Bias Detection Report

Bias Detection Report: Loan Purpose Distribution
Dataset Analyzed: Statlog.csv
Feature Examined: Purpose
Bias Type: Distribution
The purpose of this analysis was to determine if one loan purpose dominates the dataset, thereby introducing distribution bias.
Analysis Results:
1. Shannon Entropy and Balance Metric Analysis:
- Balance: 0.803
- Shannon Entropy: 2.667
- **Interpretation:** Indicates minimal bias with a fairly balanced and uncertain distribution.

2. Max/Min Ratio Analysis:

- Ratio: 31.111

- **Interpretation:** Shows extreme bias, with significant disparity between the most and least frequent categories.

3. Entropy and Normalized Entropy Analysis:

- Entropy: 2.667

- Normalized Entropy: 0.803

- **Interpretation:** Moderate bias, indicating some unevenness in category distribution.

4. Gini Index Analysis:

- Adjusted Gini Index: 0.902

- **Interpretation:** Minimal bias, suggesting relatively even distribution.

5. Relative Risk Analysis:

- Normalized Bias Score: 31.111

- **Interpretation:** Extreme bias, highlighting significant differences in observed versus expected frequencies.

6. Kolmogorov-Smirnov Test:

- K-S Statistic: 0.987

- P-Value: 0.0

- **Interpretation:** Extreme bias, strong indication of deviation from expected distribution.

Visualizations:

- Visualizations such as bar charts and pie charts could further illustrate the distribution biases observed.

Recommendations:

Given the results, the distribution of loan purposes is highly skewed, with certain purposes dominating the dataset. To address this bias, consider using re-sampling techniques or stratification to ensure a more balanced feature representation. This is crucial for analyses or models that rely on the 'Purpose' feature to prevent skewed results and ensure fair predictive performance.