HOSPITALITY DATA ANALYTICS

DATA EXPLORATION

```
In [73]: import pandas as pd
          df_booking = pd.read_csv("C:\\source-code\\3_project_hospitality_analysis\\datasets\\fact_bookings.csv")
          df_booking.head(4)
Out[73]:
         1 booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given booking_status revenue_generated rev
         3
                27-04-22
                              1/5/2022
                                           2/5/2022
                                                         -3.0
                                                                       RT1
                                                                                 direct online
                                                                                                     1.0
                                                                                                            Checked Out
                                                                                                                                  10010
                30-04-22
                              1/5/2022
                                           2/5/2022
                                                          2.0
                                                                       RT1
                                                                                      others
                                                                                                    NaN
                                                                                                              Cancelled
                                                                                                                                   9100
                28-04-22
                              1/5/2022
                                           4/5/2022
                                                          2.0
                                                                       RT1
                                                                                      logtrip
                                                                                                     5.0
                                                                                                            Checked Out
                                                                                                                                 9100000
                28-04-22
                              1/5/2022
                                           2/5/2022
                                                         -2.0
                                                                       RT1
                                                                                      others
                                                                                                    NaN
                                                                                                              Cancelled
                                                                                                                                   9100
In [74]: df_booking.shape
Out[74]: (134590, 12)
In [75]: df_booking.room_category.unique()
Out[75]: array(['RT1', 'RT2', 'RT3', 'RT4'], dtype=object)
In [76]: df_booking.booking_platform.unique()
Out[76]: array(['direct online', 'others', 'logtrip', 'tripster', 'makeyourtrip',
                  'journey', 'direct offline'], dtype=object)
In [77]: df_booking.booking_platform.value_counts()
Out[77]: booking_platform
          others
          makevourtrip
                              26898
                              14756
          logtrip
          direct online
                              13379
          tripster
                               9630
                               8106
          journey
          direct offline
                               6755
          Name: count, dtype: int64
In [78]: df_booking.booking_platform.value_counts().plot(kind='barh')
Out[78]: <Axes: ylabel='booking_platform'>
               direct offline
                    journey
                    tripster
           booking platform
               direct online
                     logtrip
              makeyourtrip
                     others
                                      10000
                                                  20000
                                                               30000
                                                                           40000
                                                                                       50000
```

```
In [79]: df_booking.describe()
```

Out[79]:

	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 [80]: df_booking['revenue_generated'].min(),df_booking['revenue_generated'].max()

Out[80]: (6500, 28560000)

In [23]: df_date = pd.read_csv("C:\\source-code\\3_project_hospitality_analysis\\datasets\\dim_date.csv")
 df_hotels = pd.read_csv("C:\\source-code\\3_project_hospitality_analysis\\datasets\\dim_hotels.csv")
 df_rooms = pd.read_csv("C:\\source-code\\3_project_hospitality_analysis\\datasets\\dim_rooms.csv")
 df_agg_bookings = pd.read_csv("C:\\source-code\\3_project_hospitality_analysis\\datasets\\fact_aggregated_bookings.cs

In [24]: df_hotels.shape

Out[24]: (25, 4)

In [25]: df_hotels.head(4)

Out[25]:

	property_id	property_name	category	city
0	16558	Atliq Grands	Luxury	Delhi
1	16559	Atliq Exotica	Luxury	Mumbai
2	16560	Atliq City	Business	Delhi
3	16561	Atliq Blu	Luxury	Delhi

In [26]: df_hotels['category'].value_counts()

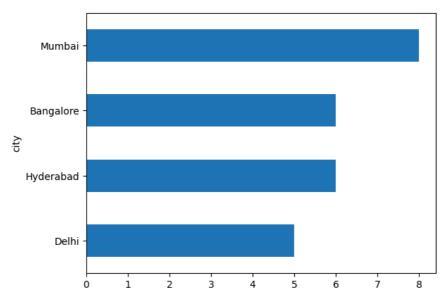
Out[26]: category

Luxury 16
Business 9

Name: count, dtype: int64

In [34]: df_hotels['city'].value_counts().sort_values().plot(kind='barh')

Out[34]: <Axes: ylabel='city'>



```
In [82]: df_agg_bookings.head(4)
Out[82]:
             property_id check_in_date room_category
                                                    successful_bookings capacity
           0
                  16559
                             1-May-22
                                               RT1
                                                                    25
                                                                           30.0
           1
                                               RT1
                  19562
                             1-May-22
                                                                    28
                                                                           30.0
           2
                  19563
                             1-May-22
                                               RT1
                                                                    23
                                                                           30.0
           3
                  17558
                             1-May-22
                                               RT1
                                                                    30
                                                                           19.0
In [36]: df_agg_bookings['property_id'].unique()
Out[36]: 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 [50]: g = df_agg_bookings.groupby('property_id')["successful_bookings"].sum()
Out[50]: 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
          19561
                    5736
          19562
                    5812
          19563
                    5413
          Name: successful_bookings, dtype: int64
In [52]: df_agg_bookings[df_agg_bookings['successful_bookings']>df_agg_bookings['capacity']]
Out[52]:
                property_id check_in_date room_category successful_bookings
                                                                         capacity
                     17558
             3
                                1-May-22
                                                  RT1
                                                                      30
                                                                              19.0
             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 [53]: df_agg_bookings[df_agg_bookings['capacity']==df_agg_bookings['capacity'].max()]

Out[53]:

	property_id	check_in_date	room_category	successful_bookings	capacity
2	27 17558	1-May-22	RT2	38	50.0
12	28 17558	2-May-22	RT2	27	50.0
22	17558	3-May-22	RT2	26	50.0
32	28 17558	4-May-22	RT2	27	50.0
42	28 17558	5-May-22	RT2	29	50.0
872	28 17558	27-Jul-22	RT2	22	50.0
882	28 17558	28-Jul-22	RT2	21	50.0
892	28 17558	29-Jul-22	RT2	23	50.0
902	28 17558	30-Jul-22	RT2	32	50.0
912	28 17558	31-Jul-22	RT2	30	50.0

92 rows × 5 columns

DATA CLEANING

In [83]: df_booking.describe()

Out[83]:

	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 [85]: df_booking[df_booking['no_guests']<0]</pre>

Out[85]:

	booking_id	property_id	booking_date	check_in_date	checkout_date	no_guests	room_category	booking_platform	ratings_give
0	May012216558RT11	16558	27-04-22	1/5/2022	2/5/2022	-3.0	RT1	direct online	1.
3	May012216558RT14	16558	28-04-22	1/5/2022	2/5/2022	-2.0	RT1	others	Na
17924	May122218559RT44	18559	12/5/2022	12/5/2022	14-05-22	-10.0	RT4	direct online	Na
18020	May122218561RT22	18561	8/5/2022	12/5/2022	14-05-22	-12.0	RT2	makeyourtrip	Na
18119	May122218562RT311	18562	5/5/2022	12/5/2022	17-05-22	-6.0	RT3	direct offline	5.
18121	May122218562RT313	18562	10/5/2022	12/5/2022	17-05-22	-4.0	RT3	direct online	Na
56715	Jun082218562RT12	18562	5/6/2022	8/6/2022	13-06-22	-17.0	RT1	others	Na
119765	Jul202219560RT220	19560	19-07-22	20-07-22	22-07-22	-1.0	RT2	others	Na
134586	Jul312217564RT47	17564	30-07-22	31-07-22	1/8/2022	-4.0	RT4	logtrip	2.
4									•

In [86]: df_booking.shape

Out[86]: (134590, 12)

In [89]: df_booking = df_booking[df_booking['no_guests']>0] #removing records that have negative number of df_booking.shape

Out[89]: (134578, 12)

In [90]: df_booking['revenue_generated'].min(),df_booking['revenue_generated'].max()

Out[90]: (6500, 28560000)

Out[91]: (15378.036937686695, 93040.15493143328)

```
In [92]: higher_limit , lower_limit = avg + 3*std , avg - 3*std
          higher_limit , lower_limit
Out[92]: (294498.50173198653, -263742.4278566132)
In [66]: df_booking[df_booking['revenue_generated']<0]</pre>
                                                                                           #checking if revenue_ggenerated column has its v
Out[66]:
             booking_id property_id booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given booking_stat
In [93]: df_booking[df_booking['revenue_generated']>higher_limit]
                                                                                                           #finding outliers in revenue_gener
Out[93]:
          i booking_date check_in_date checkout_date no_guests room_category
                                                                                booking_platform ratings_given booking_status
                                                                                                                              revenue_generated rev
          3
                 28-04-22
                                1/5/2022
                                              4/5/2022
                                                             2.0
                                                                           RT1
                                                                                           logtrip
                                                                                                           5.0
                                                                                                                  Checked Out
                                                                                                                                        9100000
          )
                 29-04-22
                               1/5/2022
                                              2/5/2022
                                                             6.0
                                                                           RT3
                                                                                      direct online
                                                                                                          NaN
                                                                                                                  Checked Out
                                                                                                                                       28560000
                 28-04-22
                               1/5/2022
                                              4/5/2022
                                                             2.0
                                                                           RT2
                                                                                      direct offline
                                                                                                           3.0
                                                                                                                  Checked Out
                                                                                                                                       12600000
                 26-04-22
                               1/5/2022
                                              2/5/2022
                                                             20
                                                                           RT1
                                                                                           others
                                                                                                          NaN
                                                                                                                     Cancelled
                                                                                                                                        2000000
                 21-07-22
                               28-07-22
                                             29-07-22
                                                                           RT2
                                                                                      direct online
                                                                                                           3.0
                                                                                                                  Checked Out
                                                                                                                                       10000000
                                                             2.0
In [94]: | df_booking = df_booking[df_booking['revenue_generated']<higher_limit]</pre>
          df_booking.shape
                                                                                                          #removing outliers in revenue_gener
Out[94]: (134573, 12)
In [95]: df_booking['revenue_realized'].describe()
Out[95]: count
                     134573.000000
                      12695.983585
          mean
                        6927.791692
          std
          min
                        2600,000000
          25%
                       7600.000000
           50%
                      11700.000000
          75%
                      15300.000000
          max
                      45220.000000
          Name: revenue_realized, dtype: float64
In [96]: | avg1, std1 = df_booking['revenue_realized'].mean(), df_booking['revenue_realized'].std()
          avg1 , std1
Out[96]: (12695.983585117372, 6927.791692242509)
In [97]: higher_limit1 = avg1 + 3*std1
          higher_limit1
                                                                    #higher limit1 > maximum value of revenue_realized => outliers could
Out[97]: 33479.3586618449
In [98]: df booking[df booking['revenue realized']>higher limit1]
Out[98]:
          perty_id booking_date check_in_date checkout_date no_guests room_category
                                                                                      booking_platform ratings_given
                                                                                                                     booking_status revenue_generat
            16559
                       27-04-22
                                     1/5/2022
                                                    7/5/2022
                                                                   4.0
                                                                                 RT4
                                                                                                 others
                                                                                                                NaN
                                                                                                                        Checked Out
                                                                                                                                                387
            16559
                       1/5/2022
                                     1/5/2022
                                                    2/5/2022
                                                                   6.0
                                                                                 RT4
                                                                                                tripster
                                                                                                                 3.0
                                                                                                                        Checked Out
                                                                                                                                                452
            16559
                       28-04-22
                                     1/5/2022
                                                    3/5/2022
                                                                   3.0
                                                                                 RT4
                                                                                                 others
                                                                                                                 5.0
                                                                                                                        Checked Out
                                                                                                                                                355
                                                    7/5/2022
            16559
                       24-04-22
                                     1/5/2022
                                                                   5.0
                                                                                 RT4
                                                                                                                NaN
                                                                                                                        Checked Out
                                                                                                                                                419
                                                                                                 logtrip
            16560
                       30-04-22
                                     1/5/2022
                                                    3/5/2022
                                                                                 RT4
                                                                                                                        Checked Out
                                                                                                                                                345
                                                                   5.0
                                                                                                 others
                                                                                                                 3.0
            19560
                       31-07-22
                                     31-07-22
                                                    2/8/2022
                                                                   6.0
                                                                                 RT4
                                                                                            direct online
                                                                                                                 5.0
                                                                                                                        Checked Out
                                                                                                                                                399
            19560
                       31-07-22
                                     31-07-22
                                                    1/8/2022
                                                                   6.0
                                                                                 RT4
                                                                                                                 2.0
                                                                                                                        Checked Out
                                                                                                                                                399
                                                                                                 others
            19562
                       28-07-22
                                     31-07-22
                                                    1/8/2022
                                                                   6.0
                                                                                 RT4
                                                                                           makeyourtrip
                                                                                                                 4.0
                                                                                                                        Checked Out
                                                                                                                                                399
            19562
                       25-07-22
                                     31-07-22
                                                    6/8/2022
                                                                   5.0
                                                                                 RT4
                                                                                            direct offline
                                                                                                                 5.0
                                                                                                                        Checked Out
                                                                                                                                                370
            17564
                       31-07-22
                                     31-07-22
                                                    1/8/2022
                                                                   4.0
                                                                                 RT4
                                                                                           makeyourtrip
                                                                                                                 4.0
                                                                                                                        Checked Out
                                                                                                                                                387
```

```
In [100]: #1299 rows have revenue_generated > higher_limit1 but almost all rows room_category is RT4 which is a presidential su
           #(has higher rent than other suites)
In [101]: | df_booking[df_booking['room_category']=='RT4'].revenue_realized.describe()
Out[101]: 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 [102]: high = 23439.308444 + 3*9048.599076
                                  #higher limit for RT4 room_category rows is ~ 50585. Thus, there are no outliers in revenue_rea
Out[102]: 50585.105672000005
In [103]: df_booking.isnull().sum()
                                                    #ratings_given has 77897 NA values but it is alright as only very few people g
Out[103]: booking_id
                                     0
           property_id
                                     0
           booking_date
                                     0
                                     0
           check in date
           checkout_date
                                     0
           no_guests
                                     0
           room_category
                                     0
           booking_platform
                                     0
           ratings_given
                                 77897
                                     0
           booking status
           revenue_generated
                                     a
           revenue_realized
                                     0
           dtype: int64
In [107]: df_agg_bookings.isnull().sum()
Out[107]: property_id
                                   0
           check_in_date
                                   0
           room_category
                                   0
           successful_bookings
                                   0
           capacity
                                   2
           dtype: int64
In [110]: df_agg_bookings = df_agg_bookings.fillna(df_agg_bookings['capacity'].mean())
           df_agg_bookings
Out[110]:
                 property_id check_in_date room_category successful_bookings
                                                                        capacity
              0
                      16559
                                1-May-22
                                                  RT1
                                                                     25
                                                                            30.0
                     19562
                                                  RT1
                                                                     28
                                                                            30.0
              1
                                1-May-22
              2
                     19563
                                                  RT1
                                                                     23
                                1-May-22
                                                                            30.0
              3
                     17558
                                1-May-22
                                                  RT1
                                                                     30
                                                                             19.0
              4
                                                  RT1
                      16558
                                1-May-22
                                                                      18
                                                                             19.0
            9195
                      16563
                                31-Jul-22
                                                  RT4
                                                                     13
                                                                             18.0
            9196
                      16559
                                31-Jul-22
                                                  RT4
                                                                     13
                                                                             18.0
            9197
                      17558
                                31-Jul-22
                                                  RT4
                                                                      3
                                                                             6.0
            9198
                     19563
                                31-Jul-22
                                                  RT4
                                                                      3
                                                                             6.0
           9199
                     17561
                                31-Jul-22
                                                  RT4
                                                                      3
                                                                             4.0
In [111]: df_agg_bookings.isnull().sum()
Out[111]: property_id
           check_in_date
                                   0
                                   0
           room_category
           successful_bookings
                                   0
                                   0
           capacity
           dtype: int64
```

	property_id	cneck_in_date	room_category	successful_bookings	capacity
3	17558	1-May-22	RT1	30	19.0
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

DATA TRANSFORMATION

```
In [113]: df_agg_bookings.head(4)
Out[113]:
               property_id check_in_date room_category successful_bookings
            0
                               1-May-22
                                                  RT1
            1
                    19562
                               1-May-22
                                                  RT1
                                                                       28
                                                                              30.0
            2
                    19563
                               1-May-22
                                                  RT1
                                                                       23
                                                                              30.0
                    17558
                               1-May-22
                                                  RT1
                                                                       30
                                                                              19.0
In [117]: df_agg_bookings['occ_pct'] = df_agg_bookings['successful_bookings']/df_agg_bookings['capacity']
           df_agg_bookings.head(4)
Out[117]:
               property_id check_in_date room_category
                                                       successful_bookings capacity
            0
                    16559
                               1-May-22
                                                  RT1
                                                                              30.0 0.833333
            1
                    19562
                               1-May-22
                                                  RT1
                                                                       28
                                                                              30.0 0.933333
            2
                    19563
                               1-May-22
                                                  RT1
                                                                       23
                                                                              30.0 0.766667
                    17558
                                                  RT1
                                                                       30
                                                                              19.0 1.578947
                               1-May-22
In [118]:
           df_agg_bookings['occ_pct'] = df_agg_bookings['occ_pct'].apply(lambda x: round(x*100, 2))
           df_agg_bookings.head(3)
                                                                                                                             #transforming occ
Out[118]:
               property_id check_in_date room_category successful_bookings capacity occ_pct
            0
                                                                                      83.33
                    16559
                               1-May-22
                                                  RT1
                                                                              30.0
            1
                    19562
                               1-May-22
                                                  RT1
                                                                       28
                                                                              30.0
                                                                                      93.33
                    19563
                               1-May-22
                                                  RT1
                                                                       23
                                                                              30.0
                                                                                      76.67
```

INSIGHTS GENERATION

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

```
In [120]: df_agg_bookings.groupby('room_category')['occ_pct'].mean().round(2)
Out[120]: room_category
           RT1
                  58.23
           RT2
                  58.04
           RT3
                  58.03
           RT4
                  59.30
           Name: occ_pct, dtype: float64
In [121]: df_rooms
Out[121]:
              room_id room_class
           0
                 RT1
                         Standard
                 RT2
           1
                            Flite
           2
                 RT3
                         Premium
```

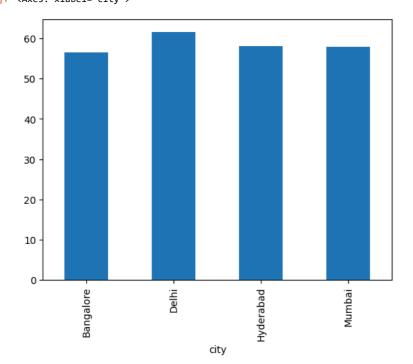
RT4

Presidential

In [126]: df = pd.merge(df_agg_bookings,df_rooms,left_on='room_category',right_on ='room_id')

```
Out[126]:
                   property_id check_in_date room_category successful_bookings
                                                                                 capacity occ pct room id room class
                0
                        16559
                                                        RT1
                                                                                                        RT1
                                    1-May-22
                                                                              25
                                                                                      30.0
                                                                                              83.33
                                                                                                                Standard
                1
                        19562
                                    1-May-22
                                                        RT1
                                                                              28
                                                                                      30.0
                                                                                              93.33
                                                                                                        RT1
                                                                                                                Standard
                2
                        19563
                                    1-May-22
                                                        RT1
                                                                              23
                                                                                      30.0
                                                                                              76.67
                                                                                                        RT1
                                                                                                                Standard
                                                                                                        RT1
                        17558
                                                        RT1
                                                                              30
                                    1-May-22
                                                                                      19.0
                                                                                             157.89
                                                                                                                Standard
                        16558
                                                        RT1
                                    1-May-22
                                                                              18
                                                                                      19.0
                                                                                              94.74
                                                                                                        RT1
                                                                                                                Standard
             9195
                        16563
                                    31-Jul-22
                                                        RT4
                                                                              13
                                                                                      18.0
                                                                                              72.22
                                                                                                        RT4
                                                                                                              Presidential
                                                        RT4
             9196
                        16559
                                    31-Jul-22
                                                                              13
                                                                                      18.0
                                                                                              72.22
                                                                                                        RT4
                                                                                                              Presidential
                                    31-Jul-22
                                                                               3
             9197
                        17558
                                                        RT4
                                                                                       6.0
                                                                                              50.00
                                                                                                        RT4
                                                                                                              Presidential
             9198
                        19563
                                    31-Jul-22
                                                        RT4
                                                                               3
                                                                                       6.0
                                                                                              50.00
                                                                                                        RT4
                                                                                                              Presidential
                        17561
                                                        RT4
             9199
                                    31-Jul-22
                                                                               3
                                                                                       4.0
                                                                                              75.00
                                                                                                        RT4
                                                                                                              Presidential
            9200 rows × 8 columns
In [127]: df.groupby('room_class')['occ_pct'].mean().round(2)
Out[127]: room_class
            Elite
                               58.04
            Premium
                               58.03
            Presidential
                               59.30
            Standard
                               58.23
            Name: occ_pct, dtype: float64
In [128]: |df.drop('room_id',axis=1,inplace=True)
            df.head(3)
Out[128]:
                property_id check_in_date room_category successful_bookings
                                                                              capacity occ_pct room_class
             0
                     16559
                                 1-May-22
                                                     RT1
                                                                           25
                                                                                   30.0
                                                                                          83.33
                                                                                                    Standard
             1
                     19562
                                 1-May-22
                                                     RT1
                                                                           28
                                                                                   30.0
                                                                                          93.33
                                                                                                    Standard
             2
                     19563
                                 1-May-22
                                                     RT1
                                                                           23
                                                                                   30.0
                                                                                          76.67
                                                                                                    Standard
            2. Printing average occupancy rate per city
In [129]: df hotels.head(2)
Out[129]:
                property_id property_name
                                           category
                                                        city
             0
                     16558
                                                       Delhi
                               Atlig Grands
                                             Luxury
             1
                     16559
                               Atliq Exotica
                                             Luxury Mumbai
In [130]: df.head(2)
Out[130]:
                property id
                           check in date room category
                                                          successful bookings
                                                                              capacity
                                                                                        occ pct room class
             0
                     16559
                                 1-May-22
                                                     RT1
                                                                           25
                                                                                   30.0
                                                                                          83.33
                                                                                                    Standard
             1
                     19562
                                 1-May-22
                                                     RT1
                                                                           28
                                                                                   30.0
                                                                                          93.33
                                                                                                    Standard
In [131]: df1 = pd.merge(df_hotels,df, on= 'property_id')
            df1.head(2)
Out[131]:
                                                      city check_in_date room_category successful_bookings
                property_id
                           property_name category
                                                                                                             capacity
                                                                                                                      occ_pct room_class
             0
                                                                                    RT1
                     16558
                               Atliq Grands
                                             Luxury
                                                     Delhi
                                                                1-May-22
                                                                                                          18
                                                                                                                  19.0
                                                                                                                          94.74
                                                                                                                                   Standard
             1
                     16558
                               Atlig Grands
                                                                2-May-22
                                                                                    RT1
                                                                                                          12
                                                                                                                  19.0
                                                                                                                         63.16
                                             Luxury Delhi
                                                                                                                                   Standard
In [133]: df1.groupby('city').occ_pct.mean().round(2)
Out[133]: city
            Bangalore
                            56.59
            Delhi
                            61.61
            Hyderabad
                            58.14
            Mumbai
                            57.94
            Name: occ_pct, dtype: float64
```

```
In [134]: df1.groupby('city').occ_pct.mean().round(2).plot(kind='bar')
Out[134]: <Axes: xlabel='city'>
```



3. When was the occupancy rate better? weekday or weekend?

In [138]: df_date.head(2)

Out[138]:

 date
 mmm yy
 week no
 day_type

 0
 01-May-22
 May 22
 W 19
 weekend

 1
 02-May-22
 May 22
 W 19
 weekeday

In [139]: df1.head(2)

Out[139]:

	property_id	property_name	category	city	check_in_date	room_category	successful_bookings	capacity	occ_pct	room_class	
Ī	0 16558	Atliq Grands	Luxury	Delhi	1-May-22	RT1	18	19.0	94.74	Standard	
	1 16558	Atliq Grands	Luxury	Delhi	2-May-22	RT1	12	19.0	63.16	Standard	

In [141]: df2 = pd.merge(df1,df_date,left_on='check_in_date',right_on ='date')
df2.head(2)

Out[141]:

₩€	mmm yy	date	room_class	occ_pct	capacity	successful_bookings	room_category	check_in_date	city	category	property_name	property_id	
W	May 22	10- May- 22	Standard	52.63	19.0	10	RT1	10-May-22	Delhi	Luxury	Atliq Grands	16558	
W	May 22	10- May- 22	Elite	54.55	22.0	12	RT2	10-May-22	Delhi	Luxury	Atliq Grands	16558	
•												4	

In [143]: df2.groupby('day_type').occ_pct.mean().round(2)

Out[143]: day_type

weekeday 50.90 weekend 72.39

Name: occ_pct, dtype: float64

4.In the month of June, what was the occupancy for different cities?

```
In [156]: df2['mmm yy'].unique()
Out[156]: array(['May 22', 'Jun 22', 'Jul 22'], dtype=object)
```

```
In [158]: df_june22 = df2[df2['mmm yy'] == 'Jun 22'].groupby('city').occ_pct.mean().round(2).sort_values(ascending=False)
          df_june22
Out[158]: city
          Delhi
                       62.47
          Hyderabad
                       58.46
          Mumbai
                       58.38
          Bangalore
                       56.58
          Name: occ_pct, dtype: float64
          4. adding august month data to the existigng dataframe
In [160]:
          df_august = pd.read_csv("C:\\source-code\\3_project_hospitality_analysis\\datasets\\new_data_august.csv")
          df_august.head(2)
Out[160]:
                                                                                         mmm week
              property_id property_name category
                                                 city room_category room_class check_in_date
                                                                                                     day_type successful_bookings ca
                                                                                                 no
                                                                                            уу
                                                                                          Aug-
           0
                  16559
                                                                                                W 32
                           Atlia Exotica
                                      Luxurv
                                              Mumbai
                                                              RT1
                                                                     Standard
                                                                                 01-Aug-22
                                                                                                    weekedav
                                                                                                                            30
                                                                                 01-Aug-22
                  19562
                             Atliq Bay
                                                              RT1
                                                                     Standard
                                                                                                W 32 weekeday
                                                                                                                            21
                                      Luxury Bangalore
In [161]: df_august.columns
dtype='object')
In [162]: df2.columns
In [166]: df_august.shape, df2.shape
Out[166]: ((7, 13), (6500, 14))
In [171]: latest_df = pd.concat([df2,df_august],ignore_index=True,axis=0)
          latest_df.tail(4)
Out[171]:
                                                    city check_in_date room_category successful_bookings capacity occ_pct room_class date
                property_id property_name category
           6503
                     19558
                             Atliq Grands
                                         Luxury Bangalore
                                                            01-Aug-22
                                                                             RT1
                                                                                                30
                                                                                                       40.0
                                                                                                              NaN
                                                                                                                     Standard NaN
           6504
                     19560
                                Atliq City Business Bangalore
                                                            01-Aug-22
                                                                             RT1
                                                                                                20
                                                                                                       26.0
                                                                                                              NaN
                                                                                                                     Standard NaN
           6505
                    17561
                                Atliq Blu
                                         Luxury
                                                 Mumbai
                                                            01-Aug-22
                                                                             RT1
                                                                                                18
                                                                                                       26.0
                                                                                                              NaN
                                                                                                                     Standard NaN
           6506
                    17564
                            Atliq Seasons Business
                                                            01-Aug-22
                                                                             RT1
                                                                                                10
                                                                                                       16.0
                                                                                                              NaN
                                                                                                                     Standard NaN
                                                 Mumbai
In [172]: latest_df.shape
Out[172]: (6507, 15)
          5. print revenue realised per city
In [176]: df_booking.head(2)
Out[176]:
                    booking_id property_id booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given
           1 May012216558RT12
                                                                                                                          NaN
                                  16558
                                            30-04-22
                                                         1/5/2022
                                                                     2/5/2022
                                                                                   2.0
                                                                                               RT1
                                                                                                            others
           4 May012216558RT15
                                  16558
                                            27-04-22
                                                         1/5/2022
                                                                     2/5/2022
                                                                                   4.0
                                                                                               RT1
                                                                                                                          5.0
                                                                                                        direct online
```

```
In [177]: df_hotels.head(2)
Out[177]:
                              property id property name category
                                                                                                        city
                        0
                                       16558
                                                          Atliq Grands
                                                                                                      Delhi
                                                                                   Luxury
                                       16559
                                                          Atliq Exotica
                                                                                   Luxury Mumbai
In [179]: df_rev = pd.merge(df_booking,df_hotels,on='property_id')
                       df_rev.head(2)
Out[179]:
                                           booking_id property_id booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given booking_booking_platform ratings_given booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_booking_
                        0 May012216558RT12
                                                                           16558
                                                                                                30-04-22
                                                                                                                           1/5/2022
                                                                                                                                                       2/5/2022
                                                                                                                                                                                   2.0
                                                                                                                                                                                                             RT1
                                                                                                                                                                                                                                                                       NaN
                                                                                                                                                                                                                                           others
                         1 May012216558RT15
                                                                           16558
                                                                                                27-04-22
                                                                                                                           1/5/2022
                                                                                                                                                       2/5/2022
                                                                                                                                                                                   4.0
                                                                                                                                                                                                             RT1
                                                                                                                                                                                                                                  direct online
                                                                                                                                                                                                                                                                         5.0
In [181]: df_rev.groupby('city')['revenue_realized'].sum()
Out[181]: city
                       Bangalore
                                                   420383550
                       Delhi
                                                   294404488
                       Hyderabad
                                                   325179310
                       Mumbai
                                                   668569251
                       Name: revenue_realized, dtype: int64
                       6.print month by month revenue
In [187]: df_date.head(3)
Out[187]:
                                       date mmm yy week no
                                                                                    day_type
                        0 01-May-22
                                                    May 22
                                                                         W 19
                         1 02-May-22
                                                                        W 19
                                                    May 22
                         2 03-May-22
                                                    May 22
                                                                        W 19
                                                                                   weekeday
In [184]: latest_df['mmm yy'].unique()
Out[184]: array(['May 22', 'Jun 22', 'Jul 22', 'Aug-22'], dtype=object)
In [186]: df_rev.head(2)
Out[186]:
                      d booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given booking_status revenue_generated re
                     8
                                   30-04-22
                                                               1/5/2022
                                                                                          2/5/2022
                                                                                                                       2.0
                                                                                                                                                 RT1
                                                                                                                                                                                                           NaN
                                                                                                                                                                                                                               Cancelled
                                                                                                                                                                                                                                                                         9100
                                                                                                                                                                              others
                                   27-04-22
                                                               1/5/2022
                                                                                          2/5/2022
                                                                                                                                                 RT1
                                                                                                                                                                                                                                                                        10920
                     18
                                                                                                                       4.0
                                                                                                                                                                     direct online
                                                                                                                                                                                                             5.0
                                                                                                                                                                                                                          Checked Out
In [188]: |pd.merge(df_rev,df_date,left_on='check_in_date',right_on='date')
Out[188]:
                            booking id property id booking date check in date checkout date no guests room category booking platform ratings given booking stat
In [191]: df_rev['check_in_date'].info()
                       <class 'pandas.core.series.Series'>
                       RangeIndex: 134573 entries, 0 to 134572
                       Series name: check_in_date
                       Non-Null Count Dtype
                       134573 non-null object
                       dtypes: object(1)
                       memory usage: 1.0+ MB
In [192]: df_date['date'].info()
                       <class 'pandas.core.series.Series'>
                       RangeIndex: 92 entries, 0 to 91
                       Series name: date
                       Non-Null Count Dtype
                       92 non-null
                                                         object
                       dtypes: object(1)
                       memory usage: 868.0+ bytes
```

```
In [193]: df_date['date'] = pd.to_datetime(df_date['date'])
                               df_date.head(2)
                               {\tt C:\Wers\Shreya\AppData\Local\Temp\ipykernel\_8920\S33639996.py:1: UserWarning: Could not infer format, so each element of the could be also 
                               t will be parsed individually, falling back to `dateutil`. To ensure parsing is consistent and as-expected, please s
                                      df_date['date'] = pd.to_datetime(df_date['date'])
Out[193]:
                                                        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
In [194]: df_date['date'].info()
                                <class 'pandas.core.series.Series'>
                               RangeIndex: 92 entries, 0 to 91
                               Series name: date
                               Non-Null Count Dtype
                               92 non-null
                                                                                 datetime64[ns]
                               dtypes: datetime64[ns](1)
                               memory usage: 868.0 bytes
In [213]: df_rev['check_in_date'] = pd.to_datetime(df_rev["check_in_date"],format='mixed')
                                # The format='mixed' option is used in pd.to datetime() to handle columns with mixed date formats.
                               df_rev.head(2)
Out[213]:
                                                             booking_id property_id booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given booking_the booking_booking_latform ratings_given booking_the booking_date check_in_date chec
                                  0 May012216558RT12
                                                                                                         16558
                                                                                                                                       30-04-22
                                                                                                                                                                       2022-01-05
                                                                                                                                                                                                                     2/5/2022
                                                                                                                                                                                                                                                             2.0
                                                                                                                                                                                                                                                                                                  RT1
                                                                                                                                                                                                                                                                                                                                                                                    NaN
                                  1 May012216558RT15
                                                                                                                                                                                                                                                                                                  RT1
                                                                                                         16558
                                                                                                                                      27-04-22
                                                                                                                                                                       2022-01-05
                                                                                                                                                                                                                    2/5/2022
                                                                                                                                                                                                                                                             4.0
                                                                                                                                                                                                                                                                                                                               direct online
                                                                                                                                                                                                                                                                                                                                                                                      5.0
In [214]: df_rev['check_in_date'].info()
                                <class 'pandas.core.series.Series'>
                               RangeIndex: 134573 entries, 0 to 134572
                                Series name: check_in_date
                               Non-Null Count Dtype
                               55790 non-null datetime64[ns]
                               dtypes: datetime64[ns](1)
                               memory usage: 1.0 MB
In [215]: df_month = pd.merge(df_rev,df_date,left_on='check_in_date',right_on='date')
                               df_month.head(3)
Out[215]:
                                                             booking_id property_id booking_date check_in_date checkout_date no_guests room_category booking_platform ratings_given booking_
                                  0 May052216558RT11
                                                                                                         16558
                                                                                                                                       15-04-22
                                                                                                                                                                       2022-05-05
                                                                                                                                                                                                                     7/5/2022
                                                                                                                                                                                                                                                             3.0
                                                                                                                                                                                                                                                                                                  RT1
                                                                                                                                                                                                                                                                                                                                                                                      5.0
                                                                                                                                                                                                                                                                                                                                          tripster
                                  1 May052216558RT12
                                                                                                         16558
                                                                                                                                       30-04-22
                                                                                                                                                                       2022-05-05
                                                                                                                                                                                                                    7/5/2022
                                                                                                                                                                                                                                                             2.0
                                                                                                                                                                                                                                                                                                  RT1
                                                                                                                                                                                                                                                                                                                                           others
                                                                                                                                                                                                                                                                                                                                                                                    NaN
                                  2 May052216558RT13
                                                                                                                                                                       2022-05-05
                                                                                                                                                                                                                    6/5/2022
                                                                                                                                        1/5/2022
                                                                                                                                                                                                                                                             3.0
                                                                                                                                                                                                                                                                                                  RT1
                                                                                                                                                                                                                                                                                                                               direct offline
                                                                                                                                                                                                                                                                                                                                                                                      5.0
In [220]: | df_month.groupby('mmm yy')['revenue_realized'].sum().sort_values()
Out[220]: mmm yy
                               Jun 22
                                                               52903014
                               Jul 22
                                                               60278496
                                                               60961428
                               May 22
                               Name: revenue_realized, dtype: int64
```

7.print revenue realize per hotel type

```
In [225]: df_month.groupby('property_name')['revenue_realized'].sum()
Out[225]: property_name
                           26936115
          Atliq Bay
          Atliq Blu
                           26459751
          Atliq City
                           29047727
          Atliq Exotica
                           32436799
                           21644446
          Atliq Grands
                           30945855
          Atliq Palace
          Atliq Seasons
                            6672245
          Name: revenue_realized, dtype: int64
```

8. Print average rate per city

```
In [226]: df_month.groupby("city")["ratings_given"].mean().round(2)
Out[226]: city
          Bangalore
                       3.41
          Delhi
                       3.79
          Hyderabad
                       3.65
          Mumbai
                       3.63
          Name: ratings_given, dtype: float64
```

9. Print a pie chart of revenue realized per booking platform

```
In [230]: df_month.groupby("booking_platform")["revenue_realized"].sum().plot(kind ='pie')
```



