

Instructions:

Note that the Python files and trained models will be placed in the barn-shared folder three days after the deadline. The project currently contains five Python files, `cnn_classification_cifar10.py`, `dataset.py`, `model.py`, `train_buildings.py`, `test.py`

Below are the instructions for training the building model on CCI (currently).

```
cd scratch-shared
./conda init

//log in again

conda activate pytorch-env-shared

//schedule the code to run

srun -t 30 -gres=gpu:1 python train_buildings.py
```

```
// To test the pretrained model
```

```
srun -t 30 -gres=gpu:1 python test.py <path_to_data_dir> <name_of_label_file.csv>
```

```
//This program will load the trained model (the model we trained before submission) from the
models folder, then it will evaluate and print the accuracy on the data in the directory provided
```

Terminal Output:**Cnn_classification_cifar10.py (CIFAR10 Warmup) - Goal 70% test acc.**

```
Train Epoch: 28 [10000/50000 (20%)]    Loss: 0.529506
Train Epoch: 28 [20000/50000 (40%)]    Loss: 0.668602
Train Epoch: 28 [30000/50000 (60%)]    Loss: 0.580766
Train Epoch: 28 [40000/50000 (80%)]    Loss: 0.510176
      Accuracy: 81.42%
Test set: Avg. loss: -91700.0211, Accuracy: 8121/10000 (81.21%)

Train Epoch: 29 [0/50000 (0%)]    Loss: 0.301322
Train Epoch: 29 [10000/50000 (20%)]    Loss: 0.375155
Train Epoch: 29 [20000/50000 (40%)]    Loss: 0.514007
Train Epoch: 29 [30000/50000 (60%)]    Loss: 0.410843
Train Epoch: 29 [40000/50000 (80%)]    Loss: 0.659053
      Accuracy: 81.29%
Test set: Avg. loss: -92216.8068, Accuracy: 8240/10000 (82.40%)

Train Epoch: 30 [0/50000 (0%)]    Loss: 0.426450
Train Epoch: 30 [10000/50000 (20%)]    Loss: 0.589516
Train Epoch: 30 [20000/50000 (40%)]    Loss: 0.514605
Train Epoch: 30 [30000/50000 (60%)]    Loss: 0.504464
Train Epoch: 30 [40000/50000 (80%)]    Loss: 0.543723
      Accuracy: 82.09%
Test set: Avg. loss: -91286.1939, Accuracy: 8202/10000 (82.02%)
(pytorch-env-shared) [RNL2fmrda@npl41 barn]$
```

Train_buildings.py (CNN Model) - Goal 90% test acc.

```
Train Epoch: 30 [2900/4380 (66%)]      Loss: 0.323846
Train Epoch: 30 [3000/4380 (68%)]      Loss: 0.251844
Train Epoch: 30 [3100/4380 (70%)]      Loss: 0.310559
Train Epoch: 30 [3200/4380 (73%)]      Loss: 0.261890
Train Epoch: 30 [3300/4380 (75%)]      Loss: 0.296492
Train Epoch: 30 [3400/4380 (77%)]      Loss: 0.234192
Train Epoch: 30 [3500/4380 (80%)]      Loss: 0.180947
Train Epoch: 30 [3600/4380 (82%)]      Loss: 0.392068
Train Epoch: 30 [3700/4380 (84%)]      Loss: 0.364467
Train Epoch: 30 [3800/4380 (86%)]      Loss: 0.227045
Train Epoch: 30 [3900/4380 (89%)]      Loss: 0.254229
Train Epoch: 30 [4000/4380 (91%)]      Loss: 0.312469
Train Epoch: 30 [4100/4380 (93%)]      Loss: 0.262813
Train Epoch: 30 [4200/4380 (95%)]      Loss: 0.347567
Train Epoch: 30 [3440/4380 (98%)]      Loss: 0.245557
      Accuracy: 90.53%
Test set: Avg. loss: 80.0020, Accuracy: 459/485 (94.64%)
(pytorch-env-shared) [RNL2fmrdr@npl41 barn]$
```

Questions:

1) How many parameters does your network have? Please provide your calculations, layer by layer. You can ignore batch normalization parameters – just count the convolution and fully connected ones.

The network has 4,594,287 parameters. The calculations to determine this parameter count can be seen below.

Parameter Calculation for CNN Model**Convolutional Layers**

- $\text{Conv1} = 3 \times 3 \times 3 \times 16 + 16 = 448$
- $\text{Conv2} = 3 \times 3 \times 16 \times 32 + 32 = 4,640$
- $\text{Conv3} = 3 \times 3 \times 32 \times 64 + 64 = 18,496$
- $\text{Conv1} + \text{Conv2} + \text{Conv3} = 448 + 4640 + 18496 = 23,584$

Batch Normalization Layers

- $\text{Bn1} = 16 \times 2 = 32$
- $\text{Bn2} = 32 \times 2 = 64$
- $\text{Bn3} = 64 \times 2 = 128$
- $\text{Bn1} + \text{Bn2} + \text{Bn3} = 32 + 64 + 128 = 224$

Fully Connected Layers

- $64 \times (\text{height}/8) \times (\text{width}/8)$
- $\text{Height} = 189/8 = 23, \text{Width} = 252/8 = 31$
- $\text{Fc1} = 64 \times 23 \times 31 \times 100 + 100 = 4,563,300$
- $\text{Fc2} = 100 \times 64 + 64 = 6464$
- $\text{Fc3} = 64 \times 11 + 11 = 715$
- $\text{Fc1} + \text{Fc2} + \text{Fc3} = 4,563,300 + 6464 + 715 = 4,570,479$

Total Parameters

$\text{Total Parameters} = \text{Conv1} + \text{Conv2} + \text{Conv3} + \text{Bn1} + \text{Bn2} + \text{Bn3} + \text{Fc1} + \text{Fc2} + \text{Fc3}$

$\text{Total Parameters} = 23,584 + 224 + 4,570,479 = 4,594,287$

2) How did you improve the CIFAR10 accuracy? What was the issue?

We improved CIFAR10 accuracy by applying data augmentation on the training data and adding four layers to the CNN_small class instead of one. The augmentations include random horizontal flips, rotation, crop, and color jitter. The dataset was also converted to a tensor and normalized before training. The reasoning for these augmentations is to increase training data diversity, generating a more complete and thorough training model.