Automobile Imports-85 Dataset

Statistical Methods Project Overview

March 16, 2025

Introduction

- In this project, we are exploring the Automobile Imports-85
 Dataset.
- The dataset contains various attributes of automobiles including technical specifications, performance metrics, and price.
- Our goals:
 - Provide a comprehensive overview of the dataset.
 - Understand the theoretical aspects of the methods we plan to use.
 - Propose analyses based on hypothesis testing and predictive modeling.

General Description of the Dataset

- The dataset is sourced from the UCI Machine Learning Repository.
- It contains **205** instances representing different automobiles. Some records are incomplete.
- The attributes include both categorical and numerical variables.
 Examples include:
 - **Symboling**: A risk rating for the automobile (ranging from -3 for very safe to +3 for very risky).
 - **Normalized Losses**: A normalized measure of the insurance losses, which indicates repair costs.
 - Make: The manufacturer of the automobile (e.g., alfa-romero, audi, bmw).
 - Fuel Type and Aspiration: Attributes describing the fuel used and engine aspiration (e.g., standard, turbo).
 - Engine Size and Horsepower: Key performance metrics.
 - Price: Often used as a target variable for regression modeling.

Detailed Summary of Attributes

Symboling:

• Risk factor with values typically ranging from -3 (low risk) to +3 (high risk).

Normalized Losses:

 Represents relative insurance losses; higher values imply higher repair/maintenance costs.

• Make:

 The car manufacturer, which may influence design, performance, and pricing.

• Fuel Type and Aspiration:

 Fuel type (e.g., gas, diesel) and whether the engine is naturally aspirated or turbocharged.

• Engine Attributes:

 Includes engine size (in cubic centimeters), horsepower, and other performance metrics.

Performance Metrics:

Such as city and highway MPG, which reflect fuel efficiency.

Price:

• A key continuous variable often used for regression analysis.

Expected Relationships Between Attributes

Based on automotive engineering and market dynamics, we expect:

- Higher engine size and horsepower to correlate with higher prices.
- Fuel type and aspiration may influence fuel efficiency (city/highway MPG) and overall performance.
- Symboling (risk rating) might be associated with insurance costs and repair expenses.
- Associations among categorical variables (e.g., fuel type, body style) can be explored using chi-square tests.

Hypothesis Testing: Detailed Overview

Our hypothesis testing will focus on evaluating associations between variables:

- Null Hypothesis (H_0): Assumes no association between the variables under investigation (e.g., "Engine size is independent of price").
- Alternative Hypothesis (H_1) : Assumes there is a statistically significant association (e.g., "Engine size is associated with price").
- Testing Procedure:
 - For categorical variables, we will use the Chi-square test of independence.
 - For numerical relationships, correlation tests or regression analyses will be used.
- Statistical Significance:
 - A p-value less than $\alpha = 0.05$ will lead us to reject the null hypothesis.
 - Effect sizes, such as **Cramér's V**, will be computed to quantify the strength of associations.

Predictive Modeling: Decision Tree Analysis

Decision Trees will be used for classification and regression:

• Algorithm:

- We plan to use the CART (Classification and Regression Trees) algorithm.
- The tree splits data based on impurity measures (e.g., Gini index or information gain) for classification, and variance reduction for regression.

• Model Building:

- Data will be split into training and testing subsets.
- Cross-validation techniques will be used to prevent overfitting.

Interpretability:

 Decision trees provide intuitive rules that help identify the most influential attributes.

Predictive Modeling: Regression Analysis

Regression Analysis will help us predict continuous outcomes such as **price**:

Linear Regression:

- Models the relationship between one or more predictor variables and a continuous target variable.
- Assumes linearity between predictors and the target.

Model Evaluation:

- Performance metrics include R-squared, RMSE (Root Mean Squared Error), and MAE (Mean Absolute Error).
- Diagnostic plots will be used to assess assumptions (e.g., normality of residuals, homoscedasticity).

• Extensions:

• If the linear model is insufficient, we may explore polynomial regression or regularization techniques (e.g., Ridge, Lasso).

Proposal of Analyses

Our comprehensive analysis plan includes:

- Data Cleaning and Preparation:
 - Handle missing values and encode categorical variables appropriately.
- Exploratory Data Analysis (EDA):
 - Compute frequency distributions and visualize each attribute using bar plots, histograms, and scatter plots.
- **3** Inferential Statistics and Hypothesis Testing:
 - Use chi-square tests for categorical variables and correlation tests for numerical variables.
 - Formulate null and alternative hypotheses (e.g., "Engine size is associated with price").
- Predictive Modeling:
 - Decision Trees: Build classification/regression trees using CART with cross-validation.
 - Regression Analysis: Develop linear or polynomial regression models to predict price, evaluating model assumptions and performance.

Conclusion and Future Work

- Our study aims to identify the key factors that influence automobile characteristics and pricing.
- Future work may include:
 - Incorporating ensemble methods or other advanced modeling techniques.
 - A deeper analysis of variable interactions and model refinements.
- Our findings will be compared with established automotive market theories to validate the insights.

References



- Breiman, L., Friedman, J., Olshen, R. and Stone, C. (1984). *Classification and Regression Trees.* Belmont, CA: Wadsworth.
- James, G., Witten, D., Hastie, T. and Tibshirani, R. (2013). An Introduction to Statistical Learning: with Applications in R. New York: Springer.
- AutoVista: Automobile Imports-85 Dataset Project. GitHub repository. Available at: https://github.com/piotrek1459/AutoVista