# Counterfeit Currency Detection

#### **Team Members:**

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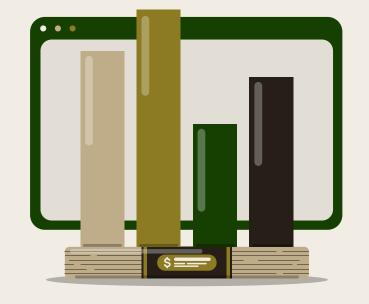
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# O1 INTRODUCTION PROBLEM STATEMENT



## **INTRODUCTION - PROBLEM STATEMENT**





Counterfeit currency refers to forged or imitation money produced with the intent to deceive and resemble genuine banknotes.



# Why is this a problem?

Counterfeit currency jeopardizes stability, erodes trust, fostering illegal activities, risking societal well-being.



# How common is the problem?

The U.S. Department of Treasury estimates

\$70 million counterfeit bills in circulation, and upper bound of \$200 million.

## Research Questions







# Ethical Deployment

Ethics in deploying
Python-based counterfeit
currency detection models
explored briefly.

#### Detection Synergies

Exploring computer vision and traditional methods for robust counterfeit detection.

# Real-Time Dynamics

Analyzing challenges, requirements, and solutions for real-time counterfeit detection systems.





# 02 DATA & METHODS

## Methods 1. Data Description

#### **Dataset Features**

1372 rows, 5 columns

Variance	How each pixel varies from the neighboring pixels and classifies them into different regions
Skewness	Measures the lack of symmetry
Kurtosis	Measures whether the data are heavy- tailed or light-tailed relative to a normal distribution
Entropy	The amount of information which must be coded for, by a compression algorithm.
Class	0 representing genuine note 1 representing fake note







	variance	skewness	kurtosis	entropy	class
0	3.62160	8.6661	-2.8073	-0.44699	0
1	4.54590	8.1674	-2.4586	-1.46210	0
2	3.86600	-2.6383	1.9242	0.10645	0
3	3.45660	9.5228	-4.0112	-3.59440	0
4	0.32924	-4.4552	4.5718	-0.98880	0

## Methods 1. Data Description

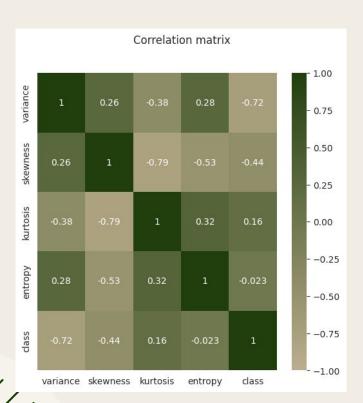
#### How data was obtained

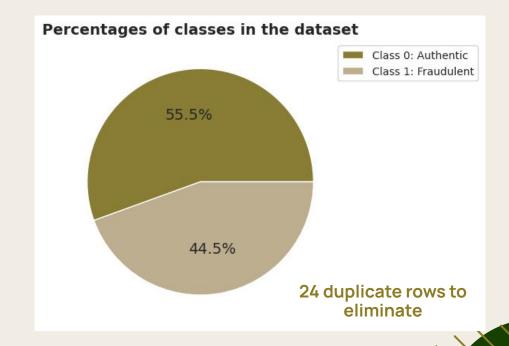
- Digitization: 400×400 pixels gray scale images with 660 dpi resolution, captured with an industrial camera
- Wavelet Transform: a mathematical algorithm designed to turn a waveform (from an image, i.e. in the space domain) into a sequence of coefficients based on an orthogonal basis of small finite waves, or wavelets.



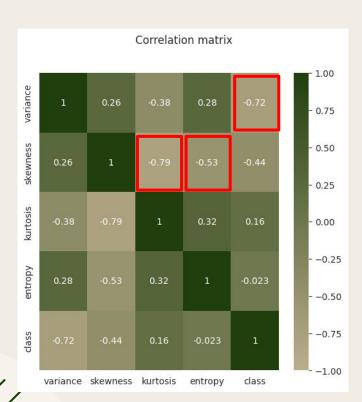
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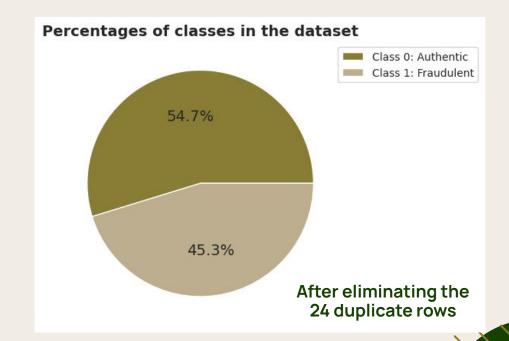
## **Data** Exploration





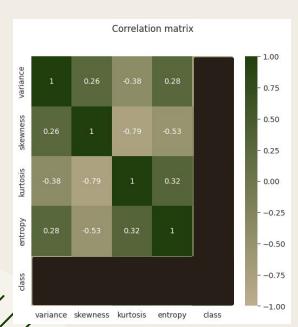
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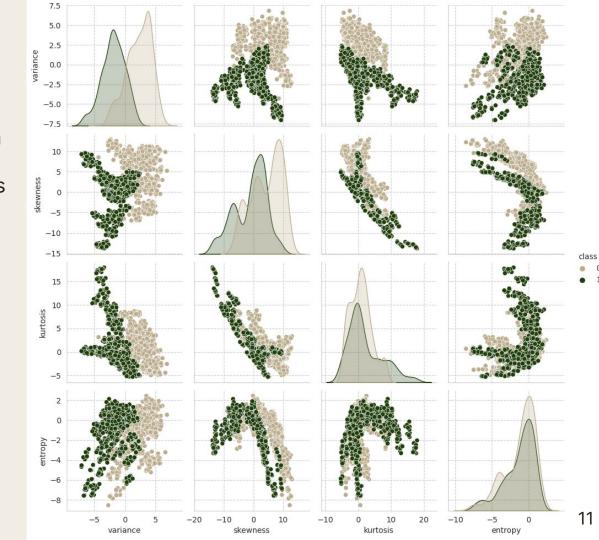




#### Pair Plot:

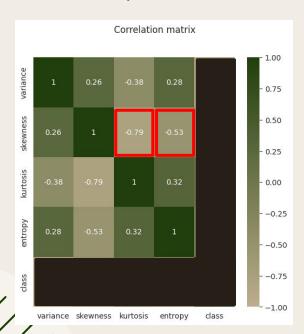
- Features by class are more distinct.
- Distribution and range for each feature.
- Relationships between features

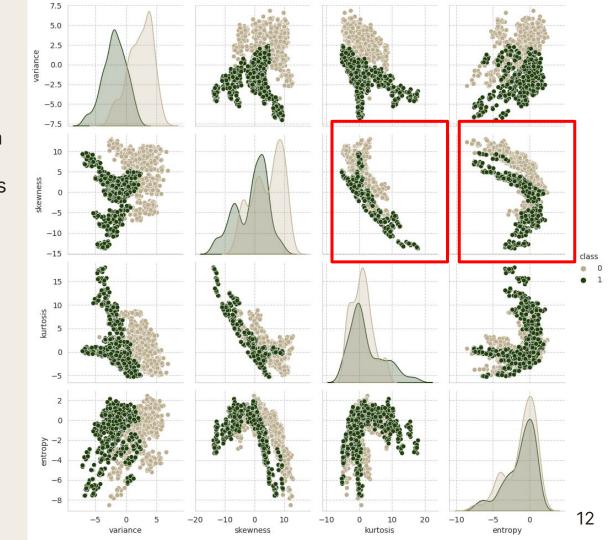




#### **Pair Plot:**

- Features by class are more distinct.
- Distribution and range for each feature.
- Relationships between features





### Methods 2. Statistical Methods & Software

**sklearn:** LogisticRegression, RandomForestClassifier, SVM, classification\_report, confusion\_matrix, accuracy\_score

pickle: dump, load

joblib, PIL, cv2, scipy, pywt, streamlit

#### **Classification Algorithms:**



#### 1. Logistic Regression

Machine learning method that takes data and categorizes data into 2 categories: P(Y=1|X) or P(Y=0|X)



#### 2. Random Forest

Machine learning algorithm which combines the output of multiple decision trees to reach a single result.



#### 3. Support Vector Machines (SVM)

Machine algorithm that aims to find a hyperplane in an N-dimensional space (N is the number of features) that distinctly classifies the data points.



# 03 RESULTS

#### **Algorithm Selection**

#### **Spot-Check Algorithm**

It involves rapidly testing a large suite of diverse machine learning algorithms on a problem in order to quickly discover what algorithms might work and where to focus attention.

```
Widgets
                                          Help
                                          Code
models.append(('LUA', LinearDiscriminantAnalysis()))
models.append(('KNN', KNeighborsClassifier()))
models.append(('CART', DecisionTreeClassifier()))
models.append(('NB', GaussianNB()))
models.append(('SVM', SVC()))
# evaluate each model in turn
results = []
names = []
for name, model in models:
   "kfold = KFold(n_splits=10, random_state=seed)
   -cv results = cross val score(model, X train, Y train, cv-kfold, scoring='accuracy')#"crc
   "results.append(cv results)
   -names.append(name)
   -msg = "%s = %f (%f)" % (name, cv results.mean(), cv results.std())
   "print(msg)
LR = 0.989950 (0.013864)
LDA = 0.978057 (0.022152)
KNN = 1.000000 (0.000000)
CART = 0.978065 (0.017970)
NB = 0.833928 (0.028628)
SVM = 1.000000 (0.000000)
```

# Accuracy

98.30%

98.54%

100%

**Logistic Regression** 

Random Forest

**SVM** 



# 04 CONCLUSION

- **1.** SVM was the best algorithm for this dataset.
- 2. The quality of image is critical while generating the dataset.
- 3. The amount of study being done in this sector is growing all the time, and various image processing techniques are being used to produce more accurate results.
- **4.** The proposed techniques can be used to extract characteristics from other currencies as well.

# LIMITATIONS

- 1. High Image Quality for Input Image detection & classification: Image taken by the camera must have the currency in the center & should occupy around 80% of the image area. The note should be front facing. The note should not be damaged or have any marks on it.
- 2. Advancement of Technology might make it difficult to identify the difference between a genuine & fake note. E.g Supernotes.
- **3.** Dataset not very large. Different patterns may reduce accuracy.

# **FUTURE WORK**

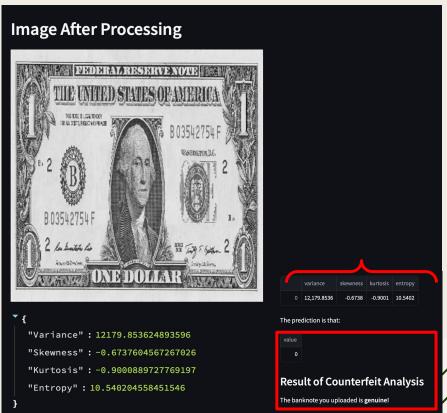
#### 1. Wearable Devices and Portable Detectors:

The idea of materializing a wearable device, which can work with a camera mounted on it can be created. The device would capture the image & send it to the application which would classify the image.

Using Neural Network can give better accuracy if datasets become complex.

# **APPLICATION**





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# Thank you!

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