AtliQ Hotels Data Analysis Project

```
In [1]: import pandas as pd
import numpy as np
from matplotlib import pyplot as plt
import seaborn as sns
```

Data Analytics Project Steps

- 1. Understanding the business Problem
- 2. Data Collection and Understanding
- 3. Data cleaning and Exploration
- 4. Data Transformation
- 5. Collect Insights

==> 1. Data Import and Extraction

Datasets

We have 5 CSV files

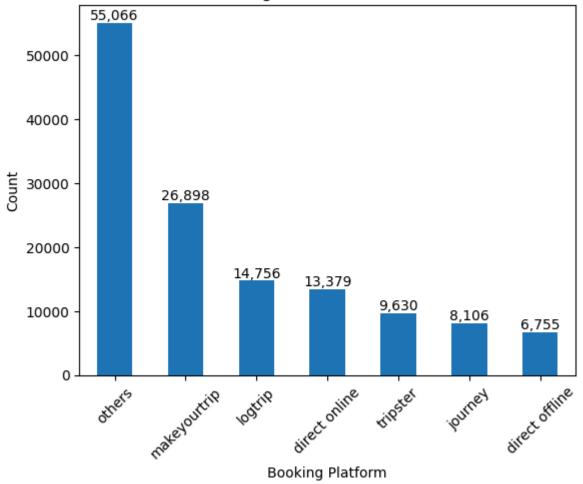
- dim date.csv
- dim hotels.csv
- dim_rooms.csv
- fact_aggregated_bookings
- fact_bookings.csv

Read bookings data in a dataframe

```
In [3]: df bookings.head(5)
                    booking_id property_id booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given b
                                             27-04-22
                                                                                                            direct online
          0 May012216558RT11
                                   16558
                                                           1/5/2022
                                                                        2/5/2022
                                                                                      -3.0
                                                                                                   RT1
                                                                                                                                1.0
          1 May012216558RT12
                                             30-04-22
                                                           1/5/2022
                                                                        2/5/2022
                                                                                      2.0
                                                                                                   RT1
                                   16558
                                                                                                                 others
                                                                                                                               NaN
          2 May012216558RT13
                                   16558
                                             28-04-22
                                                           1/5/2022
                                                                        4/5/2022
                                                                                      2.0
                                                                                                   RT1
                                                                                                                                5.0
                                                                                                                 logtrip
          3 May012216558RT14
                                             28-04-22
                                   16558
                                                           1/5/2022
                                                                        2/5/2022
                                                                                      -2.0
                                                                                                   RT1
                                                                                                                 others
                                                                                                                               NaN
          4 May012216558RT15
                                   16558
                                             27-04-22
                                                           1/5/2022
                                                                        2/5/2022
                                                                                      4.0
                                                                                                   RT1
                                                                                                             direct online
                                                                                                                                5.0
 In [4]: df bookings.shape
 Out[4]: (134590, 12)
 In [5]: df bookings.room category.unique()
 Out[5]: array(['RT1', 'RT2', 'RT3', 'RT4'], dtype=object)
 In [6]: df_bookings.booking_platform.unique()
 Out[6]: array(['direct online', 'others', 'logtrip', 'tripster', 'makeyourtrip',
                  'journey', 'direct offline'], dtype=object)
In [13]: room_category_count = df_bookings.room_category.value_counts()
          room_category_count
Out[13]: room_category
          RT2
                  49505
                  38446
          RT1
          RT3
                  30566
                  16073
          RT4
          Name: count, dtype: int64
```

```
In [14]: booking_platform_count = df_bookings.booking_platform.value_counts()
         booking_platform_count
Out[14]: booking_platform
         others
                           55066
         makeyourtrip
                         26898
         logtrip
                         14756
         direct online 13379
         tripster
                          9630
         journey
                           8106
         direct offline 6755
         Name: count, dtype: int64
In [15]: import matplotlib.pyplot as plt
         ax = df bookings.booking platform.value counts().sort values(ascending=False).plot(kind="bar")
         #Add data Labels
         for p in ax.patches:
             ax.annotate(f"{p.get_height():,.0f}",
                        (p.get_x() + p.get_width()/2, p.get_height()),
                        ha = 'center', va = 'bottom', fontsize = 10, color = 'black')
         plt.xticks(rotation= 45)
         plt.xlabel("Booking Platform")
         plt.ylabel("Count")
         plt.title("Booking Platform Distribution")
         plt.show()
```

Booking Platform Distribution



Booking Statistics

In [16]: df_bookings.describe()

Out[16]:		property_id	no_guests	ratings_given	revenue_generated	revenue_realized
	count	134590.000000	134587.000000	56683.000000	1.345900e+05	134590.000000

mean	18061.113493	2.036170	3.619004	1.537805e+04	12696.123256
std	1093.055847	1.034885	1.235009	9.303604e+04	6928.108124
min	16558.000000	-17.000000	1.000000	6.500000e+03	2600.000000
25%	17558.000000	1.000000	3.000000	9.900000e+03	7600.000000
50%	17564.000000	2.000000	4.000000	1.350000e+04	11700.000000
75%	18563.000000	2.000000	5.000000	1.800000e+04	15300.000000
max	19563.000000	6.000000	5.000000	2.856000e+07	45220.000000

In [18]: df_bookings.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 134590 entries, 0 to 134589
Data columns (total 12 columns):

Non-Null Count Column Dtype _____ booking_id 134590 non-null object property_id 134590 non-null int64 1 booking_date 134590 non-null object 134590 non-null object check_in_date checkout_date 134590 non-null object no_quests 134587 non-null float64 134590 non-null object room_category booking_platform 134590 non-null object 56683 non-null ratings_given float64 booking_status 134590 non-null object revenue_generated 134590 non-null int64 134590 non-null int64 11 revenue_realized

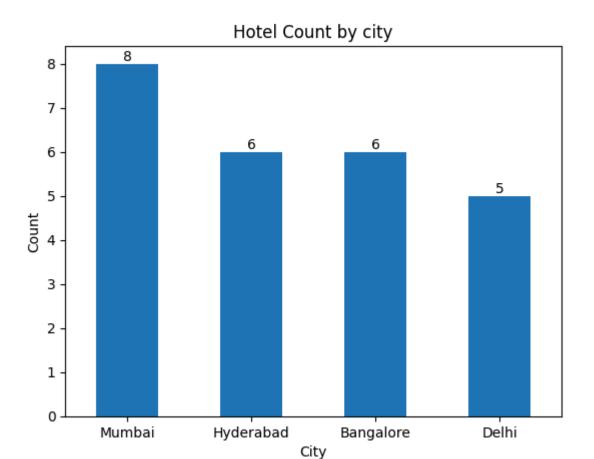
dtypes: float64(2), int64(3), object(7)

memory usage: 12.3+ MB

Read Hotels Data in Dataframe

```
In [21]: df_hotels = pd.read_csv(r"C:\Users\HP\Projects - Python\dim_hotels.csv")
         df hotels.head()
            property_id property_name category
                                                 city
                16558
                         Atliq Grands
          0
                                      Luxury
                                                Delhi
                16559
                         Atliq Exotica
                                      Luxury Mumbai
          2
                           Atliq City Business
                16560
                                                Delhi
                            Atliq Blu
                                      Luxury
          3
                16561
                                                Delhi
                           Atliq Bay
          4
                16562
                                                Delhi
                                      Luxury
In [24]: df_hotels.shape
Out[24]: (25, 4)
In [25]: df_hotels.category.unique()
Out[25]: array(['Luxury', 'Business'], dtype=object)
In [26]: df_hotels.city.unique()
Out [26]: array(['Delhi', 'Mumbai', 'Hyderabad', 'Bangalore'], dtype=object)
In [27]: df_hotels.category.value_counts()
Out[27]: category
          Luxury
                      16
                        9
          Business
          Name: count, dtype: int64
In [28]: df_hotels.city.value_counts()
Out[28]: city
                        8
          Mumbai
```

```
Hyderabad
         Bangalore 6
         Delhi
                5
         Name: count, dtype: int64
In [29]: import matplotlib.pyplot as plt
         #create the bar plot
         ax = df_hotels.city.value_counts().plot(kind= "bar")
         # Add data labels
         for p in ax.patches:
            ax.annotate(f"{p.get_height():,}",
                        (p.get_x() + p.get_width()/2, p.get_height()),
                        ha = "center", va = 'bottom', fontsize= 10, color='black')
         #Formatting
         plt.xticks(rotation = 0) # keep x-axis labels horizontal
         plt.xlabel("City")
         plt.ylabel("Count")
         plt.title("Hotel Count by city")
         plt.show()
```



```
In [31]: # Now convert labels as percentages
import matplotlib.pyplot as plt

#Calculate value counts and percentages
city_counts = df_hotels.city.value_counts()
total = city_counts.sum()
percentages = (city_counts/total) * 100 #convert to percentage

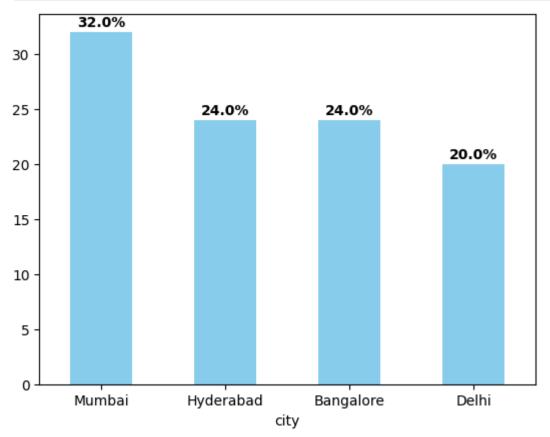
# Plot the bar chart
ax = percentages.plot(kind ="bar", color = "skyblue")

# Add percentages label to each bar
for i, v in enumerate(percentages):
```

```
plt.text(i, v + 0.5, f"{v:.1f}%", ha = "center", fontsize = 10, fontweight = 'bold')

# Rotate x-axis labels
plt.xticks(rotation = 0)

# show plot
plt.show()
```



Read aggregated_bookings data in dataframe

```
In [33]: fact_agg_bookings = pd.read_csv(r"C:\Users\HP\Projects - Python\fact_aggregated_bookings.csv")
    fact_agg_bookings.head(5)
```

```
property_id check_in_date room_category successful_bookings capacity
         0
                16559
                          1-May-22
                                           RT1
                                                              25
                                                                    30.0
                          1-May-22
                                                              28
         1
                19562
                                           RT1
                                                                    30.0
         2
                19563
                          1-May-22
                                           RT1
                                                              23
                                                                    30.0
         3
                          1-May-22
                                                                    19.0
                17558
                                           RT1
                                                              30
         4
                16558
                          1-May-22
                                           RT1
                                                                    19.0
                                                              18
In [34]: type(fact_agg_bookings)
Out[34]: pandas.core.frame.DataFrame
In [35]: # 1. Find out unique property ids in aggregated bookings datasets
         fact_agg_bookings.property_id.unique()
Out[35]: array([16559, 19562, 19563, 17558, 16558, 17560, 19558, 19560, 17561,
                 16560, 16561, 16562, 16563, 17559, 17562, 17563, 18558, 18559,
                 18561, 18562, 18563, 19559, 19561, 17564, 18560], dtype=int64)
In [36]: # 2. Find out total bookings per property_id
         fact_agg_bookings.groupby("property_id")["successful_bookings"].sum()
Out[36]: property_id
         16558
                   3153
         16559
                  7338
         16560
                  4693
         16561
                  4418
         16562
                   4820
         16563
                   7211
         17558
                   5053
         17559
                   6142
         17560
                   6013
         17561
                   5183
         17562
                   3424
```

```
17563
        6337
17564
        3982
18558
        4475
18559
        5256
18560
        6638
18561
        6458
18562
        7333
18563
        4737
19558
        4400
19559
        4729
19560
        6079
        5736
19561
19562
        5812
19563
        5413
Name: successful_bookings, dtype: int64
```

In [37]: # 3. Find out days on which bookings are greater than capacity

fact_agg_bookings[fact_agg_bookings.capacity == fact_agg_bookings.capacity.max()]

Out [37]:

	property_id	check_in_date	room_category	successful_bookings	capacity
27	17558	1-May-22	RT2	38	50.0
128	17558	2-May-22	RT2	27	50.0
229	17558	3-May-22	RT2	26	50.0
328	17558	4-May-22	RT2	27	50.0
428	17558	5-May-22	RT2	29	50.0
8728	17558	27-Jul-22	RT2	22	50.0
8828	17558	28-Jul-22	RT2	21	50.0
8928	17558	29-Jul-22	RT2	23	50.0

9028	17558	30-Jul-22	RT2	32	50.0
9128	17558	31-Jul-22	RT2	30	50.0

92 rows × 5 columns

==> 2. Data cleaning

In [38]: df_bookings.describe()

Out[38]:

	property_id	no_guests	ratings_given	revenue_generated	revenue_realized
count	134590.000000	134587.000000	56683.000000	1.345900e+05	134590.000000
mean	18061.113493	2.036170	3.619004	1.537805e+04	12696.123256
std	1093.055847	1.034885	1.235009	9.303604e+04	6928.108124
min	16558.000000	-17.000000	1.000000	6.500000e+03	2600.000000
25%	17558.000000	1.000000	3.000000	9.900000e+03	7600.000000
50%	17564.000000	2.000000	4.000000	1.350000e+04	11700.000000
75%	18563.000000	2.000000	5.000000	1.800000e+04	15300.000000
max	19563.000000	6.000000	5.000000	2.856000e+07	45220.000000

In [39]: df_bookings[df_bookings.no_guests<0]</pre>

Out[39]:

:		booking_id	property_id	booking_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_g
	0	May012216558RT11	16558	27-04-22	1/5/2022	2/5/2022	-3.0	RT1	direct online	
	3	May012216558RT14	16558	28-04-22	1/5/2022	2/5/2022	-2.0	RT1	others	1

17924	May122218559RT44	18559	12/5/2022	12/5/2022	14-05-22	-10.0	RT4	direct online	I
18020	May122218561RT22	18561	8/5/2022	12/5/2022	14-05-22	-12.0	RT2	makeyourtrip	I
18119	May122218562RT311	18562	5/5/2022	12/5/2022	17-05-22	-6.0	RT3	direct offline	
18121	May122218562RT313	18562	10/5/2022	12/5/2022	17-05-22	-4.0	RT3	direct online	I
56715	Jun082218562RT12	18562	5/6/2022	8/6/2022	13-06-22	-17.0	RT1	others	I
119765	Jul202219560RT220	19560	19-07-22	20-07-22	22-07-22	-1.0	RT2	others	I
134586	Jul312217564RT47	17564	30-07-22	31-07-22	1/8/2022	-4.0	RT4	logtrip	

In [40]: df_bookings.shape

Out[40]: (134590, 12)

In [41]: df_bookings = df_bookings[df_bookings.no_guests>0]
 df_bookings

Out[41]:

·	booking_id	property_id	booking_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_giv
1	May012216558RT12	16558	30-04-22	1/5/2022	2/5/2022	2.0	RT1	others	N
2	May012216558RT13	16558	28-04-22	1/5/2022	4/5/2022	2.0	RT1	logtrip	
4	May012216558RT15	16558	27-04-22	1/5/2022	2/5/2022	4.0	RT1	direct online	!
5	May012216558RT16	16558	1/5/2022	1/5/2022	3/5/2022	2.0	RT1	others	4
6	May012216558RT17	16558	28-04-22	1/5/2022	6/5/2022	2.0	RT1	others	N
134584	Jul312217564RT45	17564	30-07-22	31-07-22	1/8/2022	2.0	RT4	others	:
134585	Jul312217564RT46	17564	29-07-22	31-07-22	3/8/2022	1.0	RT4	makeyourtrip	:

	134587	Jul312217564RT48	17564	30-07-22	31-07-22	2/8/2022	1.0	RT4	tripster	N		
	134588	Jul312217564RT49	17564	29-07-22	31-07-22	1/8/2022	2.0	RT4	logtrip	:		
	134589	Jul312217564RT410	17564	31-07-22	31-07-22	1/8/2022	2.0	RT4	makeyourtrip	N		
	134578 r	ows × 12 columns										
In [42]:	df_book	sings.shape										
Out[42]:	(134578	f_bookings.shape 134578, 12)										
In [43]:	df_book	ings.revenue_genera	ted.min(),	df_bookings	revenue_gene	erated.max()						
Out[43]:	(6500,	28560000)										
In [44]:	avg, st	d = df_bookings.rev	enue_gener	ated.mean(),	df_bookings	revenue_gener	rated.std()					
Out[44]:	(15378	.036937686695, 93040	.154931464	11)								
In [45]:	higher_ higher_	_limit = avg + 3*std _limit										
Out[45]:	294498	.50173207896										
Tn [46].	lorror 1	imit - 200 - 3*ctd										

In [46]: lower_limit = avg - 3*std lower_limit

Out [46]: -263742.4278567056

In [47]: | df_bookings[df_bookings.revenue_generated<0]</pre>

Out[47]: booking_id property_id booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given booking_state.

In [58]: df_bookings[df_bookings.revenue_generated>higher_limit]

0 1	\bigcirc 7	

booking_platform	room_category	no_guests	checkout_date	check_in_date	booking_date	property_id	booking_id	•
logtrip	RT1	2.0	4/5/2022	1/5/2022	28-04-22	16558	May012216558RT13	2
direct online	RT3	6.0	2/5/2022	1/5/2022	29-04-22	16559	May012216559RT32	111
others	RT4	4.0	7/5/2022	1/5/2022	27-04-22	16559	May012216559RT41	137
tripster	RT4	6.0	2/5/2022	1/5/2022	1/5/2022	16559	May012216559RT43	139
logtrip	RT4	5.0	7/5/2022	1/5/2022	24-04-22	16559	May012216559RT413	149
others	RT4	6.0	1/8/2022	31-07-22	31-07-22	19560	Jul312219560RT412	134331
makeyourtrip	RT4	6.0	1/8/2022	31-07-22	28-07-22	19562	Jul312219562RT45	134467
makeyourtrip	RT4	5.0	6/8/2022	31-07-22	10/7/2022	19562	Jul312219562RT47	134469
direct offline	RT4	5.0	6/8/2022	31-07-22	25-07-22	19562	Jul312219562RT412	134474
makeyourtrip	RT4	4.0	1/8/2022	31-07-22	31-07-22	17564	Jul312217564RT42	134581
	logtrip direct online others tripster logtrip others makeyourtrip makeyourtrip direct offline	RT1 logtrip RT3 direct online RT4 others RT4 tripster RT4 logtrip RT4 others RT4 others RT4 makeyourtrip RT4 makeyourtrip RT4 direct offline	2.0 RT1 logtrip 6.0 RT3 direct online 4.0 RT4 others 6.0 RT4 tripster 5.0 RT4 logtrip 6.0 RT4 others 6.0 RT4 makeyourtrip 5.0 RT4 makeyourtrip 5.0 RT4 direct offline	4/5/2022 2.0 RT1 logtrip 2/5/2022 6.0 RT3 direct online 7/5/2022 4.0 RT4 others 2/5/2022 6.0 RT4 tripster 7/5/2022 5.0 RT4 logtrip 1/8/2022 6.0 RT4 others 1/8/2022 6.0 RT4 makeyourtrip 6/8/2022 5.0 RT4 makeyourtrip 6/8/2022 5.0 RT4 direct offline	1/5/2022 4/5/2022 2.0 RT1 logtrip 1/5/2022 2/5/2022 6.0 RT3 direct online 1/5/2022 7/5/2022 4.0 RT4 others 1/5/2022 2/5/2022 6.0 RT4 tripster 1/5/2022 7/5/2022 5.0 RT4 logtrip 31-07-22 1/8/2022 6.0 RT4 others 31-07-22 1/8/2022 6.0 RT4 makeyourtrip 31-07-22 6/8/2022 5.0 RT4 makeyourtrip 31-07-22 6/8/2022 5.0 RT4 direct offline	28-04-22 1/5/2022 4/5/2022 2.0 RT1 logtrip 29-04-22 1/5/2022 2/5/2022 6.0 RT3 direct online 27-04-22 1/5/2022 7/5/2022 4.0 RT4 others 1/5/2022 1/5/2022 2/5/2022 6.0 RT4 tripster 24-04-22 1/5/2022 7/5/2022 5.0 RT4 logtrip 31-07-22 31-07-22 1/8/2022 6.0 RT4 others 28-07-22 31-07-22 1/8/2022 6.0 RT4 makeyourtrip 10/7/2022 31-07-22 6/8/2022 5.0 RT4 makeyourtrip 25-07-22 31-07-22 6/8/2022 5.0 RT4 direct offline	16558 28-04-22 1/5/2022 4/5/2022 2.0 RT1 logtrip 16559 29-04-22 1/5/2022 2/5/2022 6.0 RT3 direct online 16559 27-04-22 1/5/2022 7/5/2022 4.0 RT4 others 16559 1/5/2022 1/5/2022 2/5/2022 6.0 RT4 tripster 16559 24-04-22 1/5/2022 7/5/2022 5.0 RT4 logtrip 19560 31-07-22 31-07-22 1/8/2022 6.0 RT4 others 19562 28-07-22 31-07-22 1/8/2022 6.0 RT4 makeyourtrip 19562 10/7/2022 31-07-22 6/8/2022 5.0 RT4 makeyourtrip 19562 25-07-22 31-07-22 6/8/2022 5.0 RT4 direct offline	May012216558RT13 16558 28-04-22 1/5/2022 4/5/2022 2.0 RT1 logtrip May012216559RT32 16559 29-04-22 1/5/2022 2/5/2022 6.0 RT3 direct online May012216559RT41 16559 27-04-22 1/5/2022 7/5/2022 4.0 RT4 others May012216559RT43 16559 1/5/2022 1/5/2022 2/5/2022 6.0 RT4 tripster May012216559RT413 16559 24-04-22 1/5/2022 7/5/2022 5.0 RT4 logtrip Jul312219560RT412 19560 31-07-22 31-07-22 1/8/2022 6.0 RT4 others Jul312219562RT45 19562 28-07-22 31-07-22 1/8/2022 6.0 RT4 makeyourtrip Jul312219562RT47 19562 25-07-22 31-07-22 6/8/2022 5.0 RT4 direct offline

901 rows × 12 columns

In [49]: df_bookings[df_bookings.revenue_generated < higher_limit]
 df_bookings</pre>

Out	[4	9]	:		
-----	---	---	---	---	---	--	--

:	booking_id	property_id	booking_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_giv
	1 May012216558RT12	16558	30-04-22	1/5/2022	2/5/2022	2.0	RT1	others	N
	2 May012216558RT13	16558	28-04-22	1/5/2022	4/5/2022	2.0	RT1	logtrip	Į.
	4 May012216558RT15	16558	27-04-22	1/5/2022	2/5/2022	4.0	RT1	direct online	!
	5 May012216558RT16	16558	1/5/2022	1/5/2022	3/5/2022	2.0	RT1	others	

N	others	RT1	2.0	6/5/2022	1/5/2022	28-04-22	16558	May012216558RT17	6
1	others	RT4	2.0	1/8/2022	31-07-22	30-07-22	17564	Jul312217564RT45	134584
:	makeyourtrip	RT4	1.0	3/8/2022	31-07-22	29-07-22	17564	Jul312217564RT46	134585
N	tripster	RT4	1.0	2/8/2022	31-07-22	30-07-22	17564	Jul312217564RT48	134587
:	logtrip	RT4	2.0	1/8/2022	31-07-22	29-07-22	17564	Jul312217564RT49	134588
N	makeyourtrip	RT4	2.0	1/8/2022	31-07-22	31-07-22	17564	Jul312217564RT410	134589

134578 rows × 12 columns

In [61]: df_bookings[df_bookings.revenue_generated>higher_limit]

```
In [54]: df_bookings.shape
Out[54]: (134578, 12)
In [59]: df_bookings.revenue_realized.describe()
Out[59]: count
                  134578.000000
                  12696.011822
         mean
                    6927.841641
         std
                    2600.000000
         min
         25%
                    7600.000000
                   11700.000000
         50%
         75%
                   15300.000000
                   45220.000000
         max
         Name: revenue_realized, dtype: float64
In [60]: higher_limit = df_bookings.revenue_realized.mean() + 3*df_bookings.revenue_realized.std()
         higher_limit
Out[60]: 33479.53674501214
```

ratings_giv	booking_platform	room_category	no_guests	checkout_date	check_in_date	booking_date	property_id	booking_id	
!	logtrip	RT1	2.0	4/5/2022	1/5/2022	28-04-22	16558	May012216558RT13	2
N	direct online	RT3	6.0	2/5/2022	1/5/2022	29-04-22	16559	May012216559RT32	111
N	others	RT4	4.0	7/5/2022	1/5/2022	27-04-22	16559	May012216559RT41	137
,	tripster	RT4	6.0	2/5/2022	1/5/2022	1/5/2022	16559	May012216559RT43	139
!	others	RT4	3.0	3/5/2022	1/5/2022	28-04-22	16559	May012216559RT47	143
:	others	RT4	6.0	1/8/2022	31-07-22	31-07-22	19560	Jul312219560RT412	134331
4	makeyourtrip	RT4	6.0	1/8/2022	31-07-22	28-07-22	19562	Jul312219562RT45	134467
N	makeyourtrip	RT4	5.0	6/8/2022	31-07-22	10/7/2022	19562	Jul312219562RT47	134469
	direct offline	RT4	5.0	6/8/2022	31-07-22	25-07-22	19562	Jul312219562RT412	134474
4	makeyourtrip	RT4	4.0	1/8/2022	31-07-22	31-07-22	17564	Jul312217564RT42	134581

1733 rows × 12 columns

In [63]: df_rooms = pd.read_csv(r"C:\Users\HP\Projects - Python\dim_rooms.csv")
 df_rooms

Out [63]: room id room class

	room_id	room_class
0	RT1	Standard
1	RT2	Elite
2	RT3	Premium
3	RT4	Presidential

```
In [64]: df bookings[df bookings.room category=="RT4"].revenue realized.describe()
Out[64]: count
                   16071.000000
                   23439.308444
          mean
                  9048.599076
          std
          min
                   7600.000000
          25%
                   19000.000000
          50%
                   26600.000000
          75%
                   32300.000000
                   45220.000000
          max
          Name: revenue_realized, dtype: float64
In [65]: df_bookings.isnull().sum()
Out[65]: booking_id
                                    0
          property_id
                                    0
          booking date
          check in date
                                    0
          checkout_date
                                    0
                                    0
          no_guests
          room_category
          booking_platform
                                    0
          ratings_given
                                77899
          booking_status
                                    0
          revenue generated
                                    0
          revenue_realized
                                    0
          dtype: int64
         *Total values in our dataframe is 134576. Out of that 77899 rows has null rating. Since there are many rows with null rating, we should not
         filter these values. Also we should not replace this rating with a median or mean rating etc**
In [66]: # In aggregate bookings find columns that have null values. Fill these null values with whatever you think is the
          # appropriate substitute (possible ways is to use mean or median)
```

fact_agg_bookings.isnull().sum()

```
Out[66]: property_id
          check in date
                                  0
          room_category
          successful bookings
                                  0
          capacity
                                  2
          dtype: int64
In [68]: fact agg bookings[fact agg bookings.capacity.isna()]
             property id check in date room category successful bookings capacity
                            1-May-22
           8
                 17561
                                              RT1
                                                                 22
                                                                        NaN
          14
                 17562
                                              RT1
                                                                 12
                            1-May-22
                                                                        NaN
In [69]: fact_agg_bookings.capacity.median()
Out[69]: 25.0
In [70]: fact_agg_bookings.capacity.fillna(fact_agg_bookings.capacity.median(), inplace=True)
In [71]: fact_agg_bookings.loc[[8,15]]
             property id check in date room category successful bookings capacity
           8
                 17561
                            1-May-22
                                              RT1
                                                                 22
                                                                        25.0
                            1-May-22
          15
                 17563
                                              RT1
                                                                 21
                                                                        25.0
In [72]: # In aggregate bookings find out records that have successful_bookings value greater than capacity. Filter those red
         fact_agg_bookings[fact_agg_bookings.successful_bookings > fact_agg_bookings.capacity]
               property id check in date room category successful bookings capacity
                   17558
                              1-May-22
                                                RT1
                                                                          19.0
             3
                                                                   30
```

12	16563	1-May-22	RT1	100	41.0
4136	19558	11-Jun-22	RT2	50	39.0
6209	19560	2-Jul-22	RT1	123	26.0
8522	19559	25-Jul-22	RT1	35	24.0
9194	18563	31-Jul-22	RT4	20	18.0

In [73]: fact_agg_bookings.shape

Out[73]: (9200, 5)

In [77]: fact_agg_bookings = fact_agg_bookings[fact_agg_bookings.successful_bookings<=fact_agg_bookings.capacity]
fact_agg_bookings.shape</pre>

Out[77]: (9194, 5)

==> 3. Data Transformation

In [83]: fact_agg_bookings.head()

Out[83]:		property_id	check_in_date	room_category	successful_bookings	capacity	occ_pct
	0	16559	1-May-22	RT1	25	30.0	83.33
	1	19562	1-May-22	RT1	28	30.0	93.33
	2	19563	1-May-22	RT1	23	30.0	76.67
	4	16558	1-May-22	RT1	18	19.0	94.74
	5	17560	1-May-22	RT1	28	40.0	70.00

```
fact_agg_bookings["occ_pct"] = fact_agg_bookings["successful_bookings"]/fact_agg_bookings["capacity"]
          fact agg bookings.head()
Out[84]:
             property id check in date room category successful bookings capacity
                                                                                occ pct
          0
                 16559
                            1-May-22
                                              RT1
                                                                          30.0 0.833333
                                                                  25
          1
                 19562
                            1-May-22
                                              RT1
                                                                   28
                                                                          30.0 0.933333
          2
                            1-May-22
                 19563
                                              RT1
                                                                  23
                                                                          30.0 0.766667
                            1-May-22
                                                                          19.0 0.947368
          4
                 16558
                                              RT1
                                                                   18
          5
                 17560
                                              RT1
                                                                  28
                                                                         40.0 0.700000
                            1-May-22
In [85]: fact_agg_bookings["occ_pct"] = fact_agg_bookings["occ_pct"].apply(lambda x:round(x*100, 2))
          fact_agg_bookings.head()
             property id check in date room category successful bookings capacity occ pct
          0
                 16559
                            1-May-22
                                              RT1
                                                                  25
                                                                         30.0
                                                                                 83.33
          1
                 19562
                            1-May-22
                                               RT1
                                                                   28
                                                                          30.0
                                                                                 93.33
          2
                 19563
                                              RT1
                                                                  23
                                                                         30.0
                                                                                 76.67
                            1-May-22
          4
                 16558
                            1-May-22
                                              RT1
                                                                          19.0
                                                                                 94.74
                                                                   18
          5
                                              RT1
                 17560
                            1-May-22
                                                                  28
                                                                         40.0
                                                                                70.00
         df_bookings.head()
                     booking id property id booking date check in date checkout date no guests room category booking platform ratings given b
                                                                                         2.0
                                                                                                      RT1
          1 May012216558RT12
                                              30-04-22
                                                            1/5/2022
                                                                          2/5/2022
                                    16558
                                                                                                                    others
                                                                                                                                   NaN
```

2 May012216558RT13	16558	28-04-22	1/5/2022	4/5/2022	2.0	RT1	logtrip	5.0
4 May012216558RT15	16558	27-04-22	1/5/2022	2/5/2022	4.0	RT1	direct online	5.0
5 May012216558RT16	16558	1/5/2022	1/5/2022	3/5/2022	2.0	RT1	others	4.0
6 May012216558RT17	16558	28-04-22	1/5/2022	6/5/2022	2.0	RT1	others	NaN

Index: 9194 entries, 0 to 9199
Data columns (total 6 columns):

#	Column	Non-Null Count	Dtype
0	property_id	9194 non-null	int64
1	check_in_date	9194 non-null	object
2	room_category	9194 non-null	object
3	successful_bookings	9194 non-null	int64
4	capacity	9194 non-null	float64
5	occ_pct	9194 non-null	float64
dt vn	es: $float64(2)$ int64	(2) object (2)	

dtypes: float64(2), int64(2), object(2)

memory usage: 502.8+ KB

There are various types of data transformations that you may have to perform based on the need. Few examples of data transformations are,

- 1. Creating new columns
- 2. Normalization
- 3. Merging data
- 4. Aggregation

==> 4. Insights Generation

1. What is an average occupancy rate in each of the room categories?

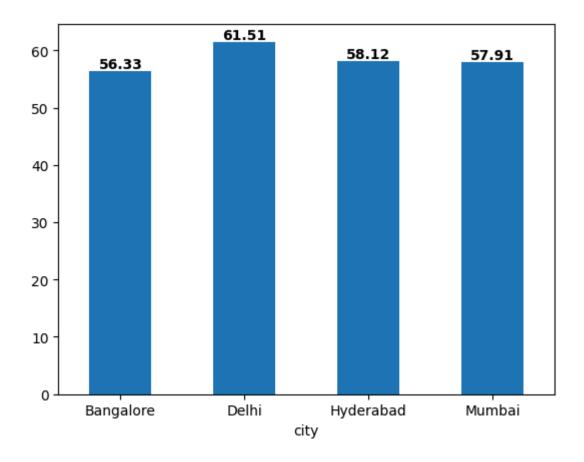
```
In [88]: fact_agg_bookings.groupby("room_category")["occ_pct"].mean()
Out[88]: room_category
          RT1
                  57.889643
          RT2
                  58.009756
          RT3
                  58.028213
          RT4
                  59.277925
          Name: occ_pct, dtype: float64
In [89]: df rooms
            room_id room_class
                RT1
          0
                       Standard
          1
                RT2
                           Elite
          2
                RT3
                       Premium
                RT4 Presidential
In [90]: df = pd.merge(fact_agg_bookings, df_rooms, left_on="room_category", right_on= "room_id")
         df.head()
Out[90]:
            property id check in date room category successful bookings capacity occ pct room id room class
          0
                 16559
                           1-May-22
                                             RT1
                                                                 25
                                                                        30.0
                                                                               83.33
                                                                                        RT1
                                                                                               Standard
                 19562
                           1-May-22
                                                                 28
                                                                        30.0
                                                                               93.33
                                                                                        RT1
                                                                                               Standard
          1
                                              RT1
          2
                                             RT1
                                                                               76.67
                                                                                        RT1
                 19563
                           1-May-22
                                                                 23
                                                                        30.0
                                                                                               Standard
                 16558
                           1-May-22
                                             RT1
                                                                        19.0
                                                                               94.74
                                                                                        RT1
                                                                                               Standard
          3
                                                                 18
          4
                 17560
                           1-May-22
                                             RT1
                                                                 28
                                                                        40.0
                                                                               70.00
                                                                                        RT1
                                                                                               Standard
In [93]: df.groupby("room_class")["occ_pct"].mean().round(2)
```

```
Out[93]: room_class
          Elite
                            58.01
          Premium
                           58.03
          Presidential
                           59.28
                           57.89
          Standard
          Name: occ_pct, dtype: float64
In [94]: df.drop("room_id", axis = 1, inplace= True)
          df.head(5)
Out[94]:
             property_id check_in_date room_category successful_bookings capacity occ_pct room_class
                 16559
                            1-May-22
                                                                  25
                                                                         30.0
                                                                                83.33
          0
                                              RT1
                                                                                        Standard
          1
                 19562
                            1-May-22
                                              RT1
                                                                  28
                                                                         30.0
                                                                                93.33
                                                                                        Standard
                 19563
                            1-May-22
                                              RT1
                                                                                76.67
          2
                                                                  23
                                                                         30.0
                                                                                        Standard
                                                                         19.0
                                                                                94.74
          3
                 16558
                            1-May-22
                                              RT1
                                                                  18
                                                                                        Standard
                            1-May-22
          4
                 17560
                                              RT1
                                                                  28
                                                                         40.0
                                                                                70.00
                                                                                        Standard
```

2. Print average occupancy rate per city

```
In [95]: df_hotels.head(4)
Out[95]:
             property_id property_name
                                        category
                                                      city
           0
                  16558
                           Atliq Grands
                                          Luxury
                                                    Delhi
                  16559
                           Atliq Exotica
                                          Luxury Mumbai
          1
                  16560
                              Atliq City Business
           2
                                                    Delhi
           3
                  16561
                               Atliq Blu
                                          Luxury
                                                    Delhi
```

```
In [97]: df = pd.merge(df, df_hotels, on = "property_id")
         df.head()
            property id check in date room category successful bookings capacity occ pct room class property name category
                                                                                                                           city
                16559
                           1-May-22
                                             RT1
                                                                 25
                                                                        30.0
                                                                               83.33
                                                                                                               Luxury Mumbai
          0
                                                                                                  Atliq Exotica
                                                                                       Standard
          1
                16559
                           2-May-22
                                             RT1
                                                                 20
                                                                        30.0
                                                                               66.67
                                                                                       Standard
                                                                                                  Atliq Exotica
                                                                                                                Luxury Mumbai
          2
                           3-May-22
                                                                               56.67
                                                                                       Standard
                                                                                                  Atliq Exotica
                                                                                                                Luxury Mumbai
                 16559
                                              RT1
                                                                 17
                                                                        30.0
                16559
                           4-May-22
                                                                        30.0
                                                                               70.00
                                                                                       Standard
                                                                                                                Luxury Mumbai
                                                                                                  Atliq Exotica
          3
                                              RT1
                                                                 21
          4
                16559
                                             RT1
                                                                               53.33
                           5-May-22
                                                                 16
                                                                        30.0
                                                                                       Standard
                                                                                                  Atliq Exotica
                                                                                                                Luxury Mumbai
In [98]: import matplotlib .pyplot as plt
          # Grouping and plotting
         ax = df.groupby("city")["occ_pct"].mean().round(2).plot(kind="bar")
          # Adding data Labels
         for p in ax.patches:
              ax.annotate(f'{p.get_height()}',
                           (p.get_x() + p.get_width() / 2, p.get_height()),
                          ha = 'center', va = 'bottom', fontsize = 10, fontweight = 'bold')
          # Rotating x-axis labels
         plt.xticks(rotation = 0)
          #show plot
         plt.show()
```



3. When was the occupancy better? Weekday or Weekend?

\bigcirc	Γ	1	\cap	1	
Jul	L	_	U	\perp	

day_type	week no	mmm yy	date	
weekend	W 19	May 22	01-May-22	0
weekeday	W 19	May 22	02-May-22	1
weekeday	W 19	May 22	03-May-22	2

```
3 04-May-22 May 22
                                   W 19 weekeday
          4 05-May-22
                        May 22
                                   W 19 weekeday
          df = pd.merge(df, df_date, left_on= "check_in_date", right_on="date")
          df.head(3)
             property id check in date room category successful bookings capacity occ pct room class property name category
                                                                                                                                date
                                                                                                                                 10-
                 16559
                           10-May-22
                                              RT1
                                                                         30.0
                                                                                60.00
          0
                                                                  18
                                                                                        Standard
                                                                                                   Atliq Exotica
                                                                                                                Luxury Mumbai May-
                                                                                                                                  22
                                                                                                                                 10-
          1
                           10-May-22
                                              RT2
                                                                  25
                                                                         41.0
                                                                                60.98
                                                                                                   Atliq Exotica
                                                                                                                Luxury Mumbai
                                                                                                                                May-
                 16559
                                                                                            Elite
                                                                                                                                  22
                                                                                                                                 10-
          2
                 16559
                           10-May-22
                                              RT3
                                                                  20
                                                                         32.0
                                                                                62.50
                                                                                        Premium
                                                                                                   Atliq Exotica
                                                                                                                Luxury Mumbai May-
                                                                                                                                  22
In [104... df.groupby("day_type")["occ_pct"].mean().round(2)
Out[104... day_type
                        50.88
           weekeday
                        72.34
           weekend
          Name: occ_pct, dtype: float64
          df["mmm yy"].unique()
Out[105... array(['May 22', 'Jun 22', 'Jul 22'], dtype=object)
```

4. In the month of June, What is the occupancy for different cities

In [107	_	ne_22 = df ne_22.head	[df["mmm yy" 1(3)]=="Jun 22"]								
Out[107		property_id	check_in_date	room_category	successful_bookings	capacity	occ_pct	room_class	property_name	category	city	date
	2200	16559	10-Jun-22	RT1	20	30.0	66.67	Standard	Atliq Exotica	Luxury	Mumbai	10- Jun- 22
	2201	16559	10-Jun-22	RT2	26	41.0	63.41	Elite	Atliq Exotica	Luxury	Mumbai	10- Jun- 22
	2202	16559	10-Jun-22	RT3	20	32.0	62.50	Premium	Atliq Exotica	Luxury	Mumbai	10- Jun- 22
In [109	df_jur	ne_22.grou	upby("city")["occ_pct"].me	an().round(2).sor	t_values	s(ascend	ing= False)			
Out[109												
	5. W e	got new	data for the r	month of aug	ust. Append that t	o the ex	isting da	ata				
In [110	df_aug		read_csv(r"C	:\Users\HP\Pr	ojects - Python\n	ew_data_	_august.	csv")				
Out[110	pro	perty_id pro	pperty_name ca	ategory c	ity room_category r	oom_class	check_i	mmn n_date y	n week day_t y no	ype succe	essful_boo	kings

```
Aug-
                 16559
                                                                  RT1
                                                                          Standard
                                                                                                             weekeday
          0
                          Atliq Exotica
                                                 Mumbai
                                                                                      01-Aug-22
                                                                                                                                      30
                                        Luxury
                                                                                                         32
                                                                                                 Aug-
                                                                                                          W
          1
                                                                                                                                      21
                 19562
                             Atliq Bay
                                        Luxury Bangalore
                                                                   RT1
                                                                          Standard
                                                                                      01-Aug-22
                                                                                                             weekeday
                                                                                                   22
                                                                                                         32
                                                                                                 Aug-
                                                                                                          W
          2
                                                                                      01-Aug-22
                                                                                                                                      23
                 19563
                           Atliq Palace Business Bangalore
                                                                   RT1
                                                                          Standard
                                                                                                             weekeday
                                                                                                   22
                                                                                                         W
                                                                                                 Aug-
          3
                                                                  RT1
                                                                                                                                      30
                 19558
                          Atliq Grands
                                        Luxury Bangalore
                                                                          Standard
                                                                                      01-Aug-22
                                                                                                             weekeday
                                                                                                   22
                                                                                                         32
                                                                                                 Aug-
                                                                                                         W
          4
                 19560
                             Atliq City Business Bangalore
                                                                   RT1
                                                                          Standard
                                                                                      01-Aug-22
                                                                                                                                      20
                                                                                                             weekeday
                                                                                                   22
                                                                                                         32
                                                                                                 Aug-
                                                                                                         W
                                                                                                                                      18
          5
                 17561
                             Atliq Blu
                                        Luxury
                                                 Mumbai
                                                                   RT1
                                                                          Standard
                                                                                      01-Aug-22
                                                                                                             weekeday
                                                                                                         32
                                                                                                 Aug-
                                                                                                                                      10
          6
                         Atliq Seasons Business
                                                                   RT1
                                                                          Standard
                                                                                      01-Aug-22
                 17564
                                                 Mumbai
                                                                                                             weekeday
                                                                                                   22
                                                                                                         32
          df_august.columns
Out[111... Index(['property_id', 'property_name', 'category', 'city', 'room_category',
                  'room_class', 'check_in_date', 'mmm yy', 'week no', 'day_type',
                  'successful_bookings', 'capacity', 'occ%'],
                 dtype='object')
          df.columns
Out[112... Index(['property_id', 'check_in_date', 'room_category', 'successful_bookings',
                  'capacity', 'occ_pct', 'room_class', 'property_name', 'category',
                  'city', 'date', 'mmm yy', 'week no', 'day_type'],
                 dtype='object')
          df_august.shape
```

```
Out[113... (7, 13)
In [114... df.shape
Out[114... (6497, 14)
In [115... latest_df = pd.concat([df, df_august], ignore_index= True, axis = 0)
          latest df.tail(5)
                property_id check_in_date room_category successful_bookings capacity occ_pct room_class property_name category
                                                                                                                                    city da
          6499
                    19563
                               01-Aug-22
                                                  RT1
                                                                      23
                                                                             30.0
                                                                                                        Atliq Palace Business Bangalore Na
                                                                                     NaN
                                                                                             Standard
                                                                             40.0
          6500
                    19558
                                                  RT1
                                                                      30
                                                                                     NaN
                                                                                                        Atliq Grands
                                                                                                                      Luxury Bangalore Na
                               01-Aug-22
                                                                                             Standard
                                                                             26.0
           6501
                     19560
                               01-Aug-22
                                                  RT1
                                                                      20
                                                                                      NaN
                                                                                             Standard
                                                                                                           Atliq City Business Bangalore Na
          6502
                    17561
                               01-Aug-22
                                                  RT1
                                                                      18
                                                                             26.0
                                                                                      NaN
                                                                                             Standard
                                                                                                            Atliq Blu
                                                                                                                      Luxury
                                                                                                                                Mumbai Na
                                                  RT1
                                                                      10
          6503
                    17564
                               01-Aug-22
                                                                             16.0
                                                                                      NaN
                                                                                             Standard
                                                                                                       Atliq Seasons Business
                                                                                                                               Mumbai Na
         latest_df.shape
Out [117... (6504, 15)
```

6. Print revenue realized per day

In [118... df_bookings.head()

ut[118 _		bo	oking_id	property_	_id bool	king_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_give
	1	May0122165	58RT12	165	58	30-04-22	1/5/2022	2/5/2022	2.0	RT1	others	Na
	2	May0122165	58RT13	165	58	28-04-22	1/5/2022	4/5/2022	2.0	RT1	logtrip	5
	4	May0122165	58RT15	165	58	27-04-22	1/5/2022	2/5/2022	4.0	RT1	direct online	5.
	5	May0122165	58RT16	165	58	1/5/2022	1/5/2022	3/5/2022	2.0	RT1	others	4.
	6	May0122165	58RT17	165	58	28-04-22	1/5/2022	6/5/2022	2.0	RT1	others	Nal
n [119	df.	_hotels.hea	ad()									
ıt[119		property_id	property_	name c	ategory	city						
	0	16558	Atliq G	rands	Luxury	Delhi						
	1	16559	Atliq E	xotica	Luxury	Mumbai						
	2	16560	Atli	q City B	usiness	Delhi						
	3	16561	Atl	iq Blu	Luxury	Delhi						
	4	16562	Atli	q Bay	Luxury	Delhi						
	<pre>df_bookings_all = pd.merge(df_bookings, df_hotels, on = "property_id") df_bookings_all.head()</pre>											
t[120		bo	oking_id	property_	_id bool	king_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_give

)		booking_id	property_id	booking_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_given	b
	0	May012216558RT12	16558	30-04-22	1/5/2022	2/5/2022	2.0	RT1	others	NaN	
	1	May012216558RT13	16558	28-04-22	1/5/2022	4/5/2022	2.0	RT1	logtrip	5.0	
	2	May012216558RT15	16558	27-04-22	1/5/2022	2/5/2022	4.0	RT1	direct online	5.0	

3 May012216558RT16	16558	1/5/2022	1/5/2022	3/5/2022	2.0	RT1	others	4.0
4 May012216558RT17	16558	28-04-22	1/5/2022	6/5/2022	2.0	RT1	others	NaN

In [121... df_bookings_all.groupby("city")["revenue_realized"].sum().round(2).sort_values(ascending=False)

Out[121... city

Mumbai 668602231 Bangalore 420383550 Hyderabad 325179310 Delhi 294438788

Name: revenue_realized, dtype: int64

7. Print month by month revenue

In [122... df_bookings_all.head(4)

	booking_id	property_id	booking_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_given	b
0	May012216558RT12	16558	30-04-22	1/5/2022	2/5/2022	2.0	RT1	others	NaN	
1	May012216558RT13	16558	28-04-22	1/5/2022	4/5/2022	2.0	RT1	logtrip	5.0	
2	May012216558RT15	16558	27-04-22	1/5/2022	2/5/2022	4.0	RT1	direct online	5.0	
3	May012216558RT16	16558	1/5/2022	1/5/2022	3/5/2022	2.0	RT1	others	4.0	

In [124... df_date.head(3)

Out [124...

day_type	week no	mmm yy	date	
weekend	W 19	May 22	01-May-22	0
weekeday	W 19	May 22	02-May-22	1
weekeday	W 19	May 22	03-May-22	2

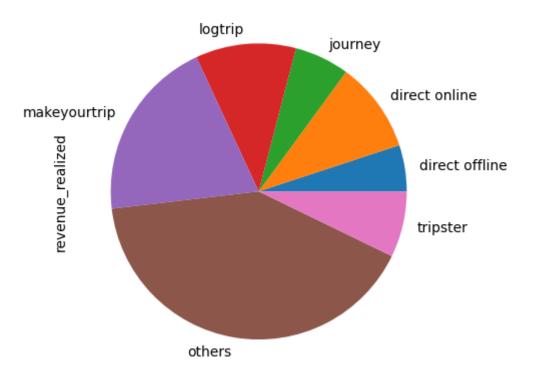
```
In [125... df date["mmm yy"].unique()
Out[125... array(['May 22', 'Jun 22', 'Jul 22'], dtype=object)
In [126... pd.merge(df_bookings_all, df_date, left_on= "check_in_date", right_on="date") #here we didn't get o/p because date
           booking_id property_id booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given booking_state
In [127... df bookings all.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 134578 entries, 0 to 134577
        Data columns (total 15 columns):
             Column
                               Non-Null Count
                                                Dtype
            booking_id 134578 non-null object
            property_id 134578 non-null int64
booking_date 134578 non-null object
            check_in_date 134578 non-null object
             checkout date 134578 non-null object
                       134578 non-null float64
             no_quests
            room_category 134578 non-null object
             booking_platform 134578 non-null object
             ratings_given
                               56679 non-null float64
             booking_status 134578 non-null object
         10 revenue_generated 134578 non-null int64
         11 revenue_realized 134578 non-null int64
         12 property_name 134578 non-null object
         13 category
                               134578 non-null object
         14 city
                               134578 non-null object
        dtypes: float64(2), int64(3), object(10)
        memory usage: 15.4+ MB
In [128... df_date.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 92 entries, 0 to 91
        Data columns (total 4 columns):
```

```
Column
                    Non-Null Count Dtype
            date 92 non-null
                                    object
        1 mmm yy 92 non-null object
            week no 92 non-null object
        3 day type 92 non-null object
       dtypes: object(4)
       memory usage: 3.0+ KB
In [129... # Now we need to convert correct data format like (in both df's date is in object format we need to convert into date
        df_date["date"] = pd.to_datetime(df_date["date"])
        df date.head(3)
       C:\Users\HP\AppData\Local\Temp\ipykernel_13656\336666208.py:2: UserWarning: Could not infer format, so each element
       will be parsed individually, falling back to `dateutil`. To ensure parsing is consistent and as-expected, please spe
       cify a format.
         df_date["date"] = pd.to_datetime(df_date["date"])
                date mmm yy week no day_type
         0 2022-05-01 May 22
                              W 19
                                    weekend
        1 2022-05-02 May 22
                              W 19 weekeday
         2 2022-05-03 May 22
                             W 19 weekeday
In [130... df_date.info()
       <class 'pandas.core.frame.DataFrame'>
       RangeIndex: 92 entries, 0 to 91
       Data columns (total 4 columns):
        # Column Non-Null Count Dtype
        ___ ____
           date 92 non-null datetime64[ns]
        0
        1 mmm yy 92 non-null object
        2 week no 92 non-null object
            day_type 92 non-null object
       dtypes: datetime64[ns](1), object(3)
```

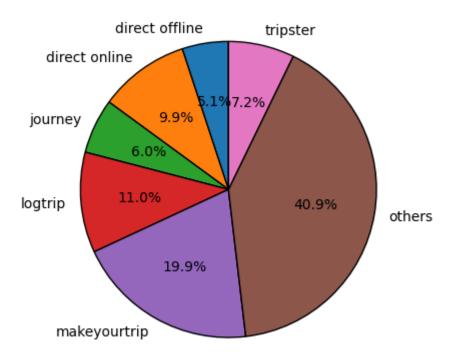
memory usage: 3.0+ KB

```
df_bookings_all["check_in_date"] = pd.to_datetime(df_bookings_all["check_in_date"], format='mixed', dayfirst=True)
 df bookings all.head(3)
           booking id property id booking date check in date checkout date no guests room category booking platform ratings given b
 0 May012216558RT12
                                             2022-05-01
                         16558
                                  30-04-22
                                                            2/5/2022
                                                                         2.0
                                                                                     RT1
                                                                                                  others
                                                                                                               NaN
 1 May012216558RT13
                         16558
                                  28-04-22
                                             2022-05-01
                                                           4/5/2022
                                                                         2.0
                                                                                     RT1
                                                                                                                5.0
                                                                                                  logtrip
 2 May012216558RT15
                         16558
                                  27-04-22
                                             2022-05-01
                                                            2/5/2022
                                                                         4.0
                                                                                     RT1
                                                                                              direct online
                                                                                                                5.0
df bookings all.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 134578 entries, 0 to 134577
Data columns (total 15 columns):
    Column
                        Non-Null Count
                                        Dtype
                        _____
    -----
    booking id
                       134578 non-null object
 0
    property id
                       134578 non-null int64
    booking date
                       134578 non-null object
     check in date
                       134578 non-null object
     checkout_date
                       134578 non-null object
                       134578 non-null float64
 5
    no quests
                       134578 non-null object
    room_category
    booking_platform 134578 non-null object
                        56679 non-null float64
    ratings given
    booking_status
                       134578 non-null object
10 revenue_generated 134578 non-null int64
 11 revenue_realized
                       134578 non-null int64
 12 property_name
                       134578 non-null object
 13 category
                       134578 non-null object
 14 city
                       134578 non-null object
dtypes: float64(2), int64(3), object(10)
memory usage: 15.4+ MB
df_bookings_all = pd.merge(df_bookings_all, df_date, left_on = "check_in_date", right_on = "date")
 df_bookings_all.head(3)
```

Out[140	booking_id	property_id I	booking_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_given b			
	0 May012216558RT12	16558	30-04-22	2022-05-01	2/5/2022	2.0	RT1	others	NaN			
	1 May012216558RT13	16558	28-04-22	2022-05-01	4/5/2022	2.0	RT1	logtrip	5.0			
	2 May012216558RT15	16558	27-04-22	2022-05-01	2/5/2022	4.0	RT1	direct online	5.0			
In [144	df_bookings_all[df_	_bookings_al	l["booking_i	d"] == "May()52216558RT11	."]						
Out[144	booking	_id property_id	d booking_dat	e check_in_da	te checkout_da	ate no_guest	s room_categor	y booking_platforr	n ratings_given			
	6159 May052216558R ⁻¹	Γ11 16558	8 15-04-2	2 2022-05-0	05 7/5/20	22 3.	0 RT	1 tripste	er 5.0			
In []:	#Print revenue real df_bookings_all.grd			revenue_real	lized"].sum()	.sort_valu	es(ascending=	False)				
Out[]:	Atliq Palace 3 Atliq City 2 Atliq Blu 2 Atliq Bay 2 Atliq Grands 2	20291568 04081863 85798439 60851922 60022118 11471234 66086735 ized, dtype:	int64									
In [146	<pre># Print average rating per city df_bookings_all.groupby("city")["ratings_given"].mean().round(2).sort_values(ascending= False)</pre>											



```
plt.ylabel("")
plt.show()
```



In []: