Final Year Project:

Anticipating Menstrual Migraine using Deep Learning.

Importing Libraries

```
In []: # For data manipulation
   import numpy as np
   import pandas as pd

# For data visualization
   import seaborn as sns
   import matplotlib.pyplot as plt

# For upsampling
   from sklearn.utils import resample

# For encoding
   from sklearn.preprocessing import LabelEncoder, LabelBinarizer
```

Importing Dataset

Out[]:		Age	Duration	Frequency	Location	Character	Intensity	Nausea	Vomit	Phonophobia	Pl
	0	30	1	5	1	1	2	1	0	1	
	1	50	3	5	1	1	3	1	1	1	
	2	53	2	1	1	1	2	1	1	1	
	3	45	3	5	1	1	3	1	0	1	
	4	53	1	1	1	1	2	1	0	1	
	5 ro	ows ×	26 colum	ns							

___Exploratory Data Analysis___

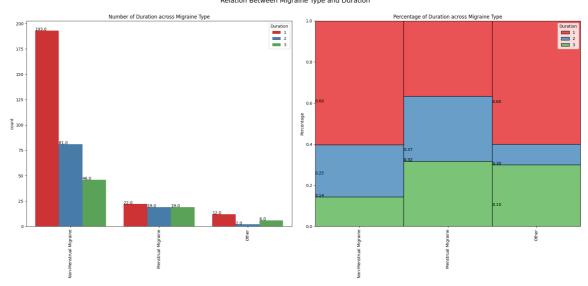
Relation between Categorical Variable and Target Variable

```
In [ ]: cat_col = []
        con_col = []
        for col in df.columns:
            if df[col].nunique() < 15:</pre>
                cat_col.append(col)
            else:
                con_col.append(col)
In [ ]: def count_percentage_plot(df, x, target, suptitle):
            fig, (ax1,ax2) = plt.subplots(1,2, figsize=(20,10))
            plt.suptitle(suptitle, fontsize=16)
            # Plot the count plot
            ax1.set_title(f"Number of {x.capitalize()} across Migraine Type")
            sns.countplot(data=df,x=target, hue=x, ax=ax1, palette="Set1")
            ax1.set xlabel("")
            ax1.set_xticklabels(ax1.get_xticklabels(), rotation=90)
            # Plot the percent plot
            ax2.set_title(f"Percentage of {x.capitalize()} across Migraine Type")
            sns.histplot(df, x=target, hue=x, stat="probability", multiple="fill", shrir
            ax2.set_xlabel("")
            ax2.set_ylabel("Percentage")
            ax2.set_xticklabels(ax1.get_xticklabels(), rotation=90)
```

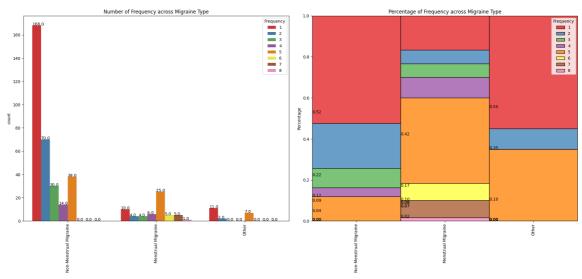
```
# Annotating the plots
for p1,p2 in zip(ax1.patches,ax2.patches):
    ax1.annotate("{:.1f}".format(p1.get_height()), (p1.get_x(),p1.get_height
    ax2.annotate("{:.2f}".format(p2.get_height()), (p2.get_x(),p2.get_height

plt.tight_layout(pad=2)
plt.show()
```

Duration and Type



Frequency and Type

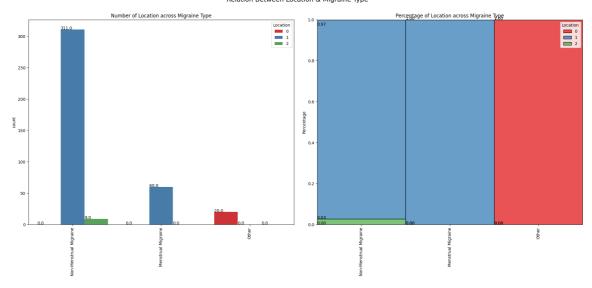


Location and Type

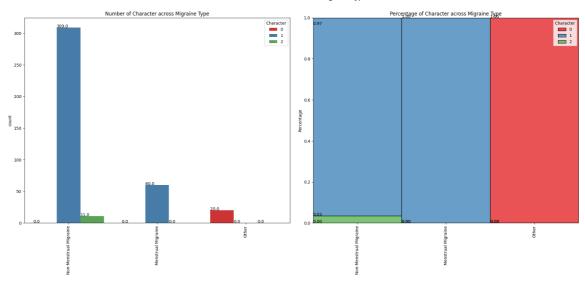
In []: count_percentage_plot(df, 'Location', 'Type', "Relation Between Location & Migra

C:\Users\bokad\AppData\Local\Temp\ipykernel_43416\1632486721.py:16: UserWarnin
g: FixedFormatter should only be used together with FixedLocator
 ax2.set_xticklabels(ax1.get_xticklabels(), rotation=90)

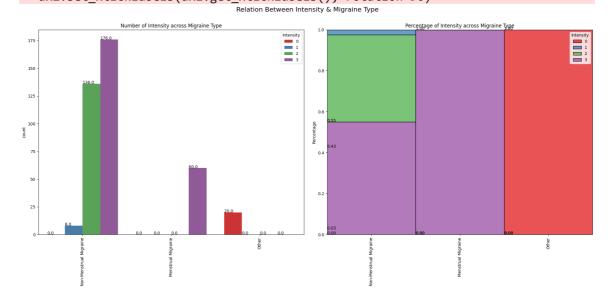
Relation Between Location & Migraine Type



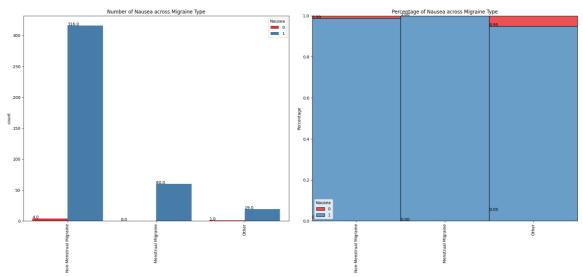
Character and Type



Intensity and Type



Nausea and Type



Vomit and Type

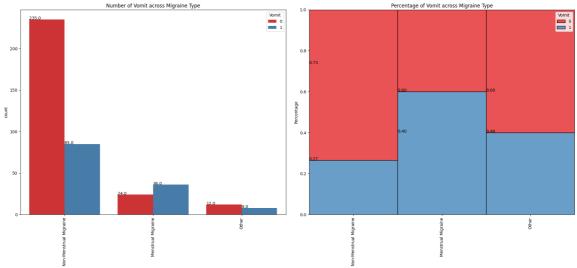
In []: count_percentage_plot(df, 'Vomit', 'Type', "Relation Between Vomit & Migraine Ty

C:\Users\bokad\AppData\Local\Temp\ipykernel_43416\1632486721.py:16: UserWarnin
g: FixedFormatter should only be used together with FixedLocator
ax2.set_xticklabels(ax1.get_xticklabels(), rotation=90)

Relation Between Vomit & Migraine Type

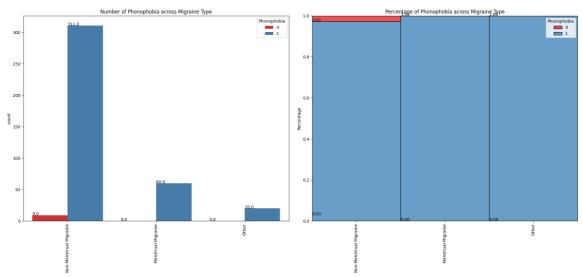
Number of Vomit across Migraine Type

Percentage of Vomit across Migraine Type



Phonophobia and Type

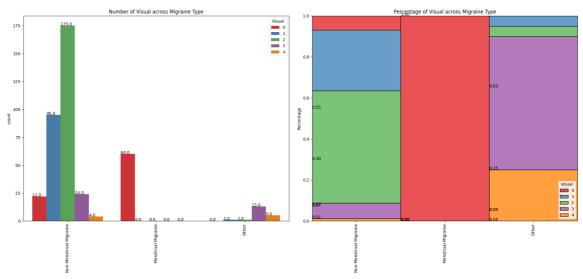
In []: count_percentage_plot(df, 'Phonophobia', 'Type', "Relation Between Phonophobia 8
 C:\Users\bokad\AppData\Local\Temp\ipykernel_43416\1632486721.py:16: UserWarnin
 g: FixedFormatter should only be used together with FixedLocator
 ax2.set_xticklabels(ax1.get_xticklabels(), rotation=90)



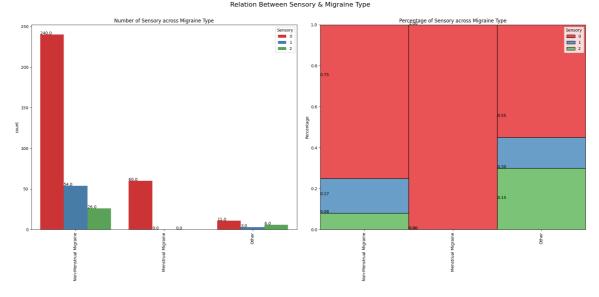
Photophobia and Type

ax2.set_xticklabels(ax1.get_xticklabels(), rotation=90)

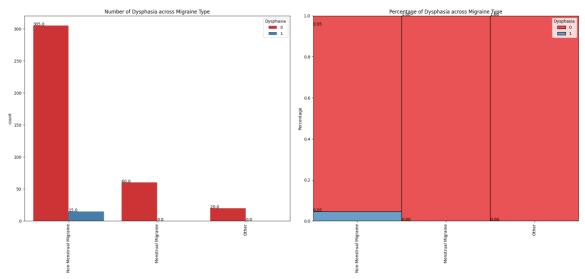
Visual and Type



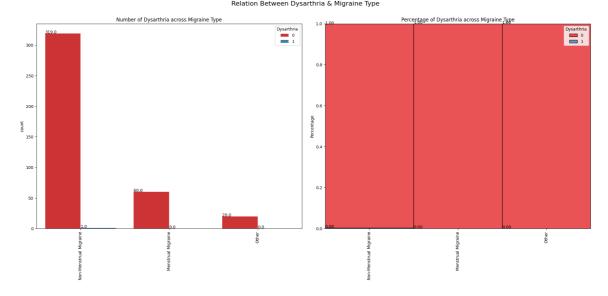
Sensory and Type



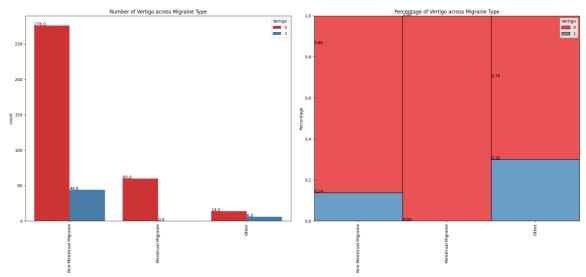
Dysphasia and Type



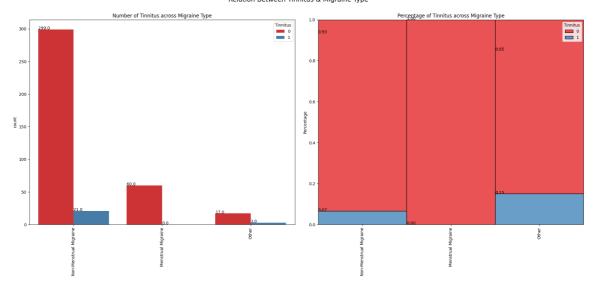
Dysarthria and Type



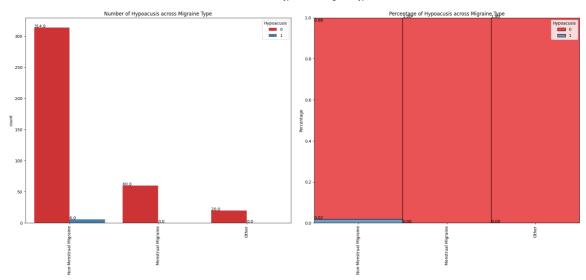
Vertigo and Type



Tinnitus and Type

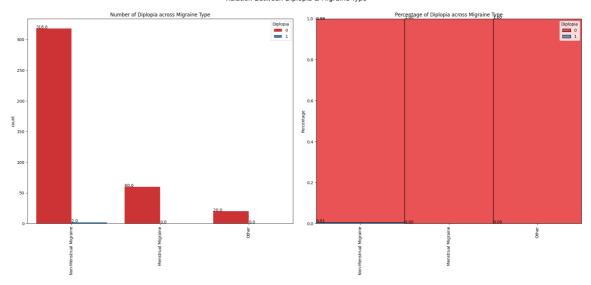


Hypoacusis and Type

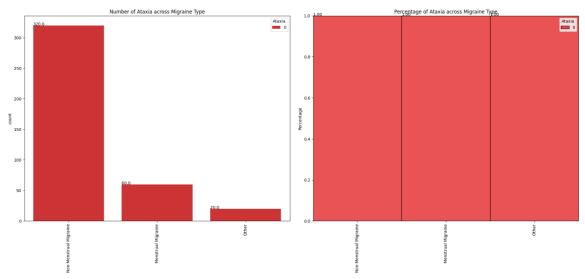


Diplopia and Type

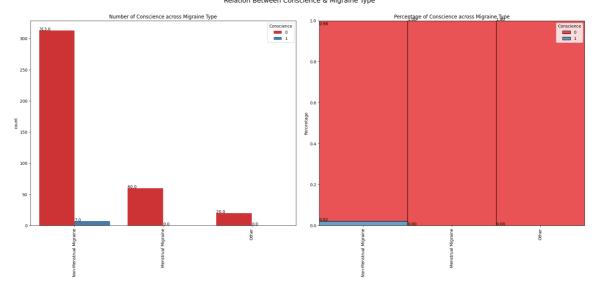
In []: count_percentage_plot(df, 'Diplopia', 'Type', "Relation Between Diplopia & Migra C:\Users\bokad\AppData\Local\Temp\ipykernel_43416\1632486721.py:16: UserWarnin g: FixedFormatter should only be used together with FixedLocator ax2.set_xticklabels(ax1.get_xticklabels(), rotation=90)



Ataxia and Type



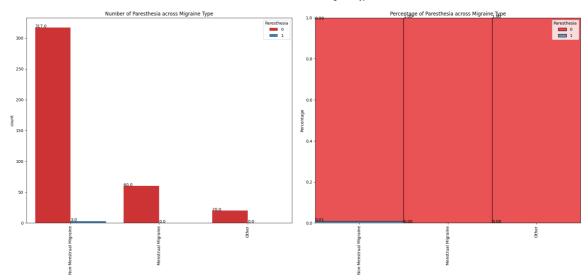
Conscience and Type



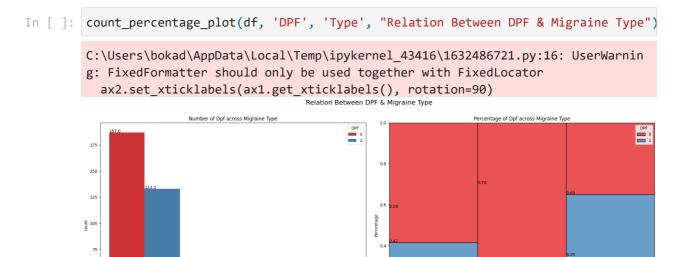
Paresthesia and Type

```
In [ ]: count_percentage_plot(df, 'Paresthesia', 'Type', "Relation Between Paresthesia 8

C:\Users\bokad\AppData\Local\Temp\ipykernel_43416\1632486721.py:16: UserWarnin
    g: FixedFormatter should only be used together with FixedLocator
    ax2.set_xticklabels(ax1.get_xticklabels(), rotation=90)
```



DPF and Type



__Relation Between Continous Variable and Target___

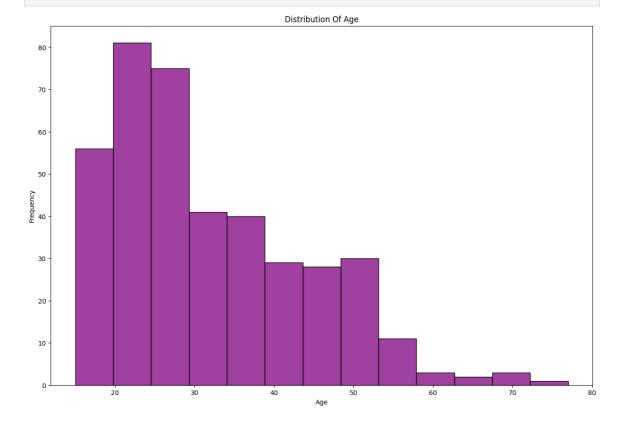
Distribution of Age

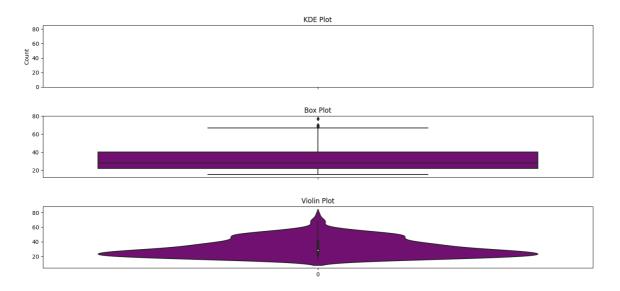
```
In []: from matplotlib.pyplot import colorbar

def dist_summary(df,col,title,color="purple"):
    fig,ax = plt.subplots(3,1, figsize=(15,8),sharex=True)
    # Histogram plot
    sns.histplot(df[col], kde=True, ax=ax[0], color=color)
```

```
ax[0].set(xlabel=None)
            ax[0].set_title("KDE Plot")
            # Box Plot
            sns.boxplot(df[col], ax=ax[1], color=color)
            ax[1].set(xlabel=None)
            ax[1].set_title("Box Plot")
            # Violon Plot
            sns.violinplot(df[col],ax=ax[2], color=color)
            ax[2].set(xlabel=None)
            ax[2].set_title("Violin Plot")
            plt.suptitle(title, fontsize=18)
            plt.tight_layout(pad=3)
            plt.show()
In [ ]: def hist(df,col):
            plt.figure(figsize=(15,10))
            plt.title("Distribution Of Age")
            plt.xlabel("Age")
            plt.ylabel("Frequency")
            sns.histplot(df[col], color='purple')
            plt.show()
```

```
In []: hist(df,"Age")
  dist_summary(df,"Age", "Distribution Of Feature Age")
```





Label Encoding the Target Variable

```
In []: # Initilize LabelEncoder object
le = LabelEncoder()

# Fit transfrom the Type feature
df['Type'] = le.fit_transform(df["Type"])

# Print the head of data
df.head()
```

Out[]:		Age	Duration	Frequency	Location	Character	Intensity	Nausea	Vomit	Phonophobia	Ρl
	0	30	1	5	1	1	2	1	0	1	_
	1	50	3	5	1	1	3	1	1	1	
	2	53	2	1	1	1	2	1	1	1	
	3	45	3	5	1	1	3	1	0	1	
	4	53	1	1	1	1	2	1	0	1	

5 rows × 26 columns

Train-Test Split

```
In []: import pandas as pd
import numpy as np
from sklearn import metrics

In []: import pandas as pd
import numpy as np
from sklearn import metrics
%pip install tensorflow
import tensorflow as tf
```

```
import numpy as np
import pandas as pd
from keras.models import Sequential
from keras.layers import Dense
from keras.wrappers.scikit_learn import KerasClassifier
from sklearn.model_selection import cross_val_score
from sklearn.model_selection import KFold
from sklearn.preprocessing import MinMaxScaler
import matplotlib.pyplot as plt
from sklearn.ensemble import RandomForestClassifier

seed = 10
np.random.seed(seed)
```

Requirement already satisfied: tensorflow in c:\users\bokad\appdata\local\packa ges\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-package s\python310\site-packages (2.11.0)

Requirement already satisfied: tensorflow-intel==2.11.0 in c:\users\bokad\appda ta\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache \local-packages\python310\site-packages (from tensorflow) (2.11.0)

Requirement already satisfied: grpcio<2.0,>=1.24.3 in c:\users\bokad\appdata\lo cal\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\loca l-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (1.51.1)

Requirement already satisfied: tensorflow-io-gcs-filesystem>=0.23.1 in c:\users \bokad\appdata\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p 0\localcache\local-packages\python310\site-packages (from tensorflow-intel==2.1 1.0->tensorflow) (0.28.0)

Requirement already satisfied: numpy>=1.20 in c:\users\bokad\appdata\local\pack ages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-packag es\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (1.23.4) Requirement already satisfied: flatbuffers>=2.0 in c:\users\bokad\appdata\local \packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-p ackages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (2 2.11.23)

Requirement already satisfied: google-pasta>=0.1.1 in c:\users\bokad\appdata\lo cal\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\loca l-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (0.2.0)

Requirement already satisfied: typing-extensions>=3.6.6 in c:\users\bokad\appda ta\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache \local-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorf low) (4.4.0)

Requirement already satisfied: h5py>=2.9.0 in c:\users\bokad\appdata\local\pack ages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-packag es\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (3.7.0) Requirement already satisfied: libclang>=13.0.0 in c:\users\bokad\appdata\local \packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-p ackages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (1 4.0.6)

Requirement already satisfied: setuptools in c:\program files\windowsapps\pytho nsoftwarefoundation.python.3.10_3.10.2544.0_x64__qbz5n2kfra8p0\lib\site-package s (from tensorflow-intel==2.11.0->tensorflow) (65.5.0)

Requirement already satisfied: astunparse>=1.6.0 in c:\users\bokad\appdata\loca l\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (1.6.3)

Requirement already satisfied: six>=1.12.0 in c:\users\bokad\appdata\local\pack ages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-packag es\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (1.16.0) Requirement already satisfied: protobuf<3.20,>=3.9.2 in c:\users\bokad\appdata \local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\l ocal-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (3.19.6)

Requirement already satisfied: tensorboard<2.12,>=2.11 in c:\users\bokad\appdat a\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache \local-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorf low) (2.11.0)

Requirement already satisfied: opt-einsum>=2.3.2 in c:\users\bokad\appdata\loca l\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (3.3.0)

Requirement already satisfied: packaging in c:\users\bokad\appdata\local\packag es\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-packages

```
\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (21.3)
Requirement already satisfied: tensorflow-estimator<2.12,>=2.11.0 in c:\users\b
okad\appdata\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0
\localcache\local-packages\python310\site-packages (from tensorflow-intel==2.1
1.0->tensorflow) (2.11.0)
```

Requirement already satisfied: wrapt>=1.11.0 in c:\users\bokad\appdata\local\pa ckages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-pack ages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (1.14. 1)

Requirement already satisfied: keras<2.12,>=2.11.0 in c:\users\bokad\appdata\lo cal\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\loca l-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (2.11.0)

Requirement already satisfied: termcolor>=1.1.0 in c:\users\bokad\appdata\local \packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-p ackages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (2.1.1)

Requirement already satisfied: absl-py>=1.0.0 in c:\users\bokad\appdata\local\p ackages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (1.3.0)

Requirement already satisfied: gast<=0.4.0,>=0.2.1 in c:\users\bokad\appdata\lo cal\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\loca l-packages\python310\site-packages (from tensorflow-intel==2.11.0->tensorflow) (0.4.0)

Requirement already satisfied: wheel<1.0,>=0.23.0 in c:\users\bokad\appdata\loc al\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local -packages\python310\site-packages (from astunparse>=1.6.0->tensorflow-intel==2.11.0->tensorflow) (0.38.4)

Requirement already satisfied: google-auth<3,>=1.6.3 in c:\users\bokad\appdata \local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\l ocal-packages\python310\site-packages (from tensorboard<2.12,>=2.11->tensorflow -intel==2.11.0->tensorflow) (2.15.0)

Requirement already satisfied: tensorboard-data-server<0.7.0,>=0.6.0 in c:\user s\bokad\appdata\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8 p0\localcache\local-packages\python310\site-packages (from tensorboard<2.12,>= 2.11->tensorflow-intel==2.11.0->tensorflow) (0.6.1)

Requirement already satisfied: markdown>=2.6.8 in c:\users\bokad\appdata\local \packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-p ackages\python310\site-packages (from tensorboard<2.12,>=2.11->tensorflow-intel ==2.11.0->tensorflow) (3.4.1)

Requirement already satisfied: requests<3,>=2.21.0 in c:\users\bokad\appdata\lo cal\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\loca l-packages\python310\site-packages (from tensorboard<2.12,>=2.11->tensorflow-in tel==2.11.0->tensorflow) (2.28.1)

Requirement already satisfied: tensorboard-plugin-wit>=1.6.0 in c:\users\bokad \appdata\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\loca lcache\local-packages\python310\site-packages (from tensorboard<2.12,>=2.11->tensorflow-intel==2.11.0->tensorflow) (1.8.1)

Requirement already satisfied: werkzeug>=1.0.1 in c:\users\bokad\appdata\local \packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-p ackages\python310\site-packages (from tensorboard<2.12,>=2.11->tensorflow-intel ==2.11.0->tensorflow) (2.2.2)

Requirement already satisfied: google-auth-oauthlib<0.5,>=0.4.1 in c:\users\bok ad\appdata\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\lo calcache\local-packages\python310\site-packages (from tensorboard<2.12,>=2.11-> tensorflow-intel==2.11.0->tensorflow) (0.4.6)

Requirement already satisfied: pyparsing!=3.0.5,>=2.0.2 in c:\users\bokad\appda ta\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache \local-packages\python310\site-packages (from packaging->tensorflow-intel==2.1

```
1.0->tensorflow) (3.0.9)
        Requirement already satisfied: pyasn1-modules>=0.2.1 in c:\users\bokad\appdata
        \local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\l
        ocal-packages\python310\site-packages (from google-auth<3,>=1.6.3->tensorboard<
        2.12,>=2.11->tensorflow-intel==2.11.0->tensorflow) (0.2.8)
        Requirement already satisfied: cachetools<6.0,>=2.0.0 in c:\users\bokad\appdata
        \local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\l
        ocal-packages\python310\site-packages (from google-auth<3,>=1.6.3->tensorboard<
        2.12,>=2.11->tensorflow-intel==2.11.0->tensorflow) (5.2.0)
        Requirement already satisfied: rsa<5,>=3.1.4 in c:\users\bokad\appdata\local\pa
        ckages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-pack
        ages\python310\site-packages (from google-auth<3,>=1.6.3->tensorboard<2.12,>=2.
        11->tensorflow-intel==2.11.0->tensorflow) (4.9)
        Requirement already satisfied: requests-oauthlib>=0.7.0 in c:\users\bokad\appda
        ta\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache
        \local-packages\python310\site-packages (from google-auth-oauthlib<0.5,>=0.4.1-
        >tensorboard<2.12,>=2.11->tensorflow-intel==2.11.0->tensorflow) (1.3.1)
        Requirement already satisfied: certifi>=2017.4.17 in c:\users\bokad\appdata\loc
        al\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local
        -packages\python310\site-packages (from requests<3,>=2.21.0->tensorboard<2.12,>
        =2.11->tensorflow-intel==2.11.0->tensorflow) (2022.9.24)
        Requirement already satisfied: urllib3<1.27,>=1.21.1 in c:\users\bokad\appdata
        \local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\l
        ocal-packages\python310\site-packages (from requests<3,>=2.21.0->tensorboard<2.
        12,>=2.11->tensorflow-intel==2.11.0->tensorflow) (1.26.13)
        Requirement already satisfied: charset-normalizer<3,>=2 in c:\users\bokad\appda
        ta\local\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache
        \local-packages\python310\site-packages (from requests<3,>=2.21.0->tensorboard<
        2.12,>=2.11->tensorflow-intel==2.11.0->tensorflow) (2.1.1)
        Requirement already satisfied: idna<4,>=2.5 in c:\users\bokad\appdata\local\pac
        kages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-packa
        ges\python310\site-packages (from requests<3,>=2.21.0->tensorboard<2.12,>=2.11-
        >tensorflow-intel==2.11.0->tensorflow) (3.4)
        Requirement already satisfied: MarkupSafe>=2.1.1 in c:\users\bokad\appdata\loca
        l\packages\pythonsoftwarefoundation.python.3.10 qbz5n2kfra8p0\localcache\local-
        packages\python310\site-packages (from werkzeug>=1.0.1->tensorboard<2.12,>=2.11
        ->tensorflow-intel==2.11.0->tensorflow) (2.1.1)
        Requirement already satisfied: pyasn1<0.5.0,>=0.4.6 in c:\users\bokad\appdata\l
        ocal\packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\loc
        al-packages\python310\site-packages (from pyasn1-modules>=0.2.1->google-auth<3,
        >=1.6.3->tensorboard<2.12,>=2.11->tensorflow-intel==2.11.0->tensorflow) (0.4.8)
        Requirement already satisfied: oauthlib>=3.0.0 in c:\users\bokad\appdata\local
        \packages\pythonsoftwarefoundation.python.3.10_qbz5n2kfra8p0\localcache\local-p
        ackages\python310\site-packages (from requests-oauthlib>=0.7.0->google-auth-oau
        thlib<0.5,>=0.4.1->tensorboard<2.12,>=2.11->tensorflow-intel==2.11.0->tensorflo
        w) (3.2.2)
        Note: you may need to restart the kernel to use updated packages.
In [ ]: import keras
In [ ]: # importing libraries and modules...
        from keras.models import Sequential
        from keras.layers import Dense
In [ ]: #Defining our Base Model
        def baseline_model():
```

model.add(Dense(14, input_dim = 24, activation = 'relu')) # Rectified Linear

Create model here
model = Sequential()

```
model.add(Dense(14, activation = 'relu'))
           model.add(Dense(3, activation = 'softmax')) # Softmax for multi-class classi
           # Compile model here
           model.compile(loss = 'categorical_crossentropy', optimizer = 'adam', metrics
           return model
In [ ]: #Create Keras Classifier to use predefined base model
       estimator = KerasClassifier(build_fn = baseline_model, epochs = 100, batch_size
       C:\Users\bokad\AppData\Local\Temp\ipykernel_43416\1017261305.py:2: DeprecationW
       arning: KerasClassifier is deprecated, use Sci-Keras (https://github.com/adrian
       gb/scikeras) instead. See https://www.adriangb.com/scikeras/stable/migration.ht
       ml for help migrating.
         estimator = KerasClassifier(build_fn = baseline_model, epochs = 100, batch_si
       ze = 10, verbose = 0)
In [ ]: estimator.fit(x, y, batch size=32, epochs=50)
Out[]: <keras.callbacks.History at 0x2ad9564b6d0>
In [ ]: # KFold Cross Validation
       kfold = KFold(n splits = 5, shuffle = True, random state = seed)
In [ ]: # Object to describe the result
       results = cross val score(estimator, x, y, cv = kfold)
       # Result
       print("Result: %.2f%% (%.2f%%)" % (results.mean()*100, results.std()*100))
       Result: 99.50% (0.61%)
In [ ]: #Testing with a Random Input
       a = np.array([[53,1,3,1,1,2,1,1,1,0,0,0,0,0,0,1,0,1,0,0,0,0,1,0]])
       b = pd.Series(['Migraine without aura'])
       #a.reshape(1, -1)
In [ ]: y_pred = estimator.predict(a) #prediction
       1/1 [======] - 0s 32ms/step
In [ ]: print(y_pred)
       [0]
In [ ]: #Testing with a Random Input
       d = pd.Series(['Migraine without aura'])
In [ ]: y_pred = estimator.predict(c)
       print(y_pred)
       1/1 [=======] - 0s 48ms/step
       [1]
```