- Last Name: NarangDate: 6/10/2020
- Approach: Reading data >> EDA >> missing value imputation and Feature engineering >> Model Experimentation and final model selection >> prediction on Test data
- Estimated AUC: 0.85 (based on cross validation mean score)

import required libraries

```
In [2]: from IPython.core.display import display, HTML
        display(HTML("<style>.container { width:100% !important; }</style>"))
        import warnings
        warnings.filterwarnings('ignore')
        import pandas as pd
        import pandas_profiling
        from pandas profiling import ProfileReport
        import matplotlib.pyplot as plt
        import numpy as np
        import os
        import seaborn as sns
        import pickle
        from sklearn.metrics import roc auc score
        from sklearn.preprocessing import MinMaxScaler, StandardScaler
        from sklearn.svm import SVC
        from sklearn.linear model import LogisticRegression
        from sklearn.model selection import learning curve
        from sklearn import tree
        from sklearn.tree import DecisionTreeClassifier
        import graphviz
        from sklearn.ensemble import GradientBoostingClassifier
        from sklearn.model selection import cross val score
        from sklearn.model selection import RandomizedSearchCV
```

Reading data files

```
In [0]: train_df = pd.read_csv('/content/train.csv')
test_df = pd.read_csv('/content/test.csv')
```

Exploratory Data Analysis

```
In [5]: profile_train = ProfileReport(train_df)
    profile_train
```

Overview

Dataset statistics

Number of variables	10
Number of observations	10000
Missing cells	269
Missing cells (%)	0.3%
Duplicate rows	0
Duplicate rows (%)	0.0%
Total size in memory	781.4 KiB
Average record size in memory	80.0 B

Variable types

NUM	4
CAT	4
BOOL	2

Reproduction

Analysis started	2020-06-10 15:30:18.656961
Analysis finished	2020-06-10 15:30:26.647893

```
In [6]: profile_test = ProfileReport(test_df)
        profile_test
```

Overview

Dataset statistics

Number of variables	9
Number of observations	10000
Missing cells	249
Missing cells (%)	0.3%
Duplicate rows	0
Duplicate rows (%)	0.0%
Total size in memory	703.2 KiB
Average record size in memory	72.0 B
Variable types	

NUM	4
CAT	4
BOOL	1

Reproduction

Analysis started	2020-06-10 15:30:30.962351
Analysis finished	2020-06-10 15:30:35.600473

Feature Engineering and missing Value imputation

```
train_df.gender.fillna('other',inplace=True)
 In [0]: test df.gender.fillna('other',inplace=True)
 In [0]: # categorical variable to one hot encoding
           train df = pd.get dummies(train df,drop first = True)
In [10]:
          train_df.head()
Out[10]:
                    cost_of_ad in_initial_launch_location income n_drivers n_vehicles prior_ins_tenure out
                     0.005737
                                                      62717
                                                                   2
                                                                              1
                                                                                             4
                56
                                                  0
            0
                50
                     0.004733
                                                  0
                                                      64328
                                                                              3
                                                                                             2
            1
                                                                                             7
                                                      83439
                                                                   1
                                                                              3
                54
                     0.004129
                                                  0
            3
                16
                     0.005117
                                                  0
                                                      30110
                                                                   2
                                                                              3
                                                                                             0
                37
                     0.003635
                                                      76565
                                                                              1
                                                                                             5
           test df = pd.get dummies(test_df,drop_first = True)
 In [0]:
In [12]:
           test df.head()
Out[12]:
                    cost of ad in initial launch location income n drivers n vehicles prior ins tenure dev
               age
                     0.005134
                                                      40376
                                                                   1
                                                                              3
                                                                                             7
            0
                34
            1
                53
                     0.005223
                                                  1
                                                      84511
                                                                   1
                                                                              1
                                                                                            11
                                                      79322
                46
                     0.004939
                                                  0
                                                                              1
                                                                                             4
                36
                     0.004924
                                                  0
                                                      63295
                                                                   1
                                                                              2
                                                                                             0
            3
                     0.005146
                                                      36170
                                                                              3
                                                                                             3
                28
```

Model - Data Prepration

```
In [0]: X_train= train_df.drop('outcome',axis = 1)
    y_train = train_df.outcome

In [0]: #Scaling data from 0 to 1
    scaler = MinMaxScaler()
    X_train = scaler.fit_transform(X_train)
    test_df = scaler.transform(test_df)
```

```
In [15]: X_train.shape,test_df.shape
Out[15]: ((10000, 13), (10000, 13))
```

Model training and testing

```
In [0]: from numpy import mean
         from sklearn.model selection import cross val score
         from sklearn.model_selection import RepeatedStratifiedKFold
         from xgboost import XGBClassifier
In [17]: # estimate scale pos weight value
         estimate = y train.value_counts()[0]/y train.value_counts()[1]
         print('Estimate: %.3f' % estimate)
         Estimate: 9.183
In [0]: model = XGBClassifier(random state=1,) #scale pos weight = estimate
In [19]: cv = RepeatedStratifiedKFold(n splits=10, n repeats=3, random state=1)
         scores = cross_val_score(model, X_train, y_train, scoring='roc auc', cv=
         cv, n_jobs=-1)
         print('Mean ROC AUC: %.3f' % mean(scores))
         Mean ROC AUC: 0.850
In [23]: # tuning model
         # define grid
         param grid = {"learning rate" : [0.05, 0.10, 0.15],
                         "max depth"
                                            : [ 3, 4, 5, 6, 8],
                         "min child weight" : [ 1, 3, 5 ],
                                           : [ 0.0, 0.1, 0.2 , 0.3],
                         "colsample_bytree" : [ 0.3, 0.4, 0.5 ] ,
                         "scale pos weight": [1,3,6]}
         # define evaluation procedure
         cv = RepeatedStratifiedKFold(n splits=10, n repeats=3, random state=1)
         # define grid search
         grid = RandomizedSearchCV(estimator=model, param distributions=param gri
         d, n jobs=-1, cv=cv, scoring='roc auc')
         # execute the grid search
         grid result = grid.fit(X train, y train)
         # report the best configuration
         print("Best: %f using %s" % (grid result.best score , grid result.best p
         arams ))
         Best: 0.849953 using {'scale pos weight': 1, 'min child weight': 5, 'ma
         x depth': 3, 'learning rate': 0.15, 'gamma': 0.1, 'colsample bytree':
         0.4}
```

test data predition

```
In [0]:
           #Best model
           model = XGBClassifier(learning_rate = 0.15 , max_depth = 3, min_child_weigh
           t = 5,
                                   gamma =0.1 ,colsample bytree =0.4 ,scale pos weigh
           t = 1)
 In [25]: model.fit(X_train,y_train)
Out[25]: XGBClassifier(base_score=0.5, booster='gbtree', colsample_bylevel=1,
                          colsample_bynode=1, colsample_bytree=0.4, gamma=0.1,
                          learning_rate=0.15, max_delta_step=0, max_depth=3,
                          min_child_weight=5, missing=None, n_estimators=100, n_job
           s=1,
                          nthread=None, objective='binary:logistic', random state=
           0,
                          reg_alpha=0, reg_lambda=1, scale_pos_weight=1, seed=None,
                          silent=None, subsample=1, verbosity=1)
  In [0]:
           pred_test = model.predict(test_df)
  In [0]:
           df out = pd.read csv('/content/test.csv')
           df out['pred outcome'] = pred test
  In [0]:
 In [34]: df out.head()
Out[34]:
                            device type gender in initial launch location income n drivers n vehicles
              age
                  cost of ad
               34
                    0.005134
                               Android
                                           F
                                                                   40376
                                                                                        3
           0
                                           F
               53
                    0.005223
                               desktop
                                                                   84511
                                                               1
                                                                               1
                                                                                        1
           2
               46
                    0.004939
                                laptop
                                                               0
                                                                   79322
                                                                                        1
               36
                    0.004924
                               Android
                                                                   63295
                                                                                        2
           3
                                           F
               28
                    0.005146
                                 other
                                                                   36170
                                                                                        3
In [133]: | cv = RepeatedStratifiedKFold(n splits=10, n repeats=3, random state=1)
           scores = cross_val_score(model, X_train, y_train, scoring='roc_auc', cv=
           cv, n jobs=-1)
           # summarize performance
           print('Mean ROC AUC: %.5f' % mean(scores))
           Mean ROC AUC: 0.84996
```