Credit Card Fraud Detection

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Abstract. The main aim of this project is to detect fraudulent credit card transactions by utilizing credit card details. As financial transactions grow in volume and complexity, it becomes increasingly critical for credit card companies to identify fraudulent activities to protect customers from unauthorized charges. Although instances of fraud are relatively infrequent, they present substantial financial risks to both consumers and financial institutions. This research employs three machine learning techniques—One-Class SVM, Local Outlier Factor, and Isolation Forest—to analyse transaction data in real-time, addressing the challenges posed by imbalanced datasets and the sophistication of fraud schemes. By implementing a comprehensive detection system using these models on a credit card transaction dataset, the study aims to enhance the accuracy of fraud detection and provide timely alerts to prevent financial losses. Key results indicate that the proposed methodology significantly improves the identification of fraudulent transactions, ultimately leading to more secure credit card usage for consumers. The conclusions drawn from this research emphasize the necessity for ongoing innovation in fraud detection methodologies to keep pace with the ever- changing landscape of financial fraud.

Keywords. Credit card fraud detection, machine learning, One-Class SVM, Local Outlier Factor, Isolation Forest.

1 INTRODUCTION

Credit card fraud has become a critical issue as the use of credit cards in everyday transactions grows. Traditional fraud detection systems, such as rule-based methods and statistical models, have struggled to keep up with the evolving tactics of fraudsters [1][2]. These methods often fail to accurately detect emerging fraud patterns, leading to both false positives and false negatives, which undermine the effectiveness of fraud prevention strategies [3][4]. In response to these challenges, researchers have turned to machine learning (ML) techniques to develop more robust fraud detection frameworks. ML methods, such as supervised and unsupervised learning models, offer the ability to adapt to new fraud schemes, improving the accuracy of detection and reducing the risk of financial losses [5][6].

Recent studies demonstrate that integrating ML models like One-Class SVM, Local Outlier Factor, and Isolation Forest into fraud detection systems can significantly enhance performance metrics, such as precision, recall, and overall detection accuracy [7][8]. One-Class SVM effectively isolates outliers in transaction data, while Local Outlier Factor identifies unusual transactions by comparing them to local clusters of data points [9][10]. Isolation Forest, a highly efficient anomaly detection method, partitions the data into isolation trees, making it easier to identify fraudulent transactions [11][12].

These ML approaches not only increase detection accuracy but also reduce the operational burden on financial institutions, allowing them to shift focus from reactive to preventive strategies [13][14]. Studies reveal that ML-based systems can adapt to constantly changing fraud patterns, ensuring continuous protection against new forms of fraud [15][16]. By addressing the limitations of traditional methods, this research

provides valuable insights into developing adaptive fraud detection systems that increase consumer trust and reduce financial risks for institutions [17][18].

Ultimately, the implementation of advanced ML techniques can create a more secure environment for digital transactions, bolstering the financial industry's efforts to safeguard consumer transactions [19][20].



This research contributes to ongoing efforts to enhance credit card security, demonstrating the applicability of innovative machine learning models in safeguarding consumer transactions. The objective of this work is to develop a machine learning-based framework that improves the detection of fraudulent transactions, thereby reducing the financial risks associated with credit card fraud. By addressing existing challenges in fraud detection and highlighting the importance of adaptive systems, this research aims to contribute valuable insights and solutions to the field. Ultimately, implementing these advanced techniques can lead to increased trust among consumers, reduced losses for financial institutions, and a more secure environment for digital transactions.

2 RESEARCH METHODOLOGY

This section outlines the methodology used for the credit card fraud detection project, detailing data preprocessing, feature selection, model training, and evaluation.

2.1 Dataset

The dataset used in this project comprises credit card transaction records, sourced from Kaggle. It contains anonymized features related to transaction details, which underwent Principal Component Analysis (PCA) for dimensionality reduction. PCA was employed to transform the high-dimensional data into fewer components while retaining the most significant information. This not only reduced the complexity of the dataset but also improved computational efficiency and model performance by focusing on the features that are most relevant to fraud detection.

2.2 Data Preprocessing

To prepare the dataset for model training, the following preprocessing steps were applied:

- Data Cleaning:
 - Duplicates were identified and removed to ensure the dataset contained unique transactions.
 - Missing Values: Although the dataset did not have missing values, handling potential missing data is a crucial step in real-world scenarios to ensure model robustness.
- Normalization:
 - Min-Max Scaling was applied to normalize the features. This scaling technique ensures that all features are within a uniform range, typically between 0 and 1, which helps prevent any particular feature from dominating others due to varying scales. This step is especially important when dealing with distance-based algorithms like One-Class SVM and Local Outlier Factor.

2.3 Feature Selection

To ensure the model utilizes the most relevant features, various feature selection techniques were employed:

- Correlation Analysis:
 - The relationship between features was analyzed using a correlation matrix. This step helped in identifying and removing highly correlated features that provide redundant information, ensuring a more generalized model and reducing multicollinearity issues.
- Feature Importance:
 - Recursive Feature Elimination (RFE) was used to systematically identify and retain the most important features. RFE works by recursively considering smaller sets of features and eliminating the least significant features, which ultimately improved the model's efficiency in detecting fraudulent transactions.

2.4 Machine Learning Algorithms

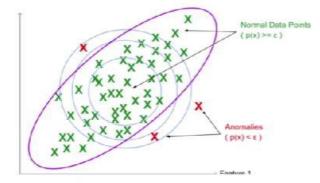
Three machine learning algorithms were implemented, each specifically suited for anomaly detection:

1. Isolation Forest:

• This is a tree-based algorithm particularly well-suited for **anomaly detection** in highdimensional datasets. It works by isolating observations by randomly selecting a feature and then randomly selecting a split value between the maximum and minimum values of the selected feature. The idea is that anomalies are few and different, and they are isolated quickly by this random process.

2. One-Class SVM:

• This algorithm fits a **boundary around normal transactions** in the feature space and classifies points lying outside this boundary as anomalies. It is highly effective for **unsupervised anomaly detection**, as it only requires data from the normal class to learn and identify potential outliers, which in this case are fraudulent transactions.



3. Local Outlier Factor (LOF):

• LOF calculates the **local density** deviation of a given data point with respect to its neighbours. It is useful in identifying **local anomalies** where the density of fraudulent transactions is considerably different from normal ones, making it a powerful algorithm for outlier detection in fraud detection systems.

2.5 Model Training and Evaluation

The models were trained using **stratified k-fold cross-validation** to ensure balanced representation of both fraud and non-fraud classes during training and validation. The following evaluation metrics were used to assess the model performance:

• Accuracy: Overall correctness of the model, measuring how well the model predicts both fraudulent and legitimate transactions.

- **Precision**: The proportion of correctly identified frauds out of all instances predicted as fraud. A high precision value indicates fewer false positives.
- **Recall**: The proportion of actual frauds that were correctly identified. High recall ensures that most fraudulent transactions are detected.
- **F1 Score**: The harmonic mean of precision and recall, providing a balanced measure of a model's performance.
- **ROC-AUC**: This metric evaluates the model's ability to distinguish between fraudulent and non-fraudulent transactions across all classification thresholds. A higher **AUC** indicates a better-performing model.

2.6 Implementation

The project was implemented using **Python**, leveraging the **PyCaret** library for efficient model training and hyperparameter tuning. PyCaret offers an easy-to-use interface for comparing multiple models, tuning hyperparameters, and evaluating models based on various metrics.

Key Python libraries used include:

- **Pandas** for data manipulation and preprocessing.
- Scikit-learn for feature scaling and implementation of algorithms.
- Matplotlib and Seaborn for data visualization.

PyCaret's **anomaly detection module** was utilized to streamline the process of training and evaluating the machine learning models. It also facilitated the process of fine-tuning hyperparameters to improve model accuracy and performance.

2.7 Model Deployment

The best-performing model, based on evaluation metrics, was deployed using **Streamlit**, a Python- based framework that allows the creation of interactive web applications. The deployed application offers **real-time fraud predictions**, where users can input transaction data, and the system classifies the transaction as either normal or fraudulent.

Key features of the deployed model include:

- **Real-time fraud detection**: Users can upload new transaction data, and the model provides instant feedback on whether the transaction is suspicious.
- **Continuous Monitoring and Retraining**: As part of future plans, the application will include mechanisms for **continuous monitoring** of incoming transactions and **retraining** the model as new fraud patterns emerge, ensuring the system stays up-to-date and adapts to new fraud techniques.

3 THEORY AND CALCULATION

In fraud detection, anomaly detection plays a pivotal role in identifying rare fraudulent transactions among a large volume of legitimate ones. Traditional rule-based systems struggle with evolving fraud tactics, which is why this project uses advanced machine learning algorithms such as Isolation Forest, One-Class SVM, and Local Outlier Factor (LOF). These models detect outliers by identifying unusual transaction patterns, providing a more dynamic and adaptive approach to fraud detection. Isolation Forest isolates anomalies based on their distinct behaviour, One-Class SVM defines a boundary for normal transactions, and LOF detects anomalies based on local density deviations. This foundation enhances real-time detection accuracy, offering a more efficient solution for financial security.

Calculation

This project leverages PyCaret, an open-source low-code machine learning library, to facilitate model development and optimization. The workflow involves:

- **Data Preparation**: Cleaning and preprocessing the dataset.
- Model Implementation: Deploying selected algorithms for fraud detection.

• Performance Evaluation: Evaluating models based on accuracy, precision, recall, and F1- score.

3.1 Mathematical Expressions and Symbols

In credit card fraud detection, algorithms like One-Class SVM and Isolation Forest use mathematical models to identify anomalies.

• Recall

Recall is defined as the ratio of correctly predicted positive observations to the all actual positives:

$$\begin{array}{c} \operatorname{Recall} = {}^{TP} \\ TP + FN \end{array}$$

Where:

TP = True Positives, FN = False Negatives

• Precision

Precision is defined as the ratio of correctly predicted positive observations to the total predicted positives:

$$\frac{PP}{TP+FP}$$

Where:

FP = False Positives

• For **One-Class SVM**, the optimization problem is defined as:

$$\min + \sum_{\substack{w=1\\2}}^{\rho} (\frac{1}{-} ||w||^2)$$

subject to:

$$(w. \phi(xi)) \ge \rho - \xi i \forall I$$

where w is the weight vector, $\phi(xi)$ is the mapped input data, ρ is the threshold, and ξi are slack variables

• For Isolation Forest, the anomaly score s(x) for a data point xxx is: $s(x)=2^{-E(h(x))/C(n)}$

where E(h(x)) is the average path length of the point xxx, and C(n) is the average path length in a binary search tree for a dataset of size n

These formulas guide the detection of fraudulent transactions.

4 RESULTS AND DISCUSSION

In credit card fraud detection, we implemented three machine learning algorithms:

Isolation Forest, One-Class SVM, and Local Outlier Factor.

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Upload the transaction CSV file for fraud detection:



Figure 1. Uploading the Document.

The high recall indicates that the models successfully identified fraudulent activities, crucial for minimizing financial losses. However, optimizing precision remains a challenge, highlighting the need for further refinement.

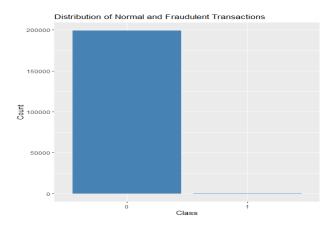


Figure 2. Bar Graph (Normal vs Fraud Transaction)

Fraudulent transactions: 2

Legitimate transactions: 23

Figure 2. Prediction Result

Overall, the results demonstrate the efficacy of advanced machine learning techniques in enhancing fraud detection, emphasizing their role in improving security in financial transactions.

4.1 **Preparation of Figures and Tables**

4.1.1 Formatting Tables

The table outlines key activities in the credit card fraud detection process, including dataset uploads, model predictions, and results analysis. Each entry lists estimated completion times and their significance for effective fraud detection, emphasizing the importance of timely execution for optimal outcomes. Formatting requirement has been summarized in the Table 1.

Activity	Description	Estimated Time to Complete	Impact on Learning Process
Dataset Upload	Users or admins upload transaction data for analysis.	2-3 minutes	Initial engagement, sets the foundation for analysis.
Data Exploration	Users explore data characteristics, such as transaction patterns and anomalies.	3-5 minutes	Increases understanding of data, influencing preprocessing.
Feature Engineering	Identification and creation of relevant features for model training, including transaction amounts, merchant categories, etc.	5-10 minutes	Enhances model performance, leading to better fraud detection
Model Training	The machine learning model is trained on the processed data to identify fraudulent behaviour.	30-60 minutes	Higher accuracy improves fraud detection capabilities.
Hyperparameter Tuning	Adjust the model's hyperparameters to optimize performance and minimize overfitting.	10-20 minutes	Fine-tuning enhances model efficiency, improving fraud detection and reducing false positives.
Prediction and Validation	The model predicts potential fraudulent transactions, which are validated against known outcomes.	10-15 minutes	Validated predictions enhance trust in the model's effectiveness.
Result Analysis	Users analyse prediction results and make decisions based on flagged transactions.	10-20 minutes	Informative insights lead to actionable strategies for fraud prevention.
Model Deployment	Deploy the trained model into a web application for real-time fraud detection.	20-30 minutes	Deployment enables continuous monitoring, improving user engagement and system utility.
Model Retraining	Periodic retraining of the model with new transaction data to maintain accuracy.	10-15 minutes	Keeps the model up-to-date, adapting to evolving fraud patterns for sustained performance.

Table 1: Activity Breakdown and Estimated Duration for Credit Card Fraud Detection.

5 CONCLUSIONS

The project effectively showcases the use of PyCaret, a low-code machine learning library, to develop and optimize advanced credit card fraud detection models. By employing its automated machine learning pipeline, the project enhances model accuracy and adaptability, crucial for addressing evolving fraudulent tactics. PyCaret simplifies the machine learning process, enabling financial institutions to implement effective fraud

detection without extensive coding knowledge. This adaptability allows models to quickly learn from new transaction patterns, reducing false positives and missed fraud cases.

While recognizing the need for continuous model updates to keep pace with changing fraud behaviours, the findings emphasize the importance of innovative solutions in the financial sector. Future research may explore integrating additional data sources and hybrid modelling techniques to strengthen fraud detection systems further. Overall, this work highlights the critical role of advanced machine learning in enhancing fraud detection efforts, fostering trust and security in financial transactions.

6 DECLARATIONS

6.1 Study Limitations

This study is limited by the use of a PCA-reduced dataset of credit card transactions, which may exclude critical features that could enhance model performance. This reduction can lead to a narrower understanding of the data, potentially impacting the predictive accuracy of the employed machine learning algorithms.

6.2 Acknowledgements

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6.3 Funding source

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