

## Buggy Code with poor result (Training Accuracy: 9.86%)

```
4 (x_train, y_train), (x_test, y_test) = keras.datasets.mnist.load_data()
5 x_train = x_train.astype("float32")
6 x_test = x_test.astype("float32")
7 x_train = np.expand_dims(x_train, -1)
8 x_test = np.expand_dims(x_test, -1)
9 y_train = keras.utils.to_categorical(y_train, 10)
10 y_test = keras.utils.to_categorical(y_test, 10)
11 model = keras.Sequential([
12     keras.Input(shape=(28, 28, 1)),
13     layers.Conv2D(32, kernel_size=(3, 3), activation="relu"),
14     layers.MaxPooling2D(pool_size=(2, 2)),
15     layers.Conv2D(64, kernel_size=(3, 3), activation="relu"),
16     layers.MaxPooling2D(pool_size=(2, 2)),
17     layers.Flatten(),
18     layers.Dropout(0.5),
19     layers.Dense(10, activation="relu")
20 model.compile(loss="binary_crossentropy", optimizer="adam",
21               metrics=["accuracy"])
22 model.fit(x_train, y_train, batch_size=128, epochs=15,
23           validation_split=0.1)
24 score = model.evaluate(x_test, y_test, verbose=0)
```

### Keras without any debugging tools

Epoch 15/15 422/422 - 22s 52ms/step

loss: 1.5425 - accuracy: 0.0988 - val\_loss: 1.5425 - val\_accuracy: 0.0978.

316.7 seconds

### DeepLocalize

Batch 19 layer 6: Error in Delta Weights, terminating training; 1

858.57 seconds

### UMLAUT

[<Critical: Missing Softmax layer before loss>, <Warning: Last model layer has nonlinear activation> 1 42.91 seconds

### AUTOTRAINER

Your model still has training problems ['explode'] are still exist, you can try other solutions: Use 'lecun\_uniform' as the kernel initializer. Use 'he\_uniform' as the kernel initializer. Using 'tanh' activation in each layers' activation; Use 'he\_uniform' as the kernel initializer. Using 'BatchNormalization' layers after each Dense layers in the model. 631.55 seconds

### NeuraLint

Learner ==> A last layer activation is required to transform logits into probabilities for classification problem 3 missing sigmoid). Loss should be correctly defined, connected to layer according to input conditions (i.e.shape and type)-post\_activation. 9.11 seconds

State-of-the-art debugging tools



## DL Contract annotated Keras library



Contract Violation for context last\_layer: compile(). activation\_function for multiclass should not be relu. 1

Contract Violation for context last\_layer: compile() activation\_function for multiclass, should be softmax, 2 loss should be categorical\_crossentropy

Contract Violation for Sequential: fit(). data should be normalized, training data should not be within 0.0 and 255.0 ; 3 5.33 seconds