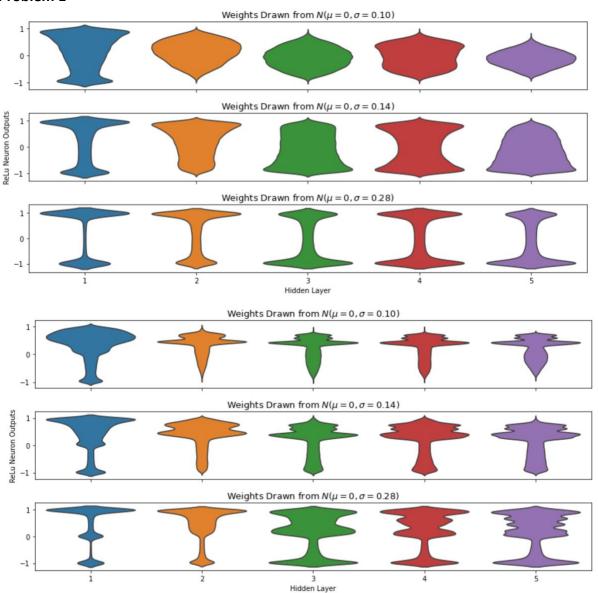
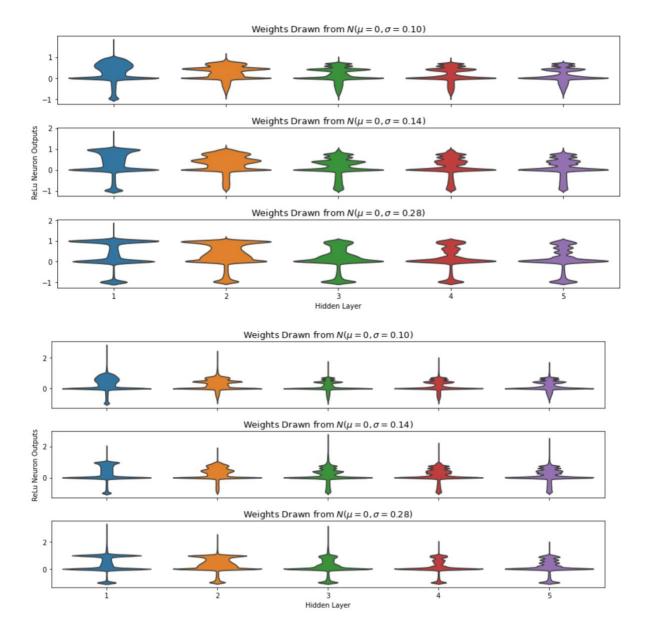
#### How I ran my jupyter notebook

- I used NYU HPC Jupiter notebook from interactive apps to run my notebook with 14 cores and GPU because Google Codelab free version does have enough memory space. Google Codelab Link:
  - https://colab.research.google.com/drive/1KZoqn3Xmqheo4ztORpWITsB79c5Zujjk?usp=sharing
- Since I couldn't submit my Jupyter notebook on Brightspace, I uploaded all the files to Google drive.
  - https://drive.google.com/drive/folders/1lYLcq5b3Elr26pW5FNmU74AhTqFaqDy?usp=sharing

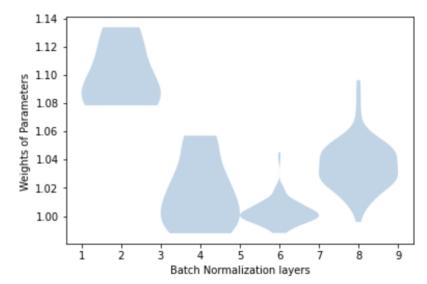
#### **Problem 1**





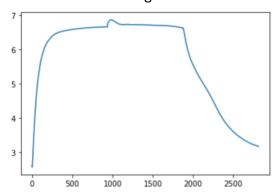
## Part 2

- Plot the distribution of learned batch norm parameters for each layer



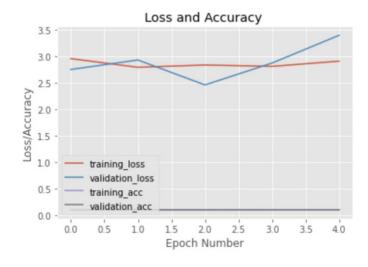
#### Part 1

- Plot the training loss as a function of the learning rate.

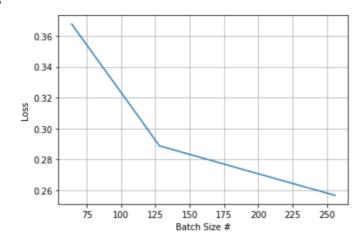


Part 2

- Plot train/validation loss and accuracy curve



Part 3



## Part 2 without dropout

- plot the training loss vs the number of epochs.

lowest training loss
AdaGrad: 1.6244221925735474
RMSProp: 1.8377635478973389
RMSProp+N: 1.5503463745117188
AdaDelta: 7.079044342041016
Adam: 1.6213159561157227

Epoch vs training loss without dropout

AdaGrad
RMSProp + N
AdaDeita
Adam

35

20

15

10

5

100

epoch

125

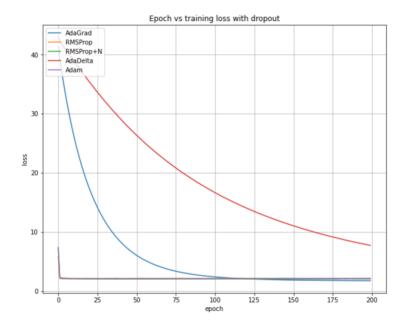
150

175

## Part 3 with dropout

lowest training loss

AdaGrad: 1.7369143962860107 RMSProp: 2.115575075149536 RMSProp+N: 2.028042793273926 AdaDelta: 7.716529846191406 Adam: 2.0822479724884033



#### Part 4

```
Test accuracy - models without dropout
Test Accuracy - Adagrad: 0.5030999779701233
313/313 [============== ] - 1s 2ms/step - loss: 1.9086 - accuracy: 0.3608
Test Accuracy - RMSProp: 0.36079999804496765
Test Accuracy - RMSProp+Nesterov: 0.4754999876022339
313/313 [================== ] - 1s 2ms/step - loss: 7.1394 - accuracy: 0.4537
Test Accuracy - Adadelta: 0.4537000060081482
313/313 [=========== ] - 1s 2ms/step - loss: 1.7330 - accuracy: 0.4200
Test Accuracy - Adam: 0.41999998688697815
Test accuracy - models with dropout
Test Accuracy - Adagrad: 0.4810999929904938
313/313 [============] - 1s 2ms/step - loss: 2.0576 - accuracy: 0.2864
Test Accuracy - RMSProp: 0.2863999903202057
313/313 [============] - 1s 2ms/step - loss: 2.0737 - accuracy: 0.2396
Test Accuracy - RMSProp+Nesterov: 0.23960000276565552
313/313 [============] - 1s 2ms/step - loss: 7.6006 - accuracy: 0.3985
Test Accuracy - Adadelta: 0.398499995470047
Test Accuracy - Adam: 0.21379999816417694
```

Part 1

Layer	Number of Activations (Memory)	Parameters (Compute)	
Input	224*224*3=150K	0	
CONV3-64	224*224*64=3.2M	(3*3*3)*64 = 1,728	
CONV3-64	224*224*64=3.2M	(3*3*64)*64 = 36,864	
POOL2	112*112*64=800K	0	
CONV3-128	112*112*128=1605632	3*3*64*128=73728	
CONV3-128	112*112*128=1605632	3*3*128*256=294912	
POOL2	56*56*128=400K	0	
CONV3-256	56*56*256=802816	3*3*128*256=294912	
CONV3-256	56*56*256=800K	(3*3*256)*256 = 589,824	
CONV3-256	56*56*256=802816	3*3*256*256=589824	
CONV3-256	56*56*256=802816	3*3*256*256=589824	
POOL2	28*28*256	0	
CONV3-512	28*28*512=400K	(3*3*256)*512 = 1,179,648	
CONV3-512	28*28*512=401408	3*3*256*512=1179648	
CONV3-512	28*28*512=400K	3*3* 256*512= 1179648	
CONV3-512	28*28*512=401408	3*3*512*512=2359296	
POOL2	14*14*512=100353	0	
CONV3-512	14*14*512=100353	3*3*512*512=2359296	
POOL2	7*7*512=25088	0	
FC	4096	4096*25088=102760488	
FC	4096	4096*4096 = 16,777,216	
FC	1000	4096*1000=4096000	
TOTAL	16.5M	140M	

Table 1: VGG19 memory and weights