```
!pip install split-folders
!pip install split-folders[full]
      Looking in indexes: <a href="https://pypi.org/simple">https://us-python.pkg.dev/colab-wheels/public/simple/</a>
      Collecting split-folders
        Downloading split_folders-0.5.1-py3-none-any.whl (8.4 kB)
      Installing collected packages: split-folders
      Successfully installed split-folders-0.5.1
      Looking in indexes: https://pxpi.org/simple. https://us-python.pkg.dev/colab-wheels/public/simple/
Requirement already satisfied: split-folders[full] in /usr/local/lib/python3.8/dist-packages (0.5.1)
      Requirement already satisfied: tqdm in /usr/local/lib/python3.8/dist-packages (from split-folders[full]) (4.64.1)
# 필요한 라이브러리 import
import os
import torch
import torch.nn as nn
import torch.optim as optim
import torch.nn.functional as F
from torch.utils import data
import torchvision datasets as datasets
import torchvision.transforms as transforms
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt # matplotlib
import pandas as pd # pandas
import natsort
import cv2
import os
from torch.utils.tensorboard import SummaryWriter
import splitfolders
from google colab import drive
drive.mount('/content/gdrive')
      Mounted at /content/gdrive
!ls -al <u>/content/gdrive/MyDrive/project</u>
      total 5270737
      drwx----- 2 root root
-rw---- 1 root root
                                     4096 Dec 12 08:11 class
           ----- 1 root root 194650 Dec 7 13:29 ILSVRC2010_ground_truth.txt
      drwx---- 2 root root
                                     4096 Dec 14 02:48 input
      drwx---- 2 root root
                                     4096 Dec 14 16:00 model
      drwx----- 2 root root
                                     4096 Dec 14 10:43 output
      drwx----- 2 root root
                                     4096 Dec 13 12:56 output_1000class
      drwx----- 2 root root
                                     4096 Dec 14 10:57 output_5
      drwx---- 2 root root
                                     4096 Dec 13 12:56 output_5class
      drwx---- 2 root root
                                     4096 Dec 14 10:53 output_tvt
      drwx---- 2 root root
                                     4096 Dec 10 03:56 val
os.chdir('/content/gdrive/MyDrive/project')
#압축해제
#!tar -xvf /content/gdrive/MyDrive/project/ILSVRC2010_images_.tar
!ls -al /content/adrive/MyDrive/project
      total 5270737
      drwx---- 2 root root
                                     4096 Dec 12 08:11 class
      -rw----- 1 root root
                                   194650 Dec 7 13:29 ILSVRC2010_ground_truth.txt
               --- 1 root root 5397002240 Dec 7 13:46 ILSVRC2010_images_.tar
      drwx---- 2 root root
                                     4096 Dec 14 02:48 input
      drwx----- 2 root root
                                     4096 Dec 14 16:00 model
      drwx---- 2 root root
                                     4096 Dec 14 10:43 output
      drwx---- 2 root root
                                     4096 Dec 13 12:56 output_1000class
      drwx---- 2 root root
                                     4096 Dec 14 10:57 output_5
      drwx---- 2 root root
                                     4096 Dec 13 12:56 output_5class
      drwx----- 2 root root
                                     4096 Dec 14 10:53 output tvt
      drwx---- 2 root root
                                     4096 Dec 10 03:56 val
# 격까변수 불러오기
y = pd.read\_csv('/content/gdrive/MyDrive/project/ILSVRC2010\_ground\_truth.txt', header=None, names=['answer'])
```

```
answer
         0
                    78
         1
                   854
         2
                   435
         3
                   541
         4
                   973
         •••
       49995
                   467
       49996
                   646
#splitfolders.ratio("/content/adrive/MvDrive/project/class", output="/content/adrive/MvDrive/project/output 1000class", seed=1337, ratio=(.8, .1, .1))
#5classes: 78,250, 438, 733, 831
!ls -al /content/gdrive/MyDrive/project
      total 5270737
      drwx----- 2 root root
                                     4096 Dec 12 08:11 class
      -rw----- 1 root root
                                   194650 Dec 7 13:29 ILSVRC2010_ground_truth.txt
      -rw----- 1 root root 5397002240 Dec 7 13:46 ILSVRC2010_images_.tar
      drwx----- 2 root root
drwx----- 2 root root
                                     4096 Dec 14 02:48 input
                                     4096 Dec 14 16:00 model
      drwx----- 2 root root
                                     4096 Dec 14 10:43 output
      drwx---- 2 root root
                                     4096 Dec 13 12:56 output_1000class
      drwx---- 2 root root
                                     4096 Dec 14 10:57 output_5
      drwx---- 2 root root
                                     4096 Dec 13 12:56 output_5class
      drwx----- 2 root root
                                     4096 Dec 14 10:53 output_tvt
      drwx----- 2 root root
                                     4096 Dec 10 03:56 val
#Icp -r /content/adrive/MvDrive/project/class/78 /content/adrive/MvDrive/project/output
#!cp -r /content/gdrive/MyDrive/project/class/250 /content/gdrive/MyDrive/project/output
#!cp -r /content/adrive/MvDrive/project/class/438 /content/adrive/MvDrive/project/output
#!cp -r /content/gdrive/MyDrive/project/class/733 /content/gdrive/MyDrive/project/output
#!cp -r /content/gdrive/MyDrive/project/class/831 /content/gdrive/MyDrive/project/output
!ls -al /content/gdrive/MyDrive/project/output
      total 20
      drwx---- 2 root root 4096 Dec 14 10:51 250
      drwx---- 2 root root 4096 Dec 14 10:51 438
      drwx----- 2 root root 4096 Dec 14 10:52 733
      drwx---- 2 root root 4096 Dec 14 10:51 78
      drwx----- 2 root root 4096 Dec 14 10:52 831
#splitfolders.ratio("/content/gdrive/MyDrive/project/output", output="/content/gdrive/MyDrive/project/output_tvt", seed=1234, ratio=(.8, .1, .1))
!ls -al /content/gdrive/MyDrive/project/output_tvt
      drwx----- 2 root root 4096 Dec 14 16:45 models
drwx---- 2 root root 4096 Dec 14 16:50 tblogs
      drwx----- 2 root root 4096 Dec 14 10:53 test
      drwx----- 2 root root 4096 Dec 14 10:53 train
      drwx----- 2 root root 4096 Dec 14 10:53 val
# 필요한 라이브러리 import
import os
import torch
import torch.nn as nn
import torch.optim as optim
import torch.nn.functional as F
from torch.utils.data import DataLoader
import torchvision.datasets as datasets
import torchvision.transforms as transforms
import pandas as pd
import numpy as no
import matplotlib.pvplot as plt # matplotlib
import pandas as pd # pandas
import natsort
import cv2
import os
from torch.utils.tensorboard import SummaryWriter
# pytorch device 정의하기
device = torch.device('cuda' if torch.cuda.is_available() else 'cpu')
# model parameters 정의하기
```

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```
NIM FPOCHS = 90
BATCH SIZE = 128
MOMENTUM = 0.9
LR\_DECAY = 0.0005
LR_INIT = 0.01
IMAGE_DIM = 227 # pixels
NUM_CLASSES = 5
DEVICE_IDS = [0, 1, 2, 3]
# data directory 지정하기
INPUT_BOOT_DIR = '/content/gdrive/MyDrive/project/output'
TRAIN_IMG_DIR = '/content/gdrive/MyDrive/project/output_tvt/train'
OUTPUT_DIR = '/content/gdrive/MyDrive/project/output_tvt
LOG_DIR = OUTPUT_DIR + '/tblogs' # tensorboard logs
CHECKPOINT_DIR = OUTPUT_DIR + '/models' # model checkpoints
# checkpoint 경로 directory 만들기
os.makedirs(CHECKPOINT_DIR, exist_ok=True)
train_img_dir='/content/gdrive/MyDrive/project/output_tvt/train'
val_img_dir='/content/gdrive/MyDrive/project/output_tvt/valid
test_img_dir='/content/gdrive/MyDrive/project/output_tvt/test
dataset = datasets.ImageFolder(train_img_dir, transforms.Compose([
        transforms.RandomResizedCrop(227, scale=(0.9, 1.0), ratio=(0.9, 1.1)),
        transforms.CenterCrop(224)
        transforms.RandomHorizontalFlip()
        transforms.ToTensor(),
        transforms.Normalize(mean=[0.485, 0.456, 0.406], std=[0.229, 0.224, 0.225]),
    ]))
dataset.classes
      ['250', '438', '733', '78', '831']
dataset.class_to_idx
      {'250': 0, '438': 1, '733': 2, '78': 3, '831': 4}
dataloader = data.DataLoader(
       dataset.
       shuffle=True
       pin_memory=True,
       num_workers=8,
       drop_last=True,
       batch_size=BATCH_SIZE)
      /usr/local/lib/python3.8/dist-packages/torch/utils/data/dataloader.py:554: UserWarning: This DataLoader will create 8 worker processes in total.
        warnings.warn(_create_warning_msg(
     4
class AlexNet(nn.Module):
  def __init__(self, num_classes=5):
   super().__init__()
    ##### CNN layers
    self.net = nn.Sequential(
       # conv1
       nn.Conv2d(in_channels=3, out_channels=96, kernel_size=11, stride=4),
       nn.ReLU(inplace=True), # non-saturating function
       nn.LocalResponseNorm(size=5, alpha=0.0001, beta=0.75, k=2), # 논문의 LRN 파라미터 그대로 지정
       nn.MaxPool2d(kernel_size=3, stride=2),
       # conv2
       nn.Conv2d(96, 256, kernel_size=5, padding=2),
       nn.ReLU(inplace=True),
       nn.LocalResponseNorm(size=5, alpha=0.0001, beta=0.75, k=2),
       nn.MaxPool2d(kernel_size=3, stride=2),
       # conv3
       nn.Conv2d(256, 384, 3, padding=1),
       nn.ReLU(inplace=True),
       # conv4
       nn.Conv2d(384, 384, 3, padding=1),
       nn.ReLU(inplace=True),
       # conv5
       nn.Conv2d(384, 256, 3, padding=1),
       nn. Rel U(inplace=True).
       nn.MaxPool2d(kernel_size=3, stride=2),
    ##### FC layers
   self.classifier = nn.Sequential(
       # fc1
       nn.Dropout(p=0.5, inplace=True),
       nn.Linear(in_features=(256 * 6 * 6), out_features=4096),
       nn.ReLU(inplace=True),
       nn.Dropout(p=0.5, inplace=True),
```

```
nn.linear(4096, 4096).
       nn.ReLU(inplace=True).
       nn.Linear(4096, num_classes),
   # bias, weight 초기화
   def init_bias_weights(self):
      for layer in self.net:
       if isinstance(layer, nn.Conv2d):
         nn.init.normal_(layer.weight, mean=0, std=0.01) # weight 초기화
         nn.init.constant_(layer.bias, 0) # bias 초기화
     # conv 2, 4, 5는 bias 1로 초기화
     nn.init.constant_(self.net[4].bias, 1)
     nn.init.constant_(self.net[10].bias, 1)
     nn.init.constant_(self.net[12].bias, 1)
    # modeling
   def forward(self, x):
     x = self.net(x) # conv
     x = x.view(-1, 255+6+6) # keras의 reshape (텐서 크기 2d 변경)
return self.classifier(x) # fc
seed = torch.initial_seed()
print('Used seed : {}'.format(seed))
      Used seed: 6775789779613122915
tbwriter = SummaryWriter(log_dir=LOG_DIR)
print('TensorboardX summary writer created')
      TensorboardX summary writer created
alexnet = AlexNet(num_classes=NUM_CLASSES).to(device)
# 다수의 GPU에서 train
#alexnet = torch.nn.parallel.DataParallel(alexnet, device_ids=DEVICE_IDS)
print(alexnet)
print('AlexNet created')
      AlexNet(
        (net): Sequential(
          (0): Conv2d(3, 96, kernel_size=(11, 11), stride=(4, 4))
          (1): ReLU(inplace=True)
          (2): LocalResponseNorm(5, alpha=0.0001, beta=0.75, k=2)
          (3): MaxPool2d(kernel_size=3, stride=2, padding=0, dilation=1, ceil_mode=False)
          (4): Conv2d(96, 256, kernel_size=(5, 5), stride=(1, 1), padding=(2, 2))
          (5): ReLU(inplace=True)
          (6): LocalResponseNorm(5, alpha=0.0001, beta=0.75, k=2)
          (7): MaxPool2d(kernel_size=3, stride=2, padding=0, dilation=1, ceil_mode=False) (8): Conv2d(256, 384, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1))
          (9): ReLU(inplace=True)
          (10): Conv2d(384, 384, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1))
           (11): ReLU(inplace=True)
           (12): Conv2d(384, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1))
           (13): ReLU(inplace=True)
          (14): MaxPool2d(kernel_size=3, stride=2, padding=0, dilation=1, ceil_mode=False)
        (classifier): Sequential(
          (0): Dropout(p=0.5, inplace=True)
           (1): Linear(in_features=9216, out_features=4096, bias=True)
          (2): ReLU(inplace=True)
          (3): Dropout(p=0.5, inplace=True)
          (4): Linear(in_features=4096, out_features=4096, bias=True)
          (5): ReLU(inplace=True)
          (6): Linear(in_features=4096, out_features=5, bias=True)
        )
      AlexNet created
dataset = datasets.ImageFolder(TRAIN_IMG_DIR, transforms.Compose([
# transforms.RandomResizedCrop(IMAGE_DIM, scale=(0.9, 1.0), ratio=(0.9, 1.1)),
transforms.CenterCrop(IMAGE DIM)
# transforms.RandomHorizontalFlip(),
transforms.ToTensor(),
transforms.Normalize(mean=[0.485, 0.456, 0.406], std=[0.229, 0.224, 0.225]),
print('Dataset created')
      Dataset created
dataset
      Dataset ImageFolder
          Number of datapoints: 200
          Root location: /content/gdrive/MyDrive/project/output_tvt/train
          StandardTransform
      Transform: Compose(
                      CenterCrop(size=(227, 227))
```

```
ToTensor()
                      Normalize(mean=[0.485, 0.456, 0.406], std=[0.229, 0.224, 0.225])
dataloader = data.DataLoader(
dataset
shuffle=True,
pin_memory=True
num_workers=8,
drop_last=True
batch_size=BATCH_SIZE)
print('Dataloader created')
      Dataloader created
      /usr/local/lib/python3.8/dist-packages/torch/utils/data/dataloader.py:554: UserWarning: This DataLoader will create 8 worker processes in total.
        warnings.warn(_create_warning_msg(
     |
dataloader
      <torch.utils.data.dataloader.DataLoader at 0x7f49659a9d60>
# optimizer 생성하기
optimizer = optim.SGD(
params=alexnet.parameters(),
Ir=LR_INIT,
momentum=MOMENTUM,
weight_decay=LR_DECAY)
print('Optimizer created')
      Optimizer created
Ir_scheduler = optim.lr_scheduler.StepLR(optimizer, step_size=30, gamma=0.1)
print('LR Scheduler created')
      LR Scheduler created
if __name__ == '__main__':
    # seed value 출력하기
    seed = torch.initial_seed()
   print('Used seed : {}'.format(seed))
   tbwriter = SummaryWriter(log_dir=LOG_DIR)
   print('TensorboardX summary writer created')
   # model 생성하기
   alexnet = AlexNet(num_classes=NUM_CLASSES).to(device)
   # 다수의 GPU에서 train
   #alexnet = torch.nn.parallel.DataParallel(alexnet, device_ids=DEVICE_IDS)
   print(alexnet)
   print('AlexNet created')
   # dataset과 data loader 생성하기
   dataset = datasets.ImageFolder(TRAIN_IMG_DIR, transforms.Compose([
       # transforms.RandomResizedCrop(IMAGE_DIM, scale=(0.9, 1.0), ratio=(0.9, 1.1)),
       transforms.CenterCrop(IMAGE_DIM)
       # transforms.RandomHorizontalFlip(),
       transforms.ToTensor().
       transforms.Normalize(mean=[0.485, 0.456, 0.406], std=[0.229, 0.224, 0.225]),
   1))
   print('Dataset created')
   dataloader = data.DataLoader(
       dataset.
       shuffle=True.
       pin_memory=True,
       num_workers=8,
       drop_last=True,
       batch_size=BATCH_SIZE)
   print('Dataloader created')
   # optimizer 생성하기
   optimizer = optim.SGD(
       params=alexnet.parameters(),
       Ir=LR_INIT.
       momentum=MOMENTUM,
       weight_decay=LR_DECAY)
   print('Optimizer created')
   # Ir_scheduler로 LR 감소시키기 : 30epochs 마다 1/10
   Ir_scheduler = optim.Ir_scheduler.StepLR(optimizer, step_size=30, gamma=0.1)
   print('LR Scheduler created')
   # train 시작
   print('Starting training...')
```

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```
total steps = 1
for epoch in range(NUM_EPOCHS):
    Ir_scheduler.step()
    for imgs, classes in dataloader:
        imgs, classes = imgs.to(device), classes.to(device)
        # loss 계산
        output = alexnet(imgs)
        loss = F.cross_entropy(output, classes)
        # parameter 갱신
       optimizer.zero_grad()
        loss.backward()
        optimizer.step()
        # log the information and add to tensorboard
        # 정보를 기록하고 tensorboard에 추가하기
        if total_steps % 10 == 0:
           with torch.no_grad():
                . preds = torch.max(output, 1)
                accuracy = torch.sum(preds == classes)
                print('Epoch: {} \text{WtStep: {} \text{WtLoss: {:.4f} \text{WtAcc: {}'
                    .format(epoch + 1, total_steps, loss.item(), accuracy.item()))
                tbwriter.add_scalar('loss', loss.item(), total_steps)
                tbwriter.add_scalar('accuracy', accuracy.item(), total_steps)
        # gradient values와 parameter average values 추력하기
        if total_steps % 100 == 0:
           with torch.no_grad():
               # parameters의 grad 출력하고 저장하기
                # parameters values 출력하고 저장하기
                print('*' * 10)
                for name, parameter in alexnet.named_parameters():
                   if parameter.grad is not None:
                        avg_grad = torch.mean(parameter.grad)
                        print(' \forall t \{\} - grad\_avg: \; \{\}'.format(name, \; avg\_grad))
                        tbwriter.add\_scalar('grad\_avg/\{\}'.format(name),\ avg\_grad.item(),\ total\_steps)
                        tbwriter.add\_histogram('grad/\{\}'.format(name),
                                parameter.grad.cpu().numpy(), total_steps)
                    if parameter.data is not None:
                        avg_weight = torch.mean(parameter.data)
                        print('\taut{} - param_avg: {}'.format(name, avg_weight))
                        tbwriter.add_histogram('weight/{}'.format(name),
                               parameter.data.cpu().numpy(), total_steps)
                        tbwriter.add_scalar('weight_avg/{}'.format(name), avg_weight.item(), total_steps)
        total_steps += 1
    # checkpoints 저장하기
    checkpoint_path = os.path.join(CHECKPOINT_DIR, 'alexnet_states_e{}.pkl'.format(epoch + 1))
    state = {
        'epoch': epoch,
        'total_steps': total_steps,
        'optimizer': optimizer.state_dict(),
        'model': alexnet.state_dict(),
        'seed': seed,
    torch.save(state, checkpoint_path)
```

С⇒

```
Used seed: 6775789779613122915
TensorboardX summary writer created
AlexNet(
  (net): Sequential(
    (0): Conv2d(3, 96, kernel_size=(11, 11), stride=(4, 4))
    (1): ReLU(inplace=True)
    (2): LocalResponseNorm(5, alpha=0.0001, beta=0.75, k=2)
    (3): MaxPool2d(kernel_size=3, stride=2, padding=0, dilation=1, ceil_mode=False)
    (4): Conv2d(96, 256, kernel_size=(5, 5), stride=(1, 1), padding=(2, 2))
    (5): ReLU(inplace=True)
    (6): LocalResponseNorm(5, alpha=0.0001, beta=0.75, k=2)
    (7): MaxPool2d(kernel_size=3, stride=2, padding=0, dilation=1, ceil_mode=False)
    (8): Conv2d(256, 384, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1))
    (9): ReLU(inplace=True)
    (10): Conv2d(384, 384, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1))
    (11): ReLU(inplace=True)
    (12): Conv2d(384, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1))
    (13): ReLU(inplace=True)
    (14): MaxPool2d(kernel_size=3, stride=2, padding=0, dilation=1, ceil_mode=False)
  (classifier): Sequential(
    (0): Dropout(p=0.5, inplace=True)
    (1): Linear(in_features=9216, out_features=4096, bias=True)
    (2): ReLU(inplace=True)
    (3): Dropout(p=0.5, inplace=True)
    (4): Linear(in_features=4096, out_features=4096, bias=True)
    (5): ReLU(inplace=True)
AlexNet created
Dataset created
Dataloader created
Optimizer created
IR Scheduler created
Starting training...
NotImplementedError
                                         Traceback (most recent call last)
<ipython-input-25-a1d4bccfc542> in <module>
    53
     54
                    # loss 계산
                   output = alexnet(imgs)
  -> 55
    56
                    loss = F.cross_entropy(output, classes)
     57
                                     🗘 1 frames
<u>/usr/local/lib/python3.8/dist-packages/torch/nn/modules/module.py</u> in
_forward_unimplemented(self, *input)
           registered hooks while the latter silently ignores them.
   242
    243
           raise NotImplementedError(f"Module [{type(self).__name__}}] is missing the
required ₩"forward\" function")
   245
                                                  Colah 유료 제품 - 여기에서 계약 취소
                                                  ✓ 0초 오후 1:16에 완료됨
```