```
In [123... # video - google drive link
          # https://drive.google.com/file/d/1Bk-fU02NyAwYkYU4Zogcq_IEdseUug7Z/view?usp=sharing
          import pandas as pd
          # Load dataset
          df = pd.read_excel("FEV-data-Excel-cleaned.xlsx")
          # info
          # print("Dataset shape:", df.shape)
          # print("\nColumn names:", df.columns.tolist())
          # print("\nFirst 5 rows:")
          print(df.head())
          # Check missing values
          # print("\nMissing values:")
          # print(df.isnull().sum())
                               Car full name Make
                                                                           Model \
         0
                      Audi e-tron 55 quattro Audi
                                                               e-tron 55 quattro
         1
                      Audi e-tron 50 quattro Audi
                                                               e-tron 50 quattro
                       Audi e-tron S quattro Audi
                                                                e-tron S quattro
            Audi e-tron Sportback 50 quattro Audi e-tron Sportback 50 quattro
           Audi e-tron Sportback 55 quattro Audi e-tron Sportback 55 quattro
            Minimal price (gross) [PLN] Engine power [KM]
                                                             Maximum torque [Nm]
         0
                                 345700
                                                        360
         1
                                                                             540
                                 308400
                                                        313
         2
                                 414900
                                                        503
                                                                             973
         3
                                 319700
                                                        313
                                                                             540
                                 357000
         4
                                                        360
                                                                             664
                 Type of brakes Drive type Battery capacity [kWh] Range (WLTP) [km] \
            disc (front + rear)
                                       4WD
                                                               95.0
                                                                                   438
            disc (front + rear)
                                       4WD
                                                               71.0
                                                                                   340
            disc (front + rear)
                                       4WD
                                                               95.0
                                                                                   364
           disc (front + rear)
                                       4WD
                                                               71.0
                                                                                   346
           disc (front + rear)
                                                               95.0
                                       4WD
                                                                                   447
                 Permissable gross weight [kg]
                                                Maximum load capacity [kg] \
         0
                                           3130
            . . .
                                                                        640
         1
                                           3040
                                                                        670
           . . .
         2
                                           3130
                                                                        565
           . . .
         3
                                           3040
                                                                        640
            . . .
                                           3130
                                                                        670
         4
            Number of seats Number of doors Tire size [in]
                                                               Maximum speed [kph]
         0
                          5
                                           5
                                                           19
                                                                               200
                          5
                                           5
                                                                               190
         1
                                                           19
                          5
         2
                                           5
                                                           20
                                                                               210
         3
                          5
                                            5
                                                           19
                                                                               190
         4
                          5
                                            5
                                                           19
                                                                               200
            Boot capacity (VDA) [1]
                                     Acceleration 0-100 kph [s] \
         0
                                                             5.7
                                 660
         1
                                660
                                                             6.8
         2
                                660
                                                             4.5
         3
                                 615
                                                             6.8
                                 615
                                                             5.7
            Maximum DC charging power [kW]
                                            mean - Energy consumption [kWh/100 km]
         0
                                       150
         1
                                       150
                                                                              23.80
         2
                                       150
                                                                              27.55
         3
                                       150
                                                                              23.30
         [5 rows x 25 columns]
In [125... # Task 1: A customer has a budget of 350,000 PLN and wants an EV with a minimum range
          # of 400 km.
          # a) Your task is to filter out EVs that meet these criteria.(2 Marks)
          filtered_df = df[(df['Minimal price (gross) [PLN]'] <= 350000) & (df['Range (WLTP) [km]'] >= 400)]
          # b) Group them by the manufacturer (Make).(6 marks)
          # Group by manufacturer (Make)
          grouped = filtered_df.groupby('Make')
          # c) Calculate the average battery capacity for each manufacturer. (8 Marks)
          # Calculate average battery capacity per manufacturer
          average_battery_capacity = grouped['Battery capacity [kWh]'].mean()
          # Display the result
          average_battery_capacity
```

```
Out[125...
          Make
           Audi
                            95.000000
                            80.000000
           BMW
                            64.000000
           Hyundai
                            64.000000
           Kia
           Mercedes-Benz
                            80.000000
           Tesla
                            68.000000
                            70.666667
           Volkswagen
           Name: Battery capacity [kWh], dtype: float64
In [127... # Task 2: You suspect some EVs have unusually high or low energy consumption. Find the
          # outliers in the mean - Energy consumption [kWh/100 km] column.(16 Marks)
          import pandas as pd
          import numpy as np
          from scipy.stats import norm
          # Mean and std of the energy consumption
          mu = df['mean - Energy consumption [kWh/100 km]'].mean()
          sigma = df['mean - Energy consumption [kWh/100 km]'].std()
          # Z-test for high outliers
          df['z_stat'] = (df['mean - Energy consumption [kWh/100 km]'] - mu) / sigma
          # cdf- Cumulative distribution function
          df['p_value'] = 1 - norm.cdf(df['z_stat']) # Right tail
          df['high_outlier'] = df['p_value'] < 0.05</pre>
          # Show only high outliers
          high_outliers = df[df['high_outlier']]
          high_outliers
Out[127...
                                 Minimal
                                                                                                                           Boot
```

Car **Engine Maximum** Range **Number Tire Maximum Acceleratio** Type Battery price Drive capacity full Make Model power capacity (WLTP) ... of size 0-100 kp torque of speed (VDA) (gross) type [kWh] doors [in] name [KM] [Nm] brakes [km] [kph] [: [PLN] [1]

0 rows × 28 columns

```
In [129... # Z-test for low outliers
    df['z_stat'] = (df['mean - Energy consumption [kWh/100 km]'] - mu) / sigma
    df['p_value'] = norm.cdf(df['z_stat']) # Left tail

# Flag low outliers at alpha = 0.05
    df['low_outlier'] = df['p_value'] < 0.05

# Show only low outliers
    low_outliers = df[df['low_outlier']]
    low_outliers</pre>
```

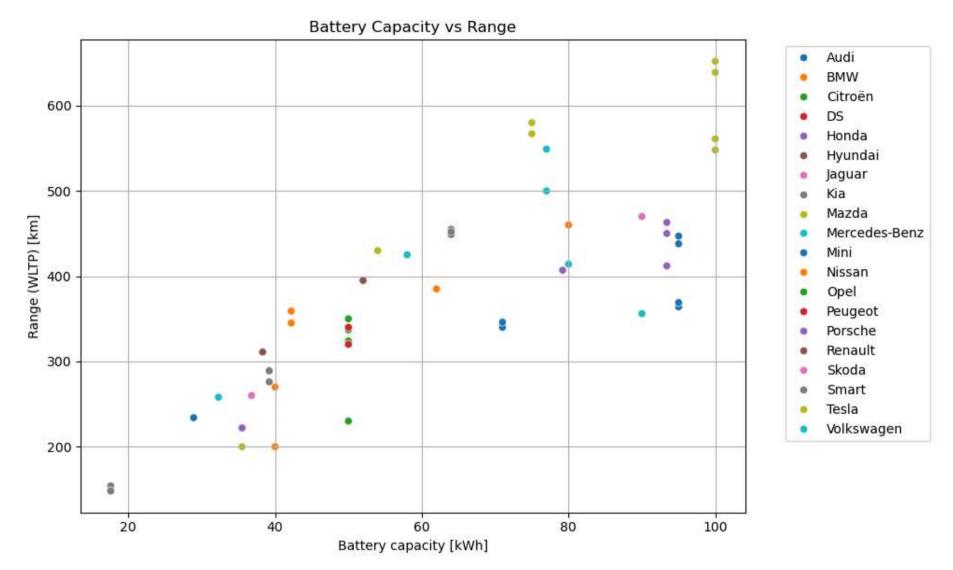
Out[129...

	Car full name	Make	Model	Minimal price (gross) [PLN]	Engine power [KM]	Maximum torque [Nm]	Type of brakes	Drive type	Battery capacity [kWh]	Range (WLTP) [km]	•••	Tire size [in]	Maximum speed [kph]	Boot capacity (VDA) [l]	Acce 0-
9	Citroën ë- C4	Citroën	ë-C4	125000	136	260	disc (front + rear)	2WD (front)	50.0	350		16	150	380	
29	Peugeot e- 2008	Peugeot	e-2008	149400	136	260	disc (front + rear)	2WD (front)	50.0	320		16	150	434	
39	Tesla Model 3 Standard Range Plus	Tesla	Model 3 Standard Range Plus	195490	285	450	disc (front + rear)	2WD (rear)	54.0	430		18	225	425	
40	Tesla Model 3 Long Range	Tesla	Model 3 Long Range	235490	372	510	disc (front + rear)	4WD	75.0	580		18	233	425	
41	Tesla Model 3 Performance	Tesla	Model 3 Performance	260490	480	639	disc (front + rear)	4WD	75.0	567		20	261	425	
42	Tesla Model S Long Range Plus	Tesla	Model S Long Range Plus	368990	525	755	disc (front + rear)	4WD	100.0	652		19	250	745	
43	Tesla Model S Performance	Tesla	Model S Performance	443990	772	1140	disc (front + rear)	4WD	100.0	639		21	261	745	
44	Tesla Model X Long Range Plus	Tesla	Model X Long Range Plus	407990	525	755	disc (front + rear)	4WD	100.0	561		20	250	857	
45	Tesla Model X Performance	Tesla	Model X Performance	482990	772	1140	disc (front + rear)	4WD	100.0	548		20	261	857	

9 rows × 29 columns

```
In [131... # Task 3: Your manager wants to know if there's a strong relationship between battery
          # capacity and range.
          # a) Create a suitable plot to visualize.(8 Marks)
          # b) Highlight any insights.(8 Marks)
          import matplotlib.pyplot as plt
          import seaborn as sns
          plt.figure(figsize=(10, 6))
          sns.scatterplot(data=df, x='Battery capacity [kWh]', y='Range (WLTP) [km]', hue='Make', palette='tab10')
          plt.title('Battery Capacity vs Range')
          plt.xlabel('Battery capacity [kWh]')
          plt.ylabel('Range (WLTP) [km]')
          plt.legend(bbox_to_anchor=(1.05, 1), loc='upper left')
          plt.grid(True)
          plt.tight_layout()
          plt.show()
          # higher battery capacity result in longer ranges.
```

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# Task 4: Build an EV recommendation class. The class should allow users to input their
# budget, desired range, and battery capacity. The class should then return the top three EVs
# matching their criteria. (8+8 Marks)
class recommendEV:
    def __init__(self, data):
        self.data = data
    def recommend(self, budget, min_range, min_battery_capacity):
        filtered = self.data[
             (self.data['Minimal price (gross) [PLN]'] <= budget) &</pre>
             (self.data['Range (WLTP) [km]'] >= min_range) &
             (self.data['Battery capacity [kWh]'] >= min_battery_capacity)
        top_three = filtered.sort_values(by='Minimal price (gross) [PLN]').head(3)
         return top_three[['Make', 'Model', 'Minimal price (gross) [PLN]', 'Range (WLTP) [km]', 'Battery capacity [kWh]']]
# Example:
recommender = recommendEV(df)
recommender.recommend(budget=145490, min_range=200, min_battery_capacity=20)
```

Out[132...

	Make	Model	Minimal price (gross) [PLN]	Range (WLTP) [km]	Battery capacity [kWh]
36	Skoda	Citigo-e iV	82050	260	36.8
46	Volkswagen	e-up!	97990	258	32.3
24	Nissan	Leaf	122900	270	40.0

```
In [133... # Task 5: Inferential Statistics - Hypothesis Testing: Test whether there is a significant
          # difference in the average Engine power [KM] of vehicles manufactured by two leading
          # manufacturers i.e. Tesla and Audi. What insights can you draw from the test results?
          # Recommendations and Conclusion: Provide actionable insights based on your analysis.
          # (Conduct a two sample t-test using ttest_ind from scipy.stats module)
          from scipy.stats import ttest_ind
          # Filter data for Tesla and Audi
          tesla_power = df[df['Make'] == 'Tesla']['Engine power [KM]']
          audi_power = df[df['Make'] == 'Audi']['Engine power [KM]']
          # Perform two-sample t-test (Welch's t-test assumes unequal variances)
          t_stat, p_value = ttest_ind(tesla_power, audi_power, equal_var=False)
          print("T-statistic:", round(t_stat, 2))
          print("P-value:", round(p_value, 4))
          # Interpretation
          if p_value < 0.05:
              print("There is a statistically significant difference in average engine power between Tesla and Audi.")
          else:
              print("No statistically significant difference in average engine power between Tesla and Audi.")
```

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T-statistic: 1.79 P-value: 0.1068

No statistically significant difference in average engine power between Tesla and Audi.

In [ ]: