

# **Business Analytics (IS641)**

## **ASSIGNMENT**

### **ELECTRIC VEHICLE DATA ANALYSIS USING POWER BI TOOLS**

**Submitted by**

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# ABOUT THE DATASET

The dataset is a detailed compilation of information on electric vehicles (EVs) within a specific region, encompassing various attributes such as geographic, legislative, and economic contexts. Key columns include vehicle details like model year, make, and model, as well as the type of electric vehicle, which helps differentiate between Battery Electric Vehicles (BEVs) and Plug-in Hybrid Electric Vehicles (PHEVs). The 'Electric Range' column provides insights into the efficiency and performance of different models, while geographic data such as city, state, postal code, legislative district, and 2020 census tract enable spatial analysis of EV adoption and regional differences in usage patterns. The 'Electric Utility' column further contextualizes the support infrastructure, highlighting the availability of charging stations and the impact of utility policies.

Economic aspects are also a critical part of the dataset, with the 'Base MSRP' (Manufacturer's Suggested Retail Price) indicating the financial accessibility of various EV models. Additionally, the 'Clean Alternative Fuel Vehicle (CAFV) Eligibility' column shows whether a vehicle qualifies for specific incentives aimed at promoting clean energy, providing a basis for analysing the effectiveness of such policies in encouraging EV adoption.

VIN (1-15)	County	City	State	Postal Code	Model Year	Make	Model	Electric Vehicle Type	Clean Alternative Fuel	Electric Range	Base MSRP	Legislative District	DOL Vehicle ID	Vehicle Location	Electric Utility	2020 Census Tract
KMKK33AGXL	King	Seattle	WA	98103	2020	HYUNDAI	KONA	Battery Electric Vehicle	Clean Alternative Fuel	258	258	0	43	249875142	POINT (-122.34301 ; CITY OF SEATTLE ;	53033004800
1C4RJYB81N	King	Bothell	WA	98011	2022	JEEP	GRAND CHEROKEE	Plug-in Hybrid Electric Vehicle	Not eligible due to I	25	0	1	233828502	POINT (-122.29578 ; PUGET SOUND ENE	53033021804	
1C4RJYD61P	Yakima	Yakima	WA	98906	2023	JEEP	GRAND CHEROKEE	Plug-in Hybrid Electric Vehicle	Not eligible due to I	25	0	14	229675939	POINT (-120.602720 PACIFICORP	53077020900	
5YJ3E1E6A7J	King	Kirkland	WA	98034	2018	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	215	0	45	104714466	POINT (-122.209285 PUGET SOUND ENE	53033021903	
WB17252G4J	Thurston	Olympia	WA	98501	2019	BMW	i3	Plug-in Hybrid Electric Vehicle	Clean Alternative Fuel	87	0	22	185488386	POINT (-122.89892 ; PUGET SOUND ENE	53067010705	
5YJ3E1E6A1L	Snohomish	Marysville	WA	98271	2020	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	266	0	38	124555523	POINT (-122.171384 PUGET SOUND ENE	53061040901	
2G4RC1N7H7H	King	Kent	WA	98042	2017	CHRYSLER	PACIFICA	Plug-in Hybrid Electric Vehicle	Clean Alternative Fuel	33	0	47	1815593	POINT (-122.111625 PUGET SOUND ENE	53033031707	
5YJ3E0E0E3L	King	Woodinville	WA	98072	2020	TESLA	MODEL Y	Battery Electric Vehicle	Clean Alternative Fuel	291	0	45	124760555	POINT (-122.151665 PUGET SOUND ENE	53033021006	
5YJ3E1E6A1J	Island	Coupeville	WA	98239	2018	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	215	0	10	125048003	POINT (-122.688070 PUGET SOUND ENE	53029971000	
7SAYG0E0F9P	King	Bellvue	WA	98004	2023	TESLA	MODEL Y	Battery Electric Vehicle	Eligibility unknown a	0	0	48	240416207	POINT (-122.291905 PUGET SOUND ENE	53033023806	
5YJ3E1E6A7J	King	Kirkland	WA	98033	2018	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	215	0	48	231013436	POINT (-122.20284 ; PUGET SOUND ENE	53033022803	
3FAP0S0U8G	Kittapow	Port Orchard	WA	98367	2016	FORD	FUSION	Plug-in Hybrid Electric Vehicle	Not eligible due to I	19	0	26	212561716	POINT (-122.685164 PUGET SOUND ENE	53033092902	
JTDKARFP9H	Kittapow	Port Orchard	WA	98366	2017	TOYOTA	PRISM PRIME	Plug-in Hybrid Electric Vehicle	Not eligible due to I	25	0	26	229764972	POINT (-122.630265 PUGET SOUND ENE	53033092900	
5YJ3E1E6B8K	Snohomish	Mukilteo	WA	98275	2019	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	220	0	21	179728765	POINT (-122.299865 PUGET SOUND ENE	53061041301	
5YJ3E1E6A5K	King	Redmond	WA	98052	2019	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	220	0	45	120633516	POINT (-122.12302 ; PUGET SOUND ENE	53033032323	
3FAP0S0U8G	Thurston	Rochester	WA	98579	2013	FORD	FUSION	Plug-in Hybrid Electric Vehicle	Not eligible due to I	19	0	20	138687212	POINT (-123.09073 ; PUGET SOUND ENE	53067012730	
WA1YAB0E4K	King	Seattle	WA	98112	2019	AUDI	E-TRON	Battery Electric Vehicle	Clean Alternative Fuel	264	0	43	475264046	POINT (-122.359835 CITY OF SEATTLE ;	53033006405	
1NAZ0Z0P6F	King	Seattle	WA	98125	2015	NISSAN	LEAF	Battery Electric Vehicle	Clean Alternative Fuel	84	0	46	252522686	POINT (-122.298365 CITY OF SEATTLE ;	53033050501	
KNDCC0LD9K	Kittapow	Bremerton	WA	98311	2019	KIA	NIRO	Plug-in Hybrid Electric Vehicle	Not eligible due to I	26	0	23	21481770	POINT (-122.646881 PUGET SOUND ENE	530330591204	
1NAZ0Z0P1E	Kittapow	Psstida	WA	98370	2014	NISSAN	LEAF	Battery Electric Vehicle	Clean Alternative Fuel	84	0	23	256178922	POINT (-122.64177 ; PUGET SOUND ENE	530330591105	
5JDKT0C51J	King	Kent	WA	98042	2018	BMW	X5	Plug-in Hybrid Electric Vehicle	Not eligible due to I	13	0	47	291897987	POINT (-122.111625 PUGET SOUND ENE	53033031708	
5YJ3A1E22J	Snohomish	Marysville	WA	98271	2018	TESLA	MODEL S	Battery Electric Vehicle	Clean Alternative Fuel	249	0	39	172808163	POINT (-122.171384 PUGET SOUND ENE	53061052808	
1G1RB8E48D	Kittapow	Bremerton	WA	98312	2013	CHEVROLET	VOLT	Plug-in Hybrid Electric Vehicle	Clean Alternative Fuel	38	0	38	138557555	POINT (-122.65223 ; PUGET SOUND ENE	53033080700	
2T3YL4D5VE	King	Seattle	WA	98108	2014	TOYOTA	RAV4	Battery Electric Vehicle	Clean Alternative Fuel	103	0	11	183567149	POINT (-122.326965 CITY OF SEATTLE ;	53033010001	
JTDKARFP9H	Snohomish	Lake Stevens	WA	98256	2017	TOYOTA	PRISM PRIME	Plug-in Hybrid Electric Vehicle	Not eligible due to I	25	0	44	160057801	POINT (-122.112265 PUGET SOUND ENE	53061052607	
5YJ3E1E6B6L	Kittapow	Silverdale	WA	98383	2020	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	322	0	23	6335647	POINT (-122.688076 PUGET SOUND ENE	530330591302	
5YJ3E1E6B3J	King	Kirkland	WA	98033	2018	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	215	0	45	205530552	POINT (-122.20284 ; PUGET SOUND ENE	530330322401	
1FADP0S0U8G	Kittapow	Kingston	WA	98346	2016	FORD	CAMAX	Plug-in Hybrid Electric Vehicle	Not eligible due to I	19	0	23	1465033	POINT (-122.50156 ; PUGET SOUND ENE	53033090102	
WVWRK7AUK	King	Kirkland	WA	98033	2019	VOLKSWAGEN	E-GOLF	Battery Electric Vehicle	Clean Alternative Fuel	125	0	45	306865107	POINT (-122.20284 ; PUGET SOUND ENE	53033032206	
5YJ3A1E23L	Kittapow	Kingston	WA	98346	2020	TESLA	MODEL S	Battery Electric Vehicle	Clean Alternative Fuel	330	0	23	110671444	POINT (-122.50156 ; PUGET SOUND ENE	530330591152	
1NAZ0Z0P7F	Thurston	Olympia	WA	98506	2015	NISSAN	LEAF	Battery Electric Vehicle	Clean Alternative Fuel	84	0	22	141547311	POINT (-122.987478 PUGET SOUND ENE	53067010200	
WA1LAAG67M	Yakima	Yakima	WA	98906	2021	AUDI	E-TRON	Battery Electric Vehicle	Clean Alternative Fuel	222	0	14	144841534	POINT (-120.602720 PACIFICORP	53077020801	
KNDCE1L08K	King	Enumclaw	WA	98022	2019	KIA	NIRO	Battery Electric Vehicle	Clean Alternative Fuel	239	0	31	117615928	POINT (-121.88953 ; PUGET SOUND ENE	53033031400	
1NAZ0Z0P9F	King	Seattle	WA	98109	2019	NISSAN	LEAF	Battery Electric Vehicle	Clean Alternative Fuel	84	0	43	180278496	POINT (-122.34484 ; CITY OF SEATTLE ;	53033007701	
5YJ3E1E6A4P	King	Bellvue	WA	98006	2023	TESLA	MODEL 3	Battery Electric Vehicle	Eligibility unknown a	0	0	41	241481278	POINT (-122.18937 ; PUGET SOUND ENE	53033024704	
JN1AZ0CP1B	King	Seattle	WA	98133	2011	NISSAN	LEAF	Battery Electric Vehicle	Clean Alternative Fuel	73	0	32	133592196	POINT (-122.34584 ; CITY OF SEATTLE ;	53033005404	
3C3CFF0E4G	King	Auburn	WA	98002	2016	FIAT	500	Battery Electric Vehicle	Clean Alternative Fuel	84	0	47	225708626	POINT (-122.228855 PUGET SOUND ENE	53033030600	
1G1FY6857L	Yakima	Moses	WA	98936	2020	CHEVROLET	BOLT EV	Battery Electric Vehicle	Clean Alternative Fuel	259	0	15	125643058	POINT (-120.379511 PACIFICORP	53077001702	
1V2DNPE33P	King	Seattle	WA	98125	2023	VOLKSWAGEN	ID.4	Battery Electric Vehicle	Eligibility unknown a	0	0	46	245619664	POINT (-122.296385 CITY OF SEATTLE ;	530330300000	
1G1FY6856N	Yakima	Tieton	WA	98947	2022	CHEVROLET	BOLT EV	Battery Electric Vehicle	Eligibility unknown a	0	0	14	208932349	POINT (-120.75692 ; PACIFICORP	53077002900	
1NAZ0Z0PXD	Kittapow	Silverdale	WA	98383	2013	NISSAN	LEAF	Battery Electric Vehicle	Clean Alternative Fuel	75	0	23	144485785	POINT (-122.688076 PUGET SOUND ENE	530330591205	
3M9F9F9E2P	Kittapow	Port Orchard	WA	98367	2023	BMW	330E	Plug-in Hybrid Electric Vehicle	Not eligible due to I	25	0	35	244137120	POINT (-122.688164 PUGET SOUND ENE	53033059201	
1NAZ0Z0P7K	King	Remton	WA	98057	2019	NISSAN	LEAF	Battery Electric Vehicle	Clean Alternative Fuel	160	0	11	4870099	POINT (-122.21024 ; PUGET SOUND ENE	53033028200	
WAUTPF9F2H	King	Bellvue	WA	98006	2017	AUDI	A3	Plug-in Hybrid Electric Vehicle	Not eligible due to I	16	0	48	199304066	POINT (-122.11832 ; PUGET SOUND ENE	53033052300	
2C4RC1733P	King	Tukwila	WA	98188	2023	CHRYSLER	PACIFICA	Plug-in Hybrid Electric Vehicle	Clean Alternative Fuel	32	0	11	236367619	POINT (-122.29179 ; PUGET SOUND ENE	53033028200	
5YJ3E1E6A7K	King	Seattle	WA	98188	2019	TESLA	MODEL 3	Battery Electric Vehicle	Clean Alternative Fuel	220	0	33	216597293	POINT (-122.29179 ; PUGET SOUND ENE	53033028200	
1FADP3R68D	Thurston	Tumwater	WA	98501	2013	FORD	FOCUS	Battery Electric Vehicle	Clean Alternative Fuel	76	0	35	230763249	POINT (-122.88892 ; PUGET SOUND ENE	53067011720	
2C4RC1N78J	Kittapow	Squishamish	WA	98392	2018	CHRYSLER	PACIFICA	Plug-in Hybrid Electric Vehicle	Clean Alternative Fuel	33	0	23	176286988	POINT (-122.55717 ; PUGET SOUND ENE	530330840100	
KNDRLJLH6N	Yakima	Yakima	WA	98906	2022	KIA	SORENTO	Plug-in Hybrid Electric Vehicle	Clean Alternative Fuel	32	0	14	209591812	POINT (-120.602720 PACIFICORP	53077000800	

# DATA PREPROCESSING

### 1. Removing Null Values:

- Identified and removed rows with missing values across all columns to ensure data integrity.

## 2. Removing Rows with Incorrect Values:

- Identified and removed rows containing incorrect or invalid values, such as negative values or outliers.

### 3. Removing duplicates:

- Checked for and removed any duplicate rows to avoid skewing the analysis.

#### 4. Removing the VIN and County Columns:

- The "VIN" and "County" columns were deemed unnecessary for the analysis or calculations required for the project.
- As a result, the columns were removed from the dataset to simplify further processing.

## 5. Handling Categorical Variables:

- Identified categorical variables within the dataset, such as "Electric Vehicle Type" or "Clean Alternative Fuel Vehicle (CAFV) Eligibility" and applied appropriate encoding techniques.
- Utilized techniques like one-hot encoding or label encoding to convert categorical variables into numerical format, ensuring compatibility with machine learning algorithms.
- By handling categorical variables effectively, we ensure that all features are represented in a format suitable for analysis and modelling, thereby enhancing the robustness of our predictive models.

[illegible]

# DATA VISUALIZATIONS

## 1. Donut Graph: BEV Vehicles and % of them

- Identifying and analyzing the total number of Battery Electric Vehicles (BEVs) in the dataset.
- Calculating the percentage of BEVs relative to the total number of electric vehicles, providing insights into the dominance of fully electric models.



## 2. Donut Graph: PHEV Vehicles and % of them

- Identifying and analyzing the total number of Plug-in Hybrid Electric Vehicles (PHEVs) in the dataset.
- Calculating the percentage of PHEVs relative to the total number of electric vehicles, providing insights into the dominance of fully electric models.



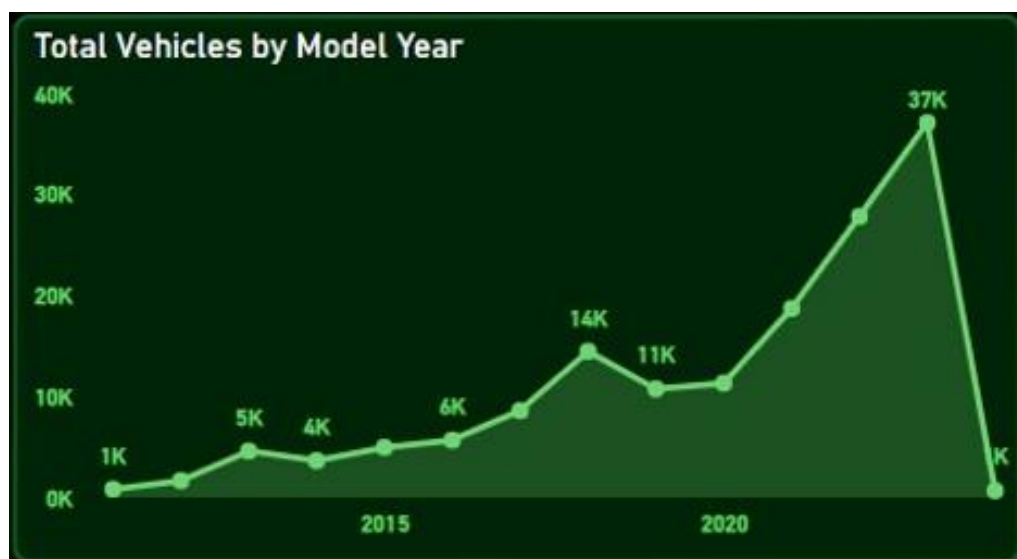
### 3. Filled Map: Total Vehicles by State

This chart showcases the geographical distribution of electric vehicles across different states, allowing for the identification of regions with higher adoption rates.



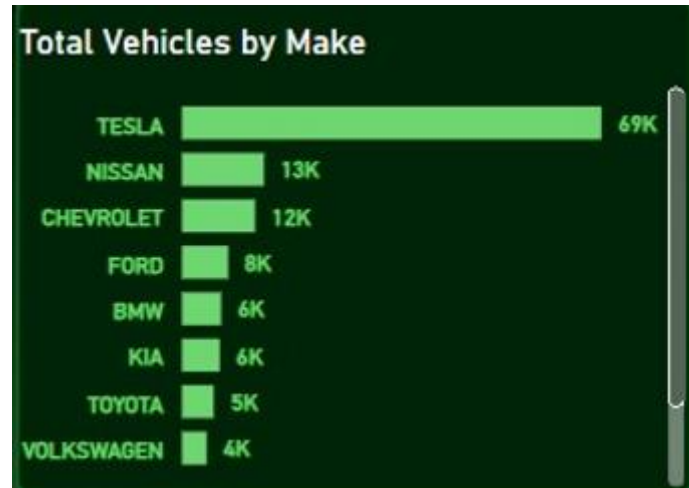
### 4. Area Chart: Total Vehicles by Model Year

This chart illustrates the distribution of electric vehicles over the years, starting from 2010, providing insights into the growth pattern and adoption trends..



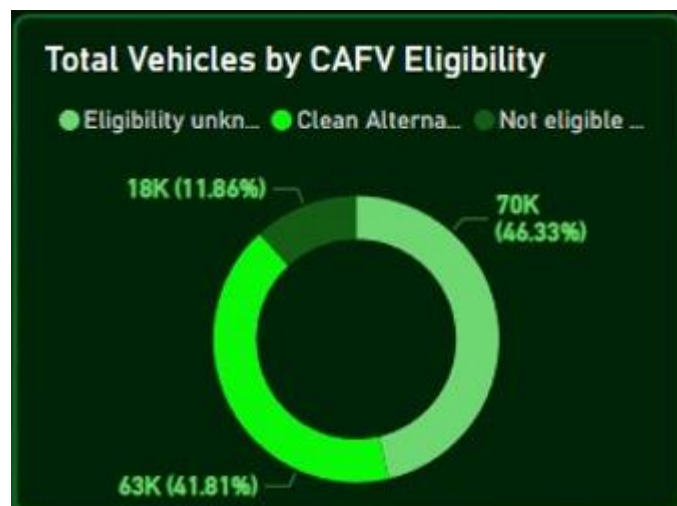
## 5. Bar Chart: Top 10 Total Vehicles by Make

This highlights the top 10 electric vehicle manufacturers based on the total number of vehicles, providing insights into the market dominance of specific brands.



## 6. Donut Chart: Total Vehicles by CAFV Eligibility

Illustrates the proportion of electric vehicles that are eligible for Clean Alternative Fuel Vehicle (CAFV) incentives, aiding in understanding the impact of incentives on vehicle adoption.



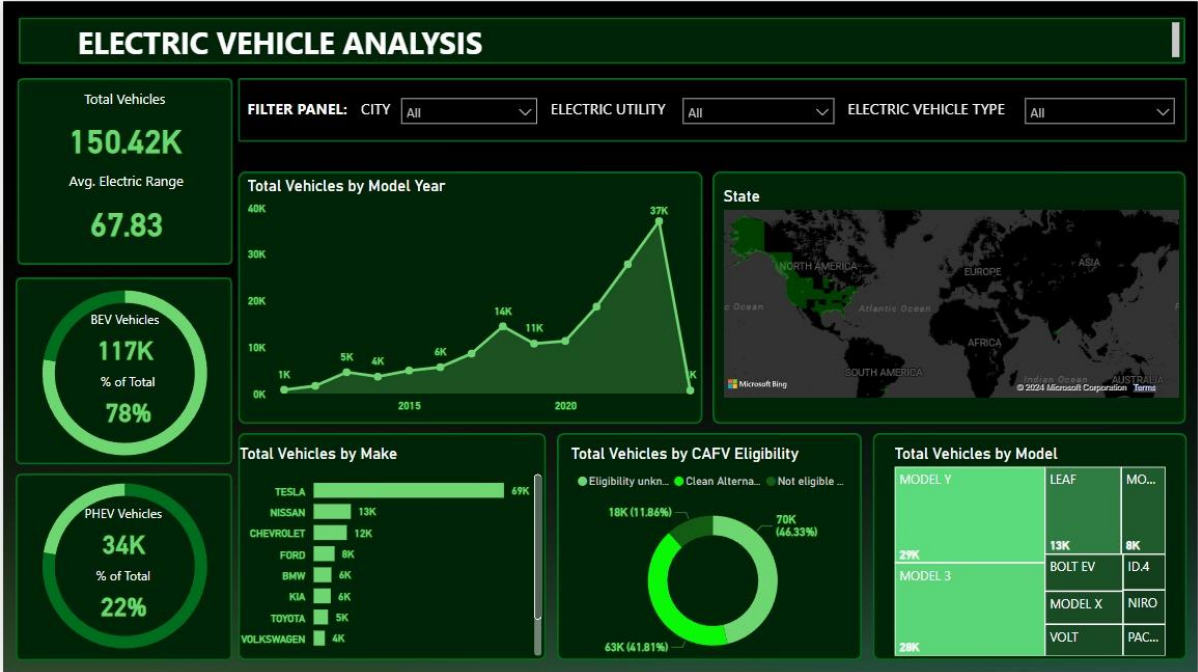
## 7. Tree Map: Top 10 Total Vehicles by Model

Highlights the top 10 electric vehicle models based on the total number of vehicles, offering insights into consumer preferences and popular models in the market.

### Total Vehicles by Model

MODEL Y	LEAF	MO...
29K	13K	8K
MODEL 3	BOLT EV	ID.4
	MODEL X	NIRO
28K	VOLT	PAC...

# THE DASHBOARD



In conclusion, the dashboard effectively utilizes a combination of data visualization techniques to present key metrics and insights in a user-friendly format. By incorporating visual elements such as charts, graphs, and cards, users can easily interpret and analyse complex data related to electric vehicles. From tracking different electric vehicles to understanding geographical distribution and model types and years distribution, the dashboard offers a comprehensive overview of critical performance indicators. By providing actionable insights and facilitating data-driven decision-making, the dashboard serves as a valuable tool for stakeholders to monitor performance, identify trends, and drive strategic initiatives for growth and success in the vehicle market.