```
%matplotlib inline
```

Double-click (or enter) to edit

```
from google.colab import drive
drive.mount('/content/drive')

☐→ Drive already mounted at /content/drive; to attempt to forcibly remount, call dr:
import os
os.chdir('/content/drive/My Drive/cs505/char_rnn_tutorial') #achange dir
!pwd

☐→ /content/drive/My Drive/cs505/char rnn tutorial
```

Classifying Names with a Character-Level RNN

```
Author: Sean Robertson <a href="https://github.com/spro/practical-pytorch">https://github.com/spro/practical-pytorch</a>_
```

We will be building and training a basic character-level RNN to classify words. A character-level RNN outputting a prediction and "hidden state" at each step, feeding its previous hidden state into each ne the output, i.e. which class the word belongs to.

Specifically, we'll train on a few thousand surnames from 18 languages of origin, and predict which la spelling:

••

```
$ python predict.py Hinton
(-0.47) Scottish
(-1.52) English
(-3.57) Irish

$ python predict.py Schmidhuber
(-0.19) German
(-2.48) Czech
(-2.68) Dutch
```

Recommended Reading:

I assume you have at least installed PyTorch, know Python, and understand Tensors:

- http://pytorch.org/ For installation instructions
- :doc:/beginner/deep learning 60min blitz to get started with PyTorch in general
- :doc:/beginner/pytorch_with_examples for a wide and deep overview

• :doc:/beginner/former_torchies_tutorial if you are former Lua Torch user

It would also be useful to know about RNNs and how they work:

- The Unreasonable Effectiveness of Recurrent Neural Networks http://karpathy.geffectiveness/ __ shows a bunch of real life examples
- Understanding LSTM Networks http://colah.github.io/posts/2015-08-Understanding but also informative about RNNs in general

Preparing the Data

.. Note:: Download the data from here https://download.pytorch.org/tutorial/data.zip_ ?

Included in the data/names directory are 18 text files named as "[Language].txt". Each file contains a mostly romanized (but we still need to convert from Unicode to ASCII).

We'll end up with a dictionary of lists of names per language, {language: [names ...]}. The general language and name in our case) are used for later extensibility.

```
from __future__ import unicode literals, print function, division
from io import open
import glob
import os
def findFiles(path): return glob.glob(path)
print(findFiles('data/cities train/*.txt'))
import unicodedata
import string
all letters = string.ascii letters + " .,; '"
n letters = len(all letters)
# Turn a Unicode string to plain ASCII, thanks to http://stackoverflow.com/a/518232/2
def unicodeToAscii(s):
    return ''.join(
        c for c in unicodedata.normalize('NFD', s)
        if unicodedata.category(c) != 'Mn'
        and c in all letters
    )
print(unicodeToAscii('Ślusàrski'))
# Build the category lines dictionary, a list of names per language
category lines = {}
val category lines = {}
all categories = []
val categories = []
```

```
var_caceyories - []
# Read a file and split into lines
def readLines(filename):
    lines = open(filename, encoding="ISO-8859-1").read().split('\n')
    return [unicodeToAscii(line) for line in lines]
for filename in findFiles('data/cities_train/*.txt'):
    category = os.path.splitext(os.path.basename(filename))[0]
    all categories.append(category)
    lines = readLines(filename)[:-1]
    category_lines[category] = lines
n_categories = len(all_categories)
for filename in findFiles('data/cities_val/*.txt'):
    category = os.path.splitext(os.path.basename(filename))[0]
    val_categories.append(category)
    lines = readLines(filename)[:-1]
    val category lines[category] = lines
```

['data/cities_train/cn.txt', 'data/cities_train/za.txt', 'data/cities_train/de.tx Slusarski

Now we have <code>category_lines</code>, a dictionary mapping each category (language) to a list of lines (nan <code>all_categories</code> (just a list of languages) and <code>n_categories</code> for later reference.

```
print(category_lines['cn'][-5:])
print(val_category_lines['cn'][-5:])

['cuizongzhuang', 'hetou', 'hulstai', 'shuanglazi', 'tebongori']
        ['xueguangzhang', 'ian', 'niujiaoxu', 'shuipo', 'daohugou']
```

Turning Names into Tensors

Now that we have all the names organized, we need to turn them into Tensors to make any use of the

To represent a single letter, we use a "one-hot vector" of size $<1 \times n_{\text{letters}}>$. A one-hot vector is f current letter, e.g. "b" = $<0 \ 1 \ 0 \ 0 \ \dots>$.

To make a word we join a bunch of those into a 2D matrix <line_length $x \ 1 \ x \ n$ letters>.

That extra 1 dimension is because PyTorch assumes everything is in batches - we're just using a batc

```
import torch
# Find letter index from all_letters, e.g. "a" = 0
def letterToIndex(letter):
```

```
return all letters.find(letter)
# Just for demonstration, turn a letter into a <1 x n_letters> Tensor
def letterToTensor(letter):
  tensor = torch.zeros(1, n_letters)
  tensor[0][letterToIndex(letter)] = 1
  return tensor
# Turn a line into a <line length x 1 x n letters>,
# or an array of one-hot letter vectors
def lineToTensor(line):
  tensor = torch.zeros(len(line), 1, n_letters)
  for li, letter in enumerate(line):
     tensor[li][0][letterToIndex(letter)] = 1
  return tensor
print(letterToTensor('J'))
print(lineToTensor('Jones').size())
  0., 0., 0.]])
   torch.Size([5, 1, 57])
```

Creating the Network

Before autograd, creating a recurrent neural network in Torch involved cloning the parameters of a lay hidden state and gradients which are now entirely handled by the graph itself. This means you can im regular feed-forward layers.

This RNN module (mostly copied from the PyTorch for Torch users tutorial http://pytorch.org/tutorials/beginner/former_torchies/ nn_tutorial.html#example-2-which operate on an input and hidden state, with a LogSoftmax layer after the output.

.. figure:: https://i.imgur.com/Z2xbyS0.png :alt:

```
import torch.nn as nn

class RNN(nn.Module):
    def __init__(self, input_size, hidden_size, output_size):
        super(RNN, self).__init__()

        self.hidden_size = hidden_size

        self.i2h = nn.Linear(input_size + hidden_size, hidden_size)
        self.i2o = nn.Linear(input_size + hidden_size, output_size)
        self.softmax = nn.LogSoftmax(dim=1)
```

```
def forward(self, input, hidden):
    combined = torch.cat((input, hidden), 1)
    hidden = self.i2h(combined)
    output = self.i2o(combined)
    output = self.softmax(output)
    return output, hidden

def initHidden(self):
    return torch.zeros(1, self.hidden_size)

n_hidden = 128
rnn = RNN(n_letters, n_hidden, n_categories)
```

To run a step of this network we need to pass an input (in our case, the Tensor for the current letter) a initialize as zeros at first). We'll get back the output (probability of each language) and a next hidden a

```
input = letterToTensor('A')
hidden =torch.zeros(1, n_hidden)

output, next_hidden = rnn(input, hidden)
print(output)

[ tensor([[-2.1508, -2.2374, -2.3111, -2.1435, -2.2026, -2.2217, -2.1695, -2.1645, -2.1848]], grad_fn=<LogSoftmaxBackward>)
```

For the sake of efficiency we don't want to be creating a new Tensor for every step, so we will use lil and use slices. This could be further optimized by pre-computing batches of Tensors.

```
input = lineToTensor('Albert')
hidden = torch.zeros(1, n_hidden)

output, next_hidden = rnn(input[0], hidden)
print(output)

C tensor([[-2.1508, -2.2374, -2.3111, -2.1435, -2.2026, -2.2217, -2.1695, -2.1645, -2.1848]], grad fn=<LogSoftmaxBackward>)
```

As you can see the output is a <1 \times n_categories> Tensor, where every item is the likelihood of the

Training

Preparing for Training

Before going into training we should make a few helper functions. The first is to interpret the output of likelihood of each category. We can use Tensor. topk to get the index of the greatest value:

```
def categoryFromOutput(output):
    top n, top i = output.topk(1)
    category_i = top_i[0].item()
    return all_categories[category_i], category_i
print(categoryFromOutput(output))
「→ ('fr', 3)
We will also want a quick way to get a training example (a name and its language):
import random
def randomChoice(1):
    return l[random.randint(0, len(1) - 1)]
def randomTrainingExample():
    category = randomChoice(all_categories)
    line = randomChoice(category lines[category])
    category tensor = torch.tensor([all_categories.index(category)], dtype=torch.long
    line tensor = lineToTensor(line)
    return category, line, category tensor, line tensor
def randomValidationExample():
    category = randomChoice(val categories)
    line = randomChoice(val category lines[category])
    val category tensor = torch.tensor([val categories.index(category)], dtype=torch.
    val line tensor = lineToTensor(line)
    return category, line, val category tensor, val line tensor
def shuffle arrs(a,b,c,d):
    combined = list(zip(a, b, c, d))
    random.shuffle(combined)
    a, b, c, d = zip(*combined)
    return a,b,c,d
def genData(category line hash, categories arr):
    x, y, x_tensor, y_tensor = [], [], [], []
    for y category in category line hash.keys():
        for x_line in category_line_hash[y_category]:
            y.append(y category)
            x.append(x line)
            y tensor.append(torch.tensor([categories arr.index(y category)], dtype=to
            x tensor.append(lineToTensor(x line))
    x, y, x_tensor, y_tensor = shuffle_arrs(x, y, x_tensor, y_tensor)
    return x, y, x_tensor, y_tensor
def TrainingData():
    return genData(category lines, all categories)
```

```
π у − []
    \# x = []
    # for y_category in category_lines.keys():
          for x line in category lines[y category]:
              y.append(y_category)
              x.append(x_line)
              y_tensor.append(torch.tensor([val_categories.index(category)], dtype=to
              x_tensor.append(lineToTensor(x_line))
    # x, y, x_tensor, y_tensor = shuffle_arrs(x, y, x_tensor, y_tensor)
    # return x, y
def ValidationData():
    return genData(val_category_lines, val_categories)
    \# y = []
    \# x = []
    # y_tensor = []
    \# x_{tensor} = []
    # for y category in val_category lines.keys():
          for x_line in val_category_lines[y_category]:
              y.append(y_category)
              x.append(x_line)
              y_tensor.append(torch.tensor([val_categories.index(category)], dtype=to
              x_tensor.append(lineToTensor(x_line))
    # x, y, x_tensor, y_tensor = shuffle_arrs(x, y, x_tensor, y_tensor)
    # return x, y
print("=== Train ===")
x,y,x_tensor,y_tensor= TrainingData()
print(x[:5])
print(y[:5])
# print(x_tensor[:1])
# print(y_tensor[:1])
print("=== Validation ===")
x,y,x_tensor,y_tensor = ValidationData()
print(x[:5])
print(y[:5])
# print(x_tensor[:1])
# print(y tensor[:1])
 [→ === Train ===
     ('eguenigue', 'hazar now', 'grosssteinbach', "podere sant'elisa", 'khanabade qotl
     ('fr', 'af', 'in', 'de', 'ir')
    === Validation ===
     ('khinddur', 'aubure', 'koppies irrigation settlement', 'kuth nari', 'lutcza')
     ('af', 'fr', 'za', 'pk', 'za')
```

Training the Network

Now all it takes to train this network is show it a bunch of examples, have it make guesses, and tell it For the loss function nn.NLLLoss is appropriate, since the last layer of the RNN is nn.LogSoftmax.

```
criterion = nn.NLLLoss()
```

Each loop of training will:

- · Create input and target tensors
- · Create a zeroed initial hidden state
- · Read each letter in and
 - Keep hidden state for next letter
- · Compare final output to target
- Back-propagate
- · Return the output and loss

```
learning rate = 0.002 # If you set this too high, it might explode. If too low, it mi
def train(category_tensor, line_tensor):
    hidden = rnn.initHidden()
    rnn.zero grad()
    # print("category tensor={}, line tensor.size()[0]={}".format(category tensor, li
    for i in range(line tensor.size()[0]):
        output, hidden = rnn(line tensor[i], hidden)
    loss = criterion(output, category tensor)
    loss.backward()
    # Add parameters' gradients to their values, multiplied by learning rate
    for p in rnn.parameters():
        p.data.add (-learning rate, p.grad.data)
    return output, loss.item()
# Just return an output given a line
def evaluate(line tensor, category tensor):
    hidden = rnn.initHidden()
    # print("evaluate debug")
    # print(line tensor.size()[0])
    # print("line tensor")
    # print(line tensor)
    for i in range(line_tensor.size()[0]):
        output, hidden = rnn(line tensor[i], hidden)
    loss = criterion(output, category tensor)
```

```
return output, loss.item()
```

Now we just have to run that with a bunch of examples. Since the train function returns both the oualso keep track of loss for plotting. Since there are 1000s of examples we print only every print_eveloss.

```
# import time
# import math
# print_every = 1000 # total = 27000
# plot every = 1000 # 5000
# # Keep track of losses for plotting
# current loss = 0
# val_losses = 0.
# train acc thru time aggregate, val acc thru time aggregate = 0., 0.
# train_losses_thru_time = []
# val_losses_thru_time = []
# train acc thru time = []
# val_acc_thru_time = []
# def timeSince(since):
#
    now = time.time()
    s = now - since
    m = math.floor(s / 60)
     s = m * 60
     return '%dm %ds' % (m, s)
# start = time.time()
# print("learning rate = ", learning rate)
# x_train, y_train, x_train_tensor, y_train_tensor = TrainingData()
# x val, y val, x val tensor, y val tensor = ValidationData()
# x train len = len(x train)
\# x val len = 10 \# len(x val)
# print("x_train_len:", x_train_len, ", x_val_len:", x_val_len)
# for i in range(x train len):
      # category, line, category tensor, line tensor = randomTrainingExample() # TOD
#
      category = y_train[i]
#
     line = x train[i]
     category tensor = y train tensor[i]
      line_tensor = x_train_tensor[i]
#
      output, loss = train(category_tensor, line_tensor)
      current loss += loss
```

```
#
      val_loss_per_train_data = 0
      val correct guess count = 0
#
#
      train_correct_guess_count = 0
#
      # for j in range(x val len):
            val output, val loss = evaluate(x val tensor[j], y val tensor[j])
#
#
            val_loss_per_train_data += val_loss
#
      for j in range(x val len):
#
          # Train accuracy calc
#
          train category, _, train category tensor, train line tensor = randomTrainin
          train output, train loss = evaluate(train line tensor, train category tenso
#
          train_guess, _ = categoryFromOutput(train_output)
#
          train correct guess count += int(train guess == train category)
#
#
          # Validation accuracy calc
          val_category, _, val_category_tensor, val_line_tensor = randomValidationExa
#
          val_output, val_loss = evaluate(val_line_tensor, val_category_tensor)
#
          val guess, = categoryFromOutput(val output)
#
          val_correct_guess_count += int(val_guess == val_category)
#
          val_loss_per_train_data += val_loss
#
      # Aggregate accuracy
#
      train acc per train data = train correct guess count / x val len
#
      train acc thru time aggregate += train acc per train data
      val acc per train data = val correct guess count / x val len
#
      val acc thru time aggregate += val acc per train data
#
#
      # Aggregate validation loss
#
      val loss per train data ave = val loss per train data / x val len
#
      val losses += val loss per train data ave
#
      # Print iter number, loss, name and guess
#
      if i % print every == 0:
          print("iter = {}({:d}%) | time taken = {} | train loss={:.4f}, val loss(ave
#
          debug x, debug y, debug x_tensor, debug_y_tensor = [], [], [], []
#
      # Add current loss avg to list of losses
#
      if i % plot every == 0:
#
#
          train losses thru time.append(current loss / plot every)
#
          val losses thru time.append(val losses / plot every)
          current loss = 0
#
          val losses = 0
          print("iter = {}({:d}%) | time taken = {} | train acc thru time ave={}, val
#
          train acc thru time.append(train acc thru time aggregate / plot every)
#
#
          val acc thru time.append(val acc thru time aggregate / plot every)
          train acc thru time aggregate = 0
#
#
          val acc thru time aggregate = 0
```

```
# import matplotlib.pyplot as plt
# import matplotlib.ticker as ticker
# plt.figure()
# train loss plot = plt.plot(train losses thru time[1:], label='Train Loss')
# val_loss_plot = plt.plot(val_losses_thru_time[1:], label="Val Loss")
# plt.legend()
# print("train losses thru time")
# print(train losses thru time[1:])
# print("val losses thru time")
# print(val_losses_thru_time[1:])
# import matplotlib.pyplot as plt
# import matplotlib.ticker as ticker
# plt.figure()
# train acc plot = plt.plot(train acc thru time[1:], label='Train Accuracy')
# val acc plot = plt.plot(val acc thru time[1:], label="Val Accuracy")
# plt.legend()
# print("train acc thru time")
# print(train acc thru time[1:])
# print("val acc thru time")
# print(val acc thru time[1:])
import time
import math
print every = 100 # total = 27000
plot every = 100 # 5000
# Keep track of losses for plotting
current loss = 0
val losses = 0.
train acc thru time aggregate, val acc thru time aggregate = 0., 0.
train losses thru time = []
val losses_thru_time = []
train_acc_thru_time = []
val acc thru time = []
def timeSince(since):
   now = time.time()
    s = now - since
    m = math.floor(s / 60)
    s = m * 60
    return '%dm %ds' % (m, s)
start = time.time()
```

```
print("learning rate = ", learning rate)
x train, y train, x train tensor, y train tensor = TrainingData()
x_val, y_val, x_val_tensor, y_val_tensor = ValidationData()
x train len = len(x train)
x_val_len = 10 # len(x_val)
print("x_train_len:", x_train_len, ", x_val_len:", x_val_len)
for i in range(x train len):
    # category, line, category tensor, line tensor = randomTrainingExample() # TODO:
    category = y_train[i]
    line = x_train[i]
    category_tensor = y_train_tensor[i]
    line_tensor = x_train_tensor[i]
    output, loss = train(category_tensor, line_tensor)
    current loss += loss
   val loss per train data = 0
   val_correct_guess_count = 0
   train_correct_guess_count = 0
    # for j in range(x val len):
          val output, val loss = evaluate(x val tensor[j], y val tensor[j])
          val loss per train data += val loss
    for j in range(x val len):
       # Train accuracy calc
        train category, , train category tensor, train line tensor = randomTrainingE
        train output, train loss = evaluate(train line tensor, train category tensor)
        train_guess, _ = categoryFromOutput(train_output)
        train_correct_guess_count += int(train_guess == train_category)
        # Validation accuracy calc
        val_category, _, val_category_tensor, val_line_tensor = randomValidationExamp
        val output, val loss = evaluate(val line tensor, val category tensor)
        val_guess, _ = categoryFromOutput(val_output)
        val correct guess count += int(val guess == val category)
        val_loss_per_train_data += val_loss
    # Aggregate accuracy
    train acc per train data = train correct guess count / x val len
    train acc thru time aggregate += train acc per train data
    val acc per train data = val correct guess count / x val len
    val acc thru time aggregate += val acc per train data
    # Aggregate validation loss
    val loss per train data ave = val loss per train data / x val len
    val losses += val loss per train data ave
    # Print iter number, loss, name and guess
```

```
if i % print_every == 0:
    print("iter = {}({:d}%) | time taken = {} | train_loss={:.4f}, val_loss(ave)=
    debug_x, debug_y, debug_x_tensor, debug_y_tensor = [], [], [], []

# Add current loss avg to list of losses
if i % plot_every == 0:
    train_losses_thru_time.append(current_loss / plot_every)
    val_losses_thru_time.append(val_losses / plot_every)
    current_loss = 0
    val_losses = 0

    print("iter = {}({:d}%) | time taken = {} | train_acc_thru_time_ave={}, val_a

    train_acc_thru_time.append(train_acc_thru_time_aggregate / plot_every)
    val_acc_thru_time.append(val_acc_thru_time_aggregate / plot_every)
    train_acc_thru_time_aggregate = 0
    val_acc_thru_time_aggregate = 0
```

 \Box

```
time taken = 3m 58s | train loss=2.2002, val loss(ave)=2.2800
iter = 12300(45\%)
iter = 12300(45\%)
                    train acc thru time ave=3m 58s, val acc thru time ave=0.33299
                    time taken = 4m 0s | train loss=2.2722, val loss(ave)=2.3406
iter = 12400(45\%)
                    train acc thru time ave=4m 0s, val acc thru time ave=0.314999
iter = 12400(45\%)
iter = 12500(46\%)
                    time taken = 4m 2s | train loss=2.1329, val loss(ave)=2.3267
iter = 12500(46\%)
                    train acc thru time ave=4m 2s, val acc thru time ave=0.282000
                    time taken = 4m 4s | train loss=1.8700, val loss(ave)=2.3448
iter = 12600(46\%)
iter = 12600(46\%)
                    train acc thru time ave=4m 4s, val acc thru time ave=0.311
                    time taken = 4m 6s | train loss=1.8203, val loss(ave)=2.2659
iter = 12700(47\%)
iter = 12700(47\%)
                    train acc thru time ave=4m 6s, val acc thru time ave=0.291999
                    time taken = 4m 8s | train loss=1.8880, val loss(ave)=2.2464
iter = 12800(47\%)
iter = 12800(47\%)
                    train acc thru time ave=4m 8s, val acc thru time ave=0.299000
                    time taken = 4m 9s | train loss=1.8384, val loss(ave)=2.2957
iter = 12900(47\%)
                    train acc thru time ave=4m 9s, val acc thru time ave=0.321000
iter = 12900(47\%)
iter = 13000(48\%)
                    time taken = 4m 11s | train loss=1.5378, val loss(ave)=2.1822
                    train_acc_thru_time_ave=4m 11s, val_acc_thru_time_ave=0.35
iter = 13000(48\%)
                    time taken = 4m 13s | train loss=1.7543, val loss(ave)=2.5320
iter = 13100(48\%)
iter = 13100(48\%)
                    train acc thru time ave=4m 13s, val acc thru time ave=0.325
iter = 13200(48\%)
                    time taken = 4m 15s | train_loss=2.3358, val_loss(ave)=2.317
iter = 13200(48\%)
                    train acc thru time ave=4m 15s, val acc thru time ave=0.30900
                    time taken = 4m 17s | train loss=1.9725, val loss(ave)=2.3769
iter = 13300(49\%)
                    train acc thru time ave=4m 17s, val acc thru time ave=0.30299
iter = 13300(49\%)
                    time taken = 4m 19s | train loss=2.2557, val loss(ave)=2.517{
iter = 13400(49\%)
                    train acc thru time_ave=4m 19s, val_acc_thru_time_ave=0.33899
iter = 13400(49\%)
iter = 13500(50\%)
                    time taken = 4m 20s | train_loss=1.7968, val_loss(ave)=2.2874
                    train acc thru time ave=4m 20s, val acc thru time ave=0.311
iter = 13500(50\%)
iter = 13600(50\%)
                    time taken = 4m 22s | train loss=1.5210, val loss(ave)=2.262
                    train acc thru time ave=4m 22s, val acc thru time ave=0.31499
iter = 13600(50\%)
                    time taken = 4m 24s | train loss=2.1146, val loss(ave)=2.499
iter = 13700(50\%)
iter = 13700(50\%)
                    train acc thru time ave=4m 24s, val acc thru time ave=0.31599
                    time taken = 4m 26s | train loss=2.0158, val loss(ave)=2.480'
iter = 13800(51\%)
iter = 13800(51\%)
                    train acc thru time ave=4m 26s, val acc thru time ave=0.30900
                    time taken = 4m 28s | train loss=1.6452, val loss(ave)=2.6433
iter = 13900(51\%)
                    train acc thru time ave=4m 28s, val acc thru time ave=0.317
iter = 13900(51\%)
iter = 14000(51\%)
                    time taken = 4m 30s | train loss=2.3315, val loss(ave)=2.5099
iter = 14000(51\%)
                    train acc thru time ave=4m 30s, val acc thru time ave=0.27899
                    time taken = 4m 32s | train loss=1.9080, val loss(ave)=2.4434
iter = 14100(52\%)
iter = 14100(52\%)
                    train acc thru time ave=4m 32s, val acc thru time ave=0.32800
                    time taken = 4m 33s | train loss=2.2569, val loss(ave)=2.358{
iter = 14200(52\%)
iter = 14200(52\%)
                    train acc thru time ave=4m 33s, val acc thru time ave=0.30300
                    time taken = 4m 35s | train loss=2.0032, val loss(ave)=2.286
iter = 14300(52\%)
                    train acc thru time ave=4m 35s, val acc thru time ave=0.305
iter = 14300(52\%)
iter = 14400(53\%)
                    time taken = 4m 37s | train loss=2.2629, val loss(ave)=2.9534
iter = 14400(53\%)
                    train acc thru time ave=4m 37s, val acc thru time ave=0.33699
                    time taken = 4m 39s | train loss=2.0681, val loss(ave)=2.272
iter = 14500(53\%)
iter = 14500(53\%)
                    train acc thru time ave=4m 39s, val acc thru time ave=0.30100
                    time taken = 4m 41s | train loss=1.7303, val loss(ave)=2.4939
iter = 14600(54\%)
                    train acc thru time ave=4m 41s, val_acc_thru_time_ave=0.32099
iter = 14600(54\%)
                    time taken = 4m 43s | train loss=1.8400, val loss(ave)=2.4820
iter = 14700(54\%)
iter = 14700(54\%)
                    train acc thru time ave=4m 43s, val acc thru time ave=0.326
                    time taken = 4m 45s | train loss=2.1921, val loss(ave)=2.039(
iter = 14800(54\%)
                    train acc thru time ave=4m 45s, val acc thru time ave=0.32499
iter = 14800(54\%)
                    time taken = 4m 46s | train loss=1.6754, val loss(ave)=2.382!
iter = 14900(55\%)
iter = 14900(55\%)
                    train acc thru time ave=4m 46s, val acc thru time ave=0.344
                    time taken = 4m 48s | train loss=1.9468, val loss(ave)=2.168!
iter = 15000(55\%)
iter = 15000(55\%)
                    train acc thru time ave=4m 48s, val acc thru time ave=0.32
                    time taken = 4m 50s | train loss=1.7500, val loss(ave)=2.243
iter = 15100(55\%)
                    train acc thru time ave=4m 50s. val acc thru time ave=0.31699
iter = 15100(55\%)
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time taken = 4m 52s | train_loss=2.0191, val_loss(ave)=2.4282
iter = 15200(56\%)
                     train acc thru time ave=4m 52s, val acc thru time ave=0.32799
iter = 15200(56\%)
                     time taken = 4m 54s | train_loss=1.4058, val_loss(ave)=2.268
iter = 15300(56\%)
                     train_acc_thru_time_ave=4m 54s, val_acc_thru_time_ave=0.312
iter = 15300(56\%)
iter = 15400(57\%)
                     time taken = 4m 56s | train loss=1.9848, val loss(ave)=2.343!
iter = 15400(57\%)
                     train acc thru time ave=4m 56s, val acc thru time ave=0.29300
                     time taken = 4m 58s | train_loss=3.1281, val_loss(ave)=2.5012
iter = 15500(57\%)
                     train acc thru time ave=4m 58s, val acc thru time ave=0.32300
iter = 15500(57\%)
                     time taken = 4m 59s | train_loss=2.2698, val_loss(ave)=2.4330
iter = 15600(57\%)
iter = 15600(57\%)
                     train acc thru time ave=4m 59s, val acc thru time ave=0.31600
                     time taken = 5m 1s | train loss=1.4748, val loss(ave)=2.3805
iter = 15700(58\%)
                     train acc thru time ave=5m 1s, val acc thru time ave=0.316
iter = 15700(58\%)
                     time taken = 5m 3s | train_loss=2.0722, val_loss(ave)=2.8802
iter = 15800(58\%)
                     train acc thru time ave=5m 3s, val acc thru time ave=0.339999
iter = 15800(58\%)
iter = 15900(58\%)
                     time taken = 5m 5s | train_loss=1.5647, val_loss(ave)=2.2978
iter = 15900(58\%)
                     train acc thru time ave=5m 5s, val acc thru time ave=0.334999
                     time taken = 5m 7s | train loss=1.2696, val loss(ave)=2.7273
iter = 16000(59\%)
                     train acc thru time ave=5m 7s, val acc thru time ave=0.343999
iter = 16000(59\%)
                     time taken = 5m 9s \mid train loss=1.5769, val loss(ave)=2.2471
iter = 16100(59\%)
iter = 16100(59\%)
                     train acc thru time ave=5m 9s, val acc thru time ave=0.348000
                     time taken = 5m 10s | train loss=1.8372, val loss(ave)=2.377
iter = 16200(60\%)
iter = 16200(60\%)
                     train acc thru time ave=5m 10s, val acc thru time ave=0.33199
                     time taken = 5m 12s | train loss=1.9412, val loss(ave)=2.038
iter = 16300(60\%)
                     train acc thru time ave=5m 12s, val acc thru time ave=0.35399
iter = 16300(60\%)
                     time taken = 5m 14s | train_loss=2.1943, val_loss(ave)=2.5160
iter = 16400(60\%)
iter = 16400(60\%)
                     train acc thru time ave=5m 14s, val acc thru time ave=0.35100
                     time taken = 5m 16s | train loss=1.8320, val loss(ave)=1.984!
iter = 16500(61\%)
                     train acc thru time ave=5m 16s, val acc thru time ave=0.32700
iter = 16500(61\%)
                     time taken = 5m 18s | train loss=2.3783, val loss(ave)=2.4579
iter = 16600(61\%)
iter = 16600(61\%)
                     train acc thru time ave=5m 18s, val acc thru time ave=0.33699
                     time taken = 5m 20s | train loss=2.0086, val loss(ave)=2.647
iter = 16700(61\%)
iter = 16700(61\%)
                     train acc thru time ave=5m 20s, val acc thru time ave=0.32599
                     time taken = 5m 22s | train loss=2.1705, val loss(ave)=2.5900
iter = 16800(62\%)
iter = 16800(62\%)
                     train_acc_thru_time_ave=5m 22s, val_acc_thru_time_ave=0.333
iter = 16900(62\%)
                     time taken = 5m 23s | train loss=1.7867, val loss(ave)=2.1760
                     train acc thru time ave=5m 23s, val acc thru time ave=0.33199
iter = 16900(62\%)
iter = 17000(62\%)
                     time taken = 5m 25s \mid train loss=1.6074, val loss(ave)=2.305
                     train acc thru time ave=5m 25s, val acc thru time ave=0.35299
iter = 17000(62\%)
                     time taken = 5m 27s | train_loss=1.6309, val_loss(ave)=2.6039
iter = 17100(63\%)
iter = 17100(63\%)
                     train acc thru time ave=5m 27s, val acc thru time ave=0.34700
                     time taken = 5m 29s | train loss=3.1790, val loss(ave)=2.0832
iter = 17200(63\%)
iter = 17200(63\%)
                     train acc thru time ave=5m 29s, val acc thru time ave=0.345
                     time taken = 5m 31s | train loss=1.3906, val loss(ave)=2.1570
iter = 17300(64\%)
iter = 17300(64\%)
                     train acc thru time ave=5m 31s, val acc thru time ave=0.29999
iter = 17400(64\%)
                     time taken = 5m 32s | train loss=1.0294, val loss(ave)=2.527
iter = 17400(64\%)
                     train acc thru time ave=5m 32s, val acc thru time ave=0.32800
                     time taken = 5m 34s | train_loss=2.0128, val_loss(ave)=2.4684
iter = 17500(64\%)
                     train acc thru time ave=5m 34s, val acc thru time ave=0.30600
iter = 17500(64\%)
                     time taken = 5m 36s | train_loss=1.4292, val_loss(ave)=2.7424
iter = 17600(65\%)
iter = 17600(65\%)
                     train acc thru time ave=5m 36s, val acc thru time ave=0.33499
                     time taken = 5m 38s | train loss=1.5184, val loss(ave)=2.2860
iter = 17700(65\%)
iter = 17700(65\%)
                     train acc thru time ave=5m 38s, val acc thru time ave=0.336
                     time taken = 5m 40s | train loss=1.2573, val loss(ave)=2.4760
iter = 17800(65\%)
                     train acc thru time ave=5m 40s, val acc thru time ave=0.343
iter = 17800(65\%)
iter = 17900(66\%)
                     time taken = 5m 42s | train loss=1.4314, val loss(ave)=2.256!
iter = 17900(66\%)
                     train acc thru time ave=5m 42s, val acc thru time ave=0.34199
                     time taken = 5m 43s | train loss=1.7756, val loss(ave)=2.580
iter = 18000(66\%)
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lter = 18000(66%)
                    train acc thru time ave=5m 43s, val acc thru time ave=0.35699
iter = 18100(67\%)
                    time taken = 5m 45s | train_loss=1.9601, val_loss(ave)=3.033{
iter = 18100(67\%)
                    train acc thru time ave=5m 45s, val acc thru time ave=0.345
                    time taken = 5m 47s | train loss=0.9575, val loss(ave)=2.100!
iter = 18200(67\%)
                    train acc thru time ave=5m 47s, val acc thru time ave=0.34399
iter = 18200(67\%)
iter = 18300(67\%)
                    time taken = 5m 49s | train_loss=1.6310, val_loss(ave)=2.1908
                    train acc thru time ave=5m 49s, val acc thru time ave=0.34399
iter = 18300(67\%)
iter = 18400(68\%)
                    time taken = 5m 51s | train loss=1.9476, val loss(ave)=2.5692
                    train acc thru time ave=5m 51s, val acc thru time ave=0.32799
iter = 18400(68\%)
                    time taken = 5m 53s | train loss=3.4008, val loss(ave)=2.7739
iter = 18500(68\%)
iter = 18500(68\%)
                    train acc thru time ave=5m 53s, val acc thru time ave=0.35999
iter = 18600(68\%)
                    time taken = 5m 54s | train_loss=1.7850, val_loss(ave)=2.255{
                    train acc thru time ave=5m 54s, val acc thru time ave=0.39399
iter = 18600(68\%)
iter = 18700(69\%)
                    time taken = 5m 56s | train_loss=3.1697, val_loss(ave)=2.3454
                    train acc thru time ave=5m 56s, val acc thru time ave=0.37399
iter = 18700(69\%)
                    time taken = 5m 58s | train loss=1.3339, val loss(ave)=2.4799
iter = 18800(69\%)
                    train acc thru time ave=5m 58s, val acc thru time ave=0.38499
iter = 18800(69\%)
iter = 18900(70\%)
                    time taken = 6m 0s | train_loss=2.8672, val_loss(ave)=2.7980
                    train acc thru time ave=6m 0s, val acc thru time ave=0.371999
iter = 18900(70\%)
iter = 19000(70\%)
                    time taken = 6m 2s | train loss=1.5832, val loss(ave)=2.3897
iter = 19000(70\%)
                    train acc thru time ave=6m 2s, val acc thru time ave=0.369999
                    time taken = 6m 4s | train_loss=1.2720, val_loss(ave)=3.3501
iter = 19100(70\%)
                    train acc thru time ave=6m 4s, val acc thru time ave=0.373
iter = 19100(70\%)
iter = 19200(71\%)
                    time taken = 6m 5s | train_loss=0.6569, val_loss(ave)=2.5742
                    train acc thru time ave=6m 5s, val acc thru time ave=0.335000
iter = 19200(71\%)
iter = 19300(71\%)
                    time taken = 6m 7s | train loss=1.8828, val loss(ave)=2.4055
iter = 19300(71\%)
                    train acc thru time ave=6m 7s, val acc thru time ave=0.367000
                    time taken = 6m 9s | train loss=1.4897, val loss(ave)=2.7761
iter = 19400(71\%)
                    train_acc_thru_time_ave=6m 9s, val_acc thru time ave=0.353999
iter = 19400(71\%)
                    time taken = 6m 11s | train loss=1.4574, val loss(ave)=2.5699
iter = 19500(72\%)
                    train_acc_thru_time_ave=6m 11s, val_acc_thru_time_ave=0.353
iter = 19500(72\%)
iter = 19600(72\%)
                    time taken = 6m 13s | train loss=1.0938, val loss(ave)=2.2041
iter = 19600(72\%)
                    train acc thru time ave=6m 13s, val acc thru time ave=0.33599
iter = 19700(72\%)
                    time taken = 6m 14s | train loss=1.6390, val loss(ave)=2.642
                    train acc thru time ave=6m 14s, val acc thru time ave=0.344
iter = 19700(72\%)
iter = 19800(73\%)
                    time taken = 6m 16s | train loss=1.8259, val loss(ave)=2.6950
                    train acc thru time ave=6m 16s, val acc thru time ave=0.361
iter = 19800(73\%)
iter = 19900(73\%)
                    time taken = 6m 18s | train loss=1.4627, val loss(ave)=2.6592
                    train acc thru time ave=6m 18s, val acc thru time ave=0.333
iter = 19900(73\%)
                    time taken = 6m 20s | train loss=1.2091, val loss(ave)=2.6960
iter = 20000(74\%)
iter = 20000(74\%)
                    train acc thru time ave=6m 20s, val acc thru time ave=0.35700
                    time taken = 6m 22s | train loss=2.4690, val loss(ave)=2.6709
iter = 20100(74\%)
iter = 20100(74\%)
                    train_acc_thru_time_ave=6m 22s, val_acc_thru_time_ave=0.37799
iter = 20200(74\%)
                    time taken = 6m 23s | train loss=1.7508, val loss(ave)=2.7366
                    train acc thru time ave=6m 23s, val acc thru time ave=0.37199
iter = 20200(74\%)
iter = 20300(75\%)
                    time taken = 6m 25s | train loss=2.0950, val loss(ave)=2.4790
                    train acc thru time ave=6m 25s, val acc thru time ave=0.38699
iter = 20300(75\%)
iter = 20400(75\%)
                    time taken = 6m 27s | train loss=1.4475, val loss(ave)=2.679{
iter = 20400(75\%)
                    train acc thru time ave=6m 27s, val acc thru time ave=0.36399
iter = 20500(75\%)
                    time taken = 6m 29s | train loss=2.2695, val loss(ave)=2.5023
                    train acc thru time ave=6m 29s, val acc thru time ave=0.347
iter = 20500(75\%)
                    time taken = 6m 30s | train_loss=1.2968, val_loss(ave)=2.741
iter = 20600(76\%)
                    train acc thru time ave=6m 30s, val acc thru time ave=0.347
iter = 20600(76\%)
iter = 20700(76\%)
                    time taken = 6m 32s | train loss=1.5432, val loss(ave)=2.382!
                    train acc thru time_ave=6m 32s, val_acc_thru_time_ave=0.39199
iter = 20700(76\%)
iter = 20800(77\%)
                    time taken = 6m 34s | train loss=2.1458, val loss(ave)=2.204
                    train acc thru time ave=6m 34s, val acc thru time ave=0.35099
iter = 20800(77\%)
iter = 20900(77\%)
                    time taken = 6m 36s | train loss=1.1018, val loss(ave)=2.4886
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iter = 20900(77\%)
                    train acc thru time ave=6m 36s, val acc thru time ave=0.36199
                    time taken = 6m 38s | train loss=1.9379, val loss(ave)=2.947
iter = 21000(77\%)
                    train_acc_thru_time_ave=6m 38s, val_acc_thru_time_ave=0.382
iter = 21000(77\%)
iter = 21100(78\%)
                    time taken = 6m 39s | train_loss=1.1685, val_loss(ave)=2.3252
                    train acc thru time ave=6m 39s, val acc thru time ave=0.37299
iter = 21100(78\%)
iter = 21200(78\%)
                    time taken = 6m 41s | train loss=1.3580, val loss(ave)=3.104
                    train acc thru time ave=6m 41s, val acc thru time ave=0.35800
iter = 21200(78\%)
                    time taken = 6m 43s | train loss=1.6205, val loss(ave)=3.057{
iter = 21300(78\%)
                    train_acc_thru_time_ave=6m 43s, val_acc_thru_time_ave=0.37499
iter = 21300(78\%)
iter = 21400(79\%)
                    time taken = 6m 45s | train_loss=0.9315, val_loss(ave)=2.991
iter = 21400(79\%)
                    train acc thru time ave=6m 45s, val acc thru time ave=0.37599
                    time taken = 6m 46s | train loss=2.3089, val loss(ave)=2.5668
iter = 21500(79\%)
iter = 21500(79\%)
                    train_acc_thru_time_ave=6m 46s, val_acc_thru_time_ave=0.37
                    time taken = 6m 48s | train loss=1.5007, val loss(ave)=2.4439
iter = 21600(80\%)
                    train acc thru time ave=6m 48s, val acc thru time ave=0.39899
iter = 21600(80\%)
iter = 21700(80\%)
                    time taken = 6m 50s | train_loss=1.8719, val_loss(ave)=2.6740
                    train acc thru time ave=6m 50s, val acc thru time ave=0.34699
iter = 21700(80\%)
iter = 21800(80\%)
                    time taken = 6m 52s | train loss=1.4589, val loss(ave)=2.113
                    train_acc_thru_time_ave=6m 52s, val_acc_thru_time_ave=0.36999
iter = 21800(80\%)
iter = 21900(81\%)
                    time taken = 6m 54s | train_loss=1.7356, val_loss(ave)=2.6316
                    train_acc_thru_time_ave=6m 54s, val_acc_thru_time_ave=0.384
iter = 21900(81\%)
iter = 22000(81\%)
                    time taken = 6m 56s | train_loss=1.0889, val_loss(ave)=3.3154
                    train_acc_thru_time_ave=6m 56s, val_acc_thru_time ave=0.37999
iter = 22000(81\%)
                    time taken = 6m 57s | train loss=0.9760, val loss(ave)=2.3220
iter = 22100(81\%)
                    train_acc_thru_time_ave=6m 57s, val_acc_thru_time_ave=0.333
iter = 22100(81\%)
iter = 22200(82\%)
                    time taken = 6m 59s | train_loss=1.9148, val_loss(ave)=2.5772
                    train acc thru time ave=6m 59s, val acc thru time ave=0.37199
iter = 22200(82\%)
iter = 22300(82\%)
                    time taken = 7m 1s \mid train loss=2.1747, val loss(ave)=2.7972
                    train acc thru time ave=7m 1s, val acc thru time ave=0.36
iter = 22300(82\%)
                    time taken = 7m 3s | train loss=1.6137, val loss(ave)=3.5009
iter = 22400(82\%)
                    train acc thru time ave=7m 3s, val acc thru time ave=0.352999
iter = 22400(82\%)
iter = 22500(83\%)
                    time taken = 7m 4s | train loss=1.8429, val loss(ave)=2.4811
iter = 22500(83\%)
                    train acc thru time ave=7m 4s, val acc thru time ave=0.379000
iter = 22600(83\%)
                    time taken = 7m 6s \mid train loss=1.7330, val loss(ave)=2.5446
iter = 22600(83\%)
                    iter = 22700(84\%)
                    time taken = 7m 8s | train loss=1.8996, val loss(ave)=2.8270
iter = 22700(84\%)
                    train acc thru time ave=7m 8s, val acc thru time ave=0.371000
iter = 22800(84\%)
                    time taken = 7m 10s | train loss=1.6847, val loss(ave)=3.1092
                    train acc thru time ave=7m 10s, val acc thru time ave=0.37999
iter = 22800(84\%)
iter = 22900(84\%)
                    time taken = 7m 12s | train loss=0.7048, val loss(ave)=3.099
iter = 22900(84\%)
                    train_acc_thru_time_ave=7m 12s, val_acc_thru_time_ave=0.345
iter = 23000(85\%)
                    time taken = 7m 13s | train loss=0.8224, val loss(ave)=2.967!
iter = 23000(85\%)
                    train acc thru time ave=7m 13s, val acc thru time ave=0.38099
iter = 23100(85\%)
                    time taken = 7m 15s | train loss=2.8651, val loss(ave)=2.746
iter = 23100(85\%)
                    train acc thru time ave=7m 15s, val acc thru time ave=0.37899
iter = 23200(85\%)
                    time taken = 7m 17s | train loss=2.5489, val loss(ave)=2.809!
iter = 23200(85\%)
                    train acc thru time ave=7m 17s, val acc thru time ave=0.35200
                    time taken = 7m 19s | train loss=0.7354, val loss(ave)=2.2656
iter = 23300(86\%)
iter = 23300(86\%)
                    train acc thru time ave=7m 19s, val acc thru time ave=0.37499
iter = 23400(86\%)
                    time taken = 7m 21s | train loss=0.5311, val loss(ave)=2.670{
iter = 23400(86\%)
                    train_acc_thru_time_ave=7m 21s, val_acc_thru_time_ave=0.37099
iter = 23500(87\%)
                    time taken = 7m 23s | train loss=3.0536, val loss(ave)=2.6790
                    train acc thru time ave=7m 23s, val acc thru time ave=0.37399
iter = 23500(87\%)
iter = 23600(87\%)
                    time taken = 7m 25s | train loss=1.8817, val loss(ave)=2.173
                    train acc thru time ave=7m 25s, val acc thru time ave=0.38399
iter = 23600(87\%)
iter = 23700(87\%)
                    time taken = 7m 26s | train loss=0.2969, val loss(ave)=2.698
                    train_acc_thru_time_ave=7m 26s, val_acc thru time ave=0.37899
iter = 23700(87\%)
iter = 23800(88\%)
                    time taken = 7m 28s | train loss=2.1149, val loss(ave)=2.514
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train acc thru time_ave=7m 28s, val_acc_thru_time_ave=0.37799
iter = 23800(88\%)
                    time taken = 7m 30s | train loss=2.4242, val loss(ave)=2.382
iter = 23900(88\%)
                    train acc thru time ave=7m 30s, val acc thru time ave=0.37099
iter = 23900(88\%)
                    time taken = 7m 32s | train loss=2.3396, val loss(ave)=2.6043
iter = 24000(88\%)
iter = 24000(88\%)
                    train acc thru time ave=7m 32s, val acc thru time ave=0.37400
iter = 24100(89\%)
                    time taken = 7m 34s | train loss=1.8689, val loss(ave)=2.7602
iter = 24100(89\%)
                    train acc thru time ave=7m 34s, val acc thru time ave=0.38399
                    time taken = 7m 35s | train loss=2.1569, val loss(ave)=2.6754
iter = 24200(89\%)
                    train acc thru time ave=7m 35s, val acc thru time ave=0.38899
iter = 24200(89\%)
                    time taken = 7m 37s | train loss=1.1251, val loss(ave)=2.612
iter = 24300(90\%)
                    train_acc_thru_time_ave=7m 37s, val_acc_thru_time_ave=0.37799
iter = 24300(90\%)
                    time taken = 7m 39s | train loss=2.1828, val loss(ave)=2.180
iter = 24400(90\%)
                    train acc thru time ave=7m 39s, val acc thru time ave=0.41
iter = 24400(90\%)
                    time taken = 7m 41s | train loss=1.6761, val loss(ave)=2.6082
iter = 24500(90\%)
                    train acc thru time ave=7m 41s, val acc thru time ave=0.37799
iter = 24500(90\%)
iter = 24600(91\%)
                    time taken = 7m 43s | train loss=1.0393, val loss(ave)=2.682!
iter = 24600(91\%)
                    train acc thru time ave=7m 43s, val acc thru time ave=0.41099
                    time taken = 7m 45s | train loss=2.0749, val loss(ave)=2.2552
iter = 24700(91\%)
iter = 24700(91\%)
                    train acc thru time ave=7m 45s, val acc thru time ave=0.40299
                    time taken = 7m 46s | train loss=0.7032, val loss(ave)=2.3680
iter = 24800(91\%)
iter = 24800(91\%)
                    train acc thru time ave=7m 46s, val acc thru time ave=0.40499
                    time taken = 7m 48s | train loss=1.5661, val loss(ave)=2.603
iter = 24900(92\%)
                    train acc thru time ave=7m 48s, val acc thru time ave=0.33099
iter = 24900(92\%)
                    time taken = 7m 50s | train_loss=2.2296, val_loss(ave)=2.8762
iter = 25000(92\%)
                    train acc thru time ave=7m 50s, val acc thru time ave=0.36300
iter = 25000(92\%)
iter = 25100(92\%)
                    time taken = 7m 52s | train loss=1.1190, val loss(ave)=2.1530
                    train_acc_thru_time_ave=7m 52s, val_acc_thru_time_ave=0.398
iter = 25100(92\%)
                    time taken = 7m 54s | train loss=1.7067, val loss(ave)=2.214
iter = 25200(93\%)
iter = 25200(93\%)
                    train acc thru time ave=7m 54s, val acc thru time ave=0.36800
                    time taken = 7m 55s | train loss=1.8808, val loss(ave)=2.214
iter = 25300(93\%)
iter = 25300(93\%)
                    train acc thru time ave=7m 55s, val acc thru time ave=0.35499
                    time taken = 7m 57s | train loss=1.4532, val loss(ave)=2.614
iter = 25400(94\%)
                    train acc thru time ave=7m 57s, val acc thru time ave=0.40799
iter = 25400(94\%)
                    time taken = 7m 59s | train loss=1.7864, val loss(ave)=2.5152
iter = 25500(94\%)
iter = 25500(94\%)
                    train acc thru time ave=7m 59s, val acc thru time ave=0.37699
iter = 25600(94\%)
                    time taken = 8m 1s | train loss=1.5119, val loss(ave)=2.2826
                    iter = 25600(94\%)
iter = 25700(95\%)
                    time taken = 8m 3s | train loss=1.8001, val loss(ave)=3.6471
iter = 25700(95\%)
                    train acc thru time ave=8m 3s, val acc thru time ave=0.404999
                    time taken = 8m 4s | train loss=3.3583, val loss(ave)=2.7407
iter = 25800(95\%)
iter = 25800(95\%)
                    train acc thru time ave=8m 4s, val acc thru time ave=0.404999
iter = 25900(95\%)
                    time taken = 8m 6s | train loss=2.3825, val loss(ave)=2.5842
iter = 25900(95\%)
                    train acc thru time ave=8m 6s, val acc thru time ave=0.414
                    time taken = 8m 8s | train loss=2.0782, val loss(ave)=2.8047
iter = 26000(96\%)
iter = 26000(96\%)
                    train acc thru time ave=8m 8s, val acc thru time ave=0.395
iter = 26100(96\%)
                    time taken = 8m 10s | train loss=1.4913, val loss(ave)=2.8810
                    train acc thru time ave=8m 10s, val acc thru time ave=0.40299
iter = 26100(96\%)
iter = 26200(97\%)
                    time taken = 8m 12s | train loss=1.3295, val loss(ave)=2.2469
iter = 26200(97\%)
                    train acc thru time ave=8m 12s, val acc thru time ave=0.38499
                    time taken = 8m 13s | train loss=1.5638, val loss(ave)=2.429
iter = 26300(97\%)
iter = 26300(97\%)
                    train acc thru time ave=8m 13s, val acc thru time ave=0.33900
                    time taken = 8m 15s | train loss=0.8817, val loss(ave)=2.2633
iter = 26400(97\%)
iter = 26400(97\%)
                    train acc thru time ave=8m 15s, val acc thru time ave=0.39299
                    time taken = 8m 17s | train loss=1.4422, val loss(ave)=3.155{
iter = 26500(98\%)
                    train_acc_thru_time_ave=8m 17s, val_acc thru time ave=0.37499
iter = 26500(98\%)
                    time taken = 8m 19s | train loss=2.4650, val loss(ave)=2.7682
iter = 26600(98\%)
                    train acc thru time ave=8m 19s, val acc thru time ave=0.37499
iter = 26600(98\%)
                    +imp +akan - 2m 21g | +rain logg-3 6202 val logg/aval-2 0509
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iter = 26700(98%) | train_acc_thru_time_ave=8m 21s, val_acc_thru_time_ave=0.392
iter = 26800(99%) | train_acc_thru_time_ave=8m 22s | train_loss=0.5329, val_loss(ave)=3.154'
iter = 26800(99%) | train_acc_thru_time_ave=8m 22s, val_acc_thru_time_ave=0.38099
iter = 26900(99%) | time taken = 8m 24s | train_loss=1.6085, val_loss(ave)=2.8512'
iter = 26900(99%) | train_acc_thru_time_ave=8m 24s, val_acc_thru_time_ave=0.395999
```