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# Import necessary libraries
import pandas as pd
from sklearn.model selection import train test split. GridSearchCV. cross val score
from sklearn.ensemble import RandomForestClassifier
from sklearn.metrics import accuracy score, precision score, recall score, f1 score, confusion matrix
from google.colab import drive
# Mount Google Drive
drive.mount('/content/drive')
# Provide the path to your dataset in Google Drive
file_path = '/content/drive/MyDrive/booking.csv
# Load the dataset
hotel_data = pd.read_csv(file_path)
print("Data Preview:\n", hotel_data.head())
# Data Exploration: Check for missing values and dataset overview
print("Missing Values Summary:\n", hotel_data.isnull().sum())
print("Dataset shape:", hotel_data.shape)
# Feature Engineering
# Convert 'date of reservation' to datetime format and extract useful features
hotel_data['date of reservation'] = pd.to_datetime(hotel_data['date of reservation'], errors='coerce')
hotel_data['reservation_month'] = hotel_data['date of reservation'].dt.month
hotel_data['reservation_year'] = hotel_data['date of reservation'].dt.year
# Convert 'booking status' to a binary target variable
hotel_data['cancellation_status'] = hotel_data['booking status'].apply(lambda x: 1 if x == 'Canceled' else 0)
# Encode categorical variables using one-hot encoding
hotel_data_encoded = pd.get_dummies(hotel_data, columns=['type of meal', 'room type', 'market segment type'], drop_first=True)
# Drop unnecessary columns and handle missing values
hotel_data_encoded.drop(columns=['date of reservation', 'booking status'], inplace=True)
hotel data encoded = hotel data encoded.dropna()
# Separate features (X) and target (Y)
X = hotel_data_encoded.drop(['cancellation_status', 'Booking_ID'], axis=1)
Y = hotel_data_encoded['cancellation_status']
# Split the data into training and testing sets
X_train, X_test, y_train, y_test = train_test_split(X, Y, test_size=0.2, random_state=42)
# Initialize and train Random Forest model
random_forest_model = RandomForestClassifier(n_estimators=100, random_state=42)
{\tt random\_forest\_model.fit}({\tt X\_train},\ {\tt y\_train})
# Predict on the test set
random_forest_y_pred = random_forest_model.predict(X_test)
# Evaluate the model
random_forest_metrics = {
    "Accuracy": accuracy_score(y_test, random_forest_y_pred),
    "Precision": precision_score(y_test, random_forest_y_pred),
    "Recall": recall_score(y_test, random_forest_y_pred),
    "F1 Score": f1_score(y_test, random_forest_y_pred),
print("Random Forest Metrics:", random_forest_metrics)
# Confusion Matrix
print("Confusion Matrix:\n", confusion_matrix(y_test, random_forest_y_pred))
# Feature Importance
feature importances = pd.DataFrame({
    'Feature': X.columns,
    'Importance': random_forest_model.feature_importances_
}).sort_values(by='Importance', ascending=False)
print("Feature Importances:\n", feature_importances)
# Cross-validation for robust evaluation
cv_scores = cross_val_score(random_forest_model, X_train, y_train, cv=5, scoring='f1')
print("Cross-validated F1 scores:", cv_scores)
print("Average F1 score:", cv_scores.mean())
# Hyperparameter Tuning
param grid = {
    'n estimators': [100, 200, 300],
    'max_depth': [None, 10, 20, 30],
    'min_samples_split': [2, 5, 10],
    'min_samples_leaf': [1, 2, 4],
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                       'max_features': ['sqrt', 'log2']
           grid_search_rf = GridSearchCV(
                      RandomForestClassifier(random_state=42),
                      param_grid,
                      scoring='f1',
                      cv=3.
                      verbose=1
           grid_search_rf.fit(X_train, y_train)
           # Get the best model and evaluate
           best_rf_model = grid_search_rf.best_estimator_
           best_rf_y_pred = best_rf_model.predict(X_test)
           optimized rf metrics = {
                       "Accuracy": accuracy_score(y_test, best_rf_y_pred),
                       "Precision": precision_score(y_test, best_rf_y_pred),
                       "Recall": recall_score(y_test, best_rf_y_pred),
                       "F1 Score": f1_score(y_test, best_rf_y_pred),
           print("Optimized Random Forest Metrics:", optimized_rf_metrics)
           # Final Cross-validation for the best model
           cv_scores_optimized = cross_val_score(best_rf_model, X_train, y_train, cv=5, scoring='f1')
           print("Cross-validated F1 scores (optimized):", cv_scores_optimized)
           print("Average F1 score (optimized):", cv_scores_optimized.mean())
                       Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.mount("/content/drive", force remount=True).
                         Data Preview:
                                                                  number of adults number of children number of weekend nights \
                                 Booking ID
                                   INN00001
                                                                                                          1
                                    TNN99992
                         1
                                                                                                          1
                                                                                                                                                                  a
                                                                                                                                                                                                                                          1
                         2
                                    INN00003
                                                                                                          2
                                                                                                                                                                  1
                                                                                                                                                                                                                                          1
                         3
                                    INN00004
                                                                                                          1
                                                                                                                                                                  a
                                                                                                                                                                                                                                          a
                         4
                                   INN00005
                                                                                                          1
                                                                                                                                                                  0
                                                                                                                                                                                                                                          1
                                  number of week nights type of meal car parking space
                                                                                                                                                                                                   room type
                         0
                                                                                                   Meal Plan 1
                                                                                                                                                                                             Room Type 1
                                                                                                 Not Selected
                         1
                                                                                                                                                                                             Room Type 1
                         2
                                                                                         3
                                                                                                 Meal Plan 1
                                                                                                                                                                                     0
                                                                                                                                                                                             Room_Type 1
                         3
                                                                                                    Meal Plan 1
                                                                                         2
                                                                                                                                                                                     0
                                                                                                                                                                                             Room_Type 1
                         4
                                                                                         2 Not Selected
                                                                                                                                                                                     0
                                                                                                                                                                                             Room_Type 1
                                 lead time market segment type repeated
                                                                                                                                                   P-C P-not-C average price
                         0
                                                  224
                                                                                              Offline
                                                                                                                                           0
                                                                                                                                                         0
                                                                                                                                                                                  0
                                                                                                                                                                                                                 88.00
                         1
                                                       5
                                                                                                 Online
                                                                                                                                           0
                                                                                                                                                         0
                                                                                                                                                                                  0
                                                                                                                                                                                                               106.68
                                                                                                 Online
                         2
                                                        1
                                                                                                                                                                                  0
                                                                                                                                                                                                                 50.00
                         3
                                                   211
                                                                                                 Online
                                                                                                                                           0
                                                                                                                                                         0
                                                                                                                                                                                  0
                                                                                                                                                                                                               100.00
                         4
                                                    48
                                                                                                 Online
                                                                                                                                           0
                                                                                                                                                         0
                                                                                                                                                                                  0
                                                                                                                                                                                                                77.00
                                 special requests date of reservation booking status
                         a
                                                                           a
                                                                                                            10/2/2015
                                                                                                                                             Not Canceled
                         1
                                                                           1
                                                                                                            11/6/2018
                                                                                                                                              Not_Canceled
                         2
                                                                           0
                                                                                                             2/28/2018
                                                                                                                                                         Canceled
                         3
                                                                           1
                                                                                                             5/20/2017
                                                                                                                                                         Canceled
                                                                           0
                                                                                                             4/11/2018
                                                                                                                                                         Canceled
                         Missing Values Summary:
                           Booking_ID
                         number of adults
                         number of children
                         number of weekend nights
                                                                                                       0
                         number of week nights
                                                                                                       0
                         type of meal
                         car parking space
                                                                                                       0
                         room type
                                                                                                       a
                         lead time
                                                                                                       a
                         market segment type
                                                                                                       0
                         repeated
                         P-C
                         P-not-C
                         average price
                                                                                                       0
                         special requests
                         date of reservation
                                                                                                       0
                         booking status % \left( \frac{1}{2}\right) =\left( \frac{1}{2}\right) \left( \frac{1}{2}\right
                         dtype: int64
                         Dataset shape: (36285, 17)
                         Random Forest Metrics: {'Accuracy': 0.8971034482758621, 'Precision': 0.8647191011235955, 'Recall': 0.8121570282819756, 'F1 Score'
                         Confusion Matrix:
                            [[4580 301]
                            [ 445 1924]]
                         Feature Importances:
                                                                                                                Feature
                                                                                                                                      Importance
                         5
                                                                                                                                           0.357203
                                                                                                       lead time
                                                                                            average price
                                                                                                                                           0.184194
```