s 3ms/step - loss: 0.9640 - accu
775/775 [=============== ] - 3s 3ms/step - loss: 1.5747 - accu
87/87 [============== ] - 0s 2ms/step - loss: 4.2068 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.1888 - accu
87/87 [============= ] - 0s 2ms/step - loss: 0.7301 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.7337 - accura
```

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87/87 [============== ] - 0s 2ms/step - loss: 0.7832 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.4007 - accu
87/87 [============== ] - 0s 2ms/step - loss: 1.0206 - accura
775/775 [=============== ] - 3s 3ms/step - loss: 4.2715 - accu
775/775 [================ ] - 3s 3ms/step - loss: 5.2532 - accu
775/775 [=============] - 3s 3ms/step - loss: 1.3633 - accu
87/87 [============== ] - 0s 2ms/step - loss: 4.1984 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.0402 - accu
87/87 [============= ] - 0s 3ms/step - loss: 0.7637 - accura
775/775 [============== ] - 3s 3ms/step - loss: 0.8278 - accu
87/87 [============= ] - 0s 2ms/step - loss: 0.7750 - accura
```

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87/87 [============== ] - 0s 2ms/step - loss: 0.8777 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.6892 - accura
775/775 [============== ] - 3s 3ms/step - loss: 0.8952 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.7463 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.0464 - accu
775/775 [============= ] - 3s 3ms/step - loss: 2.8231 - accu
87/87 [==============] - 0s 2ms/step - loss: 1.0879 - accura
775/775 [=============== ] - 3s 3ms/step - loss: 5.1640 - accu
87/87 [============= ] - 0s 2ms/step - loss: 3.9663 - accura
87/87 [===============] - 0s 2ms/step - loss: 0.6865 - accura
775/775 [============== ] - 3s 4ms/step - loss: 1.1120 - accu
87/87 [============= ] - 1s 2ms/step - loss: 1.0185 - accura
775/775 [================ ] - 3s 3ms/step - loss: 4.3139 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.6751 - accura
775/775 [============== ] - 3s 3ms/step - loss: 4.3200 - accu
87/87 [============= ] - Os 2ms/step - loss: 4.2287 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.7489 - accura
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87/87 [============== ] - 0s 2ms/step - loss: 0.7768 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.8837 - accura
775/775 [============== ] - 3s 3ms/step - loss: 5.5643 - accu
775/775 [==============] - 3s 3ms/step - loss: 4.0830 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8029 - accura
775/775 [=============== ] - 3s 3ms/step - loss: 4.4804 - accu
775/775 [============== ] - 3s 3ms/step - loss: 4.6617 - accu
775/775 [============== ] - 3s 3ms/step - loss: 5.1351 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8628 - accura
87/87 [============== ] - Os 2ms/step - loss: 4.1927 - accura
```

```
87/87 [============== ] - 0s 3ms/step - loss: 0.7485 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.7652 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.2016 - accu
775/775 [============= ] - 3s 3ms/step - loss: 1.0621 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8457 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.9864 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8227 - accura
87/87 [===============] - 0s 2ms/step - loss: 4.2373 - accura
775/775 [=============== ] - 3s 3ms/step - loss: 1.3251 - accu
87/87 [============== ] - Os 2ms/step - loss: 0.7898 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.7427 - accura
775/775 [============== ] - 3s 3ms/step - loss: 0.9619 - accu
87/87 [============= ] - 0s 2ms/step - loss: 0.7768 - accura
87/87 [============== ] - 0s 2ms/step - loss: 0.7249 - accura
775/775 [================= ] - 3s 3ms/step - loss: 1.6584 - accu
```

```
87/87 [============== ] - Os 2ms/step - loss: 1.0118 - accura
775/775 [============== ] - 3s 3ms/step - loss: 1.0361 - accu
87/87 [============== ] - 0s 2ms/step - loss: 0.8704 - accura
775/775 [============= ] - 3s 3ms/step - loss: 0.9651 - accu
3871/3871 [=============== ] - 10s 2ms/step - loss: 0.6799 - a
3871/3871 [============== ] - 11s 3ms/step - loss: 2.2297 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 1.3762 - a
3872/3872 [============== ] - 12s 3ms/step - loss: 3.7724 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 2.9833 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 4.2745 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 7.7375 - a
```

```
3872/3872 [================ ] - 12s 3ms/step - loss: 1.1373 - a
3872/3872 [================ ] - 12s 3ms/step - loss: 2.8715 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 1.3956 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 2.4288 - a
3872/3872 [================ ] - 12s 3ms/step - loss: 1.1043 - a
3871/3871 [============== ] - 10s 2ms/step - loss: 0.9220 - a
3871/3871 [=============== ] - 10s 2ms/step - loss: 1.5371 - a
3872/3872 [============== ] - 12s 3ms/step - loss: 1.5970 - a
431/431 [============== ] - 1s 2ms/step - loss: 0.6359 - accu
```

```
3871/3871 [============== ] - 10s 2ms/step - loss: 1.0483 - a
3871/3871 [================ ] - 10s 2ms/step - loss: 0.9474 - a
3872/3872 [============== ] - 12s 3ms/step - loss: 1.3092 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 0.8233 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 1.4084 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 0.7451 - a
3872/3872 [================ ] - 12s 3ms/step - loss: 1.1435 - a
431/431 [=============== ] - 1s 2ms/step - loss: 0.6298 - accu
```

```
3872/3872 [=============== ] - 12s 3ms/step - loss: 0.9086 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 1.3871 - a
3871/3871 [================ ] - 10s 2ms/step - loss: 0.9093 - a
3871/3871 [=============== ] - 11s 3ms/step - loss: 0.8176 - a
3872/3872 [============== ] - 12s 3ms/step - loss: 1.7792 - a
3871/3871 [=============== ] - 10s 2ms/step - loss: 1.1575 - a
431/431 [============== ] - 1s 2ms/step - loss: 0.6197 - accu
```

```
3872/3872 [================ ] - 12s 3ms/step - loss: 1.8131 - a
3872/3872 [================ ] - 12s 3ms/step - loss: 1.3471 - a
3872/3872 [============== ] - 12s 3ms/step - loss: 1.9166 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 4.1606 - a
3872/3872 [============== ] - 12s 3ms/step - loss: 2.8252 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 3.0865 - a
3871/3871 [=============== ] - 10s 2ms/step - loss: 1.9930 - a
3871/3871 [================ ] - 10s 2ms/step - loss: 0.7398 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 1.4477 - a
3872/3872 [============== ] - 13s 3ms/step - loss: 3.9886 - a
```

```
3872/3872 [================ ] - 13s 3ms/step - loss: 1.0267 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 3.3428 - a
3871/3871 [=============== ] - 10s 3ms/step - loss: 3.3063 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 0.8152 - a
3872/3872 [================ ] - 12s 3ms/step - loss: 1.4959 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 3.2467 - a
3872/3872 [================ ] - 13s 3ms/step - loss: 1.9981 - a
3872/3872 [============== ] - 13s 3ms/step - loss: 2.7615 - a
3872/3872 [============== ] - 13s 3ms/step - loss: 0.9574 - a
431/431 [============== ] - 1s 2ms/step - loss: 0.6202 - accu
```

```
3872/3872 [============== ] - 13s 3ms/step - loss: 0.7726 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 0.9383 - a
3872/3872 [================ ] - 13s 3ms/step - loss: 1.1689 - a
3871/3871 [================ ] - 10s 3ms/step - loss: 1.1838 - a
3871/3871 [=============== ] - 10s 2ms/step - loss: 1.0911 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 0.9246 - a
3872/3872 [============== ] - 13s 3ms/step - loss: 1.0064 - a
3872/3872 [================ ] - 13s 3ms/step - loss: 3.3051 - a
3871/3871 [=============== ] - 10s 2ms/step - loss: 0.7270 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 2.1420 - a
431/431 [=============== ] - 1s 2ms/step - loss: 0.7386 - accu
```

```
3872/3872 [================ ] - 13s 3ms/step - loss: 1.9831 - a
3871/3871 [================ ] - 10s 3ms/step - loss: 4.3931 - a
3872/3872 [=============== ] - 12s 3ms/step - loss: 0.8026 - a
3872/3872 [================ ] - 13s 3ms/step - loss: 2.1637 - a
3871/3871 [================ ] - 10s 3ms/step - loss: 1.2840 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 0.7822 - a
3872/3872 [============== ] - 13s 3ms/step - loss: 0.9948 - a
3872/3872 [=============== ] - 14s 3ms/step - loss: 0.8196 - a
431/431 [============== ] - 1s 2ms/step - loss: 0.6959 - accu
```

```
3871/3871 [================ ] - 10s 3ms/step - loss: 1.1125 - a
3871/3871 [=============== ] - 10s 3ms/step - loss: 1.9364 - a
3872/3872 [============== ] - 14s 3ms/step - loss: 2.3116 - a
3872/3872 [================ ] - 13s 3ms/step - loss: 1.4848 - a
3872/3872 [================ ] - 13s 3ms/step - loss: 1.6853 - a
3872/3872 [================ ] - 13s 3ms/step - loss: 1.3880 - a
3872/3872 [============== ] - 14s 3ms/step - loss: 1.0597 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 0.8149 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 1.0911 - a
3872/3872 [=============== ] - 13s 3ms/step - loss: 1.2423 - a
173/173 [============= ] - 1s 2ms/step - loss: 0.6927 - accu
```

```
173/173 [============== ] - 1s 2ms/step - loss: 0.6903 - accu
173/173 [============= ] - 1s 3ms/step - loss: 0.7810 - accu
173/173 [============= ] - 1s 3ms/step - loss: 0.7119 - accu
173/173 [=============== ] - 1s 3ms/step - loss: 0.7106 - accu
173/173 [============== ] - 1s 2ms/step - loss: 0.7145 - accu
```

```
1549/1549 [==================== ] - 6s 4ms/step - loss: 1.5300 - ac
173/173 [============= ] - 1s 2ms/step - loss: 0.7161 - accu
173/173 [=============== ] - 1s 3ms/step - loss: 0.6775 - accu
173/173 [============= ] - 1s 3ms/step - loss: 0.7719 - accu
```

```
173/173 [============= ] - 1s 2ms/step - loss: 0.7285 - accu
173/173 [=============== ] - 1s 3ms/step - loss: 0.7978 - accu
173/173 [============= ] - 1s 2ms/step - loss: 0.7881 - accu
173/173 [============== ] - 1s 3ms/step - loss: 0.7089 - accu
173/173 [=============== ] - 1s 3ms/step - loss: 0.8130 - accu
```

```
173/173 [============= ] - 1s 3ms/step - loss: 0.8010 - accu
1549/1549 [=============== ] - 6s 3ms/step - loss: 3.7869 - ac
173/173 [============== ] - 1s 2ms/step - loss: 0.7220 - accu
173/173 [============== ] - 1s 2ms/step - loss: 0.7428 - accu
173/173 [============= ] - 1s 2ms/step - loss: 0.7164 - accu
```

```
1549/1549 [=================== ] - 6s 3ms/step - loss: 0.7503 - ac
173/173 [=============== ] - 1s 2ms/step - loss: 0.7564 - accu
173/173 [============= ] - 1s 3ms/step - loss: 4.1802 - accu
173/173 [=============== ] - 1s 3ms/step - loss: 0.7561 - accu
173/173 [============= ] - 1s 3ms/step - loss: 0.7125 - accu
1549/1549 [=============== ] - 6s 3ms/step - loss: 3.0828 - ac
173/173 [============= ] - 1s 3ms/step - loss: 0.7394 - accu
```

```
1549/1549 [=================== ] - 6s 3ms/step - loss: 1.0846 - ac
173/173 [============= ] - 1s 3ms/step - loss: 0.7069 - accu
173/173 [============== ] - 1s 3ms/step - loss: 0.7502 - accu
173/173 [=============== ] - 1s 3ms/step - loss: 4.2924 - accu
173/173 [============= ] - 1s 3ms/step - loss: 0.7729 - accu
173/173 [============= ] - 1s 3ms/step - loss: 0.8599 - accu
```

```
173/173 [============== ] - 1s 3ms/step - loss: 0.7140 - accu
173/173 [============= ] - 1s 3ms/step - loss: 4.1201 - accu
173/173 [============== ] - 1s 2ms/step - loss: 0.7987 - accu
173/173 [============= ] - 1s 2ms/step - loss: 0.7394 - accu
173/173 [============== ] - 1s 3ms/step - loss: 0.7004 - accu
```

```
173/173 [============== ] - 1s 3ms/step - loss: 0.7264 - accu
173/173 [============= ] - 1s 3ms/step - loss: 0.7864 - accu
173/173 [============== ] - 1s 3ms/step - loss: 0.8985 - accu
173/173 [============== ] - 1s 3ms/step - loss: 0.7074 - accu
173/173 [============= ] - 1s 3ms/step - loss: 0.7354 - accu
```

```
173/173 [=============== ] - 1s 3ms/step - loss: 0.7579 - accu
3097/3097 [=============== ] - 11s 3ms/step - loss: 2.1917 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7102 - accu
3097/3097 [============== ] - 11s 3ms/step - loss: 1.3878 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.6388 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 4.0270 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.7959 - a
3097/3097 [=============== ] - 12s 4ms/step - loss: 3.3397 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 1.0189 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.9564 - a
3097/3097 [=============== ] - 11s 4ms/step - loss: 4.3895 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.0824 - a
3097/3097 [=============== ] - 12s 3ms/step - loss: 1.2191 - a
3097/3097 [================ ] - 12s 4ms/step - loss: 3.7228 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7934 - accu
3097/3097 [============= ] - 11s 3ms/step - loss: 3.2531 - a
3097/3097 [============== ] - 11s 4ms/step - loss: 1.7097 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 3.0202 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7477 - accu
```

```
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.1409 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.2374 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.8163 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 0.9151 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.6423 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 1.7760 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 0.8871 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 3.0500 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 1.0363 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.0571 - a
3097/3097 [=============== ] - 11s 4ms/step - loss: 1.3415 - a
3097/3097 [=============== ] - 11s 4ms/step - loss: 0.8393 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 0.8186 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.8994 - a
3097/3097 [============== ] - 12s 4ms/step - loss: 0.7540 - a
3097/3097 [================ ] - 12s 4ms/step - loss: 1.3029 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.6737 - accu
3097/3097 [=============== ] - 12s 4ms/step - loss: 3.0318 - a
3097/3097 [=============== ] - 12s 4ms/step - loss: 0.8352 - a
3097/3097 [=============== ] - 12s 4ms/step - loss: 0.7793 - a
3097/3097 [============= ] - 12s 4ms/step - loss: 1.1202 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 0.7974 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.6607 - accu
```

```
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.6255 - a
3097/3097 [=============== ] - 11s 4ms/step - loss: 1.4836 - a
3097/3097 [================ ] - 11s 4ms/step - loss: 0.9057 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7927 - accu
345/345 [============= ] - 1s 3ms/step - loss: 0.6250 - accu
3097/3097 [============== ] - 11s 4ms/step - loss: 3.7954 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 2.0721 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7936 - accu
3097/3097 [================ ] - 11s 4ms/step - loss: 4.2808 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.7536 - accu
3097/3097 [============== ] - 11s 4ms/step - loss: 4.3328 - a
3097/3097 [=============== ] - 12s 3ms/step - loss: 2.3272 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7727 - accu
3097/3097 [=============== ] - 11s 4ms/step - loss: 1.4267 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 1.2282 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.7154 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.7211 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 2.8803 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.3313 - a
345/345 [=============== ] - 1s 3ms/step - loss: 0.7278 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 0.9820 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.0098 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7440 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 3.9192 - a
```

```
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.1432 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.9888 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.7469 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 3.5519 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.2018 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 1.1345 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.2995 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 0.9793 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 7.7556 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.9205 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.8401 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.8623 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.0017 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 1.7933 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7550 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 0.8546 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 2.2066 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.5265 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.8305 - accu
3097/3097 [============== ] - 11s 3ms/step - loss: 0.9869 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 1.4787 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.0896 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 1.2517 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.3975 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7755 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 0.8730 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 0.8339 - a
345/345 [============= ] - 1s 2ms/step - loss: 0.6628 - accu
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.1061 - a
```

```
3097/3097 [================ ] - 11s 3ms/step - loss: 1.3619 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.8729 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.8941 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.7094 - accu
345/345 [============= ] - 1s 3ms/step - loss: 0.7535 - accu
3097/3097 [============== ] - 11s 3ms/step - loss: 3.5464 - a
3097/3097 [=============== ] - 12s 4ms/step - loss: 1.8318 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.6669 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 0.7607 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.7201 - accu
3097/3097 [============== ] - 11s 3ms/step - loss: 4.5952 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 2.3364 - a
345/345 [=============== ] - 1s 3ms/step - loss: 0.9137 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 4.1456 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 4.3837 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 0.6938 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 4.2358 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.7611 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 4.3801 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 7.3974 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 2.4252 - a
345/345 [=============== ] - 1s 3ms/step - loss: 0.8504 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 3.4204 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.2686 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7461 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 1.0700 - a
```

```
3097/3097 [================ ] - 11s 3ms/step - loss: 0.8060 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.9201 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.7192 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 4.4558 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.8633 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 0.7637 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 0.7539 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 4.5900 - a
3097/3097 [============= ] - 12s 4ms/step - loss: 3.6586 - a
3097/3097 [================ ] - 11s 4ms/step - loss: 1.4734 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.7467 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.4795 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.9776 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 0.8249 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7328 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 2.5909 - a
3097/3097 [============== ] - 13s 4ms/step - loss: 0.7268 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.7382 - a
3097/3097 [============== ] - 11s 4ms/step - loss: 1.0237 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 1.0698 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.4583 - a
3097/3097 [============= ] - 12s 4ms/step - loss: 1.0961 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.7120 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 1.5735 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.6997 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 0.9178 - a
```

```
3097/3097 [================ ] - 11s 4ms/step - loss: 1.1892 - a
3097/3097 [=============== ] - 11s 4ms/step - loss: 1.0412 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.6887 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.6181 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 1.1212 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.7268 - accu
3097/3097 [============== ] - 11s 3ms/step - loss: 1.1812 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 3.2771 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.9028 - accu
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.0326 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.7303 - accu
3097/3097 [=============== ] - 12s 3ms/step - loss: 1.5606 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.4481 - a
345/345 [=============== ] - 1s 3ms/step - loss: 0.6738 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 1.2850 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 4.3869 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 3.8917 - a
3097/3097 [================= ] - 12s 4ms/step - loss: 1.0770 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 0.7530 - a
3097/3097 [================ ] - 11s 4ms/step - loss: 1.9661 - a
3097/3097 [=============== ] - 11s 4ms/step - loss: 1.2131 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 6.4801 - a
345/345 [=============== ] - 1s 3ms/step - loss: 0.9031 - accu
3097/3097 [================ ] - 11s 4ms/step - loss: 3.0827 - a
3097/3097 [================ ] - 11s 4ms/step - loss: 3.5264 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.9522 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 2.3967 - a
```

```
3097/3097 [================ ] - 11s 4ms/step - loss: 3.7854 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.3781 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.6818 - accu
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.5622 - a
3097/3097 [================ ] - 11s 4ms/step - loss: 0.8547 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 1.5232 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.0393 - a
3097/3097 [================ ] - 12s 4ms/step - loss: 0.9356 - a
3097/3097 [============= ] - 12s 4ms/step - loss: 1.4278 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.0184 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 2.8977 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.5181 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.7560 - a
3097/3097 [============= ] - 11s 3ms/step - loss: 1.1387 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.6785 - accu
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.1839 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 0.7439 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.0792 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.6544 - accu
3097/3097 [============= ] - 13s 4ms/step - loss: 1.2402 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.7227 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 1.1166 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.6816 - a
3097/3097 [============= ] - 12s 4ms/step - loss: 1.1975 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.8626 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.0155 - a
3097/3097 [============== ] - 11s 3ms/step - loss: 1.7053 - a
345/345 [============= ] - 1s 3ms/step - loss: 0.6757 - accu
3097/3097 [================ ] - 11s 3ms/step - loss: 0.8292 - a
```

```
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.4132 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.8786 - a
3097/3097 [================ ] - 11s 3ms/step - loss: 1.0005 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7252 - accu
345/345 [============= ] - 1s 3ms/step - loss: 0.7706 - accu
3097/3097 [============== ] - 11s 3ms/step - loss: 3.9191 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.8606 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.9102 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7155 - accu
3097/3097 [============== ] - 11s 3ms/step - loss: 1.2810 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.7256 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 1.2174 - a
345/345 [============== ] - 1s 3ms/step - loss: 0.7109 - accu
3097/3097 [================ ] - 11s 4ms/step - loss: 1.0403 - a
3097/3097 [=============== ] - 11s 3ms/step - loss: 0.9399 - a
3097/3097 [============= ] - 12s 4ms/step - loss: 0.9509 - a
3097/3097 [================ ] - 11s 4ms/step - loss: 0.7900 - a
269/269 [============= ] - 1s 3ms/step - loss: 0.7164 - accu
2420/2420 [=============== ] - 9s 3ms/step - loss: 1.0877 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.7658 - accu
269/269 [============= ] - 1s 3ms/step - loss: 4.2708 - accu
```

```
2420/2420 [=============== ] - 9s 3ms/step - loss: 1.4774 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.8085 - accu
2420/2420 [=============== ] - 9s 3ms/step - loss: 2.6181 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.7376 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7440 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7267 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7797 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6565 - accu
```

```
269/269 [============= ] - 1s 3ms/step - loss: 0.9170 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7007 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7991 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.8388 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6128 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6929 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.9215 - accu
2420/2420 [=============== ] - 9s 4ms/step - loss: 1.4972 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.7135 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7267 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7051 - accu
2420/2420 [=============== ] - 9s 4ms/step - loss: 1.8570 - ac
2420/2420 [============== ] - 10s 4ms/step - loss: 4.1539 - a
269/269 [============= ] - 1s 3ms/step - loss: 0.7813 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7945 - accu
```

```
2420/2420 [=============== ] - 9s 3ms/step - loss: 1.0822 - ac
269/269 [============== ] - 1s 3ms/step - loss: 4.0883 - accu
2420/2420 [============== ] - 9s 4ms/step - loss: 4.3176 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.6745 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7786 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.8032 - accu
269/269 [============== ] - 1s 3ms/step - loss: 4.2590 - accu
2420/2420 [=============== ] - 9s 4ms/step - loss: 1.1171 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.8841 - accu
```

```
269/269 [============= ] - 1s 3ms/step - loss: 4.0668 - accu
2420/2420 [=============== ] - 10s 4ms/step - loss: 3.5936 - a
269/269 [============= ] - 1s 3ms/step - loss: 0.8812 - accu
2420/2420 [=============== ] - 9s 4ms/step - loss: 2.8439 - ac
269/269 [============= ] - 1s 3ms/step - loss: 4.2474 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7454 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6164 - accu
269/269 [================ ] - 1s 3ms/step - loss: 0.7980 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6678 - accu
269/269 [============ ] - 1s 3ms/step - loss: 0.7208 - accu
2420/2420 [================ ] - 10s 4ms/step - loss: 1.9531 - a
269/269 [============= ] - 1s 3ms/step - loss: 0.7613 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7034 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.9312 - accu
```

```
269/269 [============== ] - 1s 3ms/step - loss: 0.7325 - accu
2420/2420 [============== ] - 9s 4ms/step - loss: 0.7648 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.7686 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6951 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7283 - accu
269/269 [============== ] - 1s 3ms/step - loss: 0.6669 - accu
```

```
269/269 [============= ] - 1s 3ms/step - loss: 0.7109 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7077 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7853 - accu
2420/2420 [=============== ] - 9s 4ms/step - loss: 1.1531 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.6746 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6620 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6661 - accu
269/269 [================ ] - 1s 3ms/step - loss: 0.6748 - accu
2420/2420 [=============== ] - 9s 4ms/step - loss: 1.1722 - ac
2420/2420 [============== ] - 10s 4ms/step - loss: 0.8302 - a
269/269 [============= ] - 1s 3ms/step - loss: 0.7782 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6149 - accu
269/269 [============= ] - 1s 3ms/step - loss: 3.9020 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7144 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7122 - accu
```

```
269/269 [============= ] - 1s 3ms/step - loss: 0.7213 - accu
2420/2420 [=============== ] - 10s 4ms/step - loss: 1.1345 - a
269/269 [============= ] - 1s 3ms/step - loss: 0.8282 - accu
269/269 [============= ] - 1s 3ms/step - loss: 7.7555 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6193 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7736 - accu
```

```
269/269 [============= ] - 1s 3ms/step - loss: 0.7107 - accu
269/269 [============== ] - 1s 3ms/step - loss: 0.6705 - accu
269/269 [============ ] - 1s 3ms/step - loss: 0.7757 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6301 - accu
269/269 [================ ] - 1s 3ms/step - loss: 0.7227 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7172 - accu
269/269 [================ ] - 1s 3ms/step - loss: 0.6437 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.6681 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.9036 - accu
2420/2420 [============== ] - 9s 4ms/step - loss: 1.8278 - ac
269/269 [============= ] - 1s 3ms/step - loss: 0.7514 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7477 - accu
269/269 [============= ] - 1s 3ms/step - loss: 0.7197 - accu
```

```
In [ ]:
        best_params=fit.best_params_
        accuracy=fit.best_score_
In [ ]:
        best params
Out[ ]:
        {'batch_size': 20, 'nb_epoch': 200, 'unit': 15}
In [ ]:
        accuracy
Out[ ]:
        0.6489305555820465
In [ ]:
        Unit = 15
        # creating the layers of the NN
        ann = tf.keras.models.Sequential()
        ann.add(tf.keras.layers.Dense(units=15, activation='tanh'))
        ann.add(tf.keras.layers.Dense(units=15, activation='relu'))
        ann.add(tf.keras.layers.Dense(units=1, activation='linear'))
        ann.compile(optimizer = 'adam', loss = 'binary_crossentropy', metrics = ['ac
In [ ]:
        model=KerasClassifier(build fn=ann, batch size = 20, nb epoch = 200)
        <ipython-input-36-547324f8013c>:1: DeprecationWarning: KerasClassifier is de
         model=KerasClassifier(build fn=ann, batch size = 20, nb epoch = 200)
```

```
In [ ]:
             model.fit(X train, y train)
                                                        Traceback (most recent call last)
             ValueError
             <ipython-input-37-d768f88d541e> in <module>
             ----> 1 model.fit(X train, y train)
             /usr/local/lib/python3.8/dist-packages/keras/wrappers/scikit learn.py in fit
                           raise ValueError('Invalid shape for y: ' + str(y.shape))
                 234
                 235
                         self.n classes = len(self.classes )
                         return super(KerasClassifier, self).fit(x, y, **kwargs)
             --> 236
                 237
                 238
                       def predict(self, x, **kwargs):
             /usr/local/lib/python3.8/dist-packages/keras/wrappers/scikit_learn.py in fit
                 150
                         elif (not isinstance(self.build fn, types.FunctionType) and
                 151
                                not isinstance(self.build_fn, types.MethodType)):
             --> 152
                           self.model = self.build fn(
                                **self.filter sk params(self.build fn. call ))
                 153
                 154
                         else:
             /usr/local/lib/python3.8/dist-packages/keras/utils/traceback utils.py in err
                         except Exception as e: # pylint: disable=broad-except
                  65
                  66
                           filtered tb = process traceback frames(e. traceback )
                           raise e.with traceback(filtered tb) from None
             ---> 67
                         finally:
                  68
                           del filtered_tb
                  69
             /usr/local/lib/python3.8/dist-packages/keras/engine/base layer.py in split
                           inputs = kwargs.pop(self._call_fn_args[0])
                3099
                         else:
             -> 3100
                           raise ValueError(
                3101
                                'The first argument to `Layer.call` must always be passed.
                3102
                         return inputs, args, kwargs
             ValueError: The first argument to `Layer.call` must always be passed.
```