



Vidyayāmruthamashnuthe

BNM Institute of Technology

An Autonomous Institution under VTU



Department of Electronics & Communication Engineering

Technical Seminar

(18ECS84)

On

**Intelligent Pen for diagnosing early stage symptoms of
Parkinson's disease**

SHISHEER S KAUSHIK

1BG18EC127

Project Guide:

Dr. Rekha P

(Assistant Professor, Dept of ECE, BNMIT)

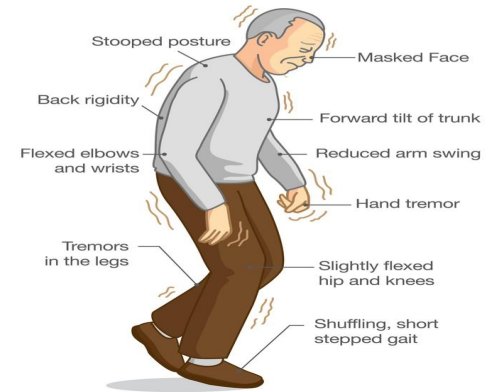
What is Parkinson's Disease?

Parkinson's disease (PD) is a neurodegenerative disorder that affects multiple regions of the brain and autonomic nervous system

- Loss of dopamine-producing cells in the brain produces the most well-known symptoms of tremor, slowness, stiffness and problems with walking and balance
- Symptoms generally develop slowly over years
- Its cause remains largely unknown; although there is no cure, many highly effective symptomatic treatment options exist



Parkinson's Disease Symptoms



Objective

- Capable of detecting standards and deviations on individuals' handwritings, such as tremors, orientation, and speed.
- Usage of an affordable and handier solution than others offered in the market, mainly for faraway places and undeveloped towns.

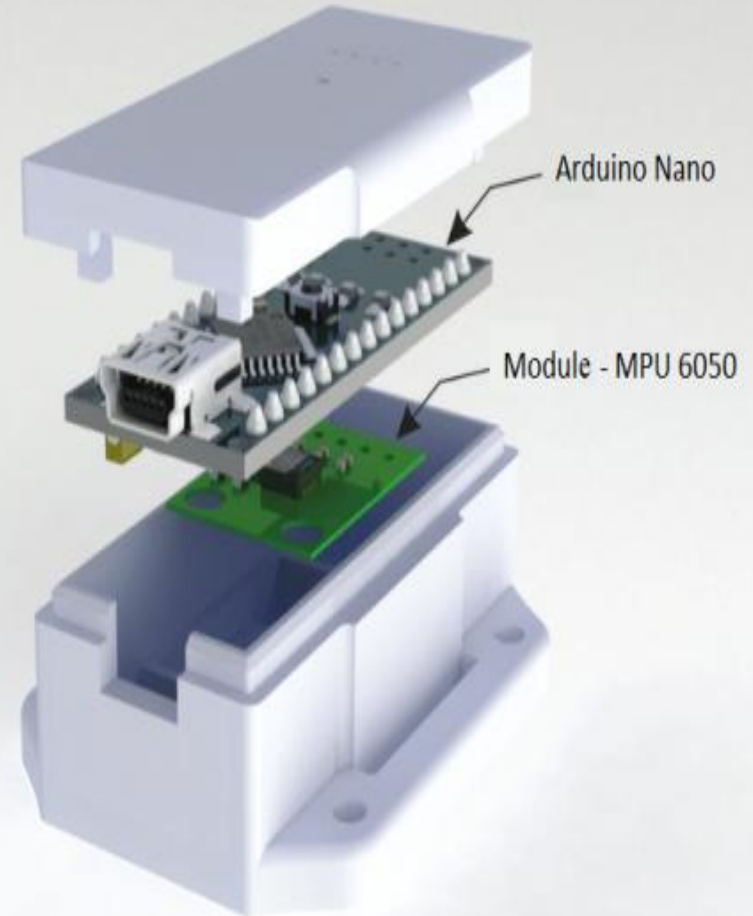


Literature survey

Title of the paper and year	Specifications & Methodology	Applications	Authors
[1] "Feature selection for classification based on fine motor signs of Parkinson's disease"	To classify the handwriting patterns of PD's patients by analyzing their biometric data	<ol style="list-style-type: none"> 1. Biometric Data collection (PD) 2. Finger Pressure monitoring 3. Pen accelerations 	<ol style="list-style-type: none"> 1. Brewer, B.R. 2. Pradhan, S
[2] "Handwritten dynamics assessment through convolutional neural networks: An application to Parkinson's disease identification".	Biometric Smart Pen (BiSP), a smart biometric pen system for recording and analyzing handwriting, drawing, and gesture movements on a paper pad or free in space	<ol style="list-style-type: none"> 1. Biometric Security Monitoring system 2. Forensic Handwriting Analysis 	<ol style="list-style-type: none"> 1. Silke A.T Weber 2. Pereira, D.R

Title of the paper and year	Specification & Methodology	Application	Authors
[3] “A survey on computer-assisted Parkinson’s disease diagnosis”.	Image signal analysis and motor exams, such as handwriting tests	These tests have been the center of numerous research works that focus on applying ML techniques to improve and facilitate diagnosis’ results.	<ol style="list-style-type: none"> 1. Pereira, C.R 2. de Albuquerque 3. Weber, S.A
[4] “Contribution of different handwriting modalities to differential diagnosis of Parkinson’s disease”.	Classification would consider the unique characteristics in hand motions of each person’s calligraphy, such as entropy, applied pressure when writing, and spent energy to realize their hand movements.	Using an ML algorithm called Support Vector Machines-Radial Basis Function (SVM-RBF), this classification correctly predicted 90% of the subjects’ diagnoses	<ol style="list-style-type: none"> 1. Rektorová, I 2. Drotár, P 3. Mekyska, J

The Intelligent Pen Prototype {Electronic Device}



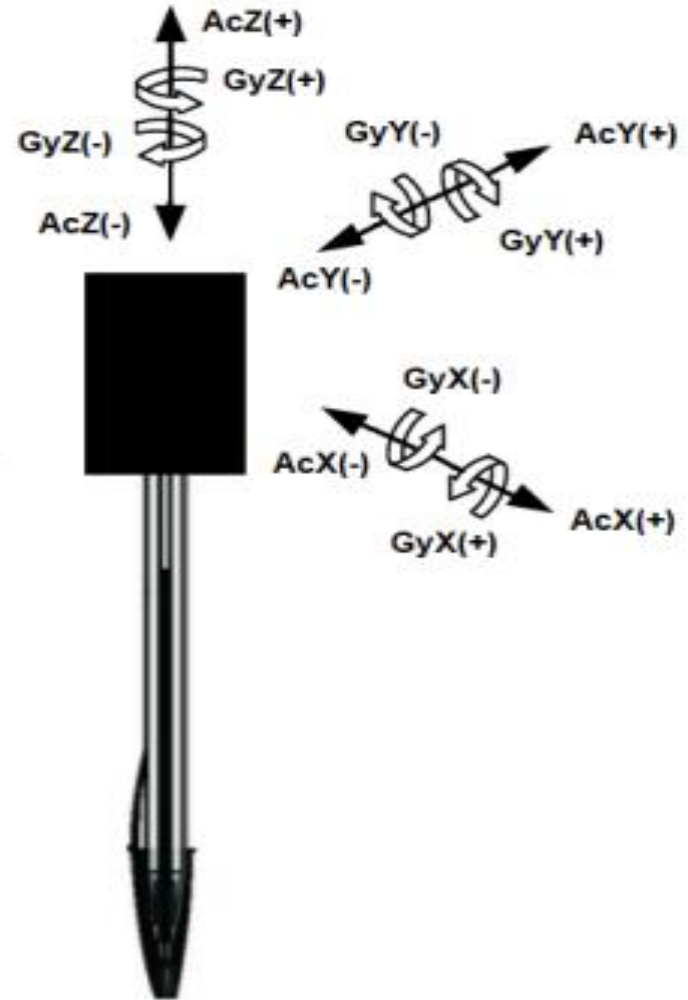
Sensors positioning and degrees of freedom (DOF) of the electronic device

Ac = Accelerometer

Gy = Gyroscope

(+) = Positive motion signal

(-) = Negative motion signal



System Setup for test by Parkinson's victim





FUNDAÇÃO EDSON QUEIROZ
UNIVERSIDADE DE FORTALEZA
ENSINANDO E APRENDENDO

POST GRADUATE PROGRAM IN APPLIED INFORMATICS
APPLIED INFORMATICS MASTERS

DATA COLLECT FORM

IDENTIFICATION: P0033, AGE: 71, DOMINATING HAND: ☒ right () left, DATE: 1/1

1 - Draw circle 10 times on the same spot non-stop

- Draw circle in the air 10 times non-stop



2 - Draw spiral from the inside out



3 - Draw meander from the inside out



4 - Diadochokinesis - Right hand for 10 seconds

5 - Diadochokinesis - Left hand for 10 seconds

observations:

Medicação 12:30; 15:40; 18:35
05:40

An example of the test applied {Data Collection Form}

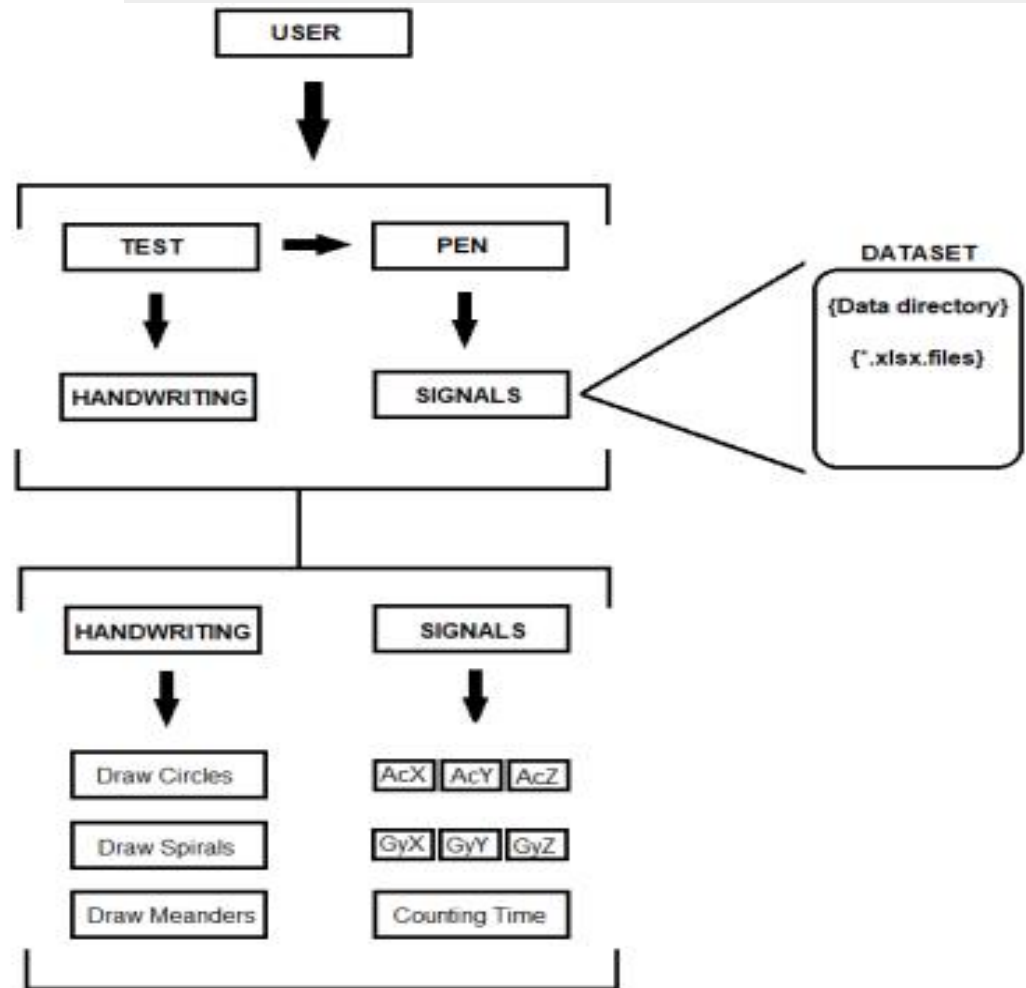
Circle

Spiral

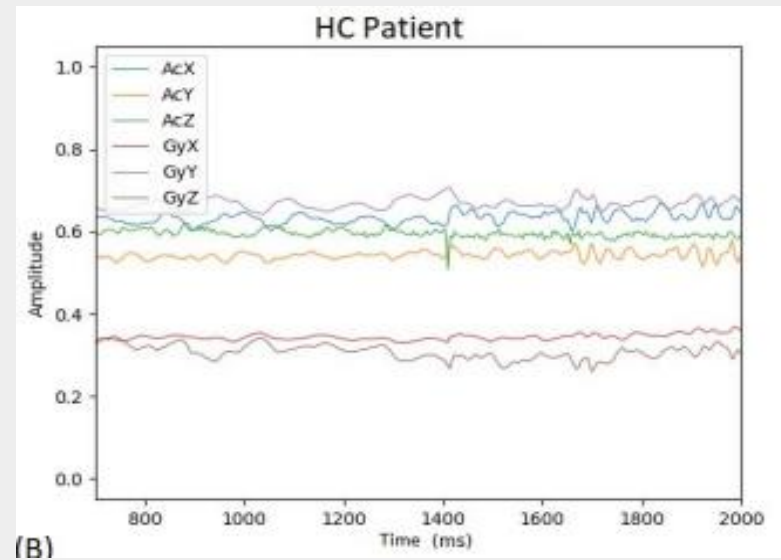
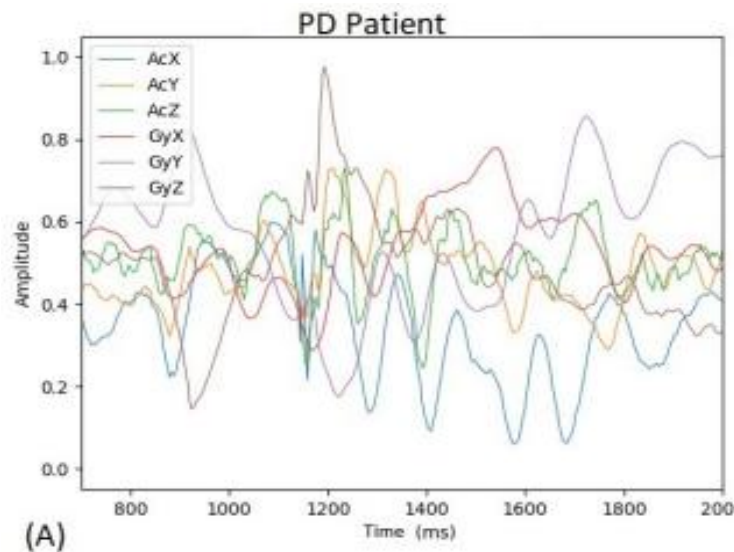
Meander

Diadochokinesis

The architecture of the modeled system



Comparison signal acquired from the sensors of {PD & HC} patient



Data Pre-Processing and ML

Classification task

- 1) Linear Discriminant Analysis (LDA)
- 2) Logistic Regression (LR)
- 3) Classification and regression Trees (CART)
- 4) K-Nearest Neighbours (KNN)
- 5) Support Vector Machines (SVM)
- 6) Naive Bayes (NB)

Evaluation method

- 1) Accuracy
- 2) Precision
- 3) Recall
- 4) F1-Score

Confusion Matrix {Syntax}

		ACTUAL VALUES	
		POSITIVE	NEGATIVE
PREDICTED VALUES	POSITIVE	TP (30)	FP (30)
	NEGATIVE	FN (10)	TN (930)

Sick people correctly predicted as sick by the model

Healthy people incorrectly predicted as sick by the model

Sick people incorrectly predicted as not sick by the model

Healthy people correctly predicted as not sick by the model

Results were analyzed individually, as new datasets,
for each performed task

- 1) Circle dataset
- 2) Air-Circle dataset
- 3) Spiral dataset
- 4) Meander dataset
- 5) Diadochokinesis dataset

All datasets were split into
two categories, i.e., training
and testing, being 75% and
25% for the first and
second, respectively

Circle Dataset

CART classifier {best(a+g)}

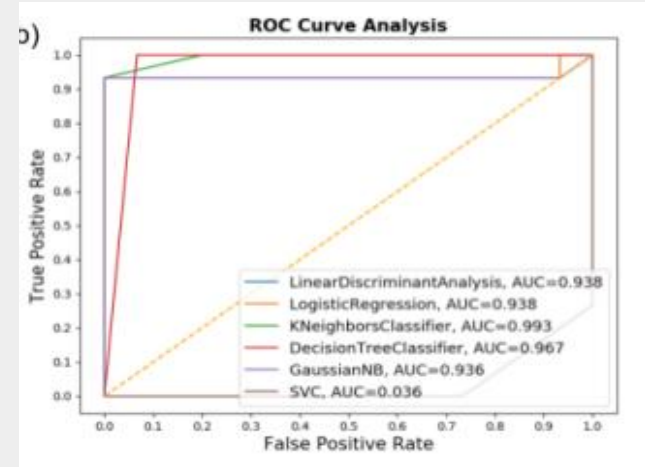
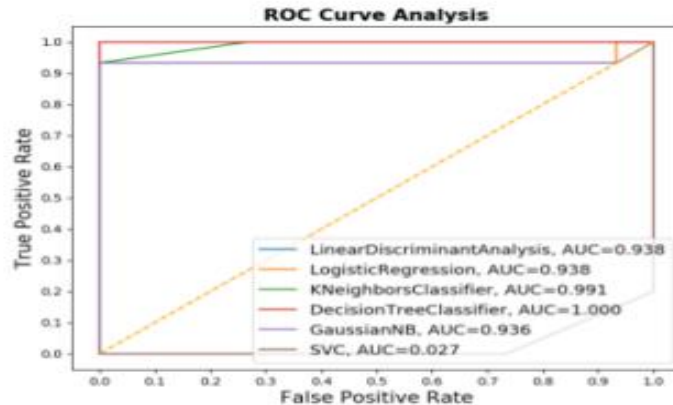
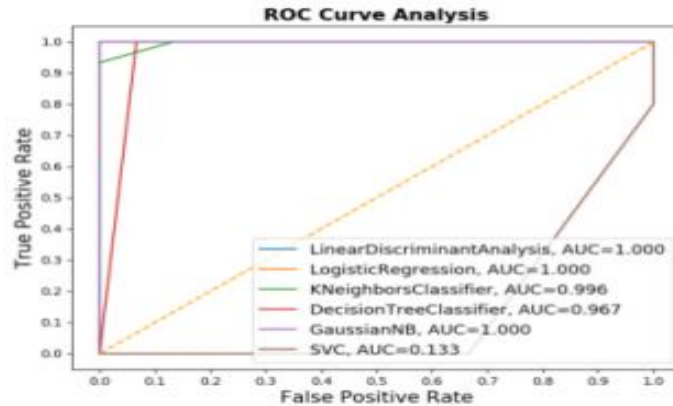
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Accuracy: 100% for both groups
Precision: 100% for both groups
Recall: 100% for both groups
F1-Score: 100% for both groups

SVM Classifier {worst(ao)}

Accuracy: 53.33%
F1-Score: 12.50%

Receiver Operating Characteristic (Circle-dataset)



AUC values above 0.9

Air-Circle Dataset

	CART	KNN	LDA	LR	NB	SVM																																																						
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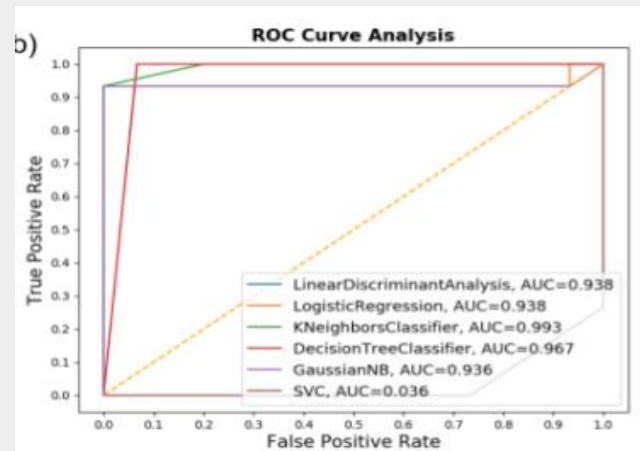
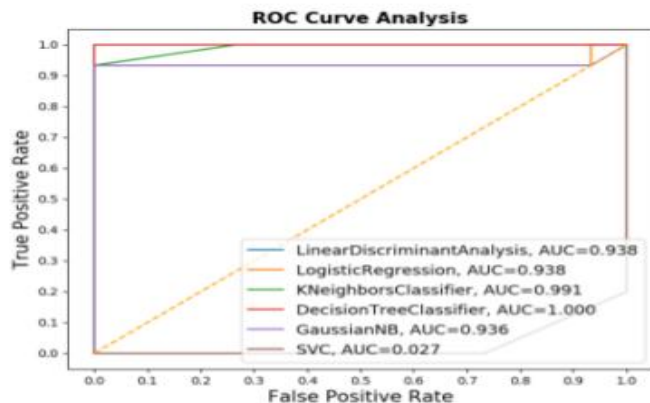
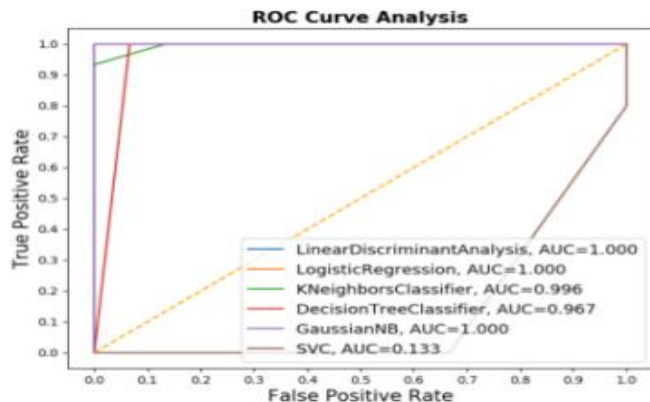
LR classifier {best(all)}

Accuracy: 100% for both groups
Precision: 100% for both groups
Recall: 100% for both groups
F1-Score: 100% for both groups

SVM Classifier {worst(go)}

Accuracy: 66.67%
F1-Score: 75.0%

Receiver Operating Characteristic (Air-Circle-dataset)



AUC values above 0.9

Spiral Dataset

CART classifier {best(ao)}

	CART	KNN	LDA	LR	NB	SVM																																																						
(a)	<table><tr><td>Predict HC</td><td>14</td><td>1</td></tr><tr><td>Predict PD</td><td>5</td><td>10</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	14	1	Predict PD	5	10	True	HC	PD	<table><tr><td>Predict HC</td><td>12</td><td>3</td></tr><tr><td>Predict PD</td><td>7</td><td>8</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	12	3	Predict PD	7	8	True	HC	PD	<table><tr><td>Predict HC</td><td>12</td><td>3</td></tr><tr><td>Predict PD</td><td>7</td><td>8</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	12	3	Predict PD	7	8	True	HC	PD	<table><tr><td>Predict HC</td><td>12</td><td>3</td></tr><tr><td>Predict PD</td><td>7</td><td>8</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	12	3	Predict PD	7	8	True	HC	PD	<table><tr><td>Predict HC</td><td>12</td><td>3</td></tr><tr><td>Predict PD</td><td>6</td><td>9</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	12	3	Predict PD	6	9	True	HC	PD	<table><tr><td>Predict HC</td><td>0</td><td>15</td></tr><tr><td>Predict PD</td><td>0</td><td>15</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	0	15	Predict PD	0	15	True	HC	PD
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(b)	<table><tr><td>Predict HC</td><td>11</td><td>4</td></tr><tr><td>Predict PD</td><td>6</td><td>9</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	11	4	Predict PD	6	9	True	HC	PD	<table><tr><td>Predict HC</td><td>11</td><td>4</td></tr><tr><td>Predict PD</td><td>7</td><td>8</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	11	4	Predict PD	7	8	True	HC	PD	<table><tr><td>Predict HC</td><td>12</td><td>3</td></tr><tr><td>Predict PD</td><td>8</td><td>7</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	12	3	Predict PD	8	7	True	HC	PD	<table><tr><td>Predict HC</td><td>12</td><td>3</td></tr><tr><td>Predict PD</td><td>7</td><td>8</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	12	3	Predict PD	7	8	True	HC	PD	<table><tr><td>Predict HC</td><td>11</td><td>4</td></tr><tr><td>Predict PD</td><td>6</td><td>9</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	11	4	Predict PD	6	9	True	HC	PD	<table><tr><td>Predict HC</td><td>0</td><td>15</td></tr><tr><td>Predict PD</td><td>1</td><td>14</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	0	15	Predict PD	1	14	True	HC	PD
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(c)	<table><tr><td>Predict HC</td><td>11</td><td>4</td></tr><tr><td>Predict PD</td><td>5</td><td>10</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	11	4	Predict PD	5	10	True	HC	PD	<table><tr><td>Predict HC</td><td>11</td><td>4</td></tr><tr><td>Predict PD</td><td>7</td><td>8</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	11	4	Predict PD	7	8	True	HC	PD	<table><tr><td>Predict HC</td><td>12</td><td>3</td></tr><tr><td>Predict PD</td><td>8</td><td>7</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	12	3	Predict PD	8	7	True	HC	PD	<table><tr><td>Predict HC</td><td>12</td><td>3</td></tr><tr><td>Predict PD</td><td>7</td><td>8</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	12	3	Predict PD	7	8	True	HC	PD	<table><tr><td>Predict HC</td><td>11</td><td>4</td></tr><tr><td>Predict PD</td><td>5</td><td>10</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	11	4	Predict PD	5	10	True	HC	PD	<table><tr><td>Predict HC</td><td>2</td><td>13</td></tr><tr><td>Predict PD</td><td>0</td><td>15</td></tr><tr><td>True</td><td>HC</td><td>PD</td></tr></table>	Predict HC	2	13	Predict PD	0	15	True	HC	PD
Predict HC	11	4																																																										
Predict PD	5	10																																																										
True	HC	PD																																																										
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True	HC	PD																																																										
Predict HC	2	13																																																										
Predict PD	0	15																																																										
True	HC	PD																																																										

Accuracy: 80% for both groups

Precision: 90.90% for PD and 73.68% for HC

Recall: 66.67% for PD and 93.33% for HC

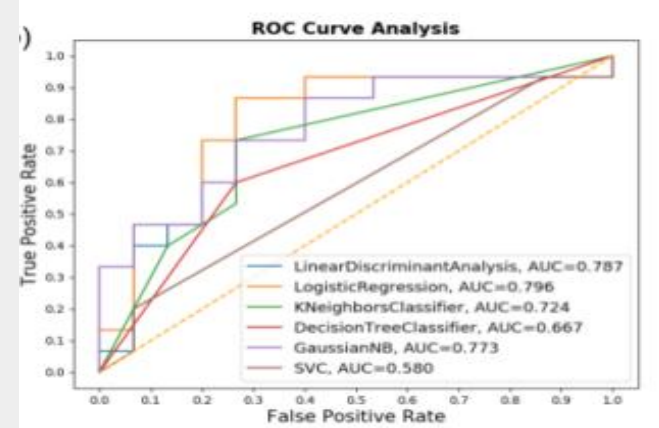
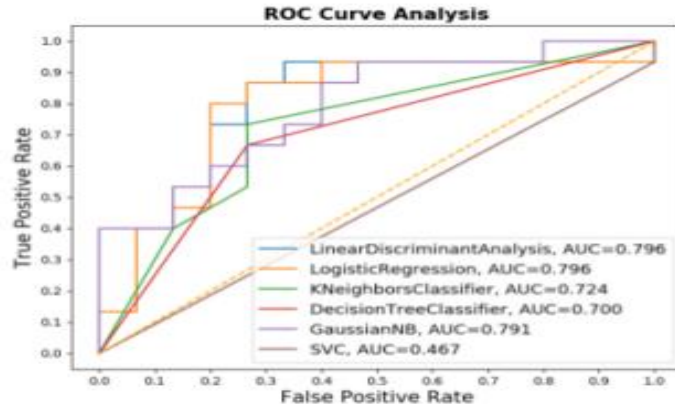
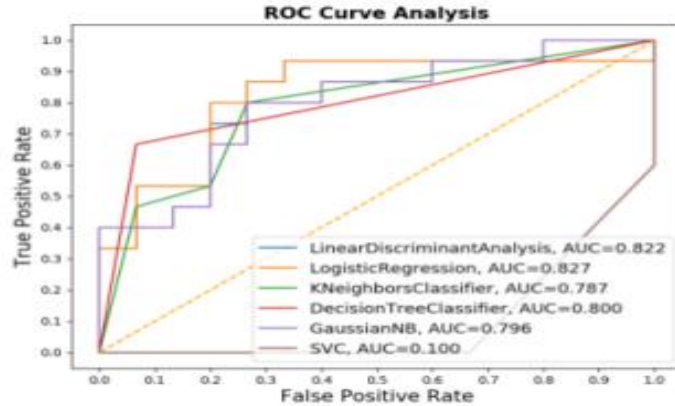
F1-Score: 76.92% for PD and 82.23% for HC

SVM Classifier {worst(a+g)}

Accuracy: 46.67%

F1-Score: 23.53%

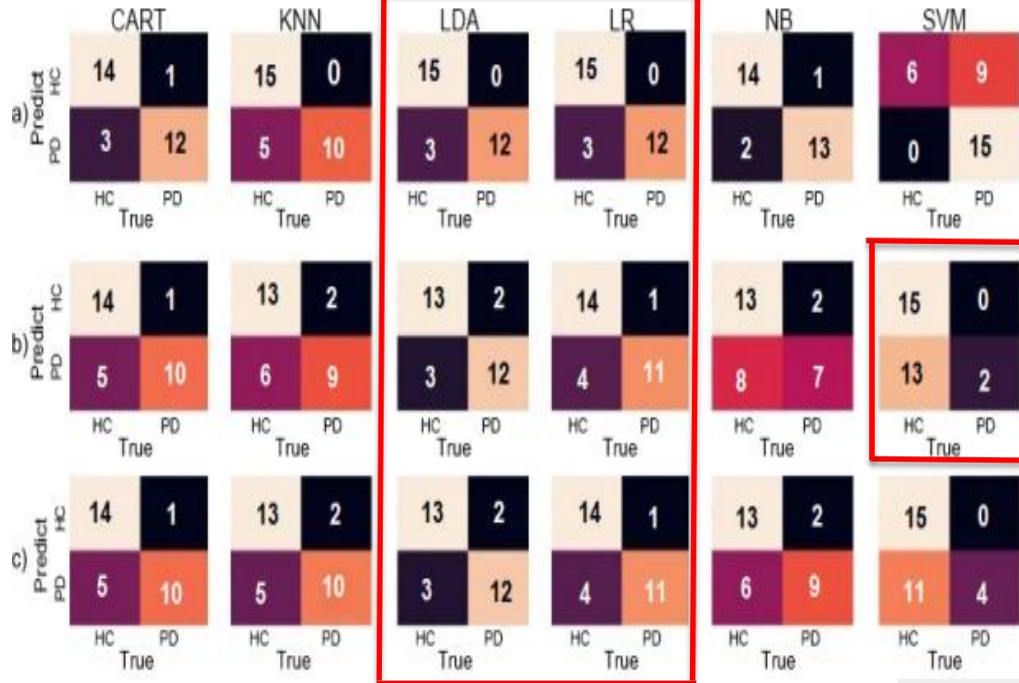
Receiver Operating Characteristic (Spiral-dataset)



AUC values below 0.8
AUC above 0.9 {paired
CART}

Meander Dataset

LDA & LR classifier
{best(ao)}

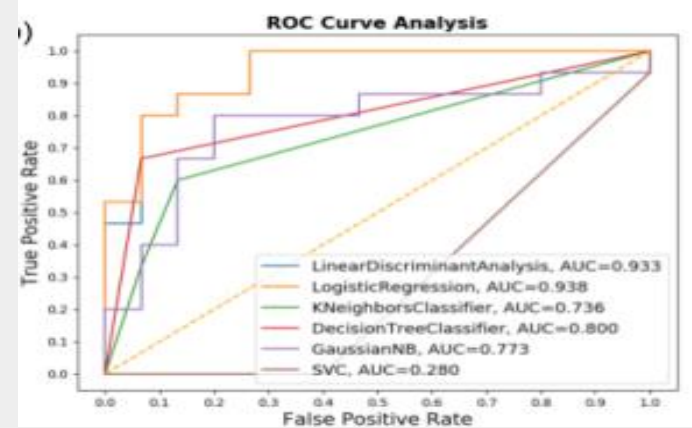
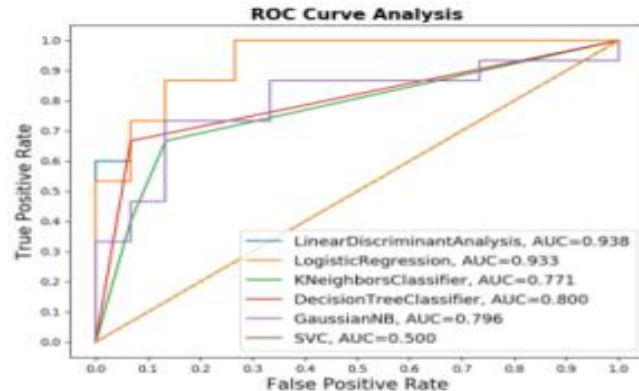
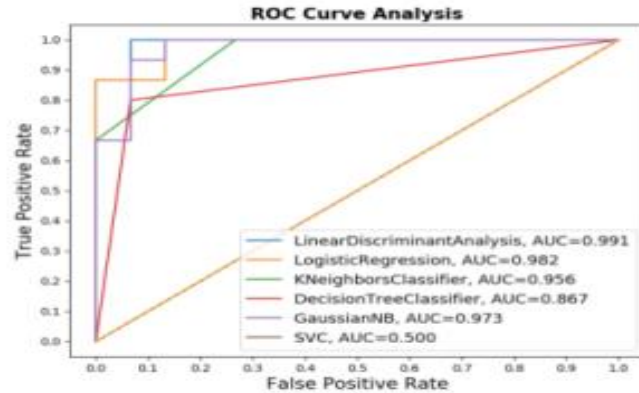


Accuracy: 90% for both groups
Precision: 100% for PD and 83.33% for HC
Recall: 80% for PD and 100% for HC
F1-Score: : 88.89% for PD and 90.91% for HC

SVM Classifier {worst(go)}

Accuracy: 56.67%
F1-Score: 23.53%

Receiver Operating Characteristic (Meander-dataset)



AUC values above 0.99
{ao}

Conclusion and Future Work

- Capable of detecting standards and deviations on individuals' handwritings, such as tremors, orientation, and speed.
- Some limitations, i.e., the sensor's disposition, were responsible for 'noisy' data and higher deviation in specific tasks than others.
- Usage of an affordable and handier solution than others offered in the market, mainly for faraway places and undeveloped towns.
- As future works, the device can be further developed to process the diagnoses and classification by its own, using built-in hardware, as well as allowing the interconnection between multiple devices and the internet for IoT related purposes.



THANK YOU



Vidyayāmṛtamashnūthe

B.N.M. Institute of Technology