

# **Project Report Format**

## **1. INTRODUCTION**

### **1.1 Project Overview**

Machine learning and deep learning plays an important role in computer technology and artificial intelligence. With the use of deep learning and machine learning, human effort can be reduced in recognizing, learning, predictions and many more areas. This article presents recognizing the handwritten digits (0 to 9) from the famous MNIST dataset, comparing classifiers like KNN, PSVM, NN and convolution neural network on basis of performance, accuracy, time, sensitivity, positive productivity, and specificity with using different parameters with the classifiers

### **1.2 Purpose**

The handwritten digit recognition is the ability of computers to recognize human handwritten digits. It is a hard task for the machine because handwritten digits are not perfect and can be made with many different flavors. The handwritten digit recognition is the solution to this problem which uses the image of a digit and recognizes the digit present in the image.

## **2. LITERATURE SURVEY**

### **2.1 Existing problem**

#### **“Handwritten digit recognition using deep learning algorithm.”**

The reliance of humans over machines has never been so high such that from object classification in photographs to adding sound to silent movies everything can be performed with the help of deep learning and machine learning algorithms. Likewise, Handwritten text recognition is one of the significant areas of research and development with a streaming number of possibilities that could be attained.

Handwriting recognition (HWR), also known as Handwritten Text Recognition (HTR), is the ability to receive and interpret intelligible handwritten input from sources such as paper documents, photographs, touch-screens and other devices. Apparently, in this paper, we have performed handwritten digit recognition with the help of MNIST datasets using Multi-Layer Perceptron (MLP) and Convolution Neural Network (CNN) models. Our main objective is to compare the accuracy of the models stated above along with their execution time to get the best possible model for digit recognition.

#### **“Recognition of Handwritten Digit using Convolutional Neural Network.”**

Humans can see and visually sense the world around them by using their eyes and brains. Computer vision works on enabling computers to see and process images in the same way that human vision does. Several algorithms developed in the area of computer vision to recognize images.

The goal of our work will be to create a model that will be able to identify and determine

the handwritten digit from its image with better accuracy. We aim to complete this using the concepts of Convolutional Neural Network and MNIST dataset. Though the goal is to create a model which can recognize the digits, we can extend it for letters and then a person's handwriting. Through this work, we aim to learn and practically apply the concepts of Convolutional Neural Networks.

### **“Handwritten Digit Recognition using Machine Learning Algorithms.”**

Handwritten character recognition is one of the practically important issues in pattern recognition applications. The applications of digit recognition include in postal mail sorting, bank check processing, form data entry, etc. The heart of the problem lies within the ability to develop an efficient algorithm that can recognize hand written digits and which is submitted by users by the way of a scanner, tablet, and other digital devices. This paper presents an approach to off-line handwritten digit recognition based on different machine learning technique.

The main objective of this paper is to ensure effective and reliable approaches for recognition of handwritten digits. Several machines learning algorithm namely, Multilayer Perceptron, Random Forest, J48 and Random Tree has been used for the recognition of digits using WEKA.

### **“Effective Handwritten digit recognition using deep neural network.”**

This paper proposed a simple neural network approach towards handwritten digit recognition using convolution. With machine learning algorithms like KNN, SVM/SOM, recognizing digits is considered as one of the unsolvable tasks due to its distinctiveness in the style of writing.

In this paper, Convolution Neural Networks are implemented with an MNIST dataset of 70000 digits with 250 distinct forms of writings. The proposed method achieved 98.51% accuracy for real-world handwritten digit prediction with less than 0.1 % loss on training with 60000 digits while 10000 under validation.

## **2.2 References**

Reference 1: <https://arxiv.org/pdf/2106.12614.pdf>

Reference 2: <https://core.ac.uk/download/pdf/231148505.pdf>

Reference 3: [https://globaljournals.org/GJCST\\_Volume18/3-Handwritten-Digit-Recognition.pdf](https://globaljournals.org/GJCST_Volume18/3-Handwritten-Digit-Recognition.pdf)

Reference 4: <http://www.warse.org/IJATCSE/static/pdf/file/ijatcse66922020.pdf>

## **2.3 Problem Statement Definition**

Create a problem statement to understand your customer's point of view. The Customer Problem Statement template helps you focus on what matters to create experiences people will love.

A well-articulated customer problem statement allows you and your team to find the ideal solution for the challenges your customers face. Throughout the process,

you'll also be able to empathize with your customers, which helps you better understand how they perceive your product or service.

<p>I am</p> <p>an 65 years old man</p>	<p>I'm trying to</p> <p>find the digits which is unshaped</p>	<p>But</p> <p>I am not able to identify</p>	<p>Because</p> <p>I don't know how to identify the unshaped digits</p>	<p>Which makes me feel</p> <p>I am not able to identify the single digit.</p>
<p>I am</p> <p>a bank cashier</p>	<p>I'm trying to</p> <p>find the digits in challan</p>	<p>But</p> <p>I am not able to identify the digits</p>	<p>Because</p> <p>the written digits are unshaped</p>	<p>Which makes me feel</p> <p>If I am not find the accurate digit, it will cause difficulties to the customer as well as me.</p>
<p>I am</p> <p>a postal officer</p>	<p>I'm trying to</p> <p>find the digits in pincode</p>	<p>But</p> <p>I am not able to identify the digits</p>	<p>Because</p> <p>the written digits are unshaped</p>	<p>Which makes me feel</p> <p>If I am not able to recognize the accurate digit in pincode, it makes difficult to deliver the message.</p>
<p>I am</p> <p>a physically challenged person</p>	<p>I'm trying to</p> <p>find the digits</p>	<p>But</p> <p>I am not able to identify the digits</p>	<p>Because</p> <p>the written digits are unshaped</p>	<p>Which makes me feel</p> <p>I am not able to identify even single digit.</p>

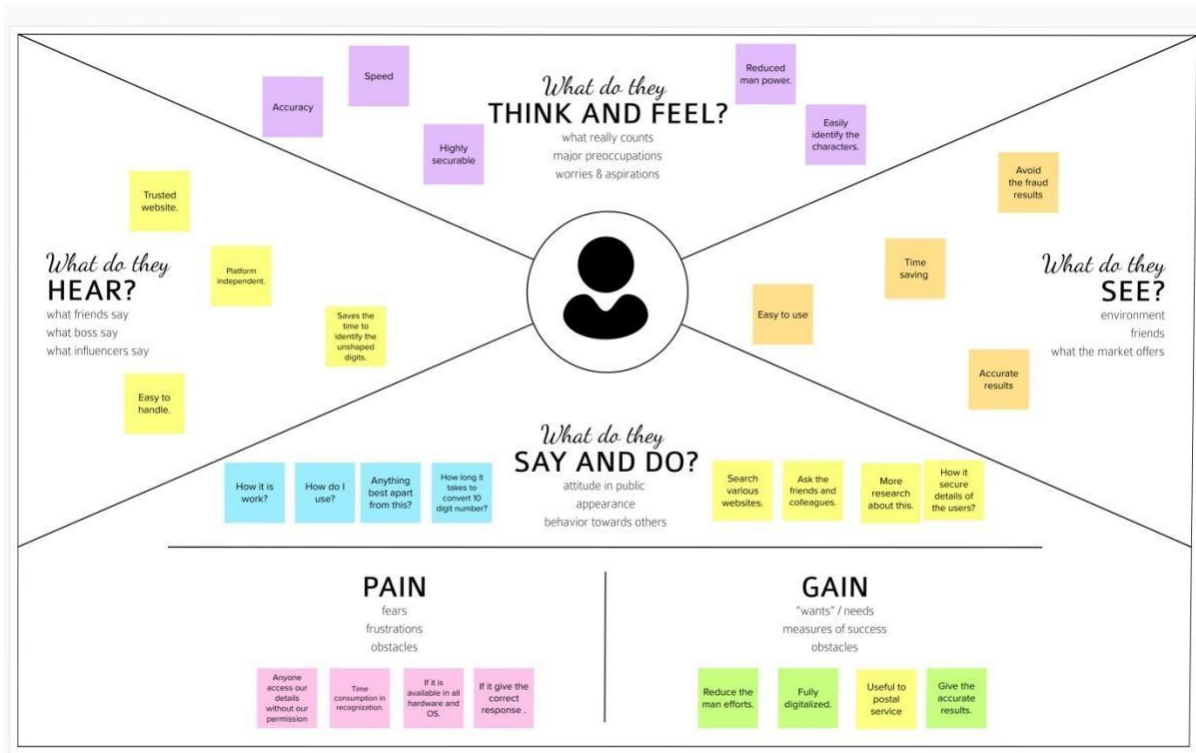
Problem Statement (PS)	I am (Customer)	I'm trying to	But	Because	Which makes me feel
PS-1	A 65 yearsold man	find the digits	I am not able to identify	I don't know how to identify the unshaped digits	I am not able to identify even a single digit.
PS-2	A postalofficer	find the digits in pin code	I am not able to identify the digits	the written digits are unshaped	If I am not able to recognize the accurate digits in pin code, it makes difficult to deliver the post in accurate location.
PS-3	A bankcashier	find the digits in challan	I am not able to identify the digits	the written digits are unshaped	If I not find the accurate digit it will cause difficulties to the customer as well me.
PS-4	A physically challenged person	find the digits	I am not able to identify the digits	the written digits are unshaped	I am not able to identify the digits

### 3. IDEATION & PROPOSED SOLUTION

#### 3.1 Empathy Map Canvas

An empathy map is a simple, easy-to-digest visual that captures knowledge about a user's behaviors and attitudes.

It is a useful tool to helps teams better understand their users. Creating an effective solution requires understanding the true problem and the person who is experiencing it. The exercise of creating the map helps participants consider things from the user's perspective along with his or her goals and challenges.



Reference:

<https://app.mural.co/invitation/mural/virtualworld6297/1662195099256?sender=u9e2cb0f0137232a310757183&key=74a671cf-34c0-4561-b6fc-ced135f6799f>

## 3.2 Ideation & Brainstorming

Brainstorming provides a free and open environment that encourages everyone within a team to participate in the creative thinking process that leads to problem solving. Prioritizing volume over value, out-of-the-box ideas are welcome and built upon, and all participants are encouraged to collaborate, helping each other develop a rich number of creative solutions.

Use this template in your own brainstorming sessions so your team can unleash their imagination and start shaping concepts even if you're not sitting in the same room.

Reference: <https://www.mural.co/templates/empathy-map-canvas>

## Step-1: Team Gathering, Collaboration and Select the Problem Statement

Template



### Brainstorm & idea prioritization

Use this template in your own brainstorming sessions so your team can unleash their imagination and start shaping concepts even if you're not sitting in the same room.

- 10 minutes to prepare
- 1 hour to collaborate
- 2-8 people recommended

After you collaborate

You can export the mural as an image or pdf to share with members of your company who might find it helpful.

Quick add-ons

Share the mural

Share a view link to the mural with stakeholders to keep them in the loop about the outcomes of the session.

Export the mural

Export a copy of the mural as a PNG or PDF to attach to emails, include in slides, or save in your drive.

Keep moving forward

Strategy blueprint

Define the components of a new idea or strategy.

Open the template →

Customer experience journey map

Understand customer needs, motivations, and obstacles for an experience.

Open the template →

Strengths, weaknesses, opportunities & threats

Identify strengths, weaknesses, opportunities, and threats (SWOT) to develop a plan.

Open the template →

Share template feedback

1

Define your problem statement

What problem are you trying to solve? Frame your problem as a How Might We statement. This will be the focus of your brainstorm.

5 minutes

PROBLEM STATEMENT

Now a days people can't recognize the handwritten digits in the various commercial websites like banking, postal, education and many government departments etc. It is hard to use the smart inputs given by the user. Therefore we intend to do a project "Handwritten digit recognition" which is digitally analyze the exact sequence of digit given by the user(mobile).

Key rules of brainstorming

To run an smooth and productive session.

Stay in topic.

Encourage wild ideas.

Defer judgment.

Listen to others.

Go for volume.

If possible, be visual.

Need some inspiration?

See a featured version of this template or kickstart your work.

Open example →

## Step-2: Brainstorm, Idea Listing and Grouping

2

### Brainstorm

Write down any ideas that come to mind that address your problem statement.

⌚ 10 minutes

**TIP**

You can select a sticky note and hit the pencil (switch to sketch) icon to start drawing.

Gokulakannan M

Provide a good starting point to measure growth.	• OCE activities to improve the impact of 100%
Good example to measure and compare with the rest of the world.	• Change the measurement to improve it.
Start and finish the impact in that period.	• Use the same measurement to measure the impact.
Use the 100% data to help the 100%	

## Anbu Marish M

Take two-digit numbers to recognize the digits.	Transfer to the right side of the board and add.
Two numbers are also used.	Map and recognize the digits in the board.
Eighteen is used to recognize the digits.	Arithmetic is used to recognize the digits.
Join the strings and connect the strings.	

**Balaji J**

It is easy to change the color and contrast	Photo is added to the user's online photo album
Recognize the important characters	Details highly confidential in the app
Scan and recognize the text and convert it into image	Highly digital text makes it easier to print
Give the digital image as input	

Naveen R S

How do you use the word <i>imagine</i> in your writing?	Don't use the word <i>imagine</i> in your writing.
Is using the phrase <i>imagine that</i> in your writing a good idea?	Continuing to use the phrase <i>imagine that</i> in your writing.
Don't use the word <i>imagine</i> in your writing.	Use the words <i>imagine that</i> in your writing.

3

### Group ideas

Take turns sharing your ideas while clustering similar or related notes as you go. In the last 10 minutes, give each cluster a sentence-like label. If a cluster is bigger than six sticky notes, try and see if you can break it up into smaller sub-groups.

⌚ 20 minutes

### Private sectors

Food deposits and recognition plates	Swing cushions against apple dented seats	Openly the app seems sensitive top	Designed to control cannery artificial ness
Two small pills on any side or top	Recognize the absence of dancers		

### Social usage

<p>People are people everywhere people have to die.</p>	<p>Scars and wounds be dignity to the people.</p>	<p>Scars and wounds be dignity to the people.</p>	<p>Fully dignified man to man to man to man.</p>
<p>They are scars to be dignity to them.</p>	<p>Dignity to man to man to man.</p>		

### Education

```

graph TD
    A[Define the problem] --> B[Develop a solution]
    B --> C[Design the solution]
    C --> D[Implement the solution]
  
```

### About App

Insert the character in high recognition

Change the recognized image to call

Share the results to social media and other networks, and save the results on the cloud

Provide personalized recognition style

Very accurate app  
Buy rates are reduced

Data is highly confidential in my app

## TO

Add customizable tags to sticky notes to make it easier to find, browse, organize, and categorize important ideas as themes within your mural.





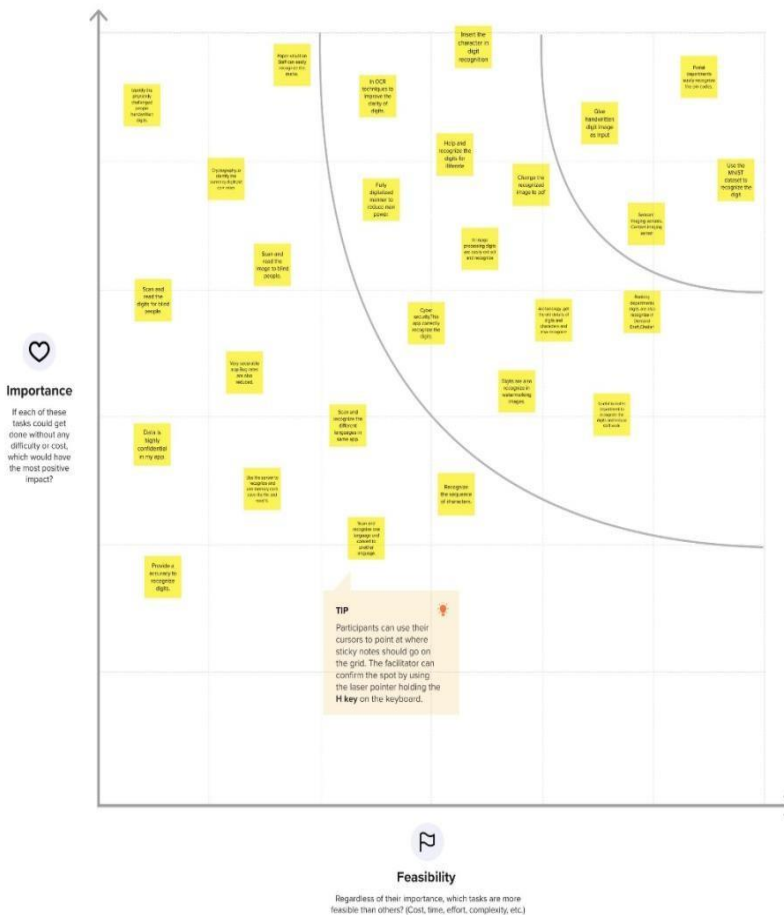
## Step-3: Idea Prioritization

4

### Prioritize

Your team should all be on the same page about what's important moving forward. Place your ideas on this grid to determine which ideas are important and which are feasible.

20 minutes



### After you collaborate

You can export the mural as an image or pdf to share with members of your company who might find it helpful.

### Quick add-ons

- A Share the mural**  
Share a view link to the mural with stakeholders to keep them in the loop about the outcomes of the session.
- B Export the mural**  
Export a copy of the mural as a PNG or PDF to attach to emails, include in slides, or save in your drive.

### Keep moving forward

- Strategy blueprint**  
Define the components of a new idea or strategy.  
[Open the template →](#)
- Customer experience journey map**  
Understand customer needs, motivations, and obstacles for an experience.  
[Open the template →](#)
- Strengths, weaknesses, opportunities & threats**  
Identify strengths, weaknesses, opportunities, and threats (SWOT) to develop a plan.  
[Open the template →](#)

[Share template feedback](#)



### 3.3 Proposed Solution

S.No.	Parameter	Description
1.	Problem Statement (Problem to be solved)	<p>Now a days people can't recognize the handwritten digits in the various commercial services like banking, postal, education, and many government departments etc. It is hard to find the exact digits given by the user.</p> <p>Therefore, we introduce our project "Handwritten digit recognition" which is digitally analyze the exact sequence of digit given by the user (Pin code).</p>
2.	Idea / Solution description	Identify the exact digits which is in the sequence form.
3.	Novelty / Uniqueness	Identify the sequence of digits.
4.	Social Impact / Customer Satisfaction	<p>1.) To identify the pin code in postal Service.</p> <p>2.) To identify the digits in challan, it avoids the fake results.</p>
5.	Business Model (Revenue Model)	<p>1.) Include ads in the application. 2.) We can use the upgrade version to earn money.</p> <p>3.) We can sell our project to the customers.</p>
6.	Scalability of the Solution	<p>We can add the features like 1.) recognize the characters with the digits.</p> <p>2.) We can add the multiple languages to recognize the characters.</p>

### 3.4 Problem Solution fit

The Problem-Solution Fit simply means that you have found a problem with your customer and that the solution you have realized for it actually solves the customer's problem. It helps entrepreneurs, marketers and corporate innovators identify behavioral patterns and recognize what would work and why

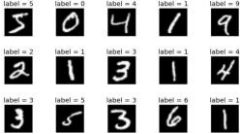
#### PURPOSE:

- ☐ Solve complex problems in a way that fits the state of your customers.
- ☐ Succeed faster and increase your solution adoption by tapping into existing mediums and channels of behavior.
- ☐ Sharpen your communication and marketing strategy with the right triggers and messaging.
- ☐ Increase touch-points with your company by finding the right problem-behavior fit and building trust by solving frequent annoyances, or urgent or costly problems.
- ☐ Understand the existing situation in order to improve it for your target group.

Define cs, fit into cc	<b>1. CUSTOMER SEGMENT(S)</b> Postal officers, Bank cashiers, Education staffs and various government departments. <b>CS</b>	<b>6. CUSTOMER CONSTRAINTS</b> They will save the time taken for deliver the post. They will avoid the problems arise if the bank cashiers recognize the digit wrongly. <b>CC</b>	<b>5. AVAILABLE SOLUTIONS</b> Handwritten digit recognition, Handwritten recognizer, Text scanner(OCR), Digit recognizer. <b>AS</b>	Explore AS, differentiate
	<b>2. JOBS-TO-BE-DONE/PROBLEMS</b> If the postal officers recognize the digits wrongly they will face the problems like time taken for deliver the post and cost to transportation. So, we implement the "Handwritten digit recognition system" it recognize the sequence of digits in the post cover. <b>J&amp;P</b>	<b>9. PROBLEM ROOT CAUSE</b> The bank cashiers will face the problem that the digits in the challan is incorrect. The postman will face the problem while he is recognize the digits in the pin code wrongly. <b>RC</b>	<b>7. BEHAVIOUR</b> They need to sign in or sign up to our application. They will use the camera to capture the image with digits to recognize the digits. <b>BE</b>	
Focus on J&P, tap into BE, understand RC	<b>3. TRIGGERS</b> We can use the social media for advertising our application. They will see the application that is run by the postal officers. <b>TR</b>	<b>10. OUR SOLUTION</b> We can introduce the project that is "A Novel Method for Handwritten Digit Recognition System" which recognize the sequence of digits and give the accurate result of the handwritten digits. <b>SL</b>	<b>8. CHANNELS OF BEHAVIOUR</b> <b>Online:</b> They will have the option like scan or capture the image with digits to recognize . It will clear or save the image. <b>CH</b> <b>Offline:</b> It will show the image that is save while recognize the digits. Procedure to use the application in proper way. Uses of the application.	Extract online & offline CH of BE
Identify strong TR & EM	<b>4. EMOTIONS: BEFORE/AFTER</b> <b>Before:</b> Time taken to deliver the post because the wrong recognition of pin code, Fear of recognize the digits in challan. <b>EM</b> <b>After:</b> Time taken is less for deliver the post, No fear about the recognize the digits in challan.			

## 4. REQUIREMENT ANALYSIS

### 4.1 Functional requirements

FR No.	Functional Requirement and description:
FR-1	<b>Image data:</b> Handwritten digit recognition is the ability of a computer to recognize the human handwritten digits from different sources like images, papers, touch screens, etc and classify them into 10 predefined classes (0-9). This has been a topic of boundless research in the field of deep learning.
FR-2	<b>Digit _Classifier_ Model:</b> Use the MNIST database of handwritten digits to train a convolutional network to predict the digit given an image. First obtain the training and validation model.
FR-3	<b>MNIST dataset:</b> The MNIST dataset is an acronym that stands for the modified National Institute of Standards and Technology dataset. It is a dataset of 60,000 small square 28 * 28-pixel greyscale images of handwritten single digits between 0 and 9. 

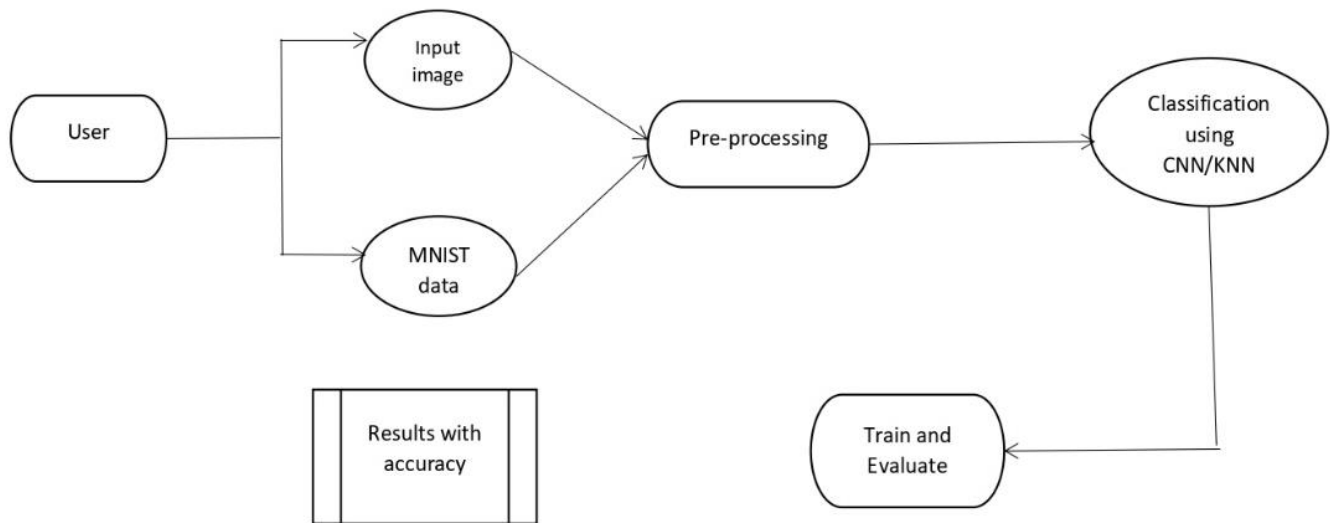
### 4.2 Non-Functional requirements

FR No.	Non-Functional Requirement
NFR-1	<b>Usability:</b> Handwritten digit recognition is one of the practically important issues in pattern recognition applications. The applications of digit recognition include in postal mail sorting, bank check processing, form data entry and etc.
NFR-2	<b>Reliability:</b> <ol style="list-style-type: none"><li>1) The system not only produces a classification of the digit but also a rich description of the instantiation parameters.</li><li>2) The generative models can perform recognition driven segmentation</li><li>3) The method invokes a relatively.</li></ol>
NFR-3	<b>Performance:</b> The neural network uses the examples to automatically infer rules for recognizing handwritten digits. Furthermore, by increasing the number of training examples, the network can learn more about handwriting, and so improve its accuracy. There are a number of ways and algorithms to recognize handwritten digits, including Deep Learning/CNN, SVM, Gaussian Naive Bayes, KNN, Decision Trees, Random Forests etc.
NFR-4	<b>Accuracy:</b> Optical Character Recognition (OCR) technology provides higher than 99% accuracy with typed characters in high-quality images. However, the diversity in human writing types, spacing differences and irregularities of handwriting causes less accurate character recognition.

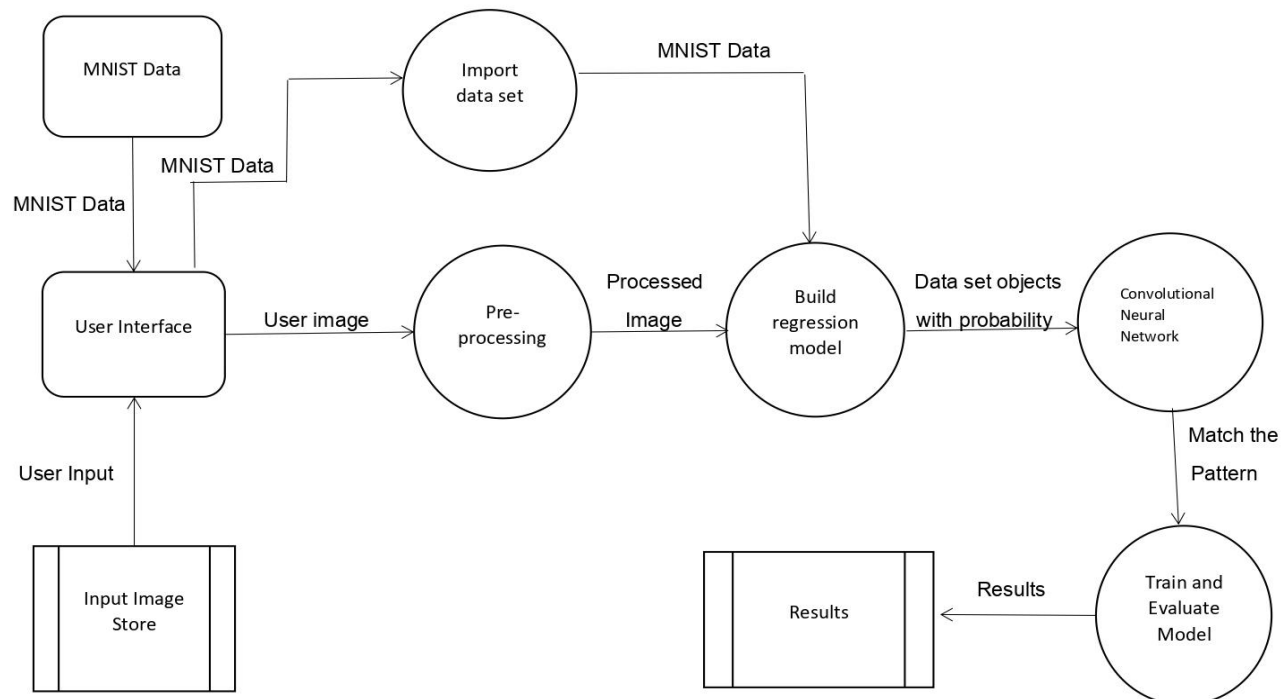
## 5. PROJECT DESIGN

### 5.1 Data Flow Diagrams

A Data Flow Diagram (DFD) is a traditional visual representation of the information flows within a system. A neat and clear DFD can depict the right amount of the system requirement graphically. It shows how data enters and leaves the system, what changes the information, and where data is stored.



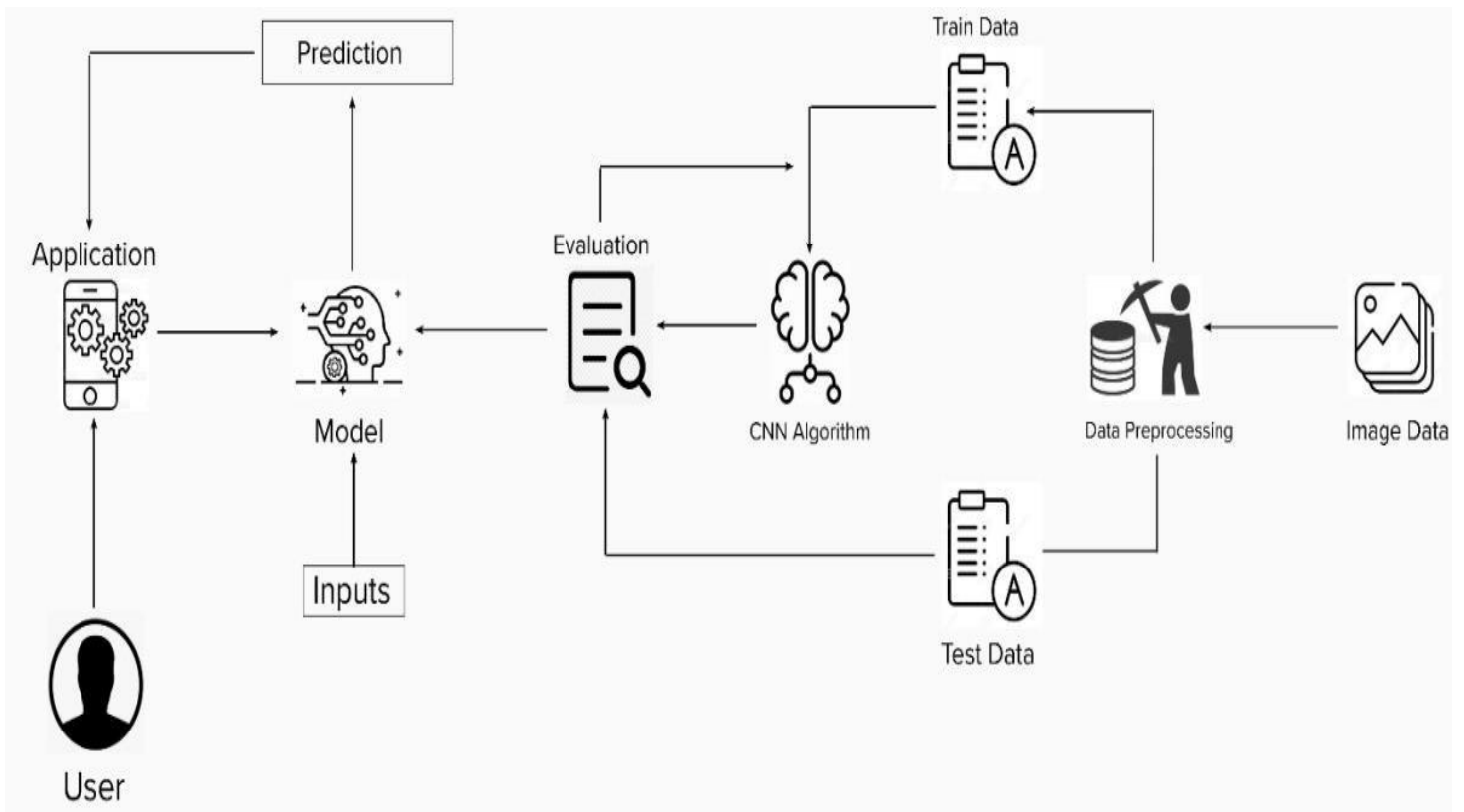
Example: DFD Level 0 (Industry Standard)



## 5.2 Solution & Technical Architecture

Solution architecture is a complex process – with many sub-processes – that bridges the gap between business problems and technology solutions. Its goals are to:

- Find the best tech solution to solve existing business problems.
- Describe the structure, characteristics, behavior, and other aspects of the software to project stakeholders.
- Define features, development phases, and solution requirements.
- Provide specifications according to which the solution is defined, managed, and delivered.



### Reference:

<https://app.mural.co/invitation/mural/ibm80676/1665134485750?sender=uae023cbd0fd8b1d992506520&key=041057db-8752-4aad-b22a-47f057bd6a99>

## 5.3 User Stories

User Type	Functional Requirement (Epic)	User Story Number	User Story / Task	Acceptance criteria	Priority	Release
Customer (Mobile user)	Home	USN-1	As a user, can sign up to create an account and set password.	I can view the awareness to use this application and it's limitations.	Low	Sprint-1
		USN-2	As a user, I will receive confirmation email once I have registered for the application	I can gain knowledge to use this application by a practical method.	Low	Sprint-1
		USN-3	As a user, I can read the instructions to use this application.	I can read instructions also to use it in a user-friendly method.	Low	Sprint-2
	Recognize	USN-4	As a user, In this prediction page, I scan the image.	I can scan the image from our local system and predict the output.	High	Sprint-2
	Predict	USN-5	As a user, I'm allowed to upload and choose the image to be uploaded in this application.	I can upload and choose the image from the system storage and also in my virtual storage.	Medium	Sprint-3
		USN-6	As a user, I will train and test the input to get the maximum accuracy of output.	I can able to train and test the application until it gets maximum accuracy of the result.	High	Sprint-4
		USN-7	As a user, I can access the MNIST data set.	I can access to produce the result.	Medium	Sprint-3
	Recognize	USN-8	As it is an open source, can use it free cost.	I can use it without any payment to be paid for it to access.	Medium	Sprint-2
		USN-9	As a user, I can use the application, virtually anywhere.	I can use the application virtually anywhere.	High	Sprint-1
		USN-10	As it is an application, it is installation free.	I can use it without the installation of any software.	Medium	Sprint-4

## 6. PROJECT PLANNING & SCHEDULING

### 6.1 Sprint Planning & Estimation

Sprint	Functional Requirement (Epic)	User Story Number	User Story / Task	Story Points	Priority	Team Members
Sprint-1	Registration	USN-1	As a user, I can register for the application by entering my email, password, and confirming mypassword.	2	High	Gokulakannan M
Sprint-1	confirmation	USN-2	As a user, I will receive confirmation email once I have registered for the application	1	High	Anbu Marish.M
Sprint-1	Login	USN-3	As a user, I can log into the application by entering email & password	1	High	NAVEEN.R.S
Sprint-2	Data Collection	USN-4	As a user, I can collect the dataset from various resources with different handwritings.	1	Low	Balaji J



Sprint	Functional Requirement (Epic)	User Story Number	User Story / Task	Story Points	Priority	Team Members
Sprint-2	Data Preprocessing	USN-5	As a user, I can load the dataset, handle the missing data, scaling and split data into train and test.	3	Medium	Gokulakannan M
Sprint-2	Model Building	USN-6	As a user, I will get an application with CNN model which provides high accuracy of recognized handwritten digit.	1	High	Anbu Marish.M
Sprint-3	Add CNN layers	USN-7	Creating the model and adding the input, hidden, and output layers to it.	5	High	Naveen.R.S
Sprint-3	Compiling the model	USN-8	With both the training data defined and model defined, it's time to configure the learning process.	2	Medium	Balaji J
Sprint-3	Train & test the model	USN-9	As a user, let us train our model with our image dataset.	5	Medium	Gokulakannan M
Sprint-3	Save the model	USN-10	As a user, the model is saved & integrated with an android application in order to predict something.	2	Low	Anbu Marish.M
Sprint-4	Train the model on IBM	USN-11	As a user, I train the model on IBM and integrate flask/Django with scoring end points.	3	High	Naveen.R.S
Sprint-4	Cloud Deployment	USN-12	As a user, I can access the web application and make use of the product from anywhere.	8	High	Balaji J

## 6.2 Sprint Delivery Schedule

Sprint	Total Story Points	Duration	Sprint Start Date	Sprint End Date (Planned)	Story Points Completed (as on Planned End Date)	Sprint Release Date (Actual)
Sprint-1	15	6 Days	24 Oct 2022	29 Oct 2022	15	29 Oct 2022
Sprint-2	5	6 Days	31 Oct 2022	05 Nov 2022	5	05 Nov 2022
Sprint-3	14	6 Days	07 Nov 2022	12 Nov 2022	14	12 Nov 2022
Sprint-4	11	6 Days	14 Nov 2022	19 Nov 2022	11	19 Nov 2022

### Velocity:

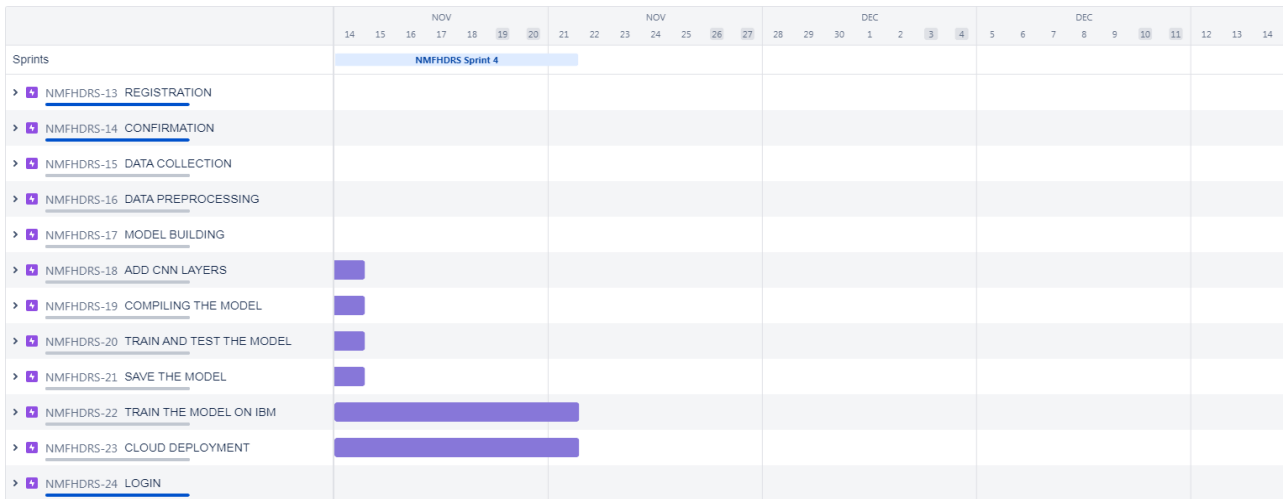
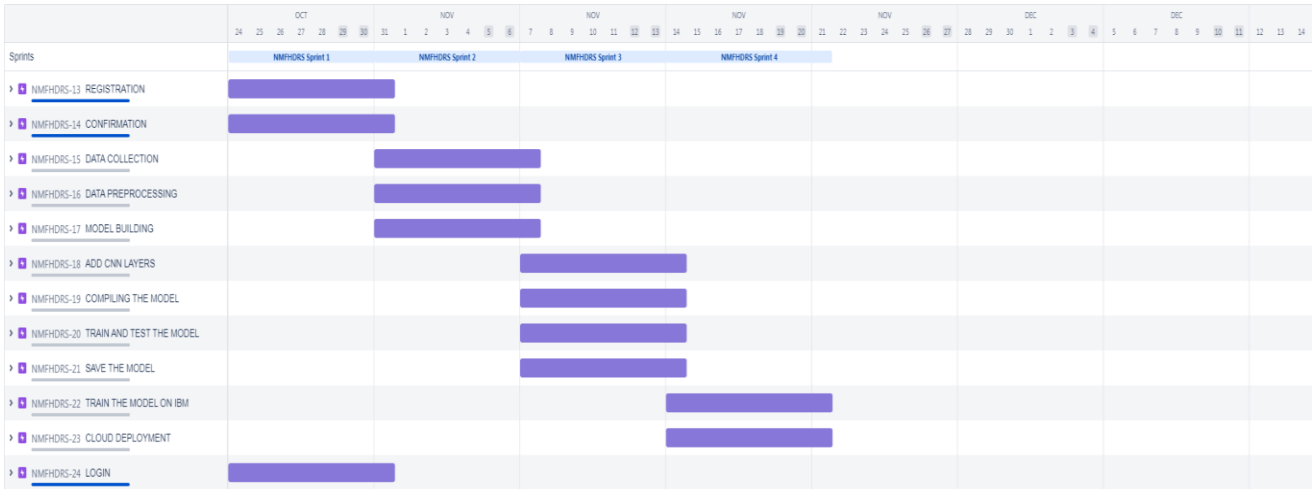
Imagine we have a 10-day sprint duration, and the velocity of the team is 20 (points per sprint). Let's calculate the team's average velocity (AV) per iteration unit (story points per day)

$$AV = \frac{\text{sprint duration}}{\text{velocity}} = \frac{20}{10} = 2$$

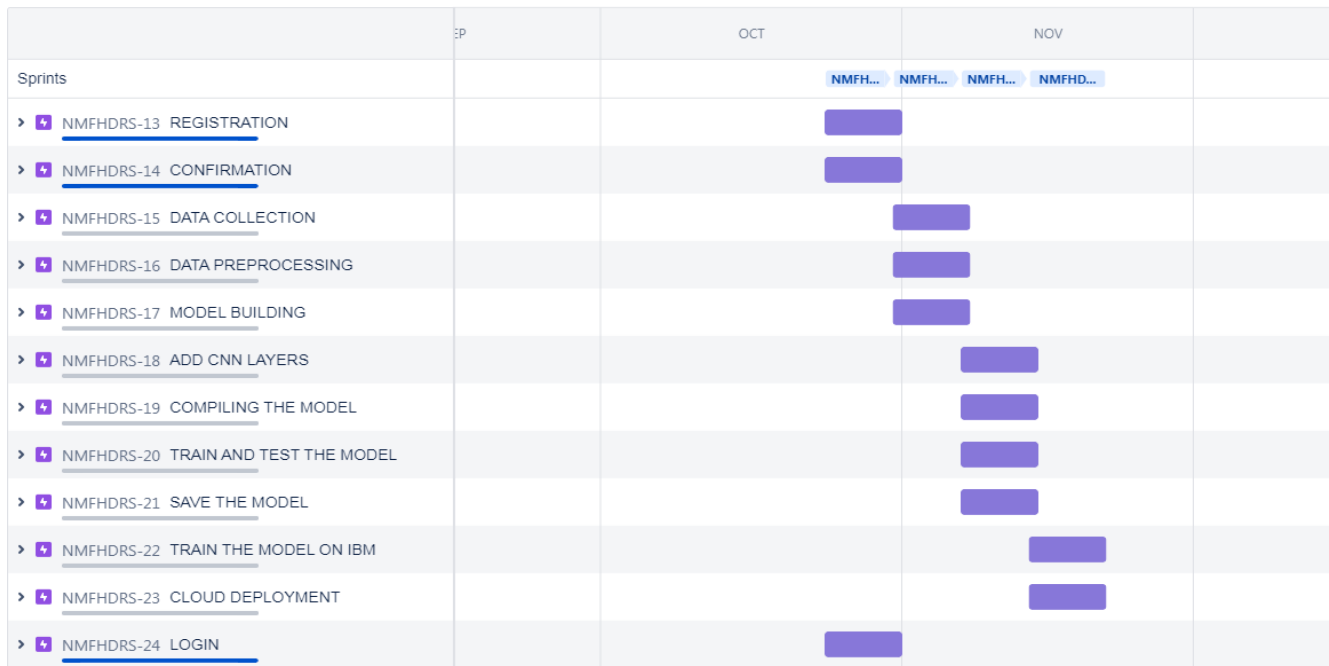
Sprint	Total story points	Duration	Average velocity
Sprint 1	15	6 Days	2.5
Sprint 2	5	6 Days	0.83
Sprint 3	14	6 Days	2.33
Sprint 4	11	6 Days	1.83
Total	45	24	1.87

Burndown Chart:

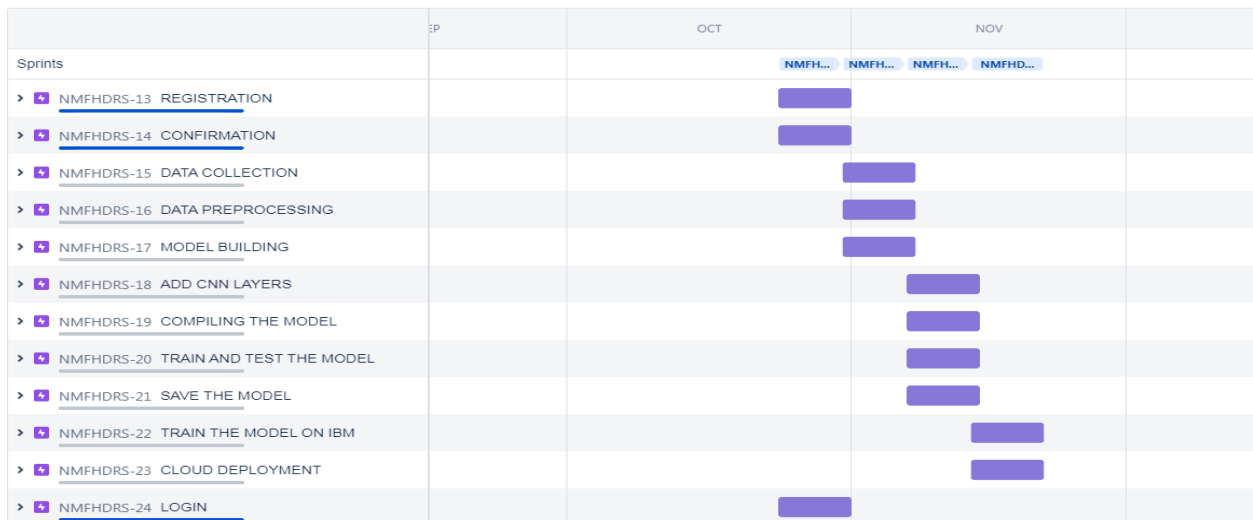
A burndown chart is a graphical representation of work left to do versus time. It is often used in agile software development methodologies such as Scrum. However, burndown charts can be applied to any project containing measurable progress over time.

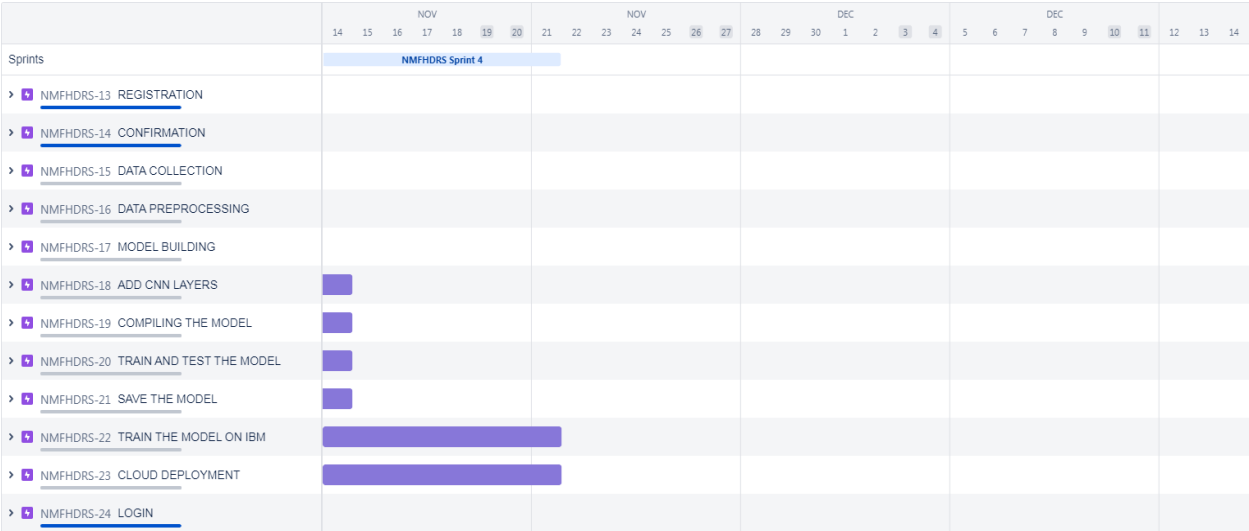
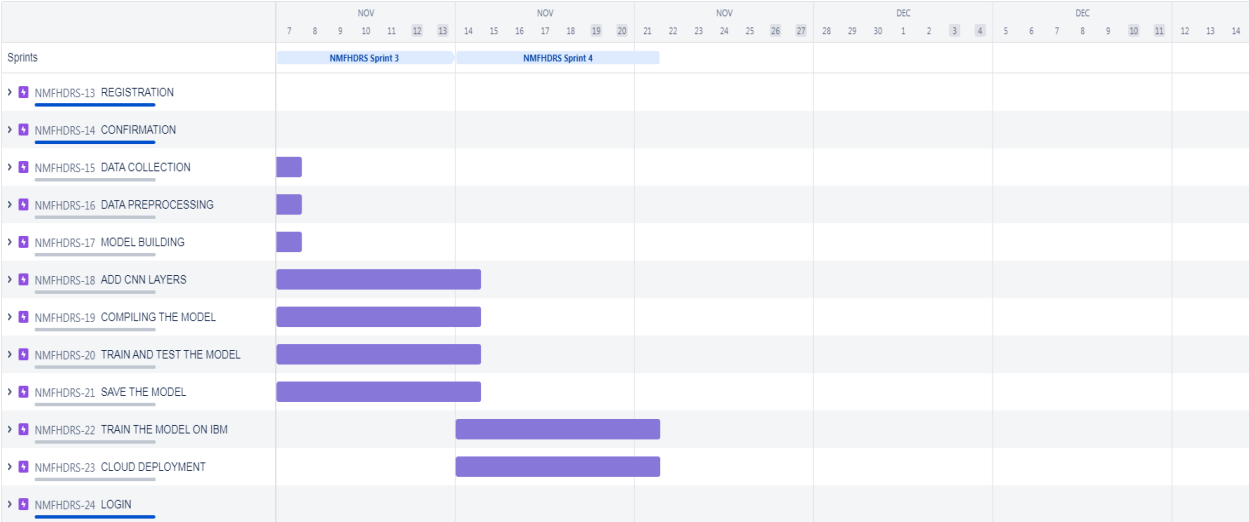
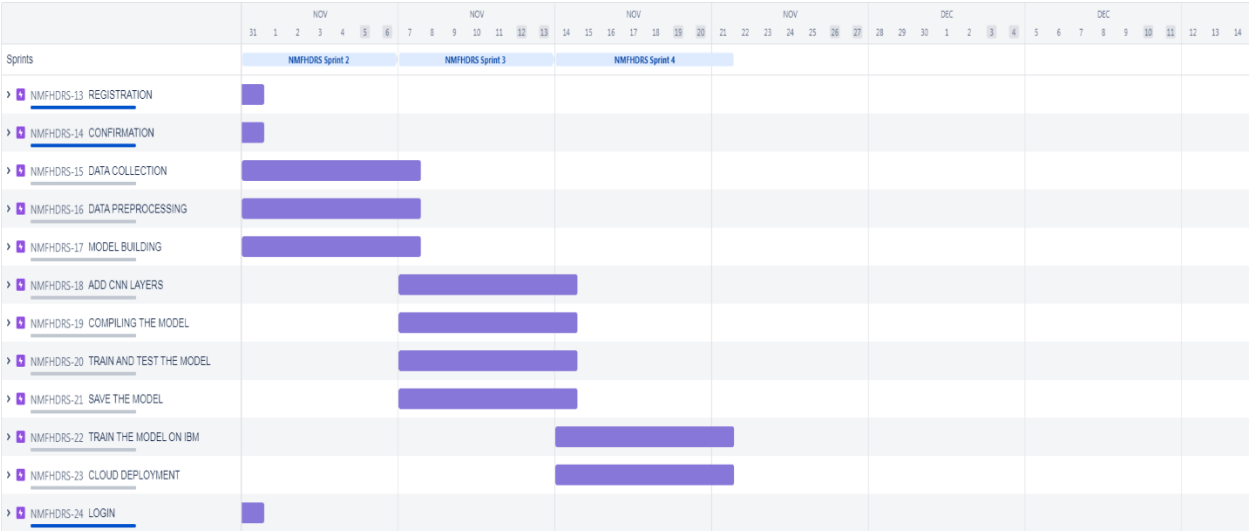


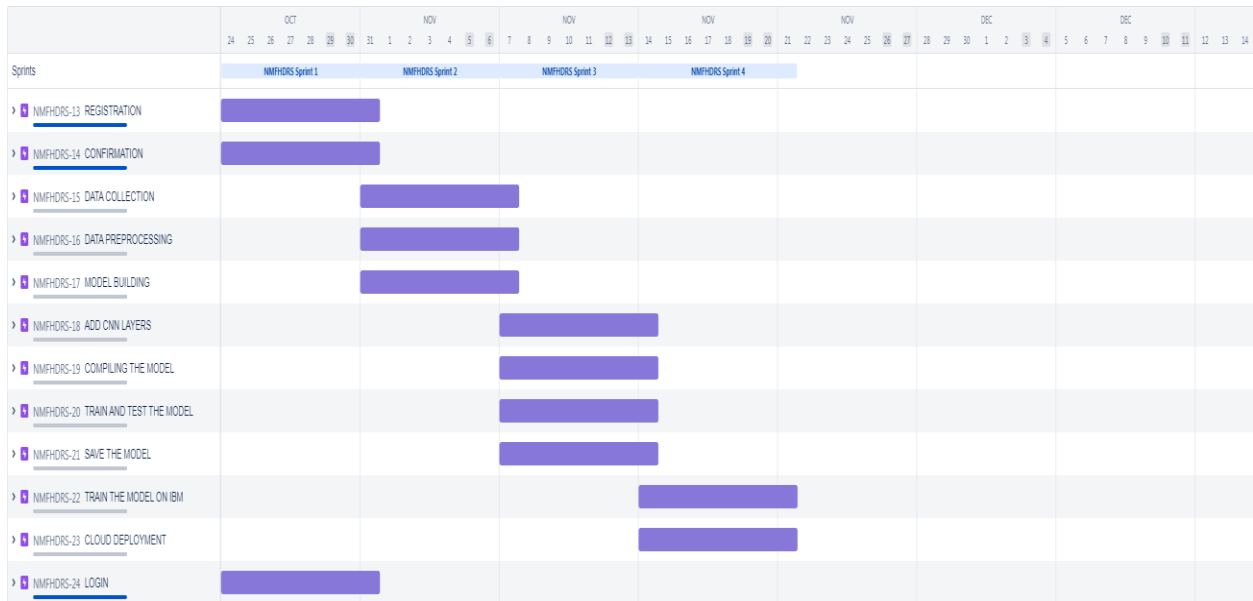




## 6.3 Reports from JIRA







## 7. CODING & SOLUTIONING (Explain the features added in the project along with code)

### 7.1 Feature

#### Load the data

`(X_train, y_train), (X_test, y_test) = mnist.load_data()`

```
Downloading data from https://storage.googleapis.com/tensorflow/tf-keras-datasets/mnist.npz
11490434/11490434 [=====] - 0s 0us/step
```

#### Analyzing the data

```
print(X_train.shape)
```

```
print(X_test.shape)
```

```
(60000, 28, 28)
(10000, 28, 28)
```

X\_train[0]

```
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    80, 156, 107, 253, 253,
  205, 11,    0,   43, 154,    0,    0,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0, 14,    1, 154, 253,
  90,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0, 139, 253,
  190, 2,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0, 11, 190,
  253, 70,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0, 35,
  241, 225, 160, 108,    1,    0,    0,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,
  81, 240, 253, 253, 119, 25,    0,    0,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,
  0, 45, 186, 253, 253, 150, 27,    0,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,
  0,    0, 16, 93, 252, 253, 187,    0,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,
  0,    0,    0,    0, 249, 253, 249, 64,    0,    0,    0,    0,    0,    0,
    0,    0],
  [ 0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,    0,
  0,    0, 46, 130, 183, 253, 253, 207,    2,    0,    0,    0,    0,    0,
    0,    0],
```

---

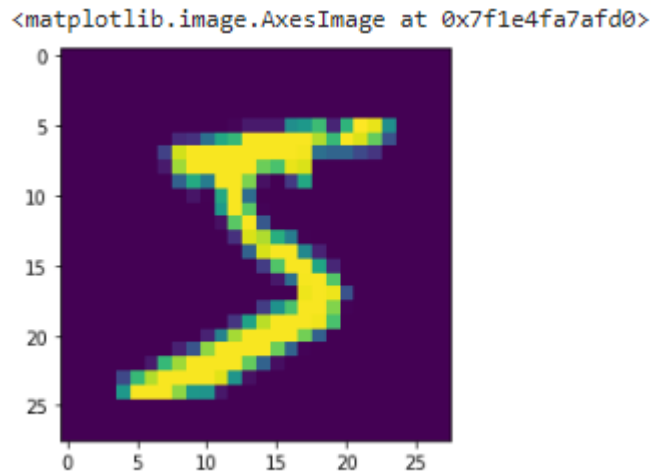
y\_train[0]

Output:



```
plt.imshow(X_train[0])
```

Output:



## Process the data

```
X_train = X_train.reshape(60000, 28, 28, 1).astype('float32')
```

```
X_test = X_test.reshape(10000, 28, 28, 1).astype('float32')
```

```
number_of_classes = 10
```

```
Y_train = np_utils.to_categorical(y_train, number_of_classes)
```

```
Y_test = np_utils.to_categorical(y_test, number_of_classes)
```

Output:

```
array([0., 0., 0., 0., 0., 1., 0., 0., 0., 0.], dtype=float32)
```

## Creating the model

```
model = Sequential()
```

```
model.add(Conv2D(64, (3, 3), input_shape=(28, 28, 1), activation="relu"))
```

```
model.add(Conv2D(32, (3, 3), activation="relu"))
```

```
model.add(Flatten())
```

```
model.add(Dense(number_of_classes, activation="softmax"))
```

```
model.compile(loss='categorical_crossentropy', optimizer="Adam", metrics=["accuracy"])
```

## Training the model

```
model.fit(X_train, Y_train, batch_size=32, epochs=5,
validation_data=(X_test,Y_test))
```

output

---

```
Epoch 1/5
1875/1875 [=====] - 210s 111ms/step - loss: 0.2144 - accuracy: 0.9519 - val_loss: 0.0811 - val_accuracy: 0.9756
Epoch 2/5
1875/1875 [=====] - 209s 111ms/step - loss: 0.0687 - accuracy: 0.9791 - val_loss: 0.0775 - val_accuracy: 0.9763
Epoch 3/5
1875/1875 [=====] - 205s 110ms/step - loss: 0.0482 - accuracy: 0.9849 - val_loss: 0.0928 - val_accuracy: 0.9741
Epoch 4/5
1875/1875 [=====] - 207s 111ms/step - loss: 0.0371 - accuracy: 0.9885 - val_loss: 0.0881 - val_accuracy: 0.9781
Epoch 5/5
1875/1875 [=====] - 204s 109ms/step - loss: 0.0268 - accuracy: 0.9913 - val_loss: 0.1048 - val_accuracy: 0.9777
```

---

## Testing the model

```
metrics = model.evaluate(X_test, Y_test, verbose=0)
print("Metrics (Test Loss & Test Accuracy): ")
print(metrics)
```

output

---

```
Metrics (Test Loss & Test Accuracy):
[0.10484439879655838, 0.9776999950408936]
```

---

```
prediction = model.predict(X_test[:4])
print(prediction)
```

output

---

```
1/1 [=====] - 0s 188ms/step
[[9.72196212e-11 3.55566171e-19 1.62708407e-08 4.93014352e-10
 4.07531131e-19 4.04937246e-14 9.97477144e-25 1.00000000e+00
 6.55548740e-11 1.02851588e-10]
[1.47237875e-08 2.46068471e-10 9.99970078e-01 2.04319695e-05
 6.09304574e-16 2.80278103e-14 1.33527167e-09 3.53577747e-21
 9.55071573e-06 8.16783614e-17]
[1.50826168e-07 9.99999285e-01 4.40007364e-09 1.09360784e-12
 3.45145956e-08 3.61518426e-10 2.13694635e-11 9.31930888e-09
 4.81676750e-07 4.37127819e-14]
[1.00000000e+00 1.82629634e-17 7.77175226e-14 6.26987949e-17
 3.55430940e-17 8.90434807e-13 2.41729969e-10 1.84495042e-17
 2.86195456e-10 9.55759994e-13]]
```

---

```
print(numpy.argmax(prediction, axis=1))
print(Y_test[:4])
```

output

---

```
[7 2 1 0]
[[0. 0. 0. 0. 0. 0. 0. 1. 0. 0.]
 [0. 0. 1. 0. 0. 0. 0. 0. 0. 0.]
 [0. 1. 0. 0. 0. 0. 0. 0. 0. 0.]
 [1. 0. 0. 0. 0. 0. 0. 0. 0. 0.]]
```

---

## Save the model

```
model.save("model.h5")
```

## Test the saved model

```
model=load_model("model.h5")
```

In [20]:

```
img = Image.open("sample.png").convert("L")
img = img.resize((28, 28))
img2arr = np.array(img)
img2arr = img2arr.reshape(1, 28, 28, 1)
results = model.predict(img2arr)
results = np.argmax(results,axis = 1)
results = pd.Series(results,name="Label")
print(results)
```

output

---

```
1/1 [=====] - 0s 140ms/step
0    2
Name: Label, dtype: int64
```

---

## Import Libraries

```
import requests
import numpy as np
from PIL import Image, ImageOps
import matplotlib.pyplot as plt
```

## Input Pre-processing

```
img = Image.open(f"sample/sample 1.png").convert("L")
```

```

img = ImageOps.invert(img)
img = img.resize((28, 28))
img_arr = np.array(img)
img_arr = img_arr / 255.0
img_arr = img_arr.reshape(28, 28, 1)

img2 = Image.open(f"sample/sample 2.png").convert("L")
img2 = ImageOps.invert(img2)
img2 = img2.resize((28, 28))
img2_arr = np.array(img2)
img2_arr = img2_arr / 255.0
img2_arr = img2_arr.reshape(28, 28, 1)

img3 = Image.open(f"sample/sample 3.png").convert("L")
img3 = ImageOps.invert(img3)
img3 = img3.resize((28, 28))
img3_arr = np.array(img3)
img3_arr = img3_arr / 255.0
img3_arr = img3_arr.reshape(28, 28, 1)

```

## Get results from deployed model

```

import requests

API_KEY = "hXFJaBL1u3AzIC6m6xVnnXWh3Bx_9is80s39JaByOKfY"
token_response = requests.post('https://iam.cloud.ibm.com/identity/token',
data={"apikey":
    API_KEY, "grant_type": 'urn:ibm:params:oauth:grant-type:apikey'})
mltoken = token_response.json()["access_token"]

header = {'Content-Type': 'application/json', 'Authorization': 'Bearer ' +
mltoken}

# NOTE: manually define and pass the array(s) of values to be scored in the
next line
payload_scoring = {"input_data": [{"fields": [], "values": [img_arr.tolist(),
img2_arr.tolist(), img3_arr.tolist()]}]}

response_scoring = requests.post('https://us-
south.ml.cloud.ibm.com/ml/v4/deployments/8c54e659-5b13-406f-8e9f-
2e240c2d5012/predictions?version=2022-11-16', json=payload_scoring,
    headers={'Authorization': 'Bearer ' + mltoken})
print("Scoring response")
print(response_scoring.json())

```

output

Scoring response

```
{'predictions': [{'id': 'dense_1', 'fields': ['prediction', 'prediction_classes', 'probability'], 'values': [[[1.9807320228437675e-09, 5.488261081154633e-07, 0.9999916553497314, 2.4803330944678237e-08, 7.750519670501888e-10, 1.4670548109663173e-10, 9.881327700522746e-11, 7.824923159205355e-06, 3.828001471362086e-09, 6.413526654203139e-11], 2, [1.9807320228437675e-09, 5.488261081154633e-07, 0.9999916553497314, 2.4803330944678237e-08, 7.750519670501888e-10, 1.4670548109663173e-10, 9.881327700522746e-11, 7.824923159205355e-06, 3.828001471362086e-09, 6.413526654203139e-11]], [[1.1611423644808383e-07, 3.2054499570222106e-06, 0.0002688071981538087, 9.318210504716262e-05, 2.1655355286753775e-09, 2.05039825118547e-08, 7.067622875833734e-11, 0.9996047616004944, 2.703320660657482e-07, 2.9663708119187504e-05], 7, [1.1611423644808383e-07, 3.2054499570222106e-06, 0.0002688071981538087, 9.318210504716262e-05, 2.1655355286753775e-09, 2.05039825118547e-08, 7.067622875833734e-11, 0.9996047616004944, 2.703320660657482e-07, 2.9663708119187504e-05]], [[5.0797520856349365e-08, 4.462049396636303e-09, 0.0006250494043342769, 3.2606001809654117e-07, 1.1626272680587135e-05, 8.228857950598467e-06, 1.1280261560386862e-06, 8.570811615982166e-08, 0.9991530179977417, 0.00020047719590365887], 8, [5.0797520856349365e-08, 4.462049396636303e-09, 0.0006250494043342769, 3.2606001809654117e-07, 1.1626272680587135e-05, 8.228857950598467e-06, 1.1280261560386862e-06, 8.570811615982166e-08, 0.9991530179977417, 0.00020047719590365887]]]]]}
```

---

## Display results

```
plt.imshow(plt.imread("sample/sample 1.png"))
plt.axis('off')
plt.show()
print("Result: ", response_scoring.json()['predictions'][0]['values'][0][1])
```

### output



Result: 2

---

```
plt.imshow(plt.imread("sample/sample 2.png"))
plt.axis('off')
plt.show()
print("Result: ", response_scoring.json()['predictions'][0]['values'][1][1])
```

### output

7

Result: 7

---

```
plt.imshow(plt.imread("sample/sample 3.png"))
plt.axis('off')
plt.show()
print("Result: ", response_scoring.json()['predictions'][0]['values'][2][1])
```

output

8

Result: 8

---

## 8. TESTING

### 8.1 Test Cases

This report shows the number of test cases that have passed, failed, and untested

Section	Total Cases	Not Tested	Fail	Pass
Print Engine	8	0	0	8
Client Application	50	0	0	50
Security	3	0	0	3
Outsource Shipping	2	0	0	2
Exception Reporting	8	0	0	8
Final Report Output	5	0	0	5
Version Control	3	0	0	3

### 8.2 User Acceptance Testing

This report shows the number of resolved or closed bugs at each severity level, and how they were resolved

Resolution	Severity 1	Severity 2	Severity 3	Severity 4	Subtotal
By Design	8	3	3	2	16
Duplicate	2	1	2	0	5
External	2	3	0	1	6
Fixed	9	3	3	18	33
Not Reproduced	1	2	0	0	3
Skipped	0	1	1	1	3
Won't Fix	0	5	2	1	8
Totals	22	18	11	23	74

## 9. RESULTS

### 9.1 Performance Metrics

MODEL SUMMARY

Model: "sequential"

Layer (type)	Output Shape	Param #
conv2d (Conv2D)	(None, 26, 26, 64)	640
conv2d_1 (Conv2D)	(None, 24, 24, 32)	18464
flatten (Flatten)	(None, 18432)	0
dense (Dense)	(None, 10)	184330

Total params: 203,434

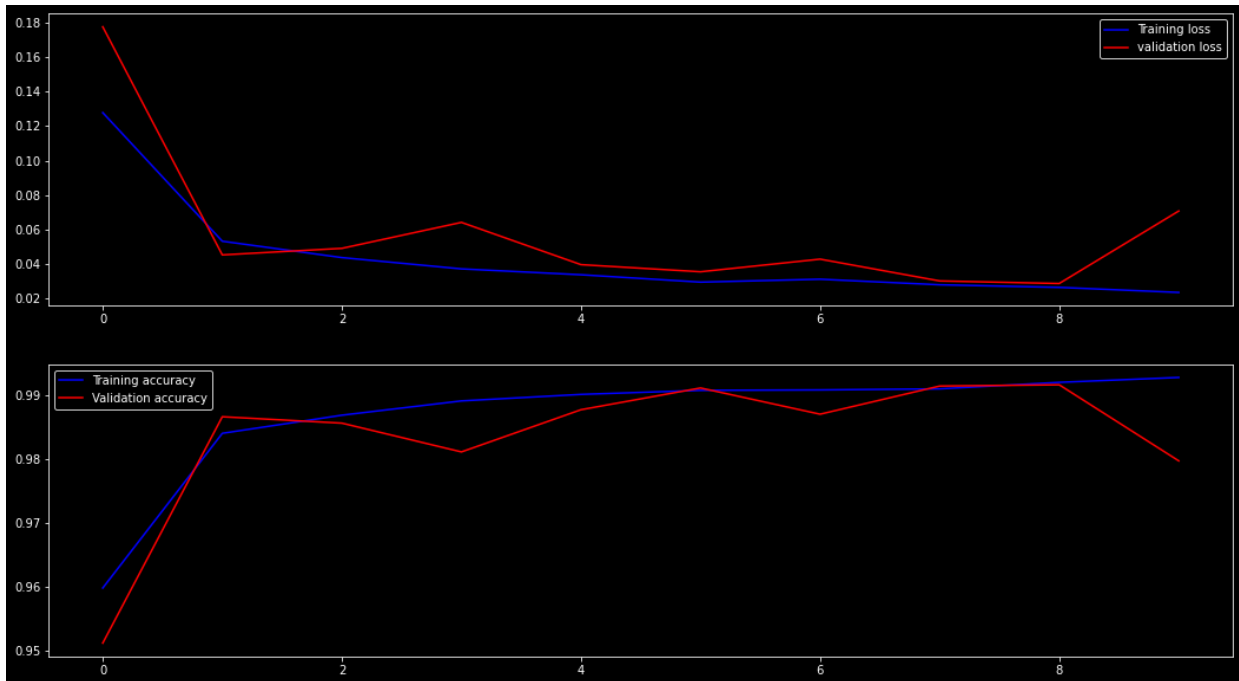
Trainable params: 203,434

Non-trainable params: 0

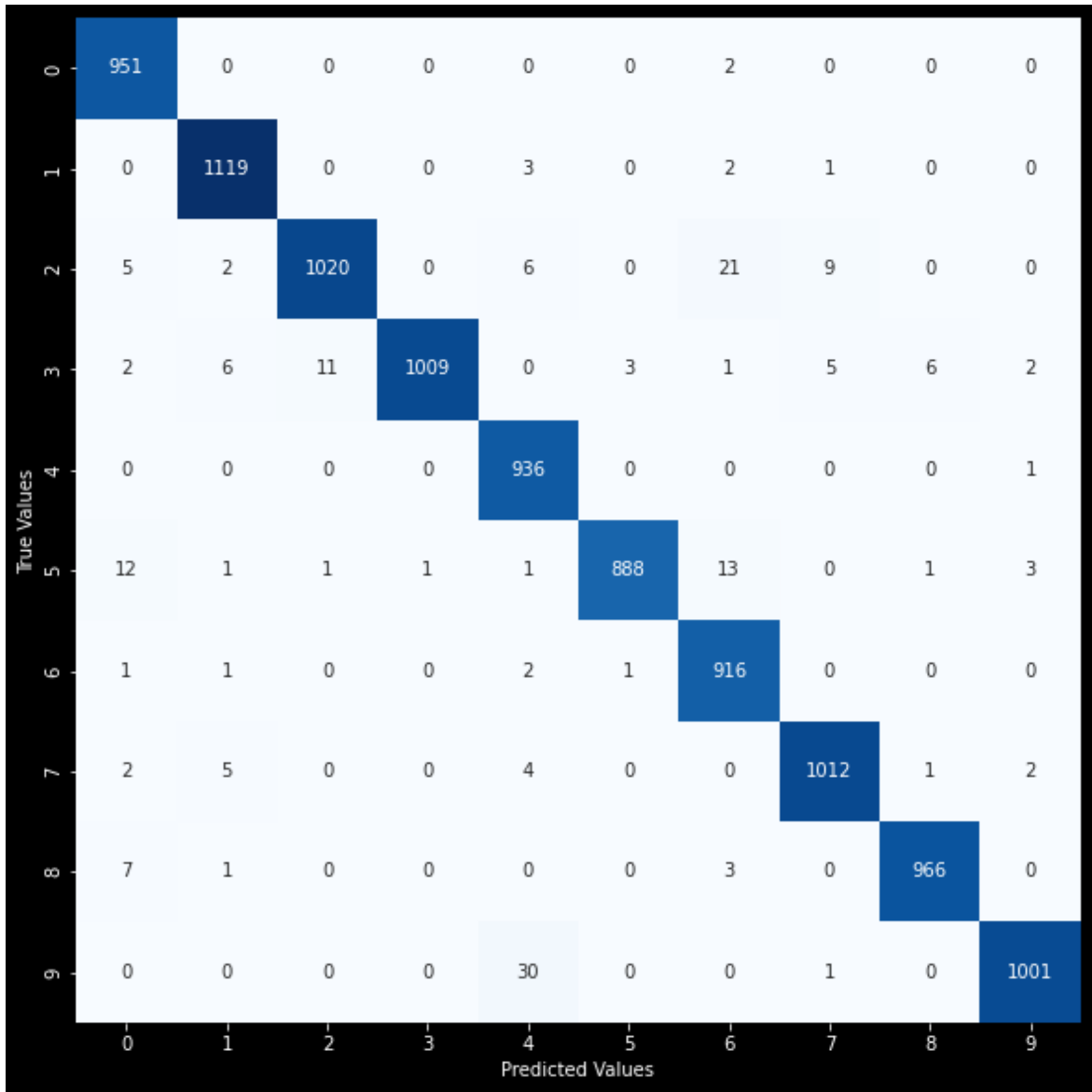


## ACCURACY

CONTENT	VALUE
Training Accuracy	99.14%
Training Loss	2.70%
Validation Accuracy	97.76%
Validation Loss	10.36%



CONFUSION MATRIX



	precision	recall	f1-score	support
0	1.00	0.97	0.98	980
1	0.99	0.99	0.99	1135
2	0.96	0.99	0.97	1032
3	0.97	1.00	0.98	1010
4	1.00	0.95	0.98	982
5	0.96	1.00	0.98	892
6	0.99	0.96	0.97	958
7	0.99	0.98	0.99	1028
8	0.99	0.99	0.99	974
9	0.97	0.99	0.98	1009
accuracy			0.98	10000
macro avg	0.98	0.98	0.98	10000
weighted avg	0.98	0.98	0.98	10000

## 10.ADVANTAGES & DISADVANTAGES

### ADVANTAGE:

It is used in the postal service to recognize the pin code by the postman to identify the accurate place using this system.

It is used in the bank to identify the handwritten digits in the challans to avoid the money loss because of wrong identification of digits.

### DISADVANTAGE:

It is not useful for illiterate peoples because they don't have enough knowledge to use this application.

It mainly focuses on only digit recognition, not for character recognitions.

## CONFUSION MATRIX

## 11.CONCLUSION

By using this system, we can easily identify the handwritten digits. It will reduce the time To identify the accurate result by using the CNN model.

The proposed method obtained 98% accuracy and is able to identify real-world images as well; the loss percentage in both training and evaluation is less than 0.1, which is negligible.

## 12.FUTURE SCOPE

In future we can add features like,

- character recognition
- character recognition for multiple languages
- character with digit recognition
- make useful for blind peoples

## 13.APPENDIX

### Source Code

```
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"Import packages"
]
},
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"execution_count": 1,
"id": "e869d9d2",
"metadata": {},
```

```

"outputs": [],
"source": [
CONFUSION MATRIX
"import numpy as np\n",
"import pandas as pd\n",
"import matplotlib.pyplot as plt\n",
"from keras.utils import np_utils\n",
"from tensorflow.keras.datasets import mnist\n",
"from tensorflow.keras.models import Sequential\n",
"from tensorflow.keras.layers import Conv2D, Dense, Flatten\n",
"from tensorflow.keras.optimizers import Adam\n",
"from tensorflow.keras.models import load_model\n",
"from PIL import Image, ImageOps"
]
},
{
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"id": "fcc79e8e",
"metadata": {},
"source": [
"Load the data"
]
},
{
"cell_type": "code",
"execution_count": 2,
"id": "e977ee08",
"metadata": {},
"outputs": [],

```

```

"source": [
CONFUSION MATRIX
(X_train, y_train), (X_test, y_test) = mnist.load_data()"
]
},
{
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"id": "d8aa2993",
"metadata": {},
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"Data analysis"
]
},
{
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"metadata": {},
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{
"name": "stdout",
"output_type": "stream",
"text": [
"(60000, 28, 28)\n",
"(10000, 28, 28)\n"
]
}
],
"source": [

```

```

"print(X_train.shape)\n",
CONFUSION MATRIX
"print(X_test.shape)"
]
},
{
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"id": "5b4e57f4",
"metadata": {},
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" 0,  0],\n",
" [ 0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  3,\n",
" 18, 18, 18, 126, 136, 175, 26, 166, 255, 247, 127, 0, 0,\n",
" 0, 0],\n",
" [ 0,  0,  0,  0,  0,  0,  0,  0, 30, 36, 94, 154, 170,\n",
" [ 0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,\n",
" 0,  0, 16, 93, 252, 253, 187, 0, 0, 0, 0, 0, 0,\n",
" 0, 0],\n",
" [ 0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,\n",
" 0,  0,  0, 249, 253, 249, 64, 0, 0, 0, 0, 0,\n",
" 0, 0],\n",
" [ 0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,  0,\n",
" 0, 46, 130, 183, 253, 253, 207, 2, 0, 0, 0, 0, 0,\n",

```

```

" 0, 0],\n",
CONJUNCTION MATRIX
" [ 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 39,\n",
" 148, 229, 253, 253, 253, 250, 182, 0, 0, 0, 0, 0, 0,\n",
" 0, 0],\n",
" [ 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 24, 114, 221,\n",
" 253, 253, 253, 253, 201, 78, 0, 0, 0, 0, 0, 0,\n",
" 0, 0],\n",
" [ 0, 0, 0, 0, 0, 0, 0, 0, 23, 66, 213, 253, 253,\n",
" 253, 253, 198, 81, 2, 0, 0, 0, 0, 0, 0, 0,\n",
" 0, 0],\n",
" [ 0, 0, 0, 0, 0, 0, 18, 171, 219, 253, 253, 253, 253,\n",
" 195, 80, 9, 0, 0, 0, 0, 0, 0, 0, 0, 0,\n",
" 0, 0],\n",
" [ 0, 0, 0, 0, 55, 172, 226, 253, 253, 253, 253, 244, 133,\n",
" 11, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,\n",
" 0, 0],\n",
" [ 0, 0, 0, 0, 136, 253, 253, 253, 212, 135, 132, 16, 0,\n",
" 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,\n",
" 0, 0],\n",
" [ 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,\n",
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"metadata": {},
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}
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```



**"X\_train[0]"**

**CONFUSION MATRIX**

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**]**

**},**

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**"output\_type": "execute\_result"**

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**"source": [**

**"y\_train[0]"**

**]**

**},**

**{**

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        AjD5fa
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**CONFUSION MATRIX**

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We7b0h**

**7mtgcgGY0E/axvgR4z7m3EbE6InojoneapjexOQDNaCbs2yXNH/X445J2NNc  
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**"plt.imshow(X\_train[0])"**

**]**

**},**

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**"Data Pre-processing"**

**]**

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    "number_of_classes = 10\n",
    "Y_train = np_utils.to_categorical(y_train, number_of_classes)\n",
    "Y_test = np_utils.to_categorical(y_test, number_of_classes)"
  ]
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```

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```

```

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"model = Sequential()\n",
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"activation=\"relu\")\n",
"model.add(Conv2D(32, (3, 3), activation=\"relu\")\n",
"model.add(Flatten())\n",
"model.add(Dense(number_of_classes, activation=\"softmax\"))"
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"model.compile(loss='categorical_crossentropy', optimizer=\"Adam\",
metrics=[\"accuracy\"])"
]
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"Train the model"

```

```

]
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        0.2377 - accuracy: 0.9523 - val_loss: 0.0928 - val_accuracy: 0.9719\n",
        "Epoch 2/5\n",
        "1875/1875 [=====] - 100s 53ms/step - loss:
        0.0656 - accuracy: 0.9803 - val_loss: 0.0910 - val_accuracy: 0.9729\n",
        "Epoch 3/5\n",
        "1875/1875 [=====] - 105s 56ms/step - loss:
        0.0458 - accuracy: 0.9857 - val_loss: 0.1193 - val_accuracy: 0.9684\n",
        "Epoch 4/5\n",
        "1875/1875 [=====] - 109s 58ms/step - loss:
        0.0368 - accuracy: 0.9883 - val_loss: 0.1116 - val_accuracy: 0.9766\n",
        "Epoch 5/5\n",
        "1875/1875 [=====] - 106s 56ms/step - loss:
        0.0274 - accuracy: 0.9914 - val_loss: 0.1173 - val_accuracy: 0.9748\n"
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  ]
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```

```
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validation_data=(X_test,Y_test))"  
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],
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"metrics = model.evaluate(X_test, Y_test, verbose=0)\n",
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"print(metrics)"
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"text": [
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```

"1/1 [=====] - 0s 82ms/step\n",
COMPRESSOR\n",
" 1.8974715e-15 1.2059106e-19 9.9998116e-01 5.5190859e-11 3.0066661e-12\n",
" [3.6490474e-11 8.6607568e-11 9.9999988e-01 1.4327577e-09 6.2738566e-15\n",
" 1.4905276e-18 3.5467995e-09 3.2217497e-17 7.2324944e-08 2.6815476e-20\n",
" [5.2345695e-07 9.8446769e-01 5.0688081e-04 2.0625328e-09 7.7538867e-03\n",
" 8.2934766e-06 2.1169055e-06 2.6437547e-07 7.2603868e-03 2.1643283e-10\n",
" [1.0000000e+00 2.3432516e-15 1.6870000e-10 1.4166539e-14 4.9352419e-14\n",
" 8.6952261e-13 4.7428284e-10 3.0202582e-16 1.2158017e-12 3.0176420e-10\n",
]\n",
]\n",
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"prediction = model.predict(X_test[:4])\n",
"print(prediction)"
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" [1. 0. 0. 0. 0. 0. 0. 0. 0. 0.]]\n"
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"print(Y_test[:4])"
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  "metadata": {},
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  "metadata": {},
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},

```

```

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      "output_type": "stream",
      "text": [
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        "0 2\n",
        "Name: Label, dtype: int64\n"
      ]
    }
  ],
  "source": [
    "img = Image.open('sample.png').convert('L')\n",
    "img = img.resize((28, 28))\n",
    "img2arr = np.array(img)\n",
    "img2arr = img2arr.reshape(1, 28, 28, 1)\n",
    "results = model.predict(img2arr)\n",
    "results = np.argmax(results,axis = 1)\n",
    "results = pd.Series(results,name='Label')\n",
    "print(results)"
  ]
}

```

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"name": "ipython",
"version": 3
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**CONFUSION MATRIX**

**app.py**

**from flask import Flask,render\_template,request**

**from recognizer import recognize**

**app=Flask(\_\_name\_\_)**

**@app.route('/')**

**def main():**

**return render\_template("home.html")**

**@app.route('/predict',methods=['POST'])**

**def predict():**

**if request.method=='POST':**

**image = request.files.get('photo', '')**

**best, others, img\_name = recognize(image)**

**return render\_template("predict.html", best=best, others=others,**

**img\_name=img\_name)**

**if \_\_name\_\_=="\_\_main\_\_":**

**app.run()**

**requirements**

**absl-py==1.2.0**

**asttokens==2.0.5**

**astunparse==1.6.3**

**backcall==0.2.0**

**cachetools==5.2.0**

**certifi==2022.6.15**

**charset-normalizer==2.1.0**

**click==8.1.3**

**colorama==0.4.5**

**cycler==0.11.0**

**CONUSION-MATRIX**  
**debugpy==1.6.2**

**decorator==5.1.1**

**entrypoints==0.4**

**executing==0.9.1**

**Flask==2.2.1**

**flatbuffers==1.12**

**fonttools==4.34.4**

**gast==0.4.0**

**google-auth==2.9.1**

**google-auth-oauthlib==0.4.6**

**google-pasta==0.2.0**

**grpcio==1.47.0**

**h5py==3.7.0**

**idna==3.3**

**ipykernel==6.15.1**

**ipython==8.4.0**

**itsdangerous==2.1.2**

**jedi==0.18.1**

**Jinja2==3.1.2**

**jupyter-client==7.3.4**

**jupyter-core==4.11.1**

**keras==2.9.0**

**Keras-Preprocessing==1.1.2**

**kiwisolver==1.4.4**

**libclang==14.0.6**

**Markdown==3.4.1**

**MarkupSafe==2.1.1**



**matplotlib==3.5.2**

**CONFLUENCE-MARKDOWN-TO-MARKUP==0.1.3**

**nest-asyncio==1.5.5**

**numpy==1.23.1**

**oauthlib==3.2.0**

**opt-einsum==3.3.0**

**packaging==21.3**

**pandas==1.4.3**

**parso==0.8.3**

**pickleshare==0.7.5**

**Pillow==9.2.0**

**prompt-toolkit==3.0.30**

**protobuf==3.19.4**

**psutil==5.9.1**

**pure-eval==0.2.2**

**pyasn1==0.4.8**

**pyasn1-modules==0.2.8**

**Pygments==2.12.0**

**pyparsing==3.0.9**

**python-dateutil==2.8.2**

**pytz==2022.1**

**pywin32==304**

**pyzmq==23.2.0**

**requests==2.28.1**

**requests-oauthlib==1.3.1**

**rsa==4.9**

**six==1.16.0**

**stack-data==0.3.0**

**tensorboard==2.9.1**  
**CONFUSION MATRIX**  
**tensorboard-data-server==0.6.1**  
**tensorboard-plugin-wit==1.8.1**  
**tensorflow==2.9.1**  
**tensorflow-estimator==2.9.0**  
**tensorflow-io-gcs-filesystem==0.26.0**  
**termcolor==1.1.0**  
**tornado==6.2**  
**traitlets==5.3.0**  
**typing\_extensions==4.3.0**  
**urllib3==1.26.11**  
**wcwidth==0.2.5**  
**Werkzeug==2.2.1**  
**wrapt==1.14.1**

## **GitHub & Project Demo Link**

### **GitHub link:**

<https://github.com/IBM-EPBL/IBM-Project-43208-1660714211>

### **Project Demo Link:**

[https://www.mediafire.com/file/tcv05ds9kgrc0ab/Untitled\\_44\\_360p\[1\].mp4/file](https://www.mediafire.com/file/tcv05ds9kgrc0ab/Untitled_44_360p[1].mp4/file)