### HM5

### April 19, 2024

### 1 Imports

```
[]: | #for typing
     from typing import List
     from PIL import Image
     import numpy as np
     # training visualization
     from tqdm import tqdm
     import matplotlib.pyplot as plt
     from torchvision import transforms
     from torchvision.datasets import DatasetFolder
     import cv2
     import torch
     import torch.nn as nn
     from torch import nn, optim
     import lightning as L
     import torch.nn.functional as F
     import torchvision.models as models
     from torchinfo import summary
     torch.__version__
```

```
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
warn(
```

[]: '2.2.2+cu121'

### 2 Load Data

```
[]: from torchvision import transforms
     transform = transforms.Compose([
       transforms.Resize(256),
       transforms.CenterCrop(224),
       transforms.ToTensor(),
       transforms.Normalize(
           mean=[0.485, 0.456, 0.406],
           std=[0.229, 0.224, 0.225])])
     def load_image(img_path:str):
             np\_img = cv2.imread(img\_path) #CV2 to open and convert BMP mages into_{\sqcup}
      → NUMPY
             #np_imq_gray = cv2.imread(imq_path, cv2.IMREAD_GRAYSCALE)
             return Image.fromarray(np_img) #we need Image for the transforms to⊔
      \hookrightarrowwork correctly
     dset = DatasetFolder(root='../../datasets/NEUdata', loader = load_image,__
      ⇔extensions = ('.bmp',), transform = transform)
     train_set, val_set = random_split(
```

75

38

# 3 Test Encoder/Decoder artichure

```
[]: encoder = nn.Sequential(
               nn.Conv2d(3, 6, kernel_size=5, stride=2, padding=1),
               nn.GELU().
               nn.AdaptiveAvgPool2d((55,55)),
               nn.BatchNorm2d(6),
               nn.Conv2d(6, 16, kernel_size=3, stride=2, padding=1),
               nn.GELU(),
               nn.AdaptiveAvgPool2d(output_size=(32,32)),
               nn.BatchNorm2d(16),
               nn.Conv2d(16, 2, kernel_size=3, stride=2, padding=1),
               nn.GELU(),
           )
    summary(encoder, input_size=(16, 3, 224, 224), row_settings=("depth", __

¬"ascii_only"))
[]: ------
    ========
    Layer (type:depth-idx)
                                        Output Shape
                                                                Param #
    =======
                                         [16, 2, 16, 16]
    Sequential
                                         [16, 6, 111, 111]
    + Conv2d: 1-1
                                                                456
    + GELU: 1-2
                                         [16, 6, 111, 111]
                                         [16, 6, 55, 55]
    + AdaptiveAvgPool2d: 1-3
    + BatchNorm2d: 1-4
                                         [16, 6, 55, 55]
    + Conv2d: 1-5
                                         [16, 16, 28, 28]
                                                                880
    + GELU: 1-6
                                         [16, 16, 28, 28]
    + AdaptiveAvgPool2d: 1-7
                                         [16, 16, 32, 32]
    + BatchNorm2d: 1-8
                                         [16, 16, 32, 32]
                                                                32
    + Conv2d: 1-9
                                         [16, 2, 16, 16]
                                                                290
    + GELU: 1-10
                                         [16, 2, 16, 16]
    ______
    _____
    Total params: 1,670
    Trainable params: 1,670
    Non-trainable params: 0
    Total mult-adds (M): 102.12
    ========
    Input size (MB): 9.63
    Forward/backward pass size (MB): 15.55
    Params size (MB): 0.01
    Estimated Total Size (MB): 25.19
```

\_\_\_\_\_

=======

```
[]: decoder = nn.Sequential(
                 nn.ConvTranspose2d(2, 8,
                                     kernel_size=3,
                                     stride=4,
                                     padding=1,
                                     output_padding=2),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d((64,64)),
                 nn.BatchNorm2d(8),
                 nn.ConvTranspose2d(8, 16,
                                     kernel_size=3,
                                     stride=2,
                                     padding=1,
                                     output_padding=1),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d((112,112)),
                 nn.BatchNorm2d(16),
                 nn.ConvTranspose2d(16, 3,
                                     kernel_size=3,
                                     stride=2,
                                     padding=1,
                                     output_padding=1),
                 nn.Sigmoid()
             )
     summary(decoder, input_size=(16, 2, 16, 16), row_settings=("depth", __

¬"ascii_only"))
```

#### []: -----======== Layer (type:depth-idx) Output Shape Param # \_\_\_\_\_\_ ======== [16, 3, 224, 224] Sequential + ConvTranspose2d: 1-1 [16, 8, 63, 63] 152 + GELU: 1-2 [16, 8, 63, 63] + AdaptiveAvgPool2d: 1-3 [16, 8, 64, 64] \_\_ + BatchNorm2d: 1-4 [16, 8, 64, 64] 16 [16, 16, 128, 128] + ConvTranspose2d: 1-5 1,168 [16, 16, 128, 128] + GELU: 1-6 + AdaptiveAvgPool2d: 1-7 [16, 16, 112, 112] + BatchNorm2d: 1-8 [16, 16, 112, 112] 32 + ConvTranspose2d: 1-9 [16, 3, 224, 224] 435 + Sigmoid: 1-10 [16, 3, 224, 224]

```
Total params: 1,803
Trainable params: 1,803
Non-trainable params: 0
Total mult-adds (M): 665.06

-------
Input size (MB): 0.03
Forward/backward pass size (MB): 86.77
Params size (MB): 0.01
Estimated Total Size (MB): 86.81
```

### 4 Write AutoEncoder

========

```
[]: class Autoencoder(L.LightningModule):
         def __init__(self, config):
             super(Autoencoder, self).__init__()
             self.lr = config['lr']
             self.weight_decay = config['weight_decay']
             self.encoder = nn.Sequential(
                 nn.Conv2d(3, 6, kernel_size=5, stride=2, padding=1),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d((55,55)),
                 nn.BatchNorm2d(6),
                 nn.Conv2d(6, 16, kernel_size=3, stride=2, padding=1),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d(output_size=(32,32)),
                 nn.BatchNorm2d(16),
                 nn.Conv2d(16, 2, kernel_size=3, stride=2, padding=1),
                 nn.GELU(),
             self.decoder = nn.Sequential(
                 nn.ConvTranspose2d(2, 8,
                                    kernel_size=3,
                                    stride=4,
                                    padding=1,
                                    output_padding=2),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d((64,64)),
                 nn.BatchNorm2d(8),
                 nn.ConvTranspose2d(8, 16,
                                    kernel_size=3,
```

```
stride=2,
                           padding=1,
                           output_padding=1),
        nn.GELU(),
        nn.AdaptiveAvgPool2d((112,112)),
        nn.BatchNorm2d(16),
        nn.ConvTranspose2d(16, 3,
                           kernel_size=3,
                           stride=2,
                           padding=1,
                           output_padding=1),
        nn.Sigmoid()
    )
    self.hist={'train':[], 'val':[]}
def forward(self, x):
    x = self.encoder(x)
    x = self.decoder(x)
    return x
def training_step(self, batch, batch_idx):
    img, _ = batch
    recon = self.forward(img)
    # print(img.shape, recon.shape)
    loss = F.mse_loss(recon, img)
    self.log('train_loss', loss, prog_bar=True)
    if batch_idx==0:
        self.hist['train'].append((loss, img[:9], recon[:9]))
    return loss
def validation_step(self, batch, batch_idx):
    img, _ = batch
    recon = self.forward(img)
    loss = F.mse_loss(recon, img)
    self.log('val_loss', loss, prog_bar=True)
    if batch_idx==0:
        self.hist['val'].append((loss, img[:9], recon[:9]))
    return {'val_loss': loss}
def configure_optimizers(self):
    optimizer = optim.Adam(self.parameters(), lr=self.lr,
                           weight_decay=self.weight_decay)
```

```
lr_scheduler = torch.optim.lr_scheduler.StepLR(optimizer, step_size=75,_u
 ⇒gamma=0.5, last_epoch=-1)
        return {"optimizer": optimizer, "lr_scheduler": lr_scheduler}
    Ostaticmethod
    def plot encoder decoder(outputs: List, title: str):
        fig= plt.figure(figsize=(9, 2))
        fig.suptitle(title)
        imgs = outputs[1].detach().cpu().numpy()
        recon = outputs[2].detach().cpu().numpy()
        for i, item in enumerate(imgs):
                plt.subplot(2, 9, i+1)
                plt.axis("off")
                plt.imshow(item[0], cmap="gray")
        for i, item in enumerate(recon):
            plt.subplot(2, 9, 9+i+1)
            plt.axis("off")
            plt.imshow(item[0], cmap="gray")
    def plot autoencoder results(self, num epochs):
        for k in range(0, num_epochs//5):
            Autoencoder.plot_encoder_decoder(self.hist["train"][k*5],_
 ⇔title=f"train_{k}")
            Autoencoder.plot_encoder_decoder(self.hist["val"][k*5],_
 ⇔title=f"val {k}")
class NEUDataModule(L.LightningDataModule):
    def __init__(self, batch_size=128):
        super().__init__()
        self.data_dir = '/mnt/c/M3/Projects/Rowan/ADV MODELS/datasets/NEUdata'
        self.batch_size = batch_size
        self.transform = transforms.Compose(
            [transforms.ToTensor(), transforms.Normalize((0.1307,), (0.3081,))]
        )
    def setup(self, stage=None):
        dset = DatasetFolder(root=self.data_dir, loader = load_image,__
 ⇔extensions = ('.bmp',), transform = transform)
        self.train_set, self.val_set = random_split(
                    dset,
                    [1200, 600])
    def train_dataloader(self):
```

```
return torch.utils.data.DataLoader(self.train_set, batch_size=self.

batch_size, shuffle=True, num_workers=1)

def val_dataloader(self):
    return torch.utils.data.DataLoader(self.val_set, batch_size=self.

batch_size, shuffle=False, num_workers=1)
```

## 5 Training

```
[]: torch.cuda.is_available()

[]: True

[]: # I've changed the model for ray tuneing so now it will get config
autoencoder = Autoencoder()

# train model
trainer = L.Trainer(max_epochs=30, )
# I've changed the model for ray tuneing so now it will get DataModule instead_u
of dataloader
trainer.fit(autoencoder, trainloader, valloader)
autoencoder.plot autoencoder results(30)
```

Trainer will use only 1 of 2 GPUs because it is running inside an interactive / notebook environment. You may try to set `Trainer(devices=2)` but please note that multi-GPU inside interactive / notebook environments is considered experimental and unstable. Your mileage may vary.

GPU available: True (cuda), used: True

TPU available: False, using: 0 TPU cores

IPU available: False, using: 0 IPUs

HPU available: False, using: 0 HPUs

You are using a CUDA device ('NVIDIA GeForce RTX 4090') that has Tensor Cores.

To properly utilize them, you should set

`torch.set\_float32\_matmul\_precision('medium' | 'high')` which will trade-off precision for performance. For more details, read https://pytorch.org/docs/stable/generated/torch.set\_float32\_matmul\_precision.html#torch.set\_float32\_matmul\_precision

Missing logger folder: /mnt/c/M3/Projects/Rowan/ADV MODELS/HM/HW5/lightning\_logs LOCAL\_RANK: 0 - CUDA\_VISIBLE\_DEVICES: [0,1]

3.5 K Trainable params

0 Non-trainable params

3.5 K Total params

0.014 Total estimated model params size (MB)

Sanity Checking: | | 0/? [00:00<?, ?it/s]

/home/woreom/miniconda3/envs/adv/lib/python3.9/sitepackages/lightning/pytorch/trainer/connectors/data\_connector.py:492: Your `val\_dataloader`'s sampler has shuffling enabled, it is strongly recommended that you turn shuffling off for val/test dataloaders.

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

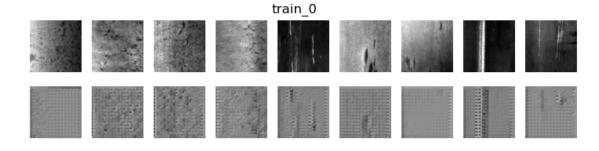
packages/lightning/pytorch/trainer/connectors/data\_connector.py:441: The 'val\_dataloader' does not have many workers which may be a bottleneck. Consider increasing the value of the `num\_workers` argument` to `num\_workers=31` in the `DataLoader` to improve performance.

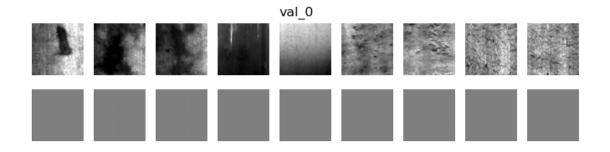
/home/woreom/miniconda3/envs/adv/lib/python3.9/sitepackages/lightning/pytorch/trainer/connectors/data\_connector.py:441: The
'train\_dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num\_workers` argument` to `num\_workers=31`
in the `DataLoader` to improve performance.

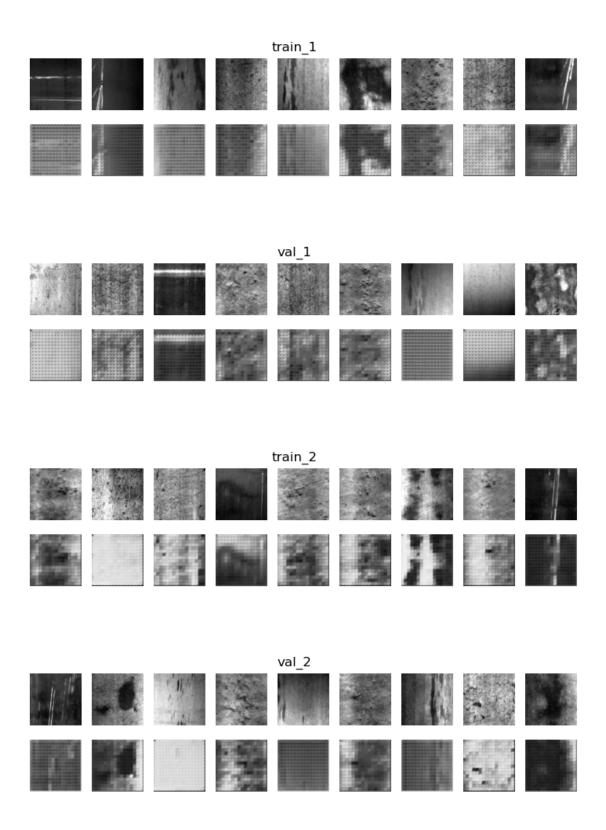
Epoch 29: 100% | 75/75 [00:10<00:00, 7.21it/s, v\_num=0, train\_loss=0.381, val\_loss=0.430]

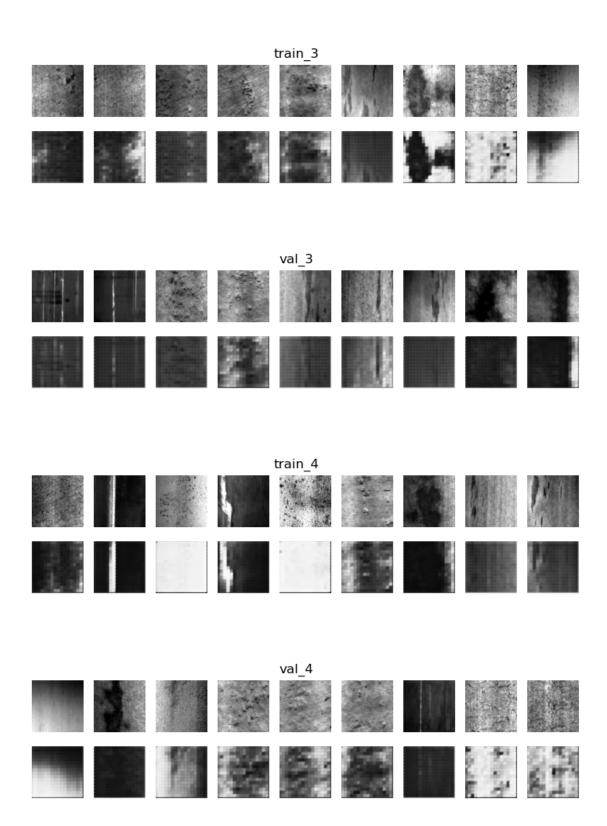
`Trainer.fit` stopped: `max\_epochs=30` reached.

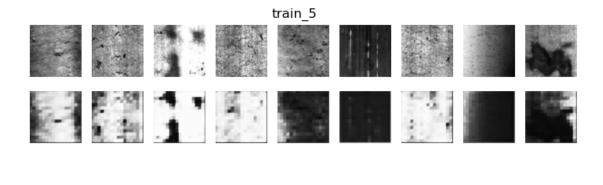
Epoch 29: 100% | 75/75 [00:10<00:00, 7.20it/s, v\_num=0, train\_loss=0.381, val\_loss=0.430]

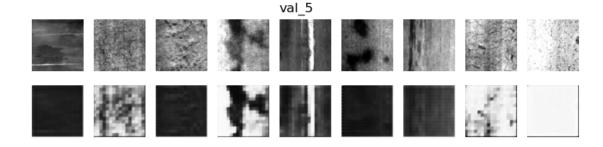












# 6 Tuning with Ray

```
[]: from ray.train.lightning import (
         RayDDPStrategy,
         RayLightningEnvironment,
         RayTrainReportCallback,
         prepare_trainer,
     from ray import tune
     from ray.tune.schedulers import ASHAScheduler
     from ray.train import RunConfig, ScalingConfig, CheckpointConfig
     from ray.train.torch import TorchTrainer
     default_config = {
         "weight_decay": 1e-6,
         "lr": 5e-5,
         "batch_size": 16,
     }
     def train_func(config):
         dm = NEUDataModule(batch_size=config["batch_size"])
         autoencoder = Autoencoder(config)
```

```
trainer = L.Trainer(
        devices="auto",
        accelerator="auto",
        strategy=RayDDPStrategy(),
        callbacks=[RayTrainReportCallback()],
        plugins=[RayLightningEnvironment()],
        enable_progress_bar=False,
        max_epochs=30,
    )
    trainer = prepare_trainer(trainer)
    trainer.fit(autoencoder, datamodule=dm)
search_space = {
    "lr": tune.loguniform(1e-6, 1e-1),
    "batch_size": tune.choice([16, 32, 64]),
    "weight_decay": tune.choice([1e-6])
}
# The maximum training epochs
num_epochs = 30
# Number of samples from parameter space
num samples = 10
scheduler = ASHAScheduler(max_t=num_epochs, grace_period=1, reduction_factor=2)
scaling_config = ScalingConfig(
    num_workers=1, use_gpu=True, resources_per_worker={"CPU": 10, "GPU": 1}
)
run_config = RunConfig(
    checkpoint_config=CheckpointConfig(
        num_to_keep=2,
        checkpoint_score_attribute="val_loss",
        checkpoint_score_order="min",
    ),
)
# Define a TorchTrainer without hyper-parameters for Tuner
ray_trainer = TorchTrainer(
    train_func,
    scaling_config=scaling_config,
    run_config=run_config,
```

```
def tune_NEU_asha(num_samples=10):
         scheduler = ASHAScheduler(max_t=num_epochs, grace_period=1,__
      →reduction_factor=2)
         tuner = tune.Tuner(
             ray trainer,
             param_space={"train_loop_config": search_space},
             tune_config=tune.TuneConfig(
                 metric="val_loss",
                 mode="min",
                 num_samples=num_samples,
                 scheduler=scheduler,
             ),
         )
         return tuner.fit()
[]: results = tune_NEU_asha(num_samples=num_samples)
    <IPython.core.display.HTML object>
    (TrainTrainable pid=72585)
    /home/woreom/miniconda3/envs/adv/lib/python3.9/site-
    packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
    extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
    packages/torchvision/image.so: undefined symbol:
    _ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
    from `torchvision.io`, you can ignore this warning. Otherwise, there might be
    something wrong with your environment. Did you have `libjpeg` or `libpng`
    installed before building `torchvision` from source?
    (TrainTrainable pid=72585)
                                 warn(
    (RayTrainWorker pid=72906) Setting up process group for: env://
    [rank=0, world_size=1]
    (TorchTrainer pid=72585) Started distributed worker processes:
    (TorchTrainer pid=72585) - (ip=172.20.7.104, pid=72906) world_rank=0,
    local rank=0, node rank=0
    (RayTrainWorker pid=72906) [W Utils.hpp:133] Warning: Environment
    variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
    TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarInt)
    (RayTrainWorker pid=72906) GPU available: True (cuda), used: True
    (RayTrainWorker pid=72906) TPU available: False, using: 0 TPU cores
    (RayTrainWorker pid=72906) IPU available: False, using: 0 IPUs
    (RayTrainWorker pid=72906) HPU available: False, using: 0 HPUs
    (RayTrainWorker pid=72906) You are using a CUDA device ('NVIDIA GeForce
    RTX 4090') that has Tensor Cores. To properly utilize them, you should set
    `torch.set_float32_matmul_precision('medium' | 'high')` which will trade-off
```

precision for performance. For more details, read https://pytorch.org/docs/stable/generated/torch.set\_float32\_matmul\_precision.html#torch.set\_float32\_matmul\_pre

```
cision
```

```
(RayTrainWorker pid=72906) Missing logger folder: /tmp/ray/session_2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18_21-39-43/working_dirs/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weig
ht decay=0.0000 2024-04-18 21-39-47/lightning logs
(RayTrainWorker pid=72906) LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [0]
(RayTrainWorker pid=72906) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=72906)
(RayTrainWorker pid=72906)
                                       | Type
                             | Name
                                                    | Params
(RayTrainWorker pid=72906) -----
(RayTrainWorker pid=72906) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=72906) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=72906) -----
(RayTrainWorker pid=72906) 3.5 K
                                     Trainable params
(RayTrainWorker pid=72906) 0
                                     Non-trainable params
(RayTrainWorker pid=72906) 3.5 K
                                     Total params
(RayTrainWorker pid=72906) 0.014
                                    Total estimated model params size
(MB)
(RayTrainWorker pid=72906)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'val_dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=72906)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=72906)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num_workers` argument` to `num_workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=72919)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/loops/fit_loop.py:298: The number of training batches
(19) is smaller than the logging interval Trainer(log_every_n_steps=50). Set a
lower value for log_every_n_steps if you want to see logs for the training
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
```

(RayTrainWorker pid=72919)

```
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source? [repeated 3x across
cluster] (Ray deduplicates logs by default. Set RAY DEDUP LOGS=0 to disable log
deduplication, or see https://docs.ray.io/en/master/ray-observability/user-
guides/configure-logging.html#log-deduplication for more options.)
(RayTrainWorker pid=72919) warn( [repeated 3x across
cluster]
(RayTrainWorker pid=72919) Setting up process group for: env://
[rank=0, world size=1]
(TorchTrainer pid=72586) Started distributed worker processes:
(TorchTrainer pid=72586) - (ip=172.20.7.104, pid=72919) world rank=0,
local_rank=0, node_rank=0
(RayTrainWorker pid=72919) [W Utils.hpp:133] Warning: Environment
variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarInt)
(RayTrainWorker pid=72919) GPU available: True (cuda), used: True
(RayTrainWorker pid=72919) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=72919) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=72919) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=72919) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set float32 matmul precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set float32 matmul precision.html#torch.set float32 matmul pre
cision
(RayTrainWorker pid=72919) Missing logger folder: /tmp/ray/session 2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18_21-39-43/working_dirs/TorchTrainer_b4607_00001_1_batch_size=64,lr=0.0020,weig
ht_decay=0.0000_2024-04-18_21-39-47/lightning_logs
(RayTrainWorker pid=72919) LOCAL_RANK: O - CUDA_VISIBLE DEVICES: [1]
(RayTrainWorker pid=72919) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=72919)
                                      | Type
(RayTrainWorker pid=72919) | Name
                                                    | Params
(RayTrainWorker pid=72919) -----
[repeated 2x across cluster]
(RayTrainWorker pid=72919) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=72919) 1 | decoder | Sequential | 1.8 K
```

```
(RayTrainWorker pid=72919) 3.5 K
                                     Trainable params
(RayTrainWorker pid=72919) 0
                                     Non-trainable params
(RayTrainWorker pid=72919) 3.5 K
                                     Total params
(RayTrainWorker pid=72919) 0.014
                                     Total estimated model params size
(MB)
(RayTrainWorker pid=72919)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'val dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=72919)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=72919)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num workers` argument` to `num workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=73515) Setting up process group for: env://
[rank=0, world_size=1]
(TorchTrainer pid=73436) Started distributed worker processes:
(TorchTrainer pid=73436) - (ip=172.20.7.104, pid=73515) world_rank=0,
local_rank=0, node_rank=0
(RayTrainWorker pid=73515) [W Utils.hpp:133] Warning: Environment
variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarInt)
(RayTrainWorker pid=72919) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00001_1_batch_size=64,lr=0.0020,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
(RayTrainWorker pid=73515)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source? [repeated 2x across
(RayTrainWorker pid=73515) warn([repeated 2x across
```

cluster]

```
(RayTrainWorker pid=73515) GPU available: True (cuda), used: True
(RayTrainWorker pid=73515) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=73515) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=73515) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=73515) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set float32 matmul precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set float32 matmul precision.html#torch.set float32 matmul pre
cision
(RayTrainWorker pid=73515) Missing logger folder: /tmp/ray/session 2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18_21-39-43/working_dirs/TorchTrainer_b4607_00002_2_batch_size=32,lr=0.0001,weig
ht_decay=0.0000_2024-04-18_21-39-47/lightning_logs
(RayTrainWorker pid=73515) LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [1]
(RayTrainWorker pid=73515) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=73515)
(RayTrainWorker pid=73515)
                                       | Type
                             Name
                                                    | Params
(RayTrainWorker pid=73515) -----
(RayTrainWorker pid=73515) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=73515) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=73515) -----
(RayTrainWorker pid=73515) 3.5 K
                                     Trainable params
(RayTrainWorker pid=73515) 0
                                     Non-trainable params
(RayTrainWorker pid=73515) 3.5 K
                                     Total params
(RayTrainWorker pid=73515) 0.014
                                    Total estimated model params size
(MB)
(RayTrainWorker pid=73515)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'val dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=73515)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=73515)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train_dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num_workers` argument` to `num_workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=73515)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
```

```
packages/lightning/pytorch/loops/fit_loop.py:298: The number of training batches
(38) is smaller than the logging interval Trainer(log_every_n_steps=50). Set a
lower value for log_every_n_steps if you want to see logs for the training
epoch.
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray results/TorchTrainer 2024-04-
18 21-39-43/TorchTrainer b4607 00000 0 batch size=16,lr=0.0022,weight decay=0.00
00_2024-04-18_21-39-47/checkpoint_000001)
(RayTrainWorker pid=73515) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00002_2_batch_size=32,lr=0.0001,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000002)
(TrainTrainable pid=73918)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(TrainTrainable pid=73918)
                             warn(
(TorchTrainer pid=73918) Started distributed worker processes:
(TorchTrainer pid=73918) - (ip=172.20.7.104, pid=74032) world_rank=0,
local rank=0, node rank=0
(RayTrainWorker pid=74032) Setting up process group for: env://
[rank=0, world size=1]
(RayTrainWorker pid=74032) [W Utils.hpp:133] Warning: Environment
variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarInt)
(RayTrainWorker pid=74032) GPU available: True (cuda), used: True
(RayTrainWorker pid=74032) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=74032) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=74032) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=74032) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set_float32_matmul_precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set_float32_matmul_precision.html#torch.set_float32_matmul_pre
cision
(RayTrainWorker pid=74032) Missing logger folder: /tmp/ray/session_2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18_21-39-43/working_dirs/TorchTrainer_b4607_00003_3_batch_size=64,lr=0.0003,weig
```

ht\_decay=0.0000\_2024-04-18\_21-39-47/lightning\_logs

```
(RayTrainWorker pid=74032) LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [1]
(RayTrainWorker pid=74032) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL ASYNC ERROR HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=74032)
(RayTrainWorker pid=74032)
                             | Name
                                       | Type
(RayTrainWorker pid=74032) -----
(RayTrainWorker pid=74032) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=74032) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=74032) -----
(RayTrainWorker pid=74032) 3.5 K
                                     Trainable params
(RayTrainWorker pid=74032) 0
                                     Non-trainable params
(RayTrainWorker pid=74032) 3.5 K
                                     Total params
(RayTrainWorker pid=74032) 0.014
                                     Total estimated model params size
(MB)
(RayTrainWorker pid=74032)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'val_dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=74032)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=74032)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train_dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num_workers` argument` to `num_workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=74032)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/loops/fit loop.py:298: The number of training batches
(19) is smaller than the logging interval Trainer(log_every_n_steps=50). Set a
lower value for log_every_n_steps if you want to see logs for the training
epoch.
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000003)
(RayTrainWorker pid=74032)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
```

```
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(RayTrainWorker pid=74032)
                             warn(
(RayTrainWorker pid=74032) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray results/TorchTrainer 2024-04-
18 21-39-43/TorchTrainer b4607 00003 3 batch size=64,lr=0.0003,weight decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
(RayTrainWorker pid=74032) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00003_3_batch_size=64,lr=0.0003,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000001) [repeated 2x across cluster]
(TrainTrainable pid=74588)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(TrainTrainable pid=74588)
(RayTrainWorker pid=74669) Setting up process group for: env://
[rank=0, world_size=1]
(TorchTrainer pid=74588) Started distributed worker processes:
(TorchTrainer pid=74588) - (ip=172.20.7.104, pid=74669) world rank=0,
local_rank=0, node_rank=0
(RayTrainWorker pid=74669) [W Utils.hpp:133] Warning: Environment
variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarInt)
(RayTrainWorker pid=74669) GPU available: True (cuda), used: True
(RayTrainWorker pid=74669) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=74669) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=74669) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=74669) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set float32 matmul precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set_float32_matmul_precision.html#torch.set_float32_matmul_pre
cision
(RayTrainWorker pid=74669) Missing logger folder: /tmp/ray/session_2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18 21-39-43/working dirs/TorchTrainer b4607 00004 4 batch size=16,lr=0.0000,weig
ht_decay=0.0000_2024-04-18_21-39-47/lightning_logs
(RayTrainWorker pid=74669) LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [1]
(RayTrainWorker pid=74669) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
```

```
(RayTrainWorker pid=74669)
(RayTrainWorker pid=74669) | Name
                                      | Type
                                                  | Params
(RayTrainWorker pid=74669) ------
(RayTrainWorker pid=74669) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=74669) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=74669) ------
(RayTrainWorker pid=74669) 3.5 K
                                    Trainable params
(RayTrainWorker pid=74669) 0
                                    Non-trainable params
(RayTrainWorker pid=74669) 3.5 K
                                    Total params
(RayTrainWorker pid=74669) 0.014
                                    Total estimated model params size
(MB)
(RayTrainWorker pid=74669)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'val_dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607 00000 0 batch size=16,lr=0.0022,weight decay=0.00
00 2024-04-18 21-39-47/checkpoint 000005)
(RayTrainWorker pid=74669)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=74669)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train_dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num_workers` argument` to `num_workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607 00000 0 batch size=16,lr=0.0022,weight decay=0.00
00_2024-04-18_21-39-47/checkpoint_000006)
(RayTrainWorker pid=74669)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(RayTrainWorker pid=74669)
                            warn(
(TrainTrainable pid=75039)
```

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

```
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(TrainTrainable pid=75039)
(TorchTrainer pid=75039) Started distributed worker processes:
(TorchTrainer pid=75039) - (ip=172.20.7.104, pid=75154) world_rank=0,
local_rank=0, node_rank=0
(RayTrainWorker pid=74669) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00004 4_batch_size=16,lr=0.0000,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
(RayTrainWorker pid=75154) Setting up process group for: env://
[rank=0, world_size=1]
(RayTrainWorker pid=75154) [W Utils.hpp:133] Warning: Environment
variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH NCCL ASYNC ERROR HANDLING instead (function getCvarInt)
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray results/TorchTrainer 2024-04-
18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000007)
(RayTrainWorker pid=75154) GPU available: True (cuda), used: True
(RayTrainWorker pid=75154) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=75154) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=75154) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=75154) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set_float32_matmul_precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set_float32_matmul_precision.html#torch.set_float32_matmul_pre
cision
(RayTrainWorker pid=75154) Missing logger folder: /tmp/ray/session 2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18_21-39-43/working_dirs/TorchTrainer_b4607_00005_5_batch_size=16,lr=0.0012,weig
ht_decay=0.0000_2024-04-18_21-39-47/lightning_logs
(RayTrainWorker pid=75154) LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [1]
(RayTrainWorker pid=75154) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=75154)
(RayTrainWorker pid=75154)
                          | Name
                                      | Type
(RayTrainWorker pid=75154) -----
(RayTrainWorker pid=75154) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=75154) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=75154) ------
```

```
(RayTrainWorker pid=75154) 3.5 K
                                     Trainable params
(RayTrainWorker pid=75154) 0
                                     Non-trainable params
(RayTrainWorker pid=75154) 3.5 K
                                     Total params
(RayTrainWorker pid=75154) 0.014
                                     Total estimated model params size
(MB)
(RayTrainWorker pid=75154)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'val dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=75154)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=75154)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num_workers` argument` to `num_workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000008)
(RayTrainWorker pid=75154)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(RayTrainWorker pid=75154)
(RayTrainWorker pid=75154) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18_21-39-43/TorchTrainer_b4607_00005_5_batch_size=16,lr=0.0012,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000009)
(RayTrainWorker pid=75154) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18_21-39-43/TorchTrainer_b4607_00005_5_batch_size=16,lr=0.0012,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000001)
```

```
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000010)
(RayTrainWorker pid=75154) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray results/TorchTrainer 2024-04-
18 21-39-43/TorchTrainer b4607 00005 5 batch size=16,lr=0.0012,weight decay=0.00
00_2024-04-18_21-39-47/checkpoint_000002)
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000011)
(RayTrainWorker pid=75154) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18_21-39-43/TorchTrainer_b4607_00005_5_batch_size=16,lr=0.0012,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000003)
(TrainTrainable pid=76080)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(TrainTrainable pid=76080)
                             warn(
(RayTrainWorker pid=76159) Setting up process group for: env://
[rank=0, world_size=1]
(TorchTrainer pid=76080) Started distributed worker processes:
(TorchTrainer pid=76080) - (ip=172.20.7.104, pid=76159) world_rank=0,
local rank=0, node rank=0
(RayTrainWorker pid=76159) [W Utils.hpp:133] Warning: Environment
variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarInt)
(RayTrainWorker pid=76159) GPU available: True (cuda), used: True
(RayTrainWorker pid=76159) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=76159) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=76159) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=76159) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set_float32_matmul_precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set_float32_matmul_precision.html#torch.set_float32_matmul_pre
cision
(RayTrainWorker pid=76159) Missing logger folder: /tmp/ray/session 2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18_21-39-43/working_dirs/TorchTrainer_b4607_00006_6_batch_size=64,lr=0.0001,weig
```

ht\_decay=0.0000\_2024-04-18\_21-39-47/lightning\_logs

```
(RayTrainWorker pid=76159) LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [1]
(RayTrainWorker pid=76159) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL ASYNC ERROR HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=76159)
(RayTrainWorker pid=76159)
                             | Name
                                       | Type
(RayTrainWorker pid=76159) -----
(RayTrainWorker pid=76159) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=76159) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=76159) -----
(RayTrainWorker pid=76159) 3.5 K
                                     Trainable params
(RayTrainWorker pid=76159) 0
                                     Non-trainable params
(RayTrainWorker pid=76159) 3.5 K
                                     Total params
(RayTrainWorker pid=76159) 0.014
                                     Total estimated model params size
(MB)
(RayTrainWorker pid=76159)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'val_dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=76159)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=76159)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train_dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num_workers` argument` to `num_workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=76159)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/loops/fit loop.py:298: The number of training batches
(19) is smaller than the logging interval Trainer(log_every_n_steps=50). Set a
lower value for log_every_n_steps if you want to see logs for the training
epoch.
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000012)
(RayTrainWorker pid=76159)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
```

```
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(RayTrainWorker pid=76159)
                             warn(
(RayTrainWorker pid=76159) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray results/TorchTrainer 2024-04-
18 21-39-43/TorchTrainer b4607 00006 6 batch size=64,lr=0.0001,weight decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000013)
(RayTrainWorker pid=76159) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00006_6_batch_size=64,lr=0.0001,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000001)
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00 2024-04-18 21-39-47/checkpoint 000014)
(TrainTrainable pid=76712)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(TrainTrainable pid=76712)
(TorchTrainer pid=76712) Started distributed worker processes:
(TorchTrainer pid=76712) - (ip=172.20.7.104, pid=76823) world_rank=0,
local_rank=0, node_rank=0
(RayTrainWorker pid=76823) Setting up process group for: env://
[rank=0, world size=1]
(RayTrainWorker pid=76823) [W Utils.hpp:133] Warning: Environment
variable NCCL ASYNC ERROR HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarInt)
(RayTrainWorker pid=76823) GPU available: True (cuda), used: True
(RayTrainWorker pid=76823) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=76823) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=76823) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=76823) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set_float32_matmul_precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set_float32_matmul_precision.html#torch.set_float32_matmul_pre
cision
```

```
(RayTrainWorker pid=76823) Missing logger folder: /tmp/ray/session_2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18 21-39-43/working dirs/TorchTrainer_b4607_00007_7_batch_size=64,lr=0.0002,weig
ht_decay=0.0000_2024-04-18_21-39-47/lightning_logs
(RayTrainWorker pid=76823) LOCAL RANK: 0 - CUDA VISIBLE DEVICES: [1]
(RayTrainWorker pid=76823) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL ASYNC ERROR HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=76823)
(RayTrainWorker pid=76823)
                           | Name
                                      | Type
                                               | Params
(RayTrainWorker pid=76823) -----
(RayTrainWorker pid=76823) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=76823) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=76823) ------
(RayTrainWorker pid=76823) 3.5 K
                                    Trainable params
(RayTrainWorker pid=76823) 0
                                   Non-trainable params
(RayTrainWorker pid=76823) 3.5 K
                                   Total params
(RayTrainWorker pid=76823) 0.014 Total estimated model params size
(MB)
(RayTrainWorker pid=76823)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data connector.py:441: The
'val_dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=76823)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=76823)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train_dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num workers` argument` to `num workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=76823)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/loops/fit_loop.py:298: The number of training batches
(19) is smaller than the logging interval Trainer(log_every_n_steps=50). Set a
lower value for log_every_n_steps if you want to see logs for the training
epoch.
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000015)
(RayTrainWorker pid=76823)
```

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

```
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(RayTrainWorker pid=76823)
(RayTrainWorker pid=76823) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607_00007_7_batch_size=64,lr=0.0002,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
(RayTrainWorker pid=76823) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18_21-39-43/TorchTrainer_b4607_00007_7_batch_size=64,lr=0.0002,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000001) [repeated 2x across cluster]
(TrainTrainable pid=77338)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(TrainTrainable pid=77338)
                             warn(
(TorchTrainer pid=77338) Started distributed worker processes:
(TorchTrainer pid=77338) - (ip=172.20.7.104, pid=77453) world_rank=0,
local rank=0, node_rank=0
(RayTrainWorker pid=77453) Setting up process group for: env://
[rank=0, world size=1]
(RayTrainWorker pid=77453) [W Utils.hpp:133] Warning: Environment
variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarInt)
(RayTrainWorker pid=77453) GPU available: True (cuda), used: True
(RayTrainWorker pid=77453) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=77453) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=77453) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=77453) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set_float32_matmul_precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set_float32_matmul_precision.html#torch.set_float32_matmul_pre
cision
(RayTrainWorker pid=77453) Missing logger folder: /tmp/ray/session 2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18_21-39-43/working_dirs/TorchTrainer_b4607_00008_8_batch_size=16,lr=0.0000,weig
ht_decay=0.0000_2024-04-18_21-39-47/lightning_logs
```

```
(RayTrainWorker pid=77453) LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [1]
(RayTrainWorker pid=77453) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL ASYNC ERROR HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=77453)
(RayTrainWorker pid=77453)
                             | Name
                                       | Type
(RayTrainWorker pid=77453) ----
(RayTrainWorker pid=77453) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=77453) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=77453) -----
(RayTrainWorker pid=77453) 3.5 K
                                     Trainable params
(RayTrainWorker pid=77453) 0
                                     Non-trainable params
(RayTrainWorker pid=77453) 3.5 K
                                     Total params
(RayTrainWorker pid=77453) 0.014
                                     Total estimated model params size
(MB)
(RayTrainWorker pid=77453)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'val_dataloader' does not have many workers which may be a bottleneck. Consider
increasing the value of the `num_workers` argument` to `num_workers=31` in the
`DataLoader` to improve performance.
(RayTrainWorker pid=77453)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/logger_connector/result.py:441: It
is recommended to use `self.log('val_loss', ..., sync_dist=True)` when logging
on epoch level in distributed setting to accumulate the metric across devices.
(RayTrainWorker pid=77453)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/lightning/pytorch/trainer/connectors/data_connector.py:441: The
'train_dataloader' does not have many workers which may be a bottleneck.
Consider increasing the value of the `num_workers` argument` to `num_workers=31`
in the `DataLoader` to improve performance.
(RayTrainWorker pid=72906) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607 00000 0 batch size=16,lr=0.0022,weight decay=0.00
00_2024-04-18_21-39-47/checkpoint_000018) [repeated 2x across cluster]
(RayTrainWorker pid=77453)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(RayTrainWorker pid=77453)
                             warn(
(TrainTrainable pid=77856)
/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
```

```
packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python
extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-
packages/torchvision/image.so: undefined symbol:
_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality
from `torchvision.io`, you can ignore this warning. Otherwise, there might be
something wrong with your environment. Did you have `libjpeg` or `libpng`
installed before building `torchvision` from source?
(TrainTrainable pid=77856)
(TorchTrainer pid=77856) Started distributed worker processes:
(TorchTrainer pid=77856) - (ip=172.20.7.104, pid=77935) world_rank=0,
local_rank=0, node_rank=0
(RayTrainWorker pid=77453) Checkpoint successfully created at:
Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
18 21-39-43/TorchTrainer b4607 00008 8 batch size=16,lr=0.0000,weight_decay=0.00
00_2024-04-18_21-39-47/checkpoint_000000)
(RayTrainWorker pid=77935) Setting up process group for: env://
[rank=0, world_size=1]
(RayTrainWorker pid=77935) [W Utils.hpp:133] Warning: Environment
variable NCCL_ASYNC_ERROR_HANDLING is deprecated; use
TORCH NCCL ASYNC ERROR HANDLING instead (function getCvarInt)
(RayTrainWorker pid=77935) GPU available: True (cuda), used: True
(RayTrainWorker pid=77935) TPU available: False, using: 0 TPU cores
(RayTrainWorker pid=77935) IPU available: False, using: 0 IPUs
(RayTrainWorker pid=77935) HPU available: False, using: 0 HPUs
(RayTrainWorker pid=77935) You are using a CUDA device ('NVIDIA GeForce
RTX 4090') that has Tensor Cores. To properly utilize them, you should set
`torch.set_float32_matmul_precision('medium' | 'high')` which will trade-off
precision for performance. For more details, read https://pytorch.org/docs/stabl
e/generated/torch.set_float32_matmul_precision.html#torch.set_float32_matmul_pre
cision
(RayTrainWorker pid=77935) Missing logger folder: /tmp/ray/session 2024
-04-18_21-39-43_850054_70174/artifacts/2024-04-18_21-39-47/TorchTrainer_2024-04-
18 21-39-43/working dirs/TorchTrainer b4607 00009 9 batch size=64,lr=0.0011,weig
ht_decay=0.0000_2024-04-18_21-39-47/lightning_logs
(RayTrainWorker pid=77935) LOCAL RANK: 0 - CUDA VISIBLE DEVICES: [1]
(RayTrainWorker pid=77935) [rank0]:[W Utils.hpp:106] Warning:
Environment variable NCCL ASYNC ERROR HANDLING is deprecated; use
TORCH_NCCL_ASYNC_ERROR_HANDLING instead (function getCvarString)
(RayTrainWorker pid=77935)
(RayTrainWorker pid=77935) | Name
                                      | Type
                                              | Params
(RayTrainWorker pid=77935) -----
(RayTrainWorker pid=77935) 0 | encoder | Sequential | 1.7 K
(RayTrainWorker pid=77935) 1 | decoder | Sequential | 1.8 K
(RayTrainWorker pid=77935) ------
(RayTrainWorker pid=77935) 3.5 K
                                    Trainable params
(RayTrainWorker pid=77935) 0
                                    Non-trainable params
(RayTrainWorker pid=77935) 3.5 K
                                    Total params
(RayTrainWorker pid=77935) 0.014
                                  Total estimated model params size
```

```
(MB)
```

#### (RayTrainWorker pid=77935)

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

packages/lightning/pytorch/trainer/connectors/data\_connector.py:441: The 'val\_dataloader' does not have many workers which may be a bottleneck. Consider increasing the value of the `num\_workers` argument` to `num\_workers=31` in the `DataLoader` to improve performance.

#### (RayTrainWorker pid=77935)

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

packages/lightning/pytorch/trainer/connectors/logger\_connector/result.py:441: It is recommended to use `self.log('val\_loss', ..., sync\_dist=True)` when logging on epoch level in distributed setting to accumulate the metric across devices. (RayTrainWorker pid=77935)

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

packages/lightning/pytorch/trainer/connectors/data\_connector.py:441: The 'train\_dataloader' does not have many workers which may be a bottleneck. Consider increasing the value of the `num\_workers` argument` to `num\_workers=31` in the `DataLoader` to improve performance.

#### (RayTrainWorker pid=77935)

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

packages/lightning/pytorch/loops/fit\_loop.py:298: The number of training batches (19) is smaller than the logging interval Trainer(log\_every\_n\_steps=50). Set a lower value for log\_every\_n\_steps if you want to see logs for the training epoch.

(RayTrainWorker pid=72906) Checkpoint successfully created at:

Checkpoint(filesystem=local, path=/home/woreom/ray\_results/TorchTrainer\_2024-04-18\_21-39-43/TorchTrainer\_b4607\_00000\_0\_batch\_size=16,lr=0.0022,weight\_decay=0.0000\_2024-04-18\_21-39-47/checkpoint\_000019)

#### (RayTrainWorker pid=77935)

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

packages/torchvision/io/image.py:13: UserWarning: Failed to load image Python extension: '/home/woreom/miniconda3/envs/adv/lib/python3.9/site-packages/torchvision/image.so: undefined symbol:

\_ZN3c1017RegisterOperatorsD1Ev'If you don't plan on using image functionality from `torchvision.io`, you can ignore this warning. Otherwise, there might be something wrong with your environment. Did you have `libjpeg` or `libpng` installed before building `torchvision` from source?

(RayTrainWorker pid=77935) warn(

(RayTrainWorker pid=77935) Checkpoint successfully created at:

Checkpoint(filesystem=local, path=/home/woreom/ray\_results/TorchTrainer\_2024-04-18\_21-39-43/TorchTrainer\_b4607\_00009\_9\_batch\_size=64,lr=0.0011,weight\_decay=0.00 00 2024-04-18 21-39-47/checkpoint 000000)

(RayTrainWorker pid=72906) Checkpoint successfully created at:

Checkpoint(filesystem=local, path=/home/woreom/ray\_results/TorchTrainer\_2024-04-18\_21-39-43/TorchTrainer\_b4607\_00000\_0\_batch\_size=16,lr=0.0022,weight\_decay=0.00 00 2024-04-18 21-39-47/checkpoint 000020)

(RayTrainWorker pid=72906) Checkpoint successfully created at:

Checkpoint(filesystem=local, path=/home/woreom/ray\_results/TorchTrainer\_2024-04-

```
(RayTrainWorker pid=72906) Checkpoint successfully created at:
    Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
    18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
    00_2024-04-18_21-39-47/checkpoint_000022)
    (RayTrainWorker pid=72906) Checkpoint successfully created at:
    Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
    18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
    00_2024-04-18_21-39-47/checkpoint_000023)
    (RayTrainWorker pid=72906) Checkpoint successfully created at:
    Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
    18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
    00_2024-04-18_21-39-47/checkpoint_000024)
    (RayTrainWorker pid=72906) Checkpoint successfully created at:
    Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
    18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
    00_2024-04-18_21-39-47/checkpoint_000025)
    (RayTrainWorker pid=72906) Checkpoint successfully created at:
    Checkpoint(filesystem=local, path=/home/woreom/ray results/TorchTrainer 2024-04-
    18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
    00_2024-04-18_21-39-47/checkpoint_000026)
    (RayTrainWorker pid=72906) Checkpoint successfully created at:
    Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
    18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
    00_2024-04-18_21-39-47/checkpoint_000027)
    (RayTrainWorker pid=72906) Checkpoint successfully created at:
    Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTrainer_2024-04-
    00_2024-04-18_21-39-47/checkpoint_000028)
    2024-04-18 21:43:19,094 INFO tune.py:1021 -- Wrote the latest version of all
    result files and experiment state to
    '/home/woreom/ray_results/TorchTrainer_2024-04-18_21-39-43' in 0.0033s.
    (RayTrainWorker pid=72906) Checkpoint successfully created at:
    Checkpoint(filesystem=local, path=/home/woreom/ray results/TorchTrainer 2024-04-
    18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.00
    00_2024-04-18_21-39-47/checkpoint_000029)
    (RayTrainWorker pid=72906) `Trainer.fit` stopped: `max_epochs=30`
    reached.
    2024-04-18 21:43:19,099 INFO tune.py:1053 -- Total run time: 212.07 seconds
    (212.04 seconds for the tuning loop).
[]: results.get_best_result(metric="val_loss", mode="min")
[]: Result(
      metrics={'train_loss': 0.40551847219467163, 'val_loss': 0.3812931180000305,
```

18 21-39-43/TorchTrainer b4607\_00000\_0\_batch\_size=16,lr=0.0022,weight\_decay=0.00

00\_2024-04-18\_21-39-47/checkpoint\_000021)

'epoch': 29, 'step': 2250},

```
path='/home/woreom/ray_results/TorchTrainer_2024-04-18_21-39-43/TorchTrainer_b
4607_00000_0_batch_size=16,lr=0.0022,weight_decay=0.0000_2024-04-18_21-39-47',
    filesystem='local',
    checkpoint=Checkpoint(filesystem=local, path=/home/woreom/ray_results/TorchTra
iner_2024-04-18_21-39-43/TorchTrainer_b4607_00000_0_batch_size=16,lr=0.0022,weig
ht_decay=0.0000_2024-04-18_21-39-47/checkpoint_000029)
)
```

#### 7 Transfer Learn

I'm not quite sure what e) means, but I'm guessing we want to do transfer learning on ImageNet100.

```
[]: default_config = {
    "weight_decay": 1e-6,
    "lr": 0.0022,
    "batch_size": 16,
}
autoencoder = Autoencoder(default_config)
# train model
# overfits after 10 epochs with the new learning rate
trainer = L.Trainer(max_epochs=10, )
# I've changed the model for ray tuneing so now it will get DataModule instead_u
    of dataloader
trainer.fit(autoencoder, trainloader, valloader)
autoencoder.plot_autoencoder_results(10)
```

Trainer will use only 1 of 2 GPUs because it is running inside an interactive / notebook environment. You may try to set `Trainer(devices=2)` but please note that multi-GPU inside interactive / notebook environments is considered experimental and unstable. Your mileage may vary.

GPU available: True (cuda), used: True

```
TPU available: False, using: 0 TPU cores
IPU available: False, using: 0 IPUs
HPU available: False, using: 0 HPUs
```

You are using a CUDA device ('NVIDIA GeForce RTX 4090') that has Tensor Cores.

To properly utilize them, you should set

`torch.set\_float32\_matmul\_precision('medium' | 'high')` which will trade-off precision for performance. For more details, read https://pytorch.org/docs/stable/generated/torch.set\_float32\_matmul\_precision.html#torch.set\_float32\_matmul\_precision

LOCAL\_RANK: 0 - CUDA\_VISIBLE\_DEVICES: [0,1]

3.5 K Trainable params

0 Non-trainable params

3.5 K Total params

0.014 Total estimated model params size (MB)

Sanity Checking: | 0/? [00:00<?, ?it/s]

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

packages/lightning/pytorch/trainer/connectors/data\_connector.py:492: Your `val\_dataloader`'s sampler has shuffling enabled, it is strongly recommended that you turn shuffling off for val/test dataloaders.

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

packages/lightning/pytorch/trainer/connectors/data\_connector.py:441: The 'val\_dataloader' does not have many workers which may be a bottleneck. Consider increasing the value of the `num\_workers` argument` to `num\_workers=31` in the `DataLoader` to improve performance.

/home/woreom/miniconda3/envs/adv/lib/python3.9/site-

packages/lightning/pytorch/trainer/connectors/data\_connector.py:441: The 'train\_dataloader' does not have many workers which may be a bottleneck.

Consider increasing the value of the `num\_workers` argument` to `num\_workers=31` in the `DataLoader` to improve performance.

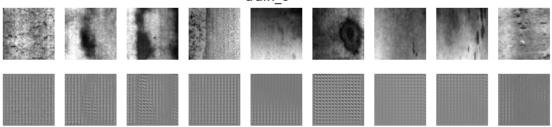
Training:	0/? [00:00 , ?it/s]</th
Validation:	0/? [00:00 , ?it/s]</td

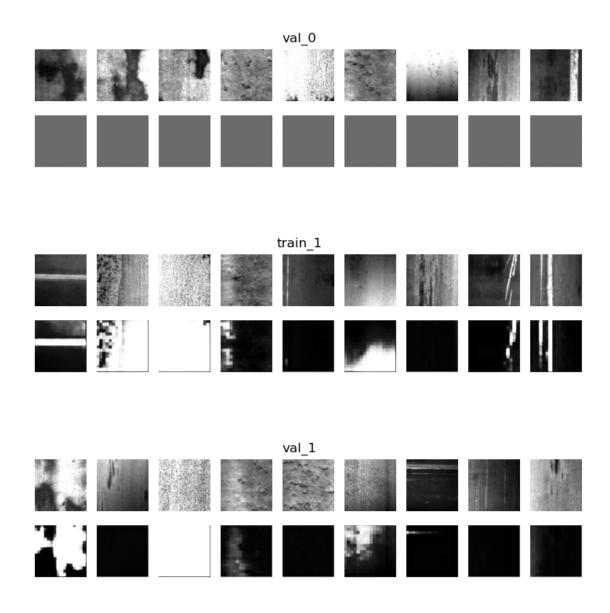
Validation: | | 0/? [00:00<?, ?it/s]

Validation: | 0/? [00:00<?, ?it/s]

`Trainer.fit` stopped: `max\_epochs=10` reached.

#### train\_0





```
ds_val = DatasetFolder(ROOT_FOLDER+'/val.X/', loader=load_image, extensions =__
      →('.JPEG','.jpeg', '.jpg'),
                         transform=transforms.Compose([transforms.CenterCrop(224),
                                                       transforms.ToTensor() ]))
     trainloader = torch.utils.data.DataLoader(
                         ds train,
                         batch_size=16,
                         shuffle=True)
     valloader = torch.utils.data.DataLoader(
                         ds_val,
                         batch_size=16,
                         shuffle=True)
     print(len(trainloader))
     # out: 2500
     print(len(valloader))
     # out: 625
    2032
    313
[]: # reset the images
     autoencoder.hist={'train':[], 'val':[]}
     # train model
     trainer = L.Trainer(max_epochs=10, )
     trainer.fit(autoencoder, trainloader, valloader)
     autoencoder.plot_autoencoder_results(10)
    Trainer will use only 1 of 2 GPUs because it is running inside an interactive /
    notebook environment. You may try to set `Trainer(devices=2)` but please note
    that multi-GPU inside interactive / notebook environments is considered
    experimental and unstable. Your mileage may vary.
    GPU available: True (cuda), used: True
    TPU available: False, using: 0 TPU cores
    IPU available: False, using: 0 IPUs
    HPU available: False, using: 0 HPUs
    LOCAL_RANK: 0 - CUDA_VISIBLE_DEVICES: [0,1]
                            | Params
      Name
               | Type
    0 | encoder | Sequential | 1.7 K
    1 | decoder | Sequential | 1.8 K
```

3.5 K Trainable params

0 Non-trainable params

3.5 K Total params

0.014 Total estimated model params size (MB)

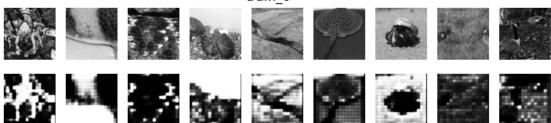
Sanity Checking: | 0/? [00:00<?, ?it/s]

Training: | | 0/? [00:00<?, ?it/s]

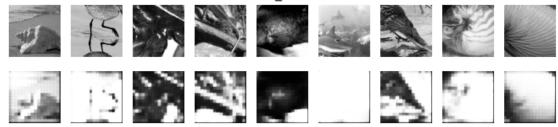
Validation: | 0/? [00:00<?, ?it/s]

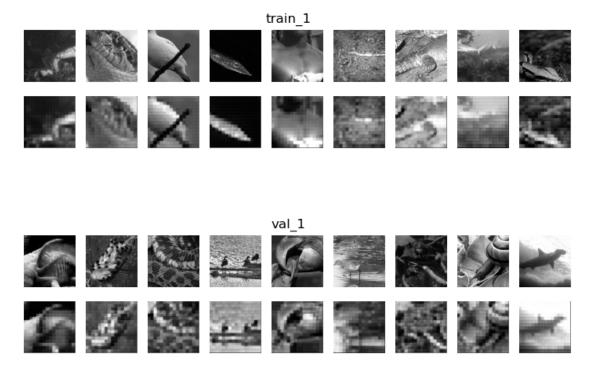
`Trainer.fit` stopped: `max\_epochs=10` reached.

#### train 0

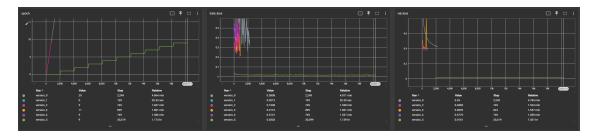


#### val 0





So the last time my autoencoder padding was weird, I had stride equal to odd numbers padding more than 1 and kernels equal to even numbers, all to make the encoder output dimension to be 512 and the decoder output dimension to be the same as the original image, this time I changed the MaxPooling layers which addaptivePooling, In this way I could control the dimensions easier and correct the weird arguments which definetly affected my results. Then I add addaptivePooling to the decoder as well (Online must examples didn't use any normalization or regularization on their decoder to be more like a mirror of the encoder but since this time we had to refine the model, I stray away from this just a little bit). For the decoder last activation function should be sigmoid but I also added another activation function before it (addaptive pooling) just to see what happens, the results were not good. For the encoder or embeddings in general it is suggested not to have a normalization because having a little bias is good but I added a normalization layer to see what happens, the results were not good or I should say not as good as without these layers. Lastly, I played around with the learning rate and visually saw that the decoded images of lr=5e-5 was better however raytune found 0.0022 a better learning rate. the first result was with lr=5e-5 and the second one was with lr=0.0022 but I trained it for less epochs. I also trained the newer model with my previous code to know how should my model behave. the lowest loss I got was around 0.36 which was significantly lower than the last assignment which was around 0.5.



# 8 Test (perivous homowork's code)

```
[]: class Autoencoder(nn.Module):
         def __init__(self):
             super(Autoencoder, self).__init__()
             self.encoder = nn.Sequential(
                 nn.Conv2d(3, 6, kernel_size=5, stride=2, padding=1),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d((55,55)),
                 nn.BatchNorm2d(6),
                 nn.Conv2d(6, 16, kernel_size=3, stride=2, padding=1),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d(output_size=(32,32)),
                 nn.BatchNorm2d(16),
                 nn.Conv2d(16, 2, kernel_size=3, stride=2, padding=1),
                 nn.GELU(),
             )
             self.decoder = nn.Sequential(
                 nn.ConvTranspose2d(2, 8,
                                     kernel_size=3,
                                     stride=4,
                                     padding=1,
                                     output_padding=2),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d((64,64)),
                 nn.BatchNorm2d(8),
                 nn.ConvTranspose2d(8, 16,
                                     kernel_size=3,
                                     stride=2,
                                     padding=1,
                                     output_padding=1),
                 nn.GELU(),
                 nn.AdaptiveAvgPool2d((112,112)),
                 nn.BatchNorm2d(16),
                 nn.ConvTranspose2d(16, 3,
                                     kernel_size=3,
                                     stride=2,
                                     padding=1,
                                     output_padding=1),
                 nn.Sigmoid()
             )
         def forward(self, x):
             x = self.encoder(x)
             x = self.decoder(x)
             return x
```

```
def eval_model(self, epoch: int, data_loader: torch.utils.data.DataLoader, u
⇔optimizer: torch.optim,
                 criterion: nn.modules.loss, device: torch.device, mode: str):
      with tqdm(data_loader, unit="batch") as tepoch:
          tepoch.set description(f"Epoch {epoch}")
          n loss = 0
          loss_ctr = 0
          for img, _ in tepoch:
              img = img.to(device)
              recon = self.forward(img)
              loss = criterion(recon, img)
              if mode == "train":
                  optimizer.zero_grad()
                  loss.backward()
                  optimizer.step()
              n_loss += loss.item()
              loss ctr += 1
              tepoch.set_postfix(mode=mode, loss=n_loss/loss_ctr)
      if epoch % self.eval_step == 0 or mode == "test":
          self.hist[mode].append((n_loss/loss_ctr, img[:9], recon[:9]))
  Ostaticmethod
  def plot_encoder_decoder(outputs: List, title: str):
      fig= plt.figure(figsize=(9, 2))
      fig.suptitle(title)
      imgs = outputs[1].detach().cpu().numpy()
      recon = outputs[2].detach().cpu().numpy()
      for i, item in enumerate(imgs):
              plt.subplot(2, 9, i+1)
              plt.axis("off")
              plt.imshow(item[0], cmap="gray")
      for i, item in enumerate(recon):
          plt.subplot(2, 9, 9+i+1)
          plt.axis("off")
          plt.imshow(item[0], cmap="gray")
  def plot_autoencoder_results(self, num_epochs):
      for k in range(0, num_epochs//self.eval_step):
```

```
Autoencoder.plot_encoder_decoder(self.hist["train"][k],_
      ⇔title=f"train_{k}")
                 Autoencoder.plot_encoder_decoder(self.hist["val"][k],_
      ⇔title=f"val {k}")
         def fit(self, train_loader, val_loader, optimizer: torch.optim, loss: nn.

¬modules.loss, num_epochs: int, eval_step: int):
             self.eval step = eval step
             # check to run training on cpu or gpu
             device = torch.device("cuda:1" if torch.cuda.is_available() else "cpu")
             self.to(device)
             # Point to training loop video
             self.hist = {"train":[], "test":[], "val":[]}
             for epoch in range(1, num_epochs+1):
                 self.train()
                 self.eval_model(epoch = epoch, data_loader = train_loader,_
      ⇔optimizer = optimizer,
                                 criterion = loss, device = device, mode = "train")
                 if epoch % self.eval_step == 0:
                     self.eval()
                     self.eval_model(epoch = epoch, data_loader = val_loader,__
      →optimizer = optimizer,
                                     criterion = loss, device = device, mode = "val")
             self.plot_autoencoder_results(num_epochs)
[]: autoencoder = Autoencoder()
     loss = nn.MSELoss()
     optimizer = torch.optim.Adam(autoencoder.parameters(),
                                  lr=1e-4,
                                  weight_decay=1e-6)
     autoencoder.fit(train_loader=trainloader, val_loader=valloader,
                     optimizer=optimizer, loss=loss, num_epochs=30, eval_step=10)
                       | 75/75 [00:06<00:00, 11.56batch/s, loss=0.91,
    Epoch 1: 100%|
    mode=train]
                       | 75/75 [00:06<00:00, 10.75batch/s, loss=0.762,
    Epoch 2: 100%|
    mode=train]
    Epoch 3: 100%|
                       | 75/75 [00:07<00:00, 9.78batch/s, loss=0.672,
    mode=train]
    Epoch 4: 100%|
                       | 75/75 [00:07<00:00, 9.42batch/s, loss=0.616,
    mode=trainl
```

```
| 75/75 [00:07<00:00, 9.93batch/s, loss=0.58,
Epoch 5: 100%
mode=train]
Epoch 6: 100%|
                   | 75/75 [00:07<00:00, 9.43batch/s, loss=0.551,
mode=train]
                   | 75/75 [00:07<00:00, 10.20batch/s, loss=0.53,
Epoch 7: 100%
mode=train]
Epoch 8: 100%|
                   75/75 [00:07<00:00, 10.18batch/s, loss=0.518,
mode=train]
                   | 75/75 [00:07<00:00, 9.85batch/s, loss=0.503,
Epoch 9: 100%
mode=train]
Epoch 10: 100%
                    | 75/75 [00:08<00:00, 8.65batch/s, loss=0.486,
mode=train]
                    | 38/38 [00:03<00:00, 10.12batch/s, loss=0.478,
Epoch 10: 100%
mode=val]
Epoch 11: 100%|
                    | 75/75 [00:08<00:00, 8.90batch/s, loss=0.477,
mode=train]
Epoch 12: 100%|
                    | 75/75 [00:08<00:00, 8.76batch/s, loss=0.468,
mode=train]
Epoch 13: 100%|
                    | 75/75 [00:08<00:00, 8.55batch/s, loss=0.465,
mode=train]
Epoch 14: 100%
                    | 75/75 [00:08<00:00, 8.60batch/s, loss=0.454,
mode=train]
Epoch 15: 100%
                    75/75 [00:08<00:00, 8.52batch/s, loss=0.451,
mode=train]
Epoch 16: 100%
                    75/75 [00:08<00:00, 8.75batch/s, loss=0.444,
mode=train]
Epoch 17: 100%
                    | 75/75 [00:08<00:00, 8.61batch/s, loss=0.442,
mode=train]
Epoch 18: 100%
                    | 75/75 [00:08<00:00, 8.75batch/s, loss=0.437,
mode=train]
                    | 75/75 [00:08<00:00, 8.67batch/s, loss=0.434,
Epoch 19: 100%
mode=train]
Epoch 20: 100%
                    | 75/75 [00:08<00:00, 8.71batch/s, loss=0.43,
mode=train]
                    | 38/38 [00:03<00:00, 10.16batch/s, loss=0.433,
Epoch 20: 100%
mode=val]
Epoch 21: 100%
                    75/75 [00:08<00:00, 8.58batch/s, loss=0.431,
mode=train]
                    | 75/75 [00:08<00:00, 8.73batch/s, loss=0.427,
Epoch 22: 100%|
mode=train]
Epoch 23: 100%|
                    | 75/75 [00:08<00:00, 8.46batch/s, loss=0.422,
mode=train]
Epoch 24: 100%
                    | 75/75 [00:08<00:00, 8.58batch/s, loss=0.422,
mode=train]
Epoch 25: 100%
                    | 75/75 [00:08<00:00, 8.68batch/s, loss=0.42,
mode=train]
Epoch 26: 100%|
                    | 75/75 [00:08<00:00, 8.70batch/s, loss=0.418,
mode=train]
```

