

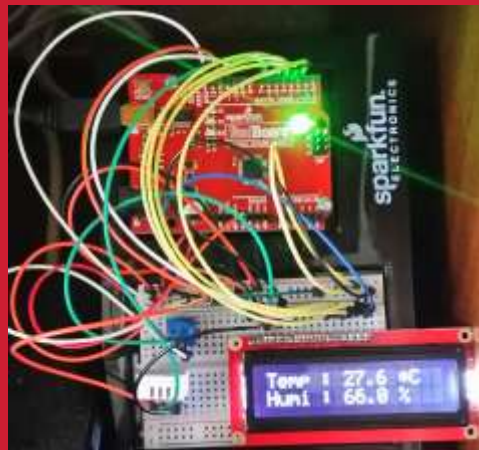


Arduino-IoT

[wk13]

nano33 BLE sensor

Gesture, Motion



Visualization of Signals using Arduino,
Node.js & storing signals in MongoDB
& mining iot data using Python



Drone-IoT-Comsi, INJE University

2nd semester, 2022

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My ID

ID를 확인하고 github에 repo 만들기

AA01	강대진	AA13	박제홍
		AA14	심준혁
AA03	김성우	AA15	이상혁
AA04	김정현	AA16	이승무
		AA17	이승준
AA06	김창연	AA18	이준희
AA07	김창욱	AA19	이현준
AA08	김태화	AA20	임태형
AA09	남승현	AA21	정동현
AA10	류재환		
AA11	박세훈	AA23	정희서
AA12	박신영	AA24	최재형

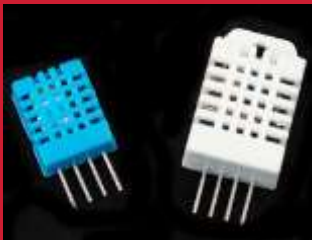
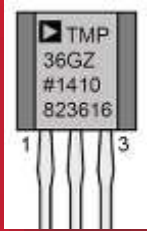
위의 id를 이용해서 github에 repo를 만드시오.

Option: 아두이노응용 실습 과제 - AAnn

Public, README.md check



[Practice]



◆ [wk12]

- IoT Project: nano33ble
- Multi-sensor circuits
- Complete your project
- Upload folder: aann-rpt12
- Use repo “aann” in github

wk12 : Practice : aann-rpt12

◆ [Target of this week]

- Complete your works
- Save your outcomes and upload outputs in github

제출폴더명 : **aann-rpt12**

제출할 파일들

- ① **iot_nano33_csv.ipynb** in data_mining folder
- ② **iot_nano33_json.ipynb** in data_mining folder
- ③ **All *.js** in nano33 folder
- ④ **public/All *.html**
- ⑤ **aann_lot33_1000.csv** in public/data folder

Purpose of AA

주요 수업 목표는 다음과 같다.

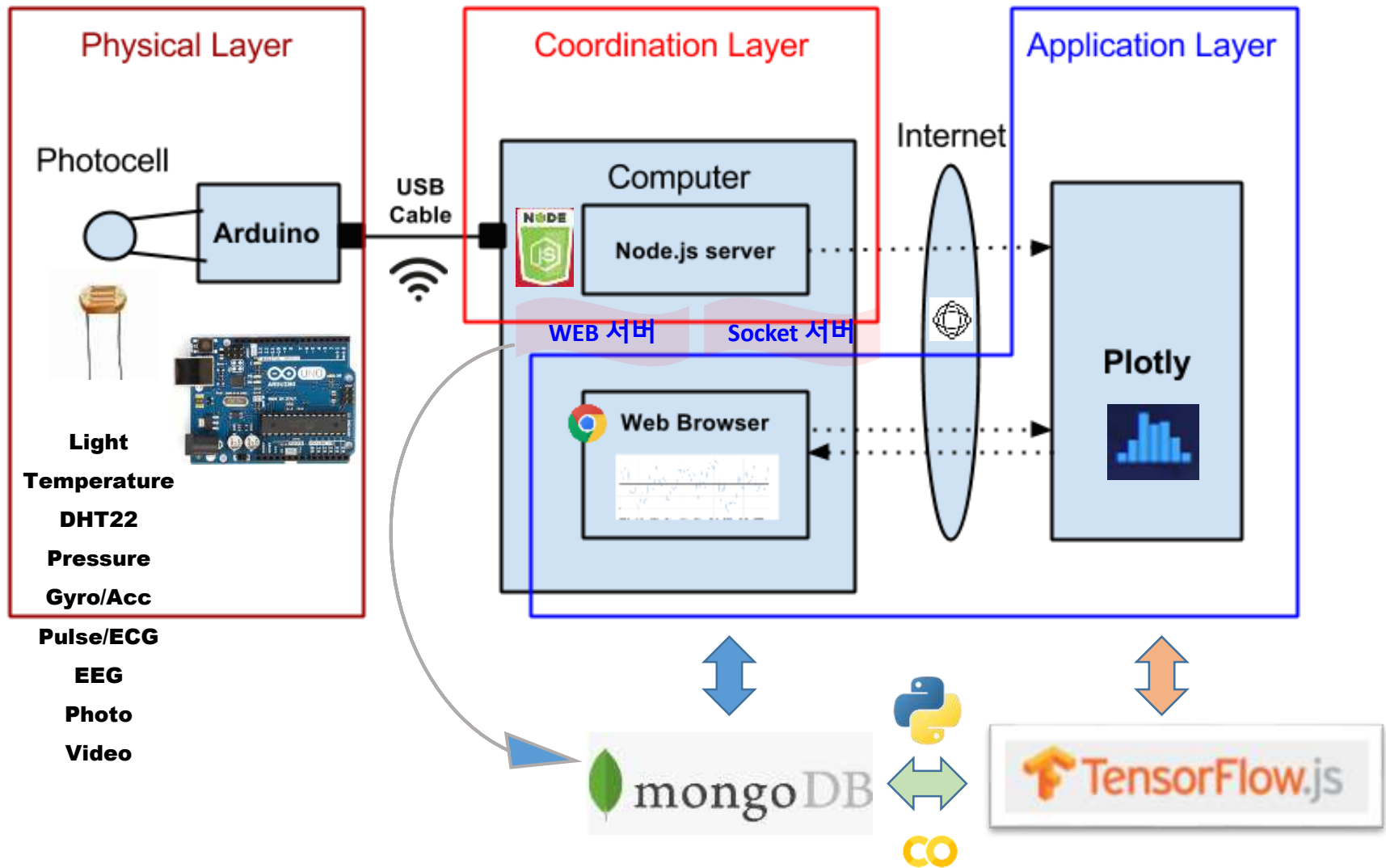
1. Node.js를 이용한 아두이노 센서 신호 처리
2. Plotly.js를 이용한 아두이노 센서 신호 시각화
3. MongoDB에 아두이노 센서 데이터 저장 및 처리

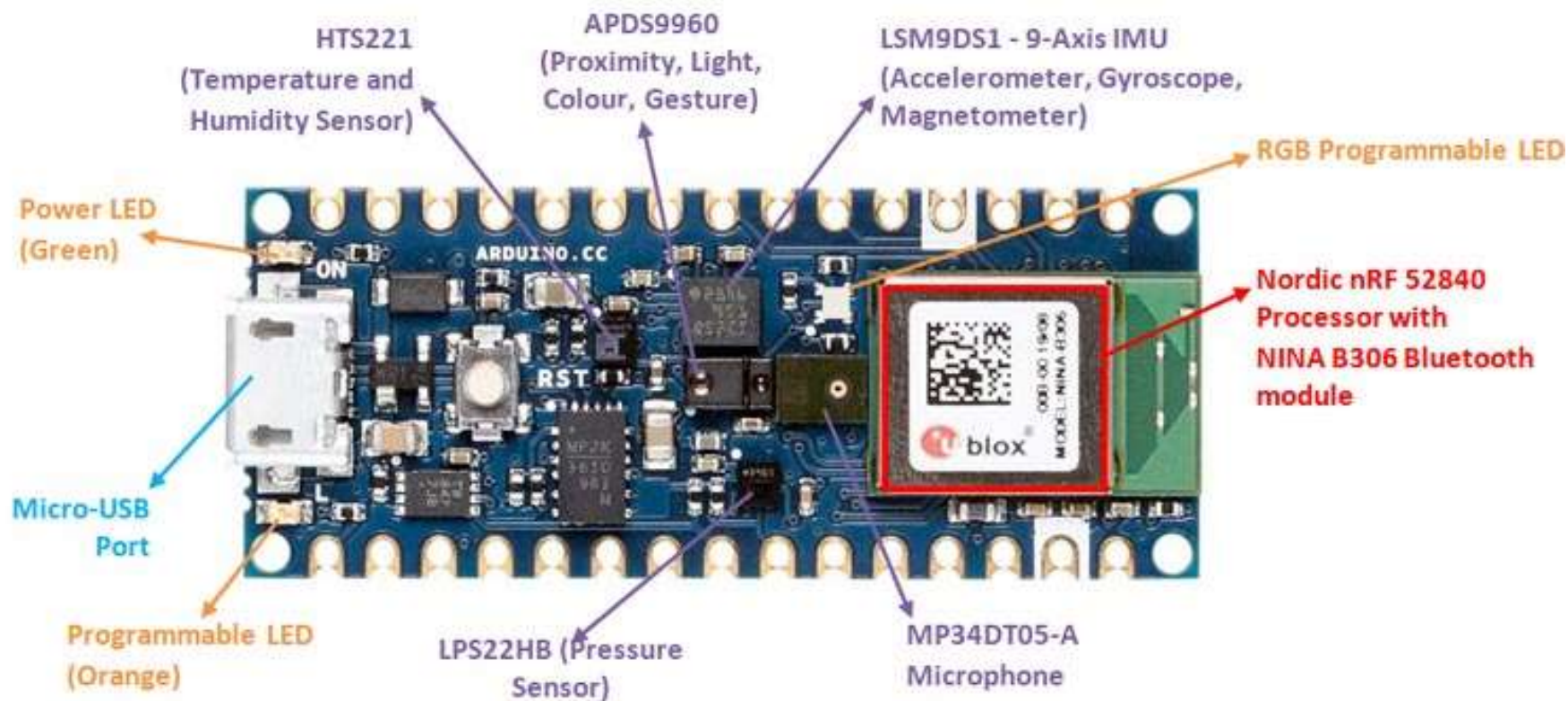


4. 저장된 IoT 데이터의 마이닝 (파이썬 코딩)

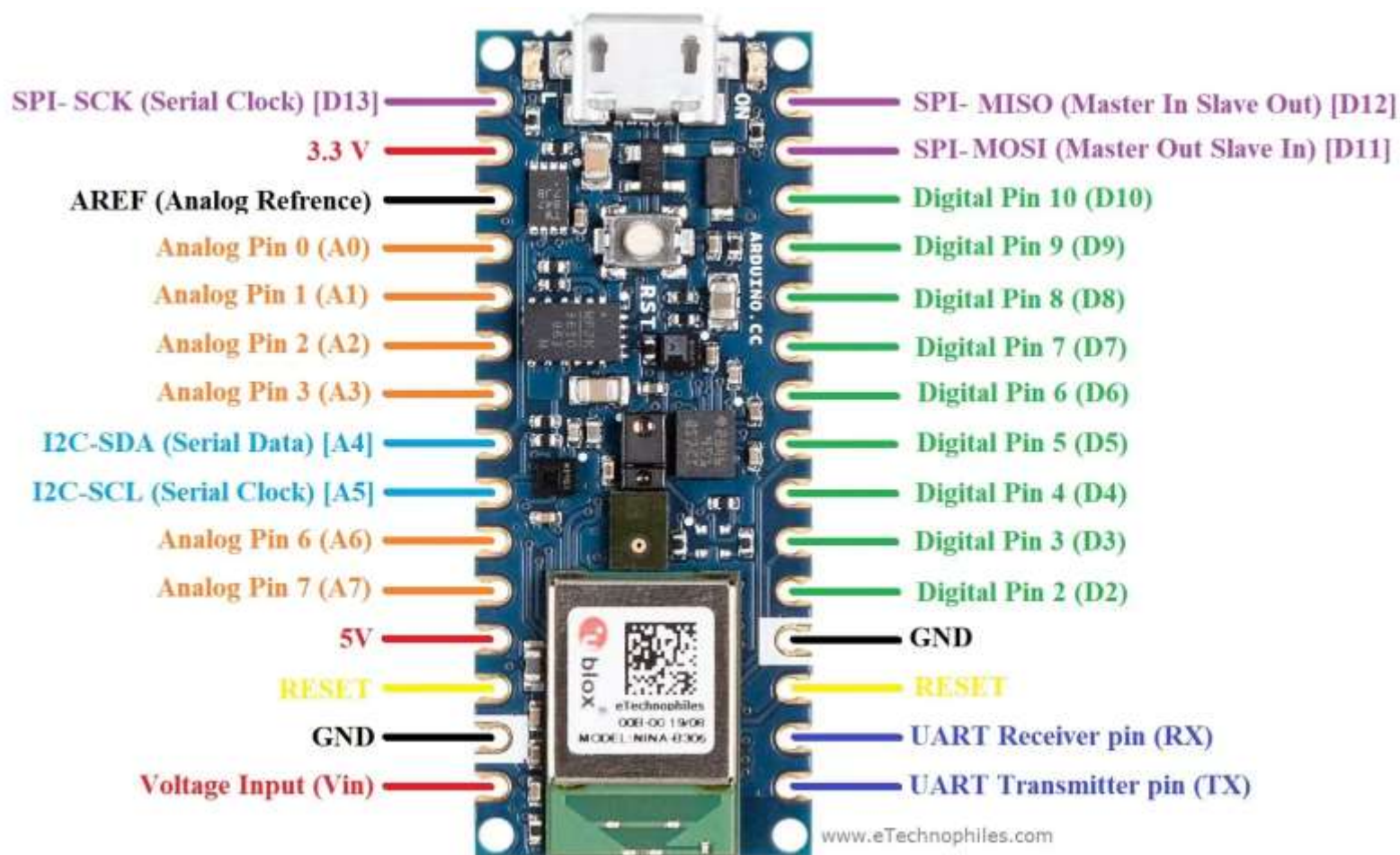


Layout [H S C]

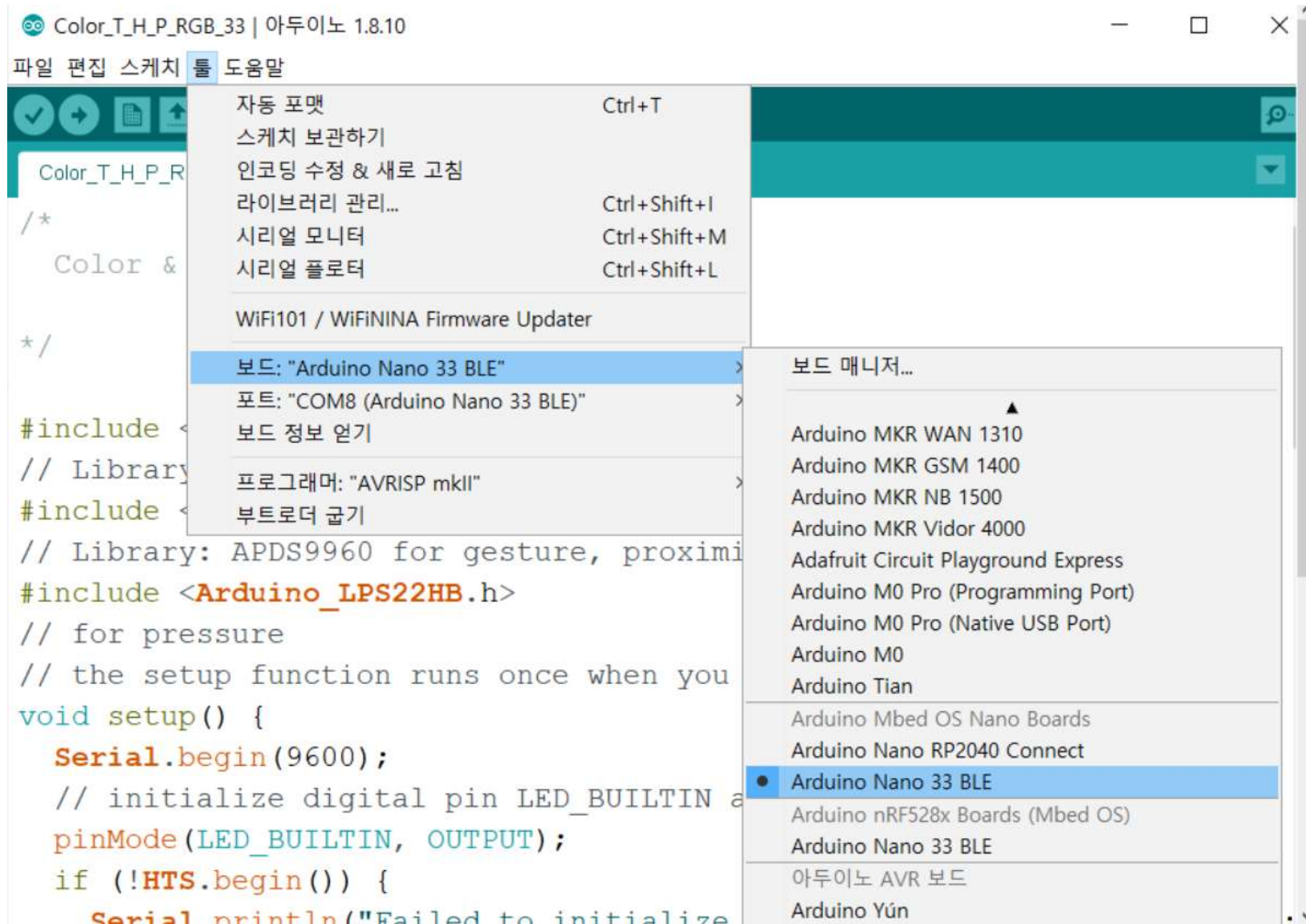




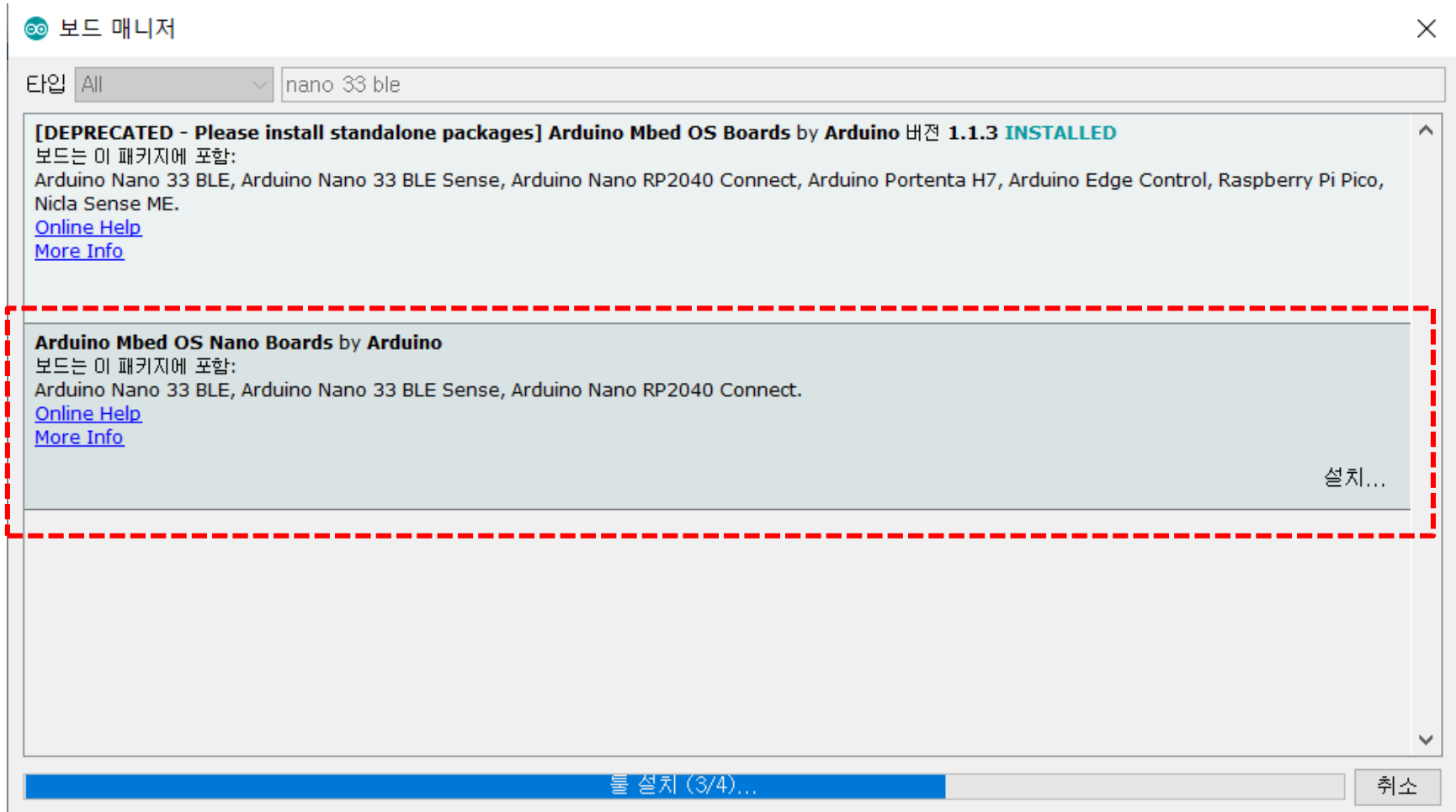
nano33BLE sensor - pins



Layout [H S C]



nano33 board





Project: nano33BLE sensor

[2022-project] IoT data mining in Colab

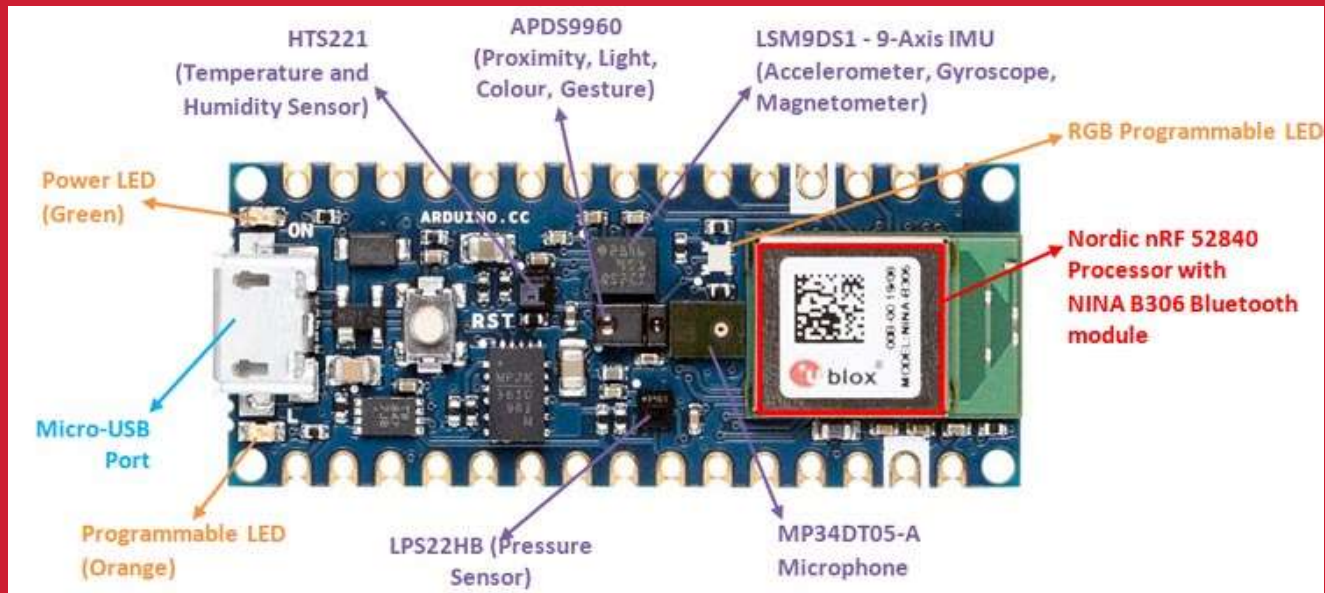
master ▾ Arduino / ar-iot / py-pandas /

 Redwoods Colaboratory를 통해 생성됨

..

 data	Add files via upload
 <code>iot_csv.ipynb</code>	Colaboratory를 통해 생성됨
 <code>iot_json.ipynb</code>	Colaboratory를 통해 생성됨
 <code>iot_nano33_csv.ipynb</code>	Colaboratory를 통해 생성됨
 <code>iot_nano33_json.ipynb</code>	Colaboratory를 통해 생성됨
 <code>rolling_corr_inf.ipynb</code>	Colaboratory를 통해 생성됨

2021/22 AA project nano33BLE sensor



APDS9960

- gestures
- proximity
- color, light intensity

begin()

end()

gestureAvailable()

readGesture()

colorAvailable()

readColor()

proximityAvailable()

readProximity()

setGestureSensitivity()

setInterruptPin()

setLEDBoost()

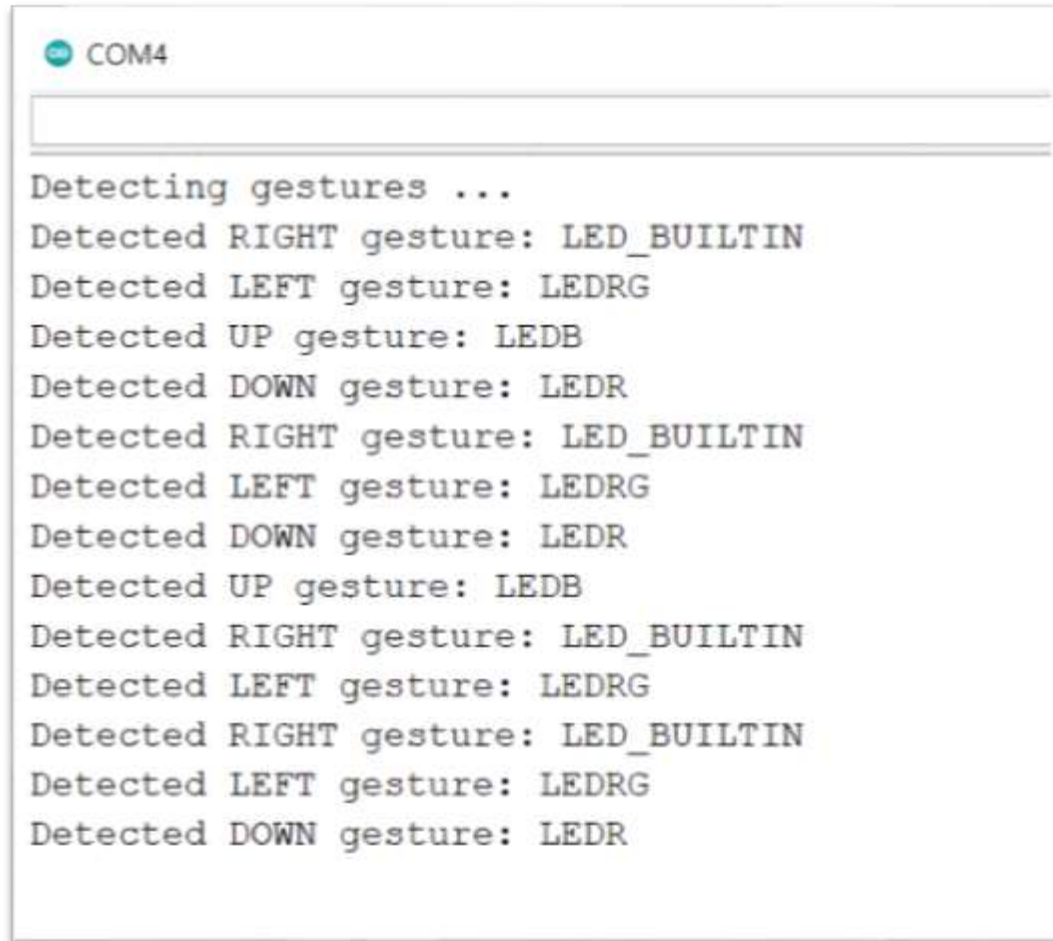
Arduino: gesture.ino

```
15 #include <Arduino_APDS9960.h>
16
17 void setup() {
18     Serial.begin(9600);
19     //in-built LED
20     pinMode(LED_BUILTIN, OUTPUT);
21     //Red
22     pinMode(LED_R, OUTPUT);
23     //Green
24     pinMode(LED_G, OUTPUT);
25     //Blue
26     pinMode(LED_B, OUTPUT);
27
28     while (!Serial);
29     if (!APDS.begin()) {
30         Serial.println("Error initializing APDS9960 sensor!");
31     }
32     // for setGestureSensitivity(..) a value between 1 and 100 is required.
33     // Higher values makes the gesture recognition more sensible but less accurate
34     // (a wrong gesture may be detected). Lower values makes the gesture recognition
35     // more accurate but less sensible (some gestures may be missed).
36     // Default is 80
37     //APDS.setGestureSensitivity(80);
38     Serial.println("Detecting gestures ...");
39     // Turning OFF the RGB LEDs
40     digitalWrite(LED_R, HIGH);
41     digitalWrite(LED_G, HIGH);
42     digitalWrite(LED_B, HIGH);
43 }
```


Arduino: gesture.ino

```
44 void loop() {
45   if (APDS.gestureAvailable()) {
46     // a gesture was detected, read and print to serial monitor
47     int gesture = APDS.readGesture();
48     switch (gesture) {
49       case GESTURE_UP:
50         Serial.println("Detected UP gesture");
51         digitalWrite(LED_R, LOW);
52         delay(1000);
53         digitalWrite(LED_R, HIGH);
54         break;
55       case GESTURE_DOWN:
56         Serial.println("Detected DOWN gesture");
57         digitalWrite(LED_G, LOW);
58         delay(1000);
59         digitalWrite(LED_G, HIGH);
60         break;
61       case GESTURE_LEFT:
62         Serial.println("Detected LEFT gesture");
63         digitalWrite(LED_B, LOW);
64         delay(1000);
65         digitalWrite(LED_B, HIGH);
66         break;
67       case GESTURE_RIGHT:
68         Serial.println("Detected RIGHT gesture");
69         digitalWrite(LED_BUILTIN, HIGH);
70         delay(1000);
71         digitalWrite(LED_BUILTIN, LOW);
72         break;
73       default:
74         break;
75     }
76   }
77 }
```

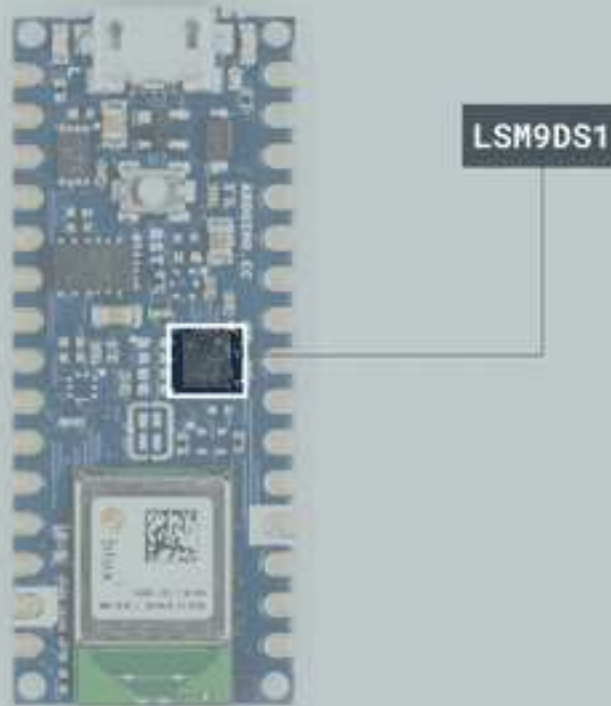
Arduino: serial monitor



The image shows a screenshot of an Arduino Serial Monitor window. At the top left, there is a green circular icon with a white 'C' and the text 'COM4'. Below this is a horizontal scroll bar. The main area of the window contains a list of text messages received from the Arduino board, all in a monospaced font. The messages are as follows:

```
Detecting gestures ...  
Detected RIGHT gesture: LED_BUILTIN  
Detected LEFT gesture: LEDRG  
Detected UP gesture: LEDB  
Detected DOWN gesture: LEDR  
Detected RIGHT gesture: LED_BUILTIN  
Detected LEFT gesture: LEDRG  
Detected DOWN gesture: LEDR  
Detected UP gesture: LEDB  
Detected RIGHT gesture: LED_BUILTIN  
Detected LEFT gesture: LEDRG  
Detected RIGHT gesture: LED_BUILTIN  
Detected LEFT gesture: LEDRG  
Detected DOWN gesture: LEDR
```

LSM9DS1, 9축 IMU센서: acc, gyro, mag



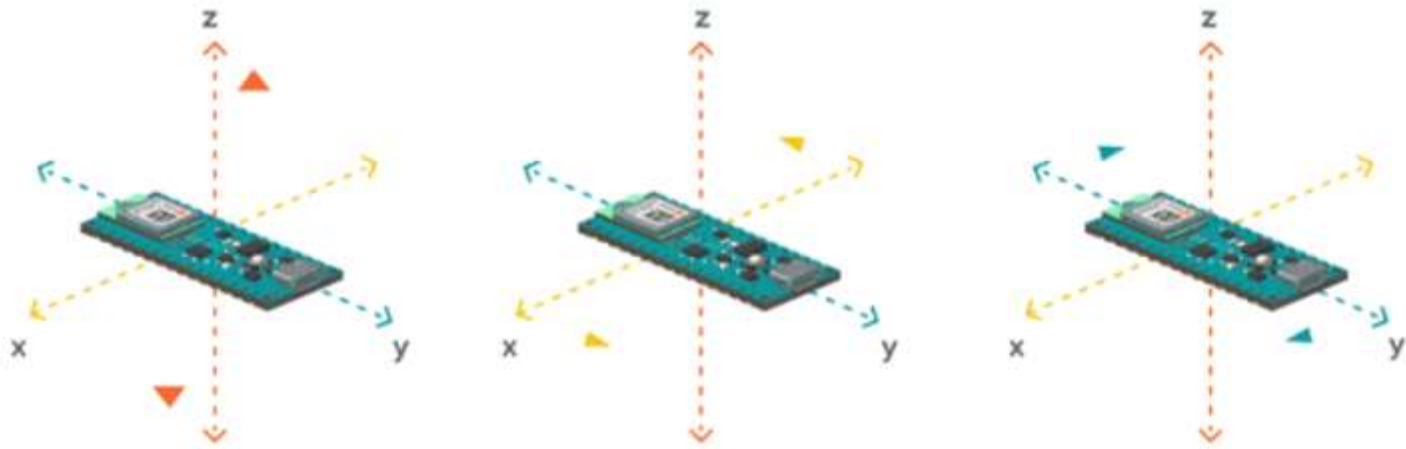
LSM9DS1, 9축 IMU센서: acc, gyro, mag

The LSM9DS1 Library

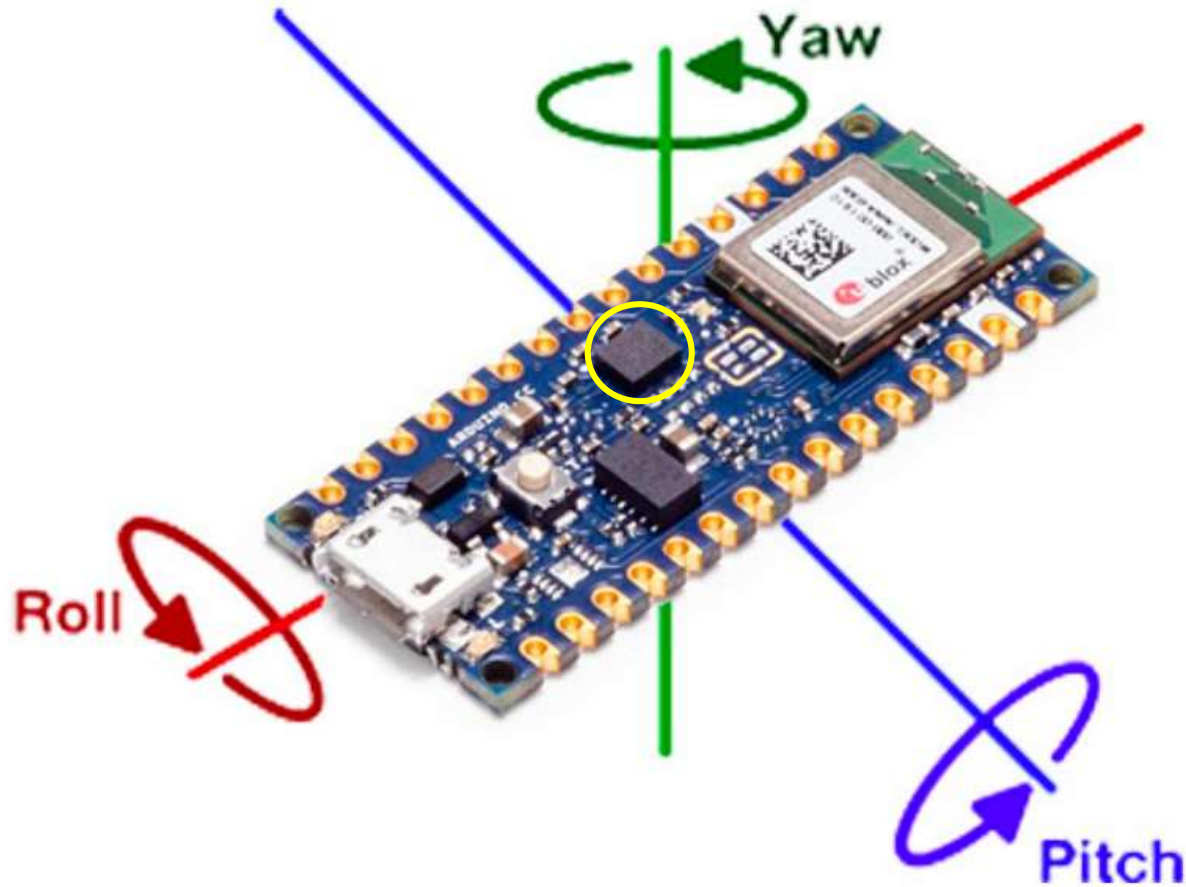
The Arduino LSM9DS1 library allows us to use the Arduino Nano 33 BLE IMU module without having to go into complicated programming. The library takes care of the sensor initialization and sets its values as follows:

- ◆ **Accelerometer** range is set at $[-4, +4]g$ ± 0.122 mg.
- ◆ **Gyroscope** range is set at $[-2000, +2000]$ dps ± 70 mdps.
- ◆ **Magnetometer** range is set at $[-400, +400]$ uT ± 0.014 uT.
- ◆ **Accelerometer** output data rate is fixed at 104 Hz.
- ◆ **Gyroscope** output data rate is fixed at 104 Hz.
- ◆ **Magnetometer** output data rate is fixed at 20 Hz.

LSM9DS1, 9축 IMU센서: **acc** , gyro, mag



LSM9DS1, 9축 IMU 센서: acc, gyro, mag



자이로 스코프 측정, 이미지 출처 <https://www.mauroalfieri.it/elettronica/arduino-nano-33-ble-giroscopio-lsm9ds1.html>

LSM9DS1, 9축 IMU센서: acc, gyro, mag

LSM9DS1_Basic.ino

```
1  #include <Arduino_LSM9DS1.h>
2
3  void setup() {
4      Serial.begin(9600);
5      while (!Serial); // 직렬통신 연결될 때 까지 대기
6      Serial.println("Started");
7      if (!IMU.begin()) { // IMU센서를 초기화합니다. 초기화중 문제가 발생하면 오류를 발생시킵니다.
8          Serial.println("Failed to initialize IMU!");
9          while (1);
10     }
11 }
12 float ax, ay, az; // 가속도 센서의 XYZ값을 저장할 변수입니다.
13 float gx, gy, gz; // 자이로 센서의 XYZ값을 저장할 변수입니다.
14 float mx, my, mz; // 지자기 센서의 XYZ값을 저장할 변수입니다.
15
16 void loop() {
17     delay(500);
18     if (IMU.accelerationAvailable()) { // 가속도 센서의 값을 출력합니다.
19         IMU.readAcceleration(ax, ay, az); // x, y, z에 각 축별 데이터를 넣습니다.
20         Serial.print("ACC 센서 - ");
21         Serial.print(ax);
22         Serial.print(',');
23         Serial.print(ay);
24         Serial.print(',');
25         Serial.print(az);
26         Serial.print(" G's");
27         Serial.print(',');
28     }
```

LSM9DS1, 9축 IMU센서: acc, gyro, mag

```
30     if (IMU.gyroscopeAvailable()) { // 자이로 센서의 값을 출력합니다.
31         IMU.readGyroscope(gx, gy, gz);
32         Serial.print("GYRO 센서 - ");
33         Serial.print(gx);
34         Serial.print(',');
35         Serial.print(gy);
36         Serial.print(',');
37         Serial.print(gz);
38         Serial.print(" degrees/second");
39         Serial.print(',');
40     }
41
42     if (IMU.magneticFieldAvailable()) { // 지자기 센서의 값을 출력합니다.
43         IMU.readMagneticField(mx, my, mz);
44         Serial.print("MAG 센서 - ");
45         Serial.print(mx);
46         Serial.print(',');
47         Serial.print(my);
48         Serial.print(',');
49         Serial.print(mz);
50         Serial.println(" uT");
51     }
52     // Serial.println();
53 }
54
```

LSM9DS1, 9축 IMU센서: acc, gyro, mag

Started

ACC 센서 - 0.02,-0.04,0.96 G's,GYRO 센서 - 1.10,-0.79,-0.12 degrees/second,MAG 센서 - -24.40,2.99,-13.93 uT
ACC 센서 - 0.02,-0.04,0.96 G's,GYRO 센서 - 1.22,-0.92,-0.12 degrees/second,MAG 센서 - -24.58,2.11,-13.27 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 1.28,-0.98,-0.06 degrees/second,MAG 센서 - -23.83,1.90,-13.56 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 1.04,-0.92,-0.12 degrees/second,MAG 센서 - -24.41,2.39,-12.95 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 1.28,-1.04,0.00 degrees/second,MAG 센서 - -24.28,4.21,-13.21 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 1.16,-1.04,-0.12 degrees/second,MAG 센서 - -24.72,1.66,-11.68 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 1.46,-0.55,0.00 degrees/second,MAG 센서 - -24.34,2.48,-12.59 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 1.04,-1.16,0.00 degrees/second,MAG 센서 - -24.65,2.88,-13.54 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 1.16,-1.10,-0.06 degrees/second,MAG 센서 - -24.21,2.72,-13.13 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 0.98,-1.16,-0.18 degrees/second,MAG 센서 - -24.13,2.39,-12.68 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 0.98,-0.92,0.00 degrees/second,MAG 센서 - -24.06,2.03,-13.05 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 1.10,-1.10,0.06 degrees/second,MAG 센서 - -23.96,6.35,-13.18 uT
ACC 센서 - 0.02,-0.04,0.97 G's,GYRO 센서 - 0.92,-0.67,-0.06 degrees/second,MAG 센서 - -24.05,2.17,-12.16 uT

LSM9DS1, 9축 IMU센서: acc, gyro, mag

IoT 데이터 수집 형태로 출력을 변경하시오.

LSM9DS1_IoT.ino 로 저장

```
-0.02,0.76,0.48,108.58,-7.26,15.08,-19.34,-10.67,9.59  
-0.43,-1.02,-0.49,103.88,-49.99,-3.30,-26.07,25.98,18.08  
0.10,0.82,0.74,-228.39,49.38,-27.10,-16.94,-10.21,5.30  
0.38,-0.11,0.33,70.62,112.61,-47.85,-9.86,9.01,-9.19  
1.12,0.27,0.61,-91.31,-158.75,49.87,1.83,-3.25,-3.11  
0.39,0.92,-0.30,153.75,-18.55,0.37,-6.21,-15.71,23.00  
-0.16,-1.15,-0.45,-24.17,-51.57,-51.94,-16.20,31.29,9.70  
0.16,0.70,0.52,-162.05,-14.34,11.05,-16.25,-10.57,6.09  
-0.13,-0.90,0.34,368.29,-10.25,-137.94,-17.02,24.33,1.95  
0.10,0.33,0.67,-99.61,7.08,34.91,-19.93,3.16,-2.32  
0.17,0.11,0.81,-12.88,1.89,-4.58,-20.63,1.93,-14.48  
0.02,-0.04,0.97,1.04,-0.73,-0.12,-25.82,3.49,-13.90  
0.02,-0.04,0.97,1.10,-1.04,-0.18,-25.20,2.51,-14.53  
0.02,-0.04,0.97,1.04,-1.04,-0.12,-25.21,2.17,-13.78  
0.03,-0.04,0.98,0.98,-1.16,-0.12,-25.56,2.22,-14.06
```

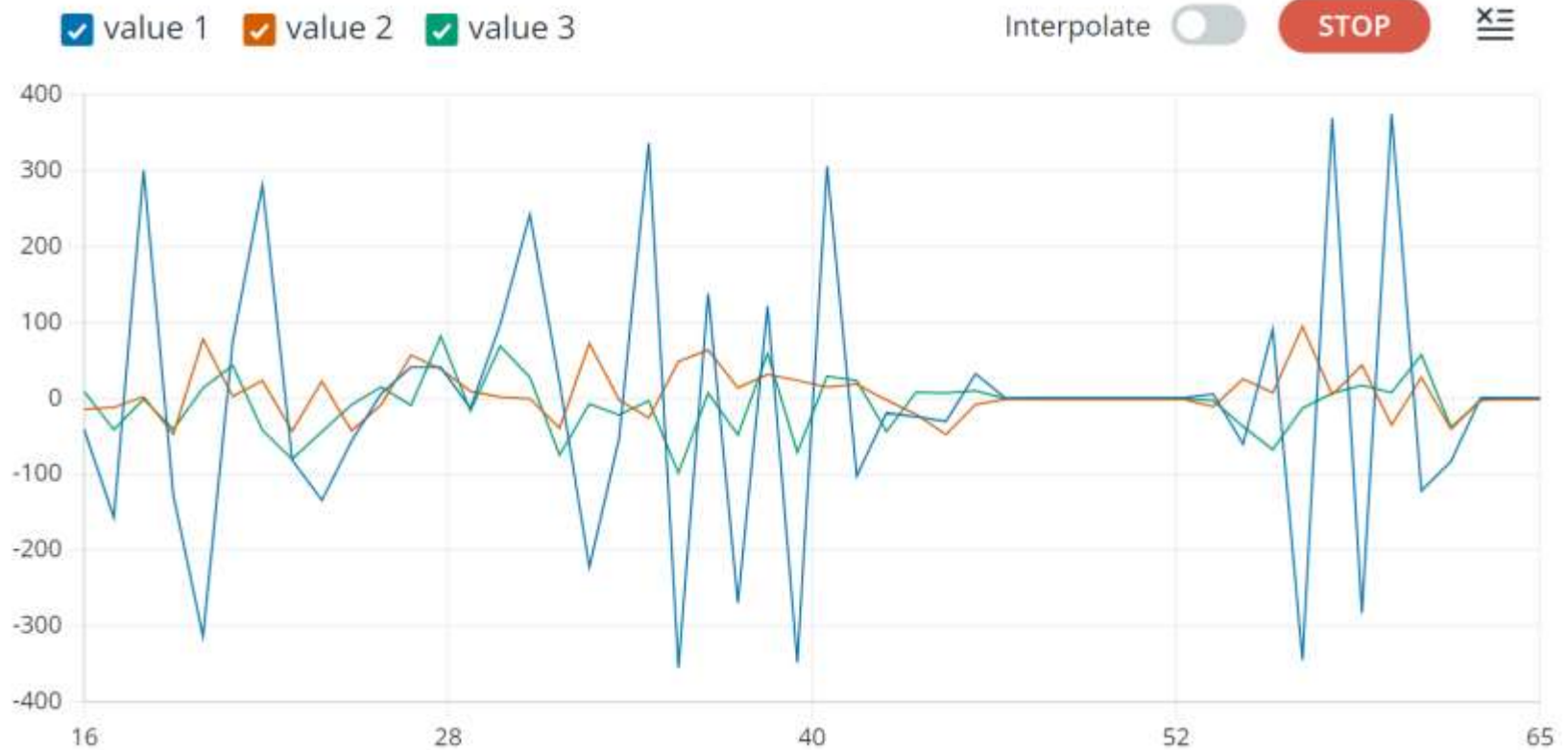
LSM9DS1, 9축 IMU센서: **acc**, gyro, mag

Accelerometer range is set at $[-4, +4]g$ ± 0.122 mg.



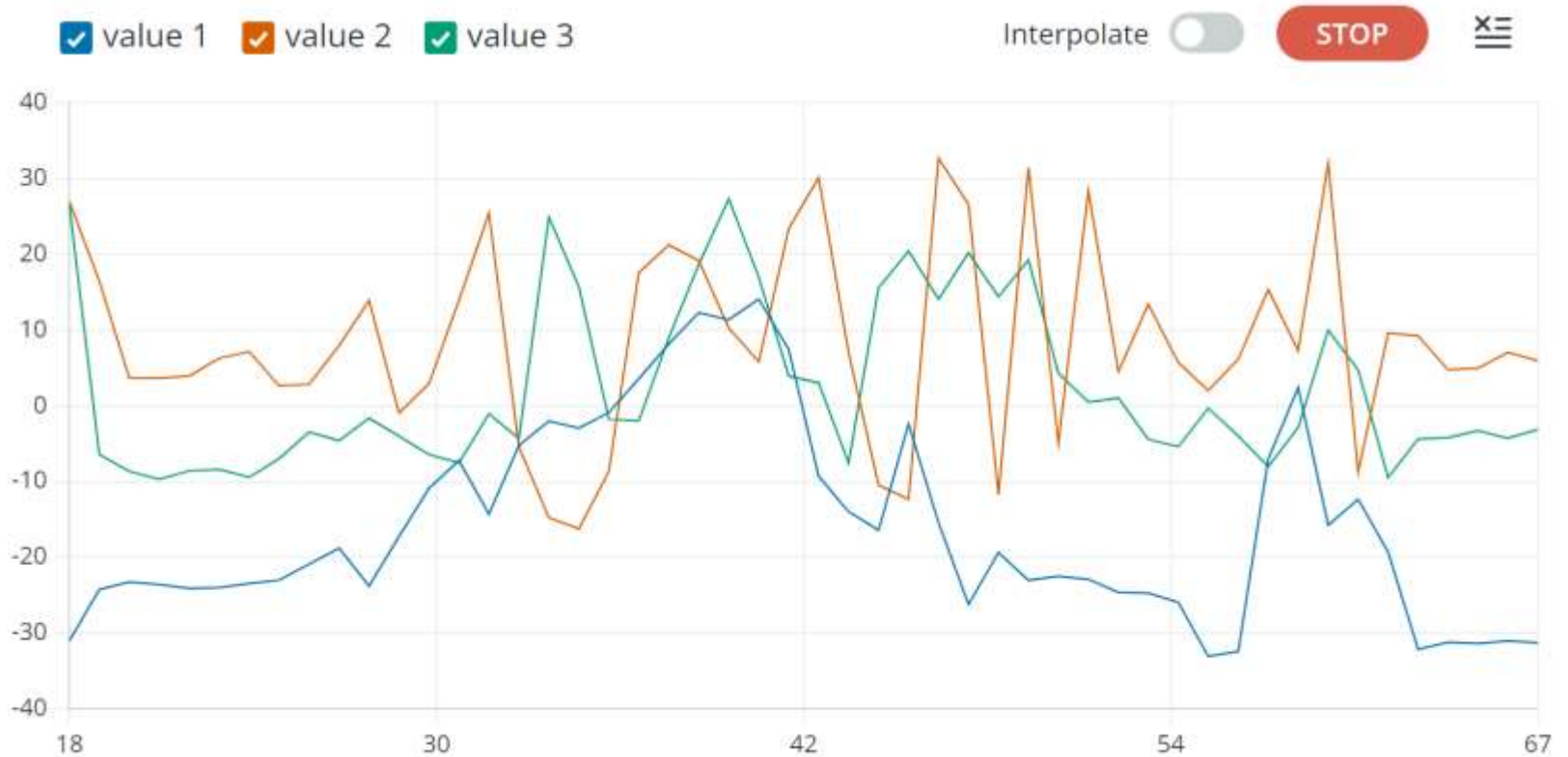
LSM9DS1, 9축 IMU센서: acc, gyro, mag

Gyroscope range is set at [-2000, +2000] dps +/- 70 mdps.



LSM9DS1, 9축 IMU센서: acc, gyro, mag

Magnetometer range is set at $[-400, +400]$ μT ± 0.014 μT .



LSM9DS1, 9축 IMU센서: acc, gyro, mag

* 9축 IMU 센서 신호 마이닝

1. MongoDB

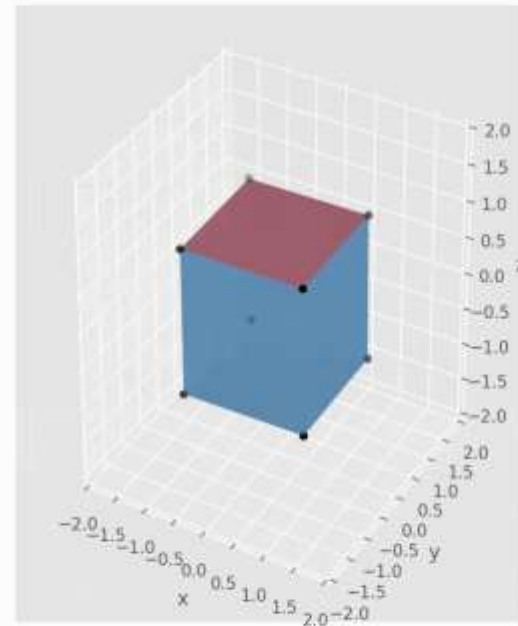
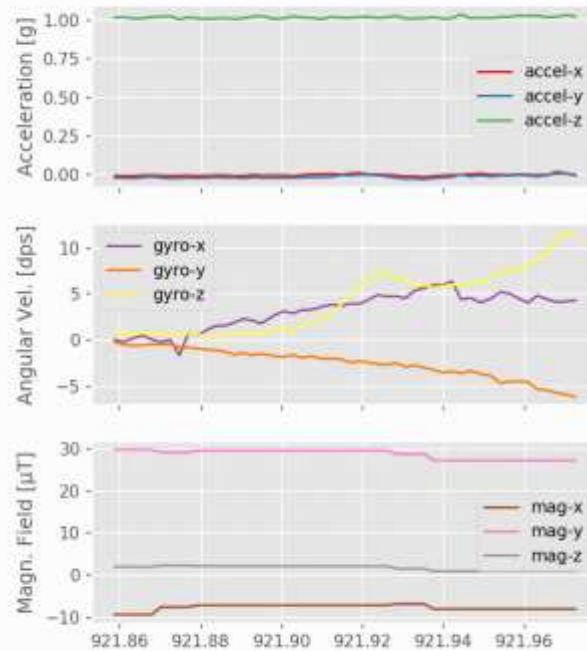
2. Express server

- 실시간 모니터링
- DB 모니터링

3. data mining using Colab

4. Deep learning ?

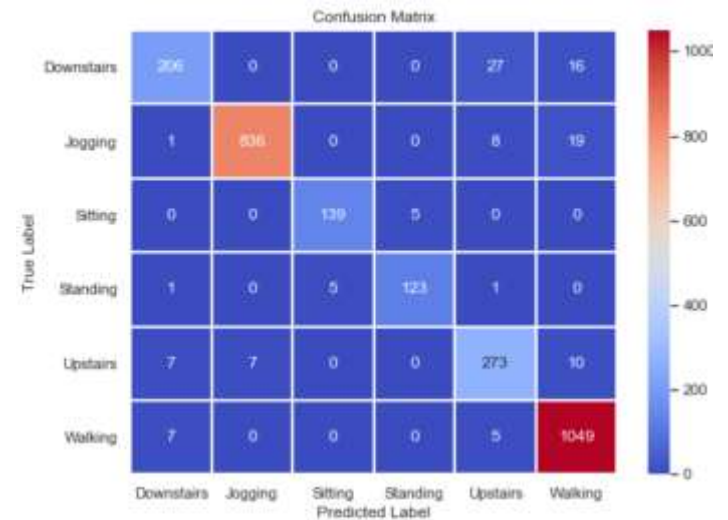
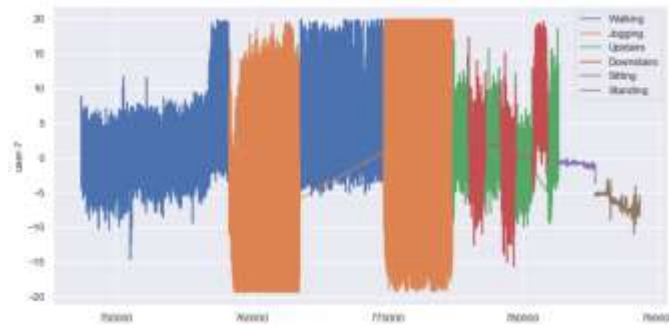
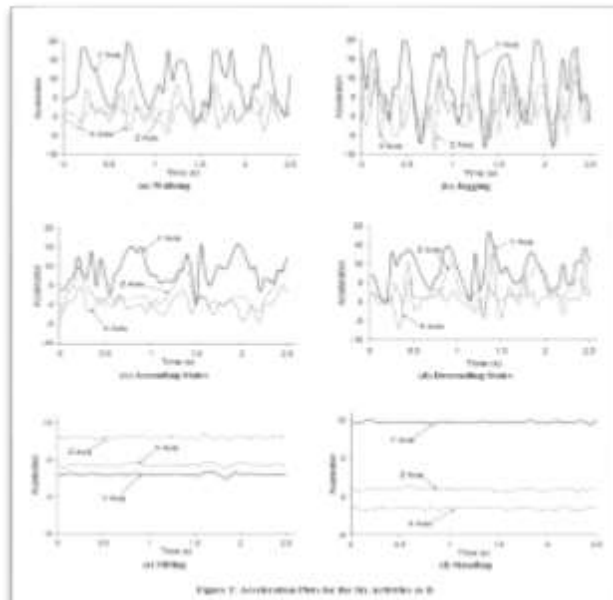
모션 인식(9-축 IMU)



https://images.squarespace-cdn.com/content/v1/59b037304c0dbfb092f8e894/1573836927118-IS5CS61OW9XH9HSRCMA1/ke17ZwdGBToddI8pDm48kGbFogdxZzB1B7PQq3zm9xl7gQa3H78H3Y0txjaiv_0fDoOvxcdMmMKkDs_yUqMSsMWxHk725yiiHCCLfrh8O1z5QPQohDlalelJMHgDF5CVIOqpeNLCI80NK65_fv7S1UQupMlr7Z9cq9PZkRytzEu3SbZmkCxOj_ksrEup4_K2kPH3bqxw7fF48mhrq5Ulr0Hg/mpu9250_cube_rotation_compressed.gif

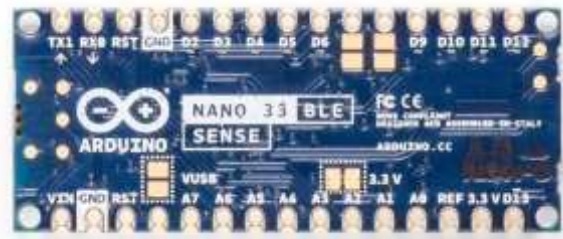
일상활동 인식(3축 가속도)

['Downstairs',
'Jogging',
'Sitting',
'Standing',
'Upstairs',
'Walking']



--- ACC_XYZ, 4s: classification report for test data ---

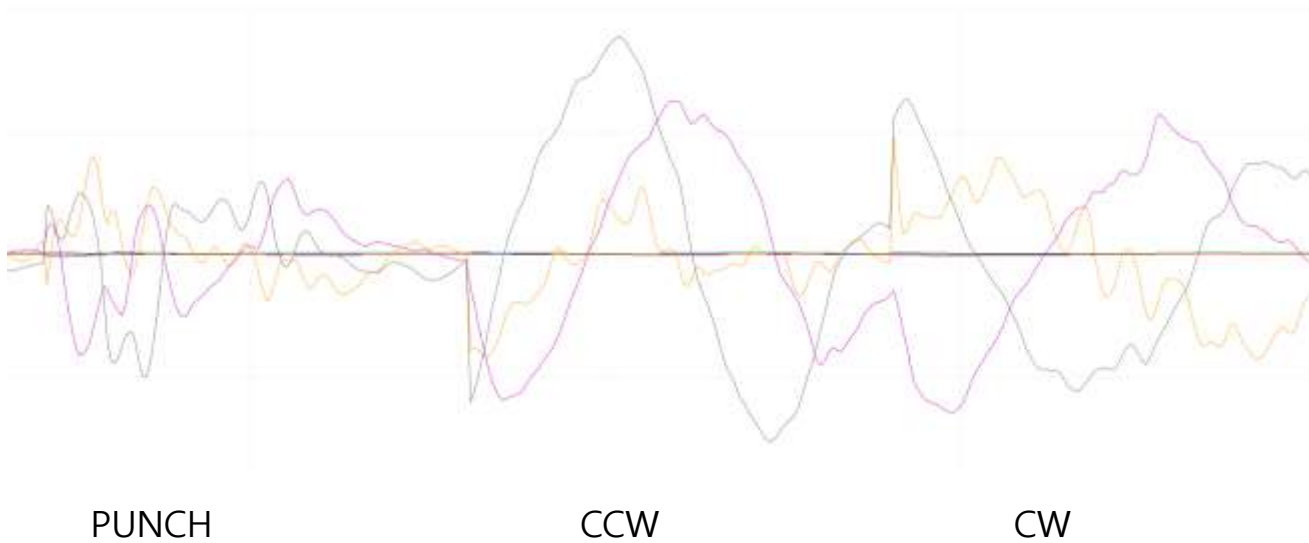
	precision	recall	f1-score	support
0	0.93	0.83	0.87	249
1	0.99	0.97	0.98	864
2	0.97	0.97	0.97	144
3	0.96	0.95	0.95	138
4	0.87	0.92	0.89	297
5	0.96	0.99	0.97	1061
accuracy			0.96	2745
macro avg	0.95	0.94	0.94	2745
weighted avg	0.96	0.96	0.96	2745



Arduino nano33 BLE

Classification of gestures
using ACC
in Tensorflow 2.x
& TinyML/TF-Lite

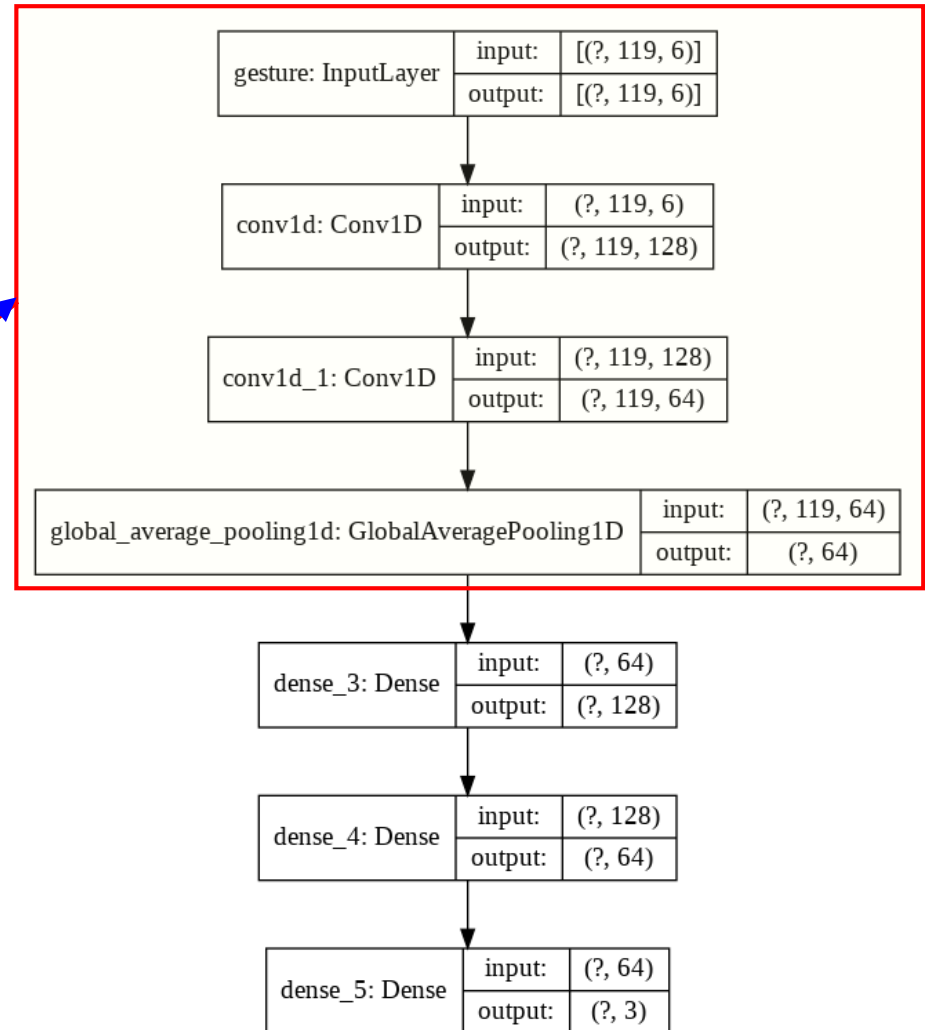
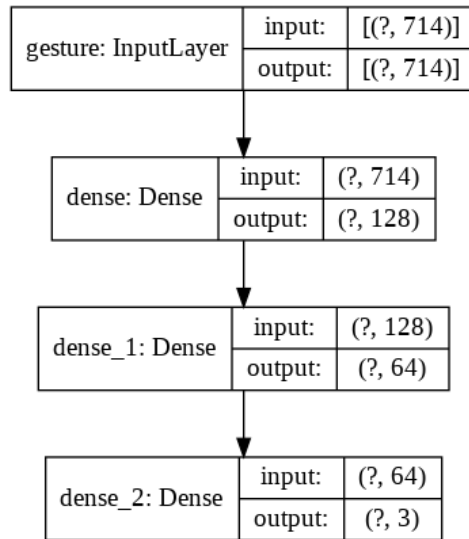
Data 모으기



119 X 6 (ax,ay,az, gx,gy,gz)

DL architecture

MLP \rightarrow Conv1D + MLP
(714,) \rightarrow (119,6) + (64,)



DL-model

```
from tensorflow.keras import layers
```

```
# TF2 functional API
```

```
# CONV1D & MLP
```

```
inputs = keras.Input(shape=(119,6), name='gesture')
```

```
x = layers.Conv1D(128, 3, padding='causal', activation='relu')(inputs) # 32,
```

```
x = layers.Conv1D(64, 3, padding='causal', activation='relu')(x) # 16
```

```
x = layers.GlobalAveragePooling1D()(x) # New features (714 => 16 or 64)
```

```
x = layers.Dense(128, activation='relu')(x)
```

```
x = layers.Dense(64, activation='relu')(x)
```

```
outputs = layers.Dense(NUM_GESTURES, activation='softmax')(x)
```

```
model_conv = keras.Model(inputs=inputs, outputs=outputs, name='gesture_model2')
```

```
model_conv.compile(optimizer='rmsprop', loss='mse', metrics=['accuracy'])
```

```
# train the model
```

```
history = model_conv.fit(inputs_train2, outputs_train, epochs=500, batch_size=16  
| | | | | validation_data=(inputs_validate2, outputs_validate))
```

```
model_conv.summary()
```

Model: "gesture_model2"

Layer (type)	Output Shape	Param #
gesture (InputLayer)	[(None, 119, 6)]	0
conv1d (Conv1D)	(None, 119, 128)	2432
conv1d_1 (Conv1D)	(None, 119, 64)	24640
global_average_pooling1d (Gl	(None, 64)	0
dense_3 (Dense)	(None, 128)	8320
dense_4 (Dense)	(None, 64)	8256
dense_5 (Dense)	(None, 3)	195

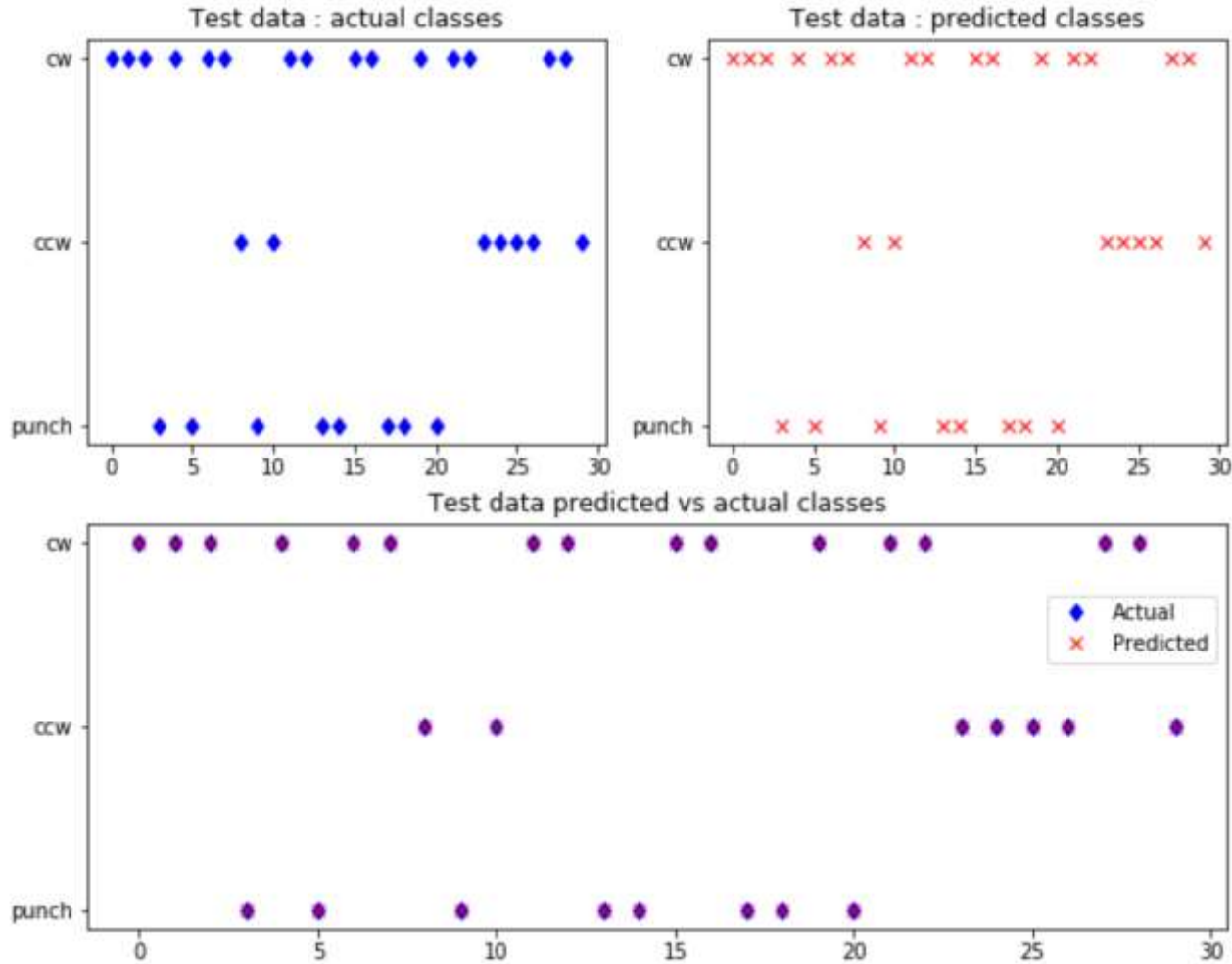
Total params: 43,843

Trainable params: 43,843

Non-trainable params: 0

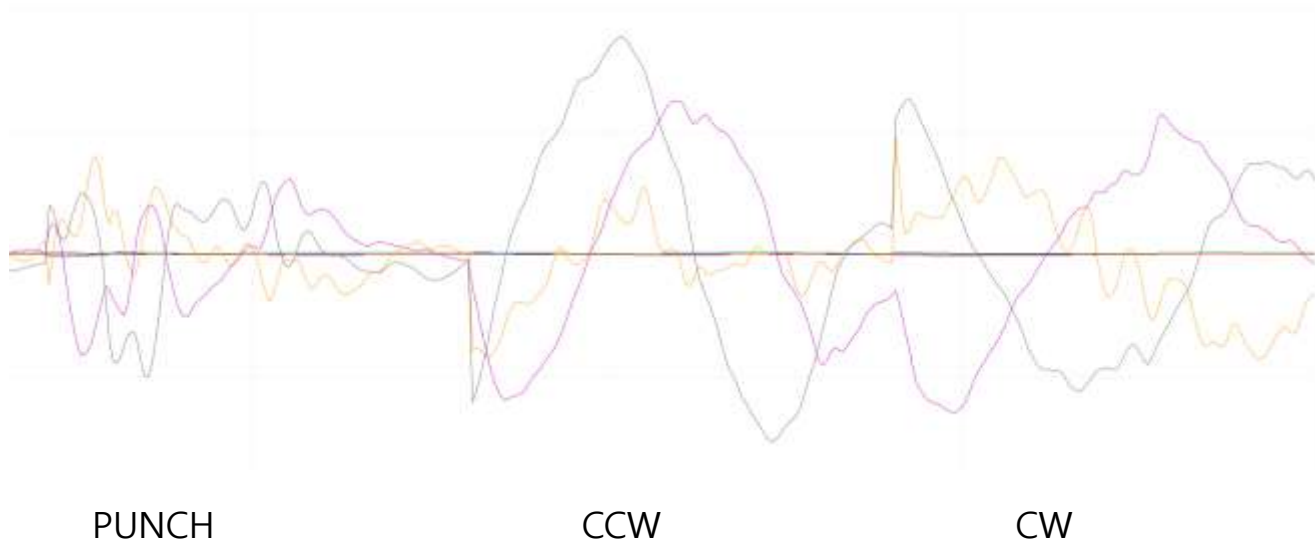
DL-model testing

actual =
[[0. 0. 1.]
[0. 0. 1.]
[0. 0. 1.]
[1. 0. 0.]
[0. 0. 1.]
[1. 0. 0.]
[0. 0. 1.]
[0. 0. 1.]
[0. 1. 0.]
[1. 0. 0.]
[0. 1. 0.]
[0. 0. 1.]
[0. 0. 1.]
[1. 0. 0.]



predictions =
[[0. 0.001 0.999]
[0.001 0.001 0.998]
[0.005 0.001 0.994]
[0.999 0. 0.001]
[0. 0.001 0.999]
[1. 0. 0.]
[0. 0.001 0.999]
[0.002 0.001 0.997]
[0. 1. 0.]
[1. 0. 0.]
[0. 1. 0.]
[0. 0.001 0.999]
[0.001 0. 0.999]
[0.997 0. 0.003]

Real-time testing

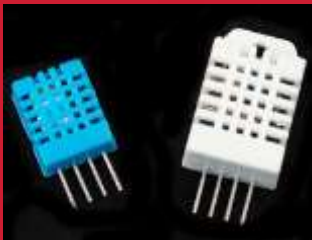
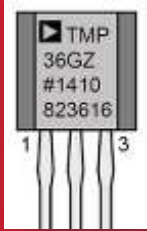


COM8

```
13:24:06.140 -> punch: 0.996470
13:24:06.140 -> ccw: 0.000000
13:24:06.140 -> cw: 0.003530
13:24:06.140 ->
13:24:10.197 -> punch: 0.000095
13:24:10.197 -> ccw: 0.000000
13:24:10.197 -> cw: 0.999905
13:24:10.197 ->
13:24:13.193 -> punch: 0.000000
13:24:13.193 -> ccw: 1.000000
13:24:13.193 -> cw: 0.000000
```



[Practice]



◆ [wk13]

- IoT Project: nano33ble
- Multi-sensor circuits : IMU
- Complete your project
- Upload folder: aann-rpt13
- Use repo “aann” in github

wk13 : Practice : aann-rpt13

◆ [Target of this week]

- Complete your works
- Save your outcomes and upload outputs in github

제출폴더명 : **aann-rpt13**

제출할 파일들

- ① **gesture.ino**
- ② **LSM9DS1_Basic.ino**
- ③ **LSM9DS1_IoT.ino**

● References & good sites

- ✓ <http://www.arduino.cc> Arduino Homepage
- ✓ <http://www.nodejs.org/ko> Node.js
- ✓ <https://plot.ly/> plotly
- ✓ <https://www.mongodb.com/> MongoDB
- ✓ <http://www.w3schools.com> By w3schools
- ✓ <http://www.github.com> GitHub

Target of this class

Real-time Weather Station from nano 33 BLE sensors



on Time: 2022-11-15 09:48:56.577

