1. INTRODUCTION

1.1 Project Overview

An electrocardiogram (ECG) measures the electric activity of the heart and has been widely used for detecting heart diseases due to its simplicity and non-invasive nature. By analysing the electrical signal of each heartbeat, i.e., the combination of action impulse waveforms produced by different specialised cardiac tissues found in the heart, it is possible to detect some of its abnormalities. In the last decades, several works were developed to produce automatic ECG-based heartbeat classification methods. In this work, we survey the current state-of-the-art methods of ECG-based automated abnormalities heartbeat classification by presenting the ECG signal preprocessing, the heartbeat segmentation techniques, the feature description methods and the learning algorithms used. In addition, we describe some of the databases used for evaluation of methods indicated by a well-known standard developed by the Association for the Advancement of Medical Instrumentation (AAMI) and described in ANSI/AAMI EC57:1998/(R)2008 (ANSI/AAMI, 2008). Finally, we discuss limitations and drawbacks of the methods in the literature presenting concluding remarks and future challenges, and also we propose an evaluation process workflow to guide authors in future works.

1.2 Purpose

According to the World Health Organization (WHO), cardiovascular diseases (CVDs) are the number one cause of death today. Over 17.7 million people died from CVDs in the year 2017 all over the world which is about 31% of all deaths, and over 75% of these deaths occur in low and middle-income countries. Arrhythmia is a representative type of CVD that refers to any irregular change from the normal heart rhythms. There are several types of arrhythmia including atrial fibrillation, premature contraction, ventricular fibrillation, and tachycardia. Although a single

arrhythmia heartbeat may not have a serious impact on life, continuous arrhythmia beats can result in fatal circumstances. In this project, we build an effective electrocardiogram (ECG) arrhythmia classification method using a convolutional neural network (CNN), in which we classify ECG into seven categories, one being normal and the other six being different types of arrhythmia using deep two-dimensional CNN with grayscale ECG images.

2. LITERATURE SURVEY

2.1 Existing problem

Previous studies on arrhythmia were used to diagnose the abnormally fast, slow, or irregular heart rhythm through ECG (Electrocardiogram), which is one of the biological signals. ECG has the form of P-QRS-T wave, and many studies have been done to extract the features of QRS-complex and R-R interval. However, in the conventional method, the P-QRS-T wave must be accurately detected, and the feature value is extracted through the P-QRS-T wave. If an error occurs in the peak detection or feature extraction process, the accuracy becomes very low. Therefore, in this paper, we implement a system that can perform PVC (Premature Ventricular Contraction) and PAC (Premature Atrial Contraction) classification by using P-QRS-T peak value without the feature extraction process using deep neural networks. The parameters were updated for PVC and PAC classification in the learning process using P-QRS-T peak without feature value. As a result of the performance evaluation, we could confirm higher accuracy than the previous studies and omit the process of feature extraction, and the time required for the preprocessing process to construct the input data set is relatively reduced.

2.2. REFERENCES

[1] *Po-Ya Hsu* Department of Computer Science & Engineering, University of California San Diego, The USA

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https://ieeexplore.ieee.org/document/9176679

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 $\underline{https://ieeexplore.ieee.org/abstract/document/8728362}$

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David Bol ICTEAM Institute, Université Catholique de Louvain, Louvain-la-Neuve, Belgium
https://ieeexplore.ieee.org/document/9795058

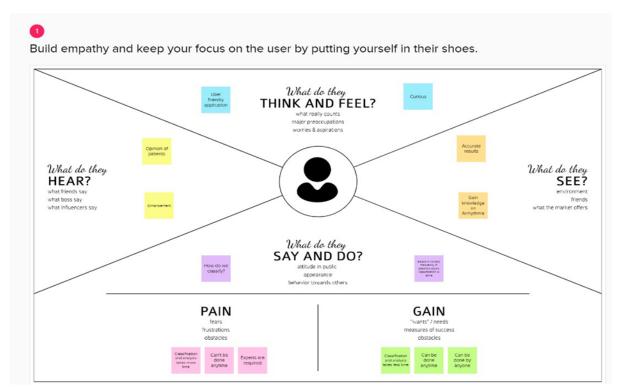
2.3 Problem Statement Definition

Arrhythmia is a representative type of CVD that refers to any irregular change from the normal heart rhythms. There are several types of arrhythmia including atrial fibrillation, premature contraction, ventricular fibrillation, and tachycardia. Although a single arrhythmia heartbeat may not have a serious impact on life, continuous arrhythmia beats can result in fatal circumstances. In this project ,we build an effective electrocardiogram (ECG) arrhythmia classification method using a convolutional neural network (CNN), in which we classify ECG into seven categories, one being normal and the other side being different types of arrhythmia using deep two-dimensional CNN with grayscale ECG images. We are creating a web application where the user selects the image which is to be classified. The image is fed into the model that is trained and the cited class will be displayed on the webpage.

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 behaviours 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.



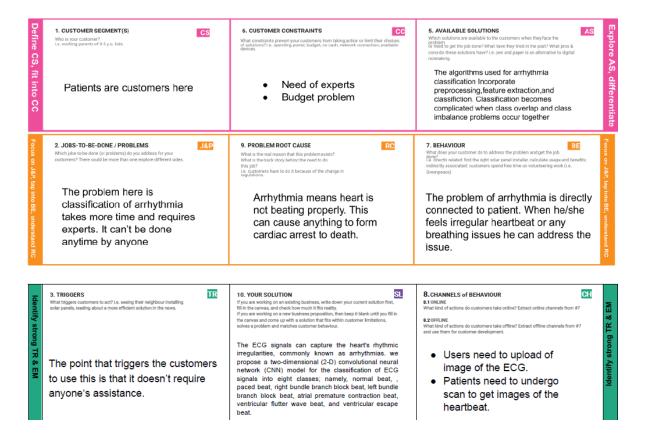
3.2 Ideation & Brainstorming



3.3 Proposed Solution

Classification of arrhythmia using deep learning with 2d ECG spectral image representation. To create an application that is used to classify the arrhythmia and provide more detailed information about it. Here we use deep learning techniques and with the help of 2D ECG spectral image to classify the arrhythmia. Provides accurate results and detailed information required by the users or patients. Users or customers can easily use the app because of its user friendly interface and simplicity. Can be used by anyone at any time. As this application can be very useful for the earlier and fast classification of arrhythmia it we be used by many patients suffering by it. Experts guidance is not required when we have a app that can be used by anyone. Data of the patient will be securely stored and maintained for future purposes.

3.4 Problem Solution fit



4.REQUIREMENT ANALYSIS

4.1 Functional requirement

FR No.	Functional Requirement (Epic)	Sub Requirement (Story / Sub-Task)
FR-1	User Registration	Registration through Form
		Registration through Gmail
FR-2	User Confirmation	Confirmation via Email
		Confirmation via OTP
FR-3	Get User Input	Upload image as jpeg
		Upload image as png
FR-4	Save Image	Images are saved in the uploads folder
FR-5	Chat with Doctor	Consult with Doctor
FR-6	Report Generation	Get complete Report

4.2 Non-Functional requirements

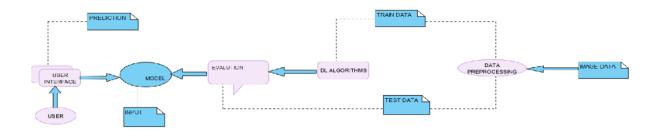
FR No.	Non-Functional Requirement	Description
NFR-1	Usability	Classification of Arrhythmia with the help of AI.
NFR-2	Security	User's data cannot be accessed by unauthorised people.
NFR-3	Reliability	The system performs without failure.
NFR-4	Performance	High accuracy.
NFR-5	Availability	Anyone who is authorised.
NFR-6	Scalability	Does not affect the performance even though used by many users.

5.PROJECT DESIGN

5.1 Data Flow Diagrams

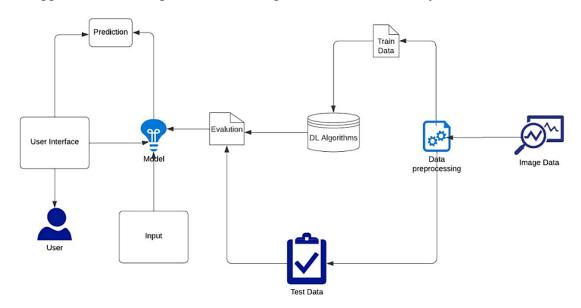
A data flow diagram (DFD) maps out the flow of information for any process or system. It uses defined symbols like rectangles, circles and arrows, plus short text labels, to show data inputs,

outputs, storage points and the routes between each destination.

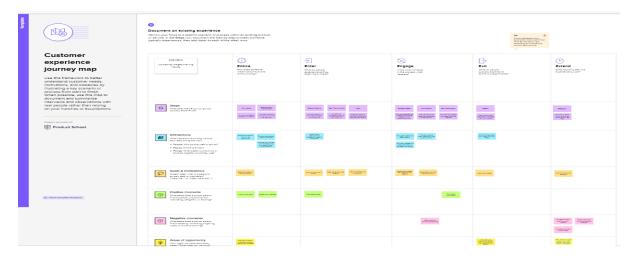


5.2 Solution & Technical Architecture

Technical architecture—which is also often referred to as application architecture, IT architecture, business architecture, etc.—refers to creating a structured software solution that will meet the business needs and expectations while providing a strong technical plan for the growth of the software application through its lifetime. IT architecture is equally important to the business team and the information technology team. Technical architecture includes the major components of the system, their relationships, and the contracts that define the interactions between the components. The goal of technical architects is to achieve all the business needs with an application that is optimised for both performance and security.



5.3 User Stories

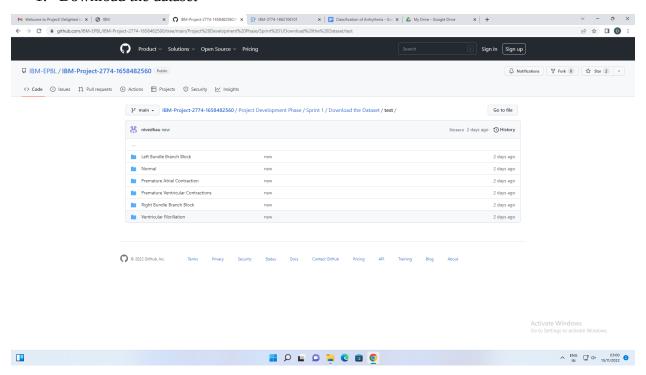


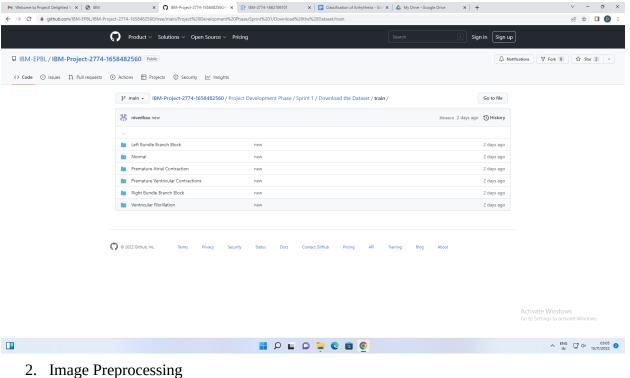
6.PROJECT PLANNING & SCHEDULING

6.1 Sprint Planning & Estimation

SPRINT 1

1. Download the dataset





A. Import the ImageDataGenerator Library

Import the ImageDataGenerator library Q [] from tensorflow.keras.preprocessing.image import ImageDataGenerator {x}

B. Configure ImageDataGenerator Class

Configure ImageDataGenerator Class [] train_datagen=ImageDataGenerator(rescale=1./255,zoom_range=0.2,vertical_flip=True,horizontal_flip=True) [] test_data=ImageDataGenerator(rescale=1./255)

C. Apply ImageDataGenerator functionality to trainset and test set



3. Model Building

A. Import the libraries

Import the libraries

[] from tensorflow.keras.models import Sequential from tensorflow.keras.layers import Dense,Convolution2D,MaxPooling2D,Flatten

B. Initialize the model

Initialize the model

[] model=Sequential()

C. Adding CNN layers



D. Adding Dense layer

Adding Dense layer

Hidden layer

[] model.add(Dense(500,activation="relu"))

[] model.add(Dense(500,activation="relu"))

Output layer

[] model.add(Dense(6,activation="softmax"))

E. Train the model

F. Save the model

Save the model

[] model.save('arrhythmia.h5')

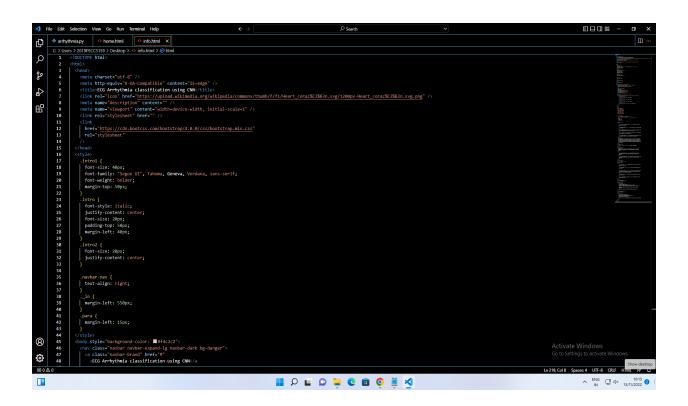
G. Testing the model

esti	ting the model	
	<pre>import numpy as np from tensorflow.keras.models import load_model from tensorflow.keras.preprocessing import image</pre>	
]	<pre>model=load_model('arrhythmia.h5')</pre>	
]	img=image.load_img("/content/drive/MyDrive/Project Development Phase/data/test/Right Bundle Branch Block/fig_101.png",target_size=	(64,64))
]	img	
]	x=image.img_to_array(img)	
]		vate Windows
	[255., 255., 255.]]]], utype=tiustsz)	
]	<pre>pred=model.predict(x)</pre>	
	1/1 [========] - 0s 43ms/step	
]	pred	
	array([[0., 0., 0., 0., 1., 0.]], dtype=float32)	
]	index=['Left Bundle Branch Block', 'Normal', 'Premature Atrial Contraction', 'Premature Ventricular Contractions', 'Right Bundle Branch Block', 'Ventricular Fibrillation']	
]	index[np.argmax(pred)]	
	'Right Bundle Branch Block'	
		rate Windows Settings to activate Windows.
		from tensorflow.keras.preprocessing import image model-load_model('arrhythmia.h5') img-image.load_img("/content/drive/PyOrive/Project Development Phase/data/test/Right Bundle Branch Block/fig_101.png",target_size- img x=image.img_to_array(img) x

SPRINT 2

A. home.html

B. info.html



C. types.html

```
| This | Section | Passed | Pa
```

D. predict_base.html

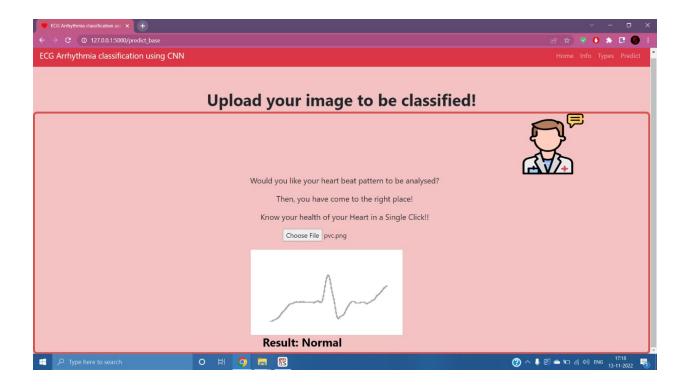
```
| The first Selective Was first Selective Was first Selective Was Select
```

SPRINT 3

app_flask.py

```
# Single of Section Vew Cos for New York Cost of Section 1 Operation 2 Section 2 Secti
```

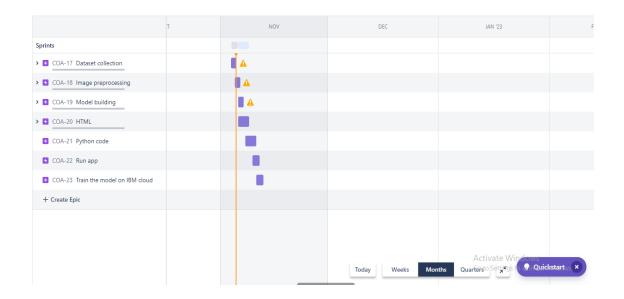
SPRINT4



6.2 Sprint Delivery Schedule

Sprint	Total Story Points	Duration	Sprint Start Date	Sprint Start Date	Story Points Completed (as on Planned End Date)	Sprint Release Date (Actual)
Sprint-1	20	2 Days	04 Nov 2022	06 Nov 2022	20	06 Nov 2022
Sprint-2	20	2 Days	06 Nov 2022	08 Nov 2022	40	08 Nov 2022
Sprint-3	20	2 Days	08 Nov 2022	10 Nov 2022	60	10 Nov 2022
Sprint-4	20	2 Days	10 Nov 2022	12 Nov 2022	80	12 Nov 2022

6.3 Reports from JIRA



7. CODING & SOLUTIONING

7.1 Feature 1

1. Classifies arrhythmia only with an ECG image within seconds

```
Source Code
import os
import numpy as np
from flask import Flask,request,render template
from tensorflow.keras.models import load_model
from tensorflow.keras.preprocessing import image
app=Flask( name )
model=load_model('arrhythmia.h5')
@app.route("/")
def about():
       return render_template("home.html")
@app.route("/home")
def home():
       return render_template("home.html")
@app.route("/types")
def types():
       return render_template("types.html")
@app.route("/info")
def information():
       return render_template("info.html")
@app.route("/predict_base")
def test():
       return render template("predict base.html")
@app.route("/predict_base",methods=["GET","POST"])
def upload():
if request.method == 'POST':
       f=request.files['file'] #requesting the file
       basepath=os.path.dirname('__file__')#storing the file directory
```

```
filepath=os.path.join(basepath,"uploads",f.filename)#storing file in uploads folder
              f.save(filepath)#saving the file
              img=image.load_img(filepath,target_size=(64,64)) #load and reshaping the image
              x=image.img_to_array(img)#converting image to array
              x=np.expand_dims(x,axis=0)#changing the dimensions of the image
              pred=model.predict(x)#predicting classes
              y_pred = np.argmax(pred)
              print("prediction",y pred)#printing the prediction
              index=['Left Bundle Branch Block','Normal','Premature Atrial Contraction',
              'Premature Ventricular Contractions', 'Right Bundle Branch Block', 'Ventricular
               Fibrillation'
               result=str(index[y_pred])
       return result
  return None
if __name__=="__main___":
       app.run(debug=True)
   2. Easy user interface
       Source code
       <!DOCTYPE html>
       <html>
       <head>
       <meta charset="utf-8" />
       <meta http-equiv="X-UA-Compatible" content="IE=edge" />
       <title>ECG Arrhythmia classification using CNN</title>
       <linkrel="icon"href="https://upload.wikimedia.org/wikipedia/commons/thumb/f/f1/Heart</pre>
       _coraz%C3%B3n.svg/1200px-Heart_coraz%C3%B3n.svg.png" />
       <meta name="description" content="" />
       <meta name="viewport" content="width=device-width, initial-scale=1" />
       <link rel="stylesheet" href="" />
    <link href="https://cdn.bootcss.com/bootstrap/4.0.0/css/bootstrap.min.css" rel="stylesheet">
       <script src="https://cdn.bootcss.com/popper.js/1.12.9/umd/popper.min.js"></script>
```

```
<script src="https://cdn.bootcss.com/jquery/3.3.1/jquery.min.js"></script>
<script src="https://cdn.bootcss.com/bootstrap/4.0.0/js/bootstrap.min.js"></script>
<link href="{{ url_for('static', filename='css/flask_main_style.css') }}" rel="stylesheet">
link href="https://cdn.bootcss.com/bootstrap/4.0.0/css/bootstrap.min.css"
rel="stylesheet"/>
<script src="{{ url_for('static', filename='js/flask_main_js.js') }}"type="text/javascript"</pre>
></script>
</head>
<style>
.intro1 {
font-size: 40px;
font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
font-weight: bolder;
margin-top: 50px;
}
.intro {
font-style: italic;
justify-content: center;
font-size: 20px;
padding-top: 10px;
margin-left: 40px;
}
.intro2 {
font-size: 20px;
justify-content: center;
.navbar-nav {
text-align: right;
}
._in {
margin-left: 550px;
}
```

```
.para {
margin-left: 15px;
font-size: larger;
text-align: center;
}
.intro3 {
font-size: 25px;
font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
font-weight: bold;
margin-top: 50px;
margin-left: 45px;
}
.right {
margin-right: 600px;
}
#imagePreview{
width:375px;
height: 211px;
border: 1px solid #f4c2c2;
background-position: center;
background-size: cover;
margin-left:530px;
margin-top: 20px;
}
#btn-predict{
margin-left: 670px;
}
#result{
margin-left: 560px;
}
.right{
margin:0 0 0 1200px;
```

```
}
</style>
<br/><body style="background-color: #f4c2c2">
<nav class="navbar navbar-expand-lg navbar-dark bg-danger">
<a class="navbar-brand" href="#">ECG Arrhythmia classification using CNN/>
<but
class="navbar-toggler"
type="button"
data-toggle="collapse"
data-target="#navbarNavAltMarkup"
aria-controls="navbarNavAltMarkup"
aria-expanded="false"
aria-label="Toggle navigation"
<span class="navbar-toggler-icon"></span>
</button>
<div class="navbar-collapse collapse w-100 order-3 dual-collapse2">
ul class="navbar-nav ml-auto">
class="nav-item">
<a class="nav-link" href="/home">Home</a>
class="nav-item">
<a class="nav-link" href="/info">Info</a>
class="nav-item">
<a class="nav-link" href="/types">Types</a>
class="nav-item">
<a class="nav-link" href="/predict_base">Predict</a>
</div>
```

```
</nav>
<div class="intro1">
<center>Upload your image to be classified!</center>
</div>
<div
style="
border: #d9534f;
border-width: 5px;
border-style: solid;
border-radius: 10px;
height:max-content;">
<img
src="https://tikotra.com/images/Tikotra-Vaccination-page-icons-02.png"
class="right"
width="150"
height="150"
/>
Would you like your heart beat pattern to be analysed?
Then, you have come to the right place!
Know your health of your Heart in a Single Click!!
<form id="upload-file" method="post" enctype="multipart/form-data">
<center>
<label for="imageUpload" class="upload-label"> </label>
<input
type="file"
name="file"
id="imageUpload"
accept=".png, .jpg, .jpeg"
/>
</center>
</form>
<div class="image-section" style="display:none;"></div>
```

```
<div class="img-preview">
       <div id="imagePreview">
       </div>
       <button type="button" class="btn btn-danger btn-lg " id="btn-predict" style="display:</pre>
none;">Predict
  </div>
  <div class="loader" style="display:none;"></div>
  <a>h3 style="color:Black; font-family: Segoe UI, Tahoma, Geneva, Verdana, sans-serif;</a>
  font-weight: bolder;" id="result">
    <span> </span>
  </h3>
 </body>
</html>
   3. Provides more information about arrhythmia and it's types
       Source Code
       <!DOCTYPE html>
<html>
 <head>
  <meta charset="utf-8" />
  <meta http-equiv="X-UA-Compatible" content="IE=edge" />
  <title>ECG Arrhythmia classification using CNN</title>
                                                              link
                                                                                  rel="icon"
href="https://upload.wikimedia.org/wikipedia/commons/thumb/f/f1/Heart_coraz%C3%B3n.svg/
1200px-Heart_coraz%C3%B3n.svg.png" />
  <meta name="description" content="" />
  <meta name="viewport" content="width=device-width, initial-scale=1" />
  <link rel="stylesheet" href="" />
  link
   href="https://cdn.bootcss.com/bootstrap/4.0.0/css/bootstrap.min.css"
   rel="stylesheet"
  />
 </head>
```

```
<style>
 .intro1 {
  font-size: 40px;
  font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
  font-weight: bolder;
  margin-top: 50px;
 }
 .intro {
  font-style: italic;
  justify-content: center;
  font-size: 20px;
  padding-top: 10px;
  margin-left: 40px;
 }
 .intro2 {
  font-size: 20px;
  justify-content: center;
 }
 .navbar-nav {
  text-align: right;
 }
 ._in {
  margin-left: 550px;
 }
 .para {
  margin-left: 15px;
 }
 .intro3 {
  font-size: 25px;
  font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
  font-weight: bold;
```

```
margin-top: 50px;
  margin-left: 45px;
 }
</style>
<br/><body style="background-color: #f4c2c2">
 <nav class="navbar navbar-expand-lg navbar-dark bg-danger">
  <a class="navbar-brand" href="#"
   >ECG Arrhythmia classification using CNN</a
  >
  <button
   class="navbar-toggler"
   type="button"
   data-toggle="collapse"
   data-target="#navbarNavAltMarkup"
   aria-controls="navbarNavAltMarkup"
   aria-expanded="false"
   aria-label="Toggle navigation"
   <span class="navbar-toggler-icon"></span>
  </button>
  <div class="navbar-collapse collapse w-100 order-3 dual-collapse2">
   ul class="navbar-nav ml-auto">
    class="nav-item">
     <a class="nav-link" href="/home">Home</a>
    class="nav-item">
     <a class="nav-link" href="/info">Info</a>
    class="nav-item">
     <a class="nav-link" href="/types">Types</a>
    class="nav-item">
```

```
<a class="nav-link" href="/predict_base">Predict</a>
   </div>
</nav>
<div
 style="
  border: #d9534f;
  border-width: 5px;
  border-style: solid;
  border-radius: 10px;
  height: max-content;
  margin-top: 30px;
  margin-left: 10px;
  margin-right: 10px;
  margin-bottom: 10px;
 <div class="intro1">
  <center>Types of Arrhythmia</center>
 </div>
 <div class="intro">
  Arrhythmias are usually categorized based on the speed of heart rate.
   The six main categories would be-
  <strong>Normal</strong>
   <strong>Left Bundle Branch Block</strong>
   <strong>Right Bundle Branch Block</strong>
   <strong>Ventricular Fibrillation</strong>
   <strong>Premature Atrial Contraction</strong>
```

```
<strong>Premature Ventricular Contractions</strong>
 </div>
<div class="intro3" id="types">
 <section>1.Left Bundle Branch Block:</section>
</div>
<div class="intro">
 A delay or blockage of electrical impulses to the left side of the
  heart. Left bundle branch block sometimes makes it harder for the
  heart to pump blood efficiently through the circulatory system. Most
  people don't have symptoms. If symptoms occur, they include fainting
  or a slow heart rate. If there's an underlying condition, such as
  heart disease, that condition needs treatment. In patients with heart
  failure, a pacemaker can also relieve symptoms as well as prevent
  death.
 </div>
<div class="intro3" id="types">
 <section>2.Premature Atrial Contraction:</section>
</div>
<div class="intro">
 Premature atrial contractions (PACs) are extra heartbeats that start
  in the upper chambers of your heart. When the premature, or early,
  signal tells the heart to contract, there may not be much blood in the
  heart at that moment. That means there's not much blood to pump out.
 </div>
<div class="intro3" id="types">
 <section>3.Premature Ventricular Contractions:</section>
</div>
```

```
<div class="intro">
```

Premature ventricular contractions (PVCs) are extra heartbeats that begin in one of the heart's two lower pumping chambers (ventricles). These extra beats disrupt the regular heart rhythm, sometimes causing a sensation of a fluttering or a skipped beat in the chest. In the vast majority of cases, PVCs have no known cause and occur spontaneously. Common known etiologies include excess caffeine consumption, excess catecholamines, high levels of anxiety, and electrolyte abnormalities.

```
</div>
</div class="intro3" id="types">
</section>4.Right Bundle Branch Block:</section>
</div>
<div class="intro">
```

Right bundle branch block is a problem with your right bundle branch that keeps your heart's electrical signal from moving at the same time as the left bundle branch. Instead of moving together on the left and right sides, the signal on the right side is running behind. This creates an irregular heartbeat. Usually, the problem isn't serious.

```
</div>
<div class="intro3" id="types">
<section>5.Ventricular Fibrillation:</section>
</div>
<div class="intro">
```

Ventricular fibrillation is a type of irregular heart rhythm (arrhythmia). During ventricular fibrillation, the lower heart chambers contract in a very rapid and uncoordinated manner. As a

result, the heart doesn't pump blood to the rest of the body.

</div>

</div>

</body>

</html>

8.TESTING

8.1. Performance Testing

Model Performance Testing:

Project team shall fill the following information in model performance testing template.

S.No.	Parameter	Values	Screenshot
1.	Model Summary	-	https://drive.google.com/file
			/d/1jmRk6-
			t2BYYywLNwihLPtM-
			BuX13BAZP/view?usp=share
			<u>_link</u>
2.	Accuracy	Training Accuracy -	https://drive.google.com/file
			/d/1KvV1YlEwYW4sx46vqdY
		Validation Accuracy -	muaTTCYHRGWIS/view?usp=
			share_link

8.2. User Acceptance Testing

Resolution	Severity 1	Severity 2	Severity 3	Severity 4	Subtotal
By Design	10	4	2	3	19
Duplicate	1	0	3	0	4
External	2	3	0	1	6
Fixed	10	2	4	10	26
Not Reproduced	0	0	1	0	1
Skipped	0	0	1	1	2
Won't Fix	0	4	1	1	6
Totals	22	15	10	30	77

9.RESULTS

9.1.Performance Metrics





10.ADVANTAGES & DISADVANTAGES

ADVANTAGES

- Provides accurate results and detailed information required by the users or patients.
- Users or customers can easily use the app because of its user-friendly interface and simplicity.
- Can be used by anyone at any time.
- As this application can be very useful for the earlier and fast classification of arrhythmia
 it we be used by many patients suffering from it.
- Experts guidance is not required when we have a app that can be used by anyone.
- Data of the patient will be securely stored and maintained for future purposes.

11.Conclusion

Arrhythmia is a severe CVD that can be predicted via ECG segment processing. Arrhythmia must be accurately diagnosed and prevented early to reduce cardiac disease. Our proposed system model met the study's primary goal of assisting doctors in swiftly determining the kind of ECG or verifying their diagnostics in a medical context while maintaining a high level of precision and cost. In this work, a CNN-Bi-LSTM model is proposed to categorise five categories of ECG fragments to construct an effective and resilient autonomous computer-aided diagnosis system. The developed network achieved maximum accuracies of 100%, 98.0%, and 98.0% of training, validation, and testing using MIT-BIH data set. In comparison, the St-Petersburg data set achieved 98.0%, 95.0%, and 95.0% accuracies of training, validation, and testing in identifying arrhythmia.

This research showed many advantages, including its ability to help clinicians reliably make ECG recording-related clinical decisions. Moreover, it was intended to be as simple as possible while delivering the most significant performance. The described method is straightforward for health professionals and does not involve signal modification or feature extraction. Additionally, this research focused only on one kind of CVD, namely, arrhythmia, whereas the manifestations of cardiac disease are often complex and varied. As a result, more types of ECG data will need to be added to broaden the scope of the planned network.

12.FUTURE SCOPE

- 1. To enable online doctor consultation
- 2. To use database and store patients data

13.APPENDIX

Source Code

1) Model Building Code

from google.colab import drive

drive.mount('/content/drive')

cd /content/drive/MyDrive/Project Development Phase

#Import the ImageDataGenerator library

from tensorflow.keras.preprocessing.image import ImageDataGenerator

#Configure ImageDataGenerator Class

train_datagen=ImageDataGenerator(rescale=1./255,zoom_range=0.2,vertical_flip=True,horizont al_flip=True)

test_data=ImageDataGenerator(rescale=1./255)

#Apply ImageDataGenerator functionality to trainset and testset

x_train=train_datagen.flow_from_directory(r"/content/drive/MyDrive/ProjectDevelopment Phase/data/train",target_size=(64,64),class_mode="categorical",batch_size=128)

x_test=test_data.flow_from_directory(r"/content/drive/MyDrive/ProjectDevelopment

Phase/data/test",target_size=(64,64),class_mode="categorical",batch_size=128)

x train.class indices

#MODEL BUILDING

#Import the libraries

from tensorflow.keras.models import Sequential

from tensorflow.keras.layers import Dense, Convolution 2D, Max Pooling 2D, Flatten

#Initialize the model

```
model=Sequential()
#Adding CNN layers
model.add(Convolution2D(32,(3,3),activation="relu",strides=(1,1),input_shape=(64,64,3)))
model.add(MaxPooling2D(pool_size=(2,2)))
model.add(Flatten())
model.summary()
#Adding Dense layer
#Hidden layer
model.add(Dense(500,activation="relu"))
model.add(Dense(500,activation="relu"))
#Output layer
model.add(Dense(6,activation="softmax"))
#Configure the learning process
model.compile(loss="categorical_crossentropy",optimizer="adam",metrics=['accuracy'])
len(x_train)
#Train the model
model.fit(x_train,epochs=5,steps_per_epoch=len(x_train),validation_data=x_test,validation_step
s=len(x_test))
model.fit(x_train,epochs=5,steps_per_epoch=len(x_train),validation_data=x_test,validation_step
s=len(x_test))
model.fit(x_train,epochs=5,steps_per_epoch=len(x_train),validation_data=x_test,validation_step
s=len(x_test))
model.fit(x_train,epochs=5,steps_per_epoch=len(x_train),validation_data=x_test,validation_step
s=len(x_test))
```

#Save the model model.save('arrhythmia.h5') **#Testing the model** import numpy as np from tensorflow.keras.models import load_model from tensorflow.keras.preprocessing import image img=image.load_img("/content/drive/MyDrive/Project Development Phase/data/test/Premature Ventricular Contractions/VEBfig_11.png",target_size=(64,64)) x=image.img_to_array(img) x=np.expand_dims(x,axis=0) pred=model.predict(x) index=['Left Bundle Branch Block', 'Normal', 'Premature Atrial Contraction', 'Premature Ventricular Contractions', 'Right Bundle Branch Block', 'Ventricular Fibrillation'] index[np.argmax(pred)]

2) HTML Code

a) home.html

<!DOCTYPE html>

<html>

<head>

```
<meta charset="utf-8"/>
  <meta http-equiv="X-UA-Compatible" content="IE=edge" />
  <title>ECG Arrhythmia classification using CNN</title>
                                                              link
                                                                                   rel="icon"
href="https://upload.wikimedia.org/wikipedia/commons/thumb/f/f1/Heart_coraz%C3%B3n.svg/
1200px-Heart_coraz%C3%B3n.svg.png" />
  <meta name="description" content="" />
  <meta name="viewport" content="width=device-width, initial-scale=1" />
  <link rel="stylesheet" href="" />
  link
   href="https://cdn.bootcss.com/bootstrap/4.0.0/css/bootstrap.min.css"
   rel="stylesheet"
  />
 </head>
 <style>
  .intro1 {
   font-size: 40px;
   font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
   font-weight: bolder;
  }
  .intro {
   font-style: italic;
   justify-content: center;
   font-size: 20px;
```

```
padding-top: 50px;
  margin-left: 200px;
  margin-right: 200px;
 }
 .intro2 {
  font-size: 20px;
 justify-content: center;
 }
 .navbar-nav {
  text-align: right;
 }
 ._in {
 margin-left: 550px;
 }
</style>
<body style="background-color: #f4c2c2">
 <nav class="navbar navbar-expand-lg navbar-dark bg-danger">
  <a class="navbar-brand" href="#"
   >ECG Arrhythmia classification using CNN</a
  >
  <button
   class="navbar-toggler"
   type="button"
```

```
data-toggle="collapse"
 data-target="#navbarNavAltMarkup"
 aria-controls="navbarNavAltMarkup"
 aria-expanded="false"
aria-label="Toggle navigation"
 <span class="navbar-toggler-icon"></span>
</button>
<div class="navbar-collapse collapse w-100 order-3 dual-collapse2">
 ul class="navbar-nav ml-auto">
  class="nav-item">
   <a class="nav-link" href="/home">Home</a>
  class="nav-item">
   <a class="nav-link" href="/info">Info</a>
  class="nav-item">
   <a class="nav-link" href="/types">Types</a>
  class="nav-item">
   <a class="nav-link" href="/predict_base">Predict</a>
  </div>
```

```
</nav>
<div
 style="
  border: #d9534f;
  border-width: 5px;
  border-style: solid;
  border-radius: 10px;
  height: max-content;
  margin-top: 30px;
  margin-left: 10px;
  margin-right: 10px;
>
 <div class="intro1">
  <center>Arrhythmia classification using CNN</center>
 </div>
 <div>
  'Hear Arrhythmia' is the condition of irregular heart rhythms. There
```

are variations in the heartbeat patterns. When electrical signals that were meant to coordinate with the heartbeats falter, this condition takes place. The heart could beat faster, or slower, or any other form of irregularity is usually noticeable. Some basic fluttery feeling is harmless. It may speed up during active periods of the body and slow

```
down during relaxing periods. The level of symptoms is important to
     look for because some of them can even be life-threatening. There
     might not be obvious signs of Arrhythmia. One might need a medical
     professional to figure it out, but the subtle details to look for are;
    </div>
   <div class="intro2">
    <img
        src="https://uxwing.com/wp-content/themes/uxwing/download/relationship-love/heart-
care-icon.png"
     alt=""
     height="200"
     width="200"
     align="right"
    />
    A fluttering feeling in the chest
     The feeling of heartbeats slowing down or speeding up
     Breathlessness
     Pain in the chest area
     Heavy sweating
     Dizziness
     Fatigue
     Lightheadedness or fainting
```

b) info.html

```
<!DOCTYPE html>
<html>
<head>
<meta charset="utf-8" />
<meta http-equiv="X-UA-Compatible" content="IE=edge" />
<title>ECG Arrhythmia classification using CNN</title>
rel="icon"
```

```
href="https://upload.wikimedia.org/wikipedia/commons/thumb/f/f1/Heart_coraz%C3%B3n.svg/
1200px-Heart_coraz%C3%B3n.svg.png" />
  <meta name="description" content="" />
  <meta name="viewport" content="width=device-width, initial-scale=1" />
  <link rel="stylesheet" href="" />
  link
   href="https://cdn.bootcss.com/bootstrap/4.0.0/css/bootstrap.min.css"
   rel="stylesheet"
  />
 </head>
 <style>
  .intro1 {
   font-size: 40px;
   font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
   font-weight: bolder;
   margin-top: 50px;
  }
  .intro {
   font-style: italic;
   justify-content: center;
   font-size: 20px;
   padding-top: 50px;
   margin-left: 40px;
```

}

```
.intro2 {
  font-size: 20px;
  justify-content: center;
 }
 .navbar-nav {
  text-align: right;
 }
 ._in {
  margin-left: 550px;
 }
 .para {
  margin-left: 15px;
 }
</style>
<body style="background-color: #f4c2c2">
 <nav class="navbar navbar-expand-lg navbar-dark bg-danger">
  <a class="navbar-brand" href="#"
   >ECG Arrhythmia classification using CNN</a
  >
  <button
   class="navbar-toggler"
   type="button"
   data-toggle="collapse"
```

```
data-target="#navbarNavAltMarkup"
  aria-controls="navbarNavAltMarkup"
  aria-expanded="false"
  aria-label="Toggle navigation"
 >
  <span class="navbar-toggler-icon"></span>
 </button>
 <div class="navbar-collapse collapse w-100 order-3 dual-collapse2">
  ul class="navbar-nav ml-auto">
   class="nav-item">
    <a class="nav-link" href="/home">Home</a>
   class="nav-item">
    <a class="nav-link" href="/info">Info</a>
   class="nav-item">
    <a class="nav-link" href="/types">Types</a>
   class="nav-item">
    <a class="nav-link" href="/predict_base">Predict</a>
   </div>
</nav>
```

```
<div
 style="
  border: #d9534f;
  border-width: 5px;
  border-style: solid;
  border-radius: 10px;
  height: max-content;
  margin-top: 30px;
  margin-left: 10px;
  margin-right: 10px;
  margin-bottom: 10px;
>
 <div class="intro1">
  <center>Diagnosis of Arrhythmia</center>
  <img
   src="http://cdn.onlinewebfonts.com/svg/img_573539.png"
   alt=""
   height="100"
   width="100"
   align="right"
  />
 </div>
 <div class="intro">
```

```
<0|>
 <|i>
  <strong>Electrocardiograms (ECG):</strong> Can detect electrical
  activity of the heart.
 <|i>
  <strong>Echocardiograms:</strong> Uses sound waves to produce images
  of the heart.
 <|i>
  <strong>Implantable loop recorder:</strong>It can be implanted under
  the skin around the heart, to record its status.
 <
  <strong> recorder:</strong>It's like a wearable ECG. It is supposed
  to be alerted when you have symptoms.
 <|i>
  <strong>Holter Monitor:</strong>It's another mobile ECG device which
  is temporarily used to record the activity of the heart.
 </01>
Other tests that can be used are, Stress test, where you are made to
```

do a physical activity and the activity of your heart is recorded.

Tilt-table test is used for fainting cases, where you lie flat on the table while recording your heart status. EP testing and mapping can also be used where tubes with electrode ends are used inside your body to find details.

```
</div>
<div class="intro1">
 <center>
  <i class="fa-solid fa-syringe"></i>Treatment -Medications
 </center>
</div>
<div class="intro">
 Drugs like blood thinners are recommended by doctors as per the
  condition of the patient. There are two therapies to treat heart
  issues---
 <0|>
  <|i>
   <strong>Cardioversion:</strong> Shock is delivered to the heart
   using patches on the chest which coordinates the electrical
   impulses.
```

```
|
   <strong>Vagal maneuvers:</strong> Controls the nervous system, which
   inturn slows down the heart beats. Used for faster heart beat
   conditions.
  </01>
</div>
<div class="intro1">
 <center>Surgeries</center>
</div>
<div class="intro">
 <0]>
  <1i>
   <strong>Ablation:</strong> Catheters are used in the blood vessels
   connected to the heart.
  <|i>
   <strong>Pacemaker:</strong> It is a tiny device implanted near the
   collarbone.
  <|i>
   <strong>Maze procedure:</strong> It involves making multiple pattern
   like incisions of the heart tissue to make it scar tissue which
```

```
reduces the stray electrical impulses.
  <|i>
   <strong>ICD:</strong> It is also a device implanted under the skin
   of the collarbone.
  <|i>
   <strong>Coronary bypass surgery:</strong> It improves the flow of
   blood to your heart.
  </01>
</div>
<div class="intro1">
 <center>Home Remedies</center>
</div>
<div class="intro">
 <0l>
  Eat healthy
  Do not smoke or drink
  Exercise regularly, keep your weight in check
  Keep your blood pressure and cholesterol levels in check
  <|i>
   Keep proper habits of medication and doctor visits whenever
   necessary
```

```
Do Yoga, Meditation, and other Relaxation techniques
    </div>
   <div class="intro1">
    <center>Precautions</center>
   </div>
   <div class="intro">
    <0|>
     Have healthy practices
     Keep note of any symptoms you're having
     Be aware of the conditions
     Have proper doctor visits
     <|i>
      Make a list of all the medications and family history of Arrhythmias
     </01>
   </div>
  </div>
 </body>
</html>
c) types.html
<!DOCTYPE html>
<html>
```

```
<head>
  <meta charset="utf-8"/>
  <meta http-equiv="X-UA-Compatible" content="IE=edge" />
  <title>ECG Arrhythmia classification using CNN</title>
                                                              link
                                                                                  rel="icon"
href="https://upload.wikimedia.org/wikipedia/commons/thumb/f/f1/Heart_coraz%C3%B3n.svg/
1200px-Heart_coraz%C3%B3n.svg.png" />
  <meta name="description" content="" />
  <meta name="viewport" content="width=device-width, initial-scale=1" />
  <link rel="stylesheet" href="" />
  link
   href="https://cdn.bootcss.com/bootstrap/4.0.0/css/bootstrap.min.css"
   rel="stylesheet"
  />
 </head>
 <style>
  .intro1 {
   font-size: 40px;
   font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
   font-weight: bolder;
   margin-top: 50px;
  }
  .intro {
   font-style: italic;
```

```
justify-content: center;
 font-size: 20px;
 padding-top: 10px;
 margin-left: 40px;
}
.intro2 {
 font-size: 20px;
justify-content: center;
}
.navbar-nav {
 text-align: right;
}
._in {
margin-left: 550px;
}
.para {
margin-left: 15px;
}
.intro3 {
 font-size: 25px;
 font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
 font-weight: bold;
 margin-top: 50px;
```

```
margin-left: 45px;
 }
</style>
<body style="background-color: #f4c2c2">
 <nav class="navbar navbar-expand-lg navbar-dark bg-danger">
  <a class="navbar-brand" href="#"
   >ECG Arrhythmia classification using CNN</a
  >
  <button
   class="navbar-toggler"
   type="button"
   data-toggle="collapse"
   data-target="#navbarNavAltMarkup"
   aria-controls="navbarNavAltMarkup"
   aria-expanded="false"
   aria-label="Toggle navigation"
  >
   <span class="navbar-toggler-icon"></span>
  </button>
  <div class="navbar-collapse collapse w-100 order-3 dual-collapse2">
   ul class="navbar-nav ml-auto">
    class="nav-item">
     <a class="nav-link" href="/home">Home</a>
```

```
class="nav-item">
    <a class="nav-link" href="/info">Info</a>
   class="nav-item">
    <a class="nav-link" href="/types">Types</a>
   class="nav-item">
    <a class="nav-link" href="/predict_base">Predict</a>
   </div>
</nav>
<div
style="
  border: #d9534f;
  border-width: 5px;
  border-style: solid;
  border-radius: 10px;
  height: max-content;
  margin-top: 30px;
  margin-left: 10px;
  margin-right: 10px;
  margin-bottom: 10px;
```

```
>
 <div class="intro1">
  <center>Types of Arrhythmia</center>
 </div>
 <div class="intro">
  Arrhythmias are usually categorized based on the speed of heart rate.
   The six main categories would be-
  <strong>Normal</strong>
   <strong>Left Bundle Branch Block</strong>
   <strong>Right Bundle Branch Block</strong>
   <strong>Ventricular Fibrillation</strong>
   <strong>Premature Atrial Contraction</strong>
   <strong>Premature Ventricular Contractions</strong>
  </div>
 <div class="intro3" id="types">
  <section>1.Left Bundle Branch Block:</section>
 </div>
 <div class="intro">
  A delay or blockage of electrical impulses to the left side of the
```

heart. Left bundle branch block sometimes makes it harder for the heart to pump blood efficiently through the circulatory system. Most people don't have symptoms. If symptoms occur, they include fainting or a slow heart rate. If there's an underlying condition, such as heart disease, that condition needs treatment. In patients with heart failure, a pacemaker can also relieve symptoms as well as prevent death.

```
</div>
</div>
<div class="intro3" id="types">

<section>2.Premature Atrial Contraction:</section>
</div>
<div class="intro">
```

Premature atrial contractions (PACs) are extra heartbeats that start in the upper chambers of your heart. When the premature, or early, signal tells the heart to contract, there may not be much blood in the heart at that moment. That means there's not much blood to pump out.

```
</div>
<div class="intro3" id="types">
<section>3.Premature Ventricular Contractions:</section>
</div>
<div class="intro">
```

Premature ventricular contractions (PVCs) are extra heartbeats that begin in one of the heart's two lower pumping chambers (ventricles). These extra beats disrupt the regular heart rhythm, sometimes causing a sensation of a fluttering or a skipped beat in the chest. In the vast majority of cases, PVCs have no known cause and occur spontaneously. Common known etiologies include excess caffeine consumption, excess catecholamines, high levels of anxiety, and electrolyte abnormalities.

```
</div>
</div>
<div class="intro3" id="types">
<section>4.Right Bundle Branch Block:</section>
</div>
<div class="intro">
```

Right bundle branch block is a problem with your right bundle branch that keeps your heart's electrical signal from moving at the same time as the left bundle branch. Instead of moving together on the left and right sides, the signal on the right side is running behind. This creates an irregular heartbeat. Usually, the problem isn't serious.

```
</div>
<div class="intro3" id="types">
```

```
<section>5.Ventricular Fibrillation:</section>
   </div>
   <div class="intro">
    Ventricular fibrillation is a type of irregular heart rhythm
     (arrhythmia). During ventricular fibrillation, the lower heart
     chambers contract in a very rapid and uncoordinated manner. As a
     result, the heart doesn't pump blood to the rest of the body.
    </div>
  </div>
 </body>
</html>
d) predict_base.html
<!DOCTYPE html>
<html>
 <head>
  <meta charset="utf-8"/>
  <meta http-equiv="X-UA-Compatible" content="IE=edge" />
  <title>ECG Arrhythmia classification using CNN</title>
                                                            link
                                                                                rel="icon"
href="https://upload.wikimedia.org/wikipedia/commons/thumb/f/f1/Heart_coraz%C3%B3n.svg/
1200px-Heart_coraz%C3%B3n.svg.png" />
  <meta name="description" content="" />
```

```
<meta name="viewport" content="width=device-width, initial-scale=1" />
 <link rel="stylesheet" href="" />
 k href="https://cdn.bootcss.com/bootstrap/4.0.0/css/bootstrap.min.css" rel="stylesheet">
 <script src="https://cdn.bootcss.com/popper.js/1.12.9/umd/popper.min.js"></script>
 <script src="https://cdn.bootcss.com/jquery/3.3.1/jquery.min.js"></script>
 <script src="https://cdn.bootcss.com/bootstrap/4.0.0/js/bootstrap.min.js"></script>
 <link href="{{ url_for('static', filename='css/flask_main_style.css') }}" rel="stylesheet">
 link
  href="https://cdn.bootcss.com/bootstrap/4.0.0/css/bootstrap.min.css"
  rel="stylesheet"
 />
 <script
  src="{{ url_for('static', filename='js/flask_main_js.js') }}"
  type="text/javascript"
 ></script>
</head>
<style>
 .intro1 {
  font-size: 40px;
  font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
  font-weight: bolder;
  margin-top: 50px;
 }
 .intro {
```

```
font-style: italic;
 justify-content: center;
 font-size: 20px;
 padding-top: 10px;
 margin-left: 40px;
}
.intro2 {
 font-size: 20px;
justify-content: center;
}
.navbar-nav {
 text-align: right;
}
._in {
 margin-left: 550px;
}
.para {
 margin-left: 15px;
 font-size: larger;
 text-align: center;
}
.intro3 {
 font-size: 25px;
 font-family: "Segoe UI", Tahoma, Geneva, Verdana, sans-serif;
```

```
font-weight: bold;
   margin-top: 50px;
   margin-left: 45px;
  }
  .right {
   margin-right: 600px;
  }
  #imagePreview{
  width:375px;
  height: 211px;
  border: 1px solid #f4c2c2;
  background-position: center;
  background-size: cover;
  margin-left:530px;
  margin-top: 20px;
#btn-predict{
  margin-left: 670px;
#result{
  margin-left: 560px;
```

}

}

}

```
.right{
  margin:0 0 0 1200px;
}
 </style>
 <br/><body style="background-color: #f4c2c2">
  <nav class="navbar navbar-expand-lg navbar-dark bg-danger">
   <a class="navbar-brand" href="#"
    >ECG Arrhythmia classification using CNN</a
   >
   <button
    class="navbar-toggler"
    type="button"
    data-toggle="collapse"
    data-target="#navbarNavAltMarkup"
    aria-controls="navbarNavAltMarkup"
    aria-expanded="false"
    aria-label="Toggle navigation"
   >
    <span class="navbar-toggler-icon"></span>
   </button>
   <div class="navbar-collapse collapse w-100 order-3 dual-collapse2">
    ul class="navbar-nav ml-auto">
      class="nav-item">
       <a class="nav-link" href="/home">Home</a>
```

```
class="nav-item">
    <a class="nav-link" href="/info">Info</a>
   class="nav-item">
    <a class="nav-link" href="/types">Types</a>
   class="nav-item">
    <a class="nav-link" href="/predict_base">Predict</a>
   </div>
</nav>
<div class="intro1">
<center>Upload your image to be classified!</center>
</div>
<div
style="
  border: #d9534f;
  border-width: 5px;
  border-style: solid;
  border-radius: 10px;
 height:max-content;
```

```
<img
 src="https://tikotra.com/images/Tikotra-Vaccination-page-icons-02.png"
class="right"
 width="150"
height="150"
/>
Would you like your heart beat pattern to be analysed?
Then, you have come to the right place!
Know your health of your Heart in a Single Click!!
<form id="upload-file" method="post" enctype="multipart/form-data">
 <center>
  <label for="imageUpload" class="upload-label"> </label>
  <input
   type="file"
   name="file"
  id="imageUpload"
   accept=".png, .jpg, .jpeg"
  />
 </center>
</form>
<div class="image-section" style="display:none;"></div>
<div class="img-preview">
<div id="imagePreview">
```

>

```
</div>
     <button type="button" class="btn btn-danger btn-lg " id="btn-predict" style="display:</pre>
none;">Predict
  </div>
  <div class="loader" style="display:none;"></div>
  <a>h3 style="color:Black; font-family: Segoe UI, Tahoma, Geneva, Verdana, sans-serif;</a>
  font-weight: bolder;" id="result">
     <span> </span>
  </h3>
 </body>
</html>
3) Flask Code
import os
import numpy as np
from flask import Flask,request,render_template
from tensorflow.keras.models import load_model
from tensorflow.keras.preprocessing import image
app=Flask(__name__)
model=load_model('arrhythmia.h5')
@app.route("/")
def about():
  return render_template("home.html")
@app.route("/home")
def home():
```

```
return render_template("home.html")
@app.route("/types")
def types():
  return render_template("types.html")
@app.route("/info")
def information():
  return render_template("info.html")
@app.route("/predict_base")
def test():
  return render_template("predict_base.html")
@app.route("/predict_base",methods=["GET","POST"])
def upload():
  if request.method == 'POST':
    f=request.files['file'] #requesting the file
     basepath=os.path.dirname('__file__')#storing the file directory
     filepath=os.path.join(basepath,"uploads",f.filename)#storing the file in uploads folder
     f.save(filepath)#saving the file
    img=image.load_img(filepath,target_size=(64,64)) #load and reshaping the image
    x=image.img_to_array(img)#converting image to array
    x=np.expand_dims(x,axis=0)#changing the dimensions of the image
    pred=model.predict(x)#predicting classes
    y_pred = np.argmax(pred)
    print("prediction",y_pred)#printing the prediction
```

GitHub

https://github.com/IBM-EPBL/IBM-Project-2774-1658482560

Project Demo Link

https://github.com/IBM-EPBL/IBM-Project-2774-

1658482560/blob/main/Video % 20 recording/Project % 20 Demo.mp4