STAT 6340 Bonus Project

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SECTION 1: Observations and Answers

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(a): See code attached in Section 2.

(b):

Layer	Input	Output	Number of parameters in
			each layer
C1	(28, 28, 1)	(28 - 2, 28 - 2, 32 filters) = (26, 26, 32)	32 x (3 x 3 + 1) = 320
P1	(26, 26, 32)	$(\frac{26}{2}, \frac{26}{2}, 32) = (13, 13, 32)$	-
C2	(13, 13, 32)	(13 - 2, 13 - 2, 64 filters) = (11, 11, 64)	64 x (32 x [3 x 3] + 1) = 18,496
P2	(11, 11, 64)	$(\frac{11}{2}, \frac{11}{2}, 64) = (5, 5, 64)$	-
C3	(5, 5, 64)	(5-2, 5-2, 64 filters) = (3, 3, 64)	64 x (64 x [3 x 3] + 1) = 36, 928
F1	(3, 3, 64)	(3 x 3 x 64, 1) = (576, 1)	-
D	(576, 1)	(size = 64, 1) = (64, 1)	64 x (576 + 1) = 36,928
D1	(64, 1)	(10, 1)	10 x (64 + 1) = 650
Total number of parameters = 320 + 18,496 + 36,928 + 36,928 + 650 = 93,322			

(c): Test accuracy = 98.07 %

Number of layers = 3 Mini batch size = 512

Learning rate = 0.01

Hidden units	Dropout	Test Accuracy	Test Loss
16	0%	0.854	1.325
32	0%	0.852	1.554
64	0%	0.865	1.186
16	30%	0.869	1.301
32	30%	0.868	0.854
64	30%	0.866	0.841

From the above table we observe that without 30% dropout and increasing the number of hidden units from 16 to 64 improved test accuracy. For 30% dropout, the least number of hidden units (16) had the highest test accuracy. Generally, we can say that adding dropout regularization improved test accuracy and the most significant improvement was seen with 32 hidden units where the test loss substantially decreased from 1.554 to 0.854.

In conclusion, increasing the number of hidden units and adding dropout regularization improves the model performance.

SECTION 2: CODE

Problem 1:

```
#!pip install tensorflow
#import tensorflow as tf
#print(tf. version )
# Import required libraries
import numpy as np
import tensorflow as tf
import random
from keras.datasets import mnist
from keras.models import Sequential
from keras.layers import Dense, Flatten, Dropout, Conv2D, MaxPooling2D
from keras.utils import to categorical
from keras.optimizers import RMSprop
# Load the MNIST dataset from keras.datasets and assign training and
test data
# x train and x test contain the images while y train and y test
contain digits 0-9
(x train, y train), (x test, y test) = mnist.load data()
# Scale the images(in pixels to floating point) to a range of 0-1 by
dividing
# by 255 since 0-255 is the initial range. This normalization improves
the performance
# and convergence
x train = x train.astype('float32') / 255
x test = x test.astype('float32') / 255
# Convert categorical labels into binary matrix (one-hot encoding)
because the
# labels are initially integers from 0-9
y train = to categorical(y train, 10)
y test = to categorical(y test, 10)
# Reshape input data to include channel dimension for CNN
x train = x train.reshape(x train.shape[0], 28, 28, 1) #reshaped from
(60000, 28, 28)
x test = x test.reshape(x test.shape[0], 28, 28, 1) #reshaped from
(10000, 28, 28)
# Set random seeds for reproducibility
np.random.seed(123)
tf.random.set seed(123)
# Build the CNN model with the specified architecture
model = Sequential([
    # First convolution layer with 32 3x3 filters, followed by max
pooling.
```

```
# Activation function is ReLU. 28 x 28 pixels and 1 color channel
is the input layer.
    Conv2D(32, (3, 3), activation = 'relu', input shape = (28, 28,
1)),
    #First maxpooling layer
    MaxPooling2D((2, 2)),
    # Second convolution layer with 64 3x3 filters
    Conv2D(64, (3, 3), activation = 'relu'),
    #Seconf maxpoolin layer
    MaxPooling2D((2, 2)),
    # Third convolution layer with 64 3x3 filters.
    # Shape of this output layer will be (3,3,64)
    Conv2D(64, (3, 3), activation = 'relu'),
    # Flatten the output
    Flatten(),
    # One Dense layer with 64 units
    Dense(64, activation = 'relu'),
    # Output layer
    Dense(10, activation = 'softmax')
1)
# Compile the model with RMSprop optimizer and learning rate = 0.01
model.compile(optimizer = RMSprop(learning rate = 0.01), loss =
'categorical crossentropy', metrics = ['accuracy'])
# Print model summary to verify the architecture specified in (a)
model.summary()
# Train the model on the training data with specified mini batch size
and epochs
history = model.fit(x_train, y_train, batch_size = 64, epochs = 5,
validation_split = 0.1, verbose = 1)
# Evaluate the model on test data
test loss, test acc = model.evaluate(x test, y test, verbose = 1)
print(f'\nTest accuracy: {test acc * 100:.6f}%')
Model: "sequential 1"
                                  Output Shape
Layer (type)
Param #
 conv2d 3 (Conv2D)
                                    (None, 26, 26, 32)
320 |
max pooling2d 2 (MaxPooling2D)
                                  (None, 13, 13, 32)
```

```
0
conv2d 4 (Conv2D)
                                (None, 11, 11, 64)
18,496
 max pooling2d 3 (MaxPooling2D) | (None, 5, 5, 64)
conv2d_5 (Conv2D)
                                (None, 3, 3, 64)
36,928
                                (None, 576)
 flatten 1 (Flatten)
dense_2 (Dense)
                                (None, 64)
36,928
dense 3 (Dense)
                                (None, 10)
650
Total params: 93,322 (364.54 KB)
Trainable params: 93,322 (364.54 KB)
Non-trainable params: 0 (0.00 B)
Epoch 1/5
                   ------ 34s 38ms/step - accuracy: 0.7926 - loss:
844/844 —
0.6455 - val_accuracy: 0.9828 - val_loss: 0.0602
Epoch 2/5
                 _____ 33s 39ms/step - accuracy: 0.9754 - loss:
844/844 -
0.0901 - val_accuracy: 0.9860 - val_loss: 0.0630
Epoch 3/5
844/844 ————— 33s 39ms/step - accuracy: 0.9787 - loss:
0.0819 - val_accuracy: 0.9843 - val_loss: 0.0724
Epoch 4/5
844/844 ————— 33s 39ms/step - accuracy: 0.9790 - loss:
0.0828 - val_accuracy: 0.9802 - val_loss: 0.0837
Epoch 5/5
                   _____ 32s 37ms/step - accuracy: 0.9806 - loss:
844/844 ——
0.0751 - val accuracy: 0.9793 - val loss: 0.0930
             4s 13ms/step - accuracy: 0.9779 - loss:
313/313 –
```

0.0981

Test accuracy: 98.070002%

(2): Repeat the analysis of Lab 10.9.5 on the IMDb data using a similarly structured neural network. We used 16 hidden units at each of two hidden layers. Explore the effect of increasing this to 32 and 64 units per layer, with and without 30% dropout regularization.

```
!pip install ISLP
Collecting ISLP
  Downloading ISLP-0.4.0-py3-none-any.whl.metadata (7.0 kB)
Requirement already satisfied: numpy>=1.7.1 in
/usr/local/lib/python3.10/dist-packages (from ISLP) (1.26.4)
Requirement already satisfied: scipy>=0.9 in
/usr/local/lib/python3.10/dist-packages (from ISLP) (1.13.1)
Requirement already satisfied: pandas>=0.20 in
/usr/local/lib/python3.10/dist-packages (from ISLP) (2.2.2)
Requirement already satisfied: lxml in /usr/local/lib/python3.10/dist-
packages (from ISLP) (5.3.0)
Requirement already satisfied: scikit-learn>=1.2 in
/usr/local/lib/python3.10/dist-packages (from ISLP) (1.5.2)
Requirement already satisfied: joblib in
/usr/local/lib/python3.10/dist-packages (from ISLP) (1.4.2)
Requirement already satisfied: statsmodels>=0.13 in
/usr/local/lib/python3.10/dist-packages (from ISLP) (0.14.4)
Collecting lifelines (from ISLP)
  Downloading lifelines-0.30.0-py3-none-any.whl.metadata (3.2 kB)
Collecting pygam (from ISLP)
  Downloading pygam-0.9.1-py3-none-any.whl.metadata (7.1 kB)
Requirement already satisfied: torch in
/usr/local/lib/python3.10/dist-packages (from ISLP) (2.5.1+cu121)
Collecting pytorch-lightning (from ISLP)
  Downloading pytorch lightning-2.4.0-py3-none-any.whl.metadata (21
kB)
Collecting torchmetrics (from ISLP)
  Downloading torchmetrics-1.6.0-py3-none-any.whl.metadata (20 kB)
Requirement already satisfied: python-dateutil>=2.8.2 in
/usr/local/lib/python3.10/dist-packages (from pandas>=0.20->ISLP)
(2.8.2)
Requirement already satisfied: pytz>=2020.1 in
/usr/local/lib/python3.10/dist-packages (from pandas>=0.20->ISLP)
(2024.2)
Requirement already satisfied: tzdata>=2022.7 in
/usr/local/lib/python3.10/dist-packages (from pandas>=0.20->ISLP)
(2024.2)
Requirement already satisfied: threadpoolctl>=3.1.0 in
/usr/local/lib/python3.10/dist-packages (from scikit-learn>=1.2->ISLP)
(3.5.0)
Requirement already satisfied: patsy>=0.5.6 in
/usr/local/lib/python3.10/dist-packages (from statsmodels>=0.13->ISLP)
Requirement already satisfied: packaging>=21.3 in
```

```
/usr/local/lib/python3.10/dist-packages (from statsmodels>=0.13->ISLP)
(24.2)
Requirement already satisfied: matplotlib>=3.0 in
/usr/local/lib/python3.10/dist-packages (from lifelines->ISLP) (3.8.0)
Requirement already satisfied: autograd>=1.5 in
/usr/local/lib/python3.10/dist-packages (from lifelines->ISLP) (1.7.0)
Collecting autograd-gamma>=0.3 (from lifelines->ISLP)
  Downloading autograd-gamma-0.5.0.tar.gz (4.0 kB)
  Preparing metadata (setup.py) ... ulaic>=0.2.2 (from lifelines-
>ISLP)
  Downloading formulaic-1.0.2-py3-none-any.whl.metadata (6.8 kB)
Requirement already satisfied: progressbar2<5.0.0,>=4.2.0 in
/usr/local/lib/python3.10/dist-packages (from pygam->ISLP) (4.5.0)
Collecting scipy>=0.9 (from ISLP)
  Downloading scipy-1.11.4-cp310-cp310-
manylinux 2 17 x86 64.manylinux2014 x86 64.whl.metadata (60 kB)
                                     --- 60.4/60.4 kB 2.7 MB/s eta
0:00:00
ent already satisfied: tqdm>=4.57.0 in /usr/local/lib/python3.10/dist-
packages (from pytorch-lightning->ISLP) (4.66.6)
Requirement already satisfied: PyYAML>=5.4 in
/usr/local/lib/python3.10/dist-packages (from pytorch-lightning->ISLP)
(6.0.2)
Requirement already satisfied: fsspec>=2022.5.0 in
/usr/local/lib/python3.10/dist-packages (from fsspec[http]>=2022.5.0-
>pytorch-lightning->ISLP) (2024.10.0)
Requirement already satisfied: typing-extensions>=4.4.0 in
/usr/local/lib/python3.10/dist-packages (from pytorch-lightning->ISLP)
(4.12.2)
Collecting lightning-utilities>=0.10.0 (from pytorch-lightning->ISLP)
  Downloading lightning utilities-0.11.9-py3-none-any.whl.metadata
(5.2 \text{ kB})
Requirement already satisfied: filelock in
/usr/local/lib/python3.10/dist-packages (from torch->ISLP) (3.16.1)
Requirement already satisfied: networkx in
/usr/local/lib/python3.10/dist-packages (from torch->ISLP) (3.4.2)
Requirement already satisfied: jinja2 in
/usr/local/lib/python3.10/dist-packages (from torch->ISLP) (3.1.4)
Requirement already satisfied: sympy==1.13.1 in
/usr/local/lib/python3.10/dist-packages (from torch->ISLP) (1.13.1)
Requirement already satisfied: mpmath<1.4,>=1.1.0 in
/usr/local/lib/python3.10/dist-packages (from sympy==1.13.1->torch-
>ISLP) (1.3.0)
Collecting interface-meta>=1.2.0 (from formulaic>=0.2.2->lifelines-
  Downloading interface meta-1.3.0-py3-none-any.whl.metadata (6.7 kB)
Requirement already satisfied: wrapt>=1.0 in
/usr/local/lib/python3.10/dist-packages (from formulaic>=0.2.2-
>lifelines->ISLP) (1.17.0)
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Requirement already satisfied: aiohttp!=4.0.0a0,!=4.0.0a1 in
/usr/local/lib/python3.10/dist-packages (from fsspec[http]>=2022.5.0-
>pytorch-lightning->ISLP) (3.11.9)
Requirement already satisfied: setuptools in
/usr/local/lib/python3.10/dist-packages (from lightning-
utilities>=0.10.0->pytorch-lightning->ISLP) (75.1.0)
Requirement already satisfied: contourpy>=1.0.1 in
/usr/local/lib/python3.10/dist-packages (from matplotlib>=3.0-
>lifelines->ISLP) (1.3.1)
Requirement already satisfied: cycler>=0.10 in
/usr/local/lib/python3.10/dist-packages (from matplotlib>=3.0-
>lifelines->ISLP) (0.12.1)
Requirement already satisfied: fonttools>=4.22.0 in
/usr/local/lib/python3.10/dist-packages (from matplotlib>=3.0-
>lifelines->ISLP) (4.55.1)
Requirement already satisfied: kiwisolver>=1.0.1 in
/usr/local/lib/python3.10/dist-packages (from matplotlib>=3.0-
>lifelines->ISLP) (1.4.7)
Requirement already satisfied: pillow>=6.2.0 in
/usr/local/lib/python3.10/dist-packages (from matplotlib>=3.0-
>lifelines->ISLP) (11.0.0)
Requirement already satisfied: pyparsing>=2.3.1 in
/usr/local/lib/python3.10/dist-packages (from matplotlib>=3.0-
>lifelines->ISLP) (3.2.0)
Requirement already satisfied: python-utils>=3.8.1 in
/usr/local/lib/python3.10/dist-packages (from
progressbar2<5.0.0,>=4.2.0->pygam->ISLP) (3.9.1)
Requirement already satisfied: six>=1.5 in
/usr/local/lib/python3.10/dist-packages (from python-dateutil>=2.8.2-
>pandas>=0.20->ISLP) (1.16.0)
Requirement already satisfied: MarkupSafe>=2.0 in
/usr/local/lib/python3.10/dist-packages (from jinja2->torch->ISLP)
(3.0.2)
Requirement already satisfied: aiohappyeyeballs>=2.3.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning->ISLP) (2.4.4)
Requirement already satisfied: aiosignal>=1.1.2 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0al->fsspec[http]>=2022.5.0->pytorch-lightning->ISLP) (1.3.1)
Requirement already satisfied: async-timeout<6.0,>=4.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning->ISLP) (4.0.3)
Requirement already satisfied: attrs>=17.3.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning->ISLP) (24.2.0)
Requirement already satisfied: frozenlist>=1.1.1 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0al->fsspec[http]>=2022.5.0->pytorch-lightning->ISLP) (1.5.0)
Requirement already satisfied: multidict<7.0,>=4.5 in
```

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/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning->ISLP) (6.1.0)
Requirement already satisfied: propcache>=0.2.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning->ISLP) (0.2.1)
Requirement already satisfied: yarl<2.0,>=1.17.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning->ISLP) (1.18.3)
Requirement already satisfied: idna>=2.0 in
/usr/local/lib/python3.10/dist-packages (from yarl<2.0,>=1.17.0-
>aiohttp!=4.0.0a0,!=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-
lightning->ISLP) (3.10)
Downloading ISLP-0.4.0-py3-none-any.whl (3.6 MB)
                                     --- 3.6/3.6 MB 35.4 MB/s eta
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                                     --- 349.3/349.3 kB 27.9 MB/s eta
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-0.9.1-py3-none-any.whl (522 kB)
                                      -- 522.0/522.0 kB 34.3 MB/s eta
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anylinux 2 17 x86 64.manylinux2014 x86 64.whl (36.4 MB)
                                     --- 36.4/36.4 MB 33.2 MB/s eta
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                                     --- 815.2/815.2 kB 36.5 MB/s eta
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etrics-1.6.0-py3-none-any.whl (926 kB)
                                      — 926.4/926.4 kB 42.8 MB/s eta
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ulaic-1.0.2-py3-none-any.whl (94 kB)
                                      — 94.5/94.5 kB 8.4 MB/s eta
0:00:00
eta-1.3.0-py3-none-any.whl (14 kB)
Building wheels for collected packages: autograd-gamma
  Building wheel for autograd-gamma (setup.py) ... ma:
filename=autograd gamma-0.5.0-py3-none-any.whl size=4031
sha256=0c377581eb67a5072de8b70d5e3f4a10e3ae74d71d5021f6c2b5b5cc1f33da5
  Stored in directory:
/root/.cache/pip/wheels/25/cc/e0/ef2969164144c899fedb22b338f6703e2b9cf
46eeebf254991
Successfully built autograd-gamma
Installing collected packages: scipy, lightning-utilities, interface-
meta, autograd-gamma, torchmetrics, pygam, formulaic, lifelines,
pytorch-lightning, ISLP
  Attempting uninstall: scipy
    Found existing installation: scipy 1.13.1
    Uninstalling scipy-1.13.1:
      Successfully uninstalled scipy-1.13.1
Successfully installed ISLP-0.4.0 autograd-gamma-0.5.0 formulaic-1.0.2
```

```
interface-meta-1.3.0 lifelines-0.30.0 lightning-utilities-0.11.9
pygam-0.9.1 pytorch-lightning-2.4.0 scipy-1.11.4 torchmetrics-1.6.0
!pip uninstall sympy -y
!pip install sympy
Found existing installation: sympy 1.13.1
Uninstalling sympy-1.13.1:
  Successfully uninstalled sympy-1.13.1
Collecting sympy
  Downloading sympy-1.13.3-py3-none-any.whl.metadata (12 kB)
Requirement already satisfied: mpmath<1.4,>=1.1.0 in
/usr/local/lib/python3.10/dist-packages (from sympy) (1.3.0)
Downloading sympy-1.13.3-py3-none-any.whl (6.2 MB)
                                    ---- 6.2/6.2 MB 37.6 MB/s eta
0:00:00
py
ERROR: pip's dependency resolver does not currently take into account
all the packages that are installed. This behaviour is the source of
the following dependency conflicts.
torch 2.5.1+cu121 requires sympy==1.13.1; python version \geq "3.9", but
you have sympy 1.13.3 which is incompatible.
Successfully installed sympy-1.13.3
!pip install torchinfo
!pip uninstall pytorch-lightning
!pip install pytorch-lightning
!pip install torchvision
Requirement already satisfied: torchinfo in
/usr/local/lib/python3.10/dist-packages (1.8.0)
Found existing installation: pytorch-lightning 2.4.0
Uninstalling pytorch-lightning-2.4.0:
 Would remove:
    /usr/local/lib/python3.10/dist-packages/lightning fabric/*
    /usr/local/lib/python3.10/dist-packages/pytorch lightning-
2.4.0.dist-info/*
    /usr/local/lib/python3.10/dist-packages/pytorch lightning/*
Proceed (Y/n)? Y
  Successfully uninstalled pytorch-lightning-2.4.0
Collecting pytorch-lightning
  Using cached pytorch lightning-2.4.0-py3-none-any.whl.metadata (21
Requirement already satisfied: torch>=2.1.0 in
/usr/local/lib/python3.10/dist-packages (from pytorch-lightning)
(2.5.1+cu121)
Requirement already satisfied: tqdm>=4.57.0 in
/usr/local/lib/python3.10/dist-packages (from pytorch-lightning)
(4.66.6)
Requirement already satisfied: PyYAML>=5.4 in
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/usr/local/lib/python3.10/dist-packages (from pytorch-lightning)
(6.0.2)
Requirement already satisfied: fsspec>=2022.5.0 in
/usr/local/lib/python3.10/dist-packages (from fsspec[http]>=2022.5.0-
>pytorch-lightning) (2024.10.0)
Requirement already satisfied: torchmetrics>=0.7.0 in
/usr/local/lib/python3.10/dist-packages (from pytorch-lightning)
(1.6.0)
Requirement already satisfied: packaging>=20.0 in
/usr/local/lib/python3.10/dist-packages (from pytorch-lightning)
(24.2)
Requirement already satisfied: typing-extensions>=4.4.0 in
/usr/local/lib/python3.10/dist-packages (from pytorch-lightning)
Requirement already satisfied: lightning-utilities>=0.10.0 in
/usr/local/lib/python3.10/dist-packages (from pytorch-lightning)
(0.11.9)
Requirement already satisfied: aiohttp!=4.0.0a0,!=4.0.0a1 in
/usr/local/lib/python3.10/dist-packages (from fsspec[http]>=2022.5.0-
>pytorch-lightning) (3.11.9)
Requirement already satisfied: setuptools in
/usr/local/lib/python3.10/dist-packages (from lightning-
utilities>=0.10.0->pytorch-lightning) (75.1.0)
Requirement already satisfied: filelock in
/usr/local/lib/python3.10/dist-packages (from torch>=2.1.0->pytorch-
lightning) (3.16.1)
Requirement already satisfied: networkx in
/usr/local/lib/python3.10/dist-packages (from torch>=2.1.0->pytorch-
lightning) (3.4.2)
Requirement already satisfied: jinja2 in
/usr/local/lib/python3.10/dist-packages (from torch>=2.1.0->pytorch-
lightning) (3.1.4)
Collecting sympy==1.13.1 (from torch>=2.1.0->pytorch-lightning)
  Downloading sympy-1.13.1-py3-none-any.whl.metadata (12 kB)
Requirement already satisfied: mpmath<1.4,>=1.1.0 in
/usr/local/lib/python3.10/dist-packages (from sympy==1.13.1-
>torch>=2.1.0->pytorch-lightning) (1.3.0)
Requirement already satisfied: numpy>1.20.0 in
/usr/local/lib/python3.10/dist-packages (from torchmetrics>=0.7.0-
>pytorch-lightning) (1.26.4)
Requirement already satisfied: aiohappyeyeballs>=2.3.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning) (2.4.4)
Requirement already satisfied: aiosignal>=1.1.2 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning) (1.3.1)
Requirement already satisfied: async-timeout<6.0,>=4.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning) (4.0.3)
```

```
Requirement already satisfied: attrs>=17.3.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning) (24.2.0)
Requirement already satisfied: frozenlist>=1.1.1 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1-spec[http]>=2022.5.0-spytorch-lightning) (1.5.0)
Requirement already satisfied: multidict<7.0,>=4.5 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0al->fsspec[http]>=2022.5.0->pytorch-lightning) (6.1.0)
Requirement already satisfied: propcache>=0.2.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1-spec[http]>=2022.5.0-spytorch-lightning) (0.2.1)
Requirement already satisfied: yarl<2.0,>=1.17.0 in
/usr/local/lib/python3.10/dist-packages (from aiohttp!=4.0.0a0,!
=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-lightning) (1.18.3)
Requirement already satisfied: MarkupSafe>=2.0 in
/usr/local/lib/python3.10/dist-packages (from jinja2->torch>=2.1.0-
>pytorch-lightning) (3.0.2)
Requirement already satisfied: idna>=2.0 in
/usr/local/lib/python3.10/dist-packages (from yarl<2.0,>=1.17.0-
>aiohttp!=4.0.0a0,!=4.0.0a1->fsspec[http]>=2022.5.0->pytorch-
lightning) (3.10)
Using cached pytorch lightning-2.4.0-py3-none-any.whl (815 kB)
Downloading sympy-1.13.1-py3-none-any.whl (6.2 MB)
                                       - 6.2/6.2 MB 34.1 MB/s eta
0:00:00
py, pytorch-lightning
  Attempting uninstall: sympy
    Found existing installation: sympy 1.13.3
    Uninstalling sympy-1.13.3:
      Successfully uninstalled sympy-1.13.3
Successfully installed pytorch-lightning-2.4.0 sympy-1.13.1
Requirement already satisfied: torchvision in
/usr/local/lib/python3.10/dist-packages (0.20.1+cu121)
Requirement already satisfied: numpy in
/usr/local/lib/python3.10/dist-packages (from torchvision) (1.26.4)
Requirement already satisfied: torch==2.5.1 in
/usr/local/lib/python3.10/dist-packages (from torchvision)
(2.5.1+cu121)
Requirement already satisfied: pillow!=8.3.*,>=5.3.0 in
/usr/local/lib/python3.10/dist-packages (from torchvision) (11.0.0)
Requirement already satisfied: filelock in
/usr/local/lib/python3.10/dist-packages (from torch==2.5.1-
>torchvision) (3.16.1)
Requirement already satisfied: typing-extensions>=4.8.0 in
/usr/local/lib/python3.10/dist-packages (from torch==2.5.1-
>torchvision) (4.12.2)
Requirement already satisfied: networkx in
/usr/local/lib/python3.10/dist-packages (from torch==2.5.1-
```

```
>torchvision) (3.4.2)
Requirement already satisfied: jinja2 in
/usr/local/lib/python3.10/dist-packages (from torch==2.5.1-
>torchvision) (3.1.4)
Requirement already satisfied: fsspec in
/usr/local/lib/python3.10/dist-packages (from torch==2.5.1-
>torchvision) (2024.10.0)
Requirement already satisfied: sympy==1.13.1 in
/usr/local/lib/python3.10/dist-packages (from torch==2.5.1-
>torchvision) (1.13.1)
Requirement already satisfied: mpmath<1.4,>=1.1.0 in
/usr/local/lib/python3.10/dist-packages (from sympy==1.13.1-
>torch==2.5.1->torchvision) (1.3.0)
Requirement already satisfied: MarkupSafe>=2.0 in
/usr/local/lib/python3.10/dist-packages (from jinja2->torch==2.5.1-
>torchvision) (3.0.2)
# Import necessary libraries
import numpy as np, pandas as pd
from matplotlib.pyplot import subplots
from sklearn.linear model import (LinearRegression,
LogisticRegression, Lasso)
from sklearn.preprocessing import StandardScaler
from sklearn.model selection import KFold
from sklearn.pipeline import Pipeline
import ISLP
from ISLP import load data
from ISLP.models import ModelSpec as MS
from sklearn.model selection import (train test split, GridSearchCV)
import tensorflow as tf
import random
from keras.datasets import mnist
from keras.models import Sequential
from keras.layers import Dense, Flatten, Dropout, Conv2D, MaxPooling2D
from keras.utils import to categorical
from keras.optimizers import RMSprop
import torch
#from torch.nn import nn
from torch.optim import RMSprop
from torch.utils.data import TensorDataset
from torchmetrics import (MeanAbsoluteError, R2Score)
from torchinfo import summary
from torchvision.io import read image
from pytorch lightning import Trainer
from pytorch lightning.loggers import CSVLogger
from torchvision.datasets import MNIST, CIFAR100
from torchvision.models import (resnet50, ResNet50 Weights)
from torchvision.transforms import (Resize, Normalize, CenterCrop,
```

```
ToTensor)
from ISLP.torch import (SimpleDataModule, SimpleModule, ErrorTracker,
rec_num_workers)
from ISLP.torch.imdb import (load_lookup, load_tensor, load_sparse,
load_sequential)
```

FOLLOWING CODE SECTIONS COPY PASTED FROM LAB 10.9.5 IN THE TEXTBOOK

```
(imdb seq train, imdb seq test) = load sequential(root='data/IMDB')
padded sample = np.asarray(imdb seg train.tensors[0][0])
sample review = padded sample[padded sample > 0][:12]
sample review[:12]
lookup = load lookup(root='data/IMDB')
' '.join(lookup[i] for i in sample review)
max num workers=10
(imdb train, imdb test) = load tensor(root='data/IMDB')
imdb dm = SimpleDataModule(imdb train, imdb test, validation=2000,
num workers=min(6, max num workers), batch size=512)
class IMDBModel(nn.Module):
    def init (self, input size):
        super(IMDBModel, self). init ()
        self.densel = nn.Linear(input size, 16)
        self.activation = nn.ReLU()
        self.dense2 = nn.Linear(16, 16)
        self.output = nn.Linear(16, 1)
    # The forward function should be at the same level as init
    def forward(self, x):
        val = x
        for map in [self.dense1, self.activation, self.dense2,
self.activation, self.output]:
            val = map(val)
        return torch.flatten(val)
imdb model = IMDBModel(imdb test.tensors[0].size()[1])
summary(imdb model, input size=imdb test.tensors[0].size(),
col_names=['input_size', 'output_size', 'num_params'])
imdb optimizer = RMSprop(imdb model.parameters(), lr=0.001)
imdb module = SimpleModule.binary classification(imdb model,
optimizer=imdb optimizer)
imdb_logger = CSVLogger('logs', name='IMDB')
imdb trainer = Trainer(deterministic=True, max epochs=30,
logger=imdb logger, callbacks=[ErrorTracker()])
imdb trainer.fit(imdb module, datamodule=imdb dm)
test res = imdb trainer.test(imdb module, datamodule=imdb dm)
test res
```

```
/usr/local/lib/python3.10/dist-packages/ISLP/torch/imdb.py:131:
FutureWarning: You are using `torch.load` with `weights only=False`
(the current default value), which uses the default pickle module
implicitly. It is possible to construct malicious pickle data which
will execute arbitrary code during unpickling (See
https://github.com/pytorch/pytorch/blob/main/SECURITY.md#untrusted-
models for more details). In a future release, the default value for
`weights_only` will be flipped to `True`. This limits the functions
that could be executed during unpickling. Arbitrary objects will no
longer be allowed to be loaded via this mode unless they are
explicitly allowlisted by the user via
`torch.serialization.add_safe_globals`. We recommend you start setting
`weights_only=True` for any use case where you don't have full control
of the loaded file. Please open an issue on GitHub for any issues
related to this experimental feature.
  S test) = [torch.load( get imdb(f'IMDB {r}', root))
/usr/local/lib/python3.10/dist-packages/ISLP/torch/imdb.py:113:
FutureWarning: You are using `torch.load` with `weights_only=False`
(the current default value), which uses the default pickle module
implicitly. It is possible to construct malicious pickle data which
will execute arbitrary code during unpickling (See
https://github.com/pytorch/pytorch/blob/main/SECURITY.md#untrusted-
models for more details). In a future release, the default value for
`weights only` will be flipped to `True`. This limits the functions
that could be executed during unpickling. Arbitrary objects will no
longer be allowed to be loaded via this mode unless they are
explicitly allowlisted by the user via
`torch.serialization.add safe globals`. We recommend you start setting
`weights only=True` for any use case where you don't have full control
of the loaded file. Please open an issue on GitHub for any issues
related to this experimental feature.
  X_test, X_train = [torch.load(_get_imdb(f'IMDB_{r}', root))
INFO:pytorch lightning.utilities.rank zero:GPU available: False, used:
False
INFO:pytorch lightning.utilities.rank zero:TPU available: False,
using: 0 TPU cores
INFO:pytorch lightning.utilities.rank zero:HPU available: False,
usina: 0 HPUs
INFO:pytorch_lightning.callbacks.model summary:
  | Name | Type | Params | Mode
-----
0 | model | IMDBModel | 160 K | train
1 | loss | BCEWithLogitsLoss | 0 | train
         Trainable params
0
         Non-trainable params
160 K Total params
0.641 Total estimated model params size (MB)
```

```
6
          Modules in train mode
0
          Modules in eval mode
{"model id":"0eaa8801c5384ee4b65677e1d9cc4481","version major":2,"vers
ion minor":0}
/usr/local/lib/python3.10/dist-packages/torch/utils/data/
dataloader.py:617: UserWarning: This DataLoader will create 6 worker
processes in total. Our suggested max number of worker in current
system is 2, which is smaller than what this DataLoader is going to
create. Please be aware that excessive worker creation might get
DataLoader running slow or even freeze, lower the worker number to
avoid potential slowness/freeze if necessary.
 warnings.warn(
/usr/local/lib/python3.10/dist-packages/pytorch lightning/loops/fit lo
op.py:298: The number of training batches (45) is smaller than the
logging interval Trainer(log every n steps=50). Set a lower value for
log_every_n_steps if you want to see logs for the training epoch.
{"model id":"37f4b9a705ce4381bf11b0015023b86a","version major":2,"vers
ion minor":0}
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```

```
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{"model id": "dd961a8c61b24f59813534776f9c2f7e", "version major": 2, "vers
ion minor":0}
```

```
{"model_id":"8c4958621c1841658b65de018449bca7","version_major":2,"version_minor":0}

{"model_id":"3ca4701ba6c944e78bd59c2d2a6e75e8","version_major":2,"version_minor":0}

INFO:pytorch_lightning.utilities.rank_zero:`Trainer.fit` stopped:
`max_epochs=30` reached.

{"model_id":"90d0f1d20d784f80804db1185a9a7dee","version_major":2,"version_minor":0}
```

Test metric	DataLoader 0
test_accuracy	0.853600025177002
test_loss	1.1887187957763672

```
[{'test loss': 1.1887187957763672, 'test accuracy':
0.853600025177002}1
#from torch.nn import nn
# Data Loading from chunk above and extracting training and test set
in
# sequential format
\max \text{ num workers} = 10
(imdb seq train, imdb seq test) = load sequential(root='data/IMDB')
(imdb train, imdb test) = load tensor(root='data/IMDB')
# Define a new class that inherits from the base class for all NN
modules in PyTorch (nn.Module)
class IMDBModel(nn.Module):
    # Initialize the model's parameters as specified in the question
with dropout rate for regularization
    def init (self, input size, hidden units = 16, dropout rate =
0.0):
        super(IMDBModel, self). init ()
        # Define layers with configurable hidden units and optional
dropout
        self.network = nn.Sequential(
            nn.Linear(input size, hidden units), # A fully connected
layer that maps the input features to the hidden units
            nn.ReLU(), # ReLU activation function for non-linearity
            nn.Dropout(p = dropout rate), # Dropout layer to prevent
overfitting
            # Above sequence is repeated with another fully connected
layer, ReLU and dropout
            nn.Linear(hidden units, hidden units),
            nn.ReLU(),
```

```
nn.Dropout(p = dropout rate),
            # A fully connected layer that maps the hidden units to a
single output unit
            nn.Linear(hidden units, 1))
    # This method defines the forward pass of the model with input
tensor x,
    # passes the input through the defined network layers above and
flattens the
    # output tensor to a 1D tensor.
    def forward(self, x):
        return torch.flatten(self.network(x))
# Define a function to train and evaluate model to do with and without
30 %
# dropout regularization.
def train and evaluate model(hidden units, dropout rate):
    # Prepare DataModule to load data and to preprocess
    imdb dm = SimpleDataModule(imdb train, imdb test, validation =
2000,
                               num workers = min(6, max num workers),
                               batch size = 512)
    # Create model using IMDB Model created above using number of
features in the test dataset as the input size
    imdb model = IMDBModel(input size = imdb test.tensors[0].size()
[1],
                           hidden units = hidden units,
                           dropout rate = dropout rate)
    # Optimize using RMSProp and set learning rate to 0.01
    imdb optimizer = RMSprop(imdb model.parameters(), lr = 0.01)
    # Lightning Module for binary classifiaction using PyTorch
Lightning
    imdb module = SimpleModule.binary classification(imdb model,
optimizer = imdb optimizer)
    # Logger for saving training logs
    imdb logger = CSVLogger('logs', name =
f'IMDB units {hidden units} dropout {dropout rate}')
    # Trainer handles the training loop to set the epochs
    imdb trainer = Trainer(deterministic = True, max epochs = 30,
                           logger = imdb logger, callbacks =
[ErrorTracker()])
    # Train and Test the model using above functions
    imdb trainer.fit(imdb module, datamodule = imdb dm)
    test_res = imdb_trainer.test(imdb_module, datamodule = imdb_dm)
    # Return results of model evaluation
    return test res
# Experiment configurations categories to specify the number of hidden
units and dropout rate as specified in the question
```

```
exper_cat = [{'hidden_units': 16, 'dropout_rate': 0.0},
                                                         # Baseline
    {'hidden units': 32, 'dropout rate': 0.0}, # Increased hidden
units, no dropout
    {'hidden units': 64, 'dropout rate': 0.0}, # Increased hidden
units, no dropout
    {'hidden units': 16, 'dropout rate': 0.3}, # Baseline with
dropout
    {'hidden units': 32, 'dropout rate': 0.3}, # Increased hidden
units with 30 % dropout
    {'hidden units': 64, 'dropout rate': 0.3} # Increased hidden
units with 30 % dropout
# Run experiments over each category above
res = \{\}
for exp in exper cat:
    print(f"Running experiment: {exp}")
    res[f"{exp['hidden units']} units, {exp['dropout rate']} dropout"]
= train and evaluate model(
        exp['hidden units'],
        exp['dropout rate']
# Print res (Note: actual print formatting might need adjustment)
for config, result in res.items():
    print(f"\nConfiguration: {config}")
    print(result)
/usr/local/lib/python3.10/dist-packages/ISLP/torch/imdb.py:131:
FutureWarning: You are using `torch.load` with `weights only=False`
(the current default value), which uses the default pickle module
implicitly. It is possible to construct malicious pickle data which
will execute arbitrary code during unpickling (See
https://github.com/pytorch/pytorch/blob/main/SECURITY.md#untrusted-
models for more details). In a future release, the default value for
`weights only` will be flipped to `True`. This limits the functions
that could be executed during unpickling. Arbitrary objects will no
longer be allowed to be loaded via this mode unless they are
explicitly allowlisted by the user via
`torch.serialization.add safe globals`. We recommend you start setting
`weights_only=True` for any use case where you don't have full control
of the loaded file. Please open an issue on GitHub for any issues
related to this experimental feature.
  S_test) = [torch.load(_get_imdb(f'IMDB_{r}', root))
/usr/local/lib/python3.10/dist-packages/ISLP/torch/imdb.py:113:
FutureWarning: You are using `torch.load` with `weights only=False`
(the current default value), which uses the default pickle module
implicitly. It is possible to construct malicious pickle data which
will execute arbitrary code during unpickling (See
https://github.com/pytorch/pytorch/blob/main/SECURITY.md#untrusted-
```

```
models for more details). In a future release, the default value for
`weights only` will be flipped to `True`. This limits the functions
that could be executed during unpickling. Arbitrary objects will no
longer be allowed to be loaded via this mode unless they are
explicitly allowlisted by the user via
`torch.serialization.add_safe_globals`. We recommend you start setting
`weights only=True` for any use case where you don't have full control
of the loaded file. Please open an issue on GitHub for any issues
related to this experimental feature.
  X test, X train = [torch.load( get imdb(f'IMDB {r}', root))
INFO:pytorch lightning.utilities.rank zero:GPU available: False, used:
INFO:pytorch lightning.utilities.rank zero:TPU available: False,
using: 0 TPU cores
INFO:pytorch lightning.utilities.rank zero:HPU available: False,
using: 0 HPUs
INFO:pytorch lightning.callbacks.model summary:
  | Name | Type
                             | Params | Mode
0 | model | IMDBModel | 160 K | train
1 | loss | BCEWithLogitsLoss | 0 | train
160 K Trainable params
        Non-trainable params
160 K
0.641
         Total params
         Total estimated model params size (MB)
10
         Modules in train mode
         Modules in eval mode
0
Running experiment: {'hidden units': 16, 'dropout rate': 0.0}
{"model id": "661e7b96108c4e0eba5daa6d2e1300fd", "version major": 2, "vers
ion minor":0}
/usr/local/lib/python3.10/dist-packages/torch/utils/data/
dataloader.py:617: UserWarning: This DataLoader will create 6 worker
processes in total. Our suggested max number of worker in current
system is 2, which is smaller than what this DataLoader is going to
create. Please be aware that excessive worker creation might get
DataLoader running slow or even freeze, lower the worker number to
avoid potential slowness/freeze if necessary.
  warnings.warn(
/usr/local/lib/python3.10/dist-packages/pytorch lightning/loops/fit lo
op.py:298: The number of training batches (45) is smaller than the
logging interval Trainer(log every n steps=50). Set a lower value for
log every n steps if you want to see logs for the training epoch.
{"model id": "84a73b3b54be43ef98b0505715aa4a4b", "version major": 2, "vers
ion minor":0}
```

```
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```

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`max epochs=30` reached.
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Test metric	DataLoader 0
test_accuracy	0.8548799753189087
test_loss	1.325154423713684

Running experiment: {'hidden units': 32, 'dropout rate': 0.0}

INFO:pytorch_lightning.utilities.rank_zero:GPU available: False, used: False

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INFO:pytorch lightning.utilities.rank zero:TPU available: False,
using: 0 TPU cores
INFO:pytorch lightning.utilities.rank zero:HPU available: False,
usina: 0 HPUs
INFO:pytorch lightning.callbacks.model summary:
  | Name | Type
                              | Params | Mode
0 | model | IMDBModel
                               321 K
                                       l train
1 | loss | BCEWithLogitsLoss | 0
                                        | train
321 K
          Trainable params
          Non-trainable params
321 K
          Total params
1.285
          Total estimated model params size (MB)
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         Modules in eval mode
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INFO:pytorch_lightning.utilities.rank_zero:`Trainer.fit` stopped:
`max_epochs=30` reached.

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Test metric	DataLoader 0
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test_loss	1.5540151596069336

```
INFO:pytorch lightning.utilities.rank zero:GPU available: False, used:
False
INFO:pytorch lightning.utilities.rank zero:TPU available: False,
using: 0 TPU cores
INFO:pytorch_lightning.utilities.rank zero:HPU available: False,
using: 0 HPUs
INFO:pytorch lightning.callbacks.model summary:
  | Name | Type
                              | Params | Mode
0 | model | IMDBModel
                              | 644 K | train
1 | loss | BCEWithLogitsLoss | 0 | train
644 K
         Trainable params
         Non-trainable params
644 K
         Total params
         Total estimated model params size (MB)
2.578
         Modules in train mode
10
         Modules in eval mode
0
Running experiment: {'hidden units': 64, 'dropout rate': 0.0}
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INFO:pytorch lightning.utilities.rank zero:`Trainer.fit` stopped:
`max epochs=30` reached.
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         Test metric
                                     DataLoader 0
        test accuracy
                                  0.8658000230789185
                                  1.1865366697311401
          test loss
INFO:pytorch lightning.utilities.rank zero:GPU available: False, used:
False
INFO:pytorch lightning.utilities.rank zero:TPU available: False,
using: 0 TPU cores
INFO:pytorch lightning.utilities.rank zero:HPU available: False,
using: 0 HPUs
INFO:pytorch lightning.callbacks.model summary:
                              | Params | Mode
```

```
0 | model | IMDBModel
                               | 160 K
                                        | train
1 | loss | BCEWithLogitsLoss | 0
                                        | train
160 K
          Trainable params
          Non-trainable params
160 K
          Total params
0.641
          Total estimated model params size (MB)
10
          Modules in train mode
          Modules in eval mode
Running experiment: {'hidden units': 16, 'dropout rate': 0.3}
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INFO:pytorch_lightning.utilities.rank_zero:`Trainer.fit` stopped:
`max_epochs=30` reached.

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Test metric	DataLoader 0	
test_accuracy	0.8689600229263306	
test_loss	1.3017518520355225	

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INFO:pytorch lightning.utilities.rank zero:GPU available: False, used:
False
INFO:pytorch lightning.utilities.rank zero:TPU available: False,
using: 0 TPU cores
INFO:pytorch lightning.utilities.rank zero:HPU available: False,
using: 0 HPUs
INFO:pytorch lightning.callbacks.model summary:
  | Name | Type
                              | Params | Mode
0 | model | IMDBModel
                              | 321 K | train
1 | loss | BCEWithLogitsLoss | 0
                                       | train
321 K
         Trainable params
         Non-trainable params
0
321 K
         Total params
1.285
         Total estimated model params size (MB)
10
         Modules in train mode
         Modules in eval mode
Running experiment: {'hidden units': 32, 'dropout rate': 0.3}
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INFO:pytorch lightning.utilities.rank zero:`Trainer.fit` stopped:
`max epochs=30` reached.
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                                    DataLoader 0
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        test accuracy
                                 0.8540134429931641
          test loss
INFO:pytorch lightning.utilities.rank zero:GPU available: False, used:
False
INFO:pytorch lightning.utilities.rank zero:TPU available: False,
using: 0 TPU cores
INFO:pytorch lightning.utilities.rank zero:HPU available: False,
using: 0 HPUs
INFO:pytorch lightning.callbacks.model summary:
  | Name | Type
                              | Params | Mode
0 | model | IMDBModel
                              | 644 K | train
1 | loss | BCEWithLogitsLoss | 0
                                      | train
644 K
          Trainable params
          Non-trainable params
644 K
          Total params
```

```
2.578
          Total estimated model params size (MB)
10
          Modules in train mode
          Modules in eval mode
Running experiment: {'hidden units': 64, 'dropout rate': 0.3}
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Test metric	DataLoader 0
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test_loss	0.8414745926856995

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Configuration: 16 units, 0.0 dropout
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Configuration: 16 units, 0.3 dropout
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