

# Chapter 1

## Introduction

### 1.1 Introduction to Pulse oximeter

Pulse oximeter is the device that work on the principle of Pulse oximetry. Pulse oximetry is the method for monitoring the people's oxygen saturation (SpO<sub>2</sub>) without harming their body. The Standard SpO<sub>2</sub> level is between 95 to 100 percentages. SpO<sub>2</sub> level is mainly depends on R (ratio) value. R value is the ratio value of Red light to Infrared light. The wave length of Red is at 660nm and IR (infrared) is at 940nm.

Pulse oximeter checks to see if people's blood oxygen level is within a healthy range or not. When your oxygen level is down from normal range, it is called hypoxemia.

When person's oxygen level falls down from normal range, the person's lungs starting to become narrow, it is res started to slower down the blood flow by the lungs. When this things happen more stress has been placed on the heart. This could be lead to Serious Heart failure problem for people.

Some symptoms of hypoxemia is given below:

- Feeling stress on Heart
- Problem in normal breathing
- Feeling stress
- Feeling restlessness

Pulse oximetry was developed in 1972, by Takuo Aoyagi and Michio Kishi, bioengineers, at Nihon Kohden using the ratio of red to infrared light absorption of pulsating components at the measuring site. [1]

Susumu Nakajima, a surgeon, and his associates first tested the device in patients, reporting it in 1975. It was commercialized by Biox in 1980. [1]

Pulse oximeter mainly uses in Hospital in below conditions:

- chronic obstructive pulmonary disease (COPD),[2]
- asthma[2]
- pneumonia[2]
- lung cancer[2]
- anemia[2]
- heart attack or heart failure[2]
- congenital heart defects[2]

## 1.2 Introduction to Internet of Things (IoT):

IoT (internet of Things) is a technology that can connect all the devices to the cloud and devices are controlled and monitor through cloud. After IoT is coming in to the Picture the sensor are attached with device that can give the values that can be measured from any were in the world through cloud by accessing remotely. The IoT has been used in many sectors like smart home, smart city, smart hospitals, smart Television and Smart Phones etc. IoT has reduced the cost of monitoring the patients through cheap sensors that can be helpful for doctor as well as patients. The use of IoT devices has been increased rapidly day by day. IoT can change the way of our Living.

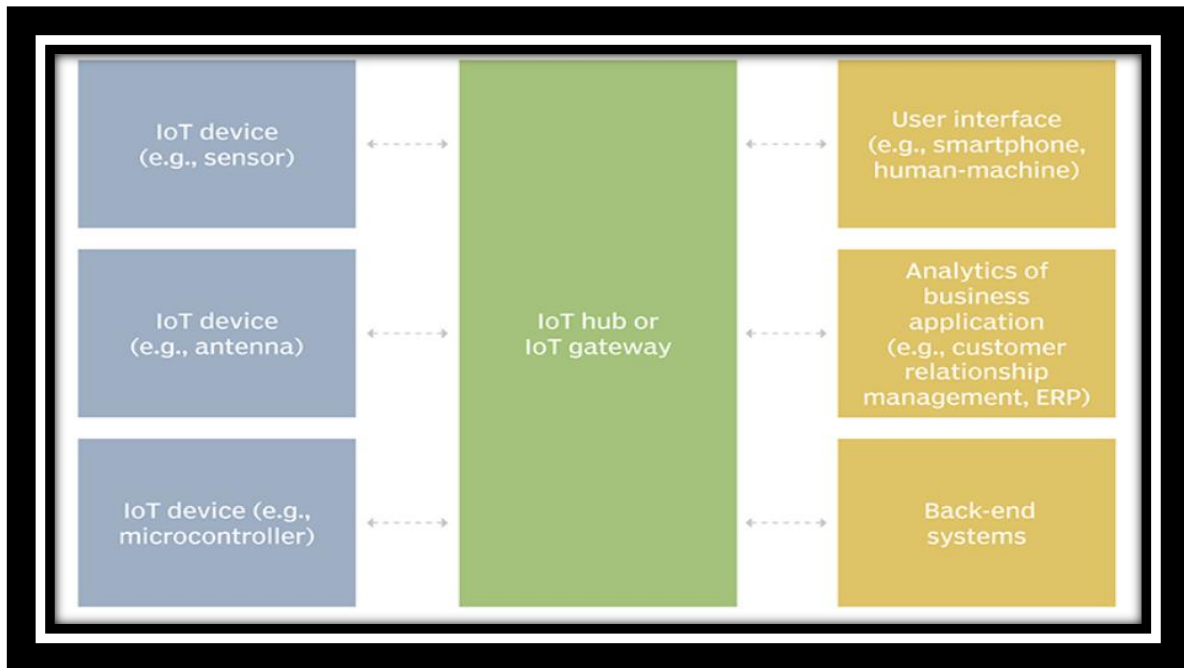


Fig1.1: IoT Architecture

## 1.3 Introduction to Machine Learning (ML):

Machine learning is the way to teach the Algorithms to learn from its past experience and updated itself. Machine learning is a part of AI (artificial intelligence). Machine learning algorithms are build model in Joblib file on sample data. On the sample Data the partition should be possible for train and test data.so that it is used later to measure the accuracy if the algorithms. There are many software used for performing machine learning algorithms like spyder, pycharm, jupyter notebook etc.

There are three types of Machine Learning given below:

- Supervised machine learning
- Unsupervised machine learning
- Reinforcement machine learning

In supervised Machine learning Labels are attached with data. In unsupervised Machine learning labels are not attached with data.in unsupervised machine learning Clustering based approach is taken. In Reinforcement Machine learning feedback Based approach is taken.

Based on the Data the machine learning algorithms are two types given below:

- Classification
- Regression

The programmer is decide to base on data they want to choose classification or regression. Normally when we want to classify some values at that time Classification algorithms are used and when we want to predict continues values like temperature at that time regression algorithms are used.

## **Chapter 2**

### **Literature Review**

#### **2.1:**

Title: web based patient health monitoring system using raspberry pi [3]

Author: Dhiraj sunehra and Pini Ramakrishna [3]

Publication: 2nd international conference on contemporary computing and Informatics (IEEE) [3]

Year: 2016

Objective:

To monitor patient's condition remotely when patient is not at Hospital and save the patient's life Before going to critical condition.

Problem:

Make the device that monitor the patient from any were anytime and Give the report to doctor as Well as patient.

Methodology:

Various sensors such as Blood pressure, Heart beat, Oxygen Saturation in the blood (Spo2), fall Detection and Body Temperature Are interfaced with Arduino Micro controller board for further Signal processing. All computed Parameters are send to Raspberry pi Web server for display on the web page. ZigBee module is used for Communication between raspberry pi and Arduino Uno.

Implementation:

The flow of implementation at software and Arduino side shows in Fig 2.1 the flow of Implementation at software raspberry pi and Web server side shows in Fig 2.2.

Results: The result of a patient is updated at every 60 seconds. The results shows in Fig 2.3

Conclusion: This System Is Useful for monitoring the health Status of elderly and ill patients. Who Are Not Able To Visit Hospital Daily and Require Assistance in Critical Condition. [3]

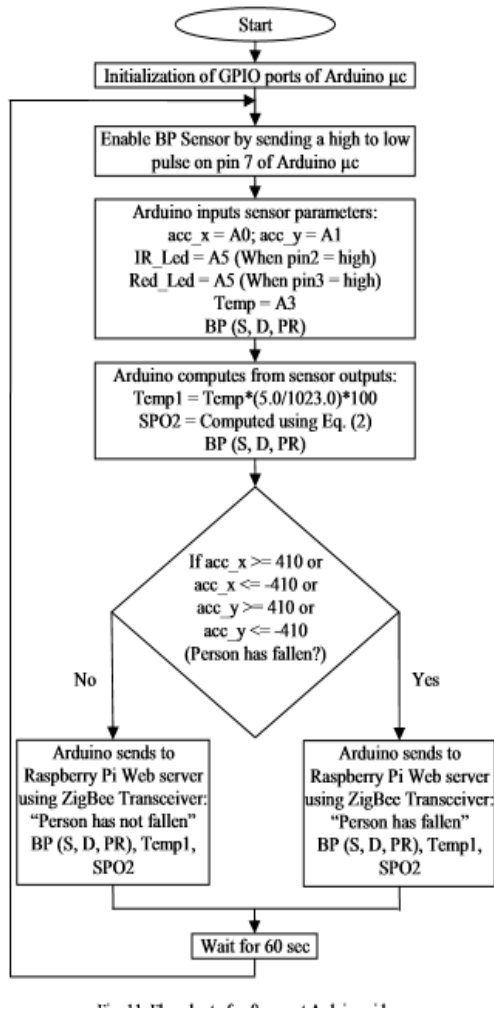


Fig 2.1: Flow chart on software and Arduino side [3]

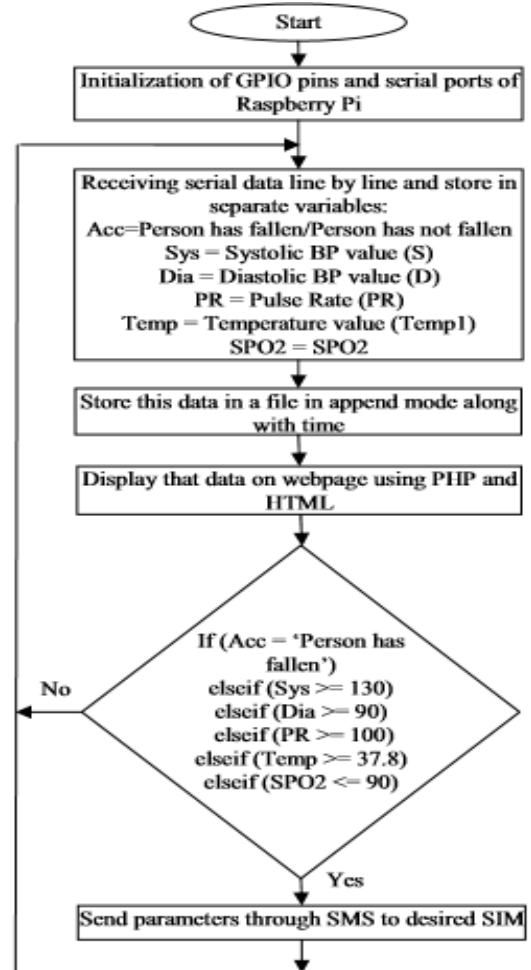


Fig 2.2: Flow chart on Raspberry pi and server side [3]

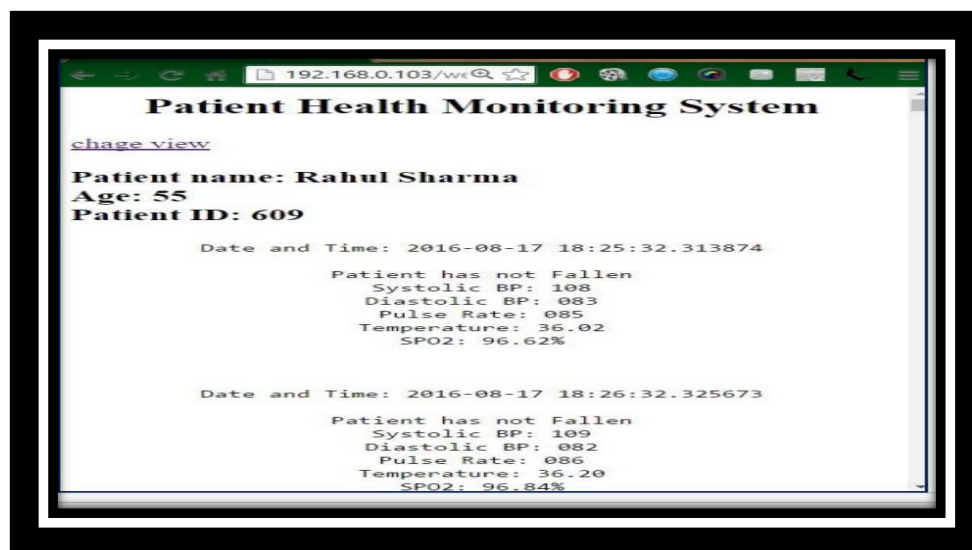


Fig 2.3: Web Result [3]

## 2.2:

Title: Micro controller Based Pulse Oximeter for Undergraduate Capstone Design [4]

Author: Michael Tamayo, Andrew Westover and Ying Sun [4]

Publication: Proceedings of the 2010 IEEE 36th Annual Northeast Bioengineering Conference [4]

Year: 2010

Objective:

To make the Pulse oximeter design using PIC18f452 micro controller.

Problem:

The purpose of this design is to examine the possibility of using a simple Micro controller to measure pulse and blood-oxygen saturation in real time, As well as the level of difficulty and learning curve associated with assigning Such a task as a senior capstone design project. The circuit consists of a PIC18F452 micro controller, transistor network, photoplethysmogram amplifier (PPG), pulse oximeter probe, digital-to-analog converter (DAC), and an LCD Screen to display results. Software is written in C++ for the microprocessor, which supports a limited C syntax. [4]

Methodology:

Code is written in C++ using the CC8E compiler with MPLA (Math Works, Natick, MA) in order to integrate the PIC processor With IDE. [4]

Results:

The LCD screen updates when four peaks have been detected after switching LEDs, Accurately displaying pulse and oxygen saturation of the blood. Figure 2 depicts a user's arterial pressure waveform with accurate peak-valley detection and LED switching across a 20 second span. These results were obtained using an oscilloscope, with channel 1 connect To the DAC to show the arterial pressure waveform and channel2 to an output port of the PIC set to an alternate between 0 and 5 volts corresponding to peak-valley detection. [4]

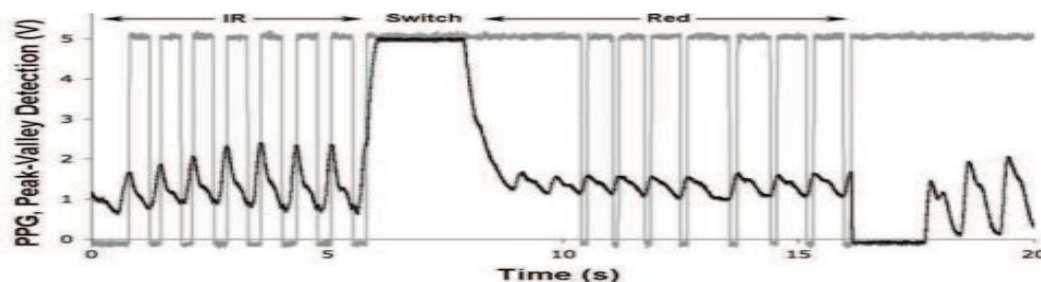


Fig: 2.4 Result of Arterial pressure results from peak and valley [4]

Conclusion:

Accurate heart rate and oxygen saturation results were obtained using a PIC Processor incapable of complex operations.

### 2.3:

Title: Mini Home-Based Vital Sign Monitor with Android Mobile Application (my Vital Gear) [5]

Author: Yuan wen hau and Mas Azalya Yusof [5]

Publication: IEEE-EMBS Conference on Biomedical Engineering and Sciences [5]

Year: 2018

Objective:

To monitor the health using Arduino microcontroller and Make the Android mobile application.

Problem:

High accurate mini home based vital sign monitor which can measure human vital signs of SpO<sub>2</sub>, ECG and body temperature based on Arduino Nano technology with Android-based mobile application support and auto alarm system. [5]

Methodology:

The software used to programming is Arduino IDE (integrated development environment) and code is written in C language.

Results:

The result is shows in Fig 2.5 and Fig 2.6

Conclusion:

The Mini Vital Sign monitor is integrated with an Android-based mobile application with simple user interface to display real-time vital sign monitoring result and auto-send notification in case of any abnormality is detected.[5]

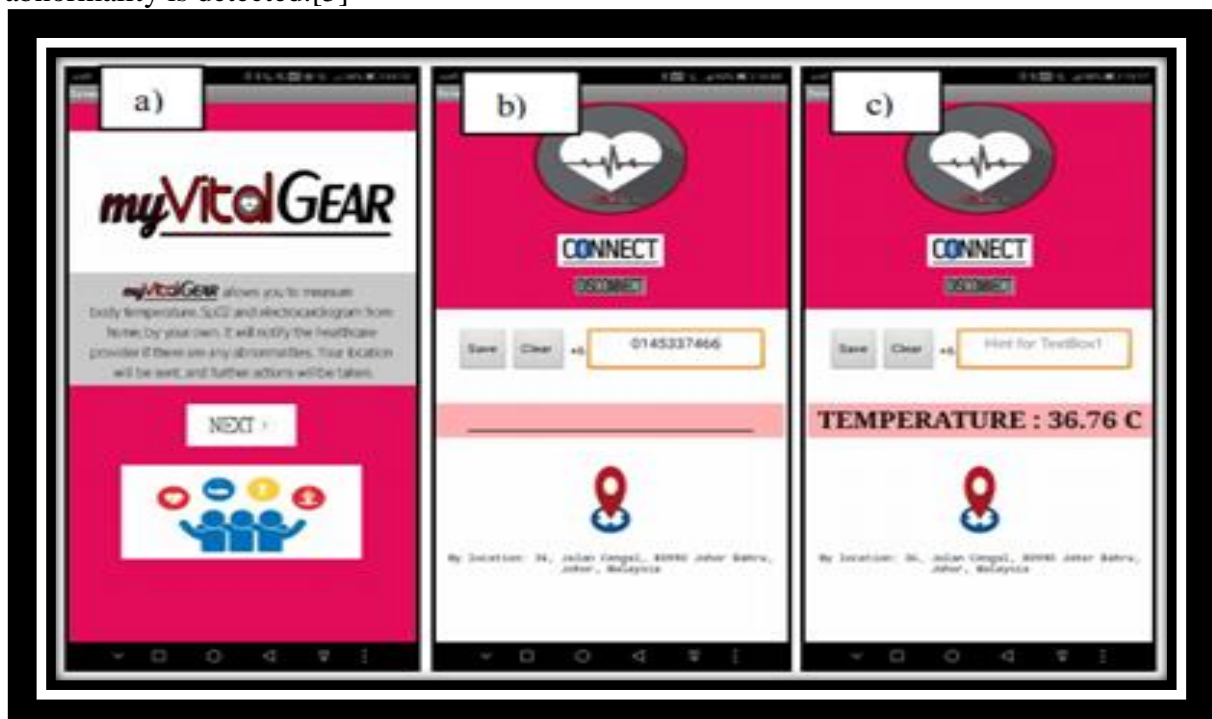


Fig 2.5: (a) Home Screen of the mobile application [5]

(b) Second page interface of the mobile application [5]

(c) Temperature measurement is displayed on the screen [5]

Vital Signs	Accuracy (%)
Heart Rate	99.4
Temperature	99.7
Oxygen Saturation(Spo2)	98.1

Table: 2.1 Vital Sign Measurement Accuracy [5]

## 2.4:

Title: An ANN based SpO2 Measurement for Clinical Management Systems. [6]

Author: Garima P Gupta, Rajashree R Nair, R Jeyanthi. [6]

Publication: Energy Procedia (Elsevier) [6]

Year: 2017

Objective:

To measure the Spo2 using LabVIEW software and compare three methods are fuzzy Logic, Linear Regression and ANN.

Problem:

Pulse oximeters are more accurate method then other methods for measuring the Spo2 Level. The samples of 20 patients are taken for normal to breathing problem patients.

Methodology:

SpO2	Saturation oxygen level in blood in percentage
A	Total amount of blood
B	Amount of oxygenated blood
R	Ratio value

Table: 2.2 Naming [6]

EQUATION:  $SpO2 = B/A * 100$



Results:

subjects	R value	ANN	Fuzzy logic	Linear regression
1	0.100	99.26	97.10	93.59
2	0.250	96.83	96.72	90.19
3	0.140	98.65	96.81	92.67
4	0.220	97.37	96.69	90.87
5	0.270	96.50	96.22	89.74
6	0.160	98.34	96.74	92.26
7	0.110	99.11	97.02	93.35
8	0.130	97.19	96.71	90.64
9	0.249	96.87	96.75	90.21
10	0.290	96.15	95.74	89.29
11	0.154	98.43	96.75	92.36
12	0.102	99.23	97.08	89.53
13	0.275	96.41	96.10	89.62
14	0.172	98.18	96.71	92.00
15	0.262	96.64	96.43	89.92
16	0.245	96.94	96.75	92.30
17	0.160	98.34	96.74	92.22
18	0.132	98.78	96.86	92.85
19	0.210	97.53	96.66	91.09
20	0.249	96.87	96.75	90.21

Table: 2.3 Comparison Table [6]

Conclusion:

Results of 20 subjects are shown in Table.3. In this, linear regression method shows poor capturing ability. ANN and Fuzzy based methods are show quite consistent values, but ANN captures accurate value than Fuzzy logic based. [6]

## 2.5:

Title: Machine Learning based SpO<sub>2</sub> Computation Using Reflectance Pulse Oximetry [7]

Author: Swaathi Venkat, Mohamed Tanveejul Arsath PS, Preejith SP [7]

And Annamol Alex [7]

Publication: 41st Annual International Conference of the IEEE Engineering in Medicine and Medicine and biological science [7]

Year: 2019

Objective: To use ML algorithm (Linear regression) for different age of persons.

Problem: To make Spo<sub>2</sub> measurement training module using LabVIEW software

And trying to get accurate result of different age persons using ML

Algorithm (Linear regression).

Methodology:

Age group	No. of male subjects	No. of female subjects	Pulmonary Disorders (No.)		
			COPD	Respiratory failure	Others
19-20	0	1	0	0	1
21-30	2	2	0	0	4
31-40	3	3	0	1	5
41-50	8	10	0	2	16
51-60	11	14	4	0	21
61-70	15	16	3	1	27
71-80	8	2	0	0	10

Table: 2.4 subject Meta data [7]

Results:

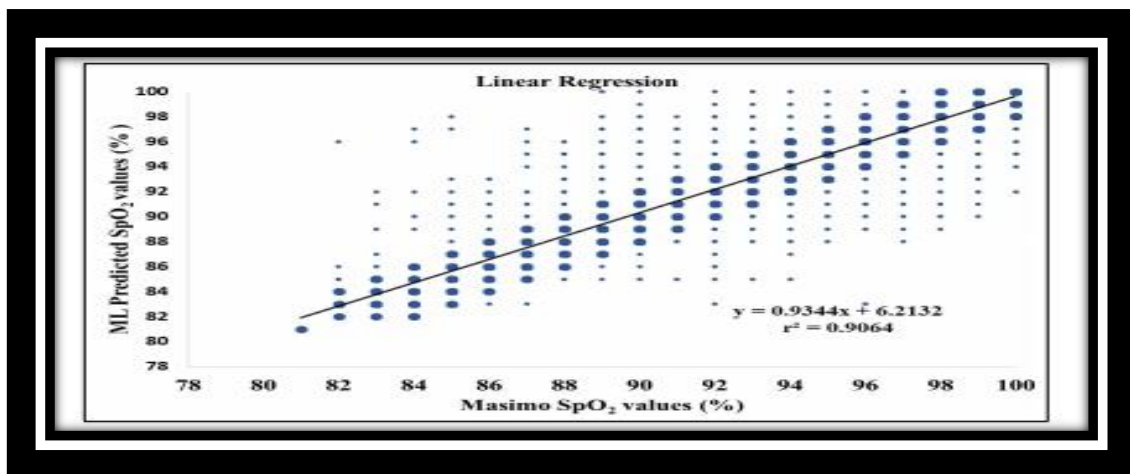


Fig 2.6: Linear regression plot [7]

Class	Total no. of test observations	No. of observations predicted with $\pm 2\%$ error	Accuracy (in %)	Absolute mean error (in %)
81	1	1	100	0
82	15	9	60	2.86
83	52	46	88.46	1.59
84	112	105	93.75	1.05
85	223	205	91.92	0.90
86	551	534	96.91	0.37
87	311	283	90.99	0.78
88	498	446	89.55	0.90
89	490	427	87.14	1.25
90	1095	1042	95.15	0.75
91	1552	1499	96.58	0.61
92	2149	2073	96.46	0.51
93	1897	1862	98.15	0.48
94	2427	2364	97.40	0.35
95	1823	1767	96.92	0.47
96	1900	1848	97.26	0.54
97	3243	3205	98.82	0.27
98	2050	2020	98.53	0.42
99	891	845	94.83	0.62
100	785	747	95.15	0.30

Table 2.5: class wise observations [7]

Conclusion:

The model was less accurate for 81-90 class data set because of given insufficient Data set. Data set for which Spo2 is less than 90% is crucial Have to take timely because of hypoxia. Also the given model can be extended on wrist and chest for Spo2 Reflectance PPG measurements

## Chapter 3

### Implementation of Pulse oximeter

#### 3.1 Components needed:

- JHD 162A 16\*2 LCD display
- ESP8266 (NODEMCU) Wi-Fi module
- Bread board
- Male to Male, Female to Male
- And Female To Female connecter
- MAX 30100 moduleI2C Module

##### 3.1.1: JHD 162A 16\*2 LCD Display:

- LCD display module with Yellow Backlight[8]
- SIZE : 20x4 (2 Rows and 16 Characters Per Row)[8]
- Built-in industry standard HD44780 equivalent LCD controller[8]
- Commonly Used in: Student Project, Collage, copiers, fax machines, laser printers, industrial test equipment, networking equipment such as routers and storage devices[8]
- Operate with 5V DC LCD type: Characters[8]



Fig: 3.1 JHD 162A LCD Display [8]

##### 3.1.2:ESP8266 Wi-Fi module:

Node MCU is an IoT Module based on ESP8266 Wi-Fi Module. Node MCU uses Lua Scripting language and is an open source Internet of Things (IoT) platform. This modules has CH340g USB to TTL IC. [9]

### Specification of Node-MCU IoT Module:

- It is based on ESP8266, integrates GPIO, PWM, IIC, 1-Wire and ADC all in one board.[9]
- Power your development in the fastest way combining with Node MCU Firmware.[9]
- USB-TTL included, plug&play. [9]
- 10 GPIO, every GPIO can be PWM, I2C, 1-wire[9]

### Features of Node-MCU IoT Module:-`

- Open source IoT Platform. [9]
- Easily Programmable. [9]
- Low cost & Simple to Implement.[9]
- WI-FI enabled[9]

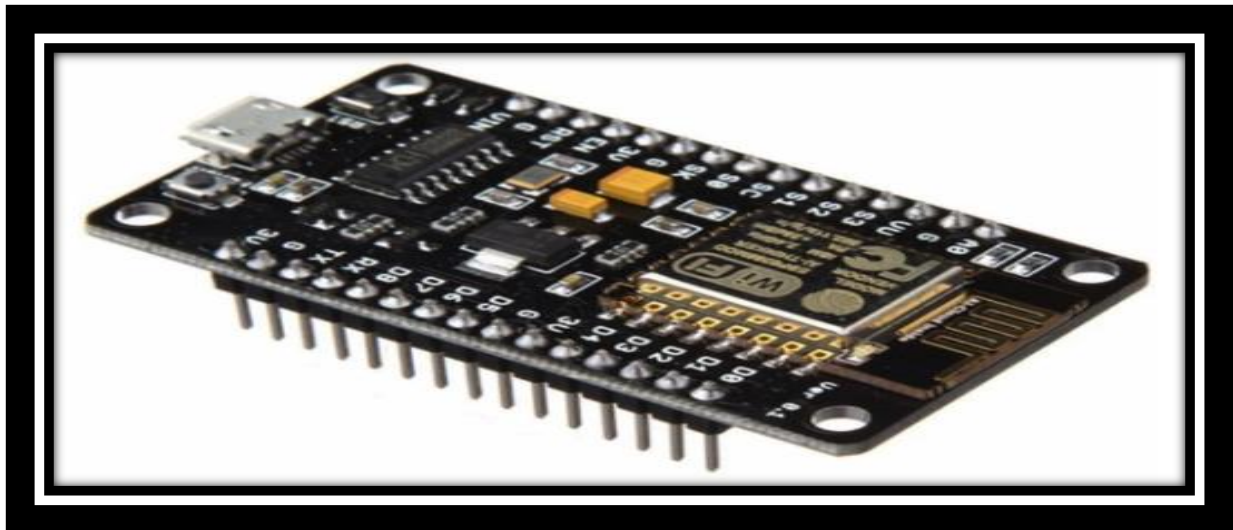


Fig: 3.2 Node MCU Wi-Fi Module [9]

### 3.1.3:MAX30100 Sensor:

The MAX30100 is an integrated pulse oximetry and heart-rate monitor sensor solution. It combines two LEDs, a photodetector, optimized optics, and low-noise analog signal processing to detect pulse oximetry and heart-rate signals.[10]

The MAX30100 operates from 1.8V and 3.3V power supplies and can be powered down through software with negligible standby current, permitting the power supply to remain connected at all times.

### Applications/Uses

- Fitness Assistant Devices[10]
- Medical Monitoring Devices[10]
- Wearable Devices[10]

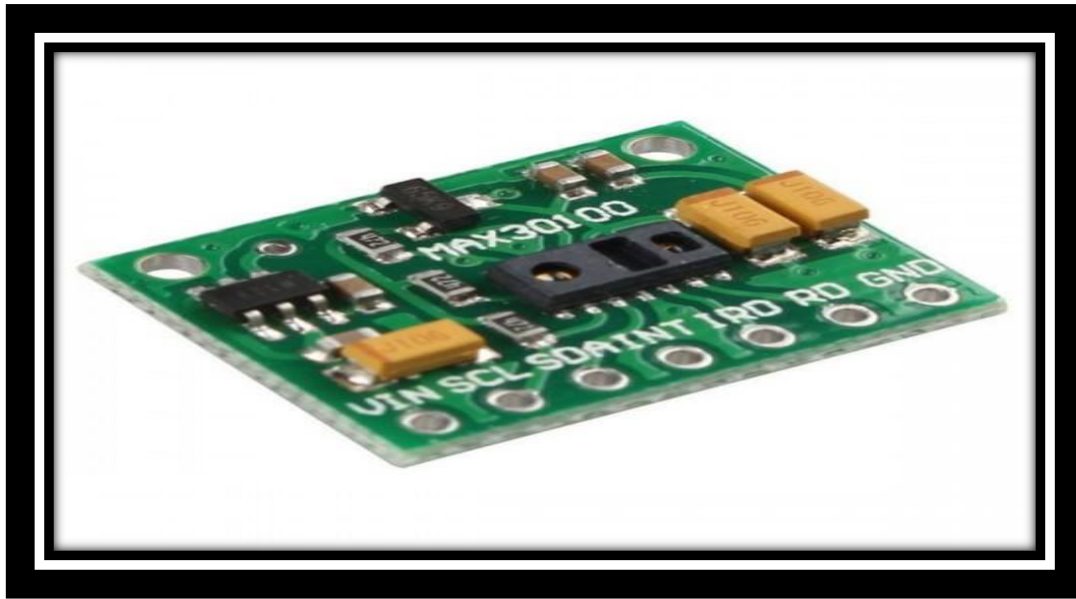


Fig3.3: MAX30100 Module [10]

#### 3.1.4:I2C module:

IIC/I2C Interface Adapter Module is used for 16×2 LCD Display. It uses the PCF8574T IC chip which converts I2C serial data to parallel data for the LCD display. Also this interface module simplifies connecting an Arduino to a 16×2 Liquid Crystal display using only 4 wires. [11]

Features:

- Serial I2C control of LCD display using PCF8574 [11]
- 5V power supply [11]
- Backlight can be enabled or disabled via a jumper on the board [11]
- Contrast control via a potentiometer [11]



Fig3.4:I2C Module [11]

### 3.2 Interfacing LCD, Node MCU and MAX30100:

The software for writing the code is Arduino IDE (Integrated Development Environment). The code is similar to C language code. The sketch written in Arduino IDE when it compiled successfully after that code is uploaded to Node MCU. The compiling code is given in Fig.3.5. The results of Spo2 and Heart rate shown in display on Fig.3.6.

For Compilation of code the following libraries are added compulsory:

- MAX30100\_PulseOximeter.
- Wire.h
- ESP8266WiFi.h
- LiquidCrystal\_I2C.h

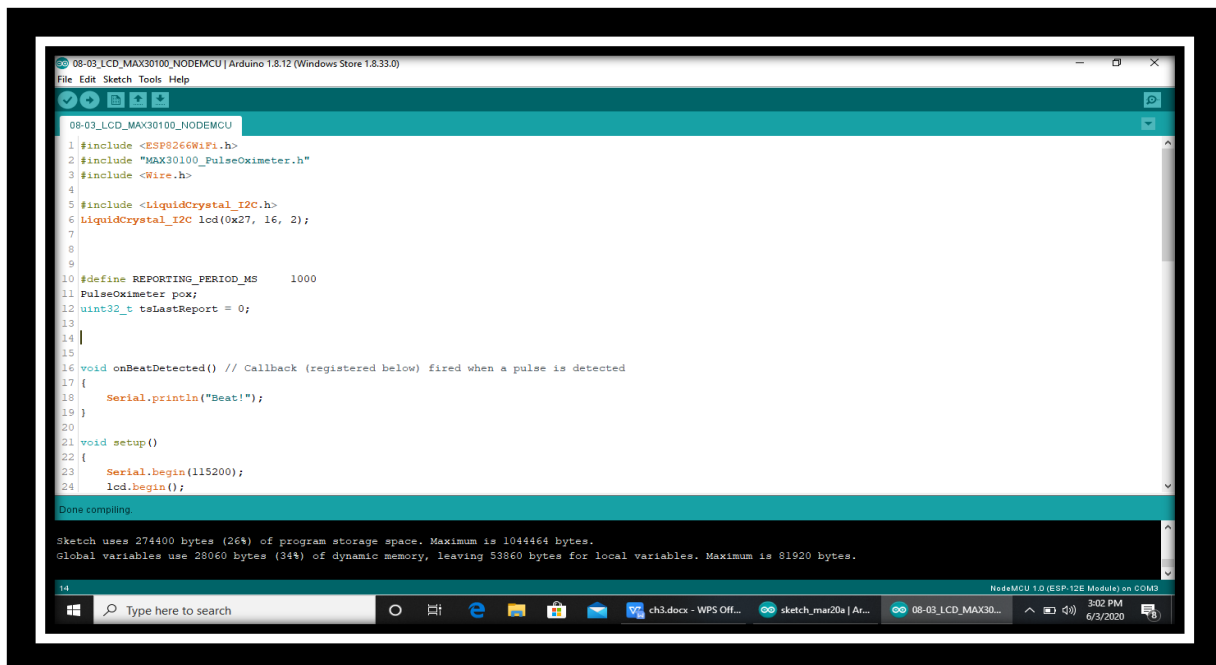


Fig3.5: Code compilation of LCD, Node MCU and MAX30100

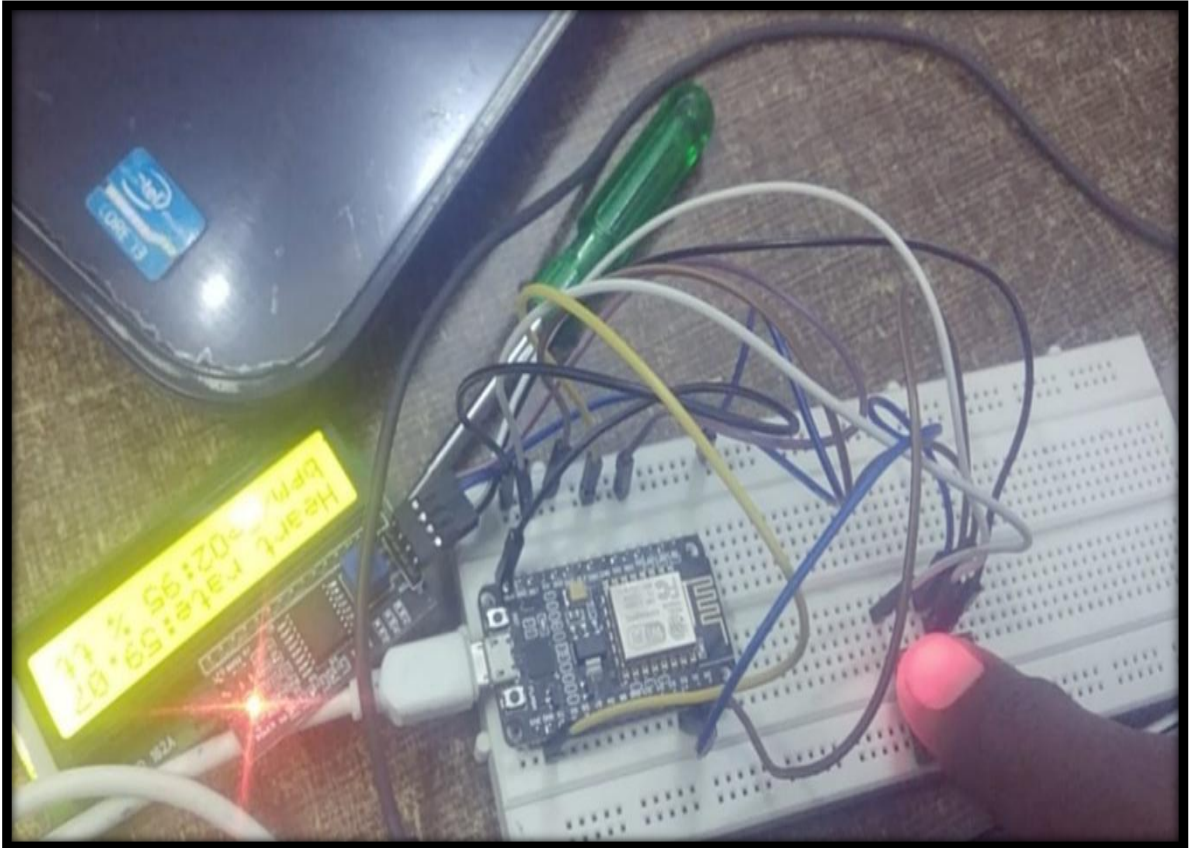


Fig3.6: Result of Spo2 and Heart rate on Display



## Chapter 4

### Implementation of Mobile app

#### 4.1 Preparation of App on Blynk platform:

Blynk is open source IoT platform that provide connectivity to connect the IoT devices to them. Blynk is also provide the facility to making our own app as per our device configuration. The data in Blynk app is secured and reliable with authentication key. Features are provided by Blynk Platform is very useful and reliable. First we have to new project and then select the devices with we want to connect with Blynk application. After that we need to configure and making app as per our requirement.

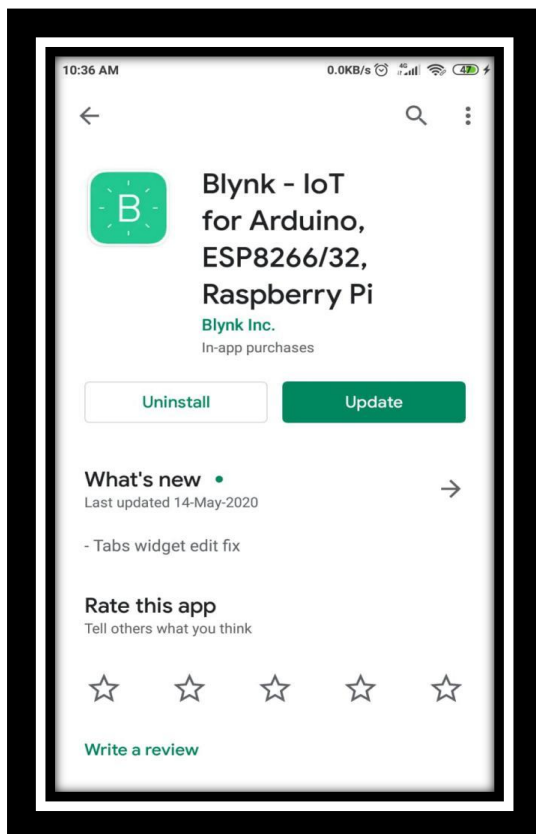


Fig 4.1: Blynk app Platform

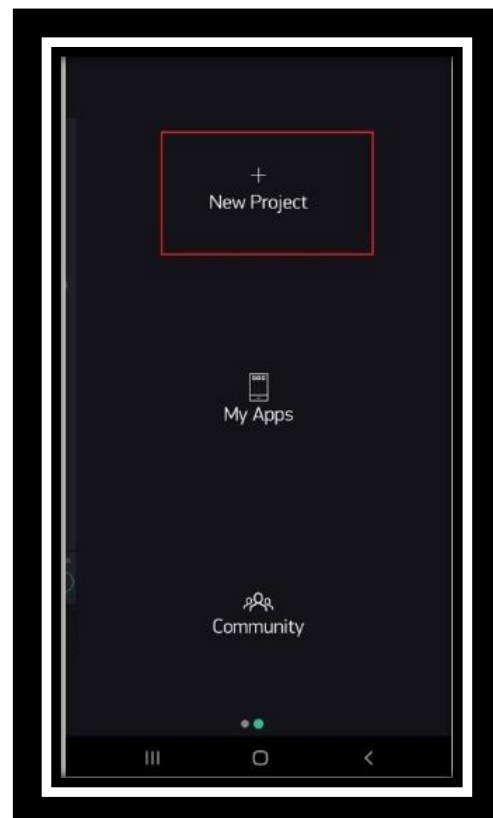


Fig 4.2: Creating a New project



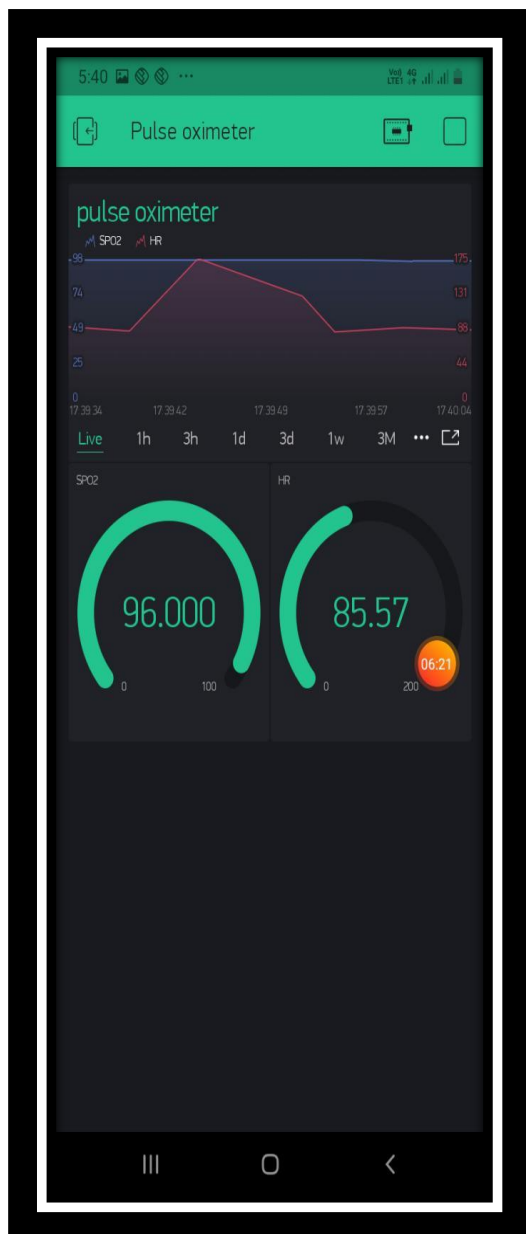


Fig 4.3: Pulse oximeter app on Blynk Platform

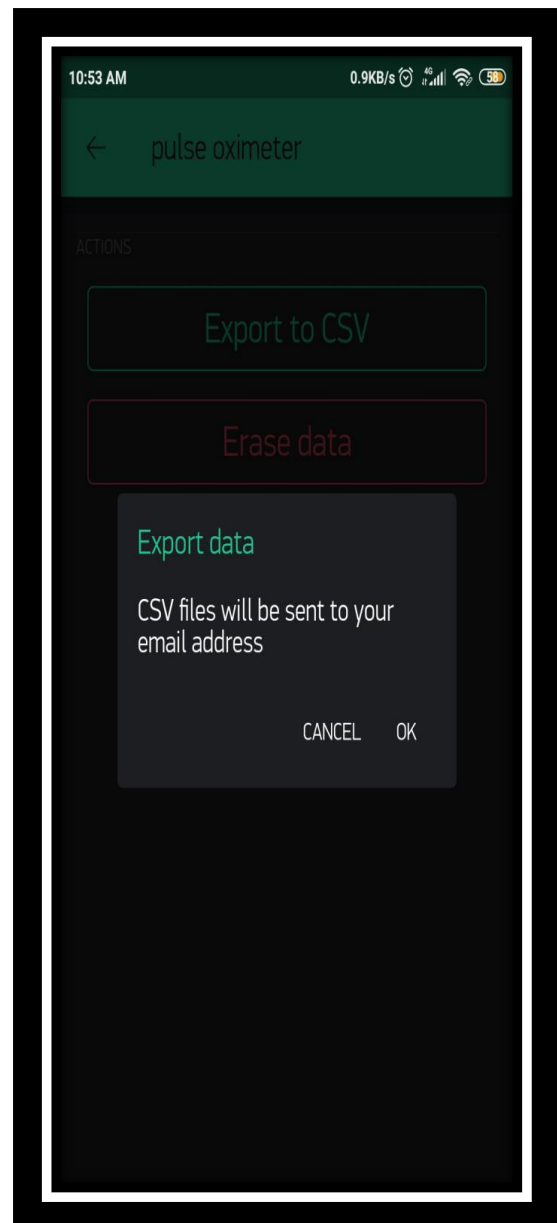


Fig 4.4: Historical data sent to mail

The image shows a screenshot of the Arduino IDE interface. The main window displays a C++ sketch for a Blynk-based pulse oximeter. The code includes headers for Wire, MAX30100\_PulseOximeter, Blynk, ESP8266WiFi, BlynkSimpleEsp8266, Wire, Adafruit\_GFX, and OakOLED. It defines a reporting period of 5000ms and declares variables for authentication, WiFi credentials, and sensor data. The code is currently at line 24. Below the code editor, a status bar indicates 'Done compiling.' and provides memory usage statistics: 'Sketch uses 296136 bytes (28%) of program storage space. Maximum is 1044464 bytes. Global variables use 31152 bytes (38%) of dynamic memory, leaving 50768 bytes for local variables. Maximum is 81920 bytes.'

Fig 4.5: Code compilation on Arduino IDE for Blynk Platform

Fig 4.1 shows Blynk Platform on Google Play store. Fig 4.2 shows the way to create new project on Blynk Platform. The data of Spo2 was stored in V5 (virtual Pin) and The Data of Heart rate (HR) was stored in V6 (Virtual pin). Fig 4.3 shows the application of Pulse oximeter on Blynk Platform. The real time data of Spo2 and HR is shows in label and Historical data is shows in graphical form. The historical Data is stored in Blynk cloud. Fig 4.4 shows the historical data is sent in E-Mail for Further analysis. Fig 4.5 shows the compilation is done on Arduino IDE software.

## Chapter 5

### Creating Health conditions on Historical data and data validation by doctor

#### 5.1 health conditions:

The health condition are create on 1304 samples of data shown in Table 5.1. The data set has been taken from Kaggle data science and machine learning data set repository. Out of 1304 samples nine health condition has been created after analyzing the data set. After that all conditions are verified by doctor.

Health conditions	Labels	Samples	conditions
Some how reduced	1	173	SPO <sub>2</sub> : 92 to 95
Bradycardia and middle SPO <sub>2</sub>	2	18	HR:<60 SPO <sub>2</sub> : 92 to 95
Tachycardia and middle SPO <sub>2</sub>	3	59	HR:>100 SPO <sub>2</sub> :92 to 95
COPD[3]	4	32	SPO <sub>2</sub> :88 to 91
Critical Condition	5	46	SPO <sub>2</sub> < 91 HR:<60 and >100
Bradycardia[1]	6	71	HR:<60
Tachycardia[2]	7	179	HR:>100
SPO <sub>2</sub> critical[5]	8	21	SPO <sub>2</sub> < 87
Normal[6]	9	704	SPO <sub>2</sub> : 96 to 100 HR:60 to 100

Table 5.1: Health conditions

#### Tachycardia:

Tachycardia happens when person's heart beat more Than 100 time per minute. There are three types of Tachycardia.

1. Supraventricular
2. Ventricular
3. Sinus tachycardia

The main Reasons for Tachycardia are strenuous exercise, a fever, fear, stress, anxiety, certain medications, street drugs and smoking.

#### Bradycardia:

Bradycardia happen when person's heart beat slower than 60 Time per minute. Normal heart beat range is Between 60 to 100. The symptoms of Bradycardia are Fatigue, shortness of breath, Pain in chest and memory problem. The main risk factor for Bradycardia is age. Bradycardia normally happens in older age Persons.

#### Chronic obstructive pulmonary disease (COPD):

COPD is common lung issue. COPD person's normally have breathing problems. Smoking is the main reason for COPD. But some people do not smoke still COPD Happens. Heavy amount of pollution also cause COPD.

## 5.2 Data Validation by Doctor:

Data validation is done by Dr. Jigar Dodiya (Anesthesiology) From Gokul super speciality, Rajkot as shown in Fig 5.1

NAME: DHARMENDRASINH REVAR	
ENROLLMENT NO: 181370760006	
Health condition	Levels of parameters
Some how reduced SPO <sub>2</sub>	SPO <sub>2</sub> : 92 to 95
Bradycardia and middle SPO <sub>2</sub>	SPO <sub>2</sub> : 92 to 95 HR: Less Than 60
Tachycardia and middle SPO <sub>2</sub>	SPO <sub>2</sub> : 92 to 95 HR: More Than 100
COPD	SPO <sub>2</sub> : 88 to 91
Critical Condition	SPO <sub>2</sub> : Less Than 91 HR: Less Than 60 And More Than 100
Bradycardia	HR: Less Than 60
Tachycardia	HR: More Than 100
SPO <sub>2</sub> critical	SPO <sub>2</sub> : Less Than 87
Normal	SPO <sub>2</sub> : 96 to 100 HR: 60 to 100

Dr. Jigar Dodiya  
MD-Anesthesiology  
Reg. No.: G-25097  
Gokul Lifescience Pvt. Ltd.

Fig 5.1 Data validation done by doctor

## Chapter 6

### Machine learning algorithms of validate data

#### 6.1 Data analysis:

Fig 6.1 shows statistics of Data set of 1304 samples like number of variables, number of observations, missing cells, duplicate rows, total size of memory, average size of memory etc.

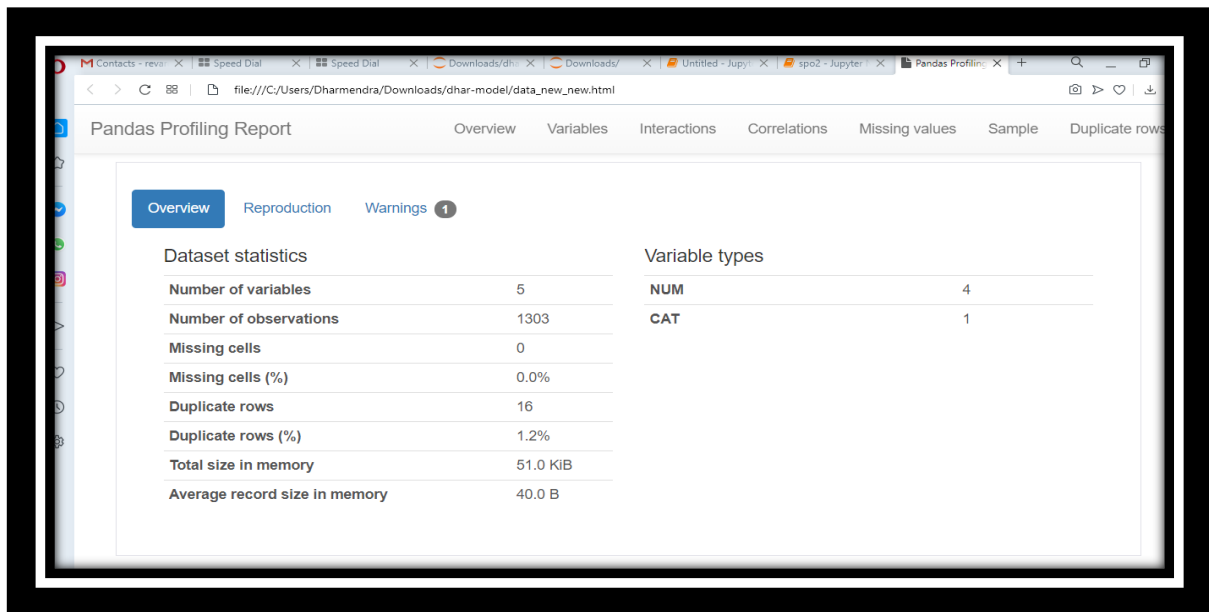


Fig 6.1: Data set statistics

Fig 6.2 Shows Genders values, its percentage and its memory size. Label 1 shows the values of male and label 2 shows the values of female.

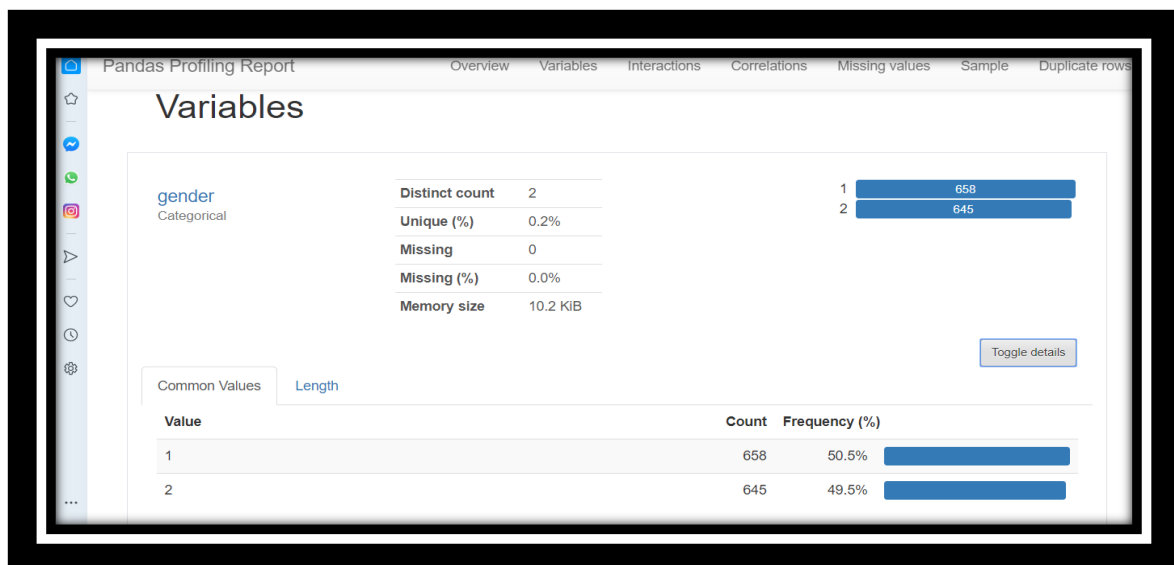


Fig 6.2: Gender count

Fig 6.3 shows details about Spo2 like mean, maximum, zeros, memory Size, minimum, zeros, unique, infinite, missing etc. the graph shows that Spo2 values on X-axis and number of samples on Y-axis.

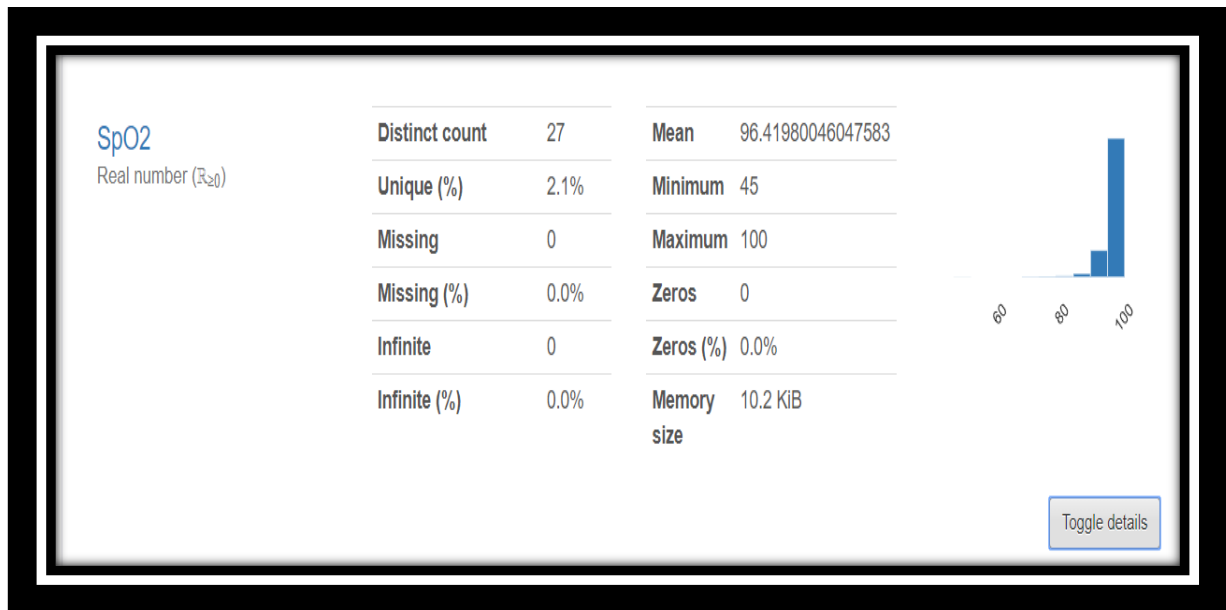


Fig 6.3: Spo2 details

Fig 6.4 shows statistics of Spo2 like standard deviation, mean, sum, variance, skew ness, Median absolute deviation, coefficient of variation, range, Q1, Q3, kurtosis, Interquartile range etc.

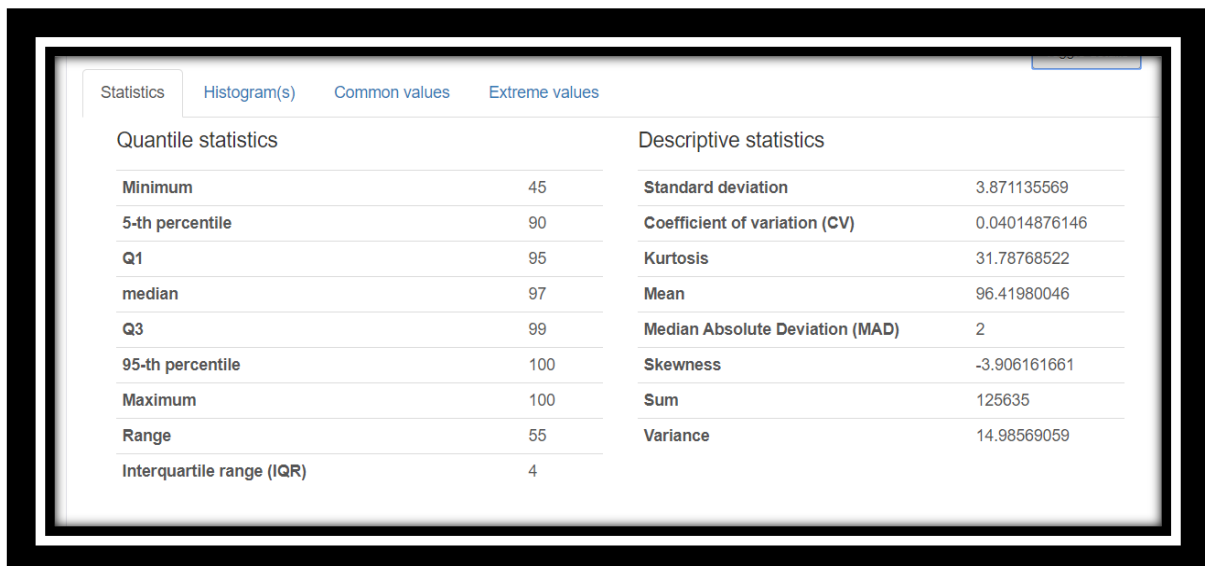


Fig 6.4 Spo2 Statistics

Fig 6.5 shows histogram of Spo2 Values. On the X-axis Shows Spo2 values and on Y-axis shows number of samples.

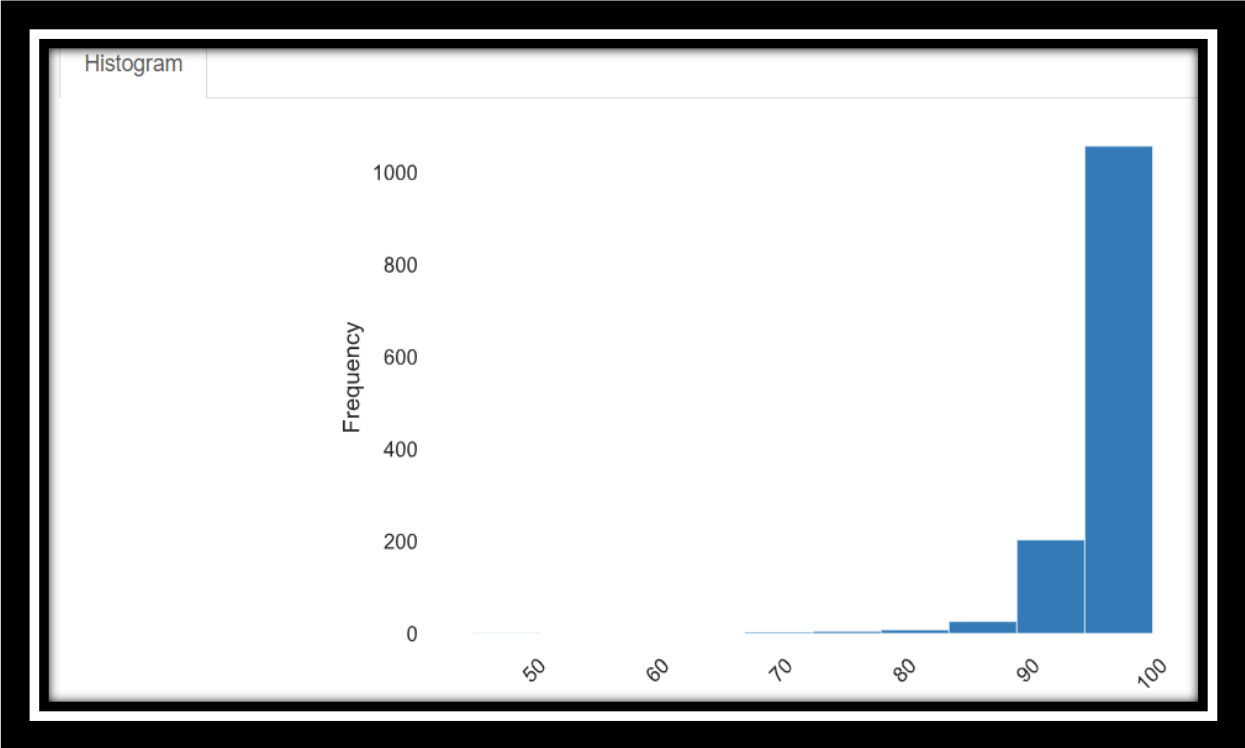


Fig 6.5 Spo2 Histogram

Fig 6.6 shows common values of Spo2 with its percentage.

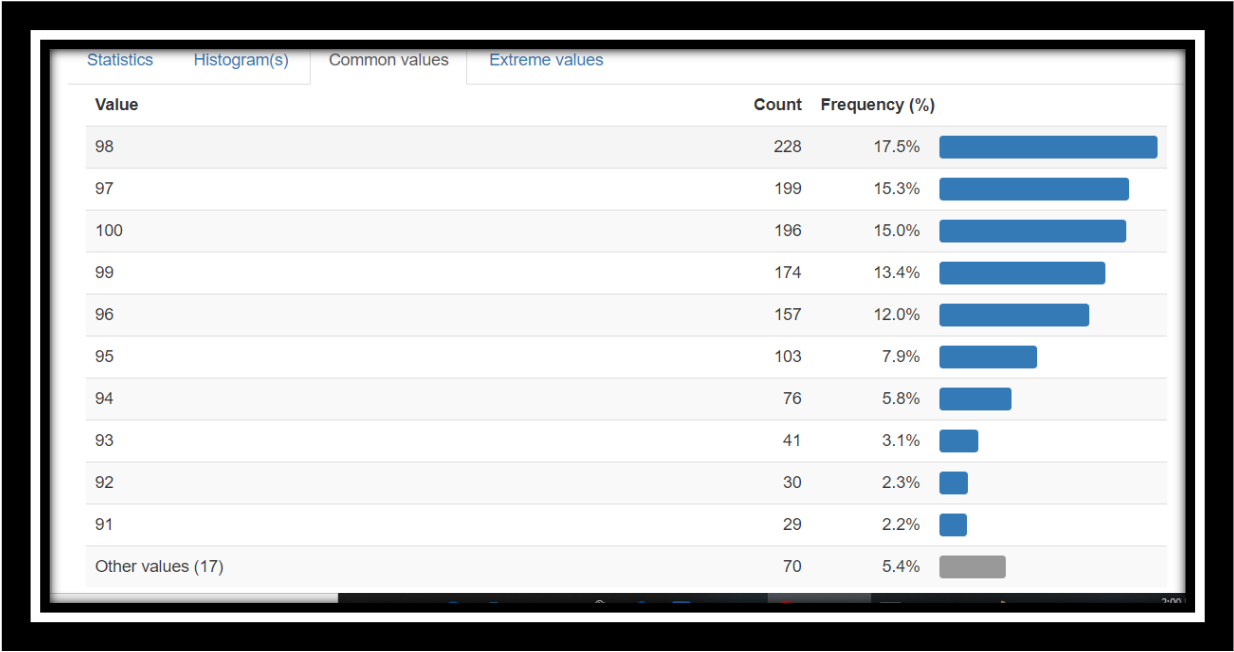


Fig 6.6: Spo2 Common values

Fig 6.7 shows extreme values of Spo2 with its percentage.

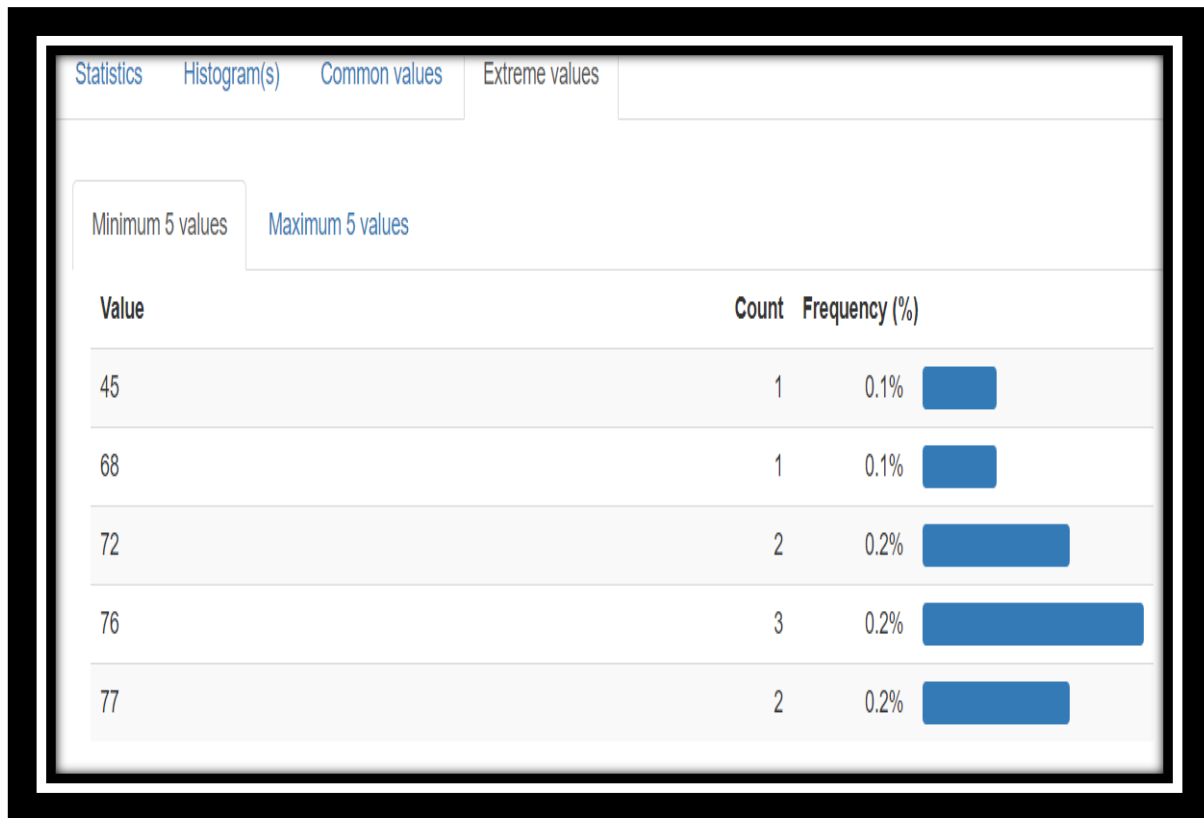


Fig 6.7: Spo2 Extreme values

Fig 6.8 shows details about HR like mean, maximum, zeros, memory Size, minimum, zeros, unique, infinite, missing etc. the graph shows that HR values on X-axis and number of samples on Y-axis.

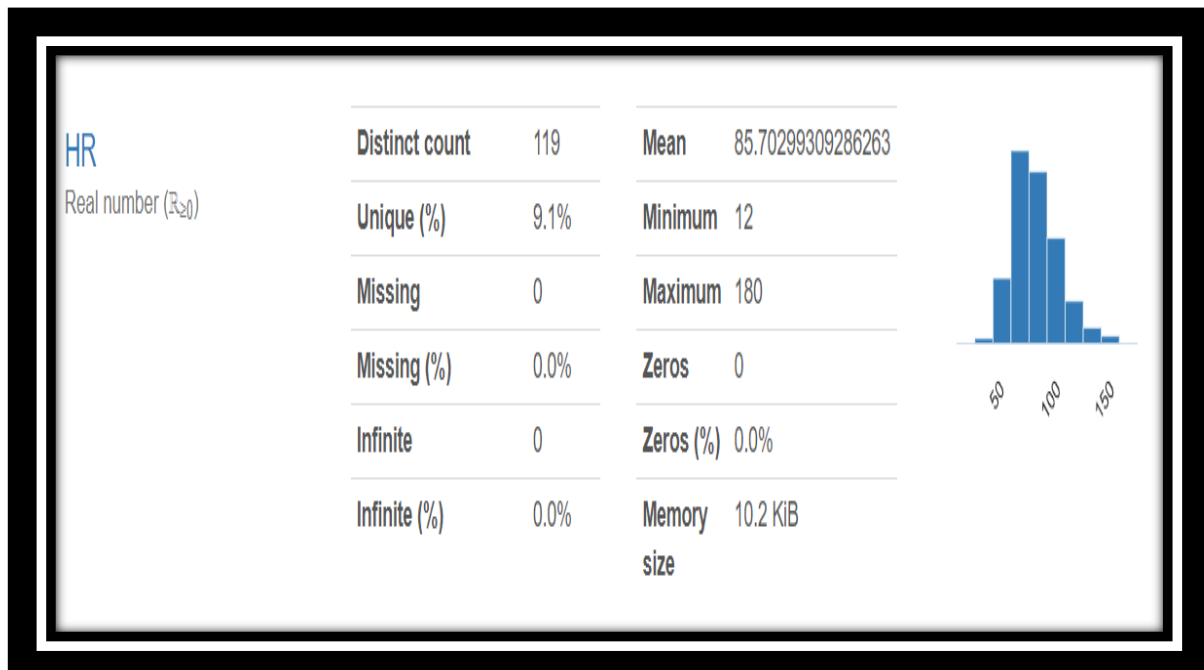


Fig 6.8: HR details



Fig 6.9 shows statistics of HR like standard deviation, mean, sum, variance, skew ness, Median absolute deviation, coefficient of variation, range, Q1, Q3, kurtosis, Interquartile range etc.



Fig 6.9: HR Statistics

Fig 6.10 shows histogram of HR Values. On the X-axis Shows Spo2 values and on Y-axis shows number of samples.

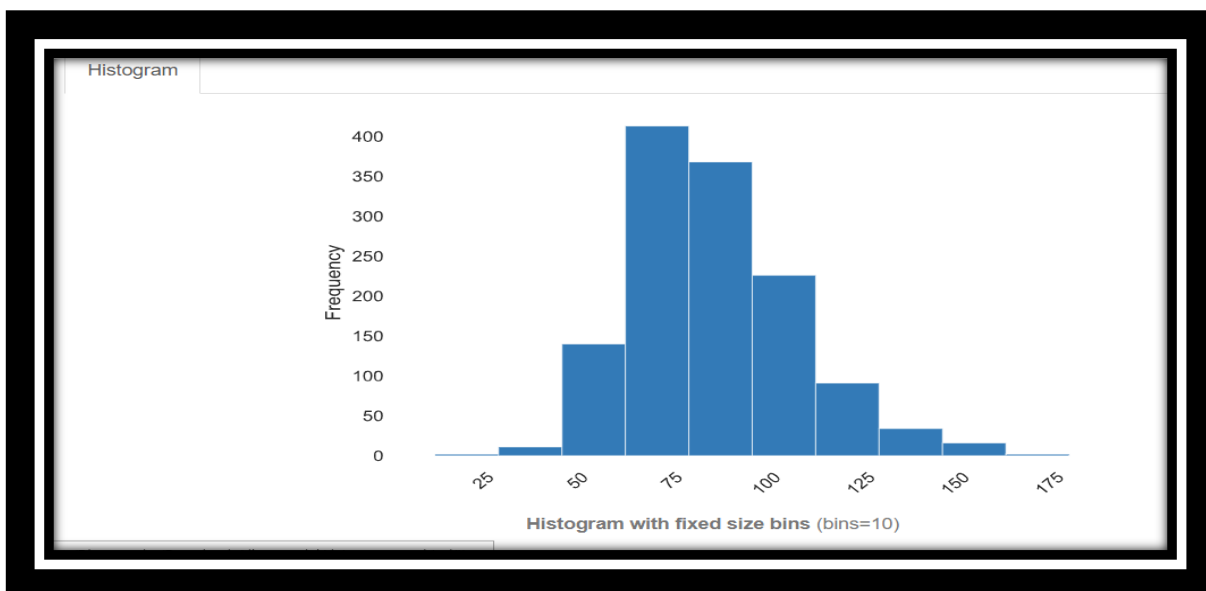


Fig 6.10: HR histogram

Fig 6.11 shows common values of HR with its percentage.



Fig 6.11 Spo2 common values

Fig 6.12 shows extreme values of HR with its percentage.

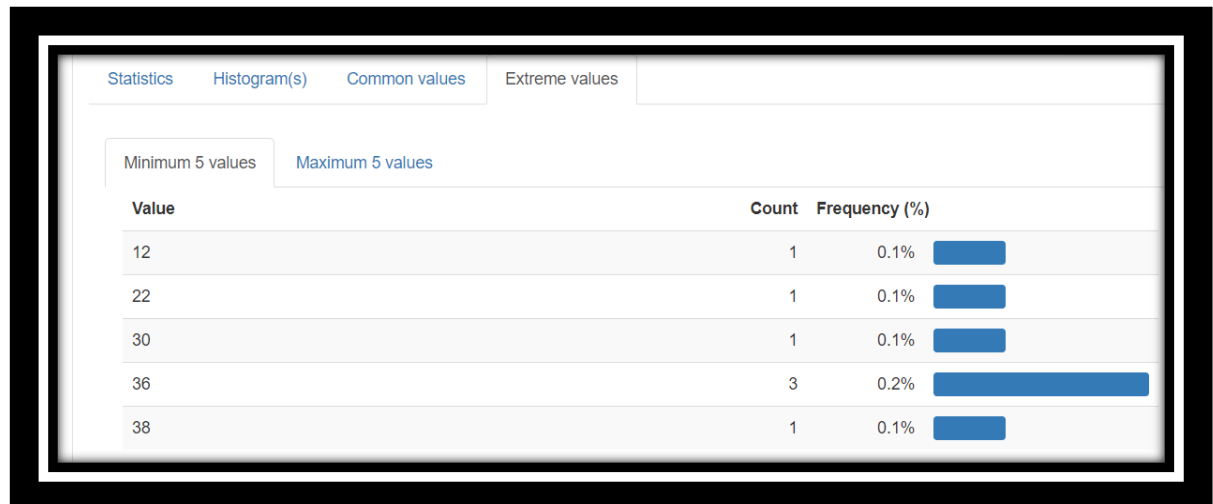


Fig 6.12: Spo2 extreme values

Fig 6.13 shows details about HR like mean, maximum, zeros, memory Size, minimum, zeros, unique, infinite, missing etc. the graph shows that age values on X-axis and number of samples on Y-axis.

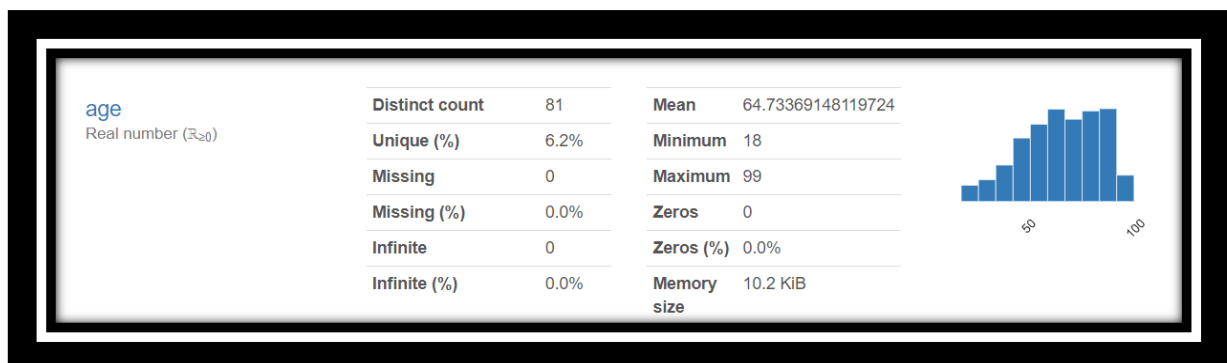


Fig 6.13: age details

Fig 6.14 shows statistics of age like standard deviation, mean, sum, variance, skew ness, Median absolute deviation, coefficient of variation, range, Q1, Q3, kurtosis, Interquartile range etc.

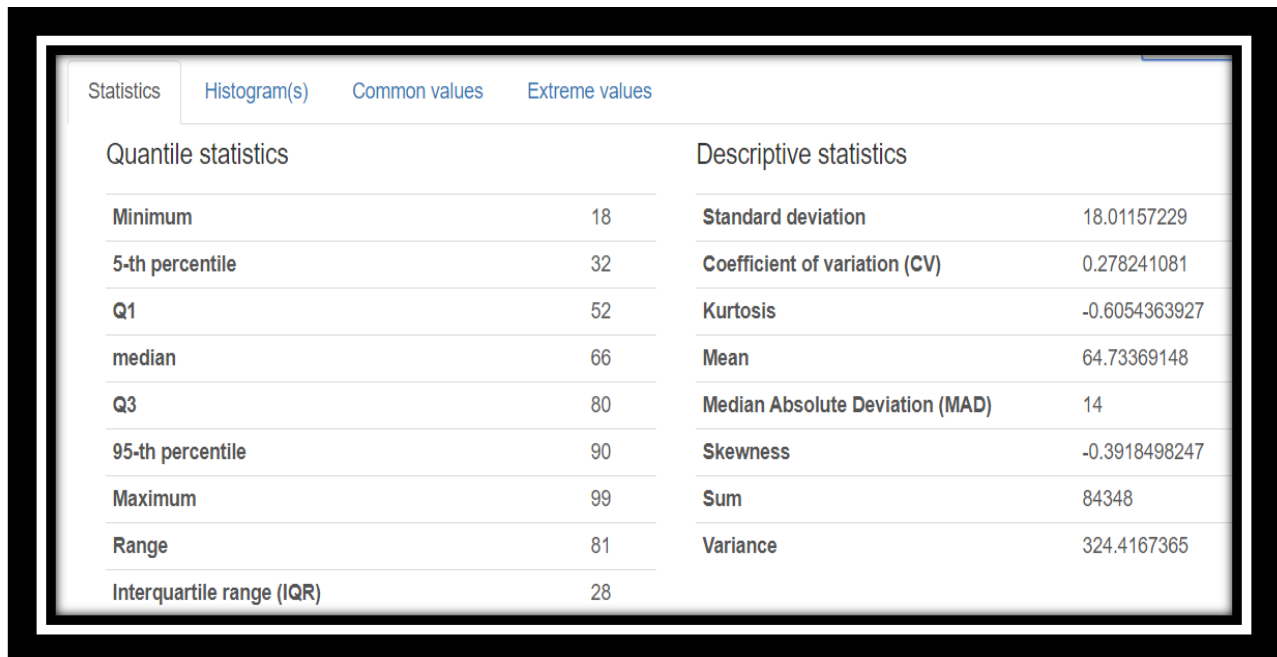


Fig 6.14: age statistics

Fig 6.10 shows histogram of age Values. On the X-axis Shows Spo2 values and on Y-axis shows number of samples.

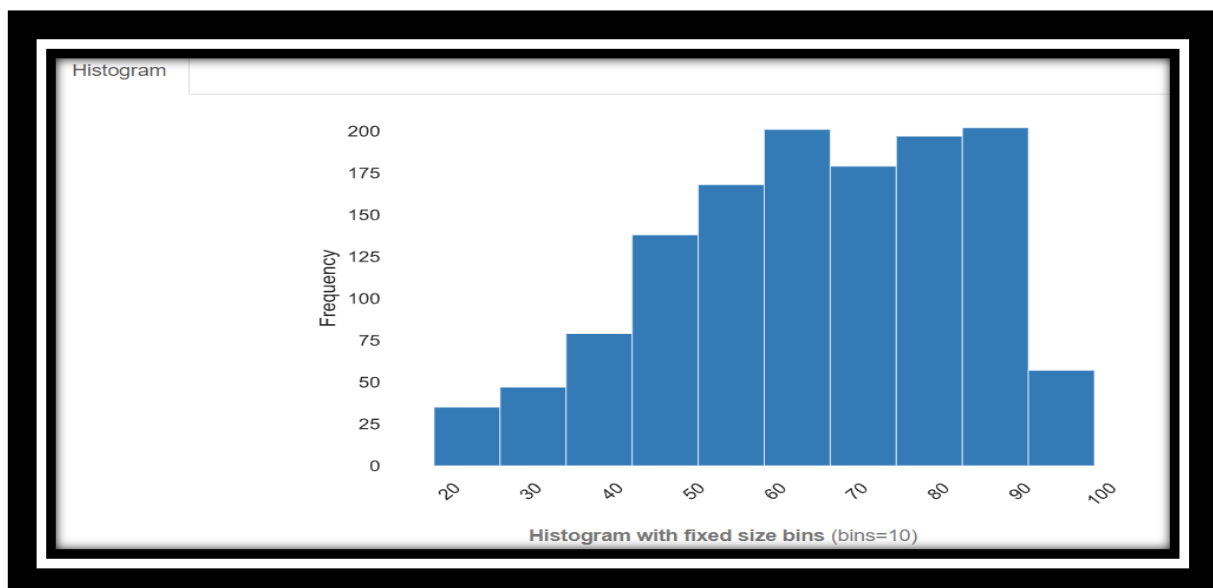


Fig 6.15: Age histogram

Fig 6.16 shows common values of Age with its percentage.

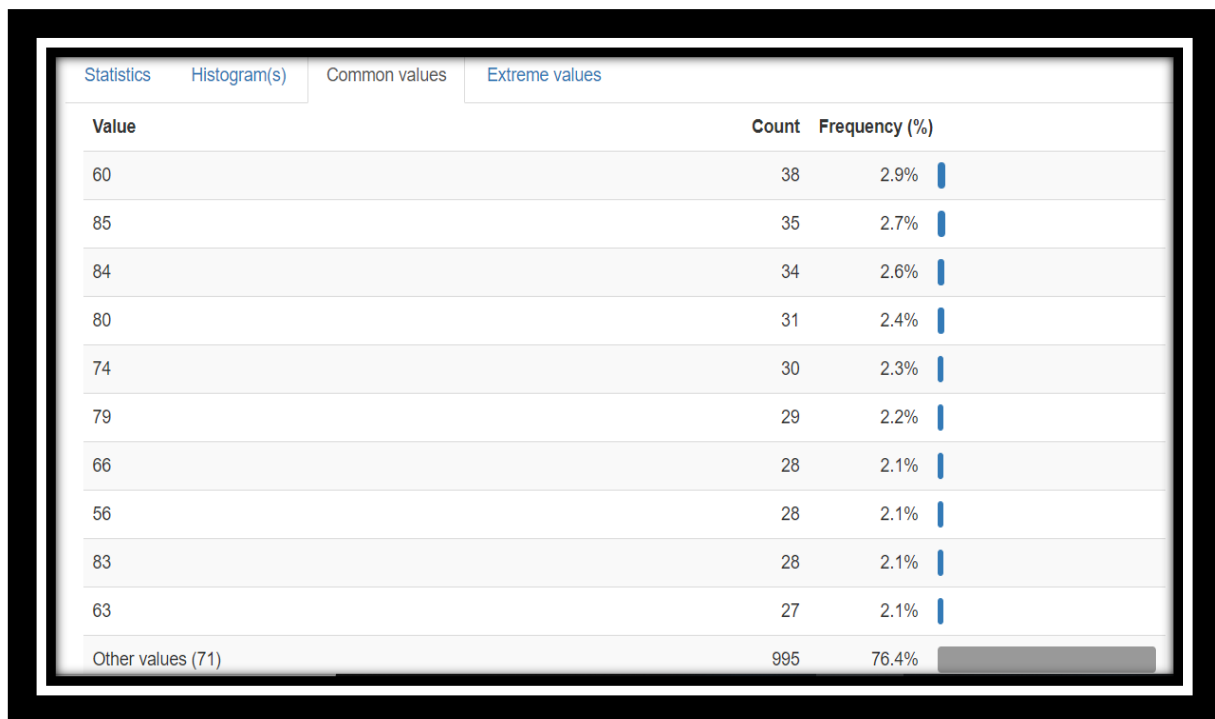


Fig 6.16: Age common values

Fig 6.17 shows common values of Age with its percentage

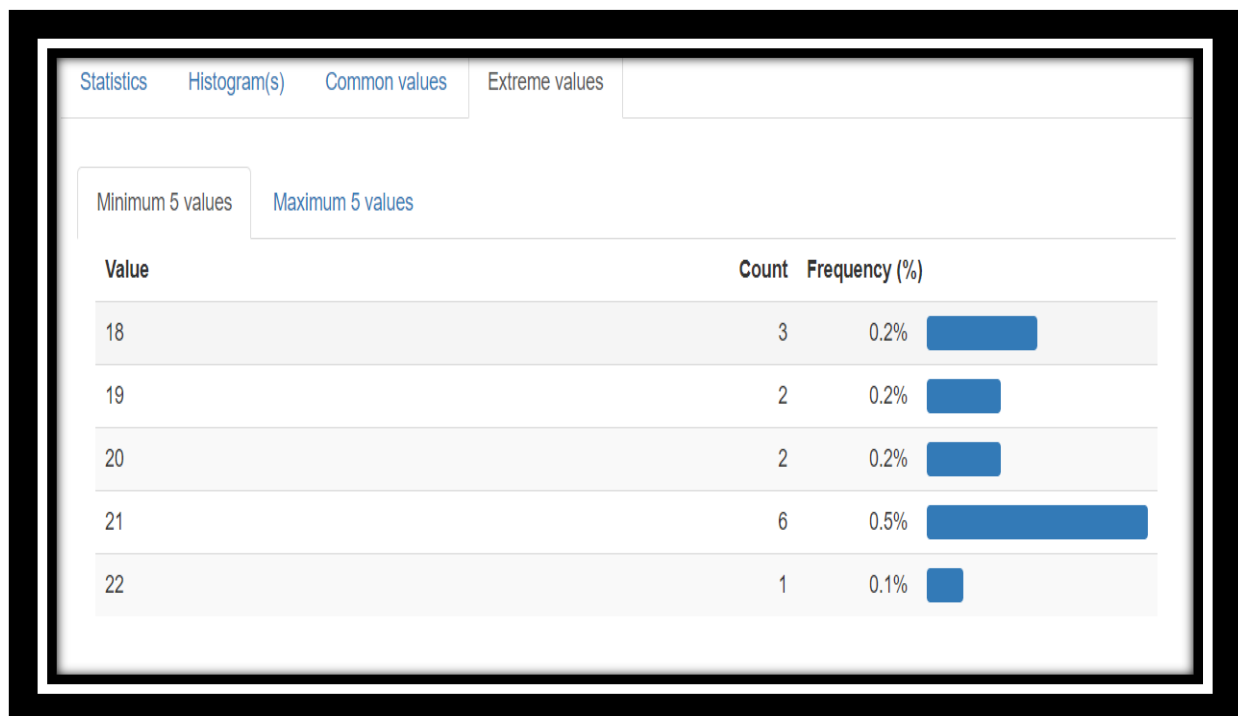


Fig 6.17: Age extreme values

Fig 6.18 shows details about health like mean, maximum, zeros, memory Size, minimum, zeros, unique, infinite, missing etc. the graph shows that HR values on X-axis and number of samples on Y-axis.

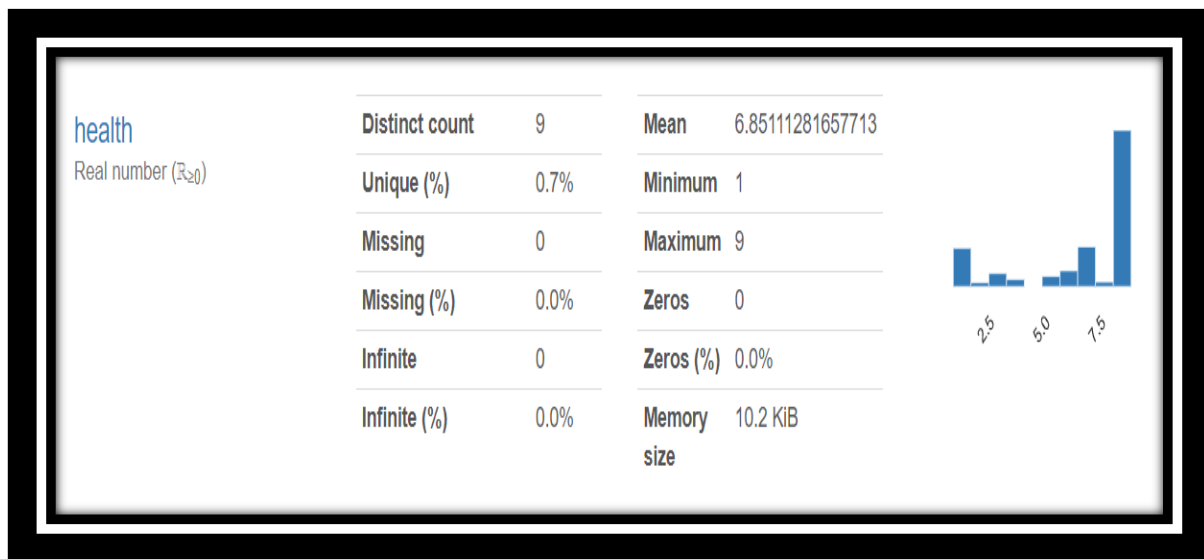


Fig 6.18: Health details

Fig 6.14 shows statistics of health like standard deviation, mean, sum, variance, skew ness, Median absolute deviation, coefficient of variation, range, Q1, Q3, kurtosis, Interquartile range etc.



Fig 6.19: health statistics

Fig 6.20 shows interaction of spo2 vs Spo2.

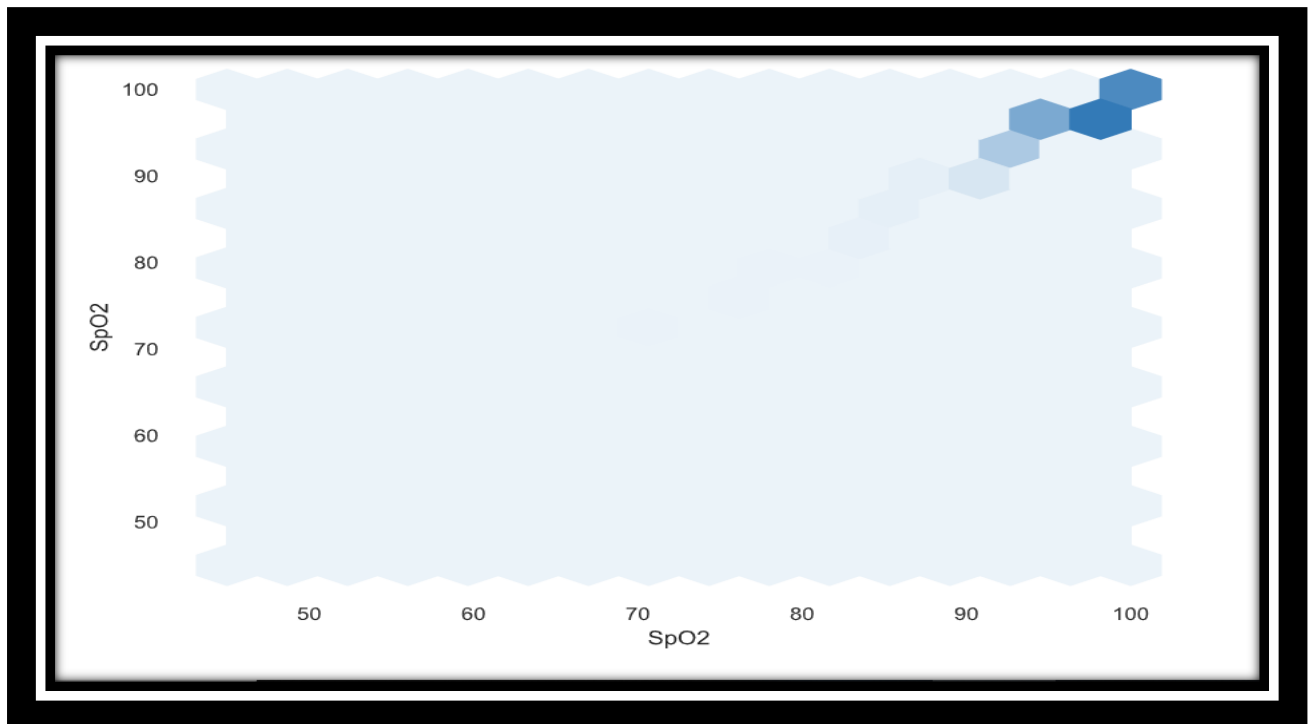


Fig 6.20:Spo2 interactions

Fig 21 show interaction Spo2 vs HR. On Y-axis shows HR values and on X-axis Shows Spo2 values.

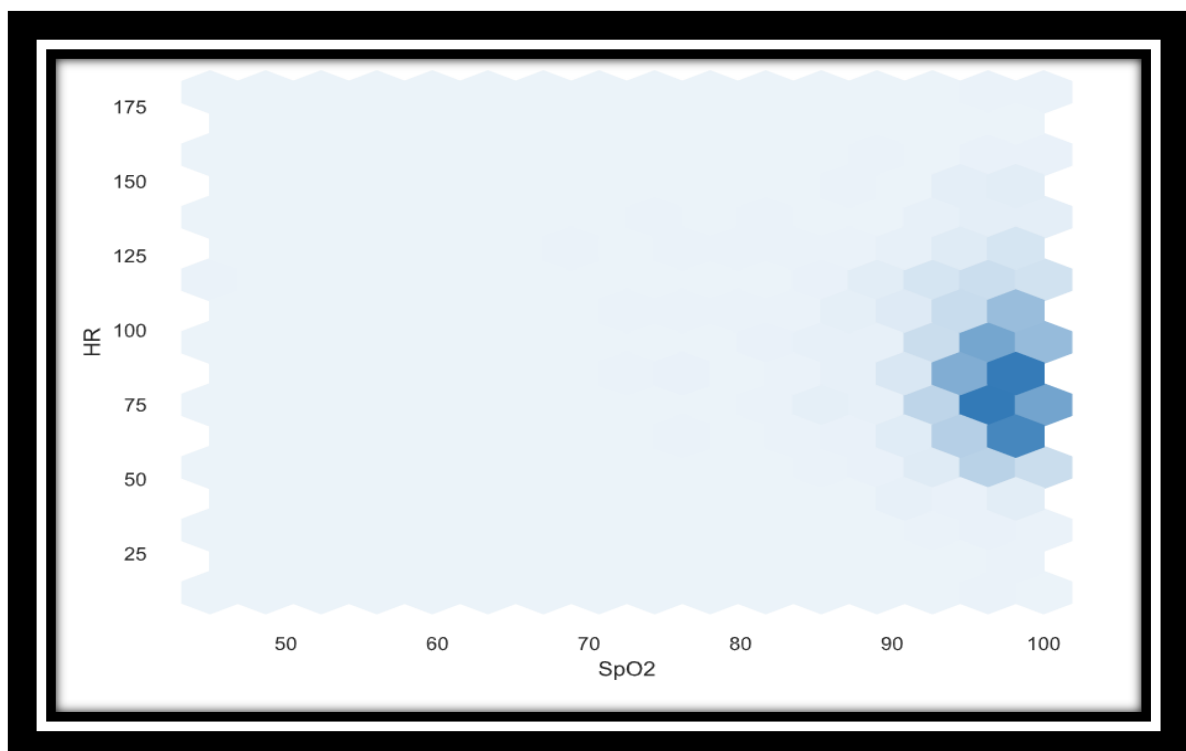


Fig 6.21:Spo2 and HR interactions

Fig 22 show interaction Spo2 vs age. On Y-axis shows age values and on X-axis Shows Spo2 values.

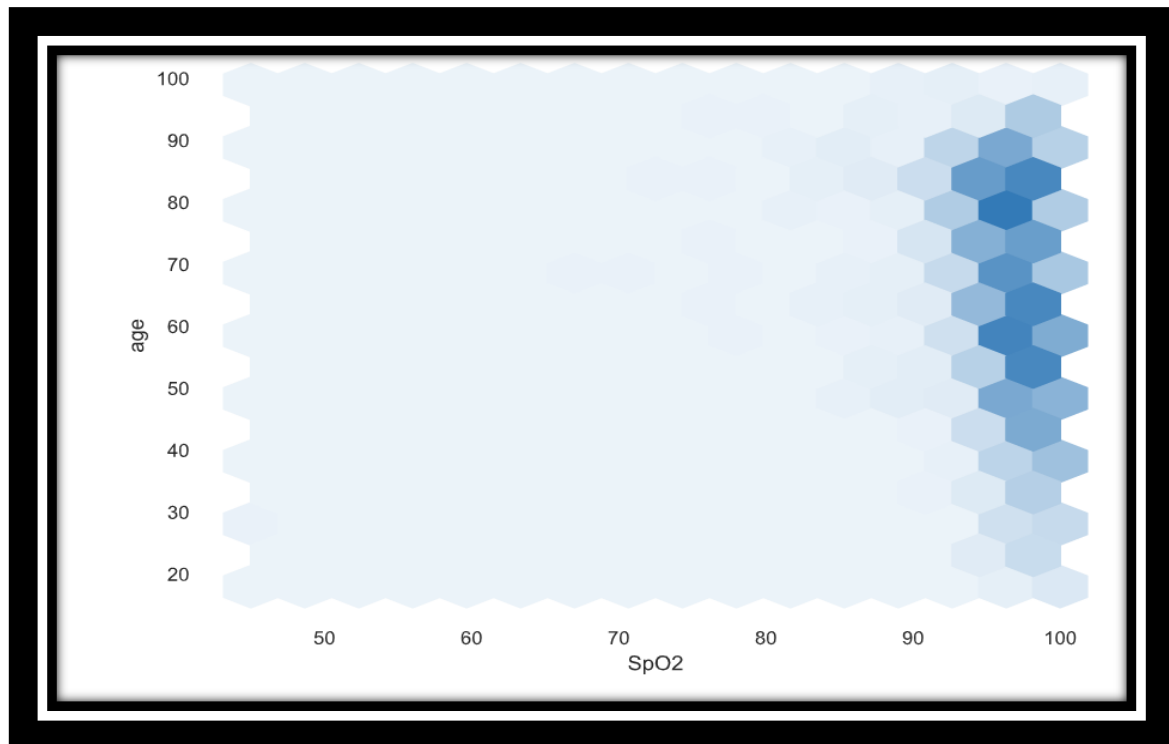


Fig 6.22: Age and Spo2 interactions

Fig 23 show interaction Spo2 vs age. On Y-axis shows health values and on X-axis Shows Spo2 values.

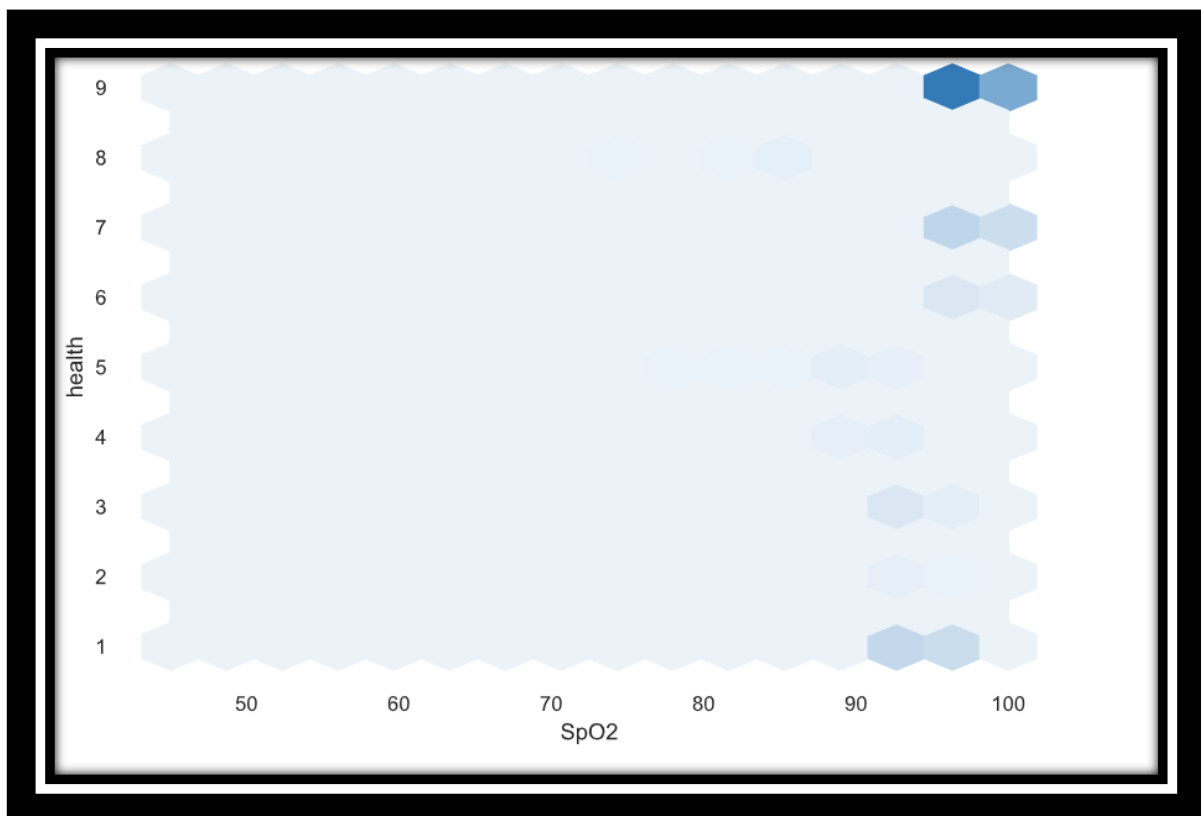


Fig 6.23: Health and Spo2 interactions

Fig 6.24: First rows values out of 1304 samples.

First rows		SpO2	HR	age	health
gender					
0	1	93	82	68	1
1	1	98	72	61	9
2	2	100	91	78	9
3	1	98	59	58	6
4	1	100	63	78	9
5	2	98	74	86	9
6	2	97	84	60	9
7	2	98	90	56	9
8	2	100	75	56	9
9	1	96	96	60	9

Fig 6.24: First rows values

Fig 6.25: Last rows values out of 1304 samples.

Last rows		SpO2	HR	age	health
gender					
1293	1	99	76	37	9
1294	2	93	130	55	3
1295	2	98	56	57	6
1296	2	97	109	63	7
1297	1	91	94	58	4
1298	2	96	70	63	9
1299	1	76	137	62	5
1300	2	72	82	81	8
1301	1	98	82	62	9
1302	2	97	76	82	9

Fig 6.25: Last rows values

Fig 6.26: Most frequent (Duplicate) values out of 1304 samples.

Most frequent		SpO2	HR	age	health	count
gender						
0	1	91	91	81	4	2
1	1	94	82	83	1	2
2	1	96	76	79	9	2
3	1	96	78	65	9	2
4	1	97	60	61	9	2
5	1	98	71	91	9	2
6	1	98	76	55	9	2
7	1	98	106	56	7	2
8	1	99	80	64	9	2
9	1	99	89	46	9	2

Fig 6.26: Duplicate values



The Figures are given above are from the report of EDA (exploratory data analysis) from the validate data set of 1304 samples. It is also called Pandas profiling Report.

## 6.2 Data analysis: Algorithms Comparison

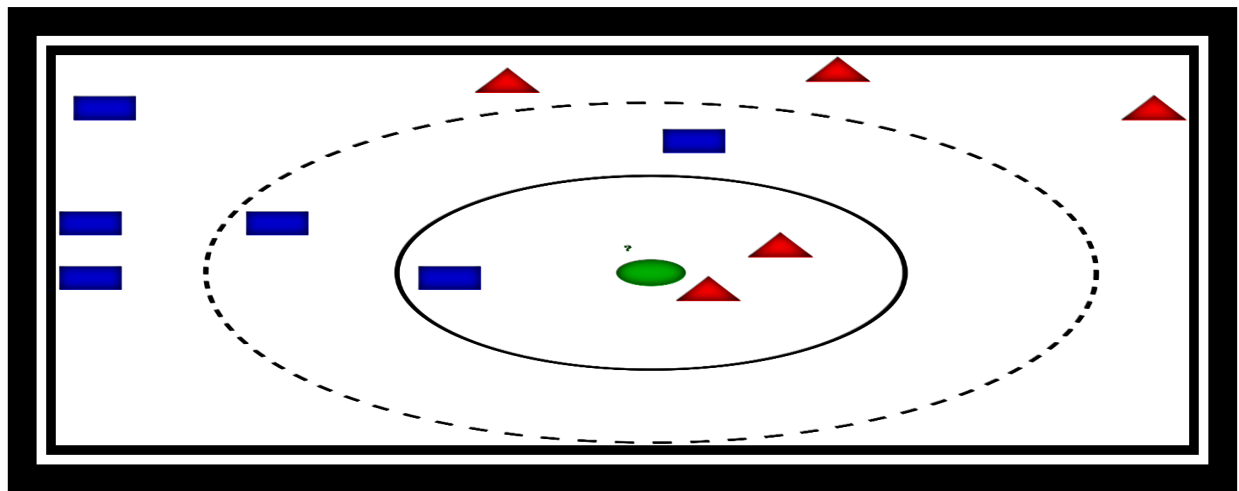
The features are in the validate data set Spo2, Gender, heart rate (HR) and age. The labels is health. The software used for performing algorithm is Jupyter Notebook. The codes are written in python language. In the validate data set 25% data was taken for testing and 75% data was taken for training. The Aim is classify the health. Three main algorithms for classification is K Nearest Neighbor, Random Forest and Decision tree. The comparison on three algorithm is shown in Table 6.1 on the parameters are MAE (mean absolute error), Average Baseline error, RMSE (root mean square error) and Accuracy.

parameters	K-nearest neighbor	Decision Tree	Random Forest
Mean absolute error	1.12	0.0	0.01
Average baseline error	57.74	57.74	57.74
Root mean square error	2.74674	0.0	0.040
Accuracy	18.46%	100%	99.81%

Table 6.1: Parameters based on Algorithms

## 6.3 K nearest neighbor (KNN):

KNN is also supervised learning algorithm. KNN is used for classification purpose. KNN is also known as lazy algorithm because it is only summarized learning process and do not learn or take its own decision itself. KNN basically identifies the data points that are separated into various classes to predict the classification of a given sample point. This predictions or classifications are done based on similarity measure. The similarity measure means KNN finds its nearest points based on Euclidean distance. The number of nearest points to find are defined by the value of K. suppose defined K value is 5, then KNN finds five nearest sample points from the test point and checks the labels of that five nearest points. KNN predicts or gives the classification output for the test sample based on the majority class of labels. For example, for  $K = 3$  and for binary classification, two labels are of same class and third is of another class. Then KNN predicts the majority class label as output class. This can be understood by showing figure below.



Sample point

Class A

Class B



Fig 6.27: KNN Algorithm

```
In [23]: # The baseline predictions are the historical averages
baseline_preds = test_features[:, feature_list.index('age')]
# Baseline errors, and display average baseline error
baseline_errors = abs(baseline_preds - test_labels)
print('Average baseline error: ', round(np.mean(baseline_errors), 2))

Average baseline error: 57.74
```

Fig 6.28: Average baseline error of KNN

```
In [34]: from sklearn.metrics import mean_squared_error
mse = mean_squared_error(test_labels, predictions)
rmse = np.sqrt(mse)

In [35]: rmse
Out[35]: 2.7464422049764807

In [36]: #testset = [[test_features]]
#predictions = [[test_labels]]
#accuracy = getAccuracy(testset, predictions)
#print(accuracy)

In [37]: mape = 100 * (errors / test_labels)
accuracy = 100 - np.mean(mape)
print('Accuracy:', round(accuracy, 2), '%.')

Accuracy: 18.46 %.
```

Fig 6.29: RMSE and Accuracy of KNN

```

In [25]: # we imported the model using sci-learn kit

# Use the forest's predict method on the test data
predictions = rf.predict(test_features)
# Calculate the absolute errors
errors = abs(predictions - test_labels)
# Print out the mean absolute error (mae)
print('Mean Absolute Error:', round(np.mean(errors), 2), '')
print(errors)
#print(n12)

Mean Absolute Error: 1.12
[0 0 0 0 3 0 0 0 0 0 0 0 8 0 0 0 0 0 0 0 0 3 0 0 7 0 0 0 0 1 0 8 0 0 0 0 1
 8 8 7 0 0 0 0 0 8 0 0 8 0 4 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 8 0 0 0 0 0 0 0
 0 0 8 0 0 8 0 0 0 0 0 0 0 8 8 1 8 0 0 0 8 0 0 0 6 0 0 0 8 0 0 2 0 0 0 0 0
 0 0 0 8 8 0 0 4 0 0 0 0 0 4 0 0 0 0 0 0 0 2 0 0 0 0 0 0 0 0 0 8 0 0 0 0 0
 0 0 0 8 0 0 4 0 0 0 0 0 0 0 0 0 0 0 0 0 3 2 0 4 4 0 4 8 0 0 0 8 0 4 0 0
 4 0 0 0 0 0 0 0 0 4 3 0 8 0 0 4 8 4 0 0 0 0 2 0 0 0 0 0 8 0 0 0 0 0 0
 0 0 0 0 0 0 0 0 0 0 4 4 0 0 0 0 0 0 0 0 4 0 0 0 0 1 0 0 8 0 0 0
 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 4 0 8 0 0 0 0 0 4 0 0 0 0 0 8
 0 8 8 0 0 3 0 0 0 0 0 0 0 0 0 0 0 0 0 8 0 8 0 2 0 8 0]

```

Fig 6.30: MAE of KNN

#### 6.4: Decision Tree (DT):

Decision tree algorithm is same as tree type structure. Decision tree algorithm is used for both the classification as well as regression problem. Decision tree algorithm mostly depends on the independent variables. Independent variables are taken as master node. This master node will have conditions over the features of the dataset. This master node has condition through which it decides on which leaf node to navigate next. Once the last leaf node is reached after satisfying all the conditions, the output is predicted. The better the sequence of conditions the better the output of algorithm. The term Information Gain is used to select the conditions in nodes. To derive the tree structure of the algorithm, a greedy, recursive based algorithm is used. as shown in FIG.6.31 the Decision will be taken based on Predicted score.

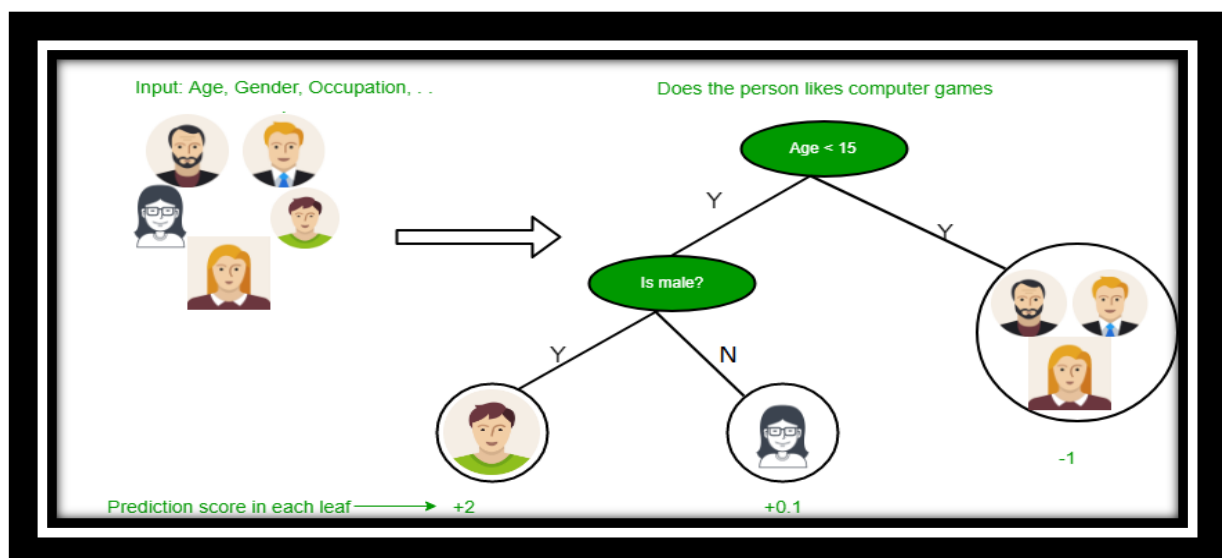


Fig 6.31: Decision Tree Algorithm

```
In [23]: # The baseline predictions are the historical averages
baseline_preds = test_features[:, feature_list.index('age')]
# Baseline errors, and display average baseline error
baseline_errors = abs(baseline_preds - test_labels)
print('Average baseline error: ', round(np.mean(baseline_errors), 2))

Average baseline error: 57.74
```

Fig 6.32: Average baseline error of Decision Tree

```
In [34]: from sklearn.metrics import mean_squared_error
mse = mean_squared_error(test_labels, predictions)
rmse = np.sqrt(mse)

In [35]: rmse

Out[35]: 0.0

In [36]: #testset = [[test_features]]
#predictions = [[test_labels]]
#accuracy = getAccuracy(testset, predictions)
#print(accuracy)

In [37]: mape = 100 * (errors / test_labels)
accuracy = 100 - np.mean(mape)
print('Accuracy:', round(accuracy, 2), '%.')

Accuracy: 100.0 %.
```

Fig 6.33: RMSE and Accuracy of Decision Tree

[illegible]

Fig 6.34: MAE of Decision Tree

### 6.5: Random Forest (RF):

Random Forest is the Machine learning algorithm that can be operate by constructing multiple decision trees. The final decision is made based on majority of the trees as shown in FIG 6.34. A decision tree is a tree-shaped diagram used to determine a course of action. Each branch of the tree represents a possible decision, occurrence, or reaction.[12]

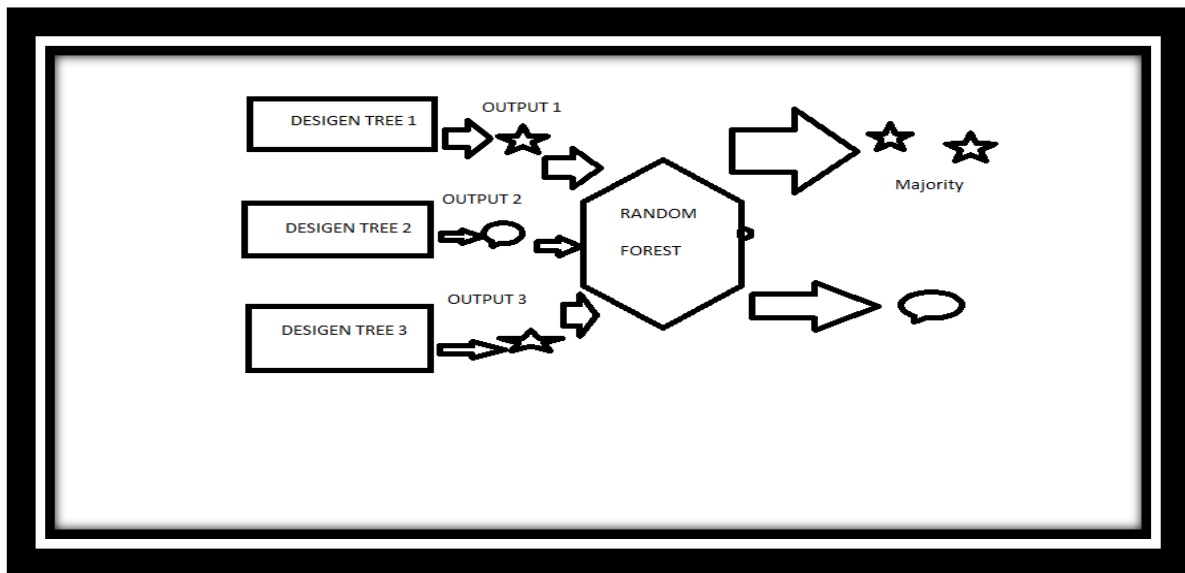


Fig 6.35: Random Forest Algorithm

```
In [23]: # The baseline predictions are the historical averages
baseline_preds = test_features[:, feature_list.index('age')]
# Baseline errors, and display average baseline error
baseline_errors = abs(baseline_preds - test_labels)
print('Average baseline error: ', round(np.mean(baseline_errors), 2))

Average baseline error: 57.74
```

Fig 6.36: Average baseline error of Random forest

```

In [34]: from sklearn.metrics import mean_squared_error
mse = mean_squared_error(test_labels, predictions)
rmse = np.sqrt(mse)

In [35]: rmse
Out[35]: 0.04017416072781169

In [36]: #testset = [[test_features]]
#predictions = [[test_labels]]
#accuracy = getAccuracy(testset, predictions)
#print(accuracy)

In [37]: mape = 100 * (errors / test_labels)
accuracy = 100 - np.mean(mape)
print('Accuracy:', round(accuracy, 2), '%.')

Accuracy: 99.81 %.

```

Fig 6.37: RMSE and Accuracy of Random forest

```

In [25]: # we imported the model using sci-learn kit

# Use the forest's predict method on the test data
predictions = rf.predict(test_features)
# Calculate the absolute errors
errors = abs(predictions - test_labels)
# Print out the mean absolute error (mae)
print('Mean Absolute Error:', round(np.mean(errors), 2), '')
print(errors)
#print(n12)

Mean Absolute Error: 0.01

```

Fig 6.38: MAE of Random forest

## Chapter 7

### Results and Conclusion

#### Results:

SPo2 & Heart rate samples of 41 different age patients have been taken for machine learning algorithm. The data has been trained under machine learning algorithm of decision tree(Jupyter Notebook) and out 41 samples , six people's health condition has been analyzed as reference as per below mentioned Table7.1 Total six Person's samples were taken with mean values of Spo2 and HR (heart rate).

The result shows the different health condition predictions after the machine learning algorithm.

Gender	Age	Spo2	HR	Health
1(MALE)	26	96	77	Normal(9)
1(MALE)	37	89	78	COPD(4)
2(FEMALE)	64	90	52	Critical condition(5)
2(FEMALE)	35	97	82	Normal(9)
1(MALE)	68	96	105	Tachycardia(7)
2(FEMALE)	52	97	54	Bradycardia(6)

TABLE 7.1: Results of Decision Tree Algorithm on Jupyter Notebook

#### Conclusion:

As Parameter shown in Comparison Table 6.1 Decision Tree Algorithm can give Better Output Then KNN (K nearest Neighbor) And Random Forest Algorithms. This device is useful in Clinical & non-clinical environment where doctor & patient can predict the health condition using the above device and methodology. This project can be enhanced in future for adding more medical Parameters.

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- [6] Garima P Gupta, Rajashree R Nair, R Jeyanthi, “An ANN based SpO2 Measurement for Clinical Management Systems”, Energy Procedia, 2017
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### Web Sites:


- [1] [https://en.wikipedia.org/wiki/Pulse\\_oximetry](https://en.wikipedia.org/wiki/Pulse_oximetry)
- [2] <https://www.ncbi.nlm.nih.gov/pmc/articles/PMC5247680/>
- [8] <https://www.amazon.in/Silicon-TechnoLabs-Alphanumeric-Display-JHD162A/dp/B00XT53RI0>
- [9] <https://www.electronicwings.com/nodemcu/introduction-to-nodemcu>
- [10] <https://datasheets.maximintegrated.com/en/ds/MAX30100.pdf>
- [11] [https://robu.in/product/iici2c-serial-interface-adapter-module/?gclid=Cj0KCQjwoaz3BRDnARIsAF1RfLfsG-hIe3ohHWYhdc2RGgp3B0dLLjb1PVY6tpAeipRlSg\\_mp7Jz8AkaAhLxEALw\\_wcB](https://robu.in/product/iici2c-serial-interface-adapter-module/?gclid=Cj0KCQjwoaz3BRDnARIsAF1RfLfsG-hIe3ohHWYhdc2RGgp3B0dLLjb1PVY6tpAeipRlSg_mp7Jz8AkaAhLxEALw_wcB)
- [12] <https://www.simplilearn.com/tutorials/machine-learning-tutorial/random-forest-algorithm>




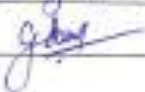


## A-Abbreviations

Acronym	Abbreviation
IOT	Internet of things
ML	Machine Learning
LR	Linear Regression
DT	Decision TREE
RF	Random Forest
ANN	Artificial Neural Network
SPO2	Saturation Percentage of oxygen
R	Ratio
IDE	Integrated Development Environment
LCD	Liquid Crystal Display
SD	Standard deviation
RMS	Root Mean Square
MSE	Mean square error
CV	Coefficient of variation
MAD	Median absolute deviation
HR	Heart rate
EDA	Exploratory data analysis

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1. Appropriateness of title with proposal. (Yes/ No) <u>Yes</u> 2. Whether the selected theme is appropriate according to the title? (Yes / No) <u>Yes</u> 3. Justify rational of proposed research. (Yes/ No) <u>Yes</u> 4. Clarity of objectives. (Yes/ No) <u>Yes</u>			
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Sr. No.	i) The appropriateness of the major highlights of work done; State here itself if work can be approved with some additional changes. ii) Main reasons for approving the work. iii) Main reasons if work is not approved.				Modification done based on Comments
1	<u>DP-1 Comments</u>				
2	Developing & Implementing algorithm for analysing data				Student has developed ML algorithm for analysed the data
<u>IR-2 Comments</u>					
	→ Insufficiency of comparison between deep learning ML algorithm				Yes, he has Insufficiency between three ML
	→ Data Validation requires for various health condition				Yes, student has validated data
	→ Data required to be communicate on cloud platform				Student has implemented program between cloud & device
					 Guide's Signature
<b>Note :</b> Above suggestions/modifications/comments must be fulfilled/accommodate by the student in DP-2		<b>Approved</b> <input checked="" type="checkbox"/> <b>Not Approved</b> <input type="checkbox"/>		Please tick on any one. If approved, then put marks ≥ 50 %.	
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Analysis address	mphcall.gtu@analysis.urkund.com

### Sources included in the report

W	URL: <a href="https://www.semanticscholar.org/paper/DESIGN-AND-IMPLEMENTATION-OF-PULSE-OKIMETER-...">https://www.semanticscholar.org/paper/DESIGN-AND-IMPLEMENTATION-OF-PULSE-OKIMETER- ...</a> Fetched: 6/22/2020 9:25:00 AM	 1
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