```
In [1]: import pandas as pd
         from pandasai import SmartDataframe
         from pandasai.llm import OpenAI
 In [2]: import numpy as np
         import matplotlib.pyplot as plt
         from sklearn.tree import DecisionTreeRegressor, export text
         from sklearn.model_selection import train_test_split
         from sklearn.metrics import mean_squared_error
In [3]: from sklearn.metrics import r2_score
         from sklearn.model_selection import GridSearchCV
In [59]: !jupyter nbconvert --to webpdf openAI - Project_Final.ipynb
        [NbConvertApp] WARNING | pattern '-' matched no files
        [NbConvertApp] Converting notebook openAI.ipynb to webpdf
        C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python310\lib\site-packages\nbco
        nvert\filters\highlight.py:71: UserWarning: IPython3 lexer unavailable, falling back
        on Python 3
          return _pygments_highlight(
        [NbConvertApp] WARNING | Alternative text is missing on 1 image(s).
        [NbConvertApp] Building PDF
        [NbConvertApp] PDF successfully created
        [NbConvertApp] Writing 169213 bytes to openAI.pdf
        [NbConvertApp] Converting notebook Project_Final.ipynb to webpdf
        [NbConvertApp] WARNING | Alternative text is missing on 15 image(s).
        [NbConvertApp] Building PDF
        [NbConvertApp] PDF successfully created
        [NbConvertApp] Writing 527785 bytes to Project_Final.pdf
```

### 1 - Load and preview dataset

```
In [5]: house_price = pd.read_csv('Real_estate _1.csv')
house_price.head()
```

Out	5	]	:

	No	X1 transaction date	X2 house age	X3 distance to the nearest MRT station	X4 number of convenience stores	X5 latitude	X6 longitude	Y house price of unit area
0	1	2012.917	32.0	84.87882	10	24.98298	121.54024	37.9
1	2	2012.917	19.5	306.59470	9	24.98034	121.53951	42.2
2	3	2013.583	13.3	561.98450	5	24.98746	121.54391	47.3
3	4	2013.500	13.3	561.98450	5	24.98746	121.54391	54.8
4	5	2012.833	5.0	390.56840	5	24.97937	121.54245	43.1

```
In [6]: llm = OpenAI(api_token="sk-proj-KtQvt_jEawaTmmBFpqxRE5fXxd7dTJfPGgsmwGYJpNW19XAv3cH
    house_price = SmartDataframe(house_price, config ={"llm": llm})
In [7]: # Checking the shape of dataset.
    house_price.chat('how many rows and columns are in the dataset?')
    {'type': 'string', 'value': 'The dataset contains 414 rows and 8 columns.'}
Out[7]: 'The dataset contains 414 rows and 8 columns.'
```

### **Data cleaning and Preparation**

In [8]: # Fixing inconsistent formatting
house\_price.chat('in column names replace whitespaces to "\_" and change uppercase t

ut[8]:		no	x1_transaction_date	x2_house_age	$x3\_distance\_to\_the\_nearest\_mrt\_station$	x4_nu
	0	1	2012.917	32.0	84.87882	
	1	2	2012.917	19.5	306.59470	
	2	3	2013.583	13.3	561.98450	
	3	4	2013.500	13.3	561.98450	
	4	5	2012.833	5.0	390.56840	
	•••			•••		
	409	410	2013.000	13.7	4082.01500	
	410	411	2012.667	5.6	90.45606	
	411	412	2013.250	18.8	390.96960	
	412	413	2013.000	8.1	104.81010	
	413	414	2013.500	6.5	90.45606	

414 rows × 8 columns

```
In [9]: # Rename 'no' column to 'transaction_id'
house_price.chat('Rename "no" to "Transaction_ID')
```

	0	1	2012.917	32.0	84.878	
	1	2	2012.917	19.5	306.594	
	2	3	2013.583	13.3	561.984	
	3	4	2013.500	13.3	561.984	
	4	5	2012.833	5.0	390.568	
	•••					
	409	410	2013.000	13.7	4082.015	
	410	411	2012.667	5.6	90.456	
	411	412	2013.250	18.8	390.969	
	412	413	2013.000	8.1	104.810	
	413	414	2013.500	6.5	90.456	
In [10]:		or missing va	lues in each col			
Out[10]:	house_price.chat('is there a missing data in the dataset?')  'There is no missing data in the dataset.'					
In [12]:	<pre># Checking for duplicate rows house_price.chat('are the dublicates values in the dataset?')</pre>					
Out[12]:	'There are no duplicate rows in the dataset.'					
In [15]:	<pre># Checking for data types house_price.chat('what are the data types of values?')</pre>					
	1 2 3 x3_distance 4 x4_n	x1_tr _to_the_neare umber_of_conv	transaction_id ransaction_date x2_house_age est_mrt_station venience_stores x5_latitude x6_longitude ce_of_unit_area	<pre>int64 float64 float64 float64 int64 float64 float64 float64</pre>	Column Data Type	

Out[9]: transaction\_id x1\_transaction\_date x2\_house\_age x3\_distance\_to\_the\_nearest\_mrt\_static

```
Traceback (most recent call last):
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\chat\generate_chat_pipeline.py", line 335, in run
   ).run(input)
     ^^^^^
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\pipeline.py", line 137, in run
   raise e
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\pipeline.py", line 101, in run
   step_output = logic.execute(
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\chat\code_execution.py", line 133, in execute
   {"content_type": "response", "value": ResponseSerializer.serialize(result)},
                                       ^^^^^^
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\responses\response_serializer.py", line 27, in serialize
   df_dict = ResponseSerializer.serialize_dataframe(result["value"])
             ^^^^^^
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\responses\response_serializer.py", line 11, in serialize_dataframe
   json data = json.loads(df.to json(orient="split", date format="iso"))
                         ^^^^^^
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandas\util\_decorators.py", line 333, in wrapper
   return func(*args, **kwargs)
          ^^^^^^
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandas\core\generic.py", line 2721, in to_json
   return json.to_json(
          ^^^^^
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandas\io\json\_json.py", line 210, in to_json
   ).write()
     ^^^^^
 File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandas\io\json\_json.py", line 263, in write
   return ujson dumps(
          ^^^^^
OverflowError: Maximum recursion level reached
```

Out[15]: 'Unfortunately, I was not able to answer your question, because of the following e rror:\n\nMaximum recursion level reached\n'

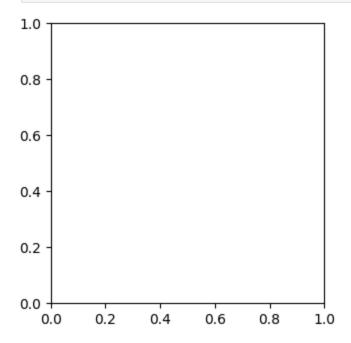
#### 2 - Data distribution and Outliers

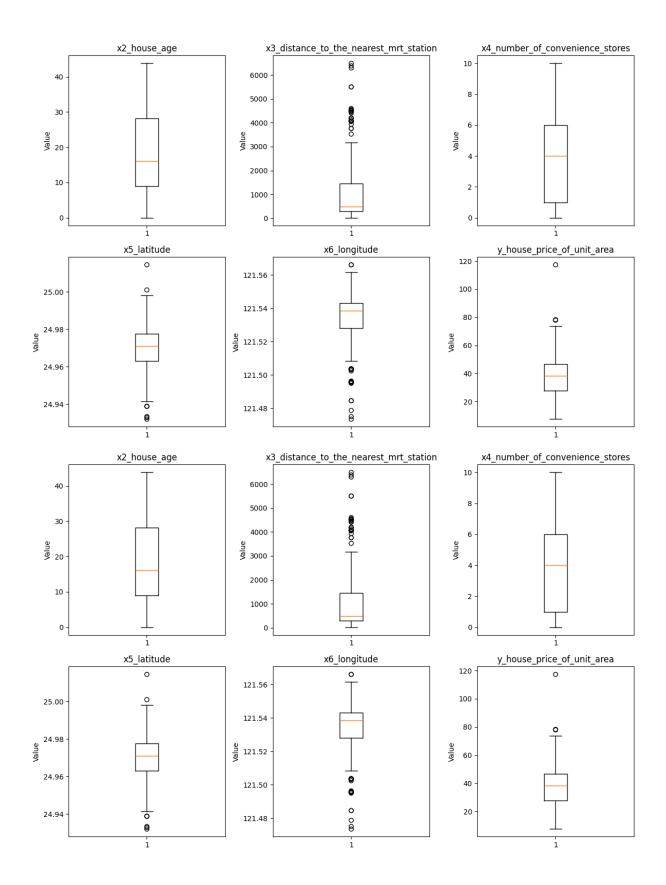
```
In [16]: # Checking Data Distribution
house_price.chat('Show data distribution of continuous data. show it in tables')
```

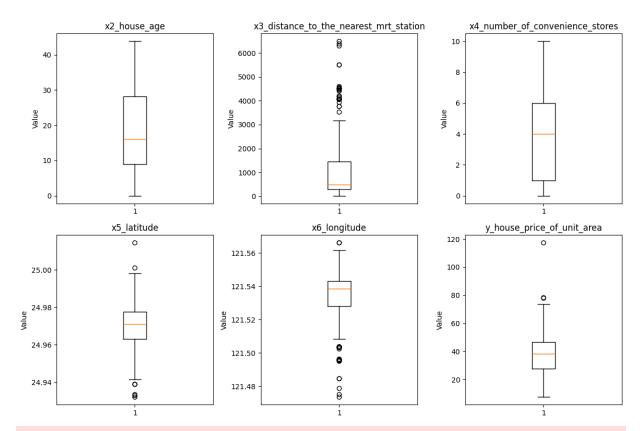
Out[16]: transac	ction_id x1_transaction_dat	e x2_house_age	$x3\_distance\_to\_the\_nearest\_mrt\_sta$
------------------	-----------------------------	----------------	--

	transaction_ia	x1_transaction_date	x=_nouse_uge	x5_aistance_to_the_nearest_init_sta
count	414.000000	414.000000	414.000000	414.00
mean	207.500000	2013.148971	17.712560	1083.88
std	119.655756	0.281967	11.392485	1262.10!
min	1.000000	2012.667000	0.000000	23.38
25%	104.250000	2012.917000	9.025000	289.32
50%	207.500000	2013.167000	16.100000	492.23
75%	310.750000	2013.417000	28.150000	1454.27
max	414.000000	2013.583000	43.800000	6488.02

In [17]: # Graphical representation of outliers to confirm outlier detection for "x3\_distanc
#And checking for potential outliers in other variables
house\_price.chat('display all outliers of dataset in boxplots')







Traceback (most recent call last):

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\chat\generate\_chat\_pipeline.py", line 335, in run

).run(input)

File "C:\Users\ $\ddot{O}$ RNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\pipeline.py", line 137, in run

raise e

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\pipeline.py", line 101, in run

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\chat\code\_execution.py", line 113, in execute

raise e

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\chat\code\_execution.py", line 85, in execute

result = self.execute\_code(code\_to\_run, code\_context)

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\chat\code\_execution.py", line 175, in execute\_code raise NoResultFoundError("No result returned")

pandasai.exceptions.NoResultFoundError: No result returned

Out[17]: 'Unfortunately, I was not able to answer your question, because of the following e rror:\n\nNo result returned\n'

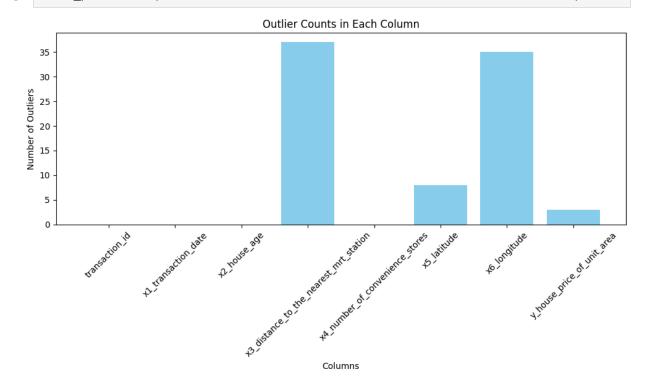
```
In [18]: #Count the outliers in each of the columns
house_price.chat('count outliers in each column')
```

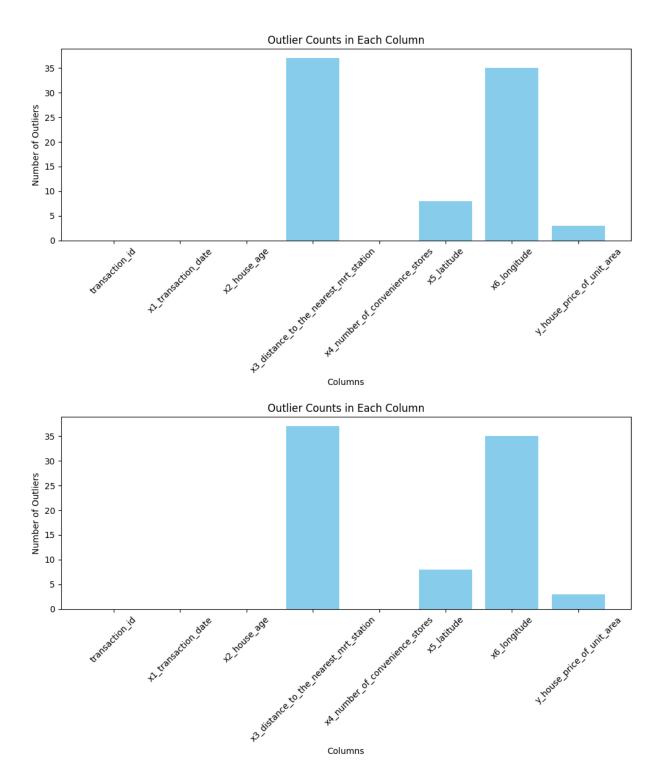
	Outlier Count
transaction_id	0
x1_transaction_date	0
x2_house_age	0
x3_distance_to_the_nearest_mrt_station	37
x4_number_of_convenience_stores	0
x5_latitude	8
x6_longitude	35
y_house_price_of_unit_area	3

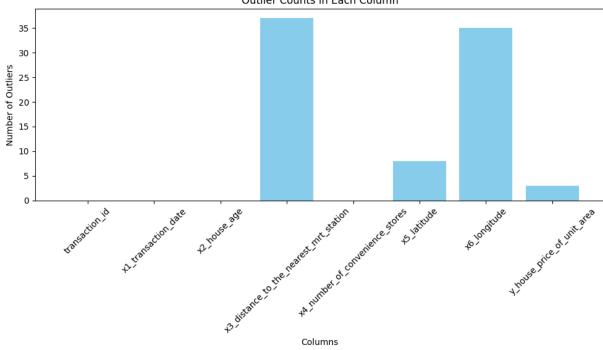
Out[18]: Outlier Count

transaction_id	0
x1_transaction_date	0
x2_house_age	0
x3_distance_to_the_nearest_mrt_station	37
x4_number_of_convenience_stores	0
x5_latitude	8
x6_longitude	35
y_house_price_of_unit_area	3

In [19]: house\_price.chat('count outliers in each column and show it in column bars')







```
Traceback (most recent call last):
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\chat\generate chat pipeline.py", line 335, in run
            ).run(input)
              ^^^^^
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\pipeline.py", line 137, in run
            raise e
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\pipeline.py", line 101, in run
            step_output = logic.execute(
                          ^^^^^
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\chat\code_execution.py", line 113, in execute
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\chat\code_execution.py", line 97, in execute
            raise InvalidOutputValueMismatch(
        pandasai.exceptions.InvalidOutputValueMismatch: Value type <class 'str'> must match
       with type plot
Out[19]: "Unfortunately, I was not able to answer your question, because of the following e
         rror:\n\nValue type <class 'str'> must match with type plot\n"
In [30]: house_price.chat('show 97th percentile of x3_distance_to_the_nearest_mrt_station co
        {'type': 'number', 'value': np.float64(4435.033050000001)}
Out[30]: np.float64(4435.033050000001)
In [20]: # Replacing "x3_distance_to_the_nearest_mrt_station" outliers with 97th percentile.
         house price chat('replace outliers in "x3 distance to the nearest mrt station" colu
```

Out[20]:		transaction_id	x1_transaction_date	x2_house_age	x3_distance_to_the_nearest_mrt_station
	0	1	2012.917	32.0	84.878
	1	2	2012.917	19.5	306.594
	2	3	2013.583	13.3	561.984
	3	4	2013.500	13.3	561.984
	4	5	2012.833	5.0	390.568
	•••				
	409	410	2013.000	13.7	4435.033
	410	411	2012.667	5.6	90.456
	411	412	2013.250	18.8	390.969
	412	413	2013.000	8.1	104.810
	413	414	2013.500	6.5	90.456

414 rows × 8 columns

In [31]: house\_price.chat('replace outliers in "x3\_distance\_to\_the\_nearest\_mrt\_station" colu

[3-]		_p: _cc. c(				
Out[31]:		transaction_id	x1_transaction_date	x2_house_age	x3_distance_to_the_nearest_mrt_station	
	0	1	2012.917	32.0	84.878	
	1	2	2012.917	19.5	306.594	
	2	3	2013.583	13.3	561.984	
	3	4	2013.500	13.3	561.984	
	4	5	2012.833	5.0	390.568	
	•••					
	409	410	2013.000	13.7	4435.033	
	410	411	2012.667	5.6	90.456	
	411	412	2013.250	18.8	390.969	
	412	413	2013.000	8.1	104.810	
	413	414	2013.500	6.5	90.456	

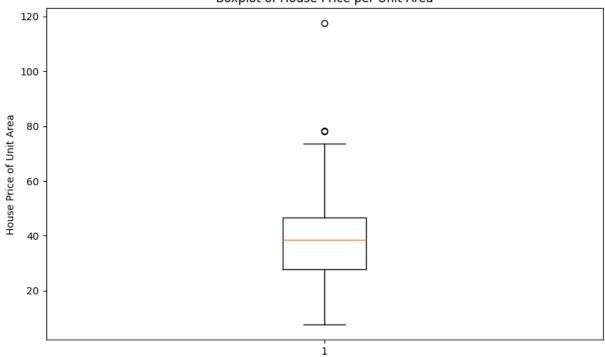
414 rows × 8 columns

In [38]: #Remove records with outliers in 'y\_house\_price\_of\_unit\_area' column
house\_price.chat('what are the outliers of the y\_house\_price\_of\_unit\_area column')

Out[38]:	transaction_id	x1_transaction_date	x2_house_age	x3_distance_to_the_nearest_mrt_static
----------	----------------	---------------------	--------------	---------------------------------------

220	221	2013.333	37.2	186.51
270	271	2013.333	10.8	252.58
312	313	2013.583	35.4	318.52

#### Boxplot of House Price per Unit Area



In [46]: # Removing 3 outliers from the "y\_house\_price\_of\_unit\_area" column.
# We can see that number of rows reduced to 411.
house\_price.chat('remove 3 outliers from the "y\_house\_price\_of\_unit\_area" ')

Out[46]:		transaction_id	x1_transaction_date	x2_house_age	x3_distance_to_the_nearest_mrt_station
	0	1	2012.917	32.0	84.878
	1	2	2012.917	19.5	306.594
	2	3	2013.583	13.3	561.984
	3	4	2013.500	13.3	561.984
	4	5	2012.833	5.0	390.568
	•••				
	409	410	2013.000	13.7	4435.033
	410	411	2012.667	5.6	90.456
	411	412	2013.250	18.8	390.969
	412	413	2013.000	8.1	104.810
	413	414	2013.500	6.5	90.456

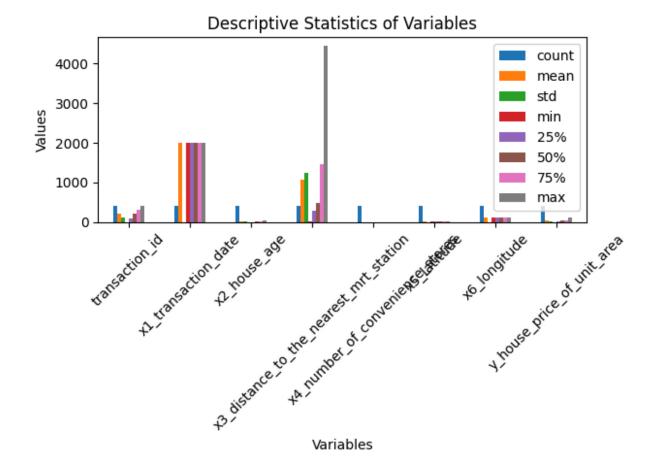
411 rows × 8 columns

## **Data Analysis for Data Understanding**

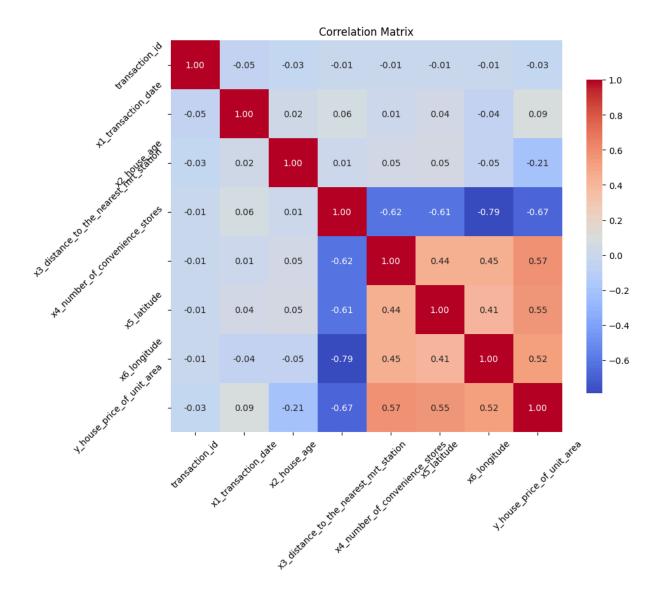
In [47]: # Display descriptive statistics of the variables
house\_price.chat('Display descriptive statistics of the variables')

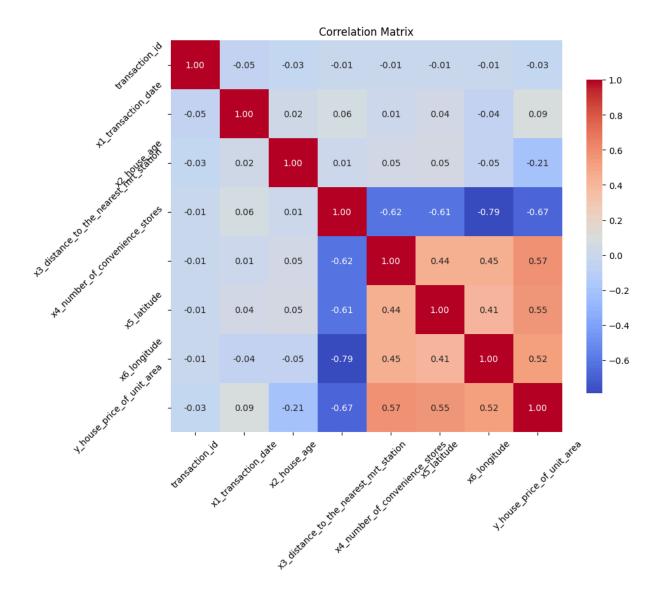
Out[47]:		transaction_id	x1_transaction_date	x2_house_age	x3_distance_to_the_nearest_mrt_sta
	count	414.000000	414.000000	414.000000	414.00
	mean	207.500000	2013.148971	17.712560	1084.77
	std	119.655756	0.281967	11.392485	1247.01
	min	1.000000	2012.667000	0.000000	23.38
	25%	104.250000	2012.917000	9.025000	289.32
	50%	207.500000	2013.167000	16.100000	492.23
	75%	310.750000	2013.417000	28.150000	1454.27
	max	414.000000	2013.583000	43.800000	4435.03

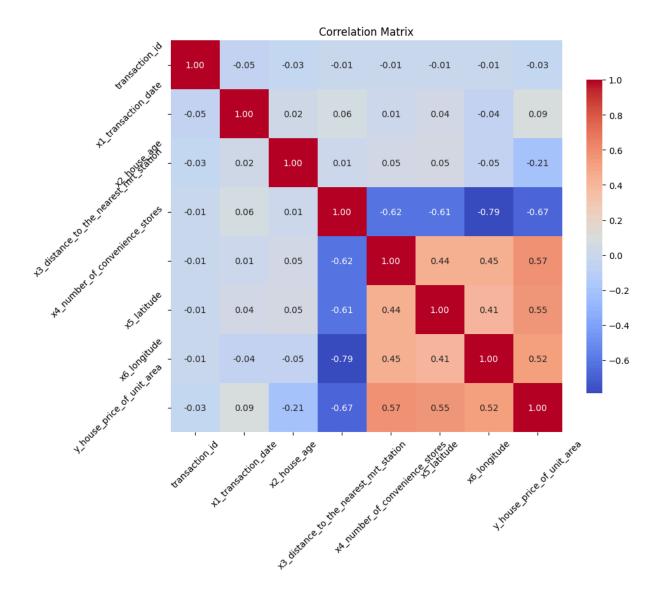
<Figure size 1000x600 with 0 Axes>

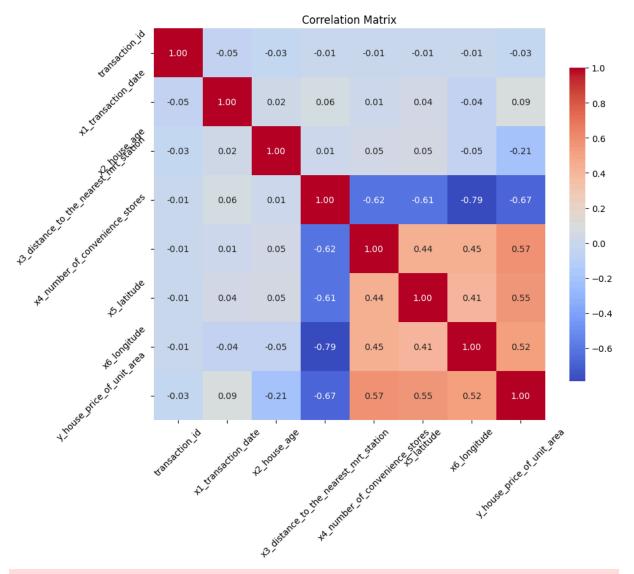


In [54]: # Generating and plotting the correlation matrix
house\_price.chat('Generate and plot the correlation matrix')









Traceback (most recent call last):

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\chat\generate\_chat\_pipeline.py", line 335, in run

).run(input)

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\pipeline.py", line 137, in run

raise e

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\pipeline.py", line 101, in run

step\_output = logic.execute(

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\chat\code\_execution.py", line 113, in execute raise e

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\chat\code\_execution.py", line 85, in execute

result = self.execute\_code(code\_to\_run, code\_context)

File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa ges\pandasai\pipelines\chat\code\_execution.py", line 175, in execute\_code raise NoResultFoundError("No result returned") pandasai.exceptions.NoResultFoundError: No result returned

Out[54]: 'Unfortunately, I was not able to answer your question, because of the following e rror:\n\nNo result returned\n'

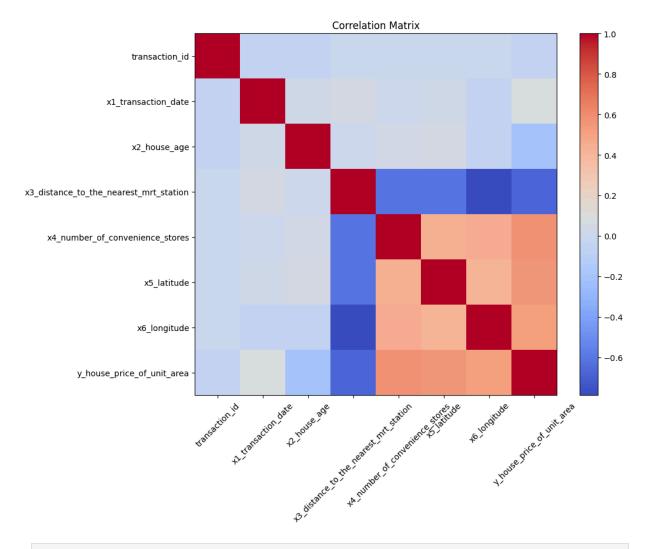
In [56]: house\_price.chat('is the a correlation amoung the variables?')

Out[56]: 'There is a significant correlation among the variables.'

In [57]: house\_price.chat('show this correlation in a table')

Out[57]: transaction\_id x1\_transaction\_date x2\_house\_age x

transaction_id	1.000000	-0.048658	-0.032808
x1_transaction_date	-0.048658	1.000000	0.017549
x2_house_age	-0.032808	0.017549	1.000000
x3_distance_to_the_nearest_mrt_station	-0.013341	0.060272	0.013843
x4_number_of_convenience_stores	-0.012699	0.009635	0.049593
x5_latitude	-0.010110	0.035058	0.054420
x6_longitude	-0.011059	-0.041082	-0.048520
y_house_price_of_unit_area	-0.028587	0.087491	-0.210567



In [ ]:

### 3 - Decision Tree Regression Model

### **Defining best predictors and Target**

		_	_
$\cap$	1 to 1	61	7 .
VL	<i>a</i> L I	UL	

#### y\_house\_price\_of\_unit\_area

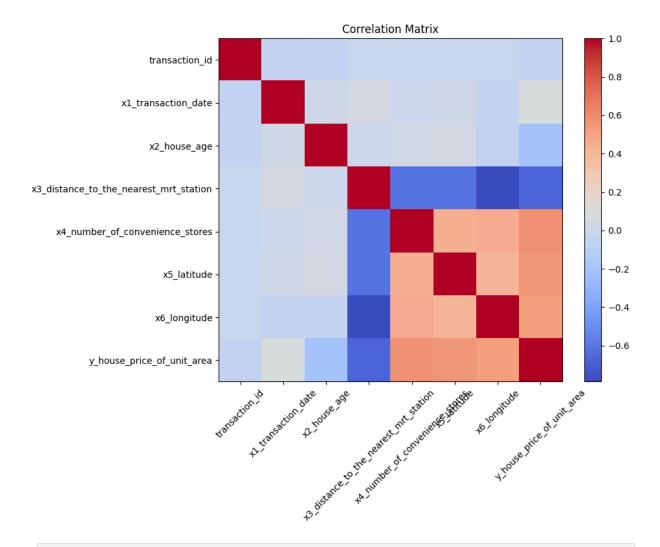
y_house_price_of_unit_area	1.000000
x4_number_of_convenience_stores	0.571005
x5_latitude	0.546307
x6_longitude	0.523287
x1_transaction_date	0.087491
transaction_id	-0.028587
x2_house_age	-0.210567
x3_distance_to_the_nearest_mrt_station	-0.673104

In [68]: # Defining the best predictors for the model.

house\_price.chat('which of them are the best predictors fot the house\_price\_of\_unit

#### Out[68]:

#### **Predictor Correlation with House Price 0** x3\_distance\_to\_the\_nearest\_mrt\_station -0.673104 x4\_number\_of\_convenience\_stores 0.571005 2 x5\_latitude 0.546307 3 x6\_longitude 0.523287



- In [69]: # Puting x3\_distance\_to\_the\_nearest\_mrt\_station, x4\_number\_of\_convenience\_stores, x
  house\_price.chat('define them as a best predictors')
- Out[69]: 'The best predictors for house price of unit area are: X2 house age, X3 distance t o the nearest MRT station, X4 number of convenience stores, X5 latitude, X6 longit ude.'
- In [90]: house\_price.chat('show values of "y house price of unit area" column')

```
Traceback (most recent call last):
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandas\core\indexes\base.py", line 3812, in get_loc
           return self. engine.get loc(casted kev)
                  ^^^^^^
         File "pandas/_libs/index.pyx", line 167, in pandas._libs.index.IndexEngine.get_loc
         File "pandas/_libs/index.pyx", line 196, in pandas._libs.index.IndexEngine.get_loc
         File "pandas/_libs/hashtable_class_helper.pxi", line 7088, in pandas._libs.hashtab
       le.PyObjectHashTable.get_item
         File "pandas/ libs/hashtable class helper.pxi", line 7096, in pandas. libs.hashtab
       le.PyObjectHashTable.get item
       KeyError: 'Y house price of unit area'
       The above exception was the direct cause of the following exception:
       Traceback (most recent call last):
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandasai\pipelines\chat\generate_chat_pipeline.py", line 335, in run
           ).run(input)
             ^^^^^
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandasai\pipelines\pipeline.py", line 137, in run
           raise e
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandasai\pipelines\pipeline.py", line 101, in run
           step_output = logic.execute(
                         ^^^^^^
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandasai\pipelines\chat\code execution.py", line 113, in execute
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandasai\pipelines\chat\code_execution.py", line 85, in execute
           result = self.execute code(code to run, code context)
                    ^^^^^^
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandasai\pipelines\chat\code_execution.py", line 171, in execute_code
           exec(code, environment)
         File "<string>", line 2, in <module>
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandas\core\frame.py", line 4107, in __getitem__
           indexer = self.columns.get_loc(key)
                     ^^^^^
         File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
       ges\pandas\core\indexes\base.py", line 3819, in get_loc
           raise KeyError(key) from err
       KeyError: 'Y house price of unit area'
Out[90]: "Unfortunately, I was not able to answer your question, because of the following e
         rror:\n\n'Y house price of unit area'\n"
```

In [ ]: # In my previous attempts pandasai displayed me an column of house\_price\_of\_unit\_ar

In [80]: # Putting House price of unit area under the name Target
# !!! Pandasai displays y\_hous\_price\_of\_unit\_area as it was before removing outli
house\_price.chat('define this column as a Target')

# Spliting dataset into training and validation dataset.

```
In [120...
         house_price.chat('crate new dataframe that consists of target and best predictors'
         Index(['transaction_id', 'x1_transaction_date', 'x2_house_age',
                'x3_distance_to_the_nearest_mrt_station',
                'x4_number_of_convenience_stores', 'x5_latitude', 'x6_longitude',
                'y_house_price_of_unit_area'],
               dtype='object')
         Index(['transaction_id', 'x1_transaction_date', 'x2_house_age',
                'x3_distance_to_the_nearest_mrt_station',
                'x4_number_of_convenience_stores', 'x5_latitude', 'x6_longitude',
                'y_house_price_of_unit_area'],
               dtype='object')
         Index(['transaction_id', 'x1_transaction_date', 'x2_house_age',
                'x3_distance_to_the_nearest_mrt_station',
                'x4_number_of_convenience_stores', 'x5_latitude', 'x6_longitude',
                'y_house_price_of_unit_area'],
               dtype='object')
```

```
Traceback (most recent call last):
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\chat\generate_chat_pipeline.py", line 335, in run
             ).run(input)
              ^^^^^
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\pipeline.py", line 137, in run
             raise e
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\pipeline.py", line 101, in run
             step output = logic.execute(
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\chat\code_execution.py", line 113, in execute
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\chat\code execution.py", line 85, in execute
             result = self.execute code(code to run, code context)
                     ^^^^^^
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandasai\pipelines\chat\code_execution.py", line 171, in execute_code
             exec(code, environment)
          File "<string>", line 2, in <module>
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandas\core\frame.py", line 4113, in __getitem_
             indexer = self.columns._get_indexer_strict(key, "columns")[1]
                      ^^^^^^
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandas\core\indexes\base.py", line 6212, in _get_indexer_strict
             self._raise_if_missing(keyarr, indexer, axis_name)
          File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
        ges\pandas\core\indexes\base.py", line 6261, in _raise_if_missing
             raise KeyError(f"None of [{key}] are in the [{axis_name}]")
        KeyError: "None of [Index(['X2 house age', 'X3 distance to the nearest MRT statio
                    'X4 number of convenience stores', 'X5 latitude', 'X6 longitude'],\n
        dtype='object')] are in the [columns]"
Out[120...
          'Unfortunately, I was not able to answer your question, because of the following e
          rror:\n\n"None of [Index([\'X2 house age\', \'X3 distance to the nearest MRT stati
          on\',\\n
                         \'X4 number of convenience stores\', \'X5 latitude\', \'X6 longitud
                        dtype=\'object\')] are in the [columns]"\n'
          e\'],\\n
In [118...
         house_price.chat('split target and best predictors into training and validation dat
        Index(['transaction_id', 'x1_transaction_date', 'x2_house_age',
                'x3 distance to the nearest mrt station',
                'x4_number_of_convenience_stores', 'x5_latitude', 'x6_longitude',
                'y_house_price_of_unit_area'],
              dtype='object')
```

```
Traceback (most recent call last):
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\chat\generate_chat_pipeline.py", line 335, in run
    ).run(input)
     ^^^^^
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\pipeline.py", line 137, in run
    raise e
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\pipeline.py", line 101, in run
    step output = logic.execute(
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\chat\code_execution.py", line 113, in execute
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\chat\code execution.py", line 85, in execute
    result = self.execute code(code to run, code context)
            ^^^^^^
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandasai\pipelines\chat\code_execution.py", line 171, in execute_code
    exec(code, environment)
  File "<string>", line 3, in <module>
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandas\core\frame.py", line 4113, in __getitem_
    indexer = self.columns._get_indexer_strict(key, "columns")[1]
             ^^^^^^
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandas\core\indexes\base.py", line 6212, in _get_indexer_strict
    self._raise_if_missing(keyarr, indexer, axis_name)
  File "C:\Users\ÖRNEK AİLESİ\AppData\Local\Programs\Python\Python312\Lib\site-packa
ges\pandas\core\indexes\base.py", line 6261, in _raise_if_missing
    raise KeyError(f"None of [{key}] are in the [{axis_name}]")
KeyError: "None of [Index(['X2 house age', 'X3 distance to the nearest MRT statio
           'X4 number of convenience stores', 'X5 latitude', 'X6 longitude'],\n
dtype='object')] are in the [columns]"
 'Unfortunately, I was not able to answer your question, because of the following e
 rror:\n\n"None of [Index([\'X2 house age\', \'X3 distance to the nearest MRT stati
```

Out[118... 'Unfortunately, I was not able to answer your question, because of the following e rror:\n\n"None of [Index([\'X2 house age\', \'X3 distance to the nearest MRT stati on\',\\n \'X4 number of convenience stores\', \'X5 latitude\', \'X6 longitud e\'],\\n dtype=\'object\')] are in the [columns]"\n'