model resisc45 2

April 16, 2023

1 Model RESISC45

1.1 Train details

- ResNet18 pretrained and fine-tune only last layer
- dataset resisc45
- 45 classes (all from dataset)
- cross-entropy optimizer
- SGD (stochastic gradient descent) with learning rate 0.001 and momentum 0.9
- dataset split in 5 folds
- model input resolution: 3 x 224 x 244
- image transforms at train (augmentations):
 - random resized crop at 224 x 224 resolution (from original 256 x 256)
 - random horizontal flip
 - normalize with mean [0.485, 0.456, 0.406] and std [0.229, 0.224, 0.225]
- image transforms at validation:
 - central crop at 224 x 224 resolution (from original 256 x 256)
 - normalize with mean [0.485, 0.456, 0.406] and std [0.229, 0.224, 0.225]
- number of trained epochs: 15
- batch size of 32

```
[]: from utils import train_pretrained_resnet, TrainConfig
```

1.2 Validation on fold 1

```
Start.
```

```
macOS-13.3.1-arm64-arm-64bit
PyTorch Version: 2.0.0
```

```
Torchvision Version: 0.15.1
Using mps device
/Users/cristianion/Desktop/satimg_model/.venv/lib/python3.11/site-
packages/torchvision/models/ utils.py:208: UserWarning: The parameter
'pretrained' is deprecated since 0.13 and may be removed in the future, please
use 'weights' instead.
  warnings.warn(
/Users/cristianion/Desktop/satimg_model/.venv/lib/python3.11/site-
packages/torchvision/models/ utils.py:223: UserWarning: Arguments other than a
weight enum or 'None' for 'weights' are deprecated since 0.13 and may be removed
in the future. The current behavior is equivalent to passing
`weights=ResNet18_Weights.IMAGENET1K_V1`. You can also use
`weights=ResNet18_Weights.DEFAULT` to get the most up-to-date weights.
  warnings.warn(msg)
ResNet(
  (conv1): Conv2d(3, 64, kernel_size=(7, 7), stride=(2, 2), padding=(3, 3),
bias=False)
  (bn1): BatchNorm2d(64, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
  (relu): ReLU(inplace=True)
  (maxpool): MaxPool2d(kernel size=3, stride=2, padding=1, dilation=1,
ceil_mode=False)
  (layer1): Sequential(
    (0): BasicBlock(
      (conv1): Conv2d(64, 64, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1),
bias=False)
      (bn1): BatchNorm2d(64, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      (relu): ReLU(inplace=True)
      (conv2): Conv2d(64, 64, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1),
bias=False)
      (bn2): BatchNorm2d(64, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
    (1): BasicBlock(
      (conv1): Conv2d(64, 64, kernel size=(3, 3), stride=(1, 1), padding=(1, 1),
bias=False)
      (bn1): BatchNorm2d(64, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      (relu): ReLU(inplace=True)
      (conv2): Conv2d(64, 64, kernel_size=(3, 3), stride=(1, 1), padding=(1, 1),
bias=False)
      (bn2): BatchNorm2d(64, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
    )
  )
  (layer2): Sequential(
```

```
(0): BasicBlock(
      (conv1): Conv2d(64, 128, kernel_size=(3, 3), stride=(2, 2), padding=(1,
1), bias=False)
      (bn1): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
      (relu): ReLU(inplace=True)
      (conv2): Conv2d(128, 128, kernel size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
      (bn2): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      (downsample): Sequential(
        (0): Conv2d(64, 128, kernel_size=(1, 1), stride=(2, 2), bias=False)
        (1): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
    )
    (1): BasicBlock(
      (conv1): Conv2d(128, 128, kernel_size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
      (bn1): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
      (relu): ReLU(inplace=True)
      (conv2): Conv2d(128, 128, kernel_size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
      (bn2): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
    )
  )
  (layer3): Sequential(
    (0): BasicBlock(
      (conv1): Conv2d(128, 256, kernel_size=(3, 3), stride=(2, 2), padding=(1,
1), bias=False)
      (bn1): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      (relu): ReLU(inplace=True)
      (conv2): Conv2d(256, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
      (bn2): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      (downsample): Sequential(
        (0): Conv2d(128, 256, kernel_size=(1, 1), stride=(2, 2), bias=False)
        (1): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      )
    )
    (1): BasicBlock(
      (conv1): Conv2d(256, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
```

```
(bn1): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      (relu): ReLU(inplace=True)
      (conv2): Conv2d(256, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
      (bn2): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
    )
  (layer4): Sequential(
    (0): BasicBlock(
      (conv1): Conv2d(256, 512, kernel_size=(3, 3), stride=(2, 2), padding=(1,
1), bias=False)
      (bn1): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      (relu): ReLU(inplace=True)
      (conv2): Conv2d(512, 512, kernel_size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
      (bn2): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
      (downsample): Sequential(
        (0): Conv2d(256, 512, kernel size=(1, 1), stride=(2, 2), bias=False)
        (1): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      )
    (1): BasicBlock(
      (conv1): Conv2d(512, 512, kernel size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
      (bn1): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True,
track_running_stats=True)
      (relu): ReLU(inplace=True)
      (conv2): Conv2d(512, 512, kernel size=(3, 3), stride=(1, 1), padding=(1,
1), bias=False)
      (bn2): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True,
track running stats=True)
    )
  )
  (avgpool): AdaptiveAvgPool2d(output_size=(1, 1))
  (fc): Linear(in_features=512, out_features=45, bias=True)
Params to learn:
         fc.weight
         fc.bias
SGD (
Parameter Group 0
    dampening: 0
    differentiable: False
```

```
foreach: None
   lr: 0.001
   maximize: False
   momentum: 0.9
   nesterov: False
   weight_decay: 0
)
Fold: 1
-----
Params to learn:
       fc.weight
        fc.bias
Epoch 1
-----
Started train.
loss: 3.890680 [ 32/25200]
loss: 3.182249 [ 3232/25200]
loss: 2.741067 [ 6432/25200]
loss: 2.386566 [ 9632/25200]
loss: 2.038327 [12832/25200]
loss: 1.955219 [16032/25200]
loss: 2.041826 [19232/25200]
loss: 1.697521 [22432/25200]
Started validation.
Test Error:
Accuracy: 69.5%, Avg loss: 1.321998
Epoch 2
_____
Started train.
loss: 2.177585 [ 32/25200]
loss: 1.545591 [ 3232/25200]
loss: 1.262399 [ 6432/25200]
loss: 1.892634 [ 9632/25200]
loss: 1.128474 [12832/25200]
loss: 1.068921 [16032/25200]
loss: 1.356302 [19232/25200]
loss: 1.596925 [22432/25200]
Started validation.
Test Error:
Accuracy: 74.2%, Avg loss: 1.001065
Epoch 3
-----
Started train.
loss: 1.502834 [ 32/25200]
loss: 1.505419 [ 3232/25200]
```

loss: 1.115209 [6432/25200]

```
loss: 1.152848 [ 9632/25200]
loss: 0.811948 [12832/25200]
loss: 1.642592 [16032/25200]
loss: 1.445277 [19232/25200]
loss: 1.380301 [22432/25200]
Started validation.
Test Error:
Accuracy: 75.2%, Avg loss: 0.908210
Epoch 4
_____
Started train.
loss: 1.187894 [ 32/25200]
loss: 0.961881 [ 3232/25200]
loss: 1.120513 [ 6432/25200]
loss: 1.319457 [ 9632/25200]
loss: 1.367835 [12832/25200]
loss: 0.970807 [16032/25200]
loss: 0.921183 [19232/25200]
loss: 0.926089 [22432/25200]
Started validation.
Test Error:
Accuracy: 76.6%, Avg loss: 0.828743
Epoch 5
_____
Started train.
loss: 0.755459 [ 32/25200]
loss: 1.635669 [ 3232/25200]
loss: 0.849786 [ 6432/25200]
loss: 1.286540 [ 9632/25200]
loss: 1.082298 [12832/25200]
loss: 1.341350 [16032/25200]
loss: 0.986091 [19232/25200]
loss: 1.051346 [22432/25200]
Started validation.
Test Error:
Accuracy: 76.6%, Avg loss: 0.811545
Epoch 6
```

Started train.

loss: 1.487782 [32/25200]

loss: 1.469378 [3232/25200]

loss: 0.852992 [6432/25200]

loss: 0.956591 [9632/25200]

loss: 0.854385 [12832/25200]

loss: 1.251342 [16032/25200]

loss: 0.814736 [19232/25200] loss: 1.263947 [22432/25200]

Started validation.

Test Error:

Accuracy: 77.9%, Avg loss: 0.764266

Epoch 7

Started train.

loss: 1.065741 [32/25200] loss: 1.159396 [3232/25200] loss: 0.990760 [6432/25200] loss: 0.685865 [9632/25200] loss: 1.057520 [12832/25200] loss: 1.105249 [16032/25200] loss: 1.113102 [19232/25200] loss: 1.012909 [22432/25200]

Started validation.

Test Error:

Accuracy: 78.3%, Avg loss: 0.748739

Epoch 8

Started train.

loss: 1.341325 [32/25200] loss: 1.048397 [3232/25200] loss: 0.700002 [6432/25200] loss: 0.644860 [9632/25200] loss: 0.835713 [12832/25200] loss: 0.945018 [16032/25200] loss: 1.122493 [19232/25200] loss: 1.356460 [22432/25200]

Started validation.

Test Error:

Accuracy: 78.7%, Avg loss: 0.734540

Epoch 9

Started train.

loss: 1.033965 [32/25200] loss: 1.210716 [3232/25200] loss: 0.699580 [6432/25200] loss: 0.999322 [9632/25200] loss: 1.356173 [12832/25200] loss: 0.816906 [16032/25200] loss: 1.269798 [19232/25200] loss: 0.843787 [22432/25200]

Started validation.

```
Test Error:
```

Accuracy: 78.6%, Avg loss: 0.721440

Epoch 10

Started train.

loss: 1.223247 [32/25200] loss: 0.693740 [3232/25200] loss: 0.797439 [6432/25200] loss: 0.760607 [9632/25200] loss: 0.707379 [12832/25200] loss: 0.438519 [16032/25200] loss: 0.941199 [19232/25200] loss: 0.719749 [22432/25200]

Started validation.

Test Error:

Accuracy: 78.2%, Avg loss: 0.715150

Epoch 11

Started train.

loss: 1.021843 [32/25200] loss: 0.915179 [3232/25200] loss: 1.005942 [6432/25200] loss: 0.847555 [9632/25200] loss: 0.668349 [12832/25200] loss: 0.786110 [16032/25200] loss: 0.720083 [19232/25200] loss: 0.501673 [22432/25200]

Started validation.

Test Error:

Accuracy: 79.2%, Avg loss: 0.699072

Epoch 12

Started train.

loss: 0.794973 [32/25200] loss: 1.343701 [3232/25200] loss: 1.006589 [6432/25200] loss: 1.054204 [9632/25200] loss: 0.875473 [12832/25200] loss: 1.024033 [16032/25200] loss: 0.730604 [19232/25200] loss: 1.066857 [22432/25200]

Started validation.

Test Error:

Accuracy: 79.2%, Avg loss: 0.698682

Epoch 13

```
Started train.
```

loss: 0.800665 [32/25200] loss: 0.809411 [3232/25200] loss: 0.525107 [6432/25200] loss: 0.731310 [9632/25200] loss: 0.843429 [12832/25200] loss: 1.317476 [16032/25200] loss: 0.628172 [19232/25200] loss: 0.984468 [22432/25200]

Started validation.

Test Error:

Accuracy: 79.5%, Avg loss: 0.682057

Epoch 14

Started train.

loss: 1.587573 [32/25200] loss: 1.116967 [3232/25200] loss: 0.822276 [6432/25200] loss: 1.099738 [9632/25200] loss: 0.789875 [12832/25200] loss: 0.569978 [16032/25200] loss: 0.853551 [19232/25200] loss: 1.324395 [22432/25200]

Started validation.

Test Error:

Accuracy: 79.3%, Avg loss: 0.679324

Epoch 15

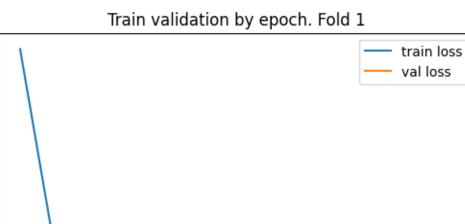
Started train.

loss: 0.813406 [32/25200] loss: 1.304135 [3232/25200] loss: 1.094846 [6432/25200] loss: 0.633451 [9632/25200] loss: 1.092720 [12832/25200] loss: 0.765974 [16032/25200] loss: 1.154358 [19232/25200] loss: 0.631918 [22432/25200]

Started validation.

Test Error:

Accuracy: 79.9%, Avg loss: 0.670507



Done.

2.25

2.00

1.75

1.50

1.25

1.00

0.75

0

1

2

3

[]:

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10

11

12 13 14