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1. I am using a high-speed computing computer, system Information as follows:

#### Hardware details

## OS info:

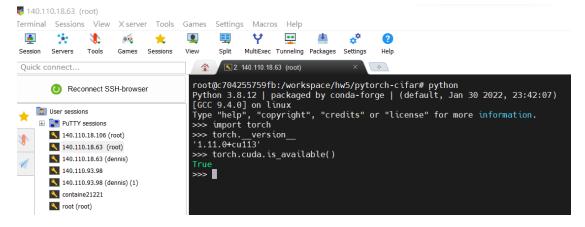
```
root@c704255759fb:/workspace/hw5/pytorch-cifar# lsb_release -a
No LSB modules are available.
Distributor ID: Ubuntu
Description: Ubuntu 20.04.4 LTS
Release: 20.04
Codename: focal
root@c704255759fb:/workspace/hw5/pytorch-cifar#
```

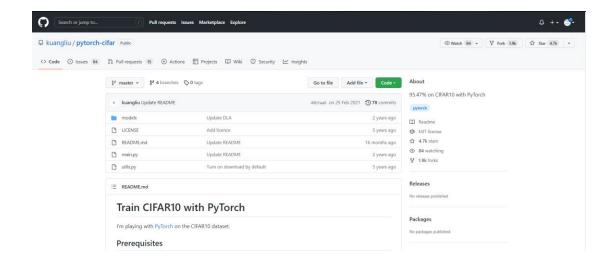
#### CPU info:

## GPU info:

```
root@c704255759fb:/workspace/hw5/pytorch-cifar# nvidia-smi
Thu Jun 9 14:41:14 2022
  NVIDIA-SMI 495.29.05
                          Driver Version: 495.29.05
                                                        CUDA Version: 11.5
                   Persistence-M Bus-Id
                                                Disp.A
                                                          Volatile Uncorr. ECC
  Fan
       Temp
                   Pwr:Usage/Cap
                                          Memory-Usage
                                                          GPU-Util Compute M.
                                                                        MIG M.
                                  00000000:07:00.0 Off
      NVIDIA A100-SXM...
                           0n
                                                                             0
        34C
               P0
                     52W / 400W
                                       OMiB / 40536MiB
                                                               0%
 N/A
                                                                       Default
                                                                      Disabled
      NVIDIA A100-SXM...
                                  00000000:0F:00.0 Off
                                                                             0
                           0n
  N/A
               P0
                     54W / 400W
                                       OMiB / 40536MiB
                                                               0%
                                                                       Default
        32C
                                                                      Disabled
  Processes:
                                                                    GPU Memory
   GPU
              CI
                        PID
         GI
                              Type
                                     Process name
         ID
              ID
                                                                    Usage
   No running processes found
root@c704255759fb:/workspace/hw5/pytorch-cifar#
```

- 2. I am using pytorch-cifar(repository) on github, which is a paper called "Deep Layer Aggregation" published in the CVPR journal. I use this repository to write homework 5 assignments. It's deep learning framework is pytorch, and version is as follows. My environment is running in Docker, and its tag is "cyh1195/cyh:1110612cs hw5". The file path is in "/workspace/code".
  - ◆ Python 3.8.12
  - ◆ PyTorch 1.11+cu113
  - https://github.com/kuangliu/pytorch-cifar
  - ◆ docker tag: docker pull cyh1195/cyh:1110612cs hw5





## 3. How to use the program?

```
# Start training with:
python train.py

# You can manually resume the training with:
python train.py —resume

# Using Model Inference:
python inference.py
```

## 4. Model desinged:

I use the model structure of this paper, and his model hyperparameter settings as in the Table 1. Data pre-processing is done only for normalization, and no other actions are done. This deep layer aggregation structures iteratively and hierarchically merge the feature hierarchy to make networks with better accuracy and fewer parameters. Aggregation is a decisive aspect of architecture as Fig 1, and as the number of modules multiply their connectivity is made all the more important. By relating architectures for aggregating channels, scales, and resolutions we identified the need for deeper aggregation, and addressed it by iterative deep aggregation and hierarchical deep aggregation.

Table 1. Hyperparameter settings

model architecture	SimpleDLA
optimizer	SGD
learning rate	0.0001
momentum	0.9
weight_decay	0.0005
batch size	256
epoch	5000
criterion(loss function)	CrossEntropyLoss
scheduler	CosineAnnealingLR

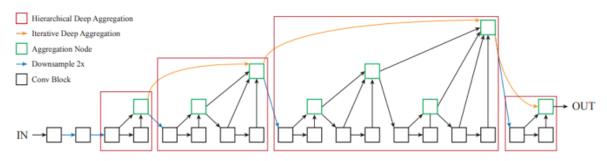


Figure 1: Deep layer aggregation

# 5. Result:

First, I trained the SimpleDLA model 195 times using training.py and the original cifar-10, the training process is shown in Figure 2. After training, the weights are saved in the "ckpt\_1000.pth" file as a pre-trained model. Then use the x\_train.npy dataset from Homework 5, and train it again with the same hyperparameter settings. Finally, the test.npy dataset is tested with inference.py, and the average accuracy of the test.npy dataset is 99%.

				_	•										
	05:38:54]	INF0	(nni.retiari	.oneshot.pytorc	h.enas/MainTh	read) Model	Epoch	[15/310]	Step	[11/196]	acc1	0.398438	(0.389915)	loss 1	.662124 (
	05:38:55]	INF0	(nni.retiari	.oneshot.pytorc	h.enas/MainTh	read) Model	Epoch	[15/310]	Step	[21/196]	acc1	0.359375	(0.375372)	loss 1	.443970 (
658047) [2022-06-08	05:38:56]	INFO	(nni.retiari	.oneshot.pytorc	h.enas/MainTh	read) Model	Epoch	[15/310]	Step	[31/196]	acc1	0.421875	(0.376008)	loss 1	.694606 (
ē47558) Г2022-06-08	05:38:571	TNFO	(nni.retiari	.oneshot.pytorc	h.enas/MainTh	read) Model	Fnoch	[15/310]	Step	[41/196]	acc1	0.398438	(0.380145)	loss 1	.573769(
632013)				.oneshot.pytorc											
629405)															
[2022-06-08 637384)	05:38:59]	INF0	(nni.retiari	.oneshot.pytorc	h.enas/MaınTh	read) Model	Epoch	[15/310]	Step	[61/196]	acc1	0.351562	(0.378586)	loss 1	.816130 (
[2022-06-08 639668)	05:38:59]	INF0	(nni.retiari	.oneshot.pytorc	h.enas/MainTh	read) Model	Epoch	[15/310]	Step	[71/196]	acc1	0.367188	(0.377091)	loss 1	.639728 (
	05:39:00]	INF0	(nni.retiari	.oneshot.pytorc	h.enas/MainTh	read) Model	Epoch	[15/310]	Step	[81/196]	acc1	0.390625	(0.375193)	loss 1	.517241 (
	05:39:01]	INF0	(nni.retiari	.oneshot.pytorc	h.enas/MainTh	read) Model	Epoch	[15/310]	Step	[91/196]	acc1	0.375000	(0.374828)	loss 1	.623981 (

Figure 2: History of traing model

```
17ms
24ms
16ms
Accuracy of my model on
                              test set: 0.992.....
Accuracy of my model
Accuracy of my model
                              test set: 0.988.....
test set: 0.992.....
                                                                         19/40
                                                                                         Step:
                                                                                                          Tot:
                                                                                                                336ms
                                                                                                                          Loss: 0.036
                                                                         20/40
                                                                                         Step:
                                                                                                         Tot:
                                                                                                               352ms
                                                                                                                          Loss: 0.035
Accuracy of my model
                           on
                              test set: 0.992.....
                                                                         21/40
                                                                                         Step:
                                                                                                18ms
                                                                                                         Tot:
                                                                                                                371ms
                                                                                                                          Loss: 0.035
                              test set: 0.996.....
                                                                         22/40
                                                                                         Step:
                                                                                                16ms
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                                                                                                               387ms
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                                                                         23/40
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26/40
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17ms
                                                                                                         Tot: 459ms
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19ms
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                              test set: 0.996=
                                                                                         Step:
                                                                                                                          Loss: 0.032
                          on
                                                                                                         Tot: 513ms
                              test set:
                                           0.984
                                                                         29/40
                                                                                         Step:
                                                                                                                          Loss: 0.033
                          on
Accuracy of my model
Accuracy of my model
                                                                                                         Tot: 531ms
Tot: 549ms
                              test set:
                                           0.977=
                                                                         30/40
                                                                                         Step:
                                                                                                17ms
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                          on
                              test set:
                                           0.996=
                                                                         31/40
                                                                                         Step:
                                                                                                18ms
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                          on
Accuracy of my model
                                           1.000==
                                                                         32/40
                                                                                                         Tot: 630ms
                                                                                                                                 0.034
                              test
                                    set:
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                                                                                                80ms
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                          on
Accuracy of my model
                              test
                                           0.996=
                                                                         33/40
                                                                                                17ms
                                                                                                          Tot: 648ms
                                                                                                                                 0.034
                                    set:
                                                                                         Step:
                                                                                                                          Loss:
Accuracy of my model
Accuracy of my model
                               test
                                           1.000====
                                                                         34/40
                                                                                         Step:
                                                                                                16ms
                                                                                                          Tot: 665ms
                                                                                                                          Loss: 0.033
                              test set:
                                           0.996=
                                                                         35/40
                                                                                         Step:
                                                                                                17ms
                                                                                                          Tot: 682ms
                                                                                                                          Loss: 0.032
                          on
                                                                                                17ms
Accuracy of my model
                          on
                              test
                                    set:
                                           0.992=
                                                                         36/40
                                                                                         Step:
                                                                                                         Tot: 699ms
                                                                                                                          Loss: 0.032
                                                                                                        Tot: 716ms |
Tot: 733ms |
Tot: 750ms |
| Tot: 949ms
Accuracy of my model
Accuracy of my model
                              test set:
                                           1.000=
                                                                         37/40
                                                                                         Step:
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                                                                         38/40
                              test set: 0.992==
                                                                                         Step:
                                                                                                16ms
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Accuracy of my model on test set: 0.992========= 39/40
                                                                                                                          Loss: 0.032
                                                                                         Step:
                                                                                                17ms
                                                                                         Step: 199ms
                                                                      === 40/40 >.
                                                                                                                          Loss: 0.032
Ccuracy of my model on test set: 1.000 root@c704255759fb:/workspace/hw5/pytorch-cifar#
```

Figure 3: The inferend result from testing data is an accuracy of 99%