## importig the libraries

## ▼ EDA of Hotel Bookings Demand

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

## importing and understanding the dataset

```
df=pd.read_csv("hotel_bookings.csv")
df.shape
df.head
```

```
<bound method NDFrame.head of</pre>
                                               hotel is canceled lead time arrival date year \
0
        Resort Hotel
                                           342
                                                              2015
1
        Resort Hotel
                                           737
                                                              2015
        Resort Hotel
                                             7
                                                              2015
        Resort Hotel
                                            13
                                                              2015
        Resort Hotel
                                            14
                                                              2015
                                                               . . .
                                           . . .
          City Hotel
119385
                                            23
                                                              2017
          City Hotel
119386
                                           102
                                                              2017
          City Hotel
119387
                                            34
                                                              2017
119388
          City Hotel
                                           109
                                                              2017
119389
          City Hotel
                                           205
                                                              2017
       arrival_date_month arrival_date_week_number \
0
                      July
                                                    27
```

 $https://colab.research.google.com/drive/1B\_f09w\_6cPsNLAto0kOmoApBgVxst9SO\#scrollTo=OW1Tsa13\_3E9\&printMode=true$ 

```
July
                                                    27
1
2
                                                    27
                      July
                                                    27
                      July
3
                                                    27
4
                      July
                       . . .
                                                   . . .
119385
                                                    35
                    August
                                                    35
119386
                    August
119387
                                                    35
                    August
119388
                                                    35
                    August
119389
                                                    35
                    August
        arrival_date_day_of_month stays_in_weekend_nights \
0
1
                                                             0
2
3
                                                             0
4
                                                             0
. . .
119385
                                 30
                                                             2
119386
                                 31
                                                             2
119387
                                 31
                                                             2
                                                             2
119388
                                 31
119389
                                 29
                                                             2
                                adults
        stays_in_week_nights
                                             deposit type
                                                            agent company \
0
                                               No Deposit
                                                               NaN
                                                                       NaN
1
                            0
                                               No Deposit
                                                               NaN
                                                                       NaN
2
                            1
                                               No Deposit
                                                               NaN
                                                                       NaN
                                               No Deposit
                                                            304.0
                                                                       NaN
3
4
                                               No Deposit
                                                            240.0
                                                                       NaN
119385
                            5
                                               No Deposit
                                                            394.0
                                                                       NaN
119386
                                               No Deposit
                                                               9.0
                                                                       NaN
119387
                                               No Deposit
                                                               9.0
                                                                       NaN
119388
                                               No Deposit
                                                             89.0
                                                                       NaN
119389
                            7
                                               No Deposit
                                                               9.0
                                                                       NaN
                                        . . .
       days_in_waiting_list customer_type
                                                 adr \
0
                                  Transient
                                                0.00
1
                           0
                                  Transient
                                                0.00
2
                                  Transient
                                              75.00
                           0
```

3 0 Transient 75.00

###

pd.set\_option('display.max\_columns',32)

Double-click (or enter) to edit

df.columns

df.nunique()

hotel	2
is_canceled	2
<pre>lead_time</pre>	479
arrival_date_year	3
arrival_date_month	12
arrival_date_week_number	53
arrival_date_day_of_month	31
stays_in_weekend_nights	17
stays_in_week_nights	35
adults	14
children	5
babies	5
meal	5
country	177
market_segment	8
distribution_channel	5
<pre>is_repeated_guest</pre>	2
previous_cancellations	15
<pre>previous_bookings_not_canceled</pre>	73
reserved_room_type	10
assigned_room_type	12
booking_changes	21

```
deposit_type
                                      3
                                    333
agent
                                    352
company
days_in_waiting_list
                                    128
customer type
                                      4
                                   8879
adr
required car parking spaces
                                      5
total of special requests
                                      6
reservation status
                                    926
reservation_status_date
dtype: int64
```

### Double-click (or enter) to edit

```
df['hotel'].value_counts()
```

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

### Double-click (or enter) to edit

```
df['meal'].value counts()
```

BB 92310 HB 14463 SC 10650 Undefined 1169 FB 798

Name: meal, dtype: int64

### Double-click (or enter) to edit

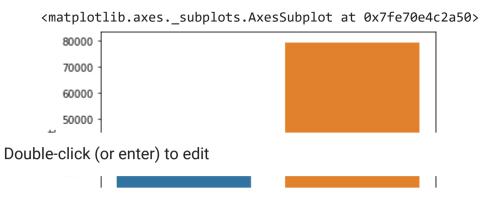
```
8/28/22, 11:26 AM
   df['market segment'].value counts()
         Online TA
                           56477
         Offline TA/TO
                          24219
         Groups
                          19811
         Direct
                          12606
         Corporate
                           5295
         Complementary
                            743
         Aviation
                            237
         Undefined
                               2
         Name: market_segment, dtype: int64
   Double-click (or enter) to edit
   df['distribution_channel'].value_counts()
         TA/TO
                      97870
        Direct
                      14645
         Corporate
                       6677
         GDS
                        193
         Undefined
         Name: distribution channel, dtype: int64
   Double-click (or enter) to edit
   df['deposit_type'].value_counts()
         No Deposit
                       104641
         Non Refund
                        14587
```

```
Refundable
                 162
```

Name: deposit\_type, dtype: int64

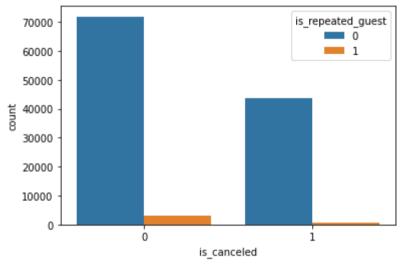
#### Double-click (or enter) to edit

```
df['customer_type'].value_counts()
     Transient
                        89613
     Transient-Party
                        25124
     Contract
                         4076
     Group
                          577
     Name: customer_type, dtype: int64
Double-click (or enter) to edit
df['total_of_special_requests'].value_counts()
          70318
          33226
          12969
           2497
            340
             40
     Name: total_of_special_requests, dtype: int64
Double-click (or enter) to edit
sns.countplot(data=df,x='hotel')
```



sns.countplot(data=df,x='is\_canceled',hue='is\_repeated\_guest')

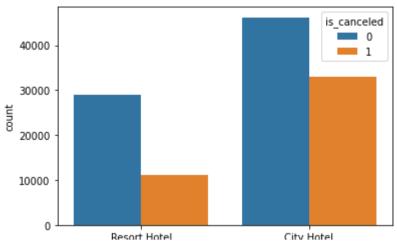




Double-click (or enter) to edit

sns.countplot(data=df,x='hotel',hue='is\_canceled')

<matplotlib.axes.\_subplots.AxesSubplot at 0x7fe70decb050>



# → Data Preparation

## ▼ Missing Data

```
df.isnull().values.any()
```

True

df.isnull().sum()

hotel	0
is_canceled	0
<pre>lead_time</pre>	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
                                        0
adults
children
                                        4
babies
                                        0
meal
                                        0
country
                                      488
market segment
                                        0
distribution channel
                                        0
is_repeated_guest
previous cancellations
previous bookings not canceled
reserved_room_type
                                        0
assigned room type
                                        0
booking changes
                                        0
deposit type
                                        0
agent
                                   16340
                                   112593
company
days_in_waiting_list
                                        0
customer type
                                        0
adr
                                        0
required_car_parking_spaces
total_of_special_requests
reservation status
                                        0
reservation status date
dtype: int64
```

#### df.fillna(0,inplace=True)

#### df.isnull().sum()

hotel	0
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
                                        0
     adults
     children
     babies
     meal
     country
     market segment
     distribution channel
     is repeated guest
                                        0
     previous cancellations
     previous bookings not canceled
                                        0
     reserved room type
     assigned room type
     booking changes
     deposit type
     agent
     company
     days in waiting list
     customer type
     adr
     required car parking spaces
     total of special requests
     reservation status
     reservation status date
     dtype: int64
df["meal"].replace("Undefined", "SC", inplace=True)
Double-click (or enter) to edit
df["meal"].unique()
     array(['BB', 'FB', 'HB', 'SC'], dtype=object)
Subset=df[(df['children']==0) & (df['adults']==0) & (df['babies']==0)]
```

### Double-click (or enter) to edit

Subset[['adults','babies','children']]

	adults	babies	children
2224	0	0	0.0
2409	0	0	0.0
3181	0	0	0.0
3684	0	0	0.0
3708	0	0	0.0
115029	0	0	0.0
115091	0	0	0.0
116251	0	0	0.0
116534	0	0	0.0
117087	0	0	0.0

180 rows × 3 columns

Double-click (or enter) to edit

type(Subset)

pandas.core.frame.DataFrame

Delete=(df['children']==0) & (df['adults']==0) & (df['babies']==0)

```
Double-click (or enter) to edit
```

```
type(Delete)
```

pandas.core.series.Series

Double-click (or enter) to edit

#### Delete

```
False
0
          False
1
2
          False
          False
          False
          . . .
119385
          False
119386
          False
119387
          False
119388
          False
119389
          False
Length: 119390, dtype: bool
```

data=df[~Delete]

Double-click (or enter) to edit

data.head()

	hotel	is_canceled	<pre>lead_time</pre>	arrival_date_year	arrival_date_month	arrival_date_week_number	arrival_date_day_of_month s
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

Subset=data[(data['children']==0) & (data['adults']==0) & (data['babies']==0)]

Double-click (or enter) to edit

Subset

hotel is\_canceled lead\_time arrival\_date\_year arrival\_date\_month arrival\_date\_week\_number arrival\_date\_day\_of\_month st

data.shape

(119210, 32)

Double-click (or enter) to edit

119390-119210

180

Double-click (or enter) to edit

```
data.to_csv('Updataed_Hotel_Booking.csv', index=False)
```

## → Home country of Guests

```
guest_country=data[data['is_canceled']==0 ]['country'].value_counts().reset_index()
guest_country.columns=['country','Number of guests']
```

Double-click (or enter) to edit

guest\_country

	(	country Numb	per of guests				
	0	PRT	20977				
	1	GBR	9668				
	2	FRA	8468				
impor	t plot	ly.offline as ly.graph_objs ly.express as	s as go				
Doub	le-click	(or enter) to	edit				
	104	טטו	1				
<pre>total_guests = guest_country["Number of guests"].sum() print(total_guests)</pre>							
	75011						
Doub	le-click	(or enter) to	edit				

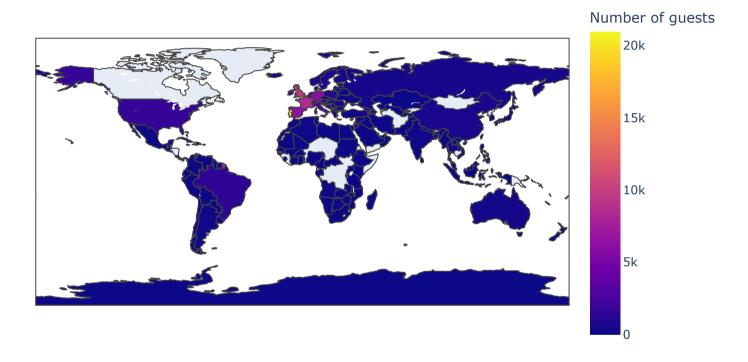
```
guest_country["Guests in %"] = round(guest_country["Number of guests"] / total_guests * 100, 2)
guest_country
```

		country	Number of guests	Guests in %			
	0	PRT	20977	27.97			
	1	GBR	9668	12.89			
	2	FRA	8468	11.29			
	3	ESP	6383	8.51			
	4	DEU	6067	8.09			
Doub	le-cli	ck (or ente	er) to edit				
	162	DJI	1	0.00			
<pre>y=guest_country['Number of guests'],     marker=dict(color='#CD7F32') ) data1 = [ trace] layout = go.Layout(     title='Guests by Country' ) fig = go.Figure(data=data1, layout=layout) pyo.plot(fig)     'temp-plot.html'</pre>							
Double-click (or enter) to edit							
map_g	uest	= px.chor	opleth(guest_count locations=guest_c color=guest_count hover_name=guest_	country['country['country['Number o			

```
title="Home country of guests")
```

map\_guest.show()

## Home country of guests



## Misinterpreting Data

```
resort = data[(data["hotel"] == "Resort Hotel") & (data["is_canceled"] == 0)]
city = data[(data["hotel"] == "City Hotel") & (data["is_canceled"] == 0)]
```

Double-click (or enter) to edit

resort

	hote	l is_canceled	lead_time	arrival_date_year	arrival_date_month	arrival_date_week_number	arrival_date_day_of_mont
(	Reso	rt . 0	342	2015	Julv	27	
resent hetel-resent grouphy(['arrival date menth'])['adr'] mean() reset index()							

resort\_hotel=resort.groupby(['arrival\_date\_month'])['adr'].mean().reset\_index()
resort\_hotel

	arrival_date_month	adr
0	April	75.867816
1	August	181.205892
2	December	68.410104
3	February	54.147478
4	January	48.761125
5	July	150.122528
6	June	107.974850
7	March	57.056838
8	May	76.657558
9	November	48.706289
10	October	61.775449
11	September	96.416860

city\_hotel=city.groupby(['arrival\_date\_month'])['adr'].mean().reset\_index()
city\_hotel

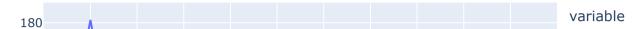
	arrival_date_month	adr
0	April	111.962267
1	August	118.674598
2	December	88.401855
3	February	86.520062
4	January	82.330983
5	July	115.818019
6	June	117.874360
7	March	90.658533
8	May	120.669827
9	November	86.946592

final=resort\_hotel.merge(city\_hotel,on='arrival\_date\_month')
final.columns=['month','price\_for\_resort','price\_for\_city\_hotel']
final

	month	<pre>price_for_resort</pre>	<pre>price_for_city_hotel</pre>
0	April	75.867816	111.962267
1	August	181.205892	118.674598
2	December	68.410104	88.401855

## ▼ Room price per night over the months

### Room price per night over the Months



▼ Guests Pay For A Room Per Night

```
df['reserved_room_type'].unique()
    array(['C', 'A', 'D', 'E', 'G', 'F', 'H', 'L', 'P', 'B'], dtype=object)
```

▼ Plotting the graph

```
data["adr_Updated"]=data["adr"]/(data["adults"]+data["children"])
data
```

/usr/local/lib/python3.7/dist-packages/ipykernel\_launcher.py:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame. Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: <a href="https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-ve">https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-ve</a>

	hotel	is_canceled	lead_time	arrival_date_year	arrival_date_month	arrival_date_week_number	arrival_date_day_of_mon
0	Resort Hotel	0	342	2015	July	27	
1	Resort Hotel	0	737	2015	July	27	
2	Resort Hotel	0	7	2015	July	27	
3	Resort Hotel	0	13	2015	July	27	
4	Resort Hotel	0	14	2015	July	27	
119385	City Hotel	0	23	2017	August	35	
	Citv						

```
)
plt.title("Price of room types per night and person", fontsize=16)
plt.xlabel("Room type", fontsize=16)
plt.ylabel("Price [EUR]", fontsize=16)

plt.ylim(0, 160)
plt.show()
```

/usr/local/lib/python3.7/dist-packages/ipykernel\_launcher.py:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame. Try using .loc[row\_indexer,col\_indexer] = value instead

prices\_C=prices[prices['reserved\_room\_type']=='C']
prices\_C

	hotel	reserved_room_type	adr_Updated
119278	City Hotel	С	104.000000
99432	City Hotel	С	65.000000
99431	City Hotel	С	65.000000
101137	City Hotel	С	55.000000
0	Resort Hotel	С	0.000000
27668	Resort Hotel	С	88.500000
39525	Resort Hotel	С	87.500000
15642	Resort Hotel	С	62.500000
15609	Resort Hotel	С	40.500000
38758	Resort Hotel	С	80.666667
623 rows	× 3 columns		

prices\_City=prices\_C[prices\_C['hotel']=='City Hotel']
prices\_Resort=prices\_C[prices\_C['hotel']=='Resort Hotel']
prices\_Resort

		hotel	reserved_room_type	adr_Updated
	0	Resort Hotel	С	0.000000
	34951	Resort Hotel	С	30.250000
	15955	Resort Hotel	С	47.366667
	25990	Resort Hotel	С	62.166667
	15960	Resort Hotel	С	90.000000
	27668	Resort Hotel	С	88.500000
	39525	Resort Hotel	С	87.500000
	15642	Resort Hotel	С	62.500000
	15609	Resort Hotel	С	40.500000
	38758	Resort Hotel	С	80.666667
6	315 rows	s × 3 columns		
prices	_City			

#### hotel reserved\_room\_type adr\_Updated

prices\_Resort.describe()

	adr_Updated
count	615.000000
mean	50.549085
std	27.821397
min	0.000000
25%	31.000000
50%	49.000000
75%	65.562500
max	171.000000

### 

```
df3=data[data['is_canceled']==0]
df3["total_nights"] = df3["stays_in_weekend_nights"] + df3["stays_in_week_nights"]
      /usr/local/lib/python3.7/dist-packages/ipykernel_launcher.py:2: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
      Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: <a href="https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-ve">https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-ve</a>
```

	hotel	is_canceled	lead_time	arrival_date_year	arrival_date_month	arrival_date_week_number	arrival_date_day_of_mon
0	Resort Hotel	0	342	2015	July	27	
1	Resort Hotel	0	737	2015	July	27	
2	Resort Hotel	0	7	2015	July	27	
3	Resort Hotel	0	13	2015	July	27	
4	Resort Hotel	0	14	2015	July	27	
119385	City Hotel	0	23	2017	August	35	
119386	City Hotel	0	102	2017	August	35	
119387	City Hotel	0	34	2017	August	35	
119388	City Hotel	0	109	2017	August	35	
119389	City Hotel	0	205	2017	August	35	
75011 rov	vs × 34 co	olumns					

df4=df3[['total\_nights','hotel','is\_canceled']]
df4

	total_nights	hotel	is_canceled
0	0	Resort Hotel	0
1	0	Resort Hotel	0
2	1	Resort Hotel	0
3	1	Resort Hotel	0
4	2	Resort Hotel	0
•••			
119385	7	City Hotel	0
119386	7	City Hotel	0
119387	7	City Hotel	0
119388	7	City Hotel	0
119389	9	City Hotel	0

75011 rows × 3 columns

hotel\_stay=df4.groupby(['total\_nights','hotel']).agg('count').reset\_index()
hotel\_stay

	total_nights	hotel	is_canceled
0	0	City Hotel	251
1	0	Resort Hotel	371
2	1	City Hotel	9155
3	1	Resort Hotel	6579
4	2	City Hotel	10983
57	46	Resort Hotel	1
58	48	City Hotel	1

hotel\_stay=hotel\_stay.rename(columns={'is\_canceled':'Number of stays'})
hotel\_stay.head()

	total_nights	hotel	Number of stays
0	0	City Hotel	251
1	0	Resort Hotel	371
2	1	City Hotel	9155
3	1	Resort Hotel	6579
4	2	City Hotel	10983

hotel\_stay\_r=hotel\_stay[hotel\_stay['hotel']=='Resort Hotel']
hotel\_stay\_r

	total_nights	hotel	Number of stays
1	0	Resort Hotel	371
3	1	Resort Hotel	6579
5	2	Resort Hotel	4488
7	3	Resort Hotel	3828
9	4	Resort Hotel	3321
11	5	Resort Hotel	1899
13	6	Resort Hotel	1205
15	7	Resort Hotel	4434
17	8	Resort Hotel	509
19	9	Resort Hotel	408
21	10	Resort Hotel	699
23	11	Resort Hotel	240
25	12	Resort Hotel	89
27	13	Resort Hotel	75
29	14	Resort Hotel	630
31	15	Resort Hotel	23
33	16	Resort Hotel	12
35	17	Resort Hotel	11
37	18	Resort Hotel	5
39	19	Resort Hotel	4
42	21	Resort Hotel	35
44	22	Resort Hotel	7

46	23	Resort Hotel	1
48	25	Resort Hotel	14
49	28	Resort Hotel	22
50	29	Resort Hotel	2
51	30	Resort Hotel	2
53	35	Resort Hotel	5
F.4	00	Dagamt Hatal	4

hotel\_stay\_c=hotel\_stay[hotel\_stay['hotel']=='City Hotel']
hotel\_stay\_c

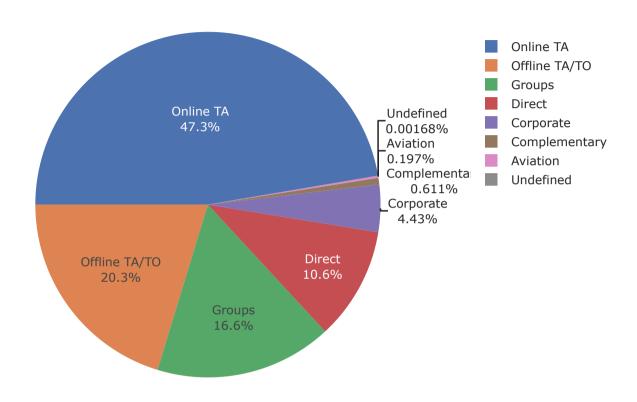
	total_nights	hotel	Number of stays		
0	0	City Hotel	251		
2	1	City Hotel	9155		
4	2	City Hotel	10983		
6	3	City Hotel	11889		
8	4	City Hotel	7694		
10	5	City Hotel	3210		
12	6	City Hotel	1111		
14	7	City Hotel	1245		
16	8	City Hotel	205		
18	9	City Hotel	119		
20	10	City Hotel	80		
22	11	City Hotel	33		
24	12	City Hotel	33		
00	40	O:T-11-T-1	4.5		
<pre>trace = go.Bar(     x=hotel_stay_r["total_nights"],     y=hotel_stay_r["Number of stays"],     name='Resort Stay'     ) trace1=go.Bar(</pre>					
<pre>x=hotel_stay_c["total_nights"], y=hotel_stay_c["Number of stays"], name='City stay' )</pre>					

```
data5 = [trace,trace1]
layout = go.Layout(
    title='Total Number of stays by Guest'
)
fig = go.Figure(data=data5, layout=layout)
pyo.plot(fig)
    'temp-plot.html'
```

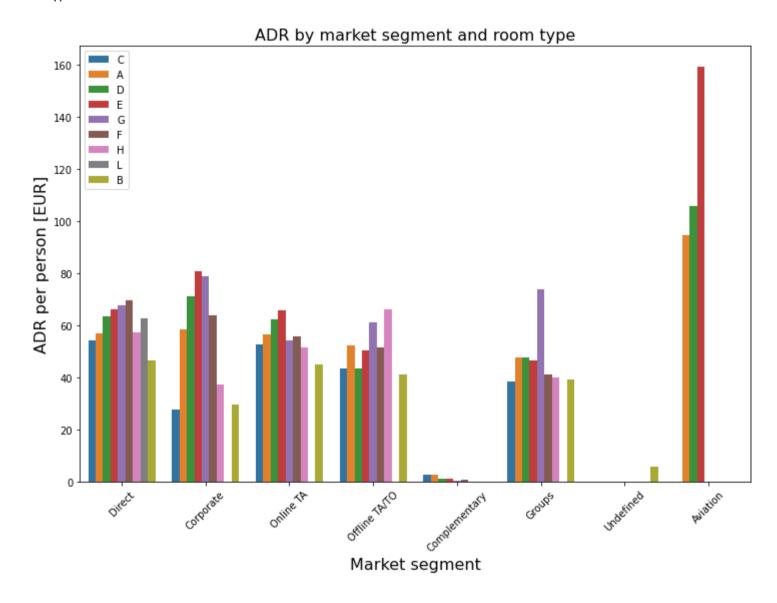
### ▼ Bookings by market segment

```
segments=data["market segment"].value counts()
segments
     Online TA
                      56408
     Offline TA/TO
                      24182
     Groups
                      19791
     Direct
                      12582
     Corporate
                       5282
     Complementary
                        728
     Aviation
                        235
     Undefined
                          2
     Name: market segment, dtype: int64
segments=data["market segment"].value counts()
# pie plot
fig = px.pie(segments,
             values=segments.values,
             names=segments.index,
             title="Bookings per market segment",
             template="seaborn")
fig.update_traces(rotation=-90, textinfo="percent+label")
fig.show()
```

## Bookings per market segment



```
plt.xticks(rotation=45)
plt.ylabel("ADR per person [EUR]", fontsize=16)
plt.legend(loc="upper left")
plt.show()
```



## ▼ Number of bookings get canceled

```
Cancel=data['is canceled']==1
cancel=Cancel.sum()
resort cancelation = data.loc[data["hotel"] == "Resort Hotel"]["is canceled"].sum()
city cancelation = data.loc[data["hotel"] == "City Hotel"]["is canceled"].sum()
resort cancelation
     11120
city cancelation
     33079
print(f"Total Booking Cancelled : {cancel} . ")
print(f"Total Resort Hotel Booking Cancelled : {resort cancelation} . ")
print(f"Total City Hotel Booking Cancelled : {city cancelation} . ")
     Total Booking Cancelled: 44199.
     Total Resort Hotel Booking Cancelled: 11120.
     Total City Hotel Booking Cancelled: 33079.
```

Month having the highest number of cancelations

```
res_book_per_month = data.loc[(data["hotel"] == "Resort Hotel")].groupby("arrival_date_month")["hotel"].count()
res_cancel_per_month = data.loc[(data["hotel"] == "Resort Hotel")].groupby("arrival_date_month")["is_canceled"].sum()
cty_book_per_month = data.loc[(data["hotel"] == "City Hotel")].groupby("arrival_date_month")["hotel"].count()
cty_cancel_per_month = data.loc[(data["hotel"] == "City Hotel")].groupby("arrival_date_month")["is_canceled"].sum()
```

#### res\_cancel\_data

	Hotel	Month	Bookings	Cancelations
0	Resort Hotel	April	3609	1059
1	Resort Hotel	August	4894	1637
2	Resort Hotel	December	2645	631
3	Resort Hotel	February	3102	794
4	Resort Hotel	January	2191	325
5	Resort Hotel	July	4573	1436
6	Resort Hotel	June	3044	1007
7	Resort Hotel	March	3334	763
8	Resort Hotel	May	3559	1024
9	Resort Hotel	November	2435	460
10	Resort Hotel	October	3553	978
11	Resort Hotel	September	3108	1006

```
plt.figure(figsize=(12, 8))
trace = go.Bar(
    x=res_cancel_data["Month"],
   y=res_cancel_data["Cancelations"],
    name="Rst Cancelled"
trace1 = go.Bar(
   x=cty cancel data["Month"],
   y=cty_cancel_data["Cancelations"],
    name="Cty Cancelled"
data6 = [trace,trace1]
layout = go.Layout(
    title='Total Number of stays by Guest'
fig = go.Figure(data=data6, layout=layout)
pyo.plot(fig)
     'temp-plot.html'
     <Figure size 864x576 with 0 Axes>
```

Colab paid products - Cancel contracts here

