Data Cleaning & Preprocessing Tasks

1 Handling Missing Values

Identify missing values in normalized_losses, bore, stroke, horsepower, peak_rpm, price.

Fill numerical missing values using:

Mean/Median for horsepower, price.

Mode for categorical columns (number_of_doors, fuel_type).

Drop records if too many values are missing.

2 String & Categorical Data Preprocessing

Convert categorical data into lowercase and remove special characters (make,

fuel_type, aspiration, etc.).

Replace "?" or NaN values with appropriate replacements.

Standardize number_of_cylinders:

Convert words ("four", "six", "eight") to integers (4, 6, 8).

Standardize fuel_system categories (e.g., mpfi, spdi → Multi-Point Fuel Injection, Single-Point Fuel Injection).

3 Numeric Feature Processing

Convert "horsepower" and "peak_rpm" to integers (handle missing values first).

Convert price to numeric and fill missing values.

Standardize units (e.g., convert horsepower to kW if needed).

Feature Engineering on Numeric Columns

Create New Features:

Power-to-weight ratio = horsepower / curb weight.

Engine efficiency = horsepower / engine size.

Fuel efficiency = city mpg / highway mpg.

Convert compression_ratio into categories:

Low (<9), Medium (9-11), High (>11).

5 Handling Date or Range Values

Extract **ranges from normalized_losses** and create bins (e.g., Low, Medium, High loss categories).

6 Encoding Categorical Features

Label Encoding for fuel_type, aspiration, drive_wheels, etc. **One-Hot Encoding** for body_style, engine_type, and fuel_system.

7 Data Scaling & Normalization

Scale numerical features (length, width, height, curb_weight, engine_size) using Min-Max Scaling or Standardization.