Replication Instructions

This document provides exact steps to replicate our fairness testing results using the Colab notebook.

Step 1: Install Dependencies

Run this in a Colab cell:

!pip install fairlearn scikit-learn pandas numpy matplotlib seaborn

- 🚺 Step 2: Load and Preprocess Data
- Load the Adult Income dataset
- Label-encode categorical features
- Split into train/test
- Step 3: Train Random Forest Classifier
- Train using scikit-learn
- Generate predictions on test set
- Step 4: Evaluate Fairness
- Use Fairlearn's `MetricFrame` to compute:
- Accuracy
- Selection Rate
- False Positive Rate
- True Positive Rate
- Step 5: Apply Targeted Perturbation
- Flip `sex` and `race` columns
- Count how many predictions change
- 📊 Step 6: Intersectional Fairness
- Combine `race` + `sex` into a single feature

- Analyze fairness metrics by group
- Identify subgroups with large disparities
- \$\mathbb{L}\$ Step 7: Run IDI Tests
- Flip one sensitive feature at a time per individual
- Measure % of individuals whose prediction changes
- Step 8: Apply Fairness Mitigation
- Use ExponentiatedGradient with demographic parity constraint
- Retrain model and evaluate improved fairness
- Step 9: Visualize Results
- Use matplotlib to generate fairness comparison charts
- All results are reproducible using the included Colab notebook.