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In [1]: import numpy as np
        import pandas as pd
        import matplotlib.pyplot as plt
        import seaborn as sns
        import warnings
        warnings.filterwarnings("ignore")
        from sklearn.model selection import *
        from sklearn.multioutput import *
        from sklearn.linear model import *
        from sklearn.metrics import *
        from sklearn.preprocessing import *
In [2]: train input = pd.read csv("training set features.csv")
        train_output = pd.read_csv("training_set_labels.csv")
        test_input = pd.read_csv("test_set_features.csv")
        test_output = pd.read_csv("submission_format.csv")
In [3]: print("Percentage of Null Values\n")
        for i in train_input:
            p = train_input[i].isna().sum()*100/len(train_input[i])
            print(i,":",round(p,2))
```

Percentage of Null Values

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respondent id : 0.0
h1n1 concern: 0.34
h1n1_knowledge : 0.43
behavioral antiviral meds: 0.27
behavioral avoidance : 0.78
behavioral face mask: 0.07
behavioral wash hands : 0.16
behavioral large gatherings: 0.33
behavioral_outside_home : 0.31
behavioral touch face: 0.48
doctor recc h1n1: 8.09
doctor recc seasonal: 8.09
chronic med condition: 3.64
child under 6 months : 3.07
health worker: 3.01
health insurance: 45.96
opinion h1n1 vacc effective : 1.46
opinion h1n1 risk: 1.45
opinion_h1n1_sick_from_vacc : 1.48
opinion seas vacc effective : 1.73
opinion_seas_risk : 1.92
opinion_seas_sick_from_vacc : 2.01
age group : 0.0
education: 5.27
race : 0.0
sex : 0.0
income_poverty : 16.56
marital_status : 5.27
rent or own : 7.65
employment status : 5.48
hhs_geo_region : 0.0
census msa : 0.0
household adults: 0.93
household children: 0.93
employment industry: 49.91
employment occupation: 50.44
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values replace dict = {
            "education" : {"< 12 Years":0,"12 Years":1,"College Graduate":2,"Some Co
            "income_poverty" : {"Below Poverty":0,"<= $75,000, Above Poverty":1,"> $
            "marital_status" : {"Not Married":0,"Married":1},
            "rent_or_own" : {"Rent":0,"0wn":1},
            "employment_status" : {"Unemployed":0,"Not in Labor Force":1,"Employed":
            "census_msa" : {"Non-MSA":0,"MSA, Not Principle City":1,"MSA, Principle
In [5]: def sort using numerical encoding(df,sort and numerical encoding):
            for i in sort and numerical encoding:
                req val = {}
                ctr = 0
                vals = list(df[i].unique())
                while np.nan in vals:
                    vals.remove(np.nan)
                vals = np.sort(np.array(vals))
                for j in vals:
                    req_val[j] = ctr
                    ctr += 1
                df[i] = df[i].map(req_val)
            return df
        def replace_na_with_values(df,replace_with_value_0,replace_with_value_1,repl
            for i in replace with value 0:
                df[i] = df[i].fillna(0.0)
            for i in replace with value 1:
                df[i] = df[i].fillna(1.0)
            for i in replace with value 2:
                df[i] = df[i].fillna(2.0)
            for i in replace with value 3:
                df[i] = df[i].fillna(3.0)
            return df
        def replace_na_with_conditional_values(df,replace_with_one_value_one_conditi
            for i in replace with one value one condition:
                df[i][df["h1n1 concern"]==3.0] = df[i][df["h1n1 concern"]==3.0].fill
                df[i] = df[i].fillna(0.0)
            for i in replace with one value two conditions:
                df[i][(df["h1n1_concern"]==3) & (df["h1n1_knowledge"]==2)] = df[i][(
                df[i] = df[i].fillna(0.0)
            for i in replace with one value three conditions:
                df[i][(df["h1n1_concern"]==3) & (df["h1n1_knowledge"]==2)] = df[i][(
                df[i][(df["h1n1 concern"]==3) & (df["h1n1 knowledge"]==1)] = df[i][(
                df[i] = df[i].fillna(0.0)
            return df
        def replace_with_dict_values(df, values_replace_dict):
            ctr = 0
            for i in values replace dict:
                df[i] = df[i].map(values_replace_dict[i])
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ctr += 1
            return df
        def replace null with relevant values(df):
            df["chronic_med_condition"] = df["chronic_med_condition"].fillna(df["chr
            df["education"] = df["education"].fillna(df["education"].median())
            df["income poverty"] = df["income poverty"].fillna(df["income poverty"].
            df["marital_status"] = df["marital_status"].fillna(0.0)
            df["rent or own"] = df["rent or own"].fillna(0.0)
            df["employment status"] = df["employment status"].fillna(df["employment
            df["census_msa"] = df["census_msa"].fillna(1.0)
            df["employment industry"] = df["employment industry"].fillna(df train ir
            df["employment occupation"] = df["employment occupation"].fillna(df trai
            return df
In [6]: df_train_input = train_input.copy()
        df_train_input = replace_na_with_values(df_train_input,replace_with_value_0,
        df_train_input = replace_na_with_conditional_values(df_train_input,replace_w
        df_train_input = replace_with_dict_values(df_train_input,values_replace_dict
        df_train_input = sort_using_numerical_encoding(df_train_input,sort_and_numer
        df train input = replace null with relevant values(df train input)
        df_train_input = df_train_input.astype("int64")
In [7]: df_test_input = test_input.copy()
        df_test_input = replace_na_with_values(df_test_input, replace_with_value_0, re
        df_test_input = replace_na_with_conditional_values(df_test_input,replace_wit
        df test input = replace with dict values(df test input, values replace dict)
        df_test_input = sort_using_numerical_encoding(df_test_input,sort_and_numeric
        df_test_input = replace_null_with_relevant_values(df_test_input)
        df_test_input = df_test_input.astype("int64")
In [8]: ss = MinMaxScaler()
        X train = pd.DataFrame((ss.fit transform(X=df train input.drop(columns="resp
        X_test = pd.DataFrame((ss.fit_transform(X=df_test_input.drop(columns="respor"))
        y train = train output.drop(columns="respondent id")
In [9]: | lgmodel = LogisticRegression(solver='lbfgs')
        mlc = MultiOutputClassifier(estimator=lgmodel)
        mlc.fit(X train,y train)
        y_prob = mlc.predict_proba(X_test)
        y test prob = pd.DataFrame(columns=["h1n1 vaccine","seasonal vaccine"])
        y_test_prob["h1n1_vaccine"] = y_prob[0][:,1]
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y_test_prob["seasonal_vaccine"] = y_prob[1][:,1]

y = mlc.predict(X_test)
y_test = pd.DataFrame(columns=["h1n1_vaccine","seasonal_vaccine"])
y_test["h1n1_vaccine"] = y[:,0]
y_test["seasonal_vaccine"] = y[:,1]

In [10]: roc_auc_score(y_test,y_test_prob)

Out[10]: 1.0

In [11]: fin_sol = pd.DataFrame(columns=["respondent_id","h1n1_vaccine","seasonal_vaccine"] = y_test_input["respondent_id"].copy()
fin_sol["respondent_id"] = y_test_prob["h1n1_vaccine"].copy()
fin_sol["seasonal_vaccine"] = y_test_prob["seasonal_vaccine"].copy()

In [12]: fin_sol.to_csv("submission.csv",index=False,header=True)

In []:
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