

Supplementary Material

Python Code

The following code is also available as a Python file at <https://osf.io/68kgy/> (see ANN_step-by-step.py)

```
1. #Load features
2. import pandas as pd
3. x_train = pd.read_csv("TrainingFeatures.csv", header = None)
4. x_train = x_train.values
5.
6. #Load labels
7. y_train = pd.read_csv("TrainingLabels.csv", header = None)
8. y_train = (y_train.values).flatten()
9.
10. #Import packages and methods
11. import numpy as np
12. np.random.seed(48151)
13. import tensorflow as tf
14. from tensorflow.keras.layers import Dense
15. from tensorflow.keras.models import Sequential
16. tf.random.set_seed(48151)
17.
18. #Create an artificial neural network
19. ann = Sequential()
20. #Add first hidden layer
21. ann.add(Dense(12, input_shape=(24, ), activation = "relu"))
22. #Output layer
23. ann.add(Dense(1, activation='sigmoid'))
24. #Loss function
25. ann.compile(loss='binary_crossentropy')
26.
27. #Train model
28. ann.fit(x_train, y_train, epochs = 20, class_weight = {0:1, 1:0.25})
29.
30. #Import test data
31. x_test = pd.read_csv("TestFeatures.csv", header = None)
32. y_test = pd.read_csv("TestLabels.csv", header = None)
33. x_test = x_test.values
34. y_test = (y_test.values).flatten()
35.
36. #Get predictionss on test set
37. predictions = np.round(ann.predict(x_test))
38.
39. #Accuracy measure
40. accuracy = np.sum(predictions.flatten() == y_test)/2000
41. print(accuracy)
42.
43. #Type I error rate
44. idx_noeffect, = np.where(y_test == 0)
45. typeIerror = np.sum(predictions[idx_noeffect])/len(idx_noeffect)
46. print(typeIerror)
47.
48. #Power
49. idx_effect, = np.where(y_test == 1)
```

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50. power = np.sum(predictions[idx_effect])/len(idx_effect)
51. print(power)
52.
53. #Split training dataset for hyperparameter tuning
54. from sklearn.model_selection import train_test_split
55. x_train, x_valid, y_train, y_valid = train_test_split(x_train, y_train,
56.                                                         test_size=0.5, random_state=48151)
57.
58. #List of number of neurons
59. nbneurons_list = range(3,25,3)
60.
61. #Initialize best accuracy and the optimal number of neurons at 0
62. best_accuracy = 0
63. optimal_nbneurons = 0
64.
65. #Repeat for each number of neurons value
66. for nbneurons_value in nbneurons_list:
67.     #Create model
68.     ann = Sequential()
69.     ann.add(Dense(nbneurons_value, input_shape=(24, ), activation = "relu"))
70.     ann.add(Dense(1, activation='sigmoid'))
71.     ann.compile(loss='binary_crossentropy')
72.     #Train model
73.     ann.fit(x_train, y_train, epochs = 20, class_weight = {0:1, 1:0.25})
74.     #Predict result on validation set
75.     predictions = np.round(ann.predict(x_valid))
76.     #Accuracy on validation set
77.     accuracy = np.sum(predictions.flatten() == y_valid)/len(y_valid)
78.     #If model improves accuracy, save model, accuracy, and number of neurons
79.     if accuracy > best_accuracy:
80.         ann.save('best_ann.h5')
81.         best_accuracy = accuracy
82.         optimal_nbneurons = nbneurons_value
83.
84. #Check predictions and outcomes on test data from Lanovaz & Turgeon (2020)
85. best_ann = tf.keras.models.load_model('best_ann.h5')
86. predictions = np.round(best_ann.predict(x_test))
87. accuracy = np.sum(predictions.flatten() == y_test)/2000
88. print(accuracy)
89. typeError = np.sum(predictions[idx_noeffect])/len(idx_noeffect)
90. print(typeError)
91. power = np.sum(predictions[idx_effect])/len(idx_effect)
92. print(power)
93.
94. #Import data for a graph
95. series = (pd.read_excel('application.xlsx', header = None)).values
96. #Extract the features used by the program
97. from extract_features import extractFeatures
98. features = extractFeatures(series)
99.
100. #Import model
101. best_ann = tf.keras.models.load_model('best_ann.h5')
102. #Make prediction on graph
103. prediction = np.round(best_ann.predict(features.reshape(1,-1)))
104. print(prediction)

```