数据挖掘互评作业三 分类、预测与聚类

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```
import csv
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

```
data = pd.read_csv('C:/Users/15192/Desktop/数据挖掘/hotel_bookings.csv')
data.head()
```

```
.dataframe tbody tr th {
    vertical-align: top;
}
.dataframe thead th {
    text-align: right;
}
```

	hotel	is_canceled	lead_time	arrival_date_year	arrival_date_month	arrival_date_week_number	arrival_date_day_of_r
0	Resort Hotel	0	342	2015	July	27	1
1	Resort Hotel	0	737	2015	July	27	1
2	Resort Hotel	0	7	2015	July	27	1
3	Resort Hotel	0	13	2015	July	27	1
4	Resort Hotel	0	14	2015	July	27	1

5 rows × 32 columns

data.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 119390 entries, 0 to 119389
Data columns (total 32 columns):
# Column
                                       Non-Null Count Dtype
118902 non-null object

14 market_segment 119390 non-null object

15 distribution_channel 119390 non-null object

16 is_repeated_guest 119390 non-null int64

17 previous_cancellations 119390 non-null

18 previous_booking
 18 previous_bookings_not_canceled 119390 non-null int64
 19 reserved_room_type 119390 non-null object
 20 assigned_room_type
                                        119390 non-null object
 21 booking_changes
                                       119390 non-null int64
                                        119390 non-null object
 22 deposit_type
                                       103050 non-null float64
 23 agent
```

```
24 company 6797 non-null float64
25 days_in_waiting_list 119390 non-null int64
26 customer_type 119390 non-null object
27 adr 119390 non-null float64
28 required_car_parking_spaces 119390 non-null int64
29 total_of_special_requests 119390 non-null int64
30 reservation_status 119390 non-null object
31 reservation_status_date 119390 non-null object
dtypes: float64(4), int64(16), object(12)
memory usage: 29.1+ MB
```

```
城市酒店和假日酒店预订需求和入住率比较
```

```
data.isnull().sum()
```

```
hote1
is canceled
                                  0
lead_time
                                  0
arrival_date_year
                                  0
arrival_date_month
                                  0
arrival date week number
                                 0
arrival_date_day_of_month
                                 0
stays_in_weekend_nights
                                 0
stays_in_week_nights
adults
                                 0
children
                                 4
babies
                                 0
meal
                                 0
country
                                 0
market segment
                                0
distribution channel
is_repeated_guest
                                 0
previous_cancellations
                                 0
previous_bookings_not_canceled 0
                                 0
reserved room type
                                 0
assigned_room_type
booking_changes
                                0
deposit_type
                                 0
                             16340
agent
                             112593
company
days_in_waiting_list
                               0
customer_type
                                  0
                                 0
required_car_parking_spaces
total_of_special_requests
                                 0
                                0
reservation status
reservation_status_date
                                0
dtype: int64
```

```
data1 = data.copy(deep = True)
data1.drop("company", axis=1, inplace=True)
data1["agent"].fillna(0, inplace=True)
data1["children"].fillna(data1["children"].mode()[0], inplace=True)
data1["country"].fillna(data1["country"].mode()[0], inplace=True)
list = data1.hote1.value_counts()
list
```

```
City Hotel 79330
Resort Hotel 40060
Name: hotel, dtype: int64
```

```
从需求量上来看,城市酒店为79330,而假日酒店为40060,所以城市酒店的需求量较大,远远高于假日酒店
```

```
rh_iscancel_count = data1[data1["hotel"]=="Resort Hotel"].groupby(["is_canceled"])["is_canceled"].count()
ch_iscancel_count = data1[data1["hotel"]=="City Hotel"].groupby(["is_canceled"])["is_canceled"].count()
```

```
rh_iscancel_count
```

```
is_canceled
0 28938
1 11122
Name: is_canceled, dtype: int64
```

ch_iscancel_count

```
is_canceled
0 46228
1 33102
Name: is_canceled, dtype: int64
```

```
rh_num = rh_iscancel_count[0]/list['Resort Hotel']
rh_num
```

0.7223664503245132

```
ch_num = ch_iscancel_count[0]/list['City Hotel']
ch_num
```

0.5827303668221354

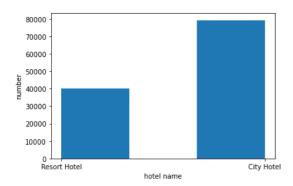
从入住率上来看,城市酒店为0.58,而假日酒店为0.72,假日酒店的入住率远远高于城市酒店。

```
fig1 = [rh_num,ch_num]
index = np.arange(2)
plt.bar(index, fig1, width=0.3,color='rgb')
plt.xticks(index,('Resort Hotel','City Hotel'))
plt.show()
```

<ipython-input-17-2d9b2db7e1b3>:3: MatplotlibDeprecationWarning: Using a string of single character colors as a color sequence is deprecated
since 3.2 and will be removed two minor releases later. Use an explicit list instead.
plt.bar(index, fig1, width=0.3,color='rgb')



```
fig = plt.figure()
ax = fig.add_subplot(111)
ax.hist(data['hotel'], bins=3)
plt.xlabel('hotel name')
plt.ylabel('number')
plt.show()
```



用户行为: 提前预订时间、入住时长、预订间隔、餐食预订情况

提前预订时间

data1['lead_time'].describe()

```
119390.000000
count
mean
        104.011416
std
          106.863097
           0.000000
min
           18.000000
25%
           69.000000
50%
75%
         160.000000
max
          737.000000
Name: lead_time, dtype: float64
```

平均提前预定时间为104,最小值为0,最大值为737

入住时长 =周末停留夜晚数+工作日停留夜晚数

data1["total_nights"] = data1["stays_in_weekend_nights"] + data1["stays_in_week_nights"]

data1['total_nights'].describe()

```
      count
      119390.000000

      mean
      3.427900

      std
      2.557439

      min
      0.00000

      25%
      2.00000

      50%
      3.00000

      75%
      4.00000

      max
      69.00000

      Name:
      total_nights, dtype: float64
```

平均入住时间为3天,最小值为0天,最大值为69天

预订间隔

data1['days_in_waiting_list'].describe()

```
119390.000000
count
            2.321149
mean
std
            17.594721
            0.000000
25%
            0.000000
            0.000000
50%
75%
            0.000000
max
           391.000000
Name: days_in_waiting_list, dtype: float64
```

```
平均预定间隔为2,最小值为0,最大值为391
```

餐食预订情况

```
data1['meal'].value_counts()
```

```
BB 92310
HB 14463
SC 10650
Undefined 1169
FB 798
Name: meal, dtype: int64
```

多数的餐食预定为BB

一年中最佳预订酒店时间

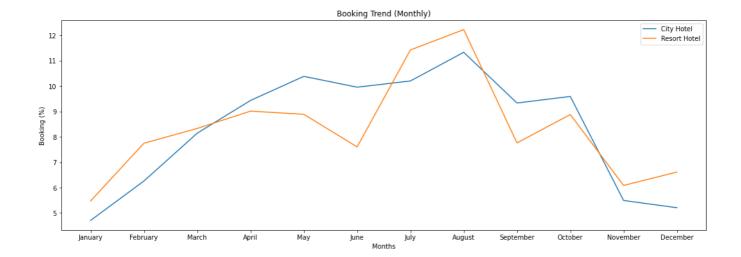
```
new_order = ['January', 'February', 'March', 'April', 'May', 'June', 'July', 'August', 'September', 'October', 'November', 'December']
sorted_months = datal.loc[datal.hotel=='City Hotel' ,'arrival_date_month'].value_counts().reindex(new_order)
x1 = sorted_months.index
y1 = sorted_months.sorted_months.sum()*100
sorted_months = datal.loc[datal.hotel=='Resort Hotel' ,'arrival_date_month'].value_counts().reindex(new_order)
x2 = sorted_months.index
y2 = sorted_months/sorted_months.sum()*100
fig, ax = plt.subplots(figsize=(18,6))
ax.set_xlabel('Months')
ax.set_ylabel('Months')
ax.set_ylabel('Months')
ax.set_title('Booking Trend (Monthly)')
sns.lineplot(x1, y1.values, label='City Hotel')
sns.lineplot(x1, y2.values, label='Resort Hotel')
plt.show()
```

D:\Anaconda\lib\site-packages\seaborn_decorators.py:36: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

warnings.warn(
D:\Anaconda\lib\site-packages\seaborn_decorators.py:36: FutureWarni

D:\Anaconda\lib\site-packages\seaborn_decorators.py:36: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

warnings.warn(



根据酒店的入住情况来看,一年中最佳预订酒店时间为1月和12月,这两月酒店的入住量最低,最适合预定酒店。

data1.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 119390 entries, 0 to 119389
Data columns (total 32 columns):
#
   Column
                                  Non-Null Count Dtype
---
    -----
0 hotel
                                  119390 non-null object
                                  119390 non-null
1
    is_canceled
   lead_time
                                  119390 non-null int64
                                  119390 non-null int64
3
   arrival_date_year
4
   arrival_date_month
                                  119390 non-null object
5
  arrival_date_week_number
                                 119390 non-null int64
    arrival_date_day_of_month
                                  119390 non-null
                                                  int64
                                 119390 non-null int64
   stavs in weekend nights
                                  119390 non-null int64
8
   stays_in_week_nights
9
    adults
                                  119390 non-null int64
10 children
                                  119390 non-null float64
 11 babies
                                  119390 non-null int64
12 meal
                                  119390 non-null object
13 country
                                  119390 non-null object
14 market_segment
                                  119390 non-null object
15 distribution_channel
                                 119390 non-null object
16 is_repeated_guest
                                  119390 non-null int64
17 previous cancellations
                                  119390 non-null int64
18 previous_bookings_not_canceled 119390 non-null int64
19 reserved_room_type
                                  119390 non-null object
20 assigned_room_type
                                 119390 non-null object
21 booking_changes
                                  119390 non-null int64
                                 119390 non-null object
22 deposit_type
23 agent
                                 119390 non-null float64
24
   days_in_waiting_list
                                  119390 non-null int64
25 customer_type
                                  119390 non-null object
                                  119390 non-null float64
26 adr
27 required_car_parking_spaces
                                  119390 non-null int64
28 total_of_special_requests
                                  119390 non-null int64
 29
   reservation_status
                                  119390 non-null object
 30 reservation_status_date
                                  119390 non-null object
                                  119390 non-null int64
31 total_nights
dtypes: float64(3), int64(17), object(12)
memory usage: 29.1+ MB
```

```
dataframe中的分类数据转化为数值数据
```

```
data1 = pd.get_dummies(data1)
data1
```

```
.dataframe tbody tr th {
    vertical-align: top;
}
.dataframe thead th {
    text-align: right;
}
```

	is_canceled	lead_time	arrival_date_year	arrival_date_week_number	arrival_date_day_of_month	stays_in_weekend_nights	stays
0	0	342	2015	27	1	0	0
1	0	737	2015	27	1	0	0
2	0	7	2015	27	1	0	1
3	0	13	2015	27	1	0	1
4	0	14	2015	27	1	0	2
•••							
119385	0	23	2017	35	30	2	5
119386	0	102	2017	35	31	2	5
119387	0	34	2017	35	31	2	5
119388	0	109	2017	35	31	2	5
119389	0	205	2017	35	29	2	7

119390 rows × 1187 columns

```
def data_split(df, label):
    from sklearn.model_selection import train_test_split

    X = df.drop(label, axis=1)
    Y = df[label]

    x_train, x_test, y_train, y_test = train_test_split(x,Y,random_state=0)
    return x_train, x_test, y_train, y_test

x_train, x_test, y_train, y_test = data_split(data1, 'is_canceled')
```

按照80%的比例划分训练集和测试集

```
def train(x_train, y_train):
    from sklearn.linear_model import LogisticRegression

    clf = LogisticRegression(random_state = 0, max_iter=100)
    clf.fit(x_train,y_train)

    return clf

clf = train(x_train, y_train)
```

```
D:\Anaconda\lib\site-packages\sklearn\linear_model\_logistic.py:762: ConvergenceWarning: lbfgs failed to converge (status=1):

STOP: TOTAL NO. of ITERATIONS REACHED LIMIT.

Increase the number of iterations (max_iter) or scale the data as shown in:
    https://scikit-learn.org/stable/modules/preprocessing.html

Please also refer to the documentation for alternative solver options:
    https://scikit-learn.org/stable/modules/linear_model.html#logistic-regression
    n_iter_i = _check_optimize_result(
```

利用logistics模型进行预测,最终模型准确率为99%