

SIGNATURE VERIFICATION SYSTEM



TEAM

Muhammad Saifullah Khan
Muhammad Mahad Tariq
Bilal Ahmed

ADVISOR

Dr. Muhammad Imran Malik

CO-ADVISOR

Dr. Muhammad Shahzad

MEET THE TEAM

MEMBERS



BILAL AHMAD
REQUIREMENTS ENGINEER



M MAHAD TARIQ
LEAD RESEARCHER



M SAIFULLAH KHAN
LEAD DEVELOPER



PROBLEM DEFINITION

AND ITS SIGNIFICANCE





PROBLEM STATEMENT

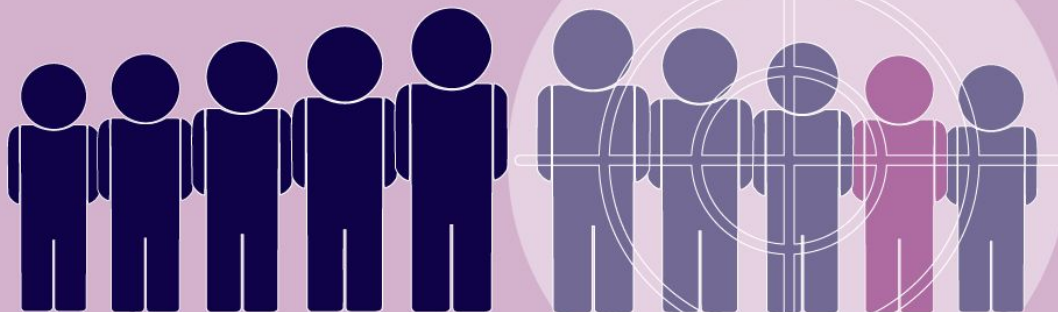
Signature is arguably the **most extensively used biometric** for **personal identification**, and therefore more likely to be used for **identity theft** with criminal intent than any other biometric, causing a **breach of personal security** which may lead to various **personal and financial losses**.



SCAMS COME IN ALL SHAPES AND SIZES

IDENTITY THEFT IS ONE OF THEM

Nearly 50% of all adults have
been targeted by a scam



1 in 5 of them fall victim

HOW SERIOUS IS THE IDENTITY FRAUD ISSUE?

Fraudsters have **stolen \$112 billion** in the past six years.

This means a **loss of \$35,600 every minute.**

00:00

In just three minutes, fraudsters steal enough to pay for:

00:01



Average mortgage
on a house for
2 years

00:02



Groceries for the
average family for
8 years

00:03



College fees
for
1 year

Independently produced by: JAVELIN

© 2016 Javelin Strategy & Research, Identity Fraud Study

IDENTITY FRAUD IN 2015

**13.1
million**

IDENTITY FRAUD
VICTIMS
IN 2015



\$15

BILLION
STOLEN



2015 AFP

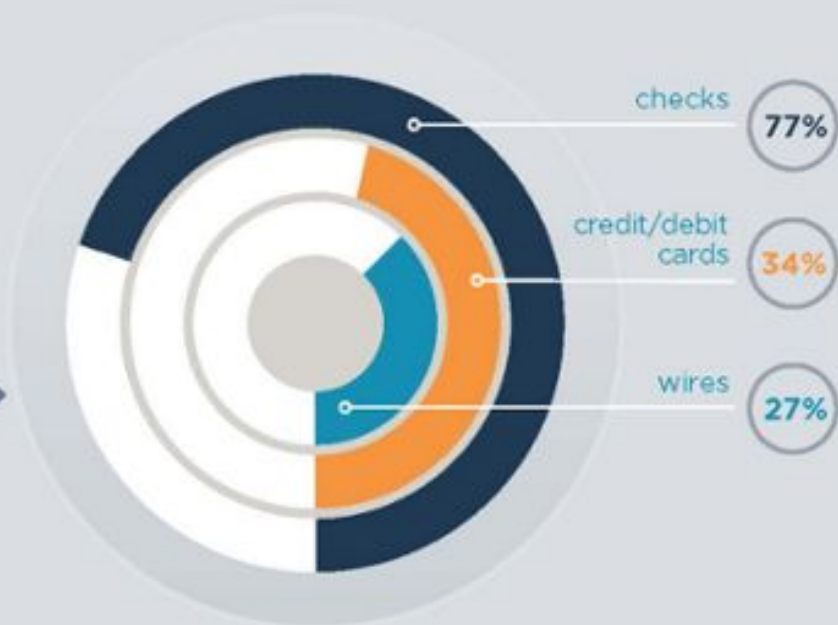
Payments Fraud and Control Survey

Underwritten by J.P.Morgan

62%

of companies were targets of payments fraud in 2014.

MOST TARGETED METHODS



YOUR IDENTITY IS AT STAKE!

IT HAPPENS ALL AROUND. IT CAN HAPPEN TO YOU.

WHO IS LIABLE FOR FORGED CHEQUES?

WHO DOES THE LAW PROTECT?

BANKS
OR
THEIR CUSTOMERS

WHO IS **LIABLE** FOR FORGED CHEQUES?

WHO DOES THE LAW PROTECT?

BANKS
OR
THEIR CUSTOMERS

WHO IS **LIABLE** FOR FORGED CHEQUES?

WHO DOES THE **LAW PROTECT**?

BANKS
OR
THEIR CUSTOMERS



THIS IS WHERE WE COME IN

OUR SOLUTION TO SIGNATURE FORGERY





VALUE PROPOSITION

WHAT ARE WE OFFERING

Our system is a **computer software and hardware system**, which provides **banks and organisations** the capability of **automatically verifying handwritten signatures** on bank checks, to **avoid fraud and financial losses** due to fraudulent signatures.



PRIMARY CUSTOMERS

WHO NEEDS THIS SYSTEM

Banks

- 35 banks operating in Pakistan
- 271 total cities
- Roughly 5-6k bank branches



USER SEGMENTS

WHO CAN USE THIS SYSTEM

Banks

Organisations

Individuals



CHALLENGES

SOME PRACTICAL DIFFICULTIES

- Genuine signatures vary too!
- Automatic extraction of handwritten signature from cheque
- Few samples of genuine signatures available for training
 - Reliable prediction requires a lot of training
- One Class Classification Problem
 - Performance generally bad

SCOPE

FUNCTIONAL REQUIREMENTS

REGISTRATION

Enroll users in the system

INPUT: 8 signature samples

OUTPUT: Enrollment status
(Success/Failure)

VERIFICATION

Establish signature authenticity

INPUT: Bank Cheque OR Signature

OUTPUT: Verification result
(Forged/Genuine)

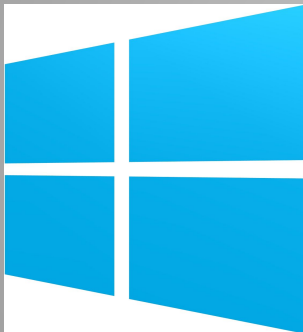


PLATFORMS

A SOLUTION FOR EVERYONE



LINUX



WINDOWS



MAC OS



ANDROID



GO-TO-MARKET STRATEGY

HOW DO WE ENGAGE CUSTOMERS

1. Involve banks in development process
 - HBL
 - Meezan Bank
2. Develop an online presence
 - GitHub
 - Project website
3. Acquire funding
 - KP Impact Challenge
 - Ignite
 - DICE Virtual Innovation



SUCCESS CRITERIA

WHAT WERE OUR GOALS

- Our algorithm performs at least as good as state-of-the-art.
- Prototype system is successfully developed.
- Acquire funding and start commercial development.
- Generate revenue by selling commercial product.



TECHNICAL DETAILS

IMPLEMENTATION, EXPERIMENTS, RESULTS



Types of Forgery

1. Random forgery:

Randomly sign. with person's own style.



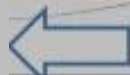
2. Blind forgery:

Own style without any knowledge of spelling.



3. Skilled forgery:

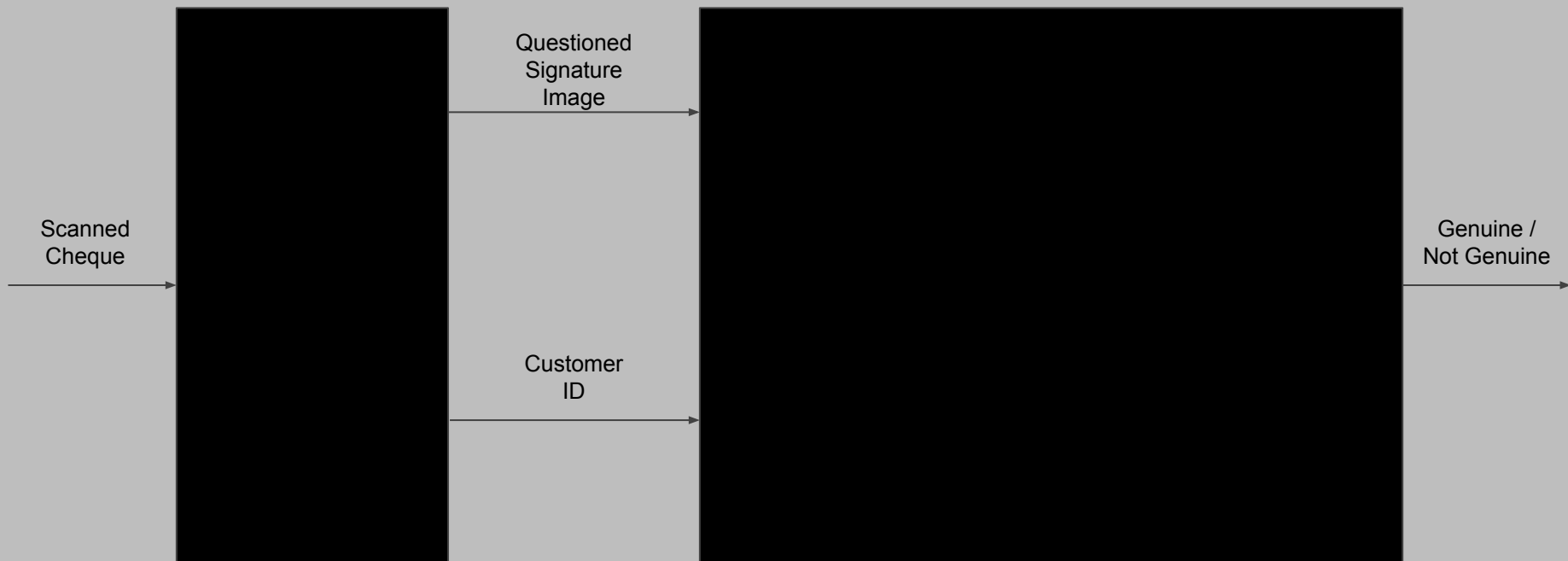
Experience in copying the signature.

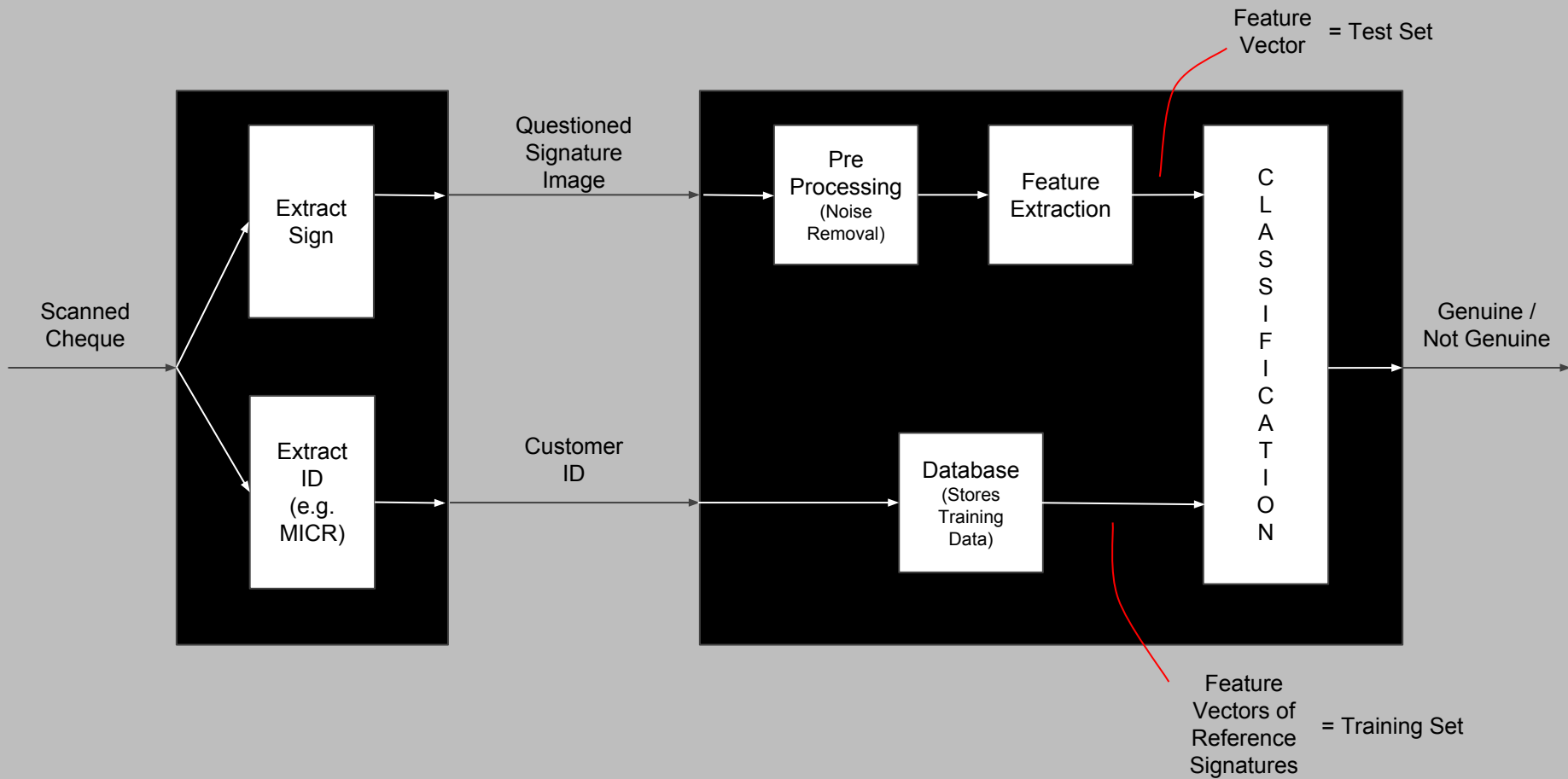


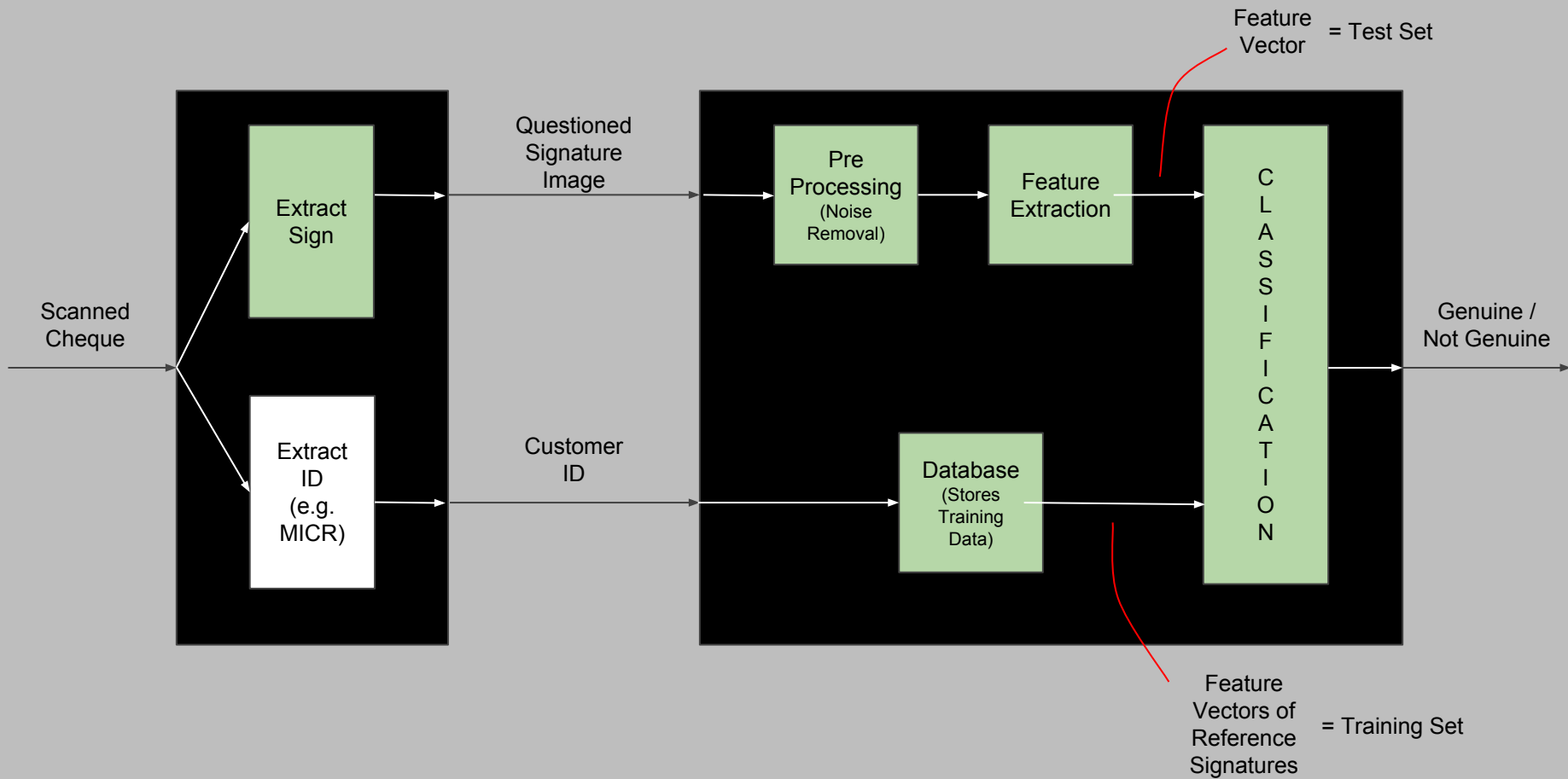


Disguised Signatures

This signature is **performed by the original author**, however the author intentionally do it **differently from routine** so that they can **later claim that it was forged**.









VERIFICATION PIPELINE

- Cheque Preprocessing
- Signature Extraction
- Analysis (Feature Extraction)
- Comparison and Evaluation (Classification)



CHEQUE PREPROCESSING

The digital image of the scanned bank cheque is preprocessed to remove cheque background and other noise. The output is a binary image of the bank cheque having white background with black text on it.



SIGNATURE EXTRACTION

In this phase, given the binary image of cheque, the actual signature is located and extracted from the whole cheque, discarding all other information including printed text, logos, and handwritten text other than the signature.

- Connected Components
- SURF
- Decision Trees



ANALYSIS

Once we have the image of the actual signature, a set of features is extracted from it. These features are a quantifiable, unique description of the signature and define its intrinsic characteristics which allow us to associate it with a particular author.

- Convolutional Neural Network (CNN)
- Facenet (Experimental)



COMPARISON AND EVALUATION

This phase involves comparing the feature vector obtained from the unknown signature sample with feature vectors of known signatures of the alleged author, and deciding whether the unknown signature belongs to this author or not.

- One Class SVM
- FAR/FRR/ERR



RESULTS

SKILLED FORGERIES

Dataset	Accuracy
GPDS 960	93.5%
MYCT	87%
CEDAR	93%



RESULTS

SKILLED FORGERIES + DISGUISED SIGNATURES

Dataset	EER
SigComp2009	13.6%
SigComp2011/Chinese	23.4%
SigComp2011/Dutch	16.1%
SigComp2012	14.3%

DEMO

THANK YOU