skv2109 hw5 p2 TPU

December 12, 2019

0.1 PyTorch/TPU ResNet18/CIFAR10 Demo

This colab example is TF/XRT 1.15 compatible.

Use Colab Cloud TPU

- On the main menu, click Runtime and select **Change runtime type**. Set "TPU" as the hardware accelerator.
- The cell below makes sure you have access to a TPU on Colab.

```
[0]: import os
assert os.environ['COLAB_TPU_ADDR'], 'Make sure to select TPU from Edit >

→Notebook settings > Hardware accelerator'
import collections
from datetime import datetime, timedelta
import requests
import threading
```

```
[0]: from google.colab import drive drive.mount('/content/drive')
```

Go to this URL in a browser: https://accounts.google.com/o/oauth2/auth?client_id =947318989803-6bn6qk8qdgf4n4g3pfee6491hc0brc4i.apps.googleusercontent.com&redire ct_uri=urn%3aietf%3awg%3aoauth%3a2.0%3aoob&response_type=code&scope=email%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdocs.test%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive.photos.readonly%20https%3a%2f%2fwww.googleapis.com%2fauth%2fpeopleapi.readonly

```
Enter your authorization code:
.....
Mounted at /content/drive
```

0.1.1 [RUNME] Install Colab TPU compatible PyTorch/TPU wheels and dependencies

This may take up to ~2 minutes

```
[0]: import collections
    from datetime import datetime, timedelta
    import os
    import requests
    import threading
    _VersionConfig = collections.namedtuple('_VersionConfig', 'wheels, server')
    CONFIG = {
        'xrt==1.15.0': _VersionConfig('1.15', '1.15.0'),
         'torch_xla==nightly': _VersionConfig('nightly', 'XRT-dev{}'.format(
            (datetime.today() - timedelta(1)).strftime('%Y%m%d'))),
    } [VERSION]
    DIST_BUCKET = 'gs://tpu-pytorch/wheels'
    TORCH_WHEEL = 'torch-{}-cp36-cp36m-linux_x86_64.whl'.format(CONFIG.wheels)
    TORCH_XLA_WHEEL = 'torch_xla-{}-cp36-cp36m-linux_x86_64.whl'.format(CONFIG.
     →wheels)
    TORCHVISION_WHEEL = 'torchvision-{}-cp36-cp36m-linux_x86_64.whl'.format(CONFIG.
    # Update TPU XRT version
    def update_server_xrt():
      print('Updating server-side XRT to {} ...'.format(CONFIG.server))
      url = 'http://{TPU_ADDRESS}:8475/requestversion/{XRT_VERSION}'.format(
          TPU_ADDRESS=os.environ['COLAB_TPU_ADDR'].split(':')[0],
          XRT_VERSION=CONFIG.server,
      print('Done updating server-side XRT: {}'.format(requests.post(url)))
    update = threading.Thread(target=update_server_xrt)
    update.start()
    # Install Colab TPU compat PyTorch/TPU wheels and dependencies
     !pip uninstall -y torch torchvision
     !gsutil cp "$DIST_BUCKET/$TORCH_WHEEL" .
     !gsutil cp "$DIST_BUCKET/$TORCH_XLA_WHEEL" .
     !gsutil cp "$DIST_BUCKET/$TORCHVISION_WHEEL" .
     !pip install "$TORCH_WHEEL"
     !pip install "$TORCH_XLA_WHEEL"
     !pip install "$TORCHVISION_WHEEL"
     !sudo apt-get install libomp5
    update.join()
    Updating server-side XRT to 1.15.0 ...
```

```
Updating server-side XRT to 1.15.0 ...
Uninstalling torch-1.3.1:
Done updating server-side XRT: <Response [200]>
Successfully uninstalled torch-1.3.1
```

```
Uninstalling torchvision-0.4.2:
  Successfully uninstalled torchvision-0.4.2
Copying gs://tpu-pytorch/wheels/torch-1.15-cp36-cp36m-linux_x86_64.whl...
\ [1 files][ 77.8 MiB/ 77.8 MiB]
Operation completed over 1 objects/77.8 MiB.
Copying gs://tpu-pytorch/wheels/torch_xla-1.15-cp36-cp36m-linux_x86_64.whl...
- [1 files] [109.8 MiB/109.8 MiB]
Operation completed over 1 objects/109.8 MiB.
Copying gs://tpu-pytorch/wheels/torchvision-1.15-cp36-cp36m-linux_x86_64.whl...
/ [1 files] [ 2.1 MiB/ 2.1 MiB]
Operation completed over 1 objects/2.1 MiB.
Processing ./torch-1.15-cp36-cp36m-linux_x86_64.whl
ERROR: fastai 1.0.59 requires torchvision, which is not installed.
Installing collected packages: torch
Successfully installed torch-1.4.0a0+c272758
Processing ./torch_xla-1.15-cp36-cp36m-linux_x86_64.whl
Installing collected packages: torch-xla
Successfully installed torch-xla-rt.r1.15
Processing ./torchvision-1.15-cp36-cp36m-linux_x86_64.whl
Requirement already satisfied: pillow>=4.1.1 in /usr/local/lib/python3.6/dist-
packages (from torchvision==1.15) (4.3.0)
Requirement already satisfied: torch in /usr/local/lib/python3.6/dist-packages
(from torchvision==1.15) (1.4.0a0+c272758)
Requirement already satisfied: six in /usr/local/lib/python3.6/dist-packages
(from torchvision==1.15) (1.12.0)
Requirement already satisfied: numpy in /usr/local/lib/python3.6/dist-packages
(from torchvision==1.15) (1.17.4)
Requirement already satisfied: olefile in /usr/local/lib/python3.6/dist-packages
(from pillow>=4.1.1->torchvision==1.15) (0.46)
Installing collected packages: torchvision
Successfully installed torchvision-0.5.0a0+8aec85d
Reading package lists... Done
Building dependency tree
Reading state information... Done
The following package was automatically installed and is no longer required:
  libnvidia-common-430
Use 'sudo apt autoremove' to remove it.
The following NEW packages will be installed:
 libomp5
0 upgraded, 1 newly installed, 0 to remove and 7 not upgraded.
Need to get 234 kB of archives.
After this operation, 774 kB of additional disk space will be used.
Get:1 http://archive.ubuntu.com/ubuntu bionic/universe amd64 libomp5 amd64
5.0.1-1 [234 kB]
Fetched 234 kB in 1s (357 kB/s)
debconf: unable to initialize frontend: Dialog
debconf: (No usable dialog-like program is installed, so the dialog based
frontend cannot be used. at /usr/share/perl5/Debconf/FrontEnd/Dialog.pm line 76,
```

```
<> line 1.)
debconf: falling back to frontend: Readline
debconf: unable to initialize frontend: Readline
debconf: (This frontend requires a controlling tty.)
debconf: falling back to frontend: Teletype
dpkg-preconfigure: unable to re-open stdin:
Selecting previously unselected package libomp5:amd64.
(Reading database ... 134983 files and directories currently installed.)
Preparing to unpack .../libomp5_5.0.1-1_amd64.deb ...
Unpacking libomp5:amd64 (5.0.1-1) ...
Setting up libomp5:amd64 (5.0.1-1) ...
Processing triggers for libc-bin (2.27-3ubuntu1) ...
```

0.1.2 Define Parameters

```
[0]: # Result Visualization Helper
     from matplotlib import pyplot as plt
     from torch.optim import lr_scheduler
     M, N = 4, 6
     RESULT_IMG_PATH = '/tmp/test_result.jpg'
     CIFAR10_LABELS = ['airplane', 'automobile', 'bird', 'cat', 'deer',
                      'dog', 'frog', 'horse', 'ship', 'truck']
     def plot_results(images, labels, preds):
       images, labels, preds = images[:M*N], labels[:M*N], preds[:M*N]
       inv_norm = transforms.Normalize(
           mean=(-0.4914/0.2023, -0.4822/0.1994, -0.4465/0.2010),
           std=(1/0.2023, 1/0.1994, 1/0.2010))
      num_images = images.shape[0]
       fig, axes = plt.subplots(M, N, figsize=(16, 9))
       fig.suptitle('Correct / Predicted Labels (Red text for incorrect ones)')
       for i, ax in enumerate(fig.axes):
         ax.axis('off')
         if i >= num_images:
           continue
         img, label, prediction = images[i], labels[i], preds[i]
         img = inv_norm(img)
         img = img.permute(1, 2, 0) # (C, M, N) \rightarrow (M, N, C)
         label, prediction = label.item(), prediction.item()
         if label == prediction:
           ax.set_title(u'\u2713', color='blue', fontsize=22)
           ax.set_title(
```

```
[0]: # Define Parameters
FLAGS = {}
FLAGS['data_dir'] = "/tmp/cifar"
FLAGS['batch_size'] = 16
FLAGS['num_workers'] = 8
FLAGS['learning_rate'] = 0.1
FLAGS['momentum'] = 0.9
FLAGS['num_epochs'] = 200
FLAGS['num_cores'] = 8
FLAGS['log_steps'] = 20
FLAGS['log_steps'] = True
```

```
[0]: import numpy as np
  import time
  import torch
  import torch.nn as nn
  import torch.nn.functional as F
  import torch.optim as optim
  import torch_xla
  import torch_xla.core.xla_model as xm
  import torch_xla.debug.metrics as met
  import torch_xla.distributed.parallel_loader as pl
  import torch_xla.distributed.xla_multiprocessing as xmp
  import torch_xla.utils.utils as xu
  import torchvision
  from torch.optim import lr_scheduler
  from torchvision import datasets, models, transforms
```

```
transforms.RandomCrop(32, padding=4),
#
      transforms.RandomHorizontalFlip(),
      transforms.ToTensor(),
      norm.
# 7)
transform_test = transforms.Compose([
      transforms.Resize(256),
      transforms.CenterCrop(224),
      transforms.ToTensor(),
      transforms.Normalize([0.485, 0.456, 0.406], [0.229, 0.224, 0.225])
1)
# transforms.Compose([
      transforms. To Tensor(),
      norm,
# ])
train_dataset = datasets.CIFAR10(
    root=os.path.join(FLAGS['data_dir'], str(xm.get_ordinal())),
    train=True,
    download=True,
    transform=transform_train)
test_dataset = datasets.CIFAR10(
    root=os.path.join(FLAGS['data_dir'], str(xm.get_ordinal())),
    train=False,
    download=True,
    transform=transform_test)
train sampler = torch.utils.data.distributed.DistributedSampler(
    train_dataset,
    num_replicas=xm.xrt_world_size(),
    rank=xm.get_ordinal(),
    shuffle=True)
train_loader = torch.utils.data.DataLoader(
    train_dataset,
    batch_size=FLAGS['batch_size'],
    sampler=train_sampler,
    num_workers=FLAGS['num_workers'],
    drop_last=True)
test_loader = torch.utils.data.DataLoader(
    test_dataset,
    batch size=FLAGS['batch size'],
    shuffle=False,
    num_workers=FLAGS['num_workers'],
    drop_last=True)
# Scale learning rate to num cores
learning_rate = FLAGS['learning_rate'] * xm.xrt_world_size()
# Get loss function, optimizer, and model
```

```
device = xm.xla_device()
 model = models.resnet50().to(device)
 optimizer = optim.SGD(model.parameters(), lr=learning_rate,
                       momentum=FLAGS['momentum'], weight_decay=5e-4)
 scheduler = lr_scheduler.StepLR(optimizer, step_size=90, gamma=0.1)
 \#loss_fn = nn.NLLLoss()
 loss_fn = nn.CrossEntropyLoss()
 def train loop fn(loader):
   tracker = xm.RateTracker()
   model.train()
   for x, (data, target) in enumerate(loader):
     optimizer.zero_grad()
     output = model(data)
     loss = loss_fn(output, target)
     loss.backward()
     xm.optimizer_step(optimizer)
     tracker.add(FLAGS['batch_size'])
     #scheduler.step()
     #if x \% FLAGS['log_steps'] == 0:
     \# print('[xla:{}]({}) Loss={}:.5f} Rate={}:.2f} GlobalRate={}:.2f} Time={}'.
\rightarrow format (
     #
            xm.get_ordinal(), x, loss.item(), tracker.rate(),
            tracker.global_rate(), time.asctime()), flush=True)
 def test_loop_fn(loader):
   total_samples = 0
   correct = 0
   model.eval()
   data, pred, target = None, None, None
   for data, target in loader:
     output = model(data)
     pred = output.max(1, keepdim=True)[1]
     correct += pred.eq(target.view_as(pred)).sum().item()
     total_samples += data.size()[0]
   accuracy = 100.0 * correct / total_samples
   #print('[xla:{}] Accuracy={:.2f}%'.format(
        xm.get_ordinal(), accuracy), flush=True)
   return accuracy, data, pred, target
 # Train and eval loops
 accuracy = 0.0
 data, pred, target = None, None, None
 for epoch in range(1, FLAGS['num_epochs'] + 1):
   para_loader = pl.ParallelLoader(train_loader, [device])
   train_loop_fn(para_loader.per_device_loader(device))
```

```
scheduler.step()
        xm.master_print("Finished training epoch {}".format(epoch))
        print("Finishtime: ", datetime.now())
         if epoch % 10 == 0:
           torch.save(model.state_dict(), '/content/drive/My Drive/tpu-resnet50/
      →model.pt')
        para_loader = pl.ParallelLoader(test_loader, [device])
        accuracy, data, pred, target = test_loop_fn(para_loader.
      →per_device_loader(device))
         #if FLAGS['metrics debug']:
           #xm.master_print(met.metrics_report())
       return accuracy, data, pred, target, model
[0]: # Start training processes
     print("Starttime: ", datetime.now())
     def _mp_fn(rank, flags):
       global FLAGS
      FLAGS = flags
      torch.set_default_tensor_type('torch.FloatTensor')
       accuracy, data, pred, target, model = train_resnet50()
     xmp.spawn(_mp_fn, args=(FLAGS,), nprocs=FLAGS['num_cores'], start_method='fork')
    Starttime: 2019-12-12 02:16:22.884370
    Downloading https://www.cs.toronto.edu/~kriz/cifar-10-python.tar.gz to
    /tmp/cifar/0/cifar-10-python.tar.gz
    HBox(children=(IntProgress(value=1, bar_style='info', max=1), HTML(value='')))
    Downloading https://www.cs.toronto.edu/~kriz/cifar-10-python.tar.gz to
    /tmp/cifar/3/cifar-10-python.tar.gz
    Downloading https://www.cs.toronto.edu/~kriz/cifar-10-python.tar.gz to
    /tmp/cifar/6/cifar-10-python.tar.gz
    HBox(children=(IntProgress(value=1, bar_style='info', max=1), HTML(value='')))
    HBox(children=(IntProgress(value=1, bar_style='info', max=1), HTML(value='')))
    Downloading https://www.cs.toronto.edu/~kriz/cifar-10-python.tar.gz to
    /tmp/cifar/2/cifar-10-python.tar.gz
    HBox(children=(IntProgress(value=1, bar_style='info', max=1), HTML(value='')))
    Downloading https://www.cs.toronto.edu/~kriz/cifar-10-python.tar.gz to
    /tmp/cifar/1/cifar-10-python.tar.gz
    HBox(children=(IntProgress(value=1, bar_style='info', max=1), HTML(value='')))
```

```
Downloading https://www.cs.toronto.edu/~kriz/cifar-10-python.tar.gz to
/tmp/cifar/5/cifar-10-python.tar.gz
HBox(children=(IntProgress(value=1, bar style='info', max=1), HTML(value='')))
Downloading https://www.cs.toronto.edu/~kriz/cifar-10-python.tar.gz to
/tmp/cifar/7/cifar-10-python.tar.gz
HBox(children=(IntProgress(value=1, bar_style='info', max=1), HTML(value='')))
Downloading https://www.cs.toronto.edu/~kriz/cifar-10-python.tar.gz to
/tmp/cifar/4/cifar-10-python.tar.gz
HBox(children=(IntProgress(value=1, bar_style='info', max=1), HTML(value='')))
Extracting /tmp/cifar/3/cifar-10-python.tar.gz to /tmp/cifar/3
Extracting /tmp/cifar/1/cifar-10-python.tar.gz to /tmp/cifar/1
Extracting /tmp/cifar/2/cifar-10-python.tar.gz to /tmp/cifar/2
Extracting /tmp/cifar/0/cifar-10-python.tar.gz to /tmp/cifar/0
Extracting /tmp/cifar/6/cifar-10-python.tar.gz to /tmp/cifar/6
Extracting /tmp/cifar/5/cifar-10-python.tar.gz to /tmp/cifar/5
Extracting /tmp/cifar/7/cifar-10-python.tar.gz to /tmp/cifar/7
Files already downloaded and verified
Extracting /tmp/cifar/4/cifar-10-python.tar.gz to /tmp/cifar/4
Files already downloaded and verified
Finishtime: 2019-12-12 02:18:32.664870
Finishtime: 2019-12-12 02:18:32.666317
Finished training epoch 1
Finishtime: 2019-12-12 02:18:32.666974
Finishtime: 2019-12-12 02:18:32.667074
Finishtime: 2019-12-12 02:18:32.666922
Finishtime: 2019-12-12 02:18:32.667180
Finishtime: 2019-12-12 02:18:32.667343
Finishtime: 2019-12-12 02:18:32.668390
[xla:3] Accuracy=10.00%
[xla:4] Accuracy=10.01%
[xla:0] Accuracy=10.00%
[xla:2] Accuracy=9.99%
[xla:6] Accuracy=9.99%
[xla:7] Accuracy=9.99%
```

[xla:1] Accuracy=10.01% [xla:5] Accuracy=9.99%

Finishtime: 2019-12-12 02:20:33.745303

Finished training epoch 2

Finishtime: 2019-12-12 02:20:33.746007 Finishtime: 2019-12-12 02:20:33.745819 Finishtime: 2019-12-12 02:20:33.745795 Finishtime: 2019-12-12 02:20:33.746402 Finishtime: 2019-12-12 02:20:33.746703 Finishtime: 2019-12-12 02:20:33.746717 Finishtime: 2019-12-12 02:20:33.748532

[xla:3] Accuracy=23.58% [xla:5] Accuracy=22.74% [xla:4] Accuracy=23.50% [xla:7] Accuracy=23.53% [xla:6] Accuracy=23.38% [xla:2] Accuracy=23.44% [xla:1] Accuracy=23.34% [xla:0] Accuracy=23.91%

Finishtime: 2019-12-12 02:22:26.190221
Finishtime: 2019-12-12 02:22:26.191013
Finishtime: 2019-12-12 02:22:26.192110
Finishtime: 2019-12-12 02:22:26.191980
Finishtime: 2019-12-12 02:22:26.192230
Finishtime: 2019-12-12 02:22:26.193103

Finished training epoch 3

Finishtime: 2019-12-12 02:22:26.196694 Finishtime: 2019-12-12 02:22:26.197799

[xla:3] Accuracy=18.65% [xla:7] Accuracy=18.84% [xla:5] Accuracy=17.49% [xla:6] Accuracy=18.38% [xla:4] Accuracy=18.22% [xla:0] Accuracy=17.59% [xla:2] Accuracy=18.74% [xla:1] Accuracy=18.33%

Finishtime: 2019-12-12 02:24:18.915306

Finished training epoch 4

Finishtime: 2019-12-12 02:24:18.916701
Finishtime: 2019-12-12 02:24:18.916939
Finishtime: 2019-12-12 02:24:18.916769
Finishtime: 2019-12-12 02:24:18.917689
Finishtime: 2019-12-12 02:24:18.916873
Finishtime: 2019-12-12 02:24:18.917416
Finishtime: 2019-12-12 02:24:18.917426

[xla:0] Accuracy=17.13%
[xla:5] Accuracy=15.86%
[xla:2] Accuracy=16.63%

```
[xla:1] Accuracy=15.66%
[xla:7] Accuracy=15.27%
[xla:4] Accuracy=16.91%
[xla:3] Accuracy=16.04%
[xla:6] Accuracy=17.15%
Finishtime: 2019-12-12 02:26:11.123379
Finishtime: 2019-12-12 02:26:11.124103
Finishtime: 2019-12-12 02:26:11.124299
Finished training epoch 5
Finishtime: 2019-12-12 02:26:11.125800
Finishtime: 2019-12-12 02:26:11.125287
Finishtime: 2019-12-12 02:26:11.125899
Finishtime: 2019-12-12 02:26:11.125887
Finishtime: 2019-12-12 02:26:11.126318
[xla:7] Accuracy=23.20%
[xla:5] Accuracy=21.61%
[xla:3] Accuracy=22.96%
[xla:0] Accuracy=22.89%
[xla:4] Accuracy=22.33%
[xla:1] Accuracy=22.91%
[xla:6] Accuracy=23.04%
[xla:2] Accuracy=23.26%
Finishtime: 2019-12-12 02:28:03.155101
Finishtime: 2019-12-12 02:28:03.155226
Finishtime: 2019-12-12 02:28:03.155504
Finished training epoch 6
Finishtime: 2019-12-12 02:28:03.156014
Finishtime: 2019-12-12 02:28:03.155855
Finishtime: 2019-12-12 02:28:03.157104
Finishtime: 2019-12-12 02:28:03.156930
Finishtime: 2019-12-12 02:28:03.157565
[xla:5] Accuracy=24.69%
[xla:3] Accuracy=25.67%
[xla:7] Accuracy=25.73%
[xla:0] Accuracy=24.75%
[xla:2] Accuracy=24.87%
[xla:6] Accuracy=25.00%
[xla:4] Accuracy=25.39%
```

Finishtime: 2019-12-12 02:29:54.957060
Finishtime: 2019-12-12 02:29:54.957728
Finishtime: 2019-12-12 02:29:54.957588
Finishtime: 2019-12-12 02:29:54.958319

Finished training epoch 7

[xla:1] Accuracy=25.39%

Finishtime: 2019-12-12 02:29:54.958473 Finishtime: 2019-12-12 02:29:54.960327 Finishtime: 2019-12-12 02:29:54.961793 Finishtime: 2019-12-12 02:29:54.962242

```
[xla:5] Accuracy=19.96%
[xla:3] Accuracy=21.00%
[xla:4] Accuracy=21.19%
[xla:6] Accuracy=21.34%
[xla:1] Accuracy=21.22%
[xla:7] Accuracy=21.77%
[xla:2] Accuracy=20.92%
[xla:0] Accuracy=20.70%
Finishtime: 2019-12-12 02:31:46.389344
Finishtime:
            2019-12-12 02:31:46.389310
Finishtime: 2019-12-12 02:31:46.390360
Finishtime: 2019-12-12 02:31:46.390849
Finishtime: 2019-12-12 02:31:46.391521
Finishtime: 2019-12-12 02:31:46.391343
Finishtime: 2019-12-12 02:31:46.390570
Finished training epoch 8
Finishtime: 2019-12-12 02:31:46.393847
[xla:4] Accuracy=23.44%
[xla:6] Accuracy=22.84%
[xla:5] Accuracy=22.70%
[xla:3] Accuracy=23.56%
[xla:2] Accuracy=22.26%
[xla:1] Accuracy=23.69%
[xla:7] Accuracy=24.12%
[xla:0] Accuracy=23.06%
Finishtime: 2019-12-12 02:33:39.360706
Finishtime:
            2019-12-12 02:33:39.360636
Finishtime: 2019-12-12 02:33:39.361157
Finishtime: 2019-12-12 02:33:39.360899
Finished training epoch 9
Finishtime: 2019-12-12 02:33:39.361541
Finishtime: 2019-12-12 02:33:39.361446
Finishtime: 2019-12-12 02:33:39.362822
Finishtime: 2019-12-12 02:33:39.362850
[xla:7] Accuracy=29.83%
[xla:3] Accuracy=29.78%
[xla:4] Accuracy=29.51%
[xla:6] Accuracy=29.38%
[xla:5] Accuracy=29.59%
[xla:1] Accuracy=29.83%
[xla:2] Accuracy=29.38%
[xla:0] Accuracy=29.43%
Finishtime:
            2019-12-12 02:35:32.578684
Finishtime: 2019-12-12 02:35:32.578307
Finishtime: 2019-12-12 02:35:32.578311
Finishtime: 2019-12-12 02:35:32.579305
```

Finishtime: 2019-12-12 02:35:32.579680

Finished training epoch 10

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Finishtime: 2019-12-12 02:35:32.579867 Finishtime: 2019-12-12 02:35:32.580947 Finishtime: 2019-12-12 02:35:32.582084 [xla:3] Accuracy=29.05%

[xla:3] Accuracy=29.05% [xla:2] Accuracy=28.98% [xla:4] Accuracy=28.98% [xla:5] Accuracy=28.66% [xla:6] Accuracy=28.97% [xla:0] Accuracy=28.78% [xla:7] Accuracy=28.67% [xla:1] Accuracy=29.54%

Finishtime: 2019-12-12 02:37:37.717175 Finishtime: 2019-12-12 02:37:37.717176 Finishtime: 2019-12-12 02:37:37.717699 Finishtime: 2019-12-12 02:37:37.717832 Finishtime: 2019-12-12 02:37:37.718486

Finished training epoch 11

Finishtime: 2019-12-12 02:37:37.720844 Finishtime: 2019-12-12 02:37:37.721607 Finishtime: 2019-12-12 02:37:37.721497

[xla:6] Accuracy=28.34% [xla:7] Accuracy=27.56% [xla:3] Accuracy=28.47% [xla:4] Accuracy=29.00% [xla:1] Accuracy=27.48% [xla:5] Accuracy=29.49% [xla:2] Accuracy=27.84% [xla:0] Accuracy=28.21%

Finishtime: 2019-12-12 02:39:30.761997 Finishtime: 2019-12-12 02:39:30.761976 Finishtime: 2019-12-12 02:39:30.761708

Finished training epoch 12

Finishtime: 2019-12-12 02:39:30.765344
Finishtime: 2019-12-12 02:39:30.765076
Finishtime: 2019-12-12 02:39:30.765854
Finishtime: 2019-12-12 02:39:30.766089
Finishtime: 2019-12-12 02:39:30.767045

[xla:6] Accuracy=30.48% [xla:4] Accuracy=29.66% [xla:7] Accuracy=31.27% [xla:2] Accuracy=29.60% [xla:0] Accuracy=29.63% [xla:3] Accuracy=30.55% [xla:1] Accuracy=30.31%

[xla:5] Accuracy=30.14% Finishtime: 2019-12-12 02:41:23.890231 Finishtime: 2019-12-12 02:41:23.891563

Finishtime: 2019-12-12 02:41:23.891413

Finishtime: 2019-12-12 02:41:23.891699

Finishtime: 2019-12-12 02:41:23.892467 Finishtime: 2019-12-12 02:41:23.893229

Finishtime: 2019-12-12 02:41:23.891641

Finished training epoch 13

Finishtime: 2019-12-12 02:41:23.895512

[xla:4] Accuracy=28.47%

[xla:0] Accuracy=28.24%

[xla:7] Accuracy=29.66%

[xla:3] Accuracy=29.03%

[xla:2] Accuracy=28.84%

[xla:6] Accuracy=28.14%

[xla:1] Accuracy=29.50%

[xla:5] Accuracy=28.07%

Finishtime: 2019-12-12 02:43:17.011031

Finishtime: 2019-12-12 02:43:17.011513

Finishtime: 2019-12-12 02:43:17.010906

Finished training epoch 14

Finishtime: 2019-12-12 02:43:17.011308

Finishtime: 2019-12-12 02:43:17.011346 Finishtime: 2019-12-12 02:43:17.011971

Finishtime: 2019-12-12 02:43:17.011688

Finishtime: 2019-12-12 02:43:17.012883

[xla:7] Accuracy=26.15%

[xla:6] Accuracy=27.01%

[xla:4] Accuracy=27.39%

[xla:1] Accuracy=26.14%

[xla:3] Accuracy=26.49%

[xla:0] Accuracy=27.29%

[xla:5] Accuracy=25.18%

[xla:2] Accuracy=27.20%

Finishtime: 2019-12-12 02:45:11.090606

Finishtime: 2019-12-12 02:45:11.091203

Finishtime: 2019-12-12 02:45:11.091425

Finished training epoch 15

Finishtime: 2019-12-12 02:45:11.091400

Finishtime: 2019-12-12 02:45:11.091982

Finishtime: 2019-12-12 02:45:11.091927

Finishtime: 2019-12-12 02:45:11.093237

Finishtime: 2019-12-12 02:45:11.093863

[xla:6] Accuracy=31.45%

[xla:4] Accuracy=33.63%

[xla:2] Accuracy=32.32%

[xla:5] Accuracy=31.30%

[xla:3] Accuracy=30.60%

[xla:7] Accuracy=29.72%

[xla:1] Accuracy=31.64%

[xla:0] Accuracy=31.24%

Finishtime: 2019-12-12 02:47:05.683454 Finishtime: 2019-12-12 02:47:05.684186 Finishtime: 2019-12-12 02:47:05.684419

Finished training epoch 16

Finishtime: 2019-12-12 02:47:05.684566 Finishtime: 2019-12-12 02:47:05.684927 Finishtime: 2019-12-12 02:47:05.685327 Finishtime: 2019-12-12 02:47:05.685986 Finishtime: 2019-12-12 02:47:05.686408

[xla:4] Accuracy=30.95%
[xla:5] Accuracy=30.03%
[xla:0] Accuracy=31.50%
[xla:7] Accuracy=32.48%
[xla:6] Accuracy=31.01%
[xla:3] Accuracy=31.75%
[xla:1] Accuracy=32.10%

[xla:2] Accuracy=30.82% Finishtime: 2019-12-12 02:48:59.499019

Finished training epoch 17

Finishtime: 2019-12-12 02:48:59.499694
Finishtime: 2019-12-12 02:48:59.500111
Finishtime: 2019-12-12 02:48:59.501014
Finishtime: 2019-12-12 02:48:59.500007
Finishtime: 2019-12-12 02:48:59.500824
Finishtime: 2019-12-12 02:48:59.500911
Finishtime: 2019-12-12 02:48:59.500527

[xla:6] Accuracy=25.15% [xla:7] Accuracy=25.70% [xla:4] Accuracy=25.03% [xla:3] Accuracy=25.00% [xla:5] Accuracy=24.28% [xla:1] Accuracy=25.55% [xla:2] Accuracy=25.03% [xla:0] Accuracy=25.46%

Finishtime: 2019-12-12 02:50:52.915060
Finishtime: 2019-12-12 02:50:52.915804
Finishtime: 2019-12-12 02:50:52.915508
Finishtime: 2019-12-12 02:50:52.916003
Finishtime: 2019-12-12 02:50:52.916238
Finishtime: 2019-12-12 02:50:52.916417
Finishtime: 2019-12-12 02:50:52.916213

Finished training epoch 18

Finishtime: 2019-12-12 02:50:52.919887

[xla:7] Accuracy=36.10% [xla:6] Accuracy=36.61% [xla:3] Accuracy=35.48% [xla:4] Accuracy=35.10% [xla:5] Accuracy=35.23%

```
[xla:1] Accuracy=36.93%
[xla:0] Accuracy=35.97%
[xla:2] Accuracy=36.07%
Finished training epoch 19
Finishtime: 2019-12-12 02:52:46.312004
Finishtime: 2019-12-12 02:52:46.311398
Finishtime: 2019-12-12 02:52:46.311795
Finishtime: 2019-12-12 02:52:46.312414
Finishtime: 2019-12-12 02:52:46.312219
Finishtime: 2019-12-12 02:52:46.312531
Finishtime: 2019-12-12 02:52:46.313880
Finishtime: 2019-12-12 02:52:46.313424
[xla:6] Accuracy=32.13%
[xla:3] Accuracy=32.29%
[xla:0] Accuracy=32.52%
[xla:7] Accuracy=32.53%
[xla:5] Accuracy=31.71%
[xla:4] Accuracy=31.86%
[xla:1] Accuracy=32.84%
[xla:2] Accuracy=32.30%
Finishtime: 2019-12-12 02:54:39.267613
Finished training epoch 20
Finishtime: 2019-12-12 02:54:39.268195
Finishtime: 2019-12-12 02:54:39.268365
Finishtime: 2019-12-12 02:54:39.268846
Finishtime: 2019-12-12 02:54:39.268484
Finishtime: 2019-12-12 02:54:39.269912
Finishtime: 2019-12-12 02:54:39.270432
Finishtime: 2019-12-12 02:54:39.271213
[xla:6] Accuracy=29.69%
[xla:4] Accuracy=29.60%
[xla:5] Accuracy=30.09%
[xla:0] Accuracy=29.98%
[xla:3] Accuracy=30.00%
[xla:7] Accuracy=30.24%
[xla:2] Accuracy=29.91%
[xla:1] Accuracy=29.60%
Finishtime: 2019-12-12 02:56:41.274240
Finishtime: 2019-12-12 02:56:41.275836
Finishtime: 2019-12-12 02:56:41.276760
Finishtime: 2019-12-12 02:56:41.276050
Finishtime: 2019-12-12 02:56:41.276631
Finishtime: 2019-12-12 02:56:41.276495
Finished training epoch 21
Finishtime: 2019-12-12 02:56:41.277439
Finishtime: 2019-12-12 02:56:41.279459
[xla:7] Accuracy=40.89%
[xla:6] Accuracy=40.17%
```

```
[xla:4] Accuracy=40.27%
[xla:5] Accuracy=39.94%
[xla:0] Accuracy=40.52%
[xla:2] Accuracy=40.88%
[xla:3] Accuracy=40.42%
[xla:1] Accuracy=41.00%
Finishtime: 2019-12-12 02:58:34.564328
Finishtime: 2019-12-12 02:58:34.564949
Finishtime: 2019-12-12 02:58:34.565353
Finishtime: 2019-12-12 02:58:34.565471
Finishtime: 2019-12-12 02:58:34.565691
Finished training epoch 22
Finishtime: 2019-12-12 02:58:34.565871
Finishtime: 2019-12-12 02:58:34.565932
Finishtime: 2019-12-12 02:58:34.567899
[xla:6] Accuracy=34.33%
[xla:5] Accuracy=34.22%
[xla:7] Accuracy=34.50%
[xla:2] Accuracy=34.76%
[xla:0] Accuracy=35.16%
[xla:3] Accuracy=34.55%
[xla:1] Accuracy=35.16%
[xla:4] Accuracy=34.41%
Finishtime: 2019-12-12 03:00:27.928039
Finishtime: 2019-12-12 03:00:27.928491
Finishtime: 2019-12-12 03:00:27.929308
Finishtime: 2019-12-12 03:00:27.929169
Finishtime: 2019-12-12 03:00:27.929222
Finishtime: 2019-12-12 03:00:27.929457
Finishtime: 2019-12-12 03:00:27.929837
Finished training epoch 23
Finishtime: 2019-12-12 03:00:27.932486
[xla:6] Accuracy=20.49%
[xla:5] Accuracy=19.51%
[xla:7] Accuracy=21.01%
[xla:0] Accuracy=21.39%
[xla:1] Accuracy=20.29%
[xla:2] Accuracy=20.30%
[xla:3] Accuracy=20.03%
[xla:4] Accuracy=19.59%
Finishtime: 2019-12-12 03:02:21.906883
            2019-12-12 03:02:21.906378
Finishtime:
Finishtime:
            2019-12-12 03:02:21.906525
Finishtime: 2019-12-12 03:02:21.907228
Finishtime:
            2019-12-12 03:02:21.906703
Finishtime: 2019-12-12 03:02:21.906889
Finishtime: 2019-12-12 03:02:21.907051
```

Finished training epoch 24

17

```
Finishtime: 2019-12-12 03:02:21.909431
[xla:5] Accuracy=17.73%
[xla:0] Accuracy=18.25%
[xla:6] Accuracy=18.61%
[xla:3] Accuracy=18.46%
[xla:7] Accuracy=19.08%
[xla:4] Accuracy=18.27%
[xla:1] Accuracy=18.04%
[xla:2] Accuracy=19.12%
Finishtime: 2019-12-12 03:04:15.641588
Finishtime: 2019-12-12 03:04:15.641810
Finishtime: 2019-12-12 03:04:15.641790
Finishtime: 2019-12-12 03:04:15.641486
Finished training epoch 25
Finishtime: 2019-12-12 03:04:15.642384
Finishtime: 2019-12-12 03:04:15.642718
Finishtime: 2019-12-12 03:04:15.642690
Finishtime: 2019-12-12 03:04:15.644183
[xla:4] Accuracy=30.38%
[xla:5] Accuracy=30.24%
[xla:7] Accuracy=31.72%
[xla:3] Accuracy=31.77%
[xla:2] Accuracy=30.77%
[xla:1] Accuracy=30.97%
[xla:6] Accuracy=29.68%
[xla:0] Accuracy=30.73%
Finishtime: 2019-12-12 03:06:09.748478
Finishtime: 2019-12-12 03:06:09.748298
Finishtime: 2019-12-12 03:06:09.748786
Finishtime: 2019-12-12 03:06:09.749524
Finishtime: 2019-12-12 03:06:09.748970
Finished training epoch 26
Finishtime: 2019-12-12 03:06:09.749753
Finishtime: 2019-12-12 03:06:09.751156
Finishtime: 2019-12-12 03:06:09.749849
[xla:6] Accuracy=34.02%
[xla:7] Accuracy=34.55%
[xla:5] Accuracy=32.82%
[xla:1] Accuracy=33.96%
[xla:0] Accuracy=33.52%
[xla:4] Accuracy=33.01%
[xla:2] Accuracy=33.32%
[xla:3] Accuracy=33.50%
Finishtime: 2019-12-12 03:08:03.271641
Finishtime: 2019-12-12 03:08:03.272538
Finishtime: 2019-12-12 03:08:03.273118
Finished training epoch 27
```

Finishtime: 2019-12-12 03:08:03.273407

Finishtime: 2019-12-12 03:08:03.273654
Finishtime: 2019-12-12 03:08:03.273786
Finishtime: 2019-12-12 03:08:03.275184
Finishtime: 2019-12-12 03:08:03.274739
[xla:7] Accuracy=37.57%

[xla:7] Accuracy=37.57% [xla:6] Accuracy=38.05% [xla:5] Accuracy=37.14% [xla:0] Accuracy=37.96% [xla:4] Accuracy=38.12% [xla:1] Accuracy=37.33% [xla:3] Accuracy=36.98% [xla:2] Accuracy=38.54%

Finishtime: 2019-12-12 03:09:56.395604
Finishtime: 2019-12-12 03:09:56.395528
Finishtime: 2019-12-12 03:09:56.396344
Finishtime: 2019-12-12 03:09:56.396498
Finishtime: 2019-12-12 03:09:56.396950
Finishtime: 2019-12-12 03:09:56.396512
Finishtime: 2019-12-12 03:09:56.397225

Finished training epoch 28

Finishtime: 2019-12-12 03:09:56.401664

[xla:7] Accuracy=36.13% [xla:6] Accuracy=35.05% [xla:5] Accuracy=34.25% [xla:4] Accuracy=35.61% [xla:2] Accuracy=34.59% [xla:0] Accuracy=35.73% [xla:3] Accuracy=35.54% [xla:1] Accuracy=35.50%

Finishtime: 2019-12-12 03:11:50.081123 Finishtime: 2019-12-12 03:11:50.082417 Finishtime: 2019-12-12 03:11:50.082749

Finished training epoch 29

Finishtime: 2019-12-12 03:11:50.082628 Finishtime: 2019-12-12 03:11:50.082336 Finishtime: 2019-12-12 03:11:50.082776 Finishtime: 2019-12-12 03:11:50.083255 Finishtime: 2019-12-12 03:11:50.084204

[xla:6] Accuracy=37.33% [xla:7] Accuracy=38.71% [xla:0] Accuracy=36.95% [xla:5] Accuracy=36.08% [xla:1] Accuracy=37.65% [xla:3] Accuracy=37.36% [xla:4] Accuracy=36.36% [xla:2] Accuracy=36.27%

Finishtime: 2019-12-12 03:13:43.790842 Finishtime: 2019-12-12 03:13:43.792368 Finishtime: 2019-12-12 03:13:43.792993 Finishtime: 2019-12-12 03:13:43.793058 Finishtime: 2019-12-12 03:13:43.793313 Finishtime: 2019-12-12 03:13:43.794132 Finishtime: 2019-12-12 03:13:43.794146

Finished training epoch 30

Finishtime: 2019-12-12 03:13:43.800784

[xla:6] Accuracy=35.93% [xla:2] Accuracy=34.96% [xla:5] Accuracy=35.61% [xla:7] Accuracy=36.39% [xla:3] Accuracy=36.34% [xla:4] Accuracy=36.99% [xla:0] Accuracy=35.52% [xla:1] Accuracy=36.48%

Finishtime: 2019-12-12 03:15:46.234875 Finishtime: 2019-12-12 03:15:46.235703 Finishtime: 2019-12-12 03:15:46.236095 Finishtime: 2019-12-12 03:15:46.236232

Finished training epoch 31

Finishtime: 2019-12-12 03:15:46.236157 Finishtime: 2019-12-12 03:15:46.237181 Finishtime: 2019-12-12 03:15:46.237358 Finishtime: 2019-12-12 03:15:46.238416

[xla:6] Accuracy=27.18% [xla:5] Accuracy=25.11% [xla:2] Accuracy=27.33% [xla:3] Accuracy=27.26% [xla:4] Accuracy=26.92% [xla:0] Accuracy=26.64% [xla:7] Accuracy=27.42% [xla:1] Accuracy=27.36%

Finishtime: 2019-12-12 03:17:41.064933 Finishtime: 2019-12-12 03:17:41.065235 Finishtime: 2019-12-12 03:17:41.065705

Finished training epoch 32

Finishtime: 2019-12-12 03:17:41.065424 Finishtime: 2019-12-12 03:17:41.066060 Finishtime: 2019-12-12 03:17:41.066190 Finishtime: 2019-12-12 03:17:41.065749 Finishtime: 2019-12-12 03:17:41.069377

[xla:7] Accuracy=34.46% [xla:1] Accuracy=34.23% [xla:0] Accuracy=34.74% [xla:3] Accuracy=34.77% [xla:5] Accuracy=35.70% [xla:6] Accuracy=34.68% [xla:4] Accuracy=35.21% [xla:2] Accuracy=34.83%

Finishtime: 2019-12-12 03:19:35.913292

Finished training epoch 33

Finishtime: 2019-12-12 03:19:35.913654
Finishtime: 2019-12-12 03:19:35.913197
Finishtime: 2019-12-12 03:19:35.91353
Finishtime: 2019-12-12 03:19:35.913176
Finishtime: 2019-12-12 03:19:35.914065
Finishtime: 2019-12-12 03:19:35.914942
Finishtime: 2019-12-12 03:19:35.914031

[xla:7] Accuracy=33.91%
[xla:6] Accuracy=34.15%
[xla:5] Accuracy=33.24%
[xla:0] Accuracy=34.32%
[xla:2] Accuracy=33.69%

[xla:3] Accuracy=35.09% [xla:1] Accuracy=35.55%

[xla:1] Accuracy=35.55% [xla:4] Accuracy=33.46%

Finishtime: 2019-12-12 03:21:30.552405

Finished training epoch 34

Finishtime: 2019-12-12 03:21:30.553443
Finishtime: 2019-12-12 03:21:30.553326
Finishtime: 2019-12-12 03:21:30.553454
Finishtime: 2019-12-12 03:21:30.554188
Finishtime: 2019-12-12 03:21:30.555088
Finishtime: 2019-12-12 03:21:30.555905
Finishtime: 2019-12-12 03:21:30.555905

[xla:7] Accuracy=28.03% [xla:0] Accuracy=28.49% [xla:4] Accuracy=27.09% [xla:3] Accuracy=27.34% [xla:6] Accuracy=26.79% [xla:5] Accuracy=28.39%

[xla:1] Accuracy=28.55% [xla:2] Accuracy=27.52%

Finishtime: 2019-12-12 03:23:25.085482 Finishtime: 2019-12-12 03:23:25.085643 Finishtime: 2019-12-12 03:23:25.086139 Finishtime: 2019-12-12 03:23:25.085842 Finishtime: 2019-12-12 03:23:25.086143

Finished training epoch 35

Finishtime: 2019-12-12 03:23:25.085478 Finishtime: 2019-12-12 03:23:25.086796 Finishtime: 2019-12-12 03:23:25.088602

[xla:6] Accuracy=28.30%
[xla:7] Accuracy=29.37%
[xla:3] Accuracy=29.85%
[xla:5] Accuracy=28.34%

```
[xla:2] Accuracy=27.37%
[xla:0] Accuracy=28.08%
[xla:1] Accuracy=29.41%
[xla:4] Accuracy=28.55%
Finishtime: 2019-12-12 03:25:19.564262
            2019-12-12 03:25:19.564013
Finishtime:
Finished training epoch 36
Finishtime: 2019-12-12 03:25:19.564977
Finishtime: 2019-12-12 03:25:19.566625
Finishtime: 2019-12-12 03:25:19.567587
Finishtime: 2019-12-12 03:25:19.567534
Finishtime: 2019-12-12 03:25:19.569256
Finishtime: 2019-12-12 03:25:19.570957
[xla:6] Accuracy=37.05%
[xla:7] Accuracy=38.07%
[xla:4] Accuracy=37.57%
[xla:0] Accuracy=38.47%
[xla:1] Accuracy=37.95%
[xla:3] Accuracy=37.66%
[xla:5] Accuracy=37.33%
[xla:2] Accuracy=37.93%
Finishtime: 2019-12-12 03:27:14.337001
Finishtime: 2019-12-12 03:27:14.337941
Finishtime: 2019-12-12 03:27:14.337837
Finished training epoch 37
Finishtime: 2019-12-12 03:27:14.338329
Finishtime: 2019-12-12 03:27:14.338398
Finishtime: 2019-12-12 03:27:14.338195
Finishtime: 2019-12-12 03:27:14.340203
Finishtime: 2019-12-12 03:27:14.338994
[xla:7] Accuracy=41.57%
[xla:3] Accuracy=41.75%
[xla:5] Accuracy=40.59%
[xla:6] Accuracy=41.38%
[xla:0] Accuracy=41.09%
[xla:1] Accuracy=41.02%
[xla:2] Accuracy=40.99%
[xla:4] Accuracy=41.09%
Finishtime: 2019-12-12 03:29:09.087776
Finishtime: 2019-12-12 03:29:09.088836
Finishtime: 2019-12-12 03:29:09.090294
Finishtime: 2019-12-12 03:29:09.089943
Finishtime: 2019-12-12 03:29:09.091061
Finished training epoch 38
Finishtime: 2019-12-12 03:29:09.090779
Finishtime: 2019-12-12 03:29:09.090332
```

Finishtime: 2019-12-12 03:29:09.092962

[xla:7] Accuracy=29.33%

```
[xla:3] Accuracy=28.80%
[xla:6] Accuracy=27.58%
[xla:5] Accuracy=28.36%
[xla:4] Accuracy=28.93%
[xla:0] Accuracy=28.41%
[xla:2] Accuracy=27.93%
[xla:1] Accuracy=28.94%
Finishtime: 2019-12-12 03:31:03.728313
Finishtime: 2019-12-12 03:31:03.729361
Finishtime: 2019-12-12 03:31:03.729560
Finishtime: 2019-12-12 03:31:03.729700
Finished training epoch 39
Finishtime: 2019-12-12 03:31:03.729882
Finishtime: 2019-12-12 03:31:03.729244
Finishtime: 2019-12-12 03:31:03.729721
Finishtime: 2019-12-12 03:31:03.732323
[xla:7] Accuracy=28.71%
[xla:6] Accuracy=28.24%
[xla:4] Accuracy=28.14%
[xla:1] Accuracy=29.34%
[xla:5] Accuracy=27.72%
[xla:2] Accuracy=29.32%
[xla:0] Accuracy=29.13%
[xla:3] Accuracy=28.63%
Finishtime: 2019-12-12 03:32:58.406579
Finishtime: 2019-12-12 03:32:58.406543
Finishtime: 2019-12-12 03:32:58.406543
Finishtime: 2019-12-12 03:32:58.407050
Finished training epoch 40
Finishtime: 2019-12-12 03:32:58.406908
Finishtime: 2019-12-12 03:32:58.407336
Finishtime: 2019-12-12 03:32:58.407732
Finishtime: 2019-12-12 03:32:58.409187
[xla:7] Accuracy=34.44%
[xla:3] Accuracy=34.25%
[xla:5] Accuracy=33.25%
[xla:6] Accuracy=32.79%
[xla:4] Accuracy=33.89%
[xla:0] Accuracy=33.94%
[xla:2] Accuracy=34.37%
[xla:1] Accuracy=34.52%
Finishtime: 2019-12-12 03:35:00.796280
Finishtime: 2019-12-12 03:35:00.797399
Finishtime: 2019-12-12 03:35:00.797120
Finished training epoch 41
Finishtime: 2019-12-12 03:35:00.797453
Finishtime: 2019-12-12 03:35:00.797620
```

Finishtime: 2019-12-12 03:35:00.799748

Finishtime: 2019-12-12 03:35:00.800419 Finishtime: 2019-12-12 03:35:00.799915 [xla:6] Accuracy=34.61% [xla:7] Accuracy=34.97% [xla:4] Accuracy=35.00% [xla:5] Accuracy=33.08% [xla:0] Accuracy=33.45% [xla:2] Accuracy=33.03% [xla:3] Accuracy=34.81% [xla:1] Accuracy=35.08% Finishtime: 2019-12-12 03:36:55.155899 Finished training epoch 42 Finishtime: 2019-12-12 03:36:55.156492 Finishtime: 2019-12-12 03:36:55.156642 Finishtime: 2019-12-12 03:36:55.156873 Finishtime: 2019-12-12 03:36:55.157704 Finishtime: 2019-12-12 03:36:55.157469 Finishtime: 2019-12-12 03:36:55.157472 Finishtime: 2019-12-12 03:36:55.158769 [xla:7] Accuracy=37.27% [xla:3] Accuracy=37.96% [xla:5] Accuracy=36.67% [xla:1] Accuracy=36.41% [xla:6] Accuracy=37.36% [xla:0] Accuracy=36.18% [xla:4] Accuracy=37.38% [xla:2] Accuracy=36.20% Finishtime: 2019-12-12 03:38:49.516117 Finishtime: 2019-12-12 03:38:49.517224 Finishtime: 2019-12-12 03:38:49.517369 Finishtime: 2019-12-12 03:38:49.518063 Finishtime: 2019-12-12 03:38:49.517434 Finished training epoch 43 Finishtime: 2019-12-12 03:38:49.518643 Finishtime: 2019-12-12 03:38:49.518342 Finishtime: 2019-12-12 03:38:49.519819 [xla:6] Accuracy=15.66% [xla:7] Accuracy=15.31% [xla:2] Accuracy=15.95% [xla:3] Accuracy=15.64% [xla:5] Accuracy=16.34% [xla:1] Accuracy=15.45% [xla:4] Accuracy=16.00% [xla:0] Accuracy=15.73% Finishtime: 2019-12-12 03:40:44.159081 Finishtime: 2019-12-12 03:40:44.159593

Finishtime: 2019-12-12 03:40:44.158954 Finishtime: 2019-12-12 03:40:44.159230 Finished training epoch 44 Finishtime: 2019-12-12 03:40:44.159809 Finishtime: 2019-12-12 03:40:44.159908 Finishtime: 2019-12-12 03:40:44.160088 Finishtime: 2019-12-12 03:40:44.162229 [xla:4] Accuracy=23.47% [xla:6] Accuracy=23.85% [xla:0] Accuracy=24.29% [xla:7] Accuracy=23.71% [xla:3] Accuracy=23.62% [xla:5] Accuracy=22.57% [xla:1] Accuracy=23.81% [xla:2] Accuracy=23.29% Finishtime: 2019-12-12 03:42:38.700244 2019-12-12 03:42:38.701770 Finishtime: Finishtime: 2019-12-12 03:42:38.702132 Finishtime: 2019-12-12 03:42:38.701934 Finishtime: 2019-12-12 03:42:38.702382 Finishtime: 2019-12-12 03:42:38.702984 Finished training epoch 45 Finishtime: 2019-12-12 03:42:38.703135 Finishtime: 2019-12-12 03:42:38.705650 [xla:4] Accuracy=30.33% [xla:0] Accuracy=28.95% [xla:6] Accuracy=30.08% [xla:3] Accuracy=30.00% [xla:5] Accuracy=28.79% [xla:1] Accuracy=30.89% [xla:2] Accuracy=30.07% [xla:7] Accuracy=30.45% Finishtime: 2019-12-12 03:44:32.800146 Finishtime: 2019-12-12 03:44:32.803785 Finishtime: 2019-12-12 03:44:32.803799 Finishtime: 2019-12-12 03:44:32.804663 Finishtime: 2019-12-12 03:44:32.804654 Finishtime: 2019-12-12 03:44:32.805368 Finishtime: 2019-12-12 03:44:32.805234 Finished training epoch 46 Finishtime: 2019-12-12 03:44:32.807906 [xla:6] Accuracy=38.55% [xla:0] Accuracy=37.89% [xla:1] Accuracy=37.36% [xla:7] Accuracy=37.77% [xla:4] Accuracy=38.82% [xla:3] Accuracy=38.37% [xla:2] Accuracy=37.43% [xla:5] Accuracy=38.29%

Finished training epoch 47

Finishtime: 2019-12-12 03:46:27.395389 Finishtime: 2019-12-12 03:46:27.396246 Finishtime: 2019-12-12 03:46:27.395346 Finishtime: 2019-12-12 03:46:27.396199 Finishtime: 2019-12-12 03:46:27.396159 Finishtime: 2019-12-12 03:46:27.396515 Finishtime: 2019-12-12 03:46:27.398358 Finishtime: 2019-12-12 03:46:27.399842 [xla:4] Accuracy=18.46% [xla:0] Accuracy=18.21% [xla:5] Accuracy=17.90% [xla:3] Accuracy=18.35% [xla:2] Accuracy=17.27% [xla:1] Accuracy=17.36% [xla:6] Accuracy=18.39% [xla:7] Accuracy=17.89% Finishtime: 2019-12-12 03:48:21.795549 Finished training epoch 48 Finishtime: 2019-12-12 03:48:21.795561 Finishtime: 2019-12-12 03:48:21.795544 Finishtime: 2019-12-12 03:48:21.795762 Finishtime: 2019-12-12 03:48:21.795828 Finishtime: 2019-12-12 03:48:21.796439 Finishtime: 2019-12-12 03:48:21.798243 Finishtime: 2019-12-12 03:48:21.797869 [xla:3] Accuracy=23.09% [xla:1] Accuracy=21.58% [xla:7] Accuracy=22.82% [xla:4] Accuracy=22.75% [xla:5] Accuracy=21.54% [xla:0] Accuracy=20.05% [xla:2] Accuracy=21.29% [xla:6] Accuracy=22.45% Finishtime: 2019-12-12 03:50:16.321474 Finishtime: 2019-12-12 03:50:16.322966 Finishtime: 2019-12-12 03:50:16.323594 Finishtime: 2019-12-12 03:50:16.324733 Finishtime: 2019-12-12 03:50:16.323003 Finishtime: 2019-12-12 03:50:16.324762 Finishtime: 2019-12-12 03:50:16.327420 Finished training epoch 49 Finishtime: 2019-12-12 03:50:16.329856 [xla:4] Accuracy=36.53% [xla:5] Accuracy=37.09% [xla:7] Accuracy=37.92% [xla:0] Accuracy=37.18% [xla:1] Accuracy=37.76%

[xla:3] Accuracy=37.05%

[xla:6] Accuracy=35.97% [xla:2] Accuracy=36.97%

Finishtime: 2019-12-12 03:52:10.314410 Finishtime: 2019-12-12 03:52:10.315203 Finishtime: 2019-12-12 03:52:10.315429

Finished training epoch 50

Finishtime: 2019-12-12 03:52:10.315534 Finishtime: 2019-12-12 03:52:10.315506 Finishtime: 2019-12-12 03:52:10.316251 Finishtime: 2019-12-12 03:52:10.317495 Finishtime: 2019-12-12 03:52:10.316646

[xla:6] Accuracy=39.30%
[xla:7] Accuracy=39.33%
[xla:3] Accuracy=38.92%
[xla:4] Accuracy=38.75%
[xla:2] Accuracy=39.18%
[xla:1] Accuracy=39.39%
[xla:5] Accuracy=38.32%
[xla:0] Accuracy=38.66%

Finishtime: 2019-12-12 03:54:11.779604 Finishtime: 2019-12-12 03:54:11.780206 Finishtime: 2019-12-12 03:54:11.780461 Finishtime: 2019-12-12 03:54:11.780119 Finishtime: 2019-12-12 03:54:11.779806 Finishtime: 2019-12-12 03:54:11.779642 Finishtime: 2019-12-12 03:54:11.780217

Finished training epoch 51

Finishtime: 2019-12-12 03:54:11.783483

[xla:7] Accuracy=22.81% [xla:0] Accuracy=22.73% [xla:4] Accuracy=21.48% [xla:1] Accuracy=22.40% [xla:6] Accuracy=21.54% [xla:5] Accuracy=20.75% [xla:2] Accuracy=21.43% [xla:3] Accuracy=22.60%

Finishtime: 2019-12-12 03:56:04.973588 Finishtime: 2019-12-12 03:56:04.973458 Finishtime: 2019-12-12 03:56:04.973817

Finished training epoch 52

Finishtime: 2019-12-12 03:56:04.974877 Finishtime: 2019-12-12 03:56:04.976924 Finishtime: 2019-12-12 03:56:04.978792 Finishtime: 2019-12-12 03:56:04.979389 Finishtime: 2019-12-12 03:56:04.975875

[xla:0] Accuracy=27.20%
[xla:5] Accuracy=26.99%
[xla:3] Accuracy=26.44%

```
[xla:7] Accuracy=25.62%
[xla:6] Accuracy=27.93%
[xla:4] Accuracy=28.07%
[xla:2] Accuracy=28.50%
[xla:1] Accuracy=25.92%
Finishtime: 2019-12-12 03:57:58.745745
Finishtime: 2019-12-12 03:57:58.747407
Finishtime: 2019-12-12 03:57:58.747953
Finishtime: 2019-12-12 03:57:58.747884
Finishtime: 2019-12-12 03:57:58.749030
Finished training epoch 53
Finishtime: 2019-12-12 03:57:58.749496
Finishtime: 2019-12-12 03:57:58.751393
Finishtime: 2019-12-12 03:57:58.751180
[xla:7] Accuracy=13.63%
[xla:3] Accuracy=13.46%
[xla:6] Accuracy=13.21%
[xla:2] Accuracy=12.66%
[xla:4] Accuracy=12.69%
[xla:1] Accuracy=12.80%
[xla:5] Accuracy=12.97%
[xla:0] Accuracy=12.68%
Finishtime: 2019-12-12 03:59:52.132005
Finishtime: 2019-12-12 03:59:52.132015
Finished training epoch 54
Finishtime: 2019-12-12 03:59:52.132789
Finishtime: 2019-12-12 03:59:52.133090
Finishtime: 2019-12-12 03:59:52.133380
Finishtime: 2019-12-12 03:59:52.134531
Finishtime: 2019-12-12 03:59:52.133241
Finishtime: 2019-12-12 03:59:52.133163
[xla:6] Accuracy=24.00%
[xla:4] Accuracy=23.88%
[xla:7] Accuracy=22.37%
[xla:3] Accuracy=23.82%
[xla:2] Accuracy=23.72%
[xla:5] Accuracy=22.39%
[xla:1] Accuracy=21.80%
[xla:0] Accuracy=24.00%
Finishtime: 2019-12-12 04:01:45.356746
Finishtime: 2019-12-12 04:01:45.356906
Finished training epoch 55
Finishtime: 2019-12-12 04:01:45.357630
Finishtime: 2019-12-12 04:01:45.357926
Finishtime: 2019-12-12 04:01:45.357279
Finishtime: 2019-12-12 04:01:45.357482
Finishtime: 2019-12-12 04:01:45.358478
```

Finishtime: 2019-12-12 04:01:45.359779

```
[xla:5] Accuracy=30.63%
[xla:4] Accuracy=30.85%
[xla:3] Accuracy=31.09%
[xla:6] Accuracy=29.94%
[xla:7] Accuracy=31.32%
[xla:0] Accuracy=30.90%
[xla:2] Accuracy=30.69%
[xla:1] Accuracy=31.06%
Finishtime: 2019-12-12 04:03:38.227948
Finishtime:
            2019-12-12 04:03:38.228795
Finishtime: 2019-12-12 04:03:38.229199
Finished training epoch 56
Finishtime: 2019-12-12 04:03:38.229345
            2019-12-12 04:03:38.229242
Finishtime:
Finishtime:
            2019-12-12 04:03:38.229645
Finishtime: 2019-12-12 04:03:38.229933
Finishtime: 2019-12-12 04:03:38.230938
[xla:7] Accuracy=31.31%
[xla:6] Accuracy=31.14%
[xla:5] Accuracy=30.57%
[xla:2] Accuracy=29.61%
[xla:0] Accuracy=30.29%
[xla:4] Accuracy=31.11%
[xla:1] Accuracy=29.92%
[xla:3] Accuracy=31.46%
Finishtime: 2019-12-12 04:05:31.443925
Finishtime:
            2019-12-12 04:05:31.443734
Finishtime: 2019-12-12 04:05:31.445186
Finishtime:
            2019-12-12 04:05:31.445063
Finishtime: 2019-12-12 04:05:31.445009
Finishtime:
            2019-12-12 04:05:31.445395
Finishtime: 2019-12-12 04:05:31.446025
Finished training epoch 57
Finishtime: 2019-12-12 04:05:31.448772
[xla:7] Accuracy=38.23%
[xla:3] Accuracy=38.50%
[xla:5] Accuracy=39.79%
[xla:4] Accuracy=37.41%
[xla:6] Accuracy=37.89%
[xla:2] Accuracy=37.95%
[xla:1] Accuracy=37.99%
[xla:0] Accuracy=37.60%
Finishtime:
            2019-12-12 04:07:24.047361
Finishtime: 2019-12-12 04:07:24.047494
Finishtime:
            2019-12-12 04:07:24.048069
Finishtime: 2019-12-12 04:07:24.048549
```

Finishtime: 2019-12-12 04:07:24.048198

Finished training epoch 58

Finishtime: 2019-12-12 04:07:24.048727 Finishtime: 2019-12-12 04:07:24.050146 Finishtime: 2019-12-12 04:07:24.051486 [xla:6] Accuracy=30.16% [xla:5] Accuracy=30.52% [xla:2] Accuracy=30.12% [xla:4] Accuracy=30.84% [xla:7] Accuracy=31.76% [xla:3] Accuracy=31.50% [xla:0] Accuracy=30.45% [xla:1] Accuracy=30.85% Finishtime: 2019-12-12 04:09:16.989205 Finishtime: 2019-12-12 04:09:16.989647 Finishtime: 2019-12-12 04:09:16.990772 Finishtime: 2019-12-12 04:09:16.991590 Finishtime: 2019-12-12 04:09:16.991152 Finishtime: 2019-12-12 04:09:16.991579 Finished training epoch 59 Finishtime: 2019-12-12 04:09:16.992813 Finishtime: 2019-12-12 04:09:16.994587 [xla:6] Accuracy=24.65% [xla:0] Accuracy=25.13% [xla:3] Accuracy=25.44% [xla:5] Accuracy=24.73% [xla:4] Accuracy=24.40% [xla:2] Accuracy=25.47% [xla:7] Accuracy=25.40% [xla:1] Accuracy=25.66% Finishtime: 2019-12-12 04:11:09.781474 Finishtime: 2019-12-12 04:11:09.782545 Finishtime: 2019-12-12 04:11:09.784244 Finished training epoch 60 Finishtime: 2019-12-12 04:11:09.784226 Finishtime: 2019-12-12 04:11:09.785315 Finishtime: 2019-12-12 04:11:09.784923 Finishtime: 2019-12-12 04:11:09.784134 Finishtime: 2019-12-12 04:11:09.786627 [xla:4] Accuracy=28.95% [xla:6] Accuracy=30.08% [xla:5] Accuracy=28.45% [xla:3] Accuracy=28.82% [xla:7] Accuracy=27.79% [xla:1] Accuracy=29.81% [xla:2] Accuracy=30.16% [xla:0] Accuracy=29.74% Finishtime: 2019-12-12 04:13:09.941488

Finishtime: 2019-12-12 04:13:09.941962 Finishtime: 2019-12-12 04:13:09.941881

30

Finishtime: 2019-12-12 04:13:09.942526

Finishtime: 2019-12-12 04:13:09.943396

Finishtime: 2019-12-12 04:13:09.943509 Finishtime: 2019-12-12 04:13:09.945691

Finished training epoch 61

Finishtime: 2019-12-12 04:13:09.949166

[xla:6] Accuracy=49.80%

[xla:5] Accuracy=50.33%

[xla:0] Accuracy=49.77%

[xla:3] Accuracy=49.98%

[xla:4] Accuracy=49.93%

[xla:1] Accuracy=50.19%

[xla:2] Accuracy=49.82%

[xla:7] Accuracy=50.02%

Finishtime: 2019-12-12 04:15:02.455555

Finishtime: 2019-12-12 04:15:02.455957 Finishtime: 2019-12-12 04:15:02.456219

Finishtime: 2019-12-12 04:15:02.457128

Finishtime: 2019-12-12 04:15:02.457412 Finishtime: 2019-12-12 04:15:02.457877

Finishtime: 2019-12-12 04:15:02.458414

Finished training epoch 62

Finishtime: 2019-12-12 04:15:02.460491

[xla:7] Accuracy=47.31%

[xla:4] Accuracy=47.76%

[xla:6] Accuracy=46.74%

[xla:5] Accuracy=47.81%

[xla:3] Accuracy=47.45%

[xla:2] Accuracy=46.56%

[xla:0] Accuracy=47.23%

[xla:1] Accuracy=47.04%

Finishtime: 2019-12-12 04:16:55.532207

Finished training epoch 63

Finishtime: 2019-12-12 04:16:55.533092

Finishtime: 2019-12-12 04:16:55.533172 Finishtime: 2019-12-12 04:16:55.533587

Finishtime: 2019-12-12 04:16:55.533566 Finishtime: 2019-12-12 04:16:55.534367

Finishtime: 2019-12-12 04:16:55.533997

Finishtime: 2019-12-12 04:16:55.534183

[xla:7] Accuracy=48.68%

[xla:4] Accuracy=49.59%

[xla:3] Accuracy=49.01%

[xla:5] Accuracy=49.47%

[xla:6] Accuracy=48.95%

[xla:0] Accuracy=49.20%

[xla:1] Accuracy=48.53%

[xla:2] Accuracy=49.62%

Finishtime: 2019-12-12 04:18:48.651210 Finishtime: 2019-12-12 04:18:48.652032 Finishtime: 2019-12-12 04:18:48.651659 Finishtime: 2019-12-12 04:18:48.652524 Finishtime: 2019-12-12 04:18:48.652906 Finishtime: 2019-12-12 04:18:48.653364 Finished training epoch 64 Finishtime: 2019-12-12 04:18:48.653383 Finishtime: 2019-12-12 04:18:48.655871 [xla:7] Accuracy=50.99% [xla:5] Accuracy=50.06% [xla:0] Accuracy=50.07% [xla:6] Accuracy=50.47% [xla:4] Accuracy=50.96% [xla:1] Accuracy=50.43% [xla:3] Accuracy=50.53% [xla:2] Accuracy=49.98% Finishtime: 2019-12-12 04:20:41.628582 Finishtime: 2019-12-12 04:20:41.628546 Finished training epoch 65 Finishtime: 2019-12-12 04:20:41.628737 Finishtime: 2019-12-12 04:20:41.629329 Finishtime: 2019-12-12 04:20:41.629236 Finishtime: 2019-12-12 04:20:41.629583 Finishtime: 2019-12-12 04:20:41.629983 Finishtime: 2019-12-12 04:20:41.630613 [xla:5] Accuracy=47.54% [xla:2] Accuracy=49.05% [xla:7] Accuracy=47.66% [xla:4] Accuracy=49.27% [xla:3] Accuracy=48.58% [xla:6] Accuracy=49.10% [xla:0] Accuracy=48.53% [xla:1] Accuracy=47.86% Finishtime: 2019-12-12 04:22:34.709384 Finishtime: 2019-12-12 04:22:34.710287 Finishtime: 2019-12-12 04:22:34.710587 Finishtime: 2019-12-12 04:22:34.710526 Finishtime: 2019-12-12 04:22:34.711203 Finishtime: 2019-12-12 04:22:34.711260 Finished training epoch 66 Finishtime: 2019-12-12 04:22:34.712327

Finishtime: 2019-12-12 04:22:34.713695

[xla:7] Accuracy=39.47% [xla:3] Accuracy=39.83% [xla:0] Accuracy=39.68% [xla:4] Accuracy=40.09% [xla:5] Accuracy=38.45%

[xla:6] Accuracy=40.60% [xla:2] Accuracy=39.33% [xla:1] Accuracy=39.06% Finishtime: 2019-12-12

Finishtime: 2019-12-12 04:24:27.903035 Finishtime: 2019-12-12 04:24:27.903046 Finishtime: 2019-12-12 04:24:27.903822

Finished training epoch 67

Finishtime: 2019-12-12 04:24:27.904120 Finishtime: 2019-12-12 04:24:27.904564 Finishtime: 2019-12-12 04:24:27.906363 Finishtime: 2019-12-12 04:24:27.907140 Finishtime: 2019-12-12 04:24:27.907202

[xla:7] Accuracy=45.52% [xla:6] Accuracy=46.40% [xla:5] Accuracy=44.81% [xla:2] Accuracy=45.61% [xla:3] Accuracy=45.88% [xla:0] Accuracy=45.61% [xla:1] Accuracy=46.54% [xla:4] Accuracy=45.30%

Finishtime: 2019-12-12 04:26:21.042829
Finishtime: 2019-12-12 04:26:21.042776
Finishtime: 2019-12-12 04:26:21.043010
Finishtime: 2019-12-12 04:26:21.044115
Finishtime: 2019-12-12 04:26:21.044201
Finishtime: 2019-12-12 04:26:21.043822
Finishtime: 2019-12-12 04:26:21.044525

Finished training epoch 68

Finishtime: 2019-12-12 04:26:21.047809

[xla:6] Accuracy=52.63% [xla:5] Accuracy=52.44% [xla:2] Accuracy=52.85% [xla:4] Accuracy=52.40% [xla:3] Accuracy=52.50% [xla:7] Accuracy=52.97% [xla:0] Accuracy=52.82% [xla:1] Accuracy=53.03%

Finishtime: 2019-12-12 04:28:14.012854 Finishtime: 2019-12-12 04:28:14.013866

Finished training epoch 69

Finishtime: 2019-12-12 04:28:14.014095 Finishtime: 2019-12-12 04:28:14.014048 Finishtime: 2019-12-12 04:28:14.014606 Finishtime: 2019-12-12 04:28:14.014976 Finishtime: 2019-12-12 04:28:14.014669 Finishtime: 2019-12-12 04:28:14.016020

[xla:6] Accuracy=47.99% [xla:5] Accuracy=46.25%

```
[xla:4] Accuracy=47.04%
[xla:3] Accuracy=47.94%
[xla:2] Accuracy=47.61%
[xla:0] Accuracy=47.99%
[xla:1] Accuracy=47.92%
[xla:7] Accuracy=47.88%
Finishtime: 2019-12-12 04:30:06.526920
Finishtime: 2019-12-12 04:30:06.527647
Finishtime: 2019-12-12 04:30:06.527990
Finishtime: 2019-12-12 04:30:06.527974
Finished training epoch 70
Finishtime: 2019-12-12 04:30:06.528686
Finishtime: 2019-12-12 04:30:06.529247
Finishtime: 2019-12-12 04:30:06.528955
Finishtime: 2019-12-12 04:30:06.530674
[xla:4] Accuracy=44.49%
[xla:0] Accuracy=44.83%
[xla:3] Accuracy=45.07%
[xla:5] Accuracy=44.78%
[xla:2] Accuracy=45.11%
[xla:7] Accuracy=44.86%
[xla:1] Accuracy=45.01%
[xla:6] Accuracy=45.00%
Finishtime: 2019-12-12 04:32:06.984386
Finishtime: 2019-12-12 04:32:06.985364
Finishtime: 2019-12-12 04:32:06.986049
Finishtime: 2019-12-12 04:32:06.986081
Finished training epoch 71
Finishtime: 2019-12-12 04:32:06.985904
Finishtime: 2019-12-12 04:32:06.986824
Finishtime: 2019-12-12 04:32:06.987148
Finishtime: 2019-12-12 04:32:06.990331
[xla:6] Accuracy=40.90%
[xla:7] Accuracy=40.52%
[xla:5] Accuracy=40.37%
[xla:3] Accuracy=40.22%
[xla:1] Accuracy=40.45%
[xla:4] Accuracy=40.23%
[xla:2] Accuracy=41.01%
[xla:0] Accuracy=41.13%
Finishtime: 2019-12-12 04:33:59.290519
Finishtime:
            2019-12-12 04:33:59.291221
Finishtime:
            2019-12-12 04:33:59.291707
Finishtime: 2019-12-12 04:33:59.291459
Finishtime:
            2019-12-12 04:33:59.292011
Finishtime: 2019-12-12 04:33:59.292019
Finishtime: 2019-12-12 04:33:59.292716
```

Finished training epoch 72

```
Finishtime: 2019-12-12 04:33:59.295914
[xla:7] Accuracy=47.22%
[xla:5] Accuracy=46.60%
[xla:6] Accuracy=47.45%
[xla:2] Accuracy=48.19%
[xla:0] Accuracy=47.53%
[xla:3] Accuracy=47.15%
[xla:1] Accuracy=48.17%
[xla:4] Accuracy=48.01%
Finishtime: 2019-12-12 04:35:51.876195
Finishtime: 2019-12-12 04:35:51.878214
Finished training epoch 73
Finishtime: 2019-12-12 04:35:51.878369
Finishtime: 2019-12-12 04:35:51.877951
Finishtime: 2019-12-12 04:35:51.880344
Finishtime: 2019-12-12 04:35:51.880054
Finishtime: 2019-12-12 04:35:51.880388
Finishtime: 2019-12-12 04:35:51.880201
[xla:6] Accuracy=51.54%
[xla:4] Accuracy=51.78%
[xla:3] Accuracy=51.46%
[xla:5] Accuracy=51.88%
[xla:7] Accuracy=51.37%
[xla:0] Accuracy=52.31%
[xla:1] Accuracy=51.92%
[xla:2] Accuracy=51.95%
Finishtime: 2019-12-12 04:37:44.853862
Finishtime: 2019-12-12 04:37:44.855169
Finishtime: 2019-12-12 04:37:44.855336
Finishtime: 2019-12-12 04:37:44.855003
Finishtime: 2019-12-12 04:37:44.855398
Finished training epoch 74
Finishtime: 2019-12-12 04:37:44.856228
Finishtime: 2019-12-12 04:37:44.856298
Finishtime: 2019-12-12 04:37:44.858127
[xla:6] Accuracy=50.28%
[xla:3] Accuracy=50.41%
[xla:5] Accuracy=50.19%
[xla:7] Accuracy=49.75%
[xla:4] Accuracy=50.16%
[xla:0] Accuracy=49.71%
[xla:1] Accuracy=50.43%
[xla:2] Accuracy=50.01%
Finishtime: 2019-12-12 04:39:37.811993
Finishtime:
            2019-12-12 04:39:37.812421
Finishtime: 2019-12-12 04:39:37.813223
Finishtime: 2019-12-12 04:39:37.812891
```

Finishtime: 2019-12-12 04:39:37.813389

Finishtime: 2019-12-12 04:39:37.813299

Finished training epoch 75

Finishtime: 2019-12-12 04:39:37.813461 Finishtime: 2019-12-12 04:39:37.815523

[xla:6] Accuracy=49.69% [xla:3] Accuracy=50.23% [xla:2] Accuracy=48.65% [xla:7] Accuracy=49.44% [xla:1] Accuracy=49.79%

[xla:5] Accuracy=48.84%

[xla:0] Accuracy=49.38% [xla:4] Accuracy=49.29%

Finished training epoch 76

Finishtime: 2019-12-12 04:41:30.820783
Finishtime: 2019-12-12 04:41:30.821483
Finishtime: 2019-12-12 04:41:30.822916
Finishtime: 2019-12-12 04:41:30.822079
Finishtime: 2019-12-12 04:41:30.822001
Finishtime: 2019-12-12 04:41:30.823556
Finishtime: 2019-12-12 04:41:30.823599
Finishtime: 2019-12-12 04:41:30.823410

[xla:7] Accuracy=47.46% [xla:6] Accuracy=47.29% [xla:2] Accuracy=46.49% [xla:3] Accuracy=47.56% [xla:4] Accuracy=46.12% [xla:5] Accuracy=46.80% [xla:0] Accuracy=46.18% [xla:1] Accuracy=46.04%

Finishtime: 2019-12-12 04:43:23.671552
Finishtime: 2019-12-12 04:43:23.671428
Finishtime: 2019-12-12 04:43:23.671902
Finishtime: 2019-12-12 04:43:23.671931
Finishtime: 2019-12-12 04:43:23.672124
Finishtime: 2019-12-12 04:43:23.672073
Finishtime: 2019-12-12 04:43:23.672552

Finished training epoch 77

Finishtime: 2019-12-12 04:43:23.675310

[xla:6] Accuracy=50.55% [xla:7] Accuracy=50.02% [xla:5] Accuracy=50.19% [xla:1] Accuracy=48.89% [xla:3] Accuracy=50.28% [xla:4] Accuracy=50.55% [xla:2] Accuracy=50.89%

[xla:0] Accuracy=51.42%

Finishtime: 2019-12-12 04:45:16.297578 Finishtime: 2019-12-12 04:45:16.298057 Finishtime: 2019-12-12 04:45:16.298412 Finishtime: 2019-12-12 04:45:16.298028

Finished training epoch 78

Finishtime: 2019-12-12 04:45:16.298778 Finishtime: 2019-12-12 04:45:16.300545 Finishtime: 2019-12-12 04:45:16.300927 Finishtime: 2019-12-12 04:45:16.302528

[xla:6] Accuracy=52.42% [xla:2] Accuracy=52.84% [xla:0] Accuracy=52.58% [xla:3] Accuracy=52.79% [xla:5] Accuracy=51.76% [xla:7] Accuracy=52.66% [xla:1] Accuracy=51.90%

[xla:4] Accuracy=52.42%

Finishtime: 2019-12-12 04:47:08.665843 Finishtime: 2019-12-12 04:47:08.665471 Finishtime: 2019-12-12 04:47:08.666375 Finishtime: 2019-12-12 04:47:08.666559 Finishtime: 2019-12-12 04:47:08.666148 Finishtime: 2019-12-12 04:47:08.666646

Finished training epoch 79

Finishtime: 2019-12-12 04:47:08.666931 Finishtime: 2019-12-12 04:47:08.669118

[xla:7] Accuracy=46.25% [xla:6] Accuracy=48.14% [xla:1] Accuracy=46.84% [xla:0] Accuracy=47.63% [xla:4] Accuracy=48.29% [xla:5] Accuracy=46.78% [xla:3] Accuracy=47.69% [xla:2] Accuracy=47.85%

Finishtime: 2019-12-12 04:49:00.966693 Finishtime: 2019-12-12 04:49:00.967111 Finishtime: 2019-12-12 04:49:00.967798 Finishtime: 2019-12-12 04:49:00.969013

Finished training epoch 80

Finishtime: 2019-12-12 04:49:00.968187 Finishtime: 2019-12-12 04:49:00.968484 Finishtime: 2019-12-12 04:49:00.968491 Finishtime: 2019-12-12 04:49:00.971214

[xla:6] Accuracy=53.78% [xla:7] Accuracy=53.06% [xla:5] Accuracy=53.23% [xla:4] Accuracy=53.62% [xla:3] Accuracy=53.27% [xla:1] Accuracy=53.03% [xla:2] Accuracy=53.45%

```
[xla:0] Accuracy=53.31%
Finished training epoch 81
Finishtime: 2019-12-12 04:51:01.287875
Finishtime: 2019-12-12 04:51:01.288127
Finishtime: 2019-12-12 04:51:01.288534
Finishtime: 2019-12-12 04:51:01.288404
Finishtime: 2019-12-12 04:51:01.288240
Finishtime: 2019-12-12 04:51:01.288686
Finishtime: 2019-12-12 04:51:01.287895
Finishtime: 2019-12-12 04:51:01.289470
[xla:6] Accuracy=49.63%
[xla:4] Accuracy=49.65%
[xla:7] Accuracy=50.32%
[xla:3] Accuracy=50.24%
[xla:0] Accuracy=48.60%
[xla:2] Accuracy=48.94%
[xla:5] Accuracy=49.91%
[xla:1] Accuracy=49.20%
Finishtime: 2019-12-12 04:52:53.456682
Finishtime: 2019-12-12 04:52:53.456076
Finished training epoch 82
Finishtime: 2019-12-12 04:52:53.456596
Finishtime: 2019-12-12 04:52:53.456828
Finishtime: 2019-12-12 04:52:53.456725
Finishtime: 2019-12-12 04:52:53.458439
Finishtime: 2019-12-12 04:52:53.459801
Finishtime: 2019-12-12 04:52:53.460808
[xla:4] Accuracy=49.33%
[xla:6] Accuracy=49.15%
[xla:7] Accuracy=50.79%
[xla:0] Accuracy=49.29%
[xla:3] Accuracy=49.21%
[xla:5] Accuracy=48.41%
[xla:1] Accuracy=50.08%
[xla:2] Accuracy=49.74%
Finishtime: 2019-12-12 04:54:45.941458
Finishtime: 2019-12-12 04:54:45.943225
Finishtime: 2019-12-12 04:54:45.942818
Finishtime: 2019-12-12 04:54:45.943070
Finishtime: 2019-12-12 04:54:45.943101
Finishtime: 2019-12-12 04:54:45.944159
Finishtime: 2019-12-12 04:54:45.943865
Finished training epoch 83
Finishtime: 2019-12-12 04:54:45.947026
[xla:6] Accuracy=43.79%
[xla:3] Accuracy=43.34%
[xla:5] Accuracy=42.54%
[xla:0] Accuracy=44.31%
```

```
[xla:4] Accuracy=43.59%
[xla:7] Accuracy=44.02%
[xla:2] Accuracy=44.02%
[xla:1] Accuracy=42.38%
Finished training epoch 84
Finishtime: 2019-12-12 04:56:37.991794
Finishtime: 2019-12-12 04:56:37.991992
Finishtime: 2019-12-12 04:56:37.991717
Finishtime: 2019-12-12 04:56:37.992778
Finishtime: 2019-12-12 04:56:37.992396
Finishtime: 2019-12-12 04:56:37.992120
Finishtime: 2019-12-12 04:56:37.992875
Finishtime: 2019-12-12 04:56:37.994154
[xla:3] Accuracy=47.45%
[xla:4] Accuracy=47.51%
[xla:5] Accuracy=47.82%
[xla:6] Accuracy=47.90%
[xla:7] Accuracy=47.98%
[xla:1] Accuracy=48.16%
[xla:2] Accuracy=47.85%
[xla:0] Accuracy=48.90%
Finishtime: 2019-12-12 04:58:29.748631
Finishtime: 2019-12-12 04:58:29.748277
Finishtime: 2019-12-12 04:58:29.749656
Finishtime: 2019-12-12 04:58:29.749378
Finishtime: 2019-12-12 04:58:29.749317
Finished training epoch 85
Finishtime: 2019-12-12 04:58:29.749349
Finishtime: 2019-12-12 04:58:29.749539
Finishtime: 2019-12-12 04:58:29.752458
[xla:6] Accuracy=45.48%
[xla:4] Accuracy=45.43%
[xla:5] Accuracy=44.42%
[xla:3] Accuracy=44.62%
[xla:1] Accuracy=43.10%
[xla:2] Accuracy=43.89%
[xla:0] Accuracy=44.32%
[xla:7] Accuracy=44.62%
Finishtime: 2019-12-12 05:00:21.789940
Finishtime: 2019-12-12 05:00:21.789988
Finished training epoch 86
Finishtime: 2019-12-12 05:00:21.789716
Finishtime: 2019-12-12 05:00:21.790650
Finishtime: 2019-12-12 05:00:21.792054
Finishtime: 2019-12-12 05:00:21.791519
Finishtime: 2019-12-12 05:00:21.791055
Finishtime: 2019-12-12 05:00:21.792650
```

[xla:6] Accuracy=53.05%

```
[xla:7] Accuracy=53.56%
[xla:2] Accuracy=53.15%
[xla:1] Accuracy=53.02%
[xla:5] Accuracy=52.69%
[xla:0] Accuracy=53.08%
[xla:4] Accuracy=53.10%
[xla:3] Accuracy=52.97%
Finishtime: 2019-12-12 05:02:14.395628
Finishtime:
            2019-12-12 05:02:14.395928
Finished training epoch 87
Finishtime: 2019-12-12 05:02:14.397511
Finishtime: 2019-12-12 05:02:14.397306
Finishtime: 2019-12-12 05:02:14.397653
Finishtime: 2019-12-12 05:02:14.400315
Finishtime: 2019-12-12 05:02:14.401074
Finishtime: 2019-12-12 05:02:14.400741
[xla:7] Accuracy=50.37%
[xla:0] Accuracy=49.10%
[xla:6] Accuracy=49.52%
[xla:3] Accuracy=50.22%
[xla:5] Accuracy=50.16%
[xla:2] Accuracy=49.60%
[xla:4] Accuracy=49.86%
[xla:1] Accuracy=49.68%
Finishtime:
            2019-12-12 05:04:07.197798
Finishtime: 2019-12-12 05:04:07.198437
Finishtime: 2019-12-12 05:04:07.197603
Finishtime: 2019-12-12 05:04:07.199149
Finished training epoch 88
Finishtime: 2019-12-12 05:04:07.199263
Finishtime:
            2019-12-12 05:04:07.199212
Finishtime: 2019-12-12 05:04:07.200442
Finishtime: 2019-12-12 05:04:07.201626
[xla:7] Accuracy=50.66%
[xla:5] Accuracy=50.04%
[xla:3] Accuracy=50.46%
[xla:6] Accuracy=51.23%
[xla:1] Accuracy=50.94%
[xla:4] Accuracy=50.67%
[xla:0] Accuracy=51.41%
[xla:2] Accuracy=50.84%
Finishtime: 2019-12-12 05:05:59.934191
Finishtime:
            2019-12-12 05:05:59.934540
Finishtime: 2019-12-12 05:05:59.933631
Finishtime:
            2019-12-12 05:05:59.934249
Finishtime: 2019-12-12 05:05:59.934593
```

Finished training epoch 89

Finishtime: 2019-12-12 05:05:59.935110

Finishtime: 2019-12-12 05:05:59.935900 Finishtime: 2019-12-12 05:05:59.940416 [xla:6] Accuracy=50.87% [xla:4] Accuracy=50.02% [xla:0] Accuracy=49.86% [xla:7] Accuracy=50.59% [xla:2] Accuracy=49.87% [xla:5] Accuracy=50.04% [xla:3] Accuracy=49.91% [xla:1] Accuracy=48.90% Finishtime: 2019-12-12 05:07:52.153012 Finishtime: 2019-12-12 05:07:52.153795 Finishtime: 2019-12-12 05:07:52.154151 Finishtime: 2019-12-12 05:07:52.155092 Finishtime: 2019-12-12 05:07:52.156665 Finishtime: 2019-12-12 05:07:52.156835 Finishtime: 2019-12-12 05:07:52.156882 Finished training epoch 90 Finishtime: 2019-12-12 05:07:52.160379 [xla:7] Accuracy=47.27% [xla:6] Accuracy=48.09% [xla:5] Accuracy=47.27% [xla:1] Accuracy=48.10% [xla:4] Accuracy=48.18% [xla:3] Accuracy=47.95% [xla:2] Accuracy=49.09% [xla:0] Accuracy=48.11% Finishtime: 2019-12-12 05:09:52.230418 Finishtime: 2019-12-12 05:09:52.231444 Finishtime: 2019-12-12 05:09:52.231917 Finished training epoch 91 Finishtime: 2019-12-12 05:09:52.232326 Finishtime: 2019-12-12 05:09:52.233129 Finishtime: 2019-12-12 05:09:52.233262 Finishtime: 2019-12-12 05:09:52.234796 Finishtime: 2019-12-12 05:09:52.234959 [xla:6] Accuracy=49.74% [xla:5] Accuracy=48.19% [xla:4] Accuracy=48.61% [xla:7] Accuracy=51.17% [xla:2] Accuracy=50.57% [xla:1] Accuracy=49.37% [xla:3] Accuracy=50.53% [xla:0] Accuracy=49.42% Finishtime: 2019-12-12 05:11:44.567313

Finishtime: 2019-12-12 05:11:44.567313 Finishtime: 2019-12-12 05:11:44.567429 Finishtime: 2019-12-12 05:11:44.567006 Finishtime: 2019-12-12 05:11:44.567788 Finished training epoch 92 Finishtime: 2019-12-12 05:11:44.568582 Finishtime: 2019-12-12 05:11:44.571046 Finishtime: 2019-12-12 05:11:44.572545 Finishtime: 2019-12-12 05:11:44.571393 [xla:6] Accuracy=47.26% [xla:4] Accuracy=47.07% [xla:0] Accuracy=47.44% [xla:7] Accuracy=47.41% [xla:5] Accuracy=47.35% [xla:3] Accuracy=47.04% [xla:2] Accuracy=48.04% [xla:1] Accuracy=47.62% Finishtime: 2019-12-12 05:13:36.836856 2019-12-12 05:13:36.837490 Finishtime: Finishtime: 2019-12-12 05:13:36.838524 Finishtime: 2019-12-12 05:13:36.839263 Finishtime: 2019-12-12 05:13:36.839056 Finishtime: 2019-12-12 05:13:36.839619 Finished training epoch 93 Finishtime: 2019-12-12 05:13:36.839889 Finishtime: 2019-12-12 05:13:36.842157 [xla:6] Accuracy=44.60% [xla:1] Accuracy=44.65% [xla:7] Accuracy=45.36% [xla:0] Accuracy=43.18% [xla:3] Accuracy=46.76% [xla:5] Accuracy=44.71% [xla:2] Accuracy=43.01% [xla:4] Accuracy=44.40% Finished training epoch 94 Finishtime: 2019-12-12 05:15:29.287950 Finishtime: 2019-12-12 05:15:29.287946 Finishtime: 2019-12-12 05:15:29.288231 Finishtime: 2019-12-12 05:15:29.289156 Finishtime: 2019-12-12 05:15:29.288513 Finishtime: 2019-12-12 05:15:29.288288 Finishtime: 2019-12-12 05:15:29.289425 Finishtime: 2019-12-12 05:15:29.289084 [xla:5] Accuracy=48.13% [xla:4] Accuracy=47.97% [xla:1] Accuracy=49.56% [xla:3] Accuracy=48.12% [xla:7] Accuracy=48.52% [xla:6] Accuracy=47.78% [xla:0] Accuracy=47.87% [xla:2] Accuracy=47.67%

Finished training epoch 95

```
Finishtime: 2019-12-12 05:17:22.168107
Finishtime: 2019-12-12 05:17:22.168177
Finishtime: 2019-12-12 05:17:22.167503
Finishtime: 2019-12-12 05:17:22.167400
Finishtime: 2019-12-12 05:17:22.168639
Finishtime: 2019-12-12 05:17:22.168526
Finishtime: 2019-12-12 05:17:22.170851
Finishtime: 2019-12-12 05:17:22.171413
       KeyboardInterrupt
                                                  Traceback (most recent call
 ناهجا ( Jast
        <ipython-input-8-6871d9b77650> in <module>()
             torch.set_default_tensor_type('torch.FloatTensor')
              accuracy, data, pred, target, model = train_resnet50()
    ----> 7 xmp.spawn(_mp_fn, args=(FLAGS,), nprocs=FLAGS['num_cores'],_
 →start_method='fork')
        /usr/local/lib/python3.6/dist-packages/torch xla/distributed/
 →xla_multiprocessing.py in spawn(fn, args, nprocs, join, daemon, start_method)
        171
                  join=join,
                 daemon=daemon,
        172
   --> 173
                 start_method=start_method)
        /usr/local/lib/python3.6/dist-packages/torch/multiprocessing/spawn.py in_
 →start_processes(fn, args, nprocs, join, daemon, start_method)
        147
        148
                # Loop on join until it returns True or raises an exception.
    --> 149
                while not context.join():
        150
                   pass
        151
        /usr/local/lib/python3.6/dist-packages/torch/multiprocessing/spawn.py in_
 →join(self, timeout)
        75
                    ready = multiprocessing.connection.wait(
        76
                        self.sentinels.keys(),
   ---> 77
                        timeout=timeout,
        78
                    )
        79
```

```
/usr/lib/python3.6/multiprocessing/connection.py in wait(object_list,u
     →timeout)
            909
            910
                            while True:
        --> 911
                                 ready = selector.select(timeout)
            912
                                 if ready:
                                     return [key.fileobj for (key, events) in ready]
            913
            /usr/lib/python3.6/selectors.py in select(self, timeout)
            374
                            ready = []
            375
                            try:
        --> 376
                                 fd_event_list = self._poll.poll(timeout)
            377
                            except InterruptedError:
            378
                                return ready
            KeyboardInterrupt:
[0]:
[0]: device = xm.xla device()
     model = models.resnet50().to(device)
     model.load_state_dict(torch.load('/content/model.pt'))
     model.eval()
            FileNotFoundError
                                                       Traceback (most recent call_
     →last)
            <ipython-input-9-3b03fa3b09a8> in <module>()
              1 device = xm.xla device()
              2 model = models.resnet50().to(device)
        ----> 3 model.load_state_dict(torch.load('/content/model.pt'))
              4 model.eval()
            /usr/local/lib/python3.6/dist-packages/torch/serialization.py in load(f, __
     →map_location, pickle_module, **pickle_load_args)
                        pickle_load_args['encoding'] = 'utf-8'
            481
            482
                 with _open_file_like(f, 'rb') as opened_file:
        --> 483
```

```
→**pickle_load_args)
            485
            /usr/local/lib/python3.6/dist-packages/torch/serialization.py in_
     →_open_file_like(name_or_buffer, mode)
            208 def _open_file_like(name_or_buffer, mode):
                     if _is_path(name_or_buffer):
            209
        --> 210
                         return _open_file(name_or_buffer, mode)
            211
                    else:
            212
                        if 'w' in mode:
            /usr/local/lib/python3.6/dist-packages/torch/serialization.py in_
     →__init__(self, name, mode)
            191 class _open_file(_opener):
                     def __init__(self, name, mode):
            192
        --> 193
                         super(_open_file, self).__init__(open(name, mode))
            194
                  def __exit__(self, *args):
            195
            FileNotFoundError: [Errno 2] No such file or directory: '/content/model.
     بpt '
[0]: from PIL import Image
     from torchvision import transforms
     def eval image(filepath):
         input_image = Image.open(filepath)
         preprocess = 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.
      \rightarrow225]),
         1)
         input tensor = preprocess(input image)
         input_batch = input_tensor.unsqueeze(0) # create a mini-batch as expected_
      \rightarrow by the model
         # move the input and model to GPU for speed if available
         device = xm.xla device()
         input_batch = input_batch.to(device)
```

return _load(opened_file, map_location, pickle_module,_

484

Wild Accuracy: 0.0

```
[0]: os.system("unzip /content/DSF_HW5_wild_images.zip")
```

[0]: 0