

PROJECT 3

AD CLICK PREDICTION (Using Random Forest , Machine Learning)

Submitted By :

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Semester Four

Session : 2023 - 27

Bachelor Of Technology (B.Tech - AI ML)

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1 Introduction

This project develops a machine learning system to predict whether users will click on online advertisements. Using a dataset of 6,657 user interactions, it analyzes features like time spent, age, income, and ad topics to predict click behavior. Multiple models are compared, with the Random Forest classifier achieving the highest accuracy of 94.3%, supporting targeted advertising strategies.

2 Key Libraries

- **Pandas:** Loads and manages the dataset (click_advertisement.csv).
- **NumPy:** Performs numerical operations for data preprocessing.
- **Scikit-learn:** Provides tools for data splitting, model training (Logistic Regression, Decision Tree, Random Forest), and evaluation.
- **XGBoost:** Implements the XGBoost classifier for comparison.
- **Seaborn/Matplotlib:** Visualizes data distributions and model performance.
- **Pickle:** Saves and loads the trained model for deployment.

3 Key Features of the Project

1. **Click Prediction:** Predicts ad clicks based on user and ad features.
2. **Multiple Models:** Compares Logistic Regression, Decision Tree, Random Forest, and XGBoost.
3. **Feature Engineering:** Encodes categorical variables and scales numerical features.
4. **Large Dataset:** Processes 6,657 records with 14 features.
5. **Model Optimization:** Uses GridSearchCV to tune Random Forest hyperparameters.
6. **Evaluation Metrics:** Reports accuracy, confusion matrix, and classification report.

4 Core Algorithm

4.1 Data Preparation

- Loads dataset with 6,657 entries and 14 features (e.g., Time_Spent, Age, Ad_Topic).
- Encodes binary variables (Male, Clicked) using LabelEncoder.

- Converts categorical variables (Ad_Topic, Country_Name, etc.) to one-hot encodings, yielding 304 features.
- Splits data into 70% training and 30% test sets.
- Scales numerical features using StandardScaler.

4.2 Model Architecture

- **Random Forest Classifier:** Ensemble of decision trees with 50 estimators, Gini criterion, and square root feature selection.
- **Other Models:** Logistic Regression, Decision Tree (entropy criterion), and XGBoost for comparison.
- Tunes Random Forest hyperparameters using GridSearchCV (n_estimators: 50, 100, 200; max_depth: None, 10, 20; min_samples_split: 2, 5, 10).

4.3 Training

- Trains models on scaled training data with random state for reproducibility
- Random Forest achieves 94.3% accuracy on test data after tuning.

4.4 Prediction and Evaluation

- Predicts clicks on test set using trained models.
- Evaluates with accuracy, confusion matrix, and classification report (precision, recall, F1-score).
- Random Forest confusion matrix: 1074 true negatives, 790 true positives, 31 false positives, 103 false negatives.

5 Conclusion

The project successfully predicts ad clicks using machine learning, with the Random Forest classifier achieving 94.3% accuracy. It outperforms Logistic Regression (89.9%), Decision Tree (91.0%), and XGBoost (94.0%) due to its ensemble approach. Limitations include high dimensionality from one-hot encoding and potential overfitting. Future work could explore feature selection, neural networks, or larger datasets for improved generalization.

6 Links

- **Demo Link:** <https://eb386265c24c42ebf8.gradio.live>

(Valid only for one week)

IMAGES :

Ad Click Prediction

Time Spent (minutes)

32.6

91.43

66.85

🔄

Age

19

61

37

🔄

Average Income (\$)

13996.5

79484.8

55930.49

🔄

Internet Usage (minutes)

104.78

269.96

184.95

🔄

Ad Topic

product_1

▼

Male

No

▼

Clear

Submit

Prediction

Prediction: Not Clicked
Confidence: 88.42%

Ad Click Prediction

Time Spent (minutes)

32.6

91.43

51.6

🔄

Age

19

61

50

🔄

Average Income (\$)

13996.5

79484.8

39132.00

🔄

Internet Usage (minutes)

104.78

269.96

176

🔄

Ad Topic

product_8

▼

Male

No

▼

Clear

Submit

Prediction

Prediction: Clicked
Confidence: 81.46%