

Report : Cifar10 performance and Robot model with camera

Summary of my internship

- ▶ Performance on a cifar10 model
- ▶ Difference of the batch size
- ▶ Make a pytorch model for the robot
- ▶ Training of both model on llrai01
- ▶ Make them work on the jetson
- ▶ Add the camera

Jetson nano 2GB developer kit

- ▶ GPU : NVIDIA Maxwell™ à 128 cœurs
- ▶ CPU : Quad-core ARM® A57 à 1,43 GHz
- ▶ RAM : 2 Go 64 bits LPDDR4 25,6 Go/s
+ Swap : 5.1GB (only for CPU)
- ▶ Stockage : MicroSD 32GB class 10
- ▶ Image : JetPack 4.5
- ▶ Software : python 3.6.9
 - ▶ Tensorflow : 2.4.1-cuda10.2
 - ▶ Pytorch : 1.10.0a0+git36449ea-cuda10.2



llrai01

- ▶ GPU : Tesla V100-SXM2-32GB
- ▶ CPU : 95x Intel(R) Xeon(R) Gold 6240R CPU @ 2.40GHz
- ▶ RAM : 395GB
- ▶ Software version :
 - ▶ Tensorflow : tensorflow-gpu/2.8.0-py3.9.12-cuda11.4-cudnn8.2
 - ▶ Pytorch : 1.12.0-cuda11.4 python 3.8.13



HP zbook laptop

- ▶ GPU : Intel® HD Graphics 520 + AMD FirePro W4190M
- ▶ CPU : Intel® Core™ i7-6500U CPU @ 2.50GHz
- ▶ RAM : 16GB
- ▶ Software version :
 - ▶ Tensorflow : tensorflow-gpu/2.6.0 cuda11.3.1 python 3.9.12
 - ▶ Pytorch : 1.12.0+cpu python 3.8.10

Comparative table Cifar10 Pytorch

Time	HP zbook laptop	Llrai01	Jetson
Import	2,04 s	1,15 s	6,37 s
Loader setup	1,90 s	4,50 s	49,5 s
Model setup	0,00 s	2,18 s	108s = 1,48min
Train 1	40,6 s	41,03 s	372s = 6,12min
Train 2	38,9 s	31,70 s	171s = 2,51min
Train/image	0,78 ms	0,63 ms	3,42 ms
Train 3	39,2 s	27,7 s	169s = 2,49min
Mean train	39,6 s	33,5 s	237s = 3,57min
Mean test/epoch	4,59 s	2,60 s	18,8 s
Test/image	0,46 ms	0,26 ms	1,88 ms
Mean loading	2,82E-2 s	0,34 s	4,13 s
Loading/image	4,7E-04 ms	5,67E-03 ms	6,88E-02 ms

Comparative table Cifar10 tensorflow

Time	HP zbook laptop	Llrai01	Jetson
Import	6,71 s	3,14 s	16,7 s
Loader setup	57,69 s	1,02 s	87,6 s
Model setup	0,14 s	5,67 s	52,1 s
Train 1	36 s	31 s	345 s
Train 2	39 s	27 s	184 s
Train/image	0,78 ms	0,54 ms	3,68 ms
Train 3	36 s	26 s	193 s
Mean train	36,95 s	28 s	241 s
Mean test/epoch	2,62 s	2 s	62,07 s
Test/image	0,26 ms	0,20 ms	6,2 ms

Comparative table Cifar10 HP zbook laptop

Time	tensorflow	Pytorch
Import	6,71 s	2,04 s
Loader setup	57,69 s	1,90 s
Model setup	0,14 s	0,00 s
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Train 2	39 s	38,9 s
Train/image	0,78 ms	0,78 ms
Train 3	36 s	39,2 s
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Comparative table Cifar10 Llrail01

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Comparative table Cifar10 Jetson

Time	tensorflow	Pytorch
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Model setup	52,1 s	108s = 1,48min
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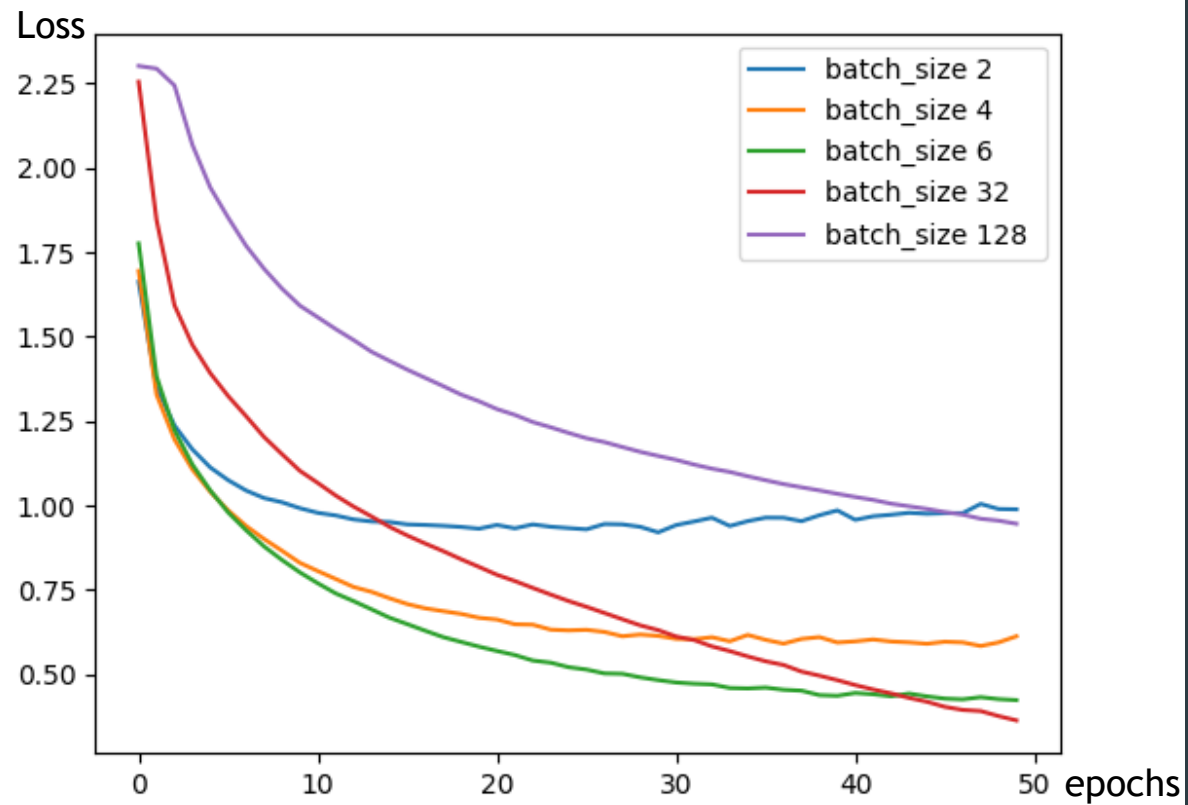
Comparison with others performance test (different model)

Average inference time	
PyTorch CPU Average inference time (s)	0.748
PyTorch CPU + TorchScript Average inference time (s)	0.625
PyTorch GPU Average inference time (s)	0.046
PyTorch GPU + TorchScript Average inference time (s)	0.036
TensorFlow CPU Average inference time (s)	0.823
TensorFlow GPU Average inference time (s)	0.043
TensorFlow GPU + XLA Average inference time (s)	0.035

<https://medium.com/huggingface/benchmarking-transformers-pytorch-and-tensorflow-e2917fb891c2>

PyTorch (1.3.0) / TensorFlow (2.0)
Results in second

Batch 50 epochs

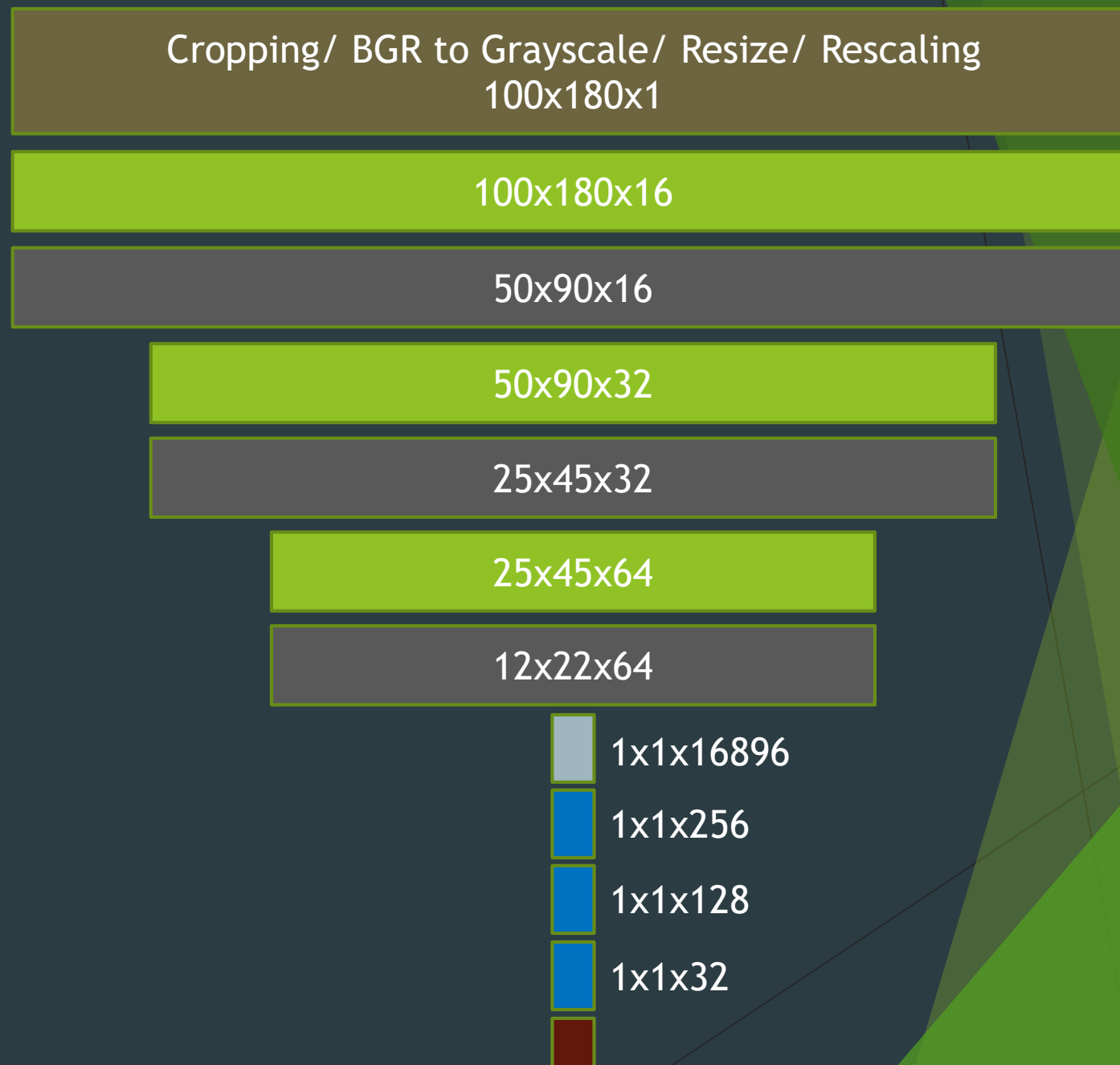


Test made on a Cifar10 model

Optimal size batch : 32

Initial Robot model

- Convolution + ReLU
- MaxPooling
- Flatten
- Linear
- Softmax



Initial model doesn't fit in the Jetson

```
jtop Nano (Developer Kit Version) - JC: Inactive - MAXN
Fichier  Édition  Onglets  Aide
NVIDIA Jetson Nano (Developer Kit Version) - Jetpack 4.5.1 [L4T 32.5.2]
CPU1 [|||||] Schedutil - 18%] 614MHz
CPU2 [|||||] Schedutil - 14%] 614MHz
CPU3 [|||] Schedutil - 8%] 614MHz
CPU4 [|||] Schedutil - 10%] 614MHz

Mem [|||||||||||||||||] 0.7G/2.0GB] (lfb 15x4MB)
Imm [ 0.0k/252.0kB] (lfb 252kB)
Swp [ 0.001GB/5.1GB] (cached 0MB)
EMC [|| 3%] 1.6GHz

GPU [ 0%] 76 MHz
Dsk [#####25.3GB/28.4GB]

[info] [Sensor] [Temp]
UpT: 0 days 0:16:6 AO 47.00C
FAN [ 0%] Ta= 0% CPU 39.00C
Jetson Clocks: inactive GPU 36.00C
NV Power[0]: MAXN PLL 38.50C
thermal 37.50C

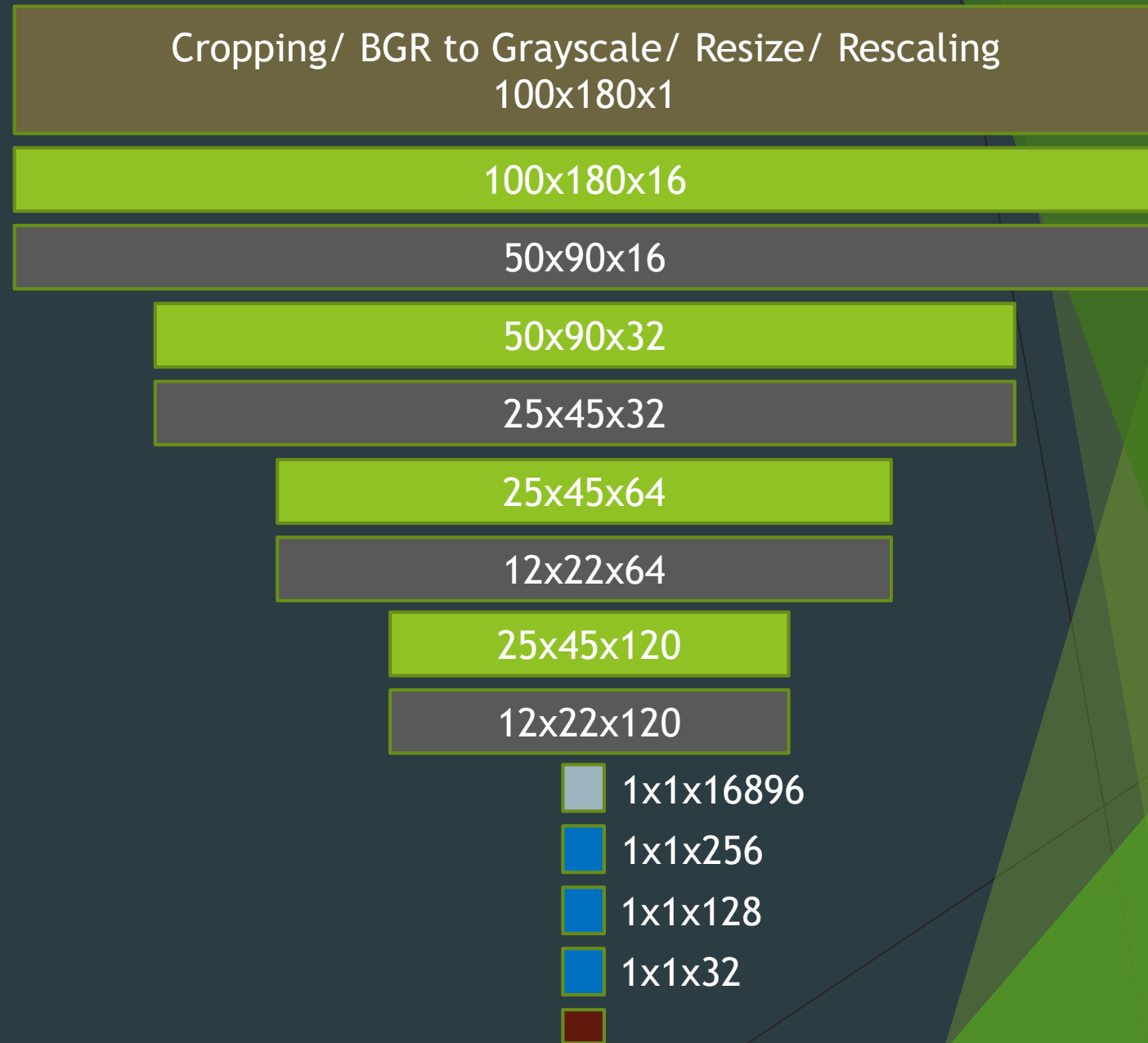
[HW engines]
APE: 25MHz
NVENC: [OFF] NVDEC: [OFF]
NVJPG: [OFF]

1ALL 2GPU 3CPU 4MEM 5CTRL 6INFO Quit
Raffaello Bonghi
```

Not enough memory,
Only 2GB

Robot model for the Jetson

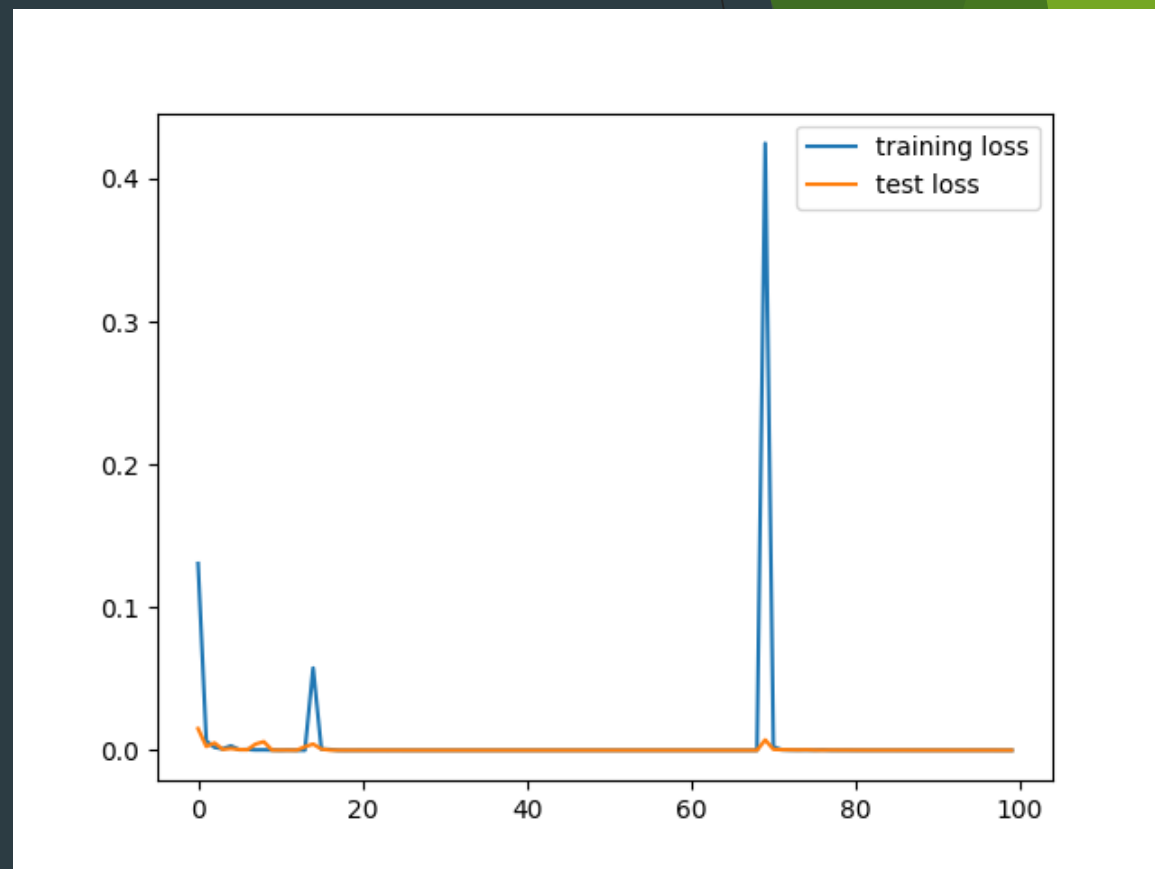
- Convolution + ReLU
- MaxPooling
- Flatten
- Linear
- Softmax



Robot training time on llrai01 : pytorch

Time	Pytorch
Import	2.43 s
Loader setup	0.24 s
Model setup	1.10 s
Mean train*	112.33 s
Train/image	2.12 ms
Mean test/epoch	11.98 s
Test/image	2.03 ms

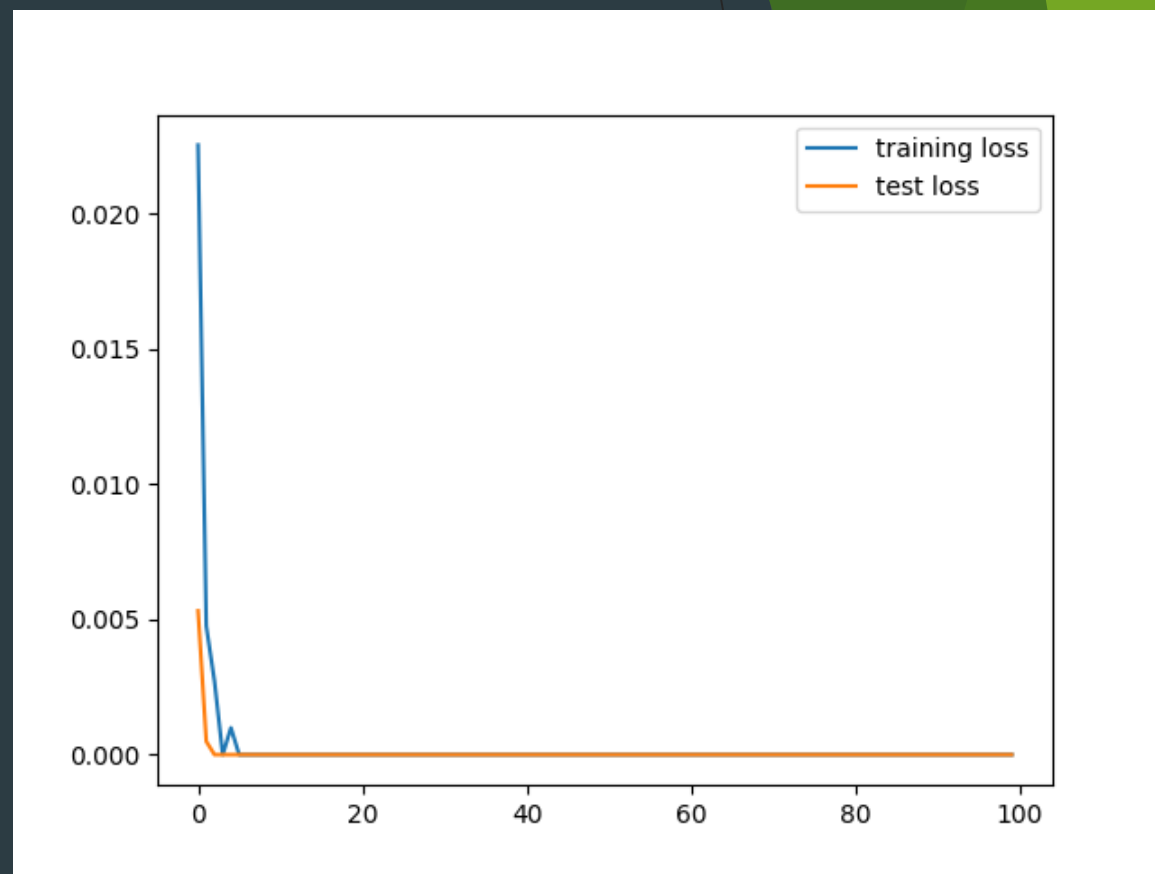
With training set :
Final loss : $2\text{E-}4$
Final accuracy : 100%



Robot training time on llrai01 : tensorflow

Time	tensorflow
Import	2.93 s
Loader setup	9.00 s
Model setup	0.15 s
Mean train*	7.58 s
Train/image	0.13 ms
Mean test/epoch	1.17 s
Test/image	9.9E-2 ms

With training set :
Final loss : 2E-4
Final accuracy : 100%



Robot training time on llrai01

Time	tensorflow	Pytorch
Import	2.93 s	2.43 s
Loader setup	9.00 s	0.24 s
Model setup	0.15 s	1.10 s
Mean train*	7.58 s	112.33 s
Train/image	0.13 ms	2.12 ms
Mean test/epoch	1.17 s	11.98 s
Test/image	9.9E-2 ms	2.03 ms

Robot with camera time : tensorflow model

time	Robot model
Import time	18.65 s
Camera setting time	2.39 s
Model loading time	15.54 s
After 2 min :	
Mean image setup time*	6.31 ms
Mean forward time*	0.28 s
Mean frame time*	0.29 s

Test made with a picture took every 2 sec

*mean made on 10 frames

Pytorch not working (Segmentation fault)

Link to the github :

- ▶ https://github.com/Loe2b/my_ml