ECGR 5105 Homework 5: Pytorch with SGD and Adam Optimizers

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GitHub Link

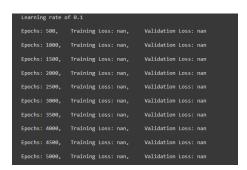
Click here to view the code

Problem 1.

1. SGD Optimizer Loss Values for Different Learning Rates:

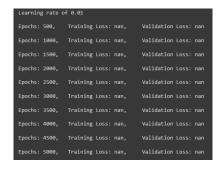
The loss values for the SGD Optimizer with a learning rate of 0.1 can be seen below. The values were too large to display properly.

Figure 1: SGD with Learning Rate of 0.1



The loss values for the SGD Optimizer with a learning rate of 0.01 can be seen below. The values were too large to display properly.

Figure 2: SGD with Learning Rate of 0.01



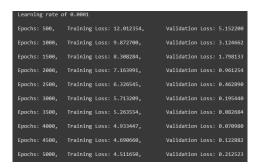
The loss values for the SGD Optimizer with a learning rate of 0.001 can be seen below. The values were too large to display properly.

Figure 3: SGD with Learning Rate of 0.001



The loss values for the SGD Optimizer with a learning rate of 0.0001 can be seen below. The values were finally small enough that we can see a drop in the loss values over time.

Figure 4: SGD with Learning Rate of 0.0001



2. Adam Optimizer Loss Values for Different Learning Rates:

The loss values for the Adam Optimizer with a learning rate of 0.1 can be seen below.

Figure 5: Adam with Learning Rate of 0.1



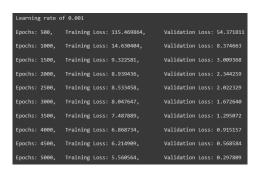
The loss values for the Adam Optimizer with a learning rate of 0.01 can be seen below.

Figure 6: Adam with Learning Rate of 0.01

Learning r	rate of 0.01			
Epochs: 56	00, Training	7.278435,	Validation	1.161389
Epochs: 16	000, Training	4.729887,	Validation	0.128108
Epochs: 15	00, Training	3.551420,	Validation	0.672878
Epochs: 26	000, Training	3.208128,	Validation	1.564775
Epochs: 25	00, Training	3.098825,	Validation	2.069755
Epochs: 36	000, Training	3.010406,	Validation	2.243273
Epochs: 35	00, Training	2.908556,	Validation	2.301728
Epochs: 46	000, Training	2.791894,	Validation	2.345571
Epochs: 45	00, Training	2.663229,	Validation	2.398024
Epochs: 56	000, Training	2.527826,	Validation	2.463071

The loss values for the Adam Optimizer with a learning rate of 0.001 can be seen below.

Figure 7: Adam with Learning Rate of 0.001



The loss values for the Adam Optimizer with a learning rate of 0.0001 can be seen below.

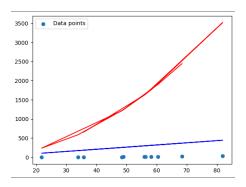
Figure 8: Adam with Learning Rate of 0.0001



3. Nonlinear vs Linear Model:

The nonlinear vs linear model plot can be seen below. The nonlinear plot is in red while the linear plot is in blue. As can be seen, the linear plot is a better approximation of the data.

Figure 9: Linear vs Nonlinear Plot



Problem 2.

1. SGD Optimizer Loss Values for Different Learning Rates:

The loss values for the SGD Optimizer with a learning rate of 0.1 can be seen below.

Figure 10: SGD with Learning Rate of 0.1



The loss values for the SGD Optimizer with a learning rate of 0.01 can be seen below.

Figure 11: SGD with Learning Rate of 0.01



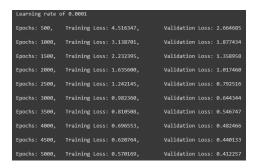
The loss values for the SGD Optimizer with a learning rate of 0.001 can be seen below.

Figure 12: SGD with Learning Rate of 0.001

Learning rate o	of 0.001	
Epochs: 500,	Training Loss: 0.570169,	Validation Loss: 0.412291
Epochs: 1000,	Training Loss: 0.464871,	Validation Loss: 0.359314
Epochs: 1500,	Training Loss: 0.459953,	Validation Loss: 0.358675
Epochs: 2000,	Training Loss: 0.459058,	Validation Loss: 0.359242
Epochs: 2500,	Training Loss: 0.458823,	Validation Loss: 0.359850
Epochs: 3000,	Training Loss: 0.458757,	Validation Loss: 0.360304
Epochs: 3500,	Training Loss: 0.458738,	Validation Loss: 0.360598
Epochs: 4000,	Training Loss: 0.458732,	Validation Loss: 0.360776
Epochs: 4500,	Training Loss: 0.458731,	Validation Loss: 0.360880
Epochs: 5000,	Training Loss: 0.458730,	Validation Loss: 0.360940

The loss values for the SGD Optimizer with a learning rate of 0.0001 can be seen below.

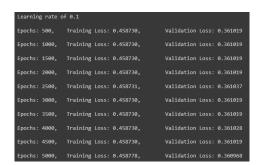
Figure 13: SGD with Learning Rate of 0.0001



2. Adam Optimizer Loss Values for Different Learning Rates:

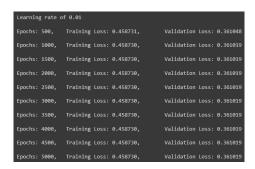
The loss values for the Adam Optimizer with a learning rate of 0.1 can be seen below.

Figure 14: Adam with Learning Rate of 0.1



The loss values for the Adam Optimizer with a learning rate of 0.01 can be seen below.

Figure 15: Adam with Learning Rate of 0.01



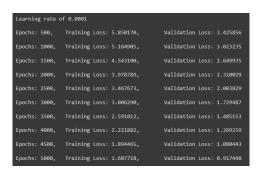
The loss values for the Adam Optimizer with a learning rate of 0.001 can be seen below.

Figure 16: Adam with Learning Rate of 0.001



The loss values for the Adam Optimizer with a learning rate of 0.0001 can be seen below.

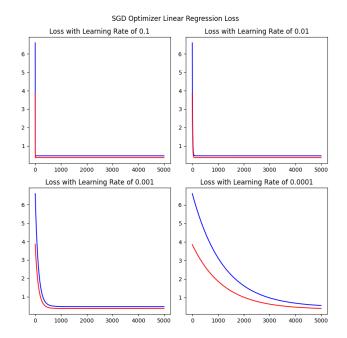
Figure 17: Adam with Learning Rate of 0.0001



3. Comparing Results to Homework 2:

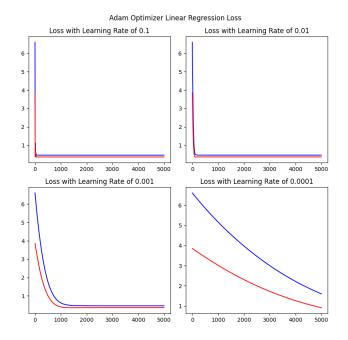
The loss value plots for the SGD Optimizer for all learning rates can be seen below.

Figure 18: SGD Loss Value Plots



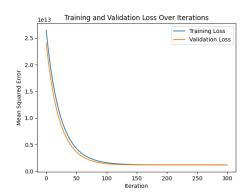
The loss value plots for the Adam Optimizer for all learning rates can be seen below.

Figure 19: Adam Loss Value Plots



The loss value plot from Homework 2 can be seen below. With a larger learning rate for the Adam or SGD optimizer, the loss converges faster than the plot in Homework 2. However, with a smaller learning rate, the linear regression plot from Homework 2 converges faster.

Figure 20: Homework 2 Loss Value Plots



Problem 3.

1. SGD Optimizer Loss Values for Different Learning Rates:

The loss values for the SGD Optimizer with a learning rate of 0.1 can be seen below.

Figure 21: SGD with Learning Rate of 0.1

Learning ra	ate of 0.1					
Epochs: 500	ð, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 100	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 150	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 200	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 250	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 300	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 350	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 400	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 450	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557
Epochs: 500	00, Training	Loss: 0.	.327611,	Validation	Loss:	0.347557

The loss values for the SGD Optimizer with a learning rate of 0.01 can be seen below.

Figure 22: SGD with Learning Rate of $0.01\,$

Learning rate o	of 0.01	
Epochs: 500,	Training Loss: 0.327614,	Validation Loss: 0.346775
Epochs: 1000,	Training Loss: 0.327611,	Validation Loss: 0.347543
Epochs: 1500,	Training Loss: 0.327611,	Validation Loss: 0.347556
Epochs: 2000,	Training Loss: 0.327611,	Validation Loss: 0.347556
Epochs: 2500,	Training Loss: 0.327611,	Validation Loss: 0.347556
Epochs: 3000,	Training Loss: 0.327611,	Validation Loss: 0.347556
Epochs: 3500,	Training Loss: 0.327611,	Validation Loss: 0.347556
Epochs: 4000,	Training Loss: 0.327611,	Validation Loss: 0.347556
Epochs: 4500,	Training Loss: 0.327611,	Validation Loss: 0.347556
Epochs: 5000,	Training Loss: 0.327611,	Validation Loss: 0.347556

The loss values for the SGD Optimizer with a learning rate of 0.001 can be seen below.

Figure 23: SGD with Learning Rate of 0.001

Learning rate	of 0.001	
Epochs: 500,	Training Loss: 0.698988,	Validation Loss: 0.690179
Epochs: 1000,	Training Loss: 0.363056,	Validation Loss: 0.346409
Epochs: 1500,	Training Loss: 0.333716,	Validation Loss: 0.335741
Epochs: 2000,	Training Loss: 0.328943,	Validation Loss: 0.338984
Epochs: 2500,	Training Loss: 0.327971,	Validation Loss: 0.341872
Epochs: 3000,	Training Loss: 0.327728,	Validation Loss: 0.343774
Epochs: 3500,	Training Loss: 0.327655,	Validation Loss: 0.345014
Epochs: 4000,	Training Loss: 0.327629,	Validation Loss: 0.345838
Epochs: 4500,	Training Loss: 0.327619,	Validation Loss: 0.346393
Epochs: 5000,	Training Loss: 0.327614,	Validation Loss: 0.346770

The loss values for the SGD Optimizer with a learning rate of 0.0001 can be seen below.

Figure 24: SGD with Learning Rate of 0.0001

Learning	rate of	0.0001					
Epochs: 5	500,	Training	Loss:	10.976434,	Validation	Loss:	12.851481
Epochs: 1	1000,	Training	Loss:	7.296107,	Validation	Loss:	8.524354
Epochs: 1	1500,	Training	Loss:	4.929107,	Validation	Loss:	5.723977
Epochs: 2	2000,	Training	Loss:	3.398851,	Validation	Loss:	3.903997
Epochs: 2	2500,	Training	Loss:	2.403218,	Validation	Loss:	2.715422
Epochs: 3	3000,	Training	Loss:	1.750390,	Validation	Loss:	1.934889
Epochs: 3	3500,	Training	Loss:	1.318346,	Validation	Loss:	1.419089
Epochs: 4	1000,	Training	Loss:	1.029275,	Validation	Loss:	1.075836
Epochs: 4	4500,	Training	Loss:	0.833404,	Validation	Loss:	0.845630
Epochs: 5	5000,	Training	Loss:	0.698782,	Validation	Loss:	0.689937

2. Adam Optimizer Loss Values for Different Learning Rates:

The loss values for the Adam Optimizer with a learning rate of 0.1 can be seen below.

Figure 25: Adam with Learning Rate of 0.1



The loss values for the Adam Optimizer with a learning rate of 0.01 can be seen below.

Figure 26: Adam with Learning Rate of 0.01

Learning rate o	of 0.01	
Epochs: 500,	Training Loss: 0.327644,	Validation Loss: 0.345123
Epochs: 1000,	Training Loss: 0.327611,	Validation Loss: 0.347555
Epochs: 1500,	Training Loss: 0.327611,	Validation Loss: 0.347557
Epochs: 2000,	Training Loss: 0.327611,	Validation Loss: 0.347557
Epochs: 2500,	Training Loss: 0.327611,	Validation Loss: 0.347557
Epochs: 3000,	Training Loss: 0.327611,	Validation Loss: 0.347557
Epochs: 3500,	Training Loss: 0.327611,	Validation Loss: 0.347557
Epochs: 4000,	Training Loss: 0.327611,	Validation Loss: 0.347557
Epochs: 4500,	Training Loss: 0.327611,	Validation Loss: 0.347557
Epochs: 5000,	Training Loss: 0.327611,	Validation Loss: 0.347557

The loss values for the Adam Optimizer with a learning rate of 0.001 can be seen below.

Figure 27: Adam with Learning Rate of 0.001

Learning rate	of 0.001	
Epochs: 500,	Training Loss: 4.365370,	Validation Loss: 4.919113
Epochs: 1000,	Training Loss: 0.912715,	Validation Loss: 0.894507
Epochs: 1500,	Training Loss: 0.380849,	Validation Loss: 0.339822
Epochs: 2000,	Training Loss: 0.336079,	Validation Loss: 0.324214
Epochs: 2500,	Training Loss: 0.330054,	Validation Loss: 0.332314
Epochs: 3000,	Training Loss: 0.328214,	Validation Loss: 0.338652
Epochs: 3500,	Training Loss: 0.327719,	Validation Loss: 0.343363
Epochs: 4000,	Training Loss: 0.327624,	Validation Loss: 0.346048
Epochs: 4500,	Training Loss: 0.327612,	Validation Loss: 0.347167
Epochs: 5000,	Training Loss: 0.327611,	Validation Loss: 0.347491

The loss values for the Adam Optimizer with a learning rate of 0.0001 can be seen below.

Figure 28: Adam with Learning Rate of 0.0001

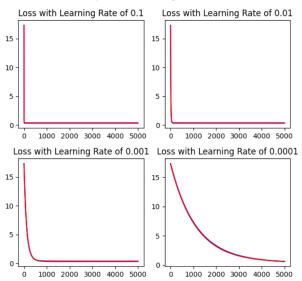


3. Comparing Results to Homework 2:

The loss value plots for the SGD Optimizer for all learning rates can be seen below.

Figure 29: SGD Loss Value Plots

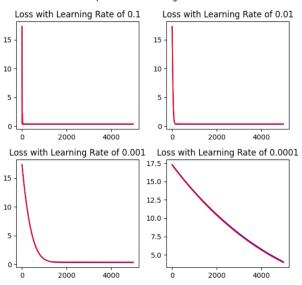
SGD Optimizer Linear Regression Loss



The loss value plots for the Adam Optimizer for all learning rates can be seen below.

Figure 30: Adam Loss Value Plots

Adam Optimizer Linear Regression Loss



The loss value plot from Homework 2 can be seen below. With a larger learning rate for the Adam or SGD optimizer, the loss converges faster than the plot in Homework 2. However, with a smaller learning rate, the linear regression plot from Homework 2 converges faster.

Figure 31: Homework 2 Loss Value Plots

