

AtliQ Grands Hospitality Analysis

Problem Statement

Atliq Grands, a well known hotel chain with a presence across several Indian cities and brands like AtliQ Seasons, AtliQ Exotica, AtliQ Bay, and AtliQ Palace, has experienced a decline in both revenue and market share. To tackle this issue and strengthen his financial performance, the company plans to harness data analytics for more informed decision-making. The initiative focuses on examining booking records sourced from both the official website and third-party platforms to uncover insights that can drive revenue growth and improve competitiveness in the market.

```
In [1]: import pandas as pd
import matplotlib.pyplot as plt
```

Dataset

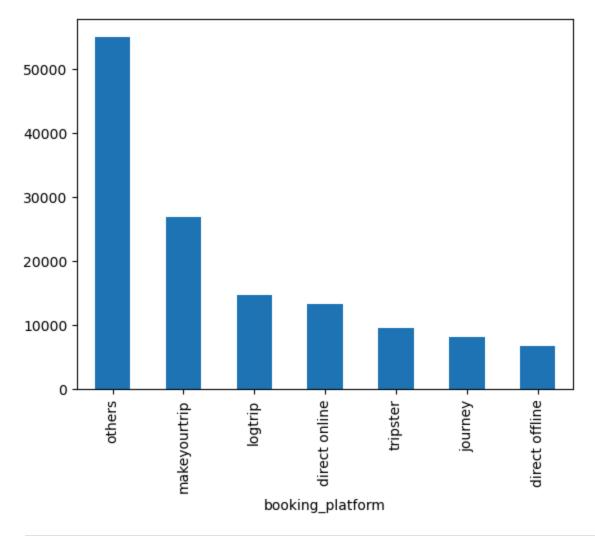
- dim_date.csv
- · dim hotels.csv
- dim_rooms.csv
- fact aggregated bookings.csv
- fact bookings.csv

Data Exploration

```
In [2]: df_bookings = pd.read_csv('fact_bookings.csv')
    df_bookings.head(4)
```

```
Out[2]:
                  booking_id property_id booking_date check_in_date checkout_date
        0 May012216558RT11
                                    16558
                                                27-04-22
                                                               1/5/2022
                                                                              2/5/2022
        1 May012216558RT12
                                    16558
                                                30-04-22
                                                               1/5/2022
                                                                              2/5/2022
        2 May012216558RT13
                                    16558
                                                28-04-22
                                                               1/5/2022
                                                                              4/5/2022
        3 May012216558RT14
                                    16558
                                                28-04-22
                                                               1/5/2022
                                                                              2/5/2022
        df_bookings.shape
In [3]:
Out[3]: (134590, 12)
In [4]:
        df bookings.room category.unique()
Out[4]: array(['RT1', 'RT2', 'RT3', 'RT4'], dtype=object)
        df_bookings.booking_platform.unique()
In [5]:
Out[5]: array(['direct online', 'others', 'logtrip', 'tripster', 'makeyourtrip',
                'journey', 'direct offline'], dtype=object)
        df bookings.booking platform.value counts().plot(kind = 'bar')
In [6]:
```

Out[6]: <Axes: xlabel='booking_platform'>



In [7]: df_bookings.describe()

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u				/	- 1	-

	property_id	no_guests	ratings_given	revenue_generated	revenue
count	134590.000000	134587.000000	56683.000000	1.345900e+05	1345
mean	18061.113493	2.036170	3.619004	1.537805e+04	126
std	1093.055847	1.034885	1.235009	9.303604e+04	69
min	16558.000000	-17.000000	1.000000	6.500000e+03	26
25%	17558.000000	1.000000	3.000000	9.900000e+03	76
50%	17564.000000	2.000000	4.000000	1.350000e+04	117
75%	18563.000000	2.000000	5.000000	1.800000e+04	153
max	19563.000000	6.000000	5.000000	2.856000e+07	452

In [8]: df_bookings.revenue_generated.min().item(),df_bookings.revenue_generated.max()

Out[8]: (6500, 28560000)

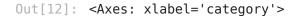
```
In [9]: df_date = pd.read_csv('dim_date.csv')
    df_hotels = pd.read_csv('dim_hotels.csv')
    df_rooms = pd.read_csv('dim_rooms.csv')
    df_agg_bookings = pd.read_csv('fact_aggregated_bookings.csv')
In [10]: df_hotels.shape
```

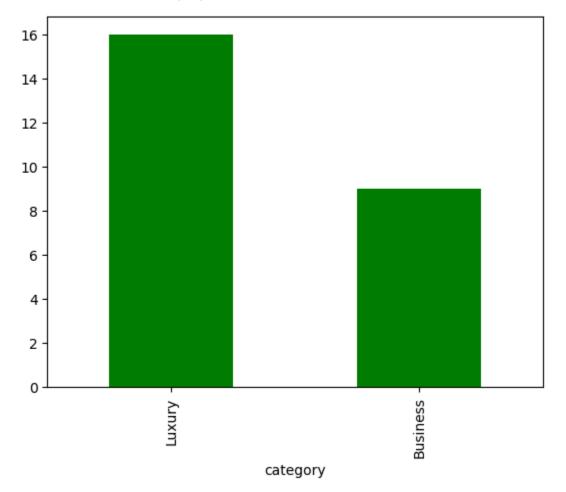
Out[10]: (25, 4)

In [11]: df_hotels.head(4)

property_id property_name category city Out[11]: 0 16558 Atliq Grands Delhi Luxury 1 16559 Atliq Exotica Mumbai Luxury 2 16560 Atliq City **Business** Delhi 3 16561 Atliq Blu Luxury Delhi

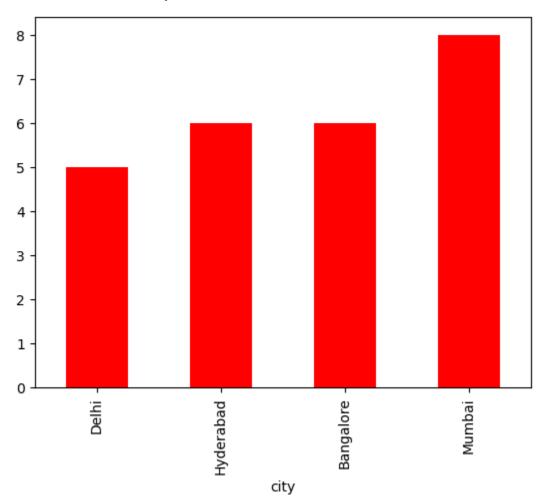
```
In [12]: df_hotels.category.value_counts().plot(kind = 'bar', color = 'green')
```





```
In [13]: df_hotels.city.value_counts().sort_values().plot(kind = 'bar', color = 'red')
```

Out[13]: <Axes: xlabel='city'>



Data Cleaning

```
In [14]: df_bookings.describe()
```

Out[14]:		property_id	no_guests	ratings_given	revenue_generated	revenue
	count	134590.000000	134587.000000	56683.000000	1.345900e+05	1345
	mean	18061.113493	2.036170	3.619004	1.537805e+04	126
	std	1093.055847	1.034885	1.235009	9.303604e+04	69
	min	16558.000000	-17.000000	1.000000	6.500000e+03	26
	25%	17558.000000	1.000000	3.000000	9.900000e+03	76
	50%	17564.000000	2.000000	4.000000	1.350000e+04	117
	75 %	18563.000000	2.000000	5.000000	1.800000e+04	153
	max	19563.000000	6.000000	5.000000	2.856000e+07	452

In [15]: df_bookings[df_bookings.no_guests <= 0]</pre>

Out[15]:		booking_id	property_id	booking_date	check_in_date	checkou
	0	May012216558RT11	16558	27-04-22	1/5/2022	2/
	3	May012216558RT14	16558	28-04-22	1/5/2022	2/
	17924	May122218559RT44	18559	12/5/2022	12/5/2022	14
	18020	May122218561RT22	18561	8/5/2022	12/5/2022	14
	18119	May122218562RT311	18562	5/5/2022	12/5/2022	17
	18121	May122218562RT313	18562	10/5/2022	12/5/2022	17
	56715	Jun082218562RT12	18562	5/6/2022	8/6/2022	13
	119765	Jul202219560RT220	19560	19-07-22	20-07-22	22
	134586	Jul312217564RT47	17564	30-07-22	31-07-22	1/

In [16]: df_bookings = df_bookings[df_bookings.no_guests > 0]
 df_bookings

Out[16]:		booking_id	property_id	booking_date	check_in_date	checkout_
	1	May012216558RT12	16558	30-04-22	1/5/2022	2/5,
	2	May012216558RT13	16558	28-04-22	1/5/2022	4/5,
	4	May012216558RT15	16558	27-04-22	1/5/2022	2/5,
	5	May012216558RT16	16558	1/5/2022	1/5/2022	3/5,
	6	May012216558RT17	16558	28-04-22	1/5/2022	6/5,
	134584	Jul312217564RT45	17564	30-07-22	31-07-22	1/8,
	134585	Jul312217564RT46	17564	29-07-22	31-07-22	3/8,
	134587	Jul312217564RT48	17564	30-07-22	31-07-22	2/8,
	134588	Jul312217564RT49	17564	29-07-22	31-07-22	1/8,
	134589	Jul312217564RT410	17564	31-07-22	31-07-22	1/8,
		ows × 12 columns				
In [17]:	_	ngs = df_bookings[c ngs.shape	df_bookings.n	o_guests > 0]		
Out[17]:	(134578,	12)				
In [18]:	df_booki	ngs.revenue_generat	ced.min().ite	m(), df_bookin	gs.revenue_gene	rated.max(
Out[18]:	(6500, 2	8560000)				
In [19]:	avg, std	= df_bookings.reve	enue_generate	d.mean().item(), df_bookings.	revenue_ge
In [20]:	avg, std					
Out[20]:	(15378.0	36937686695, 93040.	1549314641)			
In [21]:	higher_l	<pre>imit = avg + 3*std imit</pre>				
Out[21]:	294498.5	0173207896				
In [22]:	lower_li lower_li	mit = avg - 3*std mit				
Out[22]:	-263742.	4278567056				
In [23]:	df_booki	ngs[df_bookings.rev	/enue_generat	ed > higher_li	mit]	

Out[23]:		booking_id	property_id	booking_date	check_in_date	checkou				
	2	May012216558RT13	16558	28-04-22	1/5/2022	4/				
	111	May012216559RT32	16559	29-04-22	1/5/2022	2/				
	315	May012216562RT22	16562	28-04-22	1/5/2022	4/				
	562	May012217559RT118	17559	26-04-22	1/5/2022	2/				
	129176	Jul282216562RT26	16562	21-07-22	28-07-22	29				
In [24]:	_	<pre>df_bookings = df_bookings[df_bookings.revenue_generated < higher_limit] df_bookings.shape</pre>								
Out[24]:	(134573, 12)									
In [25]:	df_booki	<pre>df_bookings.revenue_realized.describe()</pre>								
Out[25]:	mean std min 25% 50% 75% max	134573.000000 12695.983585 6927.791692 2600.000000 7600.000000 11700.000000 15300.000000 45220.000000	oe: float64							
In [26]:		<pre>imit = df_bookings.r imit.item()</pre>	revenue_reali	zed.mean() + 3	*df_bookings.re	venue_rea				
Out[26]:	33479.35	8661845814								
In [27]:	df_booki	ngs[df_bookings.reve	enue_realized	> higher_limi	t]					

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		booking_id	property_id	booking_date	check_in_date	checkou
	137	May012216559RT41	16559	27-04-22	1/5/2022	7/.
	139	May012216559RT43	16559	1/5/2022	1/5/2022	2/
	143	May012216559RT47	16559	28-04-22	1/5/2022	3/
	149	May012216559RT413	16559	24-04-22	1/5/2022	7/
	222	May012216560RT45	16560	30-04-22	1/5/2022	3/
134	1328	Jul312219560RT49	19560	31-07-22	31-07-22	2/
134	4331	Jul312219560RT412	19560	31-07-22	31-07-22	1/
134	1467	Jul312219562RT45	19562	28-07-22	31-07-22	1/
134	1474	Jul312219562RT412	19562	25-07-22	31-07-22	6/
134	4581	Jul312217564RT42	17564	31-07-22	31-07-22	1/

1299 rows \times 12 columns

In [28]: df_rooms

Out[28]:

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

```
In [29]: df_bookings[df_bookings.room_category == 'RT4'].revenue_realized.describe()
```

```
16071.000000
Out[29]: count
         mean
                   23439.308444
         std
                    9048.599076
                    7600.000000
         min
         25%
                   19000.000000
         50%
                   26600.000000
         75%
                   32300.000000
                   45220.000000
         max
```

Name: revenue_realized, dtype: float64

```
In [30]: df_bookings.isnull().sum()
```

```
0
Out[30]: booking id
         property id
                                    0
         booking date
                                    0
         check in date
                                    0
         checkout date
                                    0
         no guests
                                    0
         room category
                                    0
         booking platform
                                    0
         ratings given
                               77897
         booking status
                                    0
         revenue generated
                                    0
         revenue realized
                                    0
         dtype: int64
```

Data Transformation

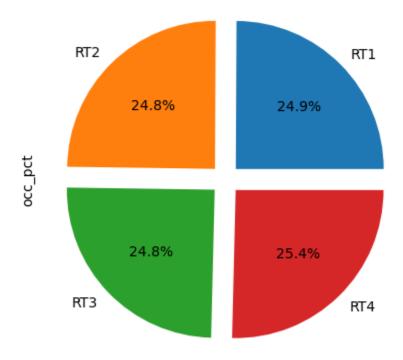
```
df agg bookings.head()
In [31]:
Out[31]:
            property_id check_in_date room_category successful_bookings capacity
          0
                  16559
                               1-May-22
                                                    RT1
                                                                           25
                                                                                   30.0
          1
                  19562
                               1-May-22
                                                    RT1
                                                                           28
                                                                                   30.0
         2
                  19563
                               1-May-22
                                                    RT1
                                                                           23
                                                                                   30.0
          3
                  17558
                               1-May-22
                                                    RT1
                                                                           30
                                                                                   19.0
          4
                               1-May-22
                                                    RT1
                                                                                   19.0
                  16558
                                                                           18
         df_agg_bookings['occ_pct'] = df_agg_bookings['successful_bookings']/df_agg_bookings
In [32]:
         df agg bookings.head()
In [33]:
            property id check in date room category successful bookings capacity
Out[33]:
         0
                  16559
                               1-May-22
                                                    RT1
                                                                           25
                                                                                   30.0
                                                                                         0.8
          1
                  19562
                               1-May-22
                                                    RT1
                                                                                   30.0
                                                                           28
                                                                                         0.9
         2
                                                                                   30.0 0.1
                  19563
                               1-May-22
                                                    RT1
                                                                           23
          3
                  17558
                               1-May-22
                                                    RT1
                                                                                   19.0 1.
                                                                           30
          4
                  16558
                               1-May-22
                                                    RT1
                                                                                   19.0 0.9
                                                                           18
In [34]: df agg bookings["occ pct"] = df agg bookings["occ pct"].apply(lambda x: round(
         df agg bookings.head(4)
```

Out[34]:		property_id	check_in_date	room_category	successful_bookings	capacity	oc
	0	16559	1-May-22	RT1	25	30.0	
	1	19562	1-May-22	RT1	28	30.0	
	2	19563	1-May-22	RT1	23	30.0	
	3	17558	1-May-22	RT1	30	19.0	1

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

In [35]: df_agg_bookings.groupby('room_category')['occ_pct'].mean().round(2).plot(kind

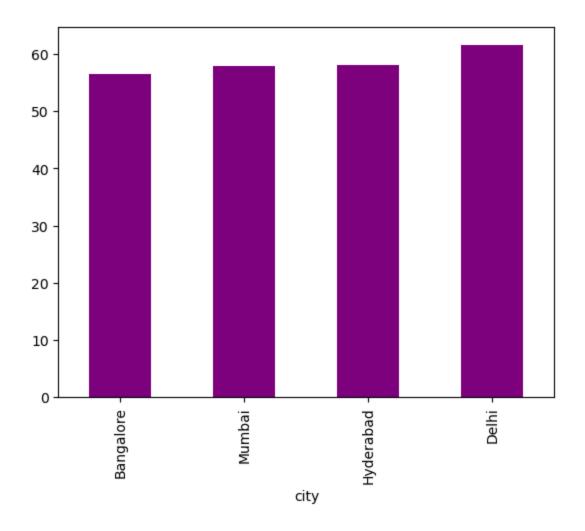
Out[35]: <Axes: ylabel='occ_pct'>



In [36]: df = pd.merge(df_agg_bookings, df_rooms, left_on = 'room_category', right_on =
 df.head(4)

Out[36]:		property_id	check_in_date	room_category	successful_bookings	capacity	oc
	0	16559	1-May-22	RT1	25	30.0	
	1	19562	1-May-22	RT1	28	30.0	
	2	19563	1-May-22	RT1	23	30.0	
	3	17558	1-May-22	RT1	30	19.0	1

```
In [37]: df.groupby('room class')['occ pct'].mean().round(2)
Out[37]: room class
                         58.04
         Elite
         Premium
                         58.03
                         59.30
         Presidential
         Standard
                         58.22
         Name: occ pct, dtype: float64
In [38]: df.drop('room id', axis = 1, inplace = True)
         df.head(4)
            property id check in date room category successful bookings capacity
Out[38]:
                                                                         25
                  16559
                              1-May-22
                                                   RT1
                                                                                 30.0
         1
                                                                         28
                                                                                 30.0
                  19562
                              1-May-22
                                                   RT1
         2
                  19563
                              1-May-22
                                                   RT1
                                                                         23
                                                                                 30.0
         3
                  17558
                              1-May-22
                                                   RT1
                                                                         30
                                                                                 19.0
         2. Print average occupancy rate per city
In [39]: df hotels.head(3)
            property id property name category
                                                      city
Out[39]:
         0
                  16558
                             Atliq Grands
                                            Luxury
                                                      Delhi
         1
                  16559
                             Atliq Exotica
                                            Luxury Mumbai
         2
                  16560
                                Atliq City
                                          Business
                                                      Delhi
In [40]: df = pd.merge(df, df hotels, on = 'property id')
         df.head(3)
            property_id check_in_date room_category successful_bookings capacity
Out[40]:
         0
                  16559
                              1-May-22
                                                   RT1
                                                                         25
                                                                                 30.0
         1
                  19562
                              1-May-22
                                                   RT1
                                                                         28
                                                                                 30.0
         2
                  19563
                              1-May-22
                                                   RT1
                                                                         23
                                                                                 30.0
In [41]: df.groupby('city')['occ pct'].mean().sort values().plot(kind = 'bar', color =
Out[41]: <Axes: xlabel='city'>
```



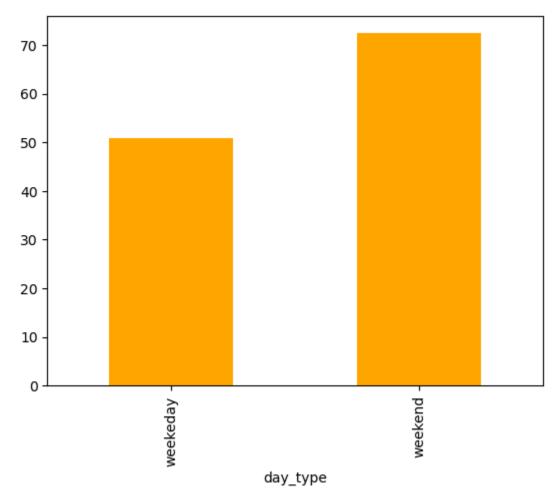
3. When was the occupancy better? Weekday or Weekend?

In [42]:	42]: df.head(3)										
Out[42]:		property_id	check_in_date	room_category	successful_bookings	capacity	oc				
	0	16559	1-May-22	RT1	25	30.0					
	1	19562	1-May-22	RT1	28	30.0					
	2	19563	1-May-22	RT1	23	30.0					
In [43]:		= pd.merge(d	If, df_date, le	ft_on = 'check_i	.n_date', right_on = '	'date')					

Out[43]:		property_id	check_in_date	room_category	successful_bookings	capacity	oc
	0	19563	10-May-22	RT3	15	29.0	
	1	18560	10-May-22	RT1	19	30.0	
	2	19562	10-May-22	RT1	18	30.0	

```
In [44]: df.groupby('day_type')['occ_pct'].mean().round(2).plot(kind = 'bar', color = '
```

Out[44]: <Axes: xlabel='day_type'>



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

```
In [45]: df['mmm yy'].unique()
Out[45]: array(['May 22', 'Jun 22', 'Jul 22'], dtype=object)
```

In [46]: df_june_22 = df[df['mmm yy'] == 'Jun 22']
df_june_22

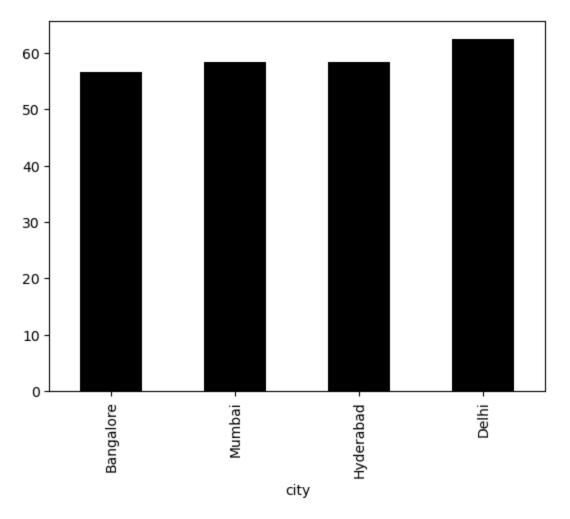
Out[46]:

	property_id	check_in_date	room_category	successful_bookings	capacity
2200	16559	10-Jun-22	RT1	20	30.0
2201	19562	10-Jun-22	RT1	19	30.0
2202	19563	10-Jun-22	RT1	17	30.0
2203	17558	10-Jun-22	RT1	9	19.0
2204	16558	10-Jun-22	RT1	11	19.0
4295	17562	30-Jun-22	RT4	3	6.0
4296	19563	30-Jun-22	RT4	3	6.0
4297	16560	30-Jun-22	RT4	3	7.0
4298	19558	30-Jun-22	RT4	3	7.0
4299	17561	30-Jun-22	RT4	3	4.0

2100 rows × 14 columns

In [47]: df_june_22.groupby('city')['occ_pct'].mean().round(2).sort_values().plot(kind

Out[47]: <Axes: xlabel='city'>



In [48]: df_august = pd.read_csv('new_data_august.csv')
 df_august.head(3)

Out[48]:		property_id	property_name	category	city	room_category	room_class
	0	16559	Atliq Exotica	Luxury	Mumbai	RT1	Standard
	1	19562	Atliq Bay	Luxury	Bangalore	RT1	Standard
	2	19563	Atliq Palace	Business	Bangalore	RT1	Standard

In [51]: df_august.shape

Out[51]: (7, 13)

In [52]: df.shape

Out[52]: (6500, 14)

In [53]: latest_df = pd.concat([df, df_august], ignore_index = True, axis = 0)
latest_df.tail(4)

Out[53]:

	property_id	check_in_date	room_category	successful_bookings	capacity
6503	19558	01-Aug-22	RT1	30	40.0
6504	19560	01-Aug-22	RT1	20	26.0
6505	17561	01-Aug-22	RT1	18	26.0
6506	17564	01-Aug-22	RT1	10	16.0

In [54]: latest_df.shape

Out[54]: (6507, 15)

5. Print revenue realized per city

In [55]: df bookings.head(4)

Out[55]: booking_id property_id booking_date check_in_date checkout_date **1** May012216558RT12 16558 30-04-22 1/5/2022 2/5/2022 **4** May012216558RT15 16558 27-04-22 1/5/2022 2/5/2022 **5** May012216558RT16 16558 1/5/2022 1/5/2022 3/5/2022 **6** May012216558RT17 28-04-22 6/5/2022 16558 1/5/2022

In [56]: df_hotels.head(3)

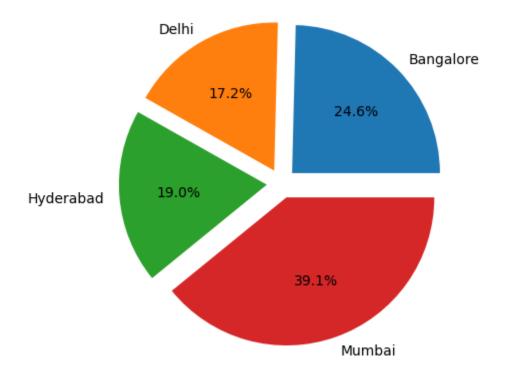
Out[56]:	property_id		property_name	category	city
	0	16558	Atliq Grands	Luxury	Delhi
	1	16559	Atliq Exotica	Luxury	Mumbai
	2	16560	Atliq City	Business	Delhi

In [57]: df_bookings_all = pd.merge(df_bookings, df_hotels, on = 'property_id')
 df_bookings_all.head(3)

Out[57]:	booking_id		property_id	booking_date	check_in_date	checkout_date
	0	May012216558RT12	16558	30-04-22	1/5/2022	2/5/2022
	1	May012216558RT15	16558	27-04-22	1/5/2022	2/5/2022
	2	May012216558RT16	16558	1/5/2022	1/5/2022	3/5/2022

In [58]: df_bookings_all.groupby('city')['revenue_realized'].sum().plot(kind = 'pie', y

Out[58]: <Axes: >



6. Print month by month revenue

In [59]: df_bookings_all.head(3)

```
booking id property id booking date check in date checkout date
Out[59]:
         0 May012216558RT12
                                                 30-04-22
                                    16558
                                                               1/5/2022
                                                                               2/5/2022
         1 May012216558RT15
                                    16558
                                                 27-04-22
                                                               1/5/2022
                                                                               2/5/2022
         2 May012216558RT16
                                    16558
                                                 1/5/2022
                                                               1/5/2022
                                                                               3/5/2022
         df date['mmm yy'].unique()
Out[60]: array(['May 22', 'Jun 22', 'Jul 22'], dtype=object)
         df date.head(3)
In [61]:
                 date mmm yy week no day_type
Out[61]:
         0 01-May-22
                        May 22
                                    W 19
                                           weekend
         1 02-May-22
                         May 22
                                    W 19
                                          weekeday
         2 03-May-22
                        May 22
                                    W 19 weekeday
         pd.merge(df bookings all, df date, left on = 'check in date', right on = 'date
In [62]:
Out[62]:
           booking_id property_id booking_date check_in_date checkout_date no gues
In [63]:
         df_bookings_all.info()
       <class 'pandas.core.frame.DataFrame'>
       RangeIndex: 134573 entries, 0 to 134572
       Data columns (total 15 columns):
             Column
                                Non-Null Count
                                                 Dtype
        - - -
                                                 ----
         0
             booking id
                                134573 non-null
                                                 object
         1
             property id
                                134573 non-null
                                                 int64
         2
             booking_date
                                134573 non-null
                                                 object
         3
             check in date
                                134573 non-null
                                                 object
         4
             checkout date
                                134573 non-null
                                                 object
         5
                                134573 non-null
                                                 float64
             no guests
         6
             room category
                                134573 non-null
                                                 object
         7
             booking_platform
                                134573 non-null
                                                 object
         8
             ratings_given
                                56676 non-null
                                                 float64
         9
             booking status
                                134573 non-null
                                                 object
         10 revenue generated 134573 non-null
                                                 int64
         11
             revenue_realized
                                134573 non-null
                                                 int64
         12
            property name
                                134573 non-null
                                                 object
         13
            category
                                134573 non-null
                                                 object
         14
            city
                                134573 non-null
                                                 object
        dtypes: float64(2), int64(3), object(10)
       memory usage: 15.4+ MB
```

```
In [64]: df_date.info()
       <class 'pandas.core.frame.DataFrame'>
       RangeIndex: 92 entries, 0 to 91
       Data columns (total 4 columns):
            Column
                     Non-Null Count Dtvpe
            -----
                     -----
        0
            date
                     92 non-null
                                     object
        1 mmm yy 92 non-null
                                   object
        2
            week no 92 non-null
                                    object
        3
            day type 92 non-null
                                    object
       dtypes: object(4)
       memory usage: 3.0+ KB
In [65]: df date['date'] = pd.to datetime(df date['date'])
        df date.head(3)
       C:\Users\sheri\AppData\Local\Temp\ipykernel 11820\248606528.py:1: UserWarning:
       Could not infer format, so each element will be parsed individually, falling ba
       ck to `dateutil`. To ensure parsing is consistent and as-expected, please speci
       fy a format.
         df_date['date'] = pd.to_datetime(df_date['date'])
Out[65]:
                 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 [66]: df_date.info()
       <class 'pandas.core.frame.DataFrame'>
       RangeIndex: 92 entries, 0 to 91
       Data columns (total 4 columns):
                     Non-Null Count Dtype
            Column
       - - -
            -----
                         -----
                     92 non-null
        0
            date
                                     datetime64[ns]
        1
                     92 non-null
                                    object
            mmm yy
                     92 non-null
        2
                                     object
            week no
            day type 92 non-null
                                     object
       dtypes: datetime64[ns](1), object(3)
       memory usage: 3.0+ KB
In [67]:
        df_bookings_all['check_in_date'] = pd.to_datetime(
            df bookings all['check in date'],
            format='%d-%m-%y', # day-month-2digit year
            errors='coerce'
         df_bookings_all.head(4)
```

```
booking id property id booking date check in date checkout date
Out[67]:
         0 May012216558RT12
                                     16558
                                                 30-04-22
                                                                    NaT
                                                                               2/5/2022
         1 May012216558RT15
                                     16558
                                                 27-04-22
                                                                    NaT
                                                                               2/5/2022
         2 May012216558RT16
                                     16558
                                                 1/5/2022
                                                                    NaT
                                                                               3/5/2022
         3 May012216558RT17
                                     16558
                                                 28-04-22
                                                                               6/5/2022
                                                                    NaT
         df_bookings_all.info()
In [68]:
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 134573 entries, 0 to 134572
        Data columns (total 15 columns):
             Column
                                Non-Null Count
                                                 Dtype
        - - -
         0
             booking_id
                                134573 non-null
                                                 object
         1
             property id
                                134573 non-null
                                                 int64
             booking date
         2
                                134573 non-null
                                                 object
         3
             check in date
                                78783 non-null
                                                 datetime64[ns]
         4
             checkout date
                                134573 non-null
                                                 object
         5
             no guests
                                134573 non-null
                                                 float64
         6
             room_category
                                134573 non-null
                                                 object
         7
             booking_platform
                                134573 non-null
                                                 object
         8
             ratings given
                                56676 non-null
                                                 float64
             booking status
         9
                                134573 non-null
                                                 object
         10 revenue_generated 134573 non-null
                                                 int64
         11
             revenue_realized
                                134573 non-null
                                                 int64
         12
            property_name
                                134573 non-null
                                                 object
         13
            category
                                134573 non-null
                                                 object
            city
                                134573 non-null
                                                 object
         14
        dtypes: datetime64[ns](1), float64(2), int64(3), object(9)
       memory usage: 15.4+ MB
In [69]: df bookings all = pd.merge(df bookings all, df date, left on = 'check in date'
         df bookings all.head(3)
Out[69]:
                   booking_id property_id booking_date check_in_date checkout_date
         0 May132216558RT11
                                                10/5/2022
                                                             2022-05-13
                                     16558
                                                                               15-05-22
         1 May132216558RT12
                                     16558
                                                 9/5/2022
                                                             2022-05-13
                                                                               14-05-22
                                                                               14-05-22
         2 May132216558RT13
                                     16558
                                                 9/5/2022
                                                             2022-05-13
         df bookings all.groupby('mmm yy')['revenue realized'].sum()
In [70]:
```

