EV MARKET ANALYSIS

1. Conclusion

The analysis of EV charging stations revealed that:

- The dataset clusters into **4 distinct operational groups** based on features like region, charger type, and power capacity.
- **Spatial distribution** of chargers is uneven, with some regions showing higher clustering and potentially better infrastructure.
- Charger types (e.g., DC-001) and services (e.g., Self Service) are largely standardized, but **power output varies**, indicating possible capacity planning gaps.
- **Boxplots** showed variation in charger availability and power across regions, hinting at state-wise investment disparities.
- The **trend analysis** suggests certain regions (or states, if applicable) are leading in sales/installation volume and are poised for growth.

2. Process (Models, Frameworks, and Libraries Used)

Preprocessing & Feature Engineering

- Columns were cleaned using pandas by stripping and standardizing column names.
- **Power values** were extracted and converted to numeric kW values.

Encoding & Scaling

- OneHotEncoder from sklearn was used to encode categorical features like region and type.
- StandardScaler was used to normalize the dataset before clustering.

Clustering

- KMeans from sklearn.cluster helped identify 4 meaningful clusters.
- The **Elbow Method** was applied to select the optimal number of clusters.

Visualization

- matplotlib.pyplot and seaborn were used for creating plots like:
 - o Box plots
 - o Scatter plots

- Cluster comparisons
- o Bar plots
- statsmodels was used for **Exponential Smoothing** to forecast sales trends.

3. Graphs & Visualizations Explained

- **Elbow Plot**: Helped determine the ideal number of clusters (k=4), by visualizing inertia values.
- **Scatter Plot by Cluster**: Showed how different regions fall into operational clusters based on charger type and power.
- **Box Plots**: Highlighted the spread of charger power and frequency across regions and places, showing outliers and regional bias.
- **Exponential Smoothing Plot**: Forecasted future EV charging station growth trends based on current regional deployment data.

4. Recommendation to the Company

Based on the clustering and trend analysis, the following recommendations are proposed:

- Standardize Charger Power Across Regions: Some locations with low power capacity may hinder charging speed and user experience.
- **Target Under-Clustered Regions**: Expand infrastructure in regions showing low charger density but high future growth potential.
- **Scale Self-Service Models**: Given their popularity and cost-effectiveness, they should be prioritized in expansion.
- **Monitor Cluster Behavior Over Time**: Re-evaluate clusters every 6–12 months using updated data to detect shifts in usage or demand.
- Use Forecasts for Strategic Investment: Invest proactively in states or regions with rising sales/installation trends to stay ahead of demand.