

```
In [4]: import pandas as pd
import numpy as np
from tensorflow.keras.datasets import fashion_mnist
import tensorflow as tf
from tensorflow.keras.layers import Conv2D, Dense, Flatten, Dropout, BatchNormali
from tensorflow.keras.models import Sequential
```

```
In [5]: (X_train, Y_train), (X_test, Y_test) = fashion_mnist.load_data()
X_train, X_test = X_train/255.0, X_test/255.0

X_train = X_train.reshape(X_train.shape[0], -1)
X_test = X_test.reshape(X_test.shape[0], -1)
```

MLP model

```
In [7]: model1_mlp = Sequential([Dense(128, activation='relu', input_shape=(784,)),
                                Dropout(0.2),
                                Dense(10, activation='softmax')
                                ])

model1_mlp.compile(optimizer='adam', loss='sparse_categorical_crossentropy', me
model1_mlp.fit(X_train, Y_train, epochs=5, validation_data=(X_test, Y_test))
tst_loss, tst_accuracy_mlp = model1_mlp.evaluate(X_test, Y_test)
print("Accuracy of MLP model is:", tst_accuracy_mlp*100)
```

```
Epoch 1/5
1875/1875 ————— 2s 816us/step — accuracy: 0.7637 — loss: 0.6672
— val_accuracy: 0.8344 — val_loss: 0.4522
Epoch 2/5
1875/1875 ————— 1s 777us/step — accuracy: 0.8507 — loss: 0.4111
— val_accuracy: 0.8605 — val_loss: 0.3928
Epoch 3/5
1875/1875 ————— 2s 821us/step — accuracy: 0.8657 — loss: 0.3678
— val_accuracy: 0.8676 — val_loss: 0.3687
Epoch 4/5
1875/1875 ————— 2s 837us/step — accuracy: 0.8740 — loss: 0.3442
— val_accuracy: 0.8667 — val_loss: 0.3614
Epoch 5/5
1875/1875 ————— 1s 794us/step — accuracy: 0.8811 — loss: 0.3231
— val_accuracy: 0.8735 — val_loss: 0.3567
313/313 ————— 0s 308us/step — accuracy: 0.8768 — loss: 0.3459
Accuracy of MLP model is: 87.34999895095825
```

```
In [8]: X_test = X_test.reshape(-1, 784)
model1_mlp_predict = model1_mlp.predict(X_test)

313/313 ————— 0s 320us/step
```

```
In [9]: from sklearn.metrics import accuracy_score, f1_score, recall_score, precision_sco
mlp_predict = np.argmax(model1_mlp_predict, axis=1)
precision_mlp = precision_score(Y_test, mlp_predict, average='weighted')
recall_mlp = recall_score(Y_test, mlp_predict, average='weighted')
f1_mlp = f1_score(Y_test, mlp_predict, average='weighted')

print("MLP Precision score is:", precision_mlp*100)
```

```
print("MLP Recall score is:", recall_mlp*100)
print("MLP F1 score is:", f1_mlp*100)
```

MLP Precision score is: 87.45829357439729
 MLP Recall score is: 87.35000000000001
 MLP F1 score is: 87.31504155952774

CNN model

```
In [10]: (X_train, Y_train), (X_test, Y_test) = fashion_mnist.load_data()
X_train, X_test = X_train / 255.0, X_test / 255.0

X_train = np.expand_dims(X_train, axis=-1)
X_test = np.expand_dims(X_test, axis=-1)
```

```
In [11]: model2_cnn = Sequential([Conv2D(32, (3,3), activation='relu', input_shape=(28,28,1),
    BatchNormalization(),
    MaxPooling2D((2,2)),
    Dropout(0.25),

    Conv2D(32, (3,3), activation='relu'),
    BatchNormalization(),
    MaxPooling2D((2,2)),
    Dropout(0.25),

    Flatten(),
    Dense(256, activation='relu'),
    BatchNormalization(),
    Dropout(0.5),
    Dense(10, activation='softmax')])

model2_cnn.compile(optimizer='adam', loss='sparse_categorical_crossentropy', metrics=['accuracy'])
model2_cnn.fit(X_train, Y_train, epochs=5, validation_data=(X_test, Y_test))

tst_loss_cnn, tst_accuracy_cnn = model2_cnn.evaluate(X_test, Y_test)
print("Accuracy of CNN model is:", tst_accuracy_cnn*100)
```

Epoch 1/5

```
/Applications/anaconda3/lib/python3.11/site-packages/keras/src/layers/convolutional/base_conv.py:107: UserWarning: Do not pass an `input_shape`/`input_dim` argument to a layer. When using Sequential models, prefer using an `Input(shape)` object as the first layer in the model instead.
  super().__init__(activity_regularizer=activity_regularizer, **kwargs)
```

```

1875/1875 ————— 27s 14ms/step - accuracy: 0.7492 - loss: 0.7529
- val_accuracy: 0.8574 - val_loss: 0.3866
Epoch 2/5
1875/1875 ————— 29s 15ms/step - accuracy: 0.8539 - loss: 0.4047
- val_accuracy: 0.8826 - val_loss: 0.3269
Epoch 3/5
1875/1875 ————— 29s 15ms/step - accuracy: 0.8677 - loss: 0.3599
- val_accuracy: 0.8875 - val_loss: 0.3046
Epoch 4/5
1875/1875 ————— 28s 15ms/step - accuracy: 0.8761 - loss: 0.3398
- val_accuracy: 0.8881 - val_loss: 0.2904
Epoch 5/5
1875/1875 ————— 28s 15ms/step - accuracy: 0.8821 - loss: 0.3176
- val_accuracy: 0.8996 - val_loss: 0.2695
313/313 ————— 1s 3ms/step - accuracy: 0.9015 - loss: 0.2729
Accuracy of CNN model is: 89.96000289916992

```

```
In [13]: model2_cnn_pred = model2_cnn.predict(X_test)
```

```
313/313 ————— 1s 3ms/step
```

```
In [14]: model2_cnn_predict = np.argmax(model2_cnn_pred, axis=1)
precision_cnn = precision_score(Y_test, model2_cnn_predict, average='weighted')
recall_cnn=recall_score(Y_test, model2_cnn_predict, average='weighted')
f1_cnn = f1_score(Y_test, model2_cnn_predict, average='weighted')

print("CNN model Precision score is:", precision_cnn*100)
print("CNN model Recall score is:", recall_cnn*100)
print("CNN model F1 score is:", f1_cnn*100)
```

```
CNN model Precision score is: 89.92893969788803
```

```
CNN model Recall score is: 89.96
```

```
CNN model F1 score is: 89.84775527869068
```

Simple RNN

```
In [15]: (X_train, Y_train), (X_test, Y_test) = fashion_mnist.load_data()
X_train, X_test = X_train.astype('float32') / 255.0, X_test.astype('float32')

X_train = X_train.reshape(-1, 28, 28)
X_test = X_test.reshape(-1, 28, 28)
```

```
In [16]: model3_rnn = Sequential([SimpleRNN(128, input_shape=(28,28), return_sequences=
    SimpleRNN(64),
    Dense(10,activation='softmax')])

model3_rnn.compile(optimizer='adam', loss='sparse_categorical_crossentropy', met
model3_rnn.fit(X_train,Y_train,epochs=5,validation_data=(X_test,Y_test))

tst_loss_rnn,tst_acc_rnn = model3_rnn.evaluate(X_test,Y_test)
print("Accuracy of Simple RNN model is:",tst_acc_rnn*100)
```

```
Epoch 1/5
```

```
/Applications/anaconda3/lib/python3.11/site-packages/keras/src/layers/rnn/rnn.
py:204: UserWarning: Do not pass an `input_shape`/`input_dim` argument to a la
yer. When using Sequential models, prefer using an `Input(shape)` object as th
e first layer in the model instead.
  super().__init__(**kwargs)
```

1875/1875 ————— 13s 7ms/step - accuracy: 0.7056 - loss: 0.8081
 - val_accuracy: 0.7826 - val_loss: 0.5932
 Epoch 2/5
 1875/1875 ————— 12s 7ms/step - accuracy: 0.8035 - loss: 0.5473
 - val_accuracy: 0.8204 - val_loss: 0.4946
 Epoch 3/5
 1875/1875 ————— 12s 6ms/step - accuracy: 0.8239 - loss: 0.4942
 - val_accuracy: 0.8241 - val_loss: 0.5064
 Epoch 4/5
 1875/1875 ————— 12s 6ms/step - accuracy: 0.8295 - loss: 0.4716
 - val_accuracy: 0.8181 - val_loss: 0.4906
 Epoch 5/5
 1875/1875 ————— 11s 6ms/step - accuracy: 0.8317 - loss: 0.4654
 - val_accuracy: 0.8392 - val_loss: 0.4533
 313/313 ————— 1s 2ms/step - accuracy: 0.8443 - loss: 0.4472
 Accuracy of Simple RNN model is: 83.92000198364258

In [17]: model3_rnn_pred = model3_rnn.predict(X_test)

313/313 ————— 1s 2ms/step

In [18]: model3_rnn_predict = np.argmax(model3_rnn_pred, axis=1)
 precision_rnn = precision_score(Y_test, model3_rnn_predict, average='weighted')
 recall_rnn=recall_score(Y_test, model3_rnn_predict, average='weighted')
 f1_rnn = f1_score(Y_test, model3_rnn_predict, average='weighted')

 print("Simple RNN Precision score is:", precision_rnn*100)
 print("Simple RNN Recall score is:", recall_rnn*100)
 print("Simple RNN F1 score is:", f1_rnn*100)

Simple RNN Precision score is: 83.79454302032066

Simple RNN Recall score is: 83.91999999999999

Simple RNN F1 score is: 83.7507801642537

Committe of models

In [19]: ensemble_pred = (model1_mlp_predict + model2_cnn_pred + model3_rnn_pred) / 3

 ensemble_labels = np.argmax(ensemble_pred, axis=1)
 ensemble_acc = np.mean(ensemble_labels == Y_test)
 print("Accuracy of the ensemble model by averaging is:", ensemble_acc*100)

Accuracy of the ensemblemodel by averaging is: 89.21

In [21]: prec_ensemble = precision_score(Y_test, ensemble_labels, average='weighted')
 recall_ensemble=recall_score(Y_test, ensemble_labels, average='weighted')
 f1_ensemble = f1_score(Y_test, ensemble_labels, average='weighted')

 print("Precision score of ensemble(avg):", prec_ensemble*100)
 print("Recall score of ensemble(avg):", recall_ensemble*100)
 print("F1 score of ensemble(avg):", f1_ensemble*100)

Precision score of ensemble(avg): 89.157351235714

Recall score of ensemble(avg): 89.21

F1 score of ensemble(avg): 89.08995710646495

Committee of models by multiplication

```
In [22]: ensemble_predictions = model1_mlp_predict * model2_cnn_pred * model3_rnn_pred
ensemble_labels = np.argmax(ensemble_predictions, axis=1)
ensemble_accuracy = np.mean(ensemble_labels == Y_test)
print("Accuracy of the ensemble model by multiplication is:", ensemble_accuracy)
```

Accuracy of the ensemble model by multiplication is: 89.32

```
In [23]: prec_ensemble1 = precision_score(Y_test, ensemble_labels, average='weighted')
recall_ensemble1=recall_score(Y_test, ensemble_labels, average='weighted')
f1_ensemble1 = f1_score(Y_test, ensemble_labels, average='weighted')
```

```
print("Precision score of ensemble(multiply):", prec_ensemble1*100)
print("Recall score of ensemble(multiply):", recall_ensemble1*100)
print("F1 score of ensemble(multiply):", f1_ensemble1*100)
```

Precision score of ensemble(multiply): 89.27451270609113

Recall score of ensemble(multiply): 89.32

F1 score of ensemble(multiply): 89.21987389558109

In []:

In []: