```
import os
import glob
import pandas as pd
import torch
import torch.nn as nn
from torch.utils.data import Dataset
import torch.nn.functional as F
from scipy import signal
from scipy.io import wavfile
import matplotlib.pyplot as plt
from imutils.object detection import non max suppression
from torch.utils.data import Dataset, DataLoader
from collections import defaultdict
from torchvision import transforms
import cv2
import imgproc
from PIL import Image
import numpy as np
from tgdm import tgdm
import torch.optim as optim
from torch.nn import CTCLoss
from scipy.special import logsumexp
train data = pd.read csv('./Data/train data new.csv')
val data = pd.read csv('./Data/val data.csv')
train_img = './Data/Train'
val img = './Data/Validation'
\max len = 0
for i in train data['labels']:
    if type(i)!= str:
         print(i)
         if len(i)> max len:
             max len=len(i)
print(max len)
unique=set()
for index, row in train data.iterrows():
    unique.update(set(row['labels']))
    if '<' in set(row['labels']):</pre>
         print(index, row['labels'])
print(unique)
alphabets = list(unique)
17
{'H', 'J', ')', 'M', 'B', '-', 'x', ',', 'z', 'N', 'd', 't', 'F', 'ú', 's', 'R', 'a', '(', 'n', 'í', 'l', 'G', 'e', 'Q', 'S', 'u', 'á', 'Y', 'O', 'D', ';', 'q', 'y', 'g', 'V', 'A', 'ó', 'P', 'i', 'C', 'r', 'E',
```

```
'b', 'ñ', 'c', 'h', 'I', 'v', 'f', 'é', 'o', ':', 'U', 'p', 'j', 'T',
'L', '.', 'm'}
for i, r in train data.iterrows():
   x=r['labels']
   if "<" in x:
        print(i, x)
CHAR=list(alphabets)
print(len(CHAR))
CHAR2LABEL = {char: i + 1 for i, char in enumerate(CHAR)}
LABEL2CHAR = {label: char for char, label in CHAR2LABEL.items()}
LABEL2CHAR[0] = ""
59
target = [CHAR2LABEL[c] for c in "ync;"]
target
[33, 19, 45, 31]
x=torch.LongTensor([target])
x = torch.nn.functional.pad(x, (0, 17-len(target)), mode='constant',
value=0)
tensor([[33, 19, 45, 31, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
[0, 0]
class OCRDataset(Dataset):
   def init (self, csv file, class name=None, transform=None):
        self.data = pd.read csv(csv file)
        self.transform = transform
        self.class name=class name
   def len (self):
       return len(self.data)
   def getitem (self, idx):
        img name = self.data.iloc[idx, 0]
        if self.class name =="train":
            img name = "./Data/Train/"+img name
        elif self.class name == "val":
            img name = "./Data/Validation/"+img name
        else:
            print("enter valid class name")
        image = Image.open(img name)
        label = self.data.iloc[idx, 1]
        target= [CHAR2LABEL[c] for c in label]
        target length = [len(target)]
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target = torch.LongTensor(target)
        target = torch.nn.functional.pad(target, (0, max len-
target length[0]), mode='constant', value=0)
        target length = torch.LongTensor(target length)
        if self.transform:
            image = self.transform(image)
        return image, target, target length
img height=64
img width=160
transform = transforms.Compose([
   transforms.Resize((img height, img width)), # Resize image to a
fixed size
   transforms.ToTensor(), # Convert image to tensor
1)
train_dataset = OCRDataset(csv_file='./Data/train_data_new.csv',
class name="train", transform=transform)
val dataset = OCRDataset(csv file='./Data/val data.csv',
class name="val", transform=transform)
train loader = DataLoader(train dataset, batch size=32, shuffle=True)
val loader = DataLoader(val dataset, batch size=32, shuffle=False)
device = torch.device('cuda' if torch.cuda.is available() else 'cpu')
print(f'device: {device}')
device: cuda
class CRNN(nn.Module):
   def init (self, img channel, img height, img width, num class,
map to seg hidden=64, rnn hidden=256, leaky relu=False):
        super(CRNN, self). init ()
        self.cnn, (output channel, output height, output width) =
self._cnn_backbone(img_channel, img_height, img_width, leaky_relu)
        self.map to seq = nn.Linear(output channel * output height,
map to seq hidden)
        self.rnn1 = nn.LSTM(map to seq hidden, rnn hidden,
bidirectional=True)
        self.rnn2 = nn.LSTM(2 * rnn hidden, rnn hidden,
bidirectional=True)
        self.dense = nn.Linear(2 * rnn hidden, num class)
   def _cnn_backbone(self, img_channel, img_height, img_width,
```

```
leaky relu):
        assert img height % 16 == 0
        assert img width % 4 == 0
        # channels = [img channel, 64, 128, 256, 256, 512, 512, 512]
        channels = [img_channel, 32, 64, 256, 256, 512, 512, 512]
kernel_sizes = [3, 3, 3, 3, 3, 3, 2]
        strides = [1, 1, 1, 1, 1, 1, 1]
        paddings = [1, 1, 1, 1, 1, 0]
        cnn = nn.Sequential()
        def conv relu(i, batch norm=False):
            # shape of input: (batch, input channel, height, width)
            input channel = channels[i]
            output channel = channels[i+1]
            cnn.add module(
                f'conv{i}',
                nn.Conv2d(input channel, output channel,
kernel sizes[i], strides[i], paddings[i])
            if batch norm:
                 cnn.add module(f'batchnorm{i}',
nn.BatchNorm2d(output channel))
            relu = nn.LeakyReLU(0.2, inplace=True) if leaky relu else
nn.ReLU(inplace=True)
            cnn.add module(f'relu{i}', relu)
        # size of image: (channel, height, width) = (img channel,
img height, img width)
        conv relu(0)
        cnn.add module('pooling0', nn.MaxPool2d(kernel size=2,
stride=2))
        # (64, img height // 2, img width // 2)
        conv relu(1)
        cnn.add module('pooling1', nn.MaxPool2d(kernel size=2,
stride=2))
        # (128, img height // 4, img width // 4)
        conv relu(2)
        conv_relu(3)
        cnn.add module(
            'pooling2',
            nn.MaxPool2d(kernel size=(2, 1))
        ) # (256, img height // 8, img width // 4)
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conv relu(4, batch norm=True)
        conv relu(5, batch norm=True)
        cnn.add module(
            'pooling3',
            nn.MaxPool2d(kernel size=(2, 1))
        ) # (512, img_height // 16, img_width // 4)
        conv relu(6) # (512, img height // 16 - 1, img width // 4 -
1)
        output_channel, output_height, output_width = channels[-1],
img height // 16 - 1, img width // 4 - 1
        return cnn, (output channel, output height, output width)
    def forward(self, images):
        # shape of images: (batch, channel, height, width)
        conv = self.cnn(images)
        batch, channel, height, width = conv.size()
        conv = conv.view(batch, channel * height, width)
        conv = conv.permute(2, 0, 1) # (width, batch, feature)
        seq = self.map to seq(conv)
        recurrent, _ = self.rnn1(seq)
        recurrent, _ = self.rnn2(recurrent)
        output = self.dense(recurrent)
        return output # shape: (seg len, batch, num class)
common config = {
    'data dir': 'data/mnt/ramdisk/max/90kDICT32px/',
    'img \overline{\text{width}}': 100,
    'img height': 32,
    'map to seq hidden': 64,
    'rnn hidden': 256,
    'leaky relu': False,
}
num class = len(LABEL2CHAR) + 1
reload checkpoint="./torch checkpoints/22 3 24-14/crnn1 020000 loss0.9
203662287679987.pt"
crnn = CRNN(3, img_height, img_width, num_class,
            map_to_seq_hidden=common_config['map_to_seq_hidden'],
            rnn hidden=common config['rnn hidden'],
            leaky relu=common config['leaky relu'])
# if reload checkpoint:
      crnn. load state dict(torch.load(reload_checkpoint,
```

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map location=device))
crnn.to(device)
CRNN (
  (cnn): Sequential(
    (conv0): Conv2d(3, 32, kernel size=(3, 3), stride=(1, 1),
padding=(1, 1)
    (relu0): ReLU(inplace=True)
    (pooling0): MaxPool2d(kernel size=2, stride=2, padding=0,
dilation=1, ceil mode=False)
    (conv1): Conv2d(32, 64, kernel size=(3, 3), stride=(1, 1),
padding=(1, 1)
    (relu1): ReLU(inplace=True)
    (pooling1): MaxPool2d(kernel size=2, stride=2, padding=0,
dilation=1, ceil mode=False)
    (conv2): Conv2d(64, 256, kernel size=(3, 3), stride=(1, 1),
padding=(1, 1)
    (relu2): ReLU(inplace=True)
    (conv3): Conv2d(256, 256, kernel size=(3, 3), stride=(1, 1),
padding=(1, 1)
    (relu3): ReLU(inplace=True)
    (pooling2): MaxPool2d(kernel size=(2, 1), stride=(2, 1),
padding=0, dilation=1, ceil mode=False)
    (conv4): Conv2d(256, 512, kernel size=(3, 3), stride=(1, 1),
padding=(1, 1)
    (batchnorm4): BatchNorm2d(512, eps=1e-05, momentum=0.1,
affine=True, track running stats=True)
    (relu4): ReLU(inplace=True)
    (conv5): Conv2d(512, 512, kernel size=(3, 3), stride=(1, 1),
padding=(1, 1)
    (batchnorm5): BatchNorm2d(512, eps=1e-05, momentum=0.1,
affine=True, track running stats=True)
    (relu5): ReLU(inplace=True)
    (pooling3): MaxPool2d(kernel size=(2, 1), stride=(2, 1),
padding=0, dilation=1, ceil mode=False)
    (conv6): Conv2d(512, 512, kernel size=(2, 2), stride=(1, 1))
    (relu6): ReLU(inplace=True)
  (map to seq): Linear(in features=1536, out features=64, bias=True)
  (rnn1): LSTM(64, 256, bidirectional=True)
  (rnn2): LSTM(512, 256, bidirectional=True)
  (dense): Linear(in features=512, out features=61, bias=True)
)
train config = {
    'epochs': 200,
    'train batch size': 32,
    'eval batch size': 512,
    'lr': 0.0005,
    'show interval': 10,
```

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'valid interval': 500,
    'save interval': 50,
    'cpu workers': 4,
    'reload checkpoint':
"./torch checkpoints/22 3 24-14/crnn1_020000_loss0.7374361485085437.pt
    'valid max iter': 100,
    'decode method': 'beam search',
    'beam size': 10,
    'checkpoints dir': './torch checkpoints/22 3 24-14'
}
optimizer = optim.RMSprop(crnn.parameters(), lr=train config['lr'])
criterion = CTCLoss(reduction='sum', zero infinity=True)
criterion.to(device)
CTCLoss()
NINF = -1 * float('inf')
DEFAULT EMISSION THRESHOLD = 0.01
def reconstruct(labels, blank=0):
    new labels = []
    # merge same labels
    previous = None
    for l in labels:
        if l != previous:
            new labels.append(l)
            previous = 1
    # delete blank
    new labels = [l for l in new_labels if l != blank]
    return new labels
def greedy decode(emission log prob, blank=0, **kwargs):
    labels = np.argmax(emission log prob, axis=-1)
    labels = reconstruct(labels, blank=blank)
    return labels
def beam_search_decode(emission_log_prob, blank=0, **kwargs):
    beam size = kwargs['beam size']
    emission_threshold = kwargs.get('emission_threshold',
np.log(DEFAULT EMISSION THRESHOLD))
    length, class count = emission log prob.shape
    beams = [([], 0)] # (prefix, accumulated log prob)
    for t in range(length):
        new beams = []
        for prefix, accumulated log prob in beams:
```

```
for c in range(class count):
                log prob = emission log prob[t, c]
                if log prob < emission threshold:</pre>
                    continue
                new prefix = prefix + [c]
                \# \log(p1 * p2) = \log p1 + \log p2
                new accu log prob = accumulated log prob + log prob
                new beams.append((new prefix, new accu log prob))
        # sorted by accumulated log prob
        new beams.sort(key=lambda x: x[1], reverse=True)
        beams = new beams[:beam size]
    # sum up beams to produce labels
    total accu log prob = {}
    for prefix, accu_log_prob in beams:
        labels = tuple( reconstruct(prefix, blank))
        \# log(p1 + p2) = logsumexp([log p1, log p2])
        total accu log prob[labels] = \
            logsumexp([accu log prob, total accu log prob.get(labels,
NINF)))
    labels beams = [(list(labels), accu log prob)
                    for labels, accu log_prob in
total accu log prob.items()]
    labels beams.sort(key=lambda x: x[1], reverse=True)
    labels = labels beams[0][0]
    return labels
def prefix beam decode(emission log prob, blank=0, **kwargs):
    beam size = kwarqs['beam size']
    emission threshold = kwarqs.get('emission threshold',
np.log(DEFAULT EMISSION THRESHOLD))
    length, class count = emission log prob.shape
    beams = [(tuple(), (0, NINF))] # (prefix, (blank_log_prob,
non blank log prob))
    # initial of beams: (empty str, (log(1.0), log(0.0)))
    for t in range(length):
        new beams dict = defaultdict(lambda: (NINF, NINF)) # log(0.0)
= NINF
        for prefix, (lp b, lp nb) in beams:
            for c in range(class count):
                log prob = emission log prob[t, c]
                if log prob < emission threshold:</pre>
                    continue
```

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end t = prefix[-1] if prefix else None
                # if new prefix == prefix
                new lp b, new lp nb = new beams dict[prefix]
                if c == blank:
                    new_beams_dict[prefix] = (
                        logsumexp([new_lp_b, lp_b + log_prob, lp_nb +
log_prob]),
                        new lp nb
                    )
                    continue
                if c == end t:
                    new beams dict[prefix] = (
                        new lp b,
                        logsumexp([new lp nb, lp nb + log prob])
                    )
                # if new prefix == prefix + (c,)
                new prefix = prefix + (c,)
                new lp b, new lp nb = new beams dict[new prefix]
                if c != end t:
                    new beams dict[new prefix] = (
                        new lp b,
                        logsumexp([new lp nb, lp b + log prob, lp nb +
log_prob])
                else:
                    new beams dict[new prefix] = (
                        new lp b,
                        logsumexp([new lp nb, lp b + log prob])
                    )
        # sorted by log(blank prob + non blank prob)
        beams = sorted(new beams dict.items(), key=lambda x:
logsumexp(x[1]), reverse=True)
        beams = beams[:beam size]
    labels = list(beams[0][0])
    return labels
def ctc decode(log probs, label2char=None, blank=0,
method='beam_search', beam_size=10):
    emission log probs =
np.transpose(log_probs.detach().cpu().numpy(), (1, 0, 2))
    # size of emission_log_probs: (batch, length, class)
    decoders = {
```

```
'greedy': greedy decode,
        'beam search': beam search decode,
        'prefix beam search': prefix beam decode,
    decoder = decoders[method]
    decoded list = []
    for emission log prob in emission log probs:
        decoded = decoder(emission_log_prob, blank=blank,
beam size=beam size)
        if label2char:
            decoded = [label2char[l] for l in decoded]
        decoded list.append(decoded)
    return decoded list
def train batch(crnn, data, optimizer, criterion, device):
    crnn.train()
    images, targets, target lengths = [d.to(device) for d in data]
    logits = crnn(images)
    log probs = torch.nn.functional.log softmax(logits, dim=2)
    batch size = images.size(0)
    input lengths = torch.LongTensor([logits.size(0)] * batch size)
    target lengths = torch.flatten(target lengths)
    loss = criterion(log probs, targets, input lengths,
target lengths)
    optimizer.zero grad()
    loss.backward()
    torch.nn.utils.clip grad norm (crnn.parameters(), 5) # gradient
clipping with 5
    optimizer.step()
    return loss.item()
def evaluate(crnn, dataloader, criterion,
             max iter=None, decode method='beam search',
beam size=10):
    crnn.eval()
    tot count = 0
    tot loss = 0
    tot correct = 0
    wrong cases = []
    pbar total = max iter if max iter else len(dataloader)
    pbar = tqdm(total=pbar total, desc="Evaluate")
    with torch.no grad():
```

```
for i, data in enumerate(dataloader):
           if max iter and i >= max iter:
               break
           device = 'cuda' if next(crnn.parameters()).is cuda else
'cpu'
           images, targets, target_lengths = [d.to(device) for d in
datal
           logits = crnn(images)
           log probs = torch.nn.functional.log softmax(logits, dim=2)
           batch size = images.size(0)
           input lengths = torch.LongTensor([logits.size(0)] *
batch size)
           loss = criterion(log probs, targets, input lengths,
target lengths)
           preds = ctc decode(log probs, method=decode method,
beam size=beam size)
           reals = targets.cpu().numpy().tolist()
           target lengths = target lengths.cpu().numpy().tolist()
           tot count += batch size
           tot loss += loss.item()
           target length counter = 0
           \# i = 0
           for pred, real, target_length in zip(preds, reals,
target lengths):
               # print(pred)
               # print(target length)
               # print(real)
               # print("-----
               real = real[0:target length[0]]
               # print(real)
# target length counter += target length[0]
               if pred == real:
                   tot correct += 1
                   wrong cases.append((real, pred))
               # i+=1
           pbar.update(1)
       pbar.close()
   evaluation = {
```

```
'loss': tot loss / tot_count,
        'acc': tot correct / tot count,
        'wrong cases': wrong cases
    return evaluation
i = 1
for epoch in range(1, train config['epochs'] + 1):
    print(f'epoch: {epoch}')
    tot train loss = 0.
    tot train count = 0
    for train_data in train_loader:
        loss = train batch(crnn, train data, optimizer, criterion,
device)
        train size = train data[0].size(0)
        tot train loss += loss
        tot train count += train size
        if i % train config['show interval'] == 0:
            print('train_batch_loss[', i, ']: ', loss / train_size)
        if i % train config['valid interval'] == 0:
            evaluation = evaluate(crnn, val loader, criterion,
decode method=train config['decode method'],
beam size=train config['beam size'])
            print('valid_evaluation: loss={loss},
acc={acc}'.format(**evaluation))
            if i % train_config['save_interval'] == 0:
                prefix = 'crnn1'
                loss = evaluation['loss']
                save model path =
os.path.join(train config['checkpoints dir'],
f'{prefix} {i:06} loss{loss}.pt')
                torch.save(crnn.state_dict(), save_model_path)
                print('save model at ', save model path)
        i += 1
    print('train loss: ', tot train loss / tot train count)
epoch: 1
train batch loss[ 10 ]: 19.372303009033203
train batch loss[ 20 ]: 7.483538627624512
train_batch_loss[ 30 ]: 5.671645164489746
train batch loss[ 40 ]: 3.922644853591919
train_batch_loss[ 50 ]: 3.880770444869995
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train batch loss[ 60 ]:
                         3.2430238723754883
train batch loss[ 70 ]:
                         2.607043743133545
train batch loss[ 80 ]:
                         2.621840238571167
train batch loss[ 90 ]:
                         2.2539937496185303
train batch loss[ 100 ]:
                          2.0676589012145996
train loss: 9.238951490999497
epoch: 2
train batch loss[ 110 ]:
                          1.0349032878875732
train batch loss[ 120 ]:
                          1.1241497993469238
train batch loss[ 130 ]:
                          0.48435676097869873
train batch loss[ 140 ]:
                          0.5460381507873535
train batch loss[ 150 ]:
                          0.3112417459487915
train_batch_loss[ 160 ]:
                          1.5099823474884033
train_batch loss[ 170 ]:
                          0.5344560146331787
train batch loss[ 180 ]:
                          0.6993008255958557
train batch loss[ 190 ]:
                          0.3589324951171875
train batch loss[ 200 ]:
                          0.425456702709198
train loss: 0.6760072655978144
epoch: 3
train_batch_loss[ 210 ]:
                          0.20357877016067505
train batch loss[ 220 ]:
                          0.20573048293590546
train batch loss[ 230 ]:
                          0.5479603409767151
train batch loss[ 240 ]:
                          0.06727345287799835
train batch loss[ 250 ]:
                          0.03894031047821045
train_batch_loss[ 260 ]:
                          0.28733325004577637
train batch loss[ 270 ]:
                          0.4901096820831299
train_batch_loss[ 280 ]:
                          0.02140367031097412
train_batch loss[ 290 ]:
                          0.38331887125968933
train batch loss[ 300 ]:
                          0.07707279175519943
train_loss: 0.2715784898780861
epoch: 4
train_batch_loss[ 310 ]:
                          0.047732945531606674
train batch loss[ 320 ]:
                          0.0364430695772171
train batch loss[ 330 ]:
                          0.29401567578315735
train batch loss[ 340 ]:
                          0.015220015309751034
                          0.03525819629430771
train batch loss[ 350 ]:
train batch loss[ 360 ]:
                          0.08738775551319122
train batch loss[ 370 ]:
                          0.03228221833705902
train_batch_loss[ 380 ]:
                          0.023368297144770622
train batch loss[ 390 ]:
                          0.05619054287672043
train_batch_loss[ 400 ]:
                          0.07008052617311478
train loss: 0.10056971094029939
epoch: 5
train batch loss[ 410 ]:
                          0.13262337446212769
train batch loss[ 420 ]:
                          0.005948426201939583
train_batch_loss[ 430 ]:
                          0.030007749795913696
train batch loss[ 440 ]:
                          0.0120000708848238
train batch loss[ 450 ]:
                          0.13480237126350403
train batch loss[ 460 ]:
                          0.05024081468582153
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train_batch loss[ 470 ]:
                          0.031314171850681305
train batch loss[ 480 ]:
                          0.01593147963285446
train batch loss[ 490 ]:
                          0.1164996474981308
train_batch_loss[ 500 ]: 0.0029667445924133062
Evaluate: 100% | 12/12 [00:00<00:00, 19.88it/s]
valid_evaluation: loss=0.6897785509136362, acc=0.8901408450704226
save model at
./torch checkpoints/22 3 24-14/crnn1 000500 loss0.6897785509136362.pt
train loss: 0.058696156848586055
epoch: 6
train_batch_loss[ 510 ]:
                          0.0809255987405777
train batch loss[ 520 ]:
                          0.017460910603404045
train batch loss[ 530 ]:
                          0.038562994450330734
train batch loss[ 540 ]:
                          0.001790744485333562
train batch loss[ 550 ]:
                          0.007386916317045689
train_batch_loss[ 560 ]:
                          0.005571088753640652
train batch loss[ 570 ]:
                          0.37470731139183044
train batch loss[ 580 ]:
                          0.006793775595724583
train batch loss[ 590 ]:
                          0.0015091741224750876
train batch loss[ 600 ]:
                          0.04163285344839096
train loss: 0.031865212570729336
epoch: 7
train batch loss[ 610 ]:
                          0.25154417753219604
train batch loss[ 620 ]:
                          0.0022244970314204693
train batch loss[ 630 ]:
                          0.002843213267624378
train batch loss[ 640 ]:
                          0.0018515628762543201
train batch loss[ 650 ]:
                          0.0002744632656686008
train batch loss[ 660 ]:
                          0.010295633226633072
train batch loss[ 670 ]:
                          0.0021177686285227537
train_batch_loss[ 680 ]:
                          0.008272813633084297
train_batch loss[ 690 ]:
                          0.029299171641469002
train batch loss[ 700 ]:
                          0.0047134291380643845
train loss: 0.013777599834984292
epoch: 8
train_batch_loss[ 710 ]:
                          0.0008343457011505961
train batch loss[ 720 ]:
                          0.17940367758274078
train_batch_loss[ 730 ]:
                          0.0017866845009848475
train batch loss[ 740 ]:
                          0.00434489781036973
train batch loss[ 750 ]:
                          0.0041722203604876995
train batch loss[ 760 ]:
                          0.0006400017300620675
train batch loss[ 770 ]:
                          0.0004397871089167893
train batch loss[ 780 ]:
                          0.008351795375347137
train batch loss[ 790 ]:
                          0.012972461991012096
train_batch_loss[ 800 ]:
                          0.00789592508226633
train loss: 0.009819868203741259
epoch: 9
train batch loss[ 810 ]:
                          0.0018536625429987907
train batch loss[ 820 ]:
                          0.0013186573050916195
```

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train_batch loss[ 830 ]:
                          0.000665524392388761
train batch loss[ 840 ]:
                          0.0002579456486273557
train batch loss[ 850 ]:
                          0.06843160837888718
train batch loss[ 860 ]:
                          0.0009937146678566933
train batch loss[ 870 ]:
                          0.00045309087727218866
train_batch_loss[ 880 ]:
                          0.01477610133588314
train batch loss[ 890 ]:
                          0.007843228057026863
train batch loss[ 900 ]:
                          0.001246383530087769
train loss: 0.01516920054583334
epoch: 10
train batch loss[ 910 ]:
                          0.0020410516299307346
train batch loss[ 920 ]:
                          0.0011538650142028928
train_batch_loss[ 930 ]:
                          0.0017904335400089622
train batch loss[ 940 ]:
                          0.00044194882502779365
train batch loss[ 950 ]:
                          0.00259743956848979
train batch loss[ 960 ]:
                          0.17456968128681183
train batch loss[ 970 ]:
                          0.005051311105489731
train batch loss[ 980 ]:
                          0.0016960534267127514
                          0.026453211903572083
train batch loss[ 990 ]:
train_batch_loss[ 1000 ]: 0.0011051804758608341
Evaluate: 100% | 12/12 [00:00<00:00, 17.88it/s]
valid evaluation: loss=0.6478889861576994, acc=0.9014084507042254
save model at
./torch checkpoints/22 3 24-14/crnn1 001000 loss0.6478889861576994.pt
train batch loss[ 1010 ]: 0.0008141401534279188
train loss: 0.017627602046494592
epoch: 11
train batch loss[ 1020 ]:
                           0.013790984638035297
train batch loss[ 1030 ]:
                           0.001188145950436592
train_batch_loss[ 1040 ]:
                           0.000965196406468749
train_batch loss[ 1050 ]:
                           0.12969419360160828
train batch loss[ 1060 ]:
                           0.00247611734084785
train batch loss[ 1070 ]:
                           0.0044930726289749146
train batch loss[ 1080 ]:
                           0.0005054682260379195
train_batch_loss[ 1090 ]:
                           0.004293041303753853
train batch loss[ 1100 ]:
                           0.00270539871416986
train_batch_loss[ 1110 ]:
                           0.0029227647464722395
train loss: 0.031067475856647746
epoch: 12
train batch loss[ 1120 ]:
                           0.00038317733560688794
train batch loss[ 1130 ]:
                           0.0007736668922007084
train batch loss[ 1140 ]:
                           0.0002284058864461258
train batch loss[ 1150 ]:
                           0.0004131175228394568
train_batch_loss[ 1160 ]:
                           0.0005612801178358495
train batch loss[ 1170 ]:
                           0.002521780552342534
train batch loss[ 1180 ]:
                           0.11001337319612503
train_batch_loss[ 1190 ]:
                           0.00036660110345110297
train batch loss[ 1200 ]:
                           0.004555473104119301
```

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train_batch_loss[ 1210 ]: 0.0017323005013167858
train loss: 0.010638594267975778
epoch: 13
train batch loss[ 1220 ]:
                           0.0006742044351994991
train batch loss[ 1230 ]:
                           0.00035295996349304914
train_batch_loss[ 1240 ]:
                           0.0003626111429184675
                           0.00034642385435290635
train batch loss[ 1250 ]:
train batch loss[ 1260 ]:
                           0.06513668596744537
train batch loss[ 1270 ]:
                           0.0012085926719009876
train batch loss[ 1280 ]:
                           0.0008057584636844695
train_batch_loss[ 1290 ]:
                           0.0006547405500896275
train batch loss[ 1300 ]:
                           0.0009600655175745487
train_batch_loss[ 1310 ]:
                           0.0009795769583433867
train loss: 0.011147461996960843
epoch: 14
train batch loss[ 1320 ]:
                           0.00010881051275646314
train batch loss[ 1330 ]:
                           0.0004377130826469511
train batch loss[ 1340 ]:
                           0.000221165333641693
train batch loss[ 1350 ]:
                           0.0005120524438098073
train batch loss[ 1360 ]:
                           0.0002646079519763589
train batch loss[ 1370 ]:
                           0.00036186346551403403
train batch loss[ 1380 ]:
                           0.0003988980024587363
train_batch_loss[ 1390 ]:
                           0.0005005031707696617
train batch loss[ 1400 ]:
                           0.12344284355640411
train_batch loss[ 1410 ]:
                           0.0004724864265881479
train loss: 0.007462203835363695
epoch: 15
train batch loss[ 1420 ]:
                           0.0001760228187777102
train batch loss[ 1430 ]:
                           0.00037469883682206273
train_batch_loss[ 1440 ]:
                           8.353582234121859e-05
train batch loss[ 1450 ]:
                           0.00069779361365363
train_batch_loss[ 1460 ]:
                           0.0003823389997705817
train batch loss[ 1470 ]:
                           0.00031966142705641687
train batch loss[ 1480 ]:
                           0.0002768495469354093
train batch loss[ 1490 ]:
                           0.00031127792317420244
train batch loss[ 1500 ]:
                           0.004473497159779072
Evaluate: 100%|
                  | 12/12 [00:00<00:00, 25.42it/s]
valid evaluation: loss=0.718074529607531, acc=0.9267605633802817
save model at
./torch checkpoints/22 3 24-14/crnn1 001500 loss0.718074529607531.pt
train batch loss[ 1510 ]: 0.09918373078107834
train loss: 0.004547127881623826
epoch: 16
train batch loss[ 1520 ]:
                           0.00019838387379422784
train batch loss[ 1530 ]:
                           0.000281885324511677
train batch loss[ 1540 ]:
                           0.0005132326041348279
                           0.00029055826598778367
train_batch_loss[ 1550 ]:
train batch loss[ 1560 ]:
                           0.0008752649300731719
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train_batch loss[ 1570 ]:
                            0.0007927757105790079
train batch loss[ 1580 ]:
                            0.0002200127491960302
train batch loss[ 1590 ]:
                            0.00013318190758582205
train batch loss[ 1600 ]:
                            0.005811022594571114
train batch loss[ 1610 ]:
                            0.000323861138895154
train loss: 0.008103276984444829
epoch: 17
train batch loss[ 1620 ]:
                            0.00023107223387341946
train batch loss[ 1630 ]:
                            8.623873873148113e-05
                            0.00015012350922916085
train batch loss[ 1640 ]:
train batch loss[ 1650 ]:
                            0.0001240697893081233
train batch loss[ 1660 ]:
                            0.0004153860209044069
train_batch_loss[ 1670 ]:
                            0.00014071157784201205
train batch loss[ 1680 ]:
                            5.533983130590059e-05
train batch loss[ 1690 ]:
                            0.00011573568190215155
train batch loss[ 1700 ]:
                            0.0026523503474891186
train batch loss[ 1710 ]:
                            0.0004052171134389937
train loss: 0.011290451762562456
epoch: 18
train batch loss[ 1720 ]:
                            8.773379522608593e-05
train batch loss[ 1730 ]:
                            0.00025838438887149096
train batch loss[ 1740 ]:
                            0.0004781555908266455
train batch loss[ 1750 ]:
                            0.00030306720873340964
train batch loss[ 1760 ]:
                            0.00010513347660889849
train batch loss[ 1770 ]:
                            0.0004062147345393896
train batch loss[ 1780 ]:
                            0.15201550722122192
train_batch_loss[ 1790 ]:
                            0.0005542442668229342
                            0.00014663168985862285
train batch loss[ 1800 ]:
train batch loss[ 1810 ]:
                            0.0012764716520905495
train loss: 0.011654567620565064
epoch: 19
train_batch_loss[ 1820 ]:
                            0.0006617754697799683
train batch loss[ 1830 ]:
                            0.0010042436188086867
train batch loss[ 1840 ]:
                            0.0001308086357312277
train batch loss[ 1850 ]:
                            9.448120545130223e-05
train batch loss[ 1860 ]:
                            0.0009222050430253148
train batch loss[ 1870 ]:
                            8.928417810238898e-05
train batch loss[ 1880 ]:
                            0.00014368815755005926
train_batch_loss[ 1890 ]:
                            0.0004215527733322233
train batch loss[ 1900 ]:
                            0.00846844632178545
train_batch_loss[ 1910 ]:
                            0.060027576982975006
train loss: 0.0040825512764222785
epoch: 20
train batch loss[ 1920 ]:
                            5.756593600381166e-05
train batch loss[ 1930 ]:
                            0.0006541436305269599
train_batch_loss[ 1940 ]:
                            0.021914096549153328
train batch loss[ 1950 ]:
                            0.012921233661472797
train batch loss[ 1960 ]:
                            7.206759619293734e-05
train batch loss[ 1970 ]:
                            0.01237889751791954
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train batch loss[ 1980 ]:
                           0.06577296555042267
train batch loss[ 1990 ]:
                           0.0002030567266047001
train batch loss[ 2000 ]:
                           0.003936159424483776
Evaluate: 100%|
                 | 12/12 [00:00<00:00, 24.63it/s]
valid evaluation: loss=0.6943803461504654, acc=0.9154929577464789
save model at
./torch checkpoints/22 3 24-14/crnn1 002000 loss0.6943803461504654.pt
train batch loss[ 2010 ]: 0.012968454509973526
train_batch_loss[ 2020 ]:
                           1.549719551500554e-06
train loss: 0.005468629704539459
epoch: 21
                           0.0005490328767336905
train batch loss[ 2030 ]:
train batch loss[ 2040 ]:
                           5.50177828699816e-05
train batch loss[ 2050 ]:
                           0.00029034141334705055
train batch loss[ 2060 ]:
                           5.7743141951505095e-05
train_batch_loss[ 2070 ]:
                           0.0001596153888385743
train batch loss[ 2080 ]:
                           2.623907676024828e-05
train batch loss[ 2090 ]:
                           0.00030369460000656545
train batch loss[ 2100 ]:
                           0.0003898900467902422
train batch loss[ 2110 ]:
                           6.785152072552592e-05
train_batch_loss[ 2120 ]:
                           0.00768713653087616
train loss: 0.0070651074595520546
epoch: 22
train batch loss[ 2130 ]:
                           0.0002657075528986752
train batch loss[ 2140 ]:
                           7.78252724558115e-05
train batch loss[ 2150 ]:
                           6.850161298643798e-05
train batch loss[ 2160 ]:
                           0.00017766846576705575
train batch loss[ 2170 ]:
                           0.00039131558150984347
                           0.00015298978541977704
train batch loss[ 2180 ]:
train_batch_loss[ 2190 ]:
                           0.0006065190536901355
train_batch loss[ 2200 ]:
                           0.01717989705502987
train batch loss[ 2210 ]:
                           0.0006696867640130222
train batch loss[ 2220 ]:
                           0.00036504596937447786
train loss: 0.007406343126855907
epoch: 23
train batch loss[ 2230 ]:
                           0.0003512697876431048
train_batch_loss[ 2240 ]:
                           0.001052643172442913
train batch loss[ 2250 ]:
                           5.215994315221906e-05
train batch loss[ 2260 ]:
                           0.00018479512073099613
train batch loss[ 2270 ]:
                           6.580898480024189e-05
train batch loss[ 2280 ]:
                           0.0046285539865493774
train batch loss[ 2290 ]:
                           0.00013366206258069724
train batch loss[ 2300 ]:
                           0.0008421932579949498
train_batch_loss[ 2310 ]:
                           4.480629286263138e-05
train batch loss[ 2320 ]:
                           7.978064240887761e-05
train loss: 0.003868096853170109
epoch: 24
train batch loss[ 2330 ]: 0.00010981154628098011
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train_batch loss[ 2340 ]:
                           0.12387946993112564
train batch loss[ 2350 ]:
                           0.00010515112080611289
train batch loss[ 2360 ]:
                           7.120940426830202e-05
train batch loss[ 2370 ]:
                           2.1406633095466532e-05
train batch loss[ 2380 ]:
                           0.148885115981102
train_batch_loss[ 2390 ]:
                           0.0023112103808671236
train batch loss[ 2400 ]:
                           0.00011827990238089114
train batch loss[ 2410 ]:
                           8.325827366206795e-05
train batch loss[ 2420 ]:
                           0.03837360814213753
train loss: 0.00470023136208864
epoch: 25
train batch loss[ 2430 ]:
                           5.2326529839774594e-05
train_batch_loss[ 2440 ]:
                           0.021760813891887665
train batch loss[ 2450 ]:
                           1.1962310964008793e-05
train batch loss[ 2460 ]:
                           0.001803300459869206
train_batch loss[ 2470 ]:
                           0.0015516811981797218
train batch loss[ 2480 ]:
                           0.0003279408847447485
train batch loss[ 2490 ]:
                           0.0002800058573484421
train batch loss[ 2500 ]: 0.00013630534522235394
Evaluate: 100% | 12/12 [00:00<00:00, 18.32it/s]
valid evaluation: loss=0.6412615007078144, acc=0.9295774647887324
save model at
./torch checkpoints/22 3 24-14/crnn1 002500 loss0.6412615007078144.pt
train batch loss[ 2510 ]: 0.004957736935466528
train batch loss[ 2520 ]:
                           6.543932249769568e-05
train loss: 0.0020384608265928777
epoch: 26
train batch loss[ 2530 ]:
                           7.288408232852817e-05
train batch loss[ 2540 ]:
                           0.11480426788330078
train_batch_loss[ 2550 ]:
                           0.00010704529995564371
train_batch loss[ 2560 ]:
                           0.00015306362183764577
train batch loss[ 2570 ]:
                           0.000521920039318502
train batch loss[ 2580 ]:
                           4.467490725801326e-05
train batch loss[ 2590 ]:
                           2.7848122044815682e-05
train_batch_loss[ 2600 ]:
                           7.188160088844597e-05
                           6.299879896687344e-05
train batch loss[ 2610 ]:
train_batch_loss[ 2620 ]:
                           0.00012363228597678244
train loss: 0.004034848863994159
epoch: 27
train batch loss[ 2630 ]:
                           3.0213755962904543e-05
train batch loss[ 2640 ]:
                           1.371079997625202e-05
train batch loss[ 2650 ]:
                           0.0004354424017947167
train batch loss[ 2660 ]:
                           0.00270151998847723
train_batch_loss[ 2670 ]:
                           0.00017742844647727907
train batch loss[ 2680 ]:
                           0.00016130993026308715
train batch loss[ 2690 ]:
                           9.05711785890162e-05
train_batch_loss[ 2700 ]:
                           0.00012575602158904076
train batch loss[ 2710 ]:
                           0.000448672246420756
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train_batch_loss[ 2720 ]: 6.968146044528112e-05
train loss: 0.002639514623410442
epoch: 28
train batch loss[ 2730 ]:
                           3.827832915703766e-05
train batch loss[ 2740 ]:
                           2.876323924283497e-05
train_batch_loss[ 2750 ]:
                           3.575992013793439e-05
train batch loss[ 2760 ]:
                           0.00012052319652866572
train batch loss[ 2770 ]:
                           0.0030051793437451124
train batch loss[ 2780 ]:
                           0.002744107972830534
train batch loss[ 2790 ]:
                           0.10324802994728088
train_batch_loss[ 2800 ]:
                           0.0008117379038594663
train batch loss[ 2810 ]:
                           0.0010048378026112914
train_batch_loss[ 2820 ]:
                           8.216180140152574e-05
train loss: 0.022212619216877286
epoch: 29
train_batch loss[ 2830 ]:
                           0.12595339119434357
train batch loss[ 2840 ]:
                           0.0032650430221110582
train batch loss[ 2850 ]:
                           0.0014045056886970997
train batch loss[ 2860 ]:
                           0.010871010832488537
train batch loss[ 2870 ]:
                           0.00015024363528937101
train batch loss[ 2880 ]:
                           0.00010296593245584518
train batch loss[ 2890 ]:
                           0.0001425657537765801
train batch loss[ 2900 ]:
                           0.00012857638648711145
train batch loss[ 2910 ]:
                           0.014583028852939606
train_batch loss[ 2920 ]:
                           0.0005083355936221778
train loss: 0.01717835754557474
epoch: 30
train batch loss[ 2930 ]:
                           0.06072421371936798
train batch loss[ 2940 ]:
                           0.0029416142497211695
train_batch_loss[ 2950 ]:
                           7.969045691424981e-05
train batch loss[ 2960 ]:
                           0.000861289503518492
train_batch_loss[ 2970 ]:
                           9.497387509327382e-05
                           0.0024234135635197163
train batch loss[ 2980 ]:
train batch loss[ 2990 ]:
                           0.0014347422402352095
train batch loss[ 3000 ]:
                           0.004115764982998371
Evaluate: 100% | 12/12 [00:00<00:00, 25.11it/s]
valid evaluation: loss=0.683659216341838, acc=0.9267605633802817
save model at
./torch checkpoints/22 3 24-14/crnn1 003000 loss0.683659216341838.pt
train batch loss[ 3010 ]: 0.00017089824541471899
train batch loss[ 3020 ]:
                           0.029777532443404198
train_batch_loss[ 3030 ]:
                           7.547981416185697e-07
train loss: 0.011348774602189351
epoch: 31
train batch loss[ 3040 ]:
                           9.973016130970791e-05
train batch loss[ 3050 ]:
                           3.735254722414538e-05
train_batch_loss[ 3060 ]:
                           0.000184153308509849
train batch loss[ 3070 ]: 0.0010999921942129731
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train batch loss[ 3080 ]:
                           3.4048251109197736e-05
train batch loss[ 3090 ]:
                           0.0010235634399577975
train batch loss[ 3100 ]:
                           0.00043687084689736366
train batch loss[ 3110 ]:
                           2.8268823371035978e-05
train batch loss[ 3120 ]:
                           0.000148110615555197
train_batch_loss[ 3130 ]:
                           0.0003900147567037493
train loss: 0.004181491226019785
epoch: 32
train batch loss[ 3140 ]:
                           0.0004628218594007194
train batch loss[ 3150 ]:
                           0.0009366644662804902
train_batch_loss[ 3160 ]:
                           1.575479473103769e-05
train batch loss[ 3170 ]:
                           2.3435146431438625e-05
train_batch_loss[ 3180 ]:
                           0.007656588219106197
train batch loss[ 3190 ]:
                           0.00030760213849134743
train batch loss[ 3200 ]:
                           3.0500994398607872e-05
train batch loss[ 3210 ]:
                           7.838844612706453e-05
train batch loss[ 3220 ]:
                           0.0009529205271974206
train_batch_loss[ 3230 ]:
                           0.00019945099484175444
train loss: 0.005187938686696431
epoch: 33
train batch loss[ 3240 ]:
                           6.335706711979583e-05
train batch loss[ 3250 ]:
                           7.085401739459485e-05
train batch loss[ 3260 ]:
                           0.0023773503489792347
train batch loss[ 3270 ]:
                           0.00013800335000269115
train batch loss[ 3280 ]:
                           6.213366577867419e-05
train batch loss[ 3290 ]:
                           1.7769052647054195e-05
train_batch_loss[ 3300 ]:
                           0.0005510289338417351
                           0.3301568925380707
train batch loss[ 3310 ]:
train batch loss[ 3320 ]:
                           0.00024375205975957215
train_batch_loss[ 3330 ]:
                           2.9637816624017432e-05
train loss: 0.008070607438983435
epoch: 34
train batch loss[ 3340 ]:
                           6.585227674804628e-05
train batch loss[ 3350 ]:
                           5.373325984692201e-05
train batch loss[ 3360 ]:
                           0.0006447017658501863
train batch loss[ 3370 ]:
                           0.00021892281074542552
train batch loss[ 3380 ]:
                           0.00035581435076892376
train batch loss[ 3390 ]:
                           2.2774398530600592e-05
train_batch_loss[ 3400 ]:
                           4.3835548240167554e-06
train batch loss[ 3410 ]:
                           1.6471658454975113e-05
train batch loss[ 3420 ]:
                           0.0023139503318816423
train batch loss[ 3430 ]:
                           3.861795266857371e-05
train loss: 0.0053999076509189175
epoch: 35
                           3.103381095570512e-05
train batch loss[ 3440 ]:
train_batch_loss[ 3450 ]:
                           1.835826515161898e-05
train batch loss[ 3460 ]:
                           9.536653124087024e-06
train batch loss[ 3470 ]:
                           4.5379223593045026e-05
train batch loss[ 3480 ]:
                           4.0735729271546006e-05
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train batch loss[ 3490 ]: 0.00016892740677576512
train batch loss[ 3500 ]: 1.756182246026583e-05
Evaluate: 100% | 12/12 [00:00<00:00, 27.02it/s]
valid evaluation: loss=0.7209868235907084, acc=0.9295774647887324
save model at
./torch_checkpoints/22_3_24-14/crnn1 003500 loss0.7209868235907084.pt
train batch loss[ 3510 ]: 2.5238492526113987e-05
train batch loss[ 3520 ]: 8.2187179941684e-06
train_batch_loss[ 3530 ]:
                           4.395045107230544e-05
train loss: 0.0010735500225341847
epoch: 36
train batch loss[ 3540 ]:
                           8.467659790767357e-05
train batch loss[ 3550 ]:
                           2.315503661520779e-05
train batch loss[ 3560 ]:
                           5.352244625100866e-05
train batch loss[ 3570 ]:
                           0.0002468572638463229
train_batch_loss[ 3580 ]:
                           0.00010323063906980678
train batch loss[ 3590 ]:
                           3.165143425576389e-05
train batch loss[ 3600 ]:
                           4.051799260196276e-05
train batch loss[ 3610 ]:
                           2.9768394597340375e-05
train batch loss[ 3620 ]:
                           0.00023632272495888174
train_batch_loss[ 3630 ]:
                           0.00034668491571210325
train loss: 0.003315907942977726
epoch: 37
train batch loss[ 3640 ]:
                           1.8432845536153764e-05
train batch loss[ 3650 ]:
                           1.6335743566742167e-05
train batch loss[ 3660 ]:
                           0.00010365767229814082
train batch loss[ 3670 ]:
                           0.07771771401166916
train batch loss[ 3680 ]:
                           6.47495617158711e-05
train batch loss[ 3690 ]:
                           0.007991407066583633
train_batch_loss[ 3700 ]:
                           0.003913576249033213
train_batch loss[ 3710 ]:
                           0.00041148392483592033
train batch loss[ 3720 ]:
                           3.296594150015153e-05
train batch loss[ 3730 ]:
                           0.005174156278371811
train_loss: 0.01780328753274129
epoch: 38
train batch loss[ 3740 ]:
                           0.00033260841155424714
train_batch_loss[ 3750 ]:
                           0.00014174668467603624
train batch loss[ 3760 ]:
                           0.00031815338297747076
train batch loss[ 3770 ]:
                           0.0002296319871675223
train batch loss[ 3780 ]:
                           0.0035957396030426025
train batch loss[ 3790 ]:
                           0.020061291754245758
train batch loss[ 3800 ]:
                           6.480753654614091e-05
train batch loss[ 3810 ]:
                           8.596322732046247e-05
train_batch_loss[ 3820 ]:
                           6.848794873803854e-05
train batch loss[ 3830 ]:
                           0.00010535708133829758
train loss: 0.006687246892307796
epoch: 39
train batch loss[ 3840 ]: 9.681854135124013e-05
```

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train_batch loss[ 3850 ]:
                           2.6718616936705075e-05
train batch loss[ 3860 ]:
                           0.03813456743955612
train batch loss[ 3870 ]:
                           5.322609649738297e-05
train batch loss[ 3880 ]:
                           4.713309681392275e-05
train batch loss[ 3890 ]:
                           0.00018838686810340732
train_batch_loss[ 3900 ]:
                           0.002560206688940525
train batch loss[ 3910 ]:
                           7.723439193796366e-05
train batch loss[ 3920 ]:
                           6.908321665832773e-05
                           0.00017573419609107077
train batch loss[ 3930 ]:
train loss: 0.003318008510632495
epoch: 40
train batch loss[ 3940 ]:
                           1.9764778699027374e-05
train_batch_loss[ 3950 ]:
                           1.751014315232169e-05
train batch loss[ 3960 ]:
                           9.095878340303898e-05
train batch loss[ 3970 ]:
                           0.14827874302864075
train batch loss[ 3980 ]:
                           8.844379408401437e-06
train batch loss[ 3990 ]:
                           3.0359824449988082e-05
train_batch_loss[ 4000 ]:
                           1.558698932058178e-05
Evaluate: 100% | 12/12 [00:00<00:00, 19.85it/s]
valid evaluation: loss=0.7178690554390491, acc=0.9126760563380282
save model at
./torch checkpoints/22 3 24-14/crnn1 004000 loss0.7178690554390491.pt
train batch loss[ 4010 ]:
                           0.0014821509830653667
train batch loss[ 4020 ]:
                           4.1867308027576655e-05
train batch loss[ 4030 ]:
                           4.555608393275179e-05
train batch loss[ 4040 ]: 5.137795445383139e-07
train loss: 0.005647092387135731
epoch: 41
                           0.00034158583730459213
train batch loss[ 4050 ]:
train_batch_loss[ 4060 ]:
                           7.136254862416536e-05
train batch loss[ 4070 ]:
                           4.7075332986423746e-05
train batch loss[ 4080 ]:
                           2.631199822644703e-05
train batch loss[ 4090 ]:
                           6.741979450453073e-05
train batch loss[ 4100 ]:
                           9.929192310664803e-05
train_batch_loss[ 4110 ]:
                           0.0016076428582891822
train batch loss[ 4120 ]:
                           3.2294716220349073e-05
train_batch_loss[ 4130 ]:
                           0.00043636883492581546
train batch loss[ 4140 ]:
                           0.0002014019846683368
train loss: 0.00281958556443078
epoch: 42
train batch loss[ 4150 ]:
                           6.068207585485652e-05
train batch loss[ 4160 ]:
                           1.703708039713092e-05
train batch loss[ 4170 ]:
                           3.275073686381802e-05
train_batch_loss[ 4180 ]:
                           0.00033256784081459045
train batch loss[ 4190 ]:
                           0.0006535860011354089
train batch loss[ 4200 ]:
                           2.137598676199559e-05
                           4.4352960685500875e-05
train_batch_loss[ 4210 ]:
train batch loss[ 4220 ]:
                           0.0002201241150032729
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train_batch_loss[ 4230 ]: 4.067195732204709e-06
train batch loss[ 4240 ]:
                           0.0001383441995130852
train loss: 0.0021628553143392707
epoch: 43
train batch loss[ 4250 ]:
                           2.115853931172751e-05
train_batch_loss[ 4260 ]:
                           1.324013737757923e-05
train batch loss[ 4270 ]:
                           2.573438541730866e-05
train batch loss[ 4280 ]:
                           0.0002804319665301591
train batch loss[ 4290 ]:
                           6.0962396673858166e-05
train batch loss[ 4300 ]:
                          4.5523502194555476e-05
train batch loss[ 4310 ]:
                           0.00044227828038856387
train batch loss[ 4320 ]:
                           2.4041322831180878e-05
train_batch_loss[ 4330 ]:
                           0.013761581853032112
train_batch loss[ 4340 ]:
                           0.0006997054442763329
train loss: 0.0019184949511983926
epoch: 44
train batch loss[ 4350 ]:
                           6.19494094280526e-05
train batch loss[ 4360 ]:
                           1.624141077627428e-05
train batch loss[ 4370 ]:
                           0.006306312512606382
train batch loss[ 4380 ]:
                           3.090698373853229e-05
train batch loss[ 4390 ]:
                           0.00016570193110965192
train batch loss[ 4400 ]:
                           0.0010050914715975523
train batch loss[ 4410 ]:
                           0.0002865094575099647
train batch loss[ 4420 ]:
                           7.148388249333948e-05
train_batch loss[ 4430 ]:
                           9.033636888489127e-05
                           0.000245125062065199
train batch loss[ 4440 ]:
train_loss: 0.0037709590389665574
epoch: 45
train batch loss[ 4450 ]:
                           0.0006613783771172166
train_batch_loss[ 4460 ]:
                           0.0008209016523323953
train batch loss[ 4470 ]:
                           0.0001340644375886768
train_batch_loss[ 4480 ]:
                           9.462468369747512e-06
train batch loss[ 4490 ]:
                          3.6873487260891125e-05
train batch loss[ 4500 ]: 0.029853343963623047
Evaluate: 100% | 12/12 [00:00<00:00, 19.88it/s]
valid evaluation: loss=0.8381433268667946, acc=0.9126760563380282
save model at
./torch checkpoints/22 3 24-14/crnn1 004500 loss0.8381433268667946.pt
train batch loss[ 4510 ]: 4.602129774866626e-05
train batch loss[ 4520 ]:
                           0.005299774464219809
train batch loss[ 4530 ]:
                           9.22246999834897e-06
train_batch_loss[ 4540 ]:
                           2.650086025823839e-05
train loss: 0.0020004526037678337
epoch: 46
train batch loss[ 4550 ]:
                           2.5160818040603772e-05
train batch loss[ 4560 ]:
                           5.8600994634616654e-06
train_batch_loss[ 4570 ]:
                           0.0002964237646665424
train batch loss[ 4580 ]: 0.00018358082161284983
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train batch loss[ 4590 ]:
                           5.092779974802397e-05
train batch loss[ 4600 ]:
                           7.042850029392866e-06
train batch loss[ 4610 ]:
                           1.2332928235991858e-05
train batch loss[ 4620 ]:
                           1.4633942555519752e-05
train batch loss[ 4630 ]:
                           0.0004209823382552713
train_batch_loss[ 4640 ]:
                           1.538886863272637e-05
train loss: 0.00021111697787660298
epoch: 47
                           1.159707608167082e-05
train batch loss[ 4650 ]:
train batch loss[ 4660 ]:
                           3.517588311297004e-06
train batch loss[ 4670 ]:
                           9.646844773669727e-06
train batch loss[ 4680 ]:
                           1.2851101928390563e-05
train_batch_loss[ 4690 ]:
                           0.025331245735287666
train_batch loss[ 4700 ]:
                           6.019945794832893e-05
train batch loss[ 4710 ]:
                           0.00014549115439876914
train batch loss[ 4720 ]:
                           2.9551127227023244e-05
train batch loss[ 4730 ]:
                           1.4216104318620637e-05
train batch loss[ 4740 ]:
                           0.0004236773820593953
train loss: 0.006354881421071122
epoch: 48
train batch loss[ 4750 ]:
                           8.363454981008545e-06
train batch loss[ 4760 ]:
                           4.68247635581065e-05
train batch loss[ 4770 ]:
                           9.955048153642565e-05
train batch loss[ 4780 ]:
                           0.0005763248191215098
train batch loss[ 4790 ]:
                           0.006469309329986572
train batch loss[ 4800 ]:
                           0.03625361993908882
train_batch_loss[ 4810 ]:
                           8.147112384904176e-05
train batch loss[ 4820 ]:
                           0.10025350749492645
train batch loss[ 4830 ]:
                           7.181077671702951e-05
train batch loss[ 4840 ]:
                           0.0001803578925319016
train loss: 0.006887658266874232
epoch: 49
train batch loss[ 4850 ]:
                           0.5063713788986206
train batch loss[ 4860 ]:
                           5.8029283536598086e-05
train batch loss[ 4870 ]:
                           1.413606878486462e-05
train batch loss[ 4880 ]:
                           0.0006498098955489695
train batch loss[ 4890 ]:
                           0.00022653586347587407
train batch loss[ 4900 ]:
                           0.002560000866651535
train_batch_loss[ 4910 ]:
                           0.0002749628620222211
train batch loss[ 4920 ]:
                           0.0011780178174376488
train batch loss[ 4930 ]:
                           1.6448082533315755e-05
train batch loss[ 4940 ]:
                           0.00017032612231560051
train loss: 0.007571434366793796
epoch: 50
train batch loss[ 4950 ]:
                           0.00028218983788974583
train_batch_loss[ 4960 ]:
                           1.574017369421199e-05
train batch loss[ 4970 ]:
                           6.538989691762254e-05
train batch loss[ 4980 ]:
                           0.0002199342125095427
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train batch loss[ 4990 ]: 9.857823170023039e-05
train batch loss[ 5000 ]: 2.2019550669938326e-05
Evaluate: 100% | 12/12 [00:00<00:00, 20.51it/s]
valid evaluation: loss=0.764096764527576, acc=0.9267605633802817
save model at
./torch_checkpoints/22_3_24-14/crnn1 005000 loss0.764096764527576.pt
train batch loss[ 5010 ]: 0.00025668556918390095
train batch loss[ 5020 ]:
                           2.157940252800472e-05
train batch loss[ 5030 ]: 4.9661783123156056e-05
train batch loss[ 5040 ]: 1.3669387044501491e-05
train_batch_loss[ 5050 ]:
                          8.145966906643784e-06
train loss: 0.0027354653134527332
epoch: 51
train batch loss[ 5060 ]:
                           0.0028458493761718273
train batch loss[ 5070 ]:
                           2.45578630710952e-05
train_batch_loss[ 5080 ]:
                           6.501554162241518e-05
train batch loss[ 5090 ]:
                           0.41958948969841003
train batch loss[ 5100 ]:
                           6.825529999332502e-05
train batch loss[ 5110 ]:
                           0.000300051411613822
train batch loss[ 5120 ]:
                           2.6589092158246785e-05
train batch loss[ 5130 ]:
                           0.0042825499549508095
train batch loss[ 5140 ]:
                           0.016611842438578606
train_batch_loss[ 5150 ]:
                           0.012465937994420528
train loss: 0.026309478329278792
epoch: 52
train batch loss[ 5160 ]:
                           2.0190273062326014e-05
train batch loss[ 5170 ]:
                           3.549647590261884e-05
train batch loss[ 5180 ]:
                           0.00021896290127187967
train batch loss[ 5190 ]:
                           0.0019081546925008297
train_batch_loss[ 5200 ]:
                           0.0003633047454059124
train_batch loss[ 5210 ]:
                           8.213607361540198e-05
train batch loss[ 5220 ]:
                           5.802610394312069e-05
train batch loss[ 5230 ]:
                           0.008417532779276371
train batch loss[ 5240 ]:
                           3.773844946408644e-05
train_batch_loss[ 5250 ]:
                           2.8142503651906736e-05
train loss: 0.005520997133525132
epoch: 53
train batch loss[ 5260 ]:
                           1.4342652320920024e-05
train batch loss[ 5270 ]:
                           6.672547169728205e-05
train batch loss[ 5280 ]:
                           1.927374250954017e-05
train batch loss[ 5290 ]:
                           2.392355600022711e-05
train_batch_loss[ 5300 ]:
                           0.00014171269140206277
train batch loss[ 5310 ]:
                           6.460966687882319e-05
train_batch_loss[ 5320 ]:
                           5.680219146597665e-06
train batch loss[ 5330 ]:
                           8.384795364690945e-06
train batch loss[ 5340 ]:
                           2.2350803192239255e-05
train batch loss[ 5350 ]:
                           8.845703268889338e-05
train loss: 0.003047265746094393
```

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epoch: 54
train batch loss[ 5360 ]:
                           1.0338404536014423e-05
train batch loss[ 5370 ]:
                           2.970616696984507e-05
train batch loss[ 5380 ]:
                           0.0024455562233924866
train batch loss[ 5390 ]:
                           1.682384026935324e-05
train_batch_loss[ 5400 ]:
                           1.3808059520670213e-05
                           4.142343095736578e-05
train batch loss[ 5410 ]:
train batch loss[ 5420 ]:
                           0.0007311787339858711
train batch loss[ 5430 ]:
                           3.464059409452602e-05
train batch loss[ 5440 ]:
                           4.3311672925483435e-05
train_batch_loss[ 5450 ]:
                           1.9986560801044106e-05
train loss: 0.004846012253083861
epoch: 55
train batch loss[ 5460 ]:
                           1.3673135072167497e-05
train batch loss[ 5470 ]:
                           2.401740857749246e-05
train batch loss[ 5480 ]:
                           0.007062150631099939
train batch loss[ 5490 ]:
                           0.0004461471689864993
train_batch_loss[ 5500 ]:
                           2.8432234103092924e-05
Evaluate: 100% | 12/12 [00:00<00:00, 18.49it/s]
valid evaluation: loss=0.8211690251256378, acc=0.9098591549295775
save model at
./torch checkpoints/22 3 24-14/crnn1 005500 loss0.8211690251256378.pt
train batch loss[ 5510 ]: 3.416468825889751e-05
                           0.00010055005986941978
train batch loss[ 5520 ]:
train batch loss[ 5530 ]:
                           6.39304198557511e-06
train batch loss[ 5540 ]:
                           8.606079791206867e-05
train batch loss[ 5550 ]:
                           6.541539914906025e-05
train loss: 0.01235202571569318
epoch: 56
train_batch_loss[ 5560 ]:
                           0.0004227049648761749
train_batch loss[ 5570 ]:
                           4.696428368333727e-05
train batch loss[ 5580 ]:
                           6.072820178815164e-05
train batch loss[ 5590 ]:
                           1.4729171198268887e-05
train batch loss[ 5600 ]:
                           0.00010147241846425459
train_batch_loss[ 5610 ]:
                           2.9815117159159854e-05
train batch loss[ 5620 ]:
                           0.0023602633737027645
train_batch_loss[ 5630 ]:
                           1.8096719941240735e-05
train batch loss[ 5640 ]:
                           0.0002512977225705981
train batch loss[ 5650 ]:
                           0.0004461075586732477
train loss: 0.004257598272250728
epoch: 57
train_batch_loss[ 5660 ]:
                           0.00011611911031650379
train batch loss[ 5670 ]:
                           3.266343264840543e-05
train_batch_loss[ 5680 ]:
                           1.8837083189282566e-05
train batch loss[ 5690 ]:
                           4.015639569843188e-05
train batch loss[ 5700 ]:
                           0.00012999586760997772
train_batch_loss[ 5710 ]:
                           3.142665445921011e-05
train batch loss [ 5720 ]: 4.8553272790741175e-05
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train_batch loss[ 5730 ]:
                           0.0001483792148064822
train batch loss[ 5740 ]:
                           8.724189683562145e-06
train batch loss[ 5750 ]:
                           0.0035850373096764088
train loss: 0.003827129562942451
epoch: 58
train_batch_loss[ 5760 ]:
                           0.00033341985545121133
                           0.00042323264642618597
train batch loss[ 5770 ]:
train batch loss[ 5780 ]:
                           0.00012448235065676272
train batch loss[ 5790 ]:
                           8.281219379568938e-06
train batch loss[ 5800 ]:
                           2.6370595151092857e-05
train batch loss[ 5810 ]:
                           3.3331562008243054e-06
train batch loss[ 5820 ]:
                           1.3225781003711745e-05
train_batch_loss[ 5830 ]:
                           7.10654467184213e-06
train_batch loss[ 5840 ]:
                           3.8937185308896005e-05
train_batch_loss[ 5850 ]:
                           1.4513733731291723e-05
train loss: 0.0007057045853775343
epoch: 59
train batch loss[ 5860 ]:
                           0.00022809862275607884
train batch loss[ 5870 ]:
                           2.545101597206667e-05
train batch loss[ 5880 ]:
                           1.495973629062064e-05
train batch loss[ 5890 ]:
                           2.7962272724835202e-05
train batch loss[ 5900 ]:
                           1.2238839190104045e-05
train batch loss[ 5910 ]:
                           0.015545619651675224
train batch loss[ 5920 ]:
                           0.0001808632368920371
train_batch loss[ 5930 ]:
                           0.00044030853314325213
train batch loss[ 5940 ]:
                           0.002790228696539998
train_batch_loss[ 5950 ]:
                           0.0003803979780059308
train loss: 0.010828657599936092
epoch: 60
train batch loss[ 5960 ]:
                           5.2672276069642976e-05
train batch loss[ 5970 ]:
                           3.9865553844720125e-05
train_batch_loss[ 5980 ]:
                           2.5233694032067433e-05
train batch loss[ 5990 ]:
                           4.827422526432201e-05
train batch loss[ 6000 ]: 0.00025378819555044174
Evaluate: 100% | 12/12 [00:00<00:00, 25.90it/s]
valid evaluation: loss=0.8983227865796694, acc=0.9267605633802817
save model at
./torch checkpoints/22 3 24-14/crnn1 006000 loss0.8983227865796694.pt
train batch loss[ 6010 ]:
                           5.351381332729943e-05
train batch loss[ 6020 ]:
                           0.0005322423530742526
train batch loss[ 6030 ]:
                           0.00849976483732462
train_batch_loss[ 6040 ]:
                           0.0005446557188406587
train batch loss[ 6050 ]:
                           0.060986824333667755
train_batch_loss[ 6060 ]:
                           8.241324879539509e-05
train loss: 0.004362269864693877
epoch: 61
train batch loss[ 6070 ]:
                           4.015843296656385e-05
train batch loss[ 6080 ]: 4.409857865539379e-06
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train batch loss[ 6090 ]:
                           0.22652235627174377
train batch loss[ 6100 ]:
                           2.164703982998617e-05
train batch loss[ 6110 ]:
                           7.331887900363654e-05
train batch loss[ 6120 ]:
                           0.037866637110710144
train batch loss[ 6130 ]:
                           2.58517793554347e-05
train_batch_loss[ 6140 ]:
                           0.0013961098156869411
train batch loss[ 6150 ]:
                           0.0008791005820967257
train batch loss[ 6160 ]:
                           0.00119775568600744
train loss: 0.004181913995600563
epoch: 62
                           0.008759947493672371
train batch loss[ 6170 ]:
train batch loss[ 6180 ]:
                           2.0490768292802386e-05
train_batch_loss[ 6190 ]:
                           0.0007633878849446774
train_batch loss[ 6200 ]:
                           8.071339834714308e-05
train batch loss[ 6210 ]:
                           3.569172622519545e-05
train batch loss[ 6220 ]:
                           0.0007965029217302799
train batch loss[ 6230 ]:
                           0.0007486007525585592
train batch loss[ 6240 ]:
                           8.832350431475788e-06
                           0.00030139769660308957
train batch loss[ 6250 ]:
train_batch_loss[ 6260 ]:
                           0.0006227444391697645
train loss: 0.0013843301400376742
epoch: 63
train batch loss[ 6270 ]:
                           1.2950429663760588e-05
train batch loss[ 6280 ]:
                           8.169943612301722e-06
train batch loss[ 6290 ]:
                           7.470985292457044e-05
train batch loss 6300 1:
                           4.711637302534655e-06
train_batch_loss[ 6310 ]:
                           1.3934740309196059e-05
                           0.0001546400599181652
train batch loss[ 6320 ]:
train batch loss[ 6330 ]:
                           7.777076461934485e-06
train_batch_loss[ 6340 ]:
                           9.447961929254234e-06
train batch loss[ 6350 ]:
                           0.0005087632453069091
train_batch_loss[ 6360 ]:
                           2.966339343402069e-05
train loss: 0.0028915075555569813
epoch: 64
train batch loss[ 6370 ]:
                           0.0019198366208001971
train batch loss[ 6380 ]:
                           3.553545684553683e-05
train batch loss[ 6390 ]:
                           1.5393157809739932e-05
train batch loss[ 6400 ]:
                           0.00013158244837541133
train_batch_loss[ 6410 ]:
                           2.1613164790323935e-05
train batch loss[ 6420 ]:
                           5.501788109540939e-06
train batch loss[ 6430 ]:
                           6.856444088043645e-05
train batch loss[ 6440 ]:
                           3.246465712436475e-05
train batch loss[ 6450 ]:
                           5.8035639085574076e-05
train batch loss[ 6460 ]:
                           2.0708050215034746e-05
train loss: 0.0055197622281180974
epoch: 65
train batch loss[ 6470 ]:
                           9.587328531779349e-05
train batch loss[ 6480 ]: 8.631170203443617e-05
```

```
train batch loss[ 6490 ]: 3.3046457247110084e-05
train batch loss[ 6500 ]: 2.4993947590701282e-05
Evaluate: 100% | 12/12 [00:00<00:00, 27.76it/s]
valid evaluation: loss=0.8693566358399013, acc=0.9323943661971831
save model at
./torch checkpoints/22 3 24-14/crnn1 006500 loss0.8693566358399013.pt
train batch loss[ 6510 ]:
                           0.0001247043692274019
train batch loss[ 6520 ]:
                           1.478259036957752e-05
train batch loss[ 6530 ]:
                           0.029433345422148705
train batch loss[ 6540 ]:
                           5.408913057181053e-05
train batch loss[ 6550 ]:
                           1.6795060219010338e-05
train batch loss[ 6560 ]:
                           0.0014456898206844926
train loss: 0.005585915542362782
epoch: 66
train batch loss[ 6570 ]:
                           1.2414384400472045e-05
train_batch_loss[ 6580 ]:
                           3.7716331462434027e-06
train batch loss[ 6590 ]:
                           1.1944444850087166e-05
train batch loss[ 6600 ]:
                           0.0010830428218469024
train batch loss[ 6610 ]:
                           1.308568607782945e-05
train batch loss[ 6620 ]:
                           9.122649498749524e-05
train batch loss[ 6630 ]:
                           5.6762028179946356e-06
train batch loss[ 6640 ]:
                           0.00011580949649214745
train batch loss[ 6650 ]:
                           2.050408284048899e-06
                           2.5267461751354858e-05
train batch loss[ 6660 ]:
train loss: 0.0011306238825260278
epoch: 67
train batch loss[ 6670 ]:
                           2.4444623704766855e-05
train batch loss[ 6680 ]:
                           2.501067501725629e-05
train batch loss[ 6690 ]:
                           7.19322451914195e-06
train_batch_loss[ 6700 ]:
                           1.2224915735714603e-05
train batch loss [ 6710 ]:
                           1.2831103049393278e-05
train batch loss[ 6720 ]:
                           1.0230988664261531e-05
train batch loss[ 6730 ]:
                           0.03639426454901695
train batch loss[ 6740 ]:
                           1.7602360458113253e-05
train_batch_loss[ 6750 ]:
                           0.002632806310430169
                           7.37316076993011e-05
train batch loss[ 6760 ]:
train_loss: 0.004042969766867301
epoch: 68
train batch loss[ 6770 ]:
                           9.734831110108644e-06
train batch loss[ 6780 ]:
                           0.00019357017299626023
train batch loss[ 6790 ]:
                           5.748664079874288e-06
train_batch_loss[ 6800 ]:
                           4.945560067426413e-05
train batch loss[ 6810 ]:
                           0.00017924277926795185
train_batch_loss[ 6820 ]:
                           1.0536969057284296e-06
train batch loss[ 6830 ]:
                           2.5738652766449377e-05
train batch loss[ 6840 ]:
                           1.9798048015218228e-05
train_batch_loss[ 6850 ]:
                           1.2908152712043375e-05
train batch loss[ 6860 ]:
                           0.0509403795003891
```

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train loss:
             0.00113984680129087
epoch: 69
train batch loss[ 6870 ]:
                           0.0005739837069995701
train batch loss[ 6880 ]:
                           9.547795343678445e-06
train batch loss[ 6890 ]:
                           4.7909885324770585e-05
train_batch_loss[ 6900 ]:
                           0.0008647278882563114
train batch loss[ 6910 ]:
                           1.1334190276102163e-05
train batch loss[ 6920 ]:
                           1.0369220035499893e-05
                           0.0022581350058317184
train batch loss[ 6930 ]:
train batch loss[ 6940 ]:
                           1.3023527571931481e-06
train batch loss[ 6950 ]:
                           4.04448619519826e-05
train batch loss[ 6960 ]:
                           0.004863315261900425
train loss: 0.0029203564653537562
epoch: 70
train batch loss[ 6970 ]:
                           7.850196197978221e-06
train batch loss[ 6980 ]:
                           1.0422279956401326e-05
train batch loss[ 6990 ]:
                           1.293874538532691e-05
train batch loss[ 7000 ]:
                           1.2574046195368282e-05
Evaluate: 100% | 12/12 [00:00<00:00, 28.03it/s]
valid evaluation: loss=0.7739426169636279, acc=0.9352112676056338
save model at
./torch checkpoints/22 3 24-14/crnn1 007000 loss0.7739426169636279.pt
train batch loss[ 7010 ]:
                           0.00011232237739022821
train batch loss[ 7020 ]:
                           2.363772364333272e-05
train batch loss[ 7030 ]:
                           7.746295977995032e-07
train batch loss[ 7040 ]:
                           7.061703854560619e-06
train batch loss[ 7050 ]:
                           1.5480383808608167e-05
train batch loss[ 7060 ]:
                           0.00015149323735386133
                           2.8641273578008017e-06
train batch loss[ 7070 ]:
train loss: 0.003908679035507034
epoch: 71
train batch loss[ 7080 ]:
                           7.352758257184178e-05
train batch loss[ 7090 ]:
                           2.197710819018539e-05
train batch loss[ 7100 ]:
                           0.007283364422619343
train_batch_loss[ 7110 ]:
                           0.0005659842281602323
train batch loss[ 7120 ]:
                           0.012915357016026974
train_batch_loss[ 7130 ]:
                           7.966579869389534e-05
train batch loss[ 7140 ]:
                           0.0006993443239480257
train batch loss[ 7150 ]:
                           1.39644125738414e-05
train batch loss[ 7160 ]:
                           0.0008061790140345693
train batch loss[ 7170 ]:
                           9.001203579828143e-06
train loss: 0.009763199723993667
epoch: 72
train batch loss[ 7180 ]:
                           0.0086432583630085
train batch loss[ 7190 ]:
                           5.5131049521151e-06
train batch loss[ 7200 ]:
                           0.0019379607401788235
                           5.380035872804001e-06
train_batch_loss[ 7210 ]:
train batch loss[ 7220 ]: 3.133356221951544e-05
```

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train_batch loss[ 7230 ]:
                           5.5374148359987885e-05
train batch loss[ 7240 ]:
                           0.00026840384816750884
train batch loss[ 7250 ]:
                           7.064945384627208e-05
train batch loss[ 7260 ]:
                           2.5161378289340064e-05
train batch loss[ 7270 ]:
                           0.00010307034972356632
train loss: 0.006448483845273298
epoch: 73
train batch loss[ 7280 ]:
                           4.261713183950633e-05
                           0.00025859009474515915
train batch loss[ 7290 ]:
train batch loss[ 7300 ]:
                           6.353370554279536e-05
train batch loss[ 7310 ]:
                           2.126499111909652e-06
train batch loss[ 7320 ]:
                           3.1154970201896504e-05
train_batch_loss[ 7330 ]:
                           1.1417914720368572e-06
train batch loss [7340]:
                           1.2693045391642954e-05
train batch loss[ 7350 ]:
                           5.898848394281231e-05
train batch loss[ 7360 ]:
                           1.419307227479294e-05
train batch loss[ 7370 ]:
                           8.14936647657305e-05
train loss: 0.001994885857357999
epoch: 74
train_batch_loss[ 7380 ]:
                           0.0006738328374922276
train batch loss[ 7390 ]:
                           1.0184870689045056e-06
train batch loss[ 7400 ]:
                           0.00016744137974455953
train batch loss[ 7410 ]:
                           1.4653769540018402e-05
train batch loss[ 7420 ]:
                           1.574138514115475e-05
train batch loss[ 7430 ]:
                           1.324348704656586e-05
train batch loss[ 7440 ]:
                          9.967462574422825e-06
train_batch_loss[ 7450 ]:
                           3.2822168577695265e-05
train batch loss[ 7460 ]:
                           1.0922281944658607e-05
train batch loss[ 7470 ]:
                           6.957556593079062e-07
train loss: 0.00027488801719762954
epoch: 75
train_batch_loss[ 7480 ]: 3.6172300497128163e-06
train batch loss[ 7490 ]: 6.5647068367979955e-06
train batch loss[ 7500 ]: 3.5086866319034016e-06
Evaluate: 100% | 12/12 [00:00<00:00, 27.67it/s]
valid evaluation: loss=0.7833182011061991, acc=0.9267605633802817
save model at
./torch checkpoints/22 3 24-14/crnn1 007500 loss0.7833182011061991.pt
train batch loss[ 7510 ]: 7.72074236010667e-06
train batch loss[ 7520 ]:
                           1.0190406101173721e-05
train batch loss[ 7530 ]:
                          3.187953552696854e-06
train_batch_loss[ 7540 ]:
                           1.1756806998164393e-05
train batch loss[ 7550 ]:
                          8.404139407502953e-06
train_batch_loss[ 7560 ]:
                           2.6933612389257178e-05
train batch loss[ 7570 ]:
                          7.504680525016738e-06
train loss: 0.00018741372987687627
epoch: 76
train batch loss[ 7580 ]: 7.735798135399818e-06
```

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train_batch loss[ 7590 ]:
                           0.00048727961257100105
train batch loss[ 7600 ]:
                           0.00013124351971782744
train batch loss[ 7610 ]:
                           0.005059405695647001
train batch loss[ 7620 ]:
                           0.010244093835353851
train batch loss[ 7630 ]:
                           0.0025057271122932434
train_batch_loss[ 7640 ]:
                           0.0058651091530919075
train batch loss[ 7650 ]:
                           0.0011971211060881615
train batch loss[ 7660 ]:
                           0.0001267811458092183
train batch loss[ 7670 ]:
                           0.008107936009764671
train loss: 0.021495958162653303
epoch: 77
train batch loss[ 7680 ]:
                           0.00013481850328389555
train_batch_loss[ 7690 ]:
                           3.214371463400312e-05
train batch loss[ 7700 ]:
                           0.0004684281302616
train batch loss[ 7710 ]:
                           7.621063105034409e-06
train batch loss[ 7720 ]:
                           3.482908505247906e-05
train batch loss[ 7730 ]:
                           2.167208367609419e-05
train batch loss[ 7740 ]:
                           2.3588847852806794e-06
                           7.754896068945527e-05
train batch loss[ 7750 ]:
train batch loss[ 7760 ]:
                           0.01790449023246765
train batch loss[ 7770 ]:
                           1.4370220014825463e-05
train loss: 0.01285422816275482
epoch: 78
train batch loss[ 7780 ]:
                           1.2682590750046074e-05
train batch loss[ 7790 ]:
                           3.791743438341655e-05
train batch loss 7800 1:
                           1.802770930225961e-05
train_batch_loss[ 7810 ]:
                           6.921580643393099e-05
train batch loss[ 7820 ]:
                           7.324644684558734e-05
train batch loss[ 7830 ]:
                           2.8214624762767926e-05
train_batch_loss[ 7840 ]:
                           4.609459574567154e-05
train batch loss[ 7850 ]:
                           5.660072929458693e-06
train_batch_loss[ 7860 ]:
                           9.457395208301023e-06
train batch loss[ 7870 ]:
                           3.1687915907241404e-05
train loss: 0.0014392690322854698
epoch: 79
                           2.184111508540809e-05
train batch loss[ 7880 ]:
train batch loss[ 7890 ]:
                           3.5656910313264234e-06
train batch loss 7900 1:
                           5.6675553423701786e-06
train_batch_loss[ 7910 ]:
                           0.07505621761083603
train batch loss[ 7920 ]:
                           3.810735961451428e-06
train batch loss[ 7930 ]:
                           8.116983735817485e-06
train batch loss[ 7940 ]:
                           2.5324028683826327e-05
train batch loss[ 7950 ]:
                           3.0349920052685775e-05
train batch loss[ 7960 ]:
                           3.739743260666728e-05
                           8.578845881856978e-05
train batch loss[ 7970 ]:
train_loss: 0.002229727101307556
epoch: 80
train batch loss[ 7980 ]: 2.0225801563356072e-05
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train batch loss[ 7990 ]: 9.025407052831724e-06
train batch loss[ 8000 ]: 4.214801447233185e-05
Evaluate: 100% | 12/12 [00:00<00:00, 22.05it/s]
valid evaluation: loss=0.9303785775748776, acc=0.9295774647887324
save model at
./torch_checkpoints/22_3_24-14/crnn1 008000 loss0.9303785775748776.pt
train batch loss[ 8010 ]:
                           0.00041692188824526966
train batch loss[ 8020 ]:
                           1.5043516214063857e-05
train batch loss[ 8030 ]:
                           1.5488417375308927e-06
train batch loss[ 8040 ]:
                           2.2873448415339226e-06
train batch loss[ 8050 ]:
                           0.00018937613640446216
train batch loss[ 8060 ]:
                           1.273948419111548e-05
train batch loss[ 8070 ]:
                           2.1587945866485825e-06
train batch loss[ 8080 ]:
                           2.0461777846018474e-05
train loss: 6.326534886507677e-05
epoch: 81
train batch loss[ 8090 ]:
                           4.687526597990654e-06
train_batch_loss[ 8100 ]:
                           1.3015019248996396e-05
train batch loss[ 8110 ]:
                           4.313579211157048e-06
train batch loss[ 8120 ]:
                           5.826522283314262e-06
train batch loss[ 8130 ]:
                           1.715277903713286e-06
train batch loss[ 8140 ]:
                           3.914386070391629e-06
train batch loss[ 8150 ]:
                           2.920023007391137e-06
                           1.7435115751140984e-06
train batch loss[ 8160 ]:
train batch loss[ 8170 ]:
                           1.2674454410444014e-06
train batch loss[ 8180 ]:
                           2.824117473210208e-06
train loss: 7.226129247500718e-06
epoch: 82
train batch loss[ 8190 ]:
                           6.001665042276727e-06
train_batch_loss[ 8200 ]:
                           2.9168497803766513e-06
train batch loss[ 8210 ]:
                           2.975861889353837e-06
train batch loss[ 8220 ]:
                           2.1569487671513343e-06
train batch loss[ 8230 ]:
                           1.6644578408886446e-06
train batch loss[ 8240 ]:
                           1.7897672250910546e-06
train_batch_loss[ 8250 ]:
                           4.906500180368312e-06
train batch loss[ 8260 ]:
                           3.229664343962213e-06
train_batch_loss[ 8270 ]:
                           2.1613523131236434e-06
train batch loss[ 8280 ]:
                           2.551232910263934e-06
train loss: 2.941062144237548e-06
epoch: 83
train batch loss[ 8290 ]:
                           1.4083240102991113e-06
train batch loss[ 8300 ]:
                           7.800360322107736e-07
train batch loss[ 8310 ]:
                           1.3861954357707873e-06
train_batch_loss[ 8320 ]:
                           8.655040346638998e-07
train batch loss[ 8330 ]:
                           7.967382771312259e-07
train batch loss[ 8340 ]:
                           1.1529148196132155e-06
train_batch_loss[ 8350 ]:
                           6.245663826121017e-07
train batch loss[ 8360 ]: 2.0955958461854607e-06
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train_batch loss[ 8370 ]:
                           1.321572426604689e-06
train batch loss[ 8380 ]: 2.886523134293384e-06
train loss: 2.0017100327523446e-06
epoch: 84
train batch loss[ 8390 ]:
                           2.021574118771241e-06
train_batch_loss[ 8400 ]:
                           1.9223666640755255e-06
train batch loss[ 8410 ]:
                           1.0922374258370837e-06
train batch loss[ 8420 ]:
                           1.0497249149921117e-06
train batch loss[ 8430 ]:
                           1.5904545307421358e-06
train batch loss[ 8440 ]:
                          1.744067162690044e-06
train batch loss[ 8450 ]:
                          1.9568838069972117e-06
train batch loss[ 8460 ]:
                          2.147451596101746e-06
train_batch_loss[ 8470 ]:
                          4.98834197060205e-07
train batch loss[ 8480 ]:
                           1.7077103393603466e-06
train loss: 1.389858561268728e-06
epoch: 85
train batch loss[ 8490 ]:
                           8.016467631932755e-07
train batch loss[ 8500 ]: 1.6215776668104809e-06
Evaluate: 100% | 12/12 [00:00<00:00, 28.23it/s]
valid evaluation: loss=0.8109778052169673, acc=0.9352112676056338
save model at
./torch checkpoints/22 3 24-14/crnn1 008500 loss0.8109778052169673.pt
train batch loss[ 8510 ]: 1.8029844568445696e-06
train batch loss[ 8520 ]:
                           7.530534276156686e-07
train batch loss[ 8530 ]:
                           7.006170790191391e-07
train batch loss[ 8540 ]:
                           6.831614882685244e-07
train batch loss[ 8550 ]:
                          4.4490661821328104e-07
train_batch_loss[ 8560 ]:
                           7.225152103274013e-07
train batch loss[ 8570 ]:
                          1.3726202041652869e-06
train_batch_loss[ 8580 ]: 9.493314792052843e-07
train loss: 9.565721058040102e-07
epoch: 86
train batch loss[ 8590 ]:
                           9.837991683525615e-07
train batch loss[ 8600 ]:
                           7.268509421010094e-07
train_batch_loss[ 8610 ]:
                           6.850760883025941e-07
                           3.8710766148142284e-07
train batch loss[ 8620 ]:
train_batch_loss[ 8630 ]:
                           2.3134619198117434e-07
train batch loss[ 8640 ]:
                           6.253617357288022e-07
train batch loss[ 8650 ]:
                          4.429273303685477e-07
train batch loss[ 8660 ]:
                           6.153526896923722e-07
train batch loss[ 8670 ]:
                           9.773398232937325e-07
train_batch_loss[ 8680 ]:
                           3.4613168509167735e-07
train loss: 6.632278980994563e-07
epoch: 87
train batch loss[ 8690 ]:
                           7.456335993083485e-07
train batch loss[ 8700 ]:
                           5.421588298304414e-07
train_batch_loss[ 8710 ]:
                          4.7615881726414955e-07
train batch loss[ 8720 ]: 1.7785350792109966e-07
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train_batch loss[ 8730 ]:
                           2.570304786786437e-07
train batch loss[ 8740 ]:
                           6.221160901986877e-07
train batch loss[ 8750 ]:
                           3.5122440067425487e-07
train batch loss[ 8760 ]:
                           2.8402422458384535e-07
train batch loss[ 8770 ]:
                           3.623422912824026e-07
train_batch_loss[ 8780 ]:
                           3.797758836299181e-07
train loss: 4.5328285273122095e-07
epoch: 88
train batch loss[ 8790 ]:
                           3.110034754172375e-07
train batch loss[ 8800 ]:
                           4.038155907437613e-07
train batch loss[ 8810 ]:
                           2.249721262614912e-07
train batch loss[ 8820 ]:
                           1.257285475730896e-07
train_batch_loss[ 8830 ]:
                           1.3526369002647698e-07
train_batch loss[ 8840 ]:
                           2.0896538899251027e-07
train batch loss[ 8850 ]:
                           3.6424637528398307e-07
train_batch loss[ 8860 ]:
                           1.548323780298233e-07
train batch loss[ 8870 ]:
                           4.781612119586498e-07
train_batch_loss[ 8880 ]:
                           3.01752010045675e-07
train loss: 3.134777225843974e-07
epoch: 89
train batch loss[ 8890 ]:
                           1.251457888429286e-07
train batch loss[ 8900 ]:
                           2.0278072554447135e-07
train batch loss[ 8910 ]:
                           2.5513773493912595e-07
train batch loss[ 8920 ]:
                           1.489350012207069e-07
train_batch loss[ 8930 ]:
                           1.0436633601784706e-07
train batch loss[ 8940 ]:
                           1.8184073269367218e-07
train_batch_loss[ 8950 ]:
                           1.561046332199112e-07
train batch loss[ 8960 ]:
                           1.1233953500777716e-07
train batch loss[ 8970 ]:
                           6.127766027930193e-07
train_batch_loss[ 8980 ]:
                           1.0663643479347229e-07
train loss: 2.034425992972794e-07
epoch: 90
train batch loss[ 8990 ]: 1.6435880922927026e-07
train batch loss[ 9000 ]: 6.239861249923706e-08
Evaluate: 100% | 12/12 [00:00<00:00, 28.94it/s]
valid evaluation: loss=0.8187679250160573, acc=0.9380281690140845
save model at
./torch checkpoints/22 3 24-14/crnn1 009000 loss0.8187679250160573.pt
train batch loss[ 9010 ]:
                          7.86958409548788e-08
train batch loss[ 9020 ]:
                           1.685573209897484e-07
train batch loss[ 9030 ]:
                           1.6798730939626694e-07
train batch loss[ 9040 ]:
                           1.0587973520159721e-07
train batch loss[ 9050 ]:
                           8.42846930027008e-08
train_batch_loss[ 9060 ]:
                           8.313509169965982e-08
train batch loss[ 9070 ]:
                           1.0709391062846407e-07
train batch loss[ 9080 ]:
                           5.069887265563011e-08
train batch loss[ 9090 ]:
                           0.0
train loss: 1.3298579289458705e-07
```

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epoch: 91
train_batch loss[ 9100 ]:
                           8.1476173363626e-08
train batch loss[ 9110 ]:
                           1.4202650788774918e-07
train batch loss[ 9120 ]:
                           2.689175744308159e-07
train batch loss[ 9130 ]:
                           6.50179572403431e-08
train_batch_loss[ 9140 ]:
                           7.729226325636773e-08
train batch loss[ 9150 ]:
                           7.252673839275303e-08
train batch loss[ 9160 ]:
                           5.989568307995796e-08
train batch loss[ 9170 ]:
                           1.0702206054702401e-07
train batch loss[ 9180 ]:
                           4.46889316663146e-08
train_batch_loss[ 9190 ]:
                           7.487684428042485e-08
train loss: 8.239778578499943e-08
epoch: 92
train batch loss[ 9200 ]:
                           4.684989107772708e-08
train batch loss[ 9210 ]:
                           1.5598196512200957e-07
train batch loss[ 9220 ]:
                           6.728032531100325e-08
train batch loss[ 9230 ]:
                           3.584864316508174e-08
train_batch_loss[ 9240 ]:
                           7.991548045538366e-08
train batch loss[ 9250 ]:
                           6.979097832982006e-08
train batch loss[ 9260 ]:
                           5.576021067099646e-08
train batch loss[ 9270 ]:
                           5.261972191306086e-08
train batch loss[ 9280 ]:
                           4.09772802356656e-08
train batch loss[ 9290 ]:
                           1.9092105674189952e-08
train loss: 5.265783021113697e-08
epoch: 93
train batch loss[ 9300 ]:
                           1.4319084584712982e-08
train_batch_loss[ 9310 ]:
                           3.1180661608232185e-08
train_batch loss[ 9320 ]:
                           2.3283057259959605e-08
train batch loss[ 9330 ]:
                           1.1175863789958385e-08
train_batch_loss[ 9340 ]:
                           7.450580596923828e-09
train batch loss[ 9350 ]:
                           3.3527612686157227e-08
train_batch_loss[ 9360 ]:
                           4.793037078343332e-08
train batch loss[ 9370 ]:
                           4.842877388000488e-08
train batch loss[ 9380 ]:
                           1.768785296007991e-08
train batch loss[ 9390 ]:
                           1.862644971595273e-08
train loss: 2.6628115194701394e-08
epoch: 94
                           1.1408701539039612e-08
train batch loss[ 9400 ]:
train_batch_loss[ 9410 ]:
                           3.3178356062535386e-08
train batch loss[ 9420 ]:
                           6.51925802230835e-09
train batch loss[ 9430 ]:
                           1.676289684837684e-08
train batch loss[ 9440 ]:
                           8.381903171539307e-09
train batch loss[ 9450 ]:
                           8.38183566997941e-09
train_batch loss[ 9460 ]:
                           1.0710209608078003e-08
train batch loss[ 9470 ]:
                           1.3329554349184036e-08
train_batch_loss[ 9480 ]:
                           2.223532646894455e-08
train batch loss[ 9490 ]:
                           1.1176325642736629e-08
train loss: 1.4920778546721102e-08
```

```
epoch: 95
train batch loss[ 9500 ]: -3.725290298461914e-09
Evaluate: 100% | 12/12 [00:00<00:00, 22.26it/s]
valid evaluation: loss=0.8376243386942316, acc=0.9380281690140845
save model at
./torch_checkpoints/22_3_24-14/crnn1 009500 loss0.8376243386942316.pt
train batch loss[ 9510 ]: 8.381903171539307e-09
train batch loss[ 9520 ]:
                           7.450580596923828e-09
train_batch_loss[ 9530 ]:
                           1.862645149230957e-09
train batch loss[ 9540 ]:
                          7.450580596923828e-09
train batch loss[ 9550 ]:
                           -9.458744898438454e-10
train batch loss[ 9560 ]:
                           1.1059455573558807e-08
train batch loss[ 9570 ]:
                           2.2104359231889248e-08
train batch loss[ 9580 ]:
                           2.2444022818035592e-07
train batch loss[ 9590 ]:
                           2.484066953911679e-06
train_loss: 0.005468533727700691
epoch: 96
train batch loss[ 9600 ]:
                           0.00046265212586149573
train batch loss[ 9610 ]:
                           0.013121054507791996
train batch loss[ 9620 ]:
                           2.1140496755833738e-05
train batch loss[ 9630 ]:
                           0.0025573824532330036
train batch loss[ 9640 ]:
                           0.0028057629242539406
train batch loss[ 9650 ]:
                           1.1440990419941954e-05
train batch loss[ 9660 ]:
                           0.0011978760594502091
train batch loss[ 9670 ]:
                           0.00017371622379869223
train batch loss[ 9680 ]:
                           1.872380153145059e-06
train batch loss[ 9690 ]:
                           0.00024666014360263944
train loss: 0.02792095945435671
epoch: 97
train_batch_loss[ 9700 ]:
                           6.7246191974845715e-06
train batch loss[ 9710 ]:
                           3.577097231755033e-05
train batch loss[ 9720 ]:
                           5.185013833397534e-06
train batch loss[ 9730 ]:
                           4.8751928261481225e-05
train batch loss[ 9740 ]:
                           0.0004429953405633569
train_batch_loss[ 9750 ]:
                           6.511226820293814e-05
train batch loss[ 9760 ]:
                           0.0002076836972264573
train_batch_loss[ 9770 ]:
                           3.0125179364404175e-06
train batch loss[ 9780 ]:
                           1.1026983884221409e-05
train batch loss[ 9790 ]:
                           1.682871334196534e-05
train loss: 0.013473506362187943
epoch: 98
train batch loss[ 9800 ]:
                           1.893947774078697e-05
train batch loss[ 9810 ]:
                           2.2796750272391364e-05
train_batch_loss[ 9820 ]:
                           8.057183003984392e-05
train batch loss[ 9830 ]:
                           3.732066397788003e-05
train batch loss[ 9840 ]:
                           1.2635999837584677e-06
train_batch_loss[ 9850 ]:
                           5.478056846186519e-05
train batch loss[ 9860 ]: 2.284617949044332e-06
```

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train_batch_loss[ 9870 ]: 9.324211305283825e-07
train batch loss[ 9880 ]:
                         2.116481846314855e-05
train batch loss[ 9890 ]: 3.8127127481857315e-06
train loss: 0.0031545653973657434
epoch: 99
train_batch_loss[ 9900 ]:
                           2.5573849598004017e-06
train batch loss[ 9910 ]:
                           3.697453939821571e-05
train batch loss[ 9920 ]:
                           6.370955816237256e-05
train batch loss[ 9930 ]:
                          2.8060121621820144e-05
train batch loss[ 9940 ]:
                           0.0005522086867131293
train_batch_loss[ 9950 ]:
                          5.033512934460305e-06
train_batch loss[ 9960 ]:
                          2.3049069568514824e-06
train_batch_loss[ 9970 ]:
                           2.3089514797902666e-06
train batch loss[ 9980 ]:
                          1.6163394320756197e-06
train_batch_loss[ 9990 ]: 6.756955554010347e-05
train loss: 0.0002643386913239438
epoch: 100
train batch loss[ 10000 ]: 1.837393756431993e-05
Evaluate: 100% | 12/12 [00:00<00:00, 23.57it/s]
valid evaluation: loss=0.8941356577084099, acc=0.923943661971831
save model at
./torch checkpoints/22 3 24-14/crnn1 010000 loss0.8941356577084099.pt
train batch loss[ 10010 ]:
                            4.601524051395245e-05
                            5.114635860081762e-05
train batch loss[ 10020 ]:
train batch loss[ 10030 ]:
                            6.005743216519477e-06
train batch loss[ 10040 ]:
                            2.6580396479403134e-06
train batch loss[ 10050 ]:
                            0.010339667089283466
train batch loss[ 10060 ]:
                            7.989204459590837e-05
                            5.964422598481178e-06
train batch loss[ 10070 ]:
train_batch_loss[ 10080 ]:
                            5.6525303079979494e-05
train batch loss[ 10090 ]:
                            0.00016924327064771205
train batch loss[ 10100 ]:
                            1.2268622716267903e-06
train loss: 0.0003760852314510868
epoch: 101
train_batch_loss[ 10110 ]:
                            4.003211870440282e-06
train batch loss[ 10120 ]:
                            4.650890696211718e-05
train_batch_loss[ 10130 ]:
                            7.652139174751937e-06
train batch loss[ 10140 ]:
                            8.19782871985808e-06
train batch loss[ 10150 ]:
                            9.291510650655255e-06
train batch loss[ 10160 ]:
                            3.3196861295436975e-06
train batch loss[ 10170 ]:
                            1.8601584088173695e-05
train batch loss[ 10180 ]:
                            4.849461038247682e-05
train batch loss[ 10190 ]:
                            1.0977632882713806e-05
train_batch_loss[ 10200 ]:
                            7.6141441240906715e-06
train loss: 0.003554390840081115
epoch: 102
train batch loss[ 10210 ]:
                            9.154082363238558e-05
train batch loss[ 10220 ]: 0.0007138874498195946
```

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train batch loss[ 10230 ]:
                            1.3089359526929911e-05
train batch loss[ 10240 ]:
                            8.66859991219826e-05
train batch loss[ 10250 ]:
                            0.004640054423362017
train batch loss[ 10260 ]:
                            3.2297677535098046e-05
train batch loss[ 10270 ]:
                            0.0006507504731416702
train_batch_loss[ 10280 ]:
                            0.00015581022307742387
train batch loss[ 10290 ]:
                            7.037808245513588e-06
train batch loss[ 10300 ]:
                            0.0001471904688514769
train loss: 0.00660469958125683
epoch: 103
train batch loss[ 10310 ]:
                            1.590657848282717e-05
train batch loss[ 10320 ]:
                            6.576864961971296e-06
train_batch_loss[ 10330 ]:
                            1.1727240689651808e-06
train_batch loss[ 10340 ]:
                            8.311740202771034e-06
train batch loss[ 10350 ]:
                            1.9086473912466317e-06
train batch loss[ 10360 ]:
                            0.00015005472232587636
train batch loss[ 10370 ]:
                            1.5495819752686657e-05
train batch loss[ 10380 ]:
                            9.973451597034e-06
                            3.815875516011147e-06
train batch loss[ 10390 ]:
train_batch_loss[ 10400 ]:
                            1.1711373417711002e-06
train loss: 0.0025486637003014844
epoch: 104
train batch loss[ 10410 ]:
                            0.001809676643460989
train batch loss[ 10420 ]:
                            0.0054458435624837875
train batch loss[ 10430 ]:
                            1.0719068086473271e-05
train batch loss[ 10440 ]:
                            7.981964154168963e-05
train_batch_loss[ 10450 ]:
                            9.643182238505688e-06
train batch loss[ 10460 ]:
                            7.88217585068196e-06
train batch loss[ 10470 ]:
                            2.916898438343196e-06
train_batch_loss[ 10480 ]:
                            0.0001873869332484901
train batch loss[ 10490 ]:
                            6.246480188565329e-05
train_batch_loss[ 10500 ]: 1.3241513443063013e-05
Evaluate: 100% | 12/12 [00:00<00:00, 26.78it/s]
valid evaluation: loss=0.9254451086613494, acc=0.9267605633802817
save model at
./torch checkpoints/22 3 24-14/crnn1 010500 loss0.9254451086613494.pt
train_loss: 0.00019220726575925484
epoch: 105
train batch loss[ 10510 ]:
                            5.543367933569243e-07
train batch loss[ 10520 ]:
                            4.826008535019355e-06
train batch loss[ 10530 ]:
                            2.057684014289407e-06
train_batch_loss[ 10540 ]:
                            2.5258868845412508e-05
train batch loss[ 10550 ]:
                            6.821631359343883e-06
train_batch_loss[ 10560 ]:
                            2.5795989131438546e-06
train batch loss[ 10570 ]:
                            1.1601252481341362e-05
train batch loss[ 10580 ]:
                            9.114115755437524e-07
train_batch_loss[ 10590 ]:
                            6.528514404635644e-07
train batch loss[ 10600 ]:
                            2.7742330530600157e-06
```

```
train loss:
             0.00031015897675070234
epoch: 106
train batch loss[ 10610 ]:
                            2.5738179374457104e-06
train batch loss[ 10620 ]:
                            5.054712801211281e-06
train batch loss[ 10630 ]:
                            1.3829977660861914e-06
train_batch_loss[ 10640 ]:
                            9.160088666249067e-06
train batch loss[ 10650 ]:
                            1.3586464774562046e-05
train batch loss[ 10660 ]:
                            0.0001614960638107732
train batch loss[ 10670 ]:
                            1.288047997149988e-06
train batch loss[ 10680 ]:
                            1.7951932704818319e-06
train_batch_loss[ 10690 ]:
                            1.4609890058636665e-05
train batch loss[ 10700 ]:
                            7.82005736255087e-06
train loss: 0.00017838687493325404
epoch: 107
train batch loss[ 10710 ]:
                            0.009532161988317966
train_batch loss[ 10720 ]:
                            5.601437806035392e-06
train batch loss[ 10730 ]:
                            5.572751251747832e-05
train batch loss[ 10740 ]:
                            0.00015167419041972607
                            1.5215994153550128e-06
train batch loss[ 10750 ]:
train batch loss[ 10760 ]:
                            0.015904169529676437
train batch loss[ 10770 ]:
                            0.009318196214735508
train batch loss[ 10780 ]:
                            8.713721399544738e-06
train batch loss[ 10790 ]:
                            5.6856752053136006e-05
train batch loss[ 10800 ]:
                            5.970028723822907e-06
train loss: 0.012401064042411952
epoch: 108
train_batch_loss[ 10810 ]:
                            6.196903541422216e-06
train batch loss[ 10820 ]:
                            1.4232549801818095e-05
train batch loss[ 10830 ]:
                            4.411486224853434e-05
train_batch_loss[ 10840 ]:
                            1.9365102161827963e-06
train batch loss[ 10850 ]:
                            0.00026390189304947853
train_batch_loss[ 10860 ]:
                            0.19203776121139526
train batch loss[ 10870 ]:
                            0.011476515792310238
train batch loss[ 10880 ]:
                            2.4120819944073446e-05
train batch loss[ 10890 ]:
                            0.00017591292271390557
train batch loss[ 10900 ]:
                            0.05207306146621704
train loss: 0.00401602348254203
epoch: 109
train_batch_loss[ 10910 ]:
                            0.41935527324676514
train batch loss[ 10920 ]:
                            2.496881461411249e-05
train batch loss[ 10930 ]:
                            1.2439427337085363e-05
train batch loss[ 10940 ]:
                            0.0812392458319664
train batch loss[ 10950 ]:
                            2.8662121621891856e-05
train batch loss[ 10960 ]:
                            3.938551162718795e-05
train batch loss[ 10970 ]:
                            5.310845381245599e-07
train_batch_loss[ 10980 ]:
                            1.968590368051082e-06
train batch loss[ 10990 ]:
                            0.00014780942001380026
train batch loss[ 11000 ]:
                            1.9101094039797317e-06
Evaluate: 100% | 12/12 [00:00<00:00, 20.43it/s]
```

```
valid evaluation: loss=0.9612252683706687, acc=0.9098591549295775
save model at
./torch checkpoints/22 3 24-14/crnn1 011000 loss0.9612252683706687.pt
train loss: 0.011188795905461403
epoch: 110
train_batch_loss[ 11010 ]:
                            4.004579386673868e-05
train batch loss[ 11020 ]:
                            2.461971052980516e-05
train batch loss[ 11030 ]:
                            4.788463684235467e-06
train batch loss[ 11040 ]:
                            1.3804017726215534e-05
train batch loss[ 11050 ]:
                            1.8339524103794247e-06
train_batch_loss[ 11060 ]:
                            2.653883711900562e-06
train batch loss[ 11070 ]:
                            3.562984784366563e-05
train_batch_loss[ 11080 ]:
                            0.012061161920428276
train_batch loss[ 11090 ]:
                            8.301793423015624e-05
train batch loss[ 11100 ]:
                            2.0645853510359302e-05
train batch loss[ 11110 ]:
                            1.3150274753570557e-06
train loss: 0.0002355813462587276
epoch: 111
train batch loss[ 11120 ]:
                            2.9987606467329897e-05
train_batch_loss[ 11130 ]:
                            2.881373802665621e-06
train batch loss[ 11140 ]:
                            0.0009182142093777657
train batch loss[ 11150 ]:
                            0.0002870371681638062
train batch loss[ 11160 ]:
                            5.69389812881127e-05
train batch loss[ 11170 ]:
                            9.062619028554764e-07
train batch loss[ 11180 ]:
                            0.00013955104805063456
                            8.083598368102685e-05
train batch loss[ 11190 ]:
train_batch_loss[ 11200 ]:
                            1.0375249075877946e-05
train batch loss[ 11210 ]:
                            2.324914476048434e-06
train loss: 0.00011229602680439443
epoch: 112
train batch loss[ 11220 ]:
                            6.320629836409353e-06
train_batch_loss[ 11230 ]:
                            2.8507131446531275e-06
train batch loss[ 11240 ]:
                            0.00021051712974440306
train batch loss[ 11250 ]:
                            7.286802429007366e-06
train batch loss[ 11260 ]:
                            1.470157144467521e-06
train batch loss[ 11270 ]:
                            9.491074706602376e-06
train batch loss[ 11280 ]:
                            2.7576912543736398e-05
train batch loss[ 11290 ]:
                            1.3311345128386165e-06
train_batch_loss[ 11300 ]:
                            4.432612695381977e-05
                            2.6397145120427012e-05
train batch loss[ 11310 ]:
train loss: 0.00010767881308789646
epoch: 113
train batch loss[ 11320 ]:
                            1.6106278053484857e-06
train batch loss[ 11330 ]:
                            5.852198228240013e-06
train batch loss[ 11340 ]:
                            8.740314569877228e-07
train_batch_loss[ 11350 ]:
                            1.4905761418049224e-05
train batch loss[ 11360 ]:
                            6.337666036415612e-07
train batch loss[ 11370 ]:
                            6.147770363895688e-06
train batch loss[ 11380 ]:
                            1.357372411803226e-06
train batch loss[ 11390 ]: 3.420645953156054e-06
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train batch loss[ 11400 ]: 2.8801732696592808e-06
train batch loss[ 11410 ]: 3.349145345055149e-06
train loss: 0.00027994928094819606
epoch: 114
train batch loss[ 11420 ]:
                            1.2665195754379965e-05
train_batch_loss[ 11430 ]:
                            3.0403753044083714e-05
train batch loss[ 11440 ]:
                            1.0242220014333725e-06
train batch loss[ 11450 ]:
                            3.501848186715506e-05
train batch loss[ 11460 ]:
                            1.4298504538601264e-05
train batch loss[ 11470 ]:
                            5.723016784031643e-06
train batch loss[ 11480 ]:
                            2.7333435355103575e-05
train batch loss[ 11490 ]:
                            3.9342554373433813e-05
train_batch loss[ 11500 ]:
                            1.7411755834473297e-05
Evaluate: 100% | 12/12 [00:00<00:00, 21.89it/s]
valid evaluation: loss=1.0146929046532638, acc=0.923943661971831
save model at
./torch checkpoints/22 3 24-14/crnn1 011500 loss1.0146929046532638.pt
train batch loss[ 11510 ]: 0.0004186595615465194
train loss: 0.010686640054029854
epoch: 115
train batch loss[ 11520 ]:
                            0.0001634654909139499
train batch loss[ 11530 ]:
                            4.994612027076073e-06
train batch loss[ 11540 ]:
                            1.4456327335210517e-06
                            1.5904455722193234e-05
train batch loss[ 11550 ]:
train batch loss[ 11560 ]:
                            3.2185341751755914e-06
train batch loss[ 11570 ]:
                            0.00011022407852578908
train batch loss[ 11580 ]:
                            8.27226831461303e-05
train batch loss[ 11590 ]:
                            1.4664019545307383e-06
                            2.5777100745472126e-05
train batch loss[ 11600 ]:
train_batch_loss[ 11610 ]:
                            8.747432730160654e-06
train loss: 0.006854641455559014
epoch: 116
train batch loss[ 11620 ]:
                            2.842047933881986e-06
train batch loss[ 11630 ]:
                            3.275755034337635e-06
train_batch_loss[ 11640 ]:
                            0.00029480698867700994
train batch loss[ 11650 ]:
                            7.682619616389275e-05
train_batch_loss[ 11660 ]:
                            0.0001254002272617072
                            0.0005357905756682158
train batch loss[ 11670 ]:
train batch loss[ 11680 ]:
                            7.889222615631297e-06
train batch loss[ 11690 ]:
                            1.646444434300065e-05
train batch loss[ 11700 ]:
                            0.0002747380349319428
train_batch_loss[ 11710 ]:
                            1.482182960899081e-05
train loss: 0.009415694558229836
epoch: 117
train batch loss[ 11720 ]:
                            3.9419683162122965e-07
train batch loss[ 11730 ]:
                            4.3638683564495295e-06
train_batch_loss[ 11740 ]:
                            1.009586685540853e-05
train batch loss[ 11750 ]:
                            2.4565088097006083e-06
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train batch loss[ 11760 ]:
                            2.4921546355471946e-06
train batch loss[ 11770 ]:
                            6.122110062278807e-05
train batch loss[ 11780 ]:
                            1.0641102562658489e-05
train batch loss[ 11790 ]:
                            4.738918050861685e-06
train batch loss[ 11800 ]:
                            0.04140188544988632
train_batch_loss[ 11810 ]:
                            5.38998210686259e-06
train loss: 0.003401525789590351
epoch: 118
                            1.2880801477876958e-05
train batch loss[ 11820 ]:
train batch loss[ 11830 ]:
                            7.011937213974306e-06
train_batch_loss[ 11840 ]:
                            1.0390644092694856e-05
train batch loss[ 11850 ]:
                            0.0002492503263056278
train_batch_loss[ 11860 ]:
                            0.0035981819964945316
train batch loss[ 11870 ]:
                            9.007355401990935e-06
train batch loss[ 11880 ]:
                            3.877675680996617e-06
train batch loss[ 11890 ]:
                            2.6475114282220602e-05
train batch loss[ 11900 ]:
                            2.7344905902282335e-05
train batch loss[ 11910 ]:
                            7.87255703471601e-05
train loss: 0.005148430134181586
epoch: 119
train batch loss[ 11920 ]:
                            9.04506232473068e-05
train batch loss[ 11930 ]:
                            8.673443517182022e-06
train batch loss[ 11940 ]:
                            9.262058483727742e-06
train batch loss[ 11950 ]:
                            3.33827301801648e-05
train batch loss[ 11960 ]:
                            7.413726416416466e-05
train batch loss[ 11970 ]:
                            0.0009406295721419156
train_batch_loss[ 11980 ]:
                            0.07884340733289719
                            1.3886266970075667e-05
train batch loss[ 11990 ]:
train batch loss[ 12000 ]: 9.934301488101482e-07
Evaluate: 100% | 12/12 [00:00<00:00, 20.93it/s]
valid evaluation: loss=0.8495553951238243, acc=0.9436619718309859
save model at
./torch checkpoints/22 3 24-14/crnn1 012000 loss0.8495553951238243.pt
train batch loss[ 12010 ]: 9.695399057818577e-06
train_loss: 0.0016170739275279179
epoch: 120
train_batch_loss[ 12020 ]:
                            2.9774375434499234e-05
train batch loss[ 12030 ]:
                            1.3290858987602405e-05
train batch loss[ 12040 ]:
                            9.960014722310007e-06
train batch loss[ 12050 ]:
                            4.364995675132377e-06
train batch loss[ 12060 ]:
                            3.283836576883914e-06
train batch loss[ 12070 ]:
                            1.6145873814821243e-05
train batch loss[ 12080 ]:
                            3.6483143048826605e-05
train_batch_loss[ 12090 ]:
                            2.330918869120069e-05
train batch loss[ 12100 ]:
                            4.075103788636625e-05
train batch loss[ 12110 ]:
                            1.491536750108935e-05
train batch loss[ 12120 ]:
                            0.0
train loss: 0.002874374530573832
```

```
epoch: 121
train batch loss[ 12130 ]:
                            0.011149058118462563
train batch loss[ 12140 ]:
                            8.172491652658209e-05
train batch loss[ 12150 ]:
                            2.9865504984627478e-05
train batch loss[ 12160 ]:
                            7.010384592831542e-07
train_batch_loss[ 12170 ]:
                            1.2245776815689169e-05
train batch loss[ 12180 ]:
                            7.063865268719383e-06
train batch loss[ 12190 ]:
                            1.4262168406276032e-05
                            1.1211780474695843e-05
train batch loss[ 12200 ]:
                            4.4790331230615266e-06
train batch loss[ 12210 ]:
train_batch_loss[ 12220 ]:
                            4.268578322808025e-06
train loss: 0.002936577064098881
epoch: 122
train batch loss[ 12230 ]:
                            1.3783719623461366e-06
train batch loss[ 12240 ]:
                            9.792960554477759e-06
train batch loss[ 12250 ]:
                            3.6299825296737254e-06
train batch loss[ 12260 ]:
                            7.046559039736167e-05
train batch loss[ 12270 ]:
                            4.5917739043943584e-05
train batch loss[ 12280 ]:
                            3.316807851660997e-05
train batch loss[ 12290 ]:
                            3.578375617507845e-05
train batch loss[ 12300 ]:
                            4.554303814074956e-06
train batch loss[ 12310 ]:
                            4.011153578176163e-06
train batch loss[ 12320 ]:
                            9.211894393956754e-06
train loss: 0.004402628805378616
epoch: 123
train batch loss[ 12330 ]:
                            0.00021711816953029484
train_batch_loss[ 12340 ]:
                            3.2468651625094935e-05
train batch loss[ 12350 ]:
                            1.1829283721453976e-05
train batch loss[ 12360 ]:
                            1.6939455235842615e-05
train_batch_loss[ 12370 ]:
                            0.00035728176590055227
train batch loss[ 12380 ]:
                            0.03327133506536484
train_batch_loss[ 12390 ]:
                            3.030657535418868e-05
train batch loss[ 12400 ]:
                            1.989525480894372e-05
train batch loss[ 12410 ]:
                            3.1057486921781674e-05
train batch loss[ 12420 ]: 7.003763312241063e-05
train loss: 0.003961693143174954
epoch: 124
train batch loss[ 12430 ]:
                            1.1772468496928923e-05
train_batch_loss[ 12440 ]:
                            0.0002890012401621789
train batch loss[ 12450 ]:
                            2.5812681997194886e-05
train batch loss[ 12460 ]:
                            2.296838465554174e-05
train batch loss[ 12470 ]:
                            1.674517761784955e-06
                            8.747082347326796e-07
train batch loss[ 12480 ]:
train batch loss[ 12490 ]:
                            2.430254426144529e-06
train batch loss[ 12500 ]:
                            5.273737770039588e-06
Evaluate: 100% | 12/12 [00:00<00:00, 21.47it/s]
valid evaluation: loss=0.9378341748172164, acc=0.9211267605633803
save model at
```

```
./torch checkpoints/22 3 24-14/crnn1 012500 loss0.9378341748172164.pt
train batch loss[ 12510 ]:
                            0.003979692701250315
train batch loss[ 12520 ]:
                            5.647776106343372e-06
train loss: 0.005389199905227252
epoch: 125
train_batch_loss[ 12530 ]:
                            8.497706858179299e-07
train batch loss[ 12540 ]:
                            3.656569606391713e-05
train batch loss[ 12550 ]:
                            0.0026607608888298273
train batch loss[ 12560 ]:
                            8.082772183115594e-06
train batch loss[ 12570 ]:
                            3.049292899959255e-06
train_batch_loss[ 12580 ]:
                            1.656505673963693e-06
train batch loss[ 12590 ]:
                            9.077607683138922e-05
train_batch_loss[ 12600 ]:
                            0.0014369639102369547
train batch loss[ 12610 ]:
                            6.647949703619815e-06
train_batch_loss[ 12620 ]:
                            2.564271562732756e-05
train loss: 0.0013048869045538059
epoch: 126
train batch loss[ 12630 ]:
                            1.521216381661361e-05
train batch loss[ 12640 ]:
                            7.162897873058682e-06
train batch loss[ 12650 ]:
                            1.4538600225932896e-06
train batch loss[ 12660 ]:
                            1.8740577161224792e-06
train batch loss[ 12670 ]:
                            1.3814315025229007e-06
train batch loss[ 12680 ]:
                            5.857821633981075e-06
train batch loss[ 12690 ]:
                            4.7612134949304163e-05
train batch loss[ 12700 ]:
                            5.240856353339041e-06
train batch loss[ 12710 ]:
                            1.4156139513943344e-05
train_batch_loss[ 12720 ]:
                            2.901867219406995e-06
train loss: 0.002803370645063796
epoch: 127
train batch loss[ 12730 ]:
                            6.029405085428152e-06
train batch loss[ 12740 ]:
                            3.293707550255931e-06
train_batch_loss[ 12750 ]:
                            7.930053698146367e-07
train batch loss[ 12760 ]:
                            5.558175871556159e-06
train batch loss[ 12770 ]:
                            3.889248182531446e-05
train batch loss[ 12780 ]:
                            0.0002846185234375298
train batch loss[ 12790 ]:
                            2.752886757662054e-06
train batch loss[ 12800 ]:
                            7.455365903297206e-06
train batch loss[ 12810 ]:
                            0.008037456311285496
train_batch_loss[ 12820 ]:
                            0.004312196280807257
train loss: 0.009866502569970096
epoch: 128
train batch loss[ 12830 ]:
                            2.9325062769203214e-06
train batch loss[ 12840 ]:
                            2.67125760728959e-05
train batch loss[ 12850 ]:
                            7.648140467608755e-07
train batch loss[ 12860 ]:
                            5.821137165185064e-06
train_batch_loss[ 12870 ]:
                            0.02065463177859783
train batch loss[ 12880 ]:
                            3.2776875741546974e-05
train batch loss[ 12890 ]:
                            0.0006944767665117979
train batch loss[ 12900 ]:
                            3.434692553128116e-05
```

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train batch loss[ 12910 ]: 9.445188879908528e-06
train batch loss[ 12920 ]: 1.9716142560355365e-05
train loss: 0.011275677147195632
epoch: 129
train batch loss[ 12930 ]:
                            6.707113789161667e-05
train_batch_loss[ 12940 ]:
                            2.0898092770949006e-05
train batch loss[ 12950 ]:
                            7.528629794251174e-06
train batch loss[ 12960 ]:
                            3.523296300045331e-06
train batch loss[ 12970 ]:
                            2.022445733018685e-05
train batch loss[ 12980 ]:
                            1.0852845662157051e-05
train batch loss[ 12990 ]:
                            4.3610566535789985e-07
train_batch_loss[ 13000 ]:
                           1.0053918231278658e-06
Evaluate: 100% | 12/12 [00:00<00:00, 20.32it/s]
valid evaluation: loss=0.9196159016498378, acc=0.9211267605633803
save model at
./torch_checkpoints/22_3_24-14/crnn1_013000_loss0.9196159016498378.pt
train batch loss[ 13010 ]: 1.2588247955136467e-06
train_batch_loss[ 13020 ]:
                            0.00019201490795239806
train loss: 0.00022736805950000435
epoch: 130
train batch loss[ 13030 ]:
                            2.0109753677388653e-05
train batch loss[ 13040 ]:
                            3.8884958485141397e-05
train batch loss[ 13050 ]:
                            2.2188123693922535e-05
train batch loss[ 13060 ]:
                           7.255844138853718e-06
train batch loss[ 13070 ]:
                            1.092451475415146e-05
train batch loss[ 13080 ]:
                            1.2902225989819271e-06
train batch loss[ 13090 ]:
                            3.75290255760774e-07
train batch loss[ 13100 ]:
                            4.9493173719383776e-05
                           2.18536879401654e-05
train batch loss[ 13110 ]:
train_batch_loss[ 13120 ]:
                            0.000394953356590122
train batch loss[ 13130 ]: 1.5894571940104166e-07
train loss: 0.0013753170565511624
epoch: 131
train batch loss[ 13140 ]:
                            7.833432391635142e-06
train_batch_loss[ 13150 ]:
                            0.008713486604392529
train batch loss[ 13160 ]:
                            1.119360877055442e-05
train_batch_loss[ 13170 ]:
                            1.622038666937442e-06
train batch loss[ 13180 ]:
                            1.9065863625655766e-06
train batch loss[ 13190 ]:
                            5.8492769312579185e-06
train batch loss[ 13200 ]:
                            0.00019493410945869982
train batch loss[ 13210 ]:
                            7.825376087566838e-06
train batch loss[ 13220 ]:
                            6.045345799066126e-06
train batch loss[ 13230 ]:
                            1.0587536053208169e-05
train_loss: 0.0002199224280018398
epoch: 132
train batch loss[ 13240 ]:
                            3.3621834063524147e-06
train_batch_loss[ 13250 ]: 3.482924967102008e-06
train batch loss[ 13260 ]: 6.010857759974897e-05
```

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train batch loss[ 13270 ]:
                            7.519411155954003e-07
train batch loss[ 13280 ]:
                            2.4743344511080068e-06
train batch loss[ 13290 ]:
                            8.767615327087697e-06
train batch loss[ 13300 ]:
                            4.0685405110707507e-05
train batch loss[ 13310 ]:
                            8.85503595782211e-07
train_batch_loss[ 13320 ]:
                            3.8037169360904954e-06
train batch loss[ 13330 ]:
                            3.6553688005369622e-06
train loss: 1.333080482659643e-05
epoch: 133
train batch loss[ 13340 ]:
                            1.288879502681084e-06
train batch loss[ 13350 ]:
                            1.1378974704712164e-06
train batch loss[ 13360 ]:
                            5.755571237386903e-07
train_batch_loss[ 13370 ]:
                            1.932712393681868e-06
train batch loss[ 13380 ]:
                            1.2681302905548364e-05
train batch loss[ 13390 ]:
                            6.138599928817712e-06
train batch loss[ 13400 ]:
                            6.626353865613055e-07
train batch loss[ 13410 ]:
                            1.3300050341058522e-06
train batch loss[ 13420 ]:
                            1.509091816842556e-06
train batch loss[ 13430 ]:
                            8.58888597576879e-07
train loss: 4.282704510324524e-06
epoch: 134
train batch loss[ 13440 ]:
                            2.4690370992175303e-06
train batch loss[ 13450 ]:
                            2.119937335010036e-06
train batch loss[ 13460 ]:
                            1.2738746590912342e-06
train batch loss[ 13470 ]:
                            1.092268348656944e-06
train batch loss[ 13480 ]:
                            8.543224225832091e-07
train_batch_loss[ 13490 ]:
                            5.589918146142736e-07
train batch loss[ 13500 ]: 2.1223513613222167e-06
Evaluate: 100% | 12/12 [00:00<00:00, 22.03it/s]
valid evaluation: loss=0.8456282740655604, acc=0.9323943661971831
save model at
./torch checkpoints/22 3 24-14/crnn1 013500 loss0.8456282740655604.pt
                            5.602267947324435e-07
train batch loss[ 13510 ]:
train batch loss[ 13520 ]:
                            6.819583404649165e-07
train_batch_loss[ 13530 ]:
                            1.9669516859721625e-06
train loss: 1.5503043688510074e-06
epoch: 135
train batch loss[ 13540 ]:
                            4.0105078369379044e-07
train batch loss[ 13550 ]:
                            6.756725383638695e-07
train batch loss[ 13560 ]:
                            1.8024902601609938e-05
train batch loss[ 13570 ]:
                            2.1487157937372103e-06
train batch loss[ 13580 ]:
                            7.058015398797579e-07
train batch loss[ 13590 ]:
                            5.548194508264714e-07
train_batch_loss[ 13600 ]:
                            9.706734545034124e-07
                            6.258484290810884e-07
train batch loss[ 13610 ]:
train batch loss[ 13620 ]:
                            1.664564251768752e-06
train batch loss[ 13630 ]:
                            1.3643521015183069e-06
train loss: 1.3117393081456182e-06
```

```
epoch: 136
train batch loss[ 13640 ]:
                            7.876277550167288e-07
train batch loss[ 13650 ]:
                            5.85596865221305e-07
train batch loss[ 13660 ]:
                            1.1235388228669763e-06
train batch loss[ 13670 ]:
                            6.345504743876518e-07
train_batch_loss[ 13680 ]:
                            3.4906406654044986e-07
train batch loss[ 13690 ]:
                            9.299071734858444e-07
train batch loss[ 13700 ]:
                            5.451124707178678e-07
train batch loss[ 13710 ]:
                            4.691532922151964e-07
train batch loss[ 13720 ]:
                            7.720979624536994e-07
train_batch_loss[ 13730 ]:
                            6.851571470178897e-07
train loss: 6.925449259812145e-07
epoch: 137
train batch loss[ 13740 ]:
                            4.357557372713927e-07
train batch loss[ 13750 ]:
                            1.05873857592087e-06
train batch loss[ 13760 ]:
                            2.6749319204100175e-07
train batch loss[ 13770 ]:
                            4.6720370505681785e-07
train batch loss[ 13780 ]:
                            3.7390873330878094e-07
train batch loss[ 13790 ]:
                            2.931028575403616e-07
train batch loss[ 13800 ]:
                            2.5145283188976464e-07
train batch loss[ 13810 ]:
                            2.5234930944861844e-07
train batch loss[ 13820 ]:
                            4.307493099986459e-07
train batch loss[ 13830 ]:
                            7.513734772146563e-07
train loss: 4.839865231986575e-07
epoch: 138
train batch loss[ 13840 ]:
                            3.380700945854187e-07
train_batch_loss[ 13850 ]:
                            3.292076087291207e-07
train batch loss[ 13860 ]:
                            3.964828465541359e-07
train batch loss[ 13870 ]:
                            1.6346160691682599e-07
train_batch_loss[ 13880 ]:
                            2.952701265712676e-07
train batch loss[ 13890 ]:
                            2.8163046295048844e-07
train_batch_loss[ 13900 ]:
                            1.8666284518076282e-07
train batch loss[ 13910 ]:
                            4.4519754283101065e-07
train batch loss[ 13920 ]:
                            1.8346584340633854e-07
train batch loss[ 13930 ]:
                            7.303448796847078e-07
train loss: 3.4600956095494696e-07
epoch: 139
train batch loss[ 13940 ]:
                            1.6641752154100686e-07
train_batch_loss[ 13950 ]:
                            2.5890034294207e-07
train batch loss[ 13960 ]:
                            1.3073433535737422e-07
train batch loss[ 13970 ]:
                            1.369025994790718e-07
train batch loss[ 13980 ]:
                            1.745634108374361e-07
train batch loss[ 13990 ]:
                            1.930018243001541e-07
train batch loss[ 14000 ]:
                            9.877840057015419e-08
Evaluate: 100%
                  | 12/12 [00:00<00:00, 21.67it/s]
valid evaluation: loss=0.8379797920686337, acc=0.9352112676056338
save model at
./torch_checkpoints/22_3_24-14/crnn1 014000 loss0.8379797920686337.pt
```

```
train batch loss[ 14010 ]:
                            2.1978439690428786e-07
train batch loss[ 14020 ]:
                            4.517621619015699e-07
train batch loss[ 14030 ]:
                            2.8777856186934514e-07
train loss: 2.3671513305990012e-07
epoch: 140
train_batch_loss[ 14040 ]:
                            1.4893521438352764e-07
train batch loss[ 14050 ]:
                            1.1909287422895432e-07
train batch loss[ 14060 ]:
                            2.2548181277670665e-07
train batch loss[ 14070 ]:
                            3.059358277823776e-07
train batch loss[ 14080 ]:
                            1.416765371686779e-07
train batch loss[ 14090 ]:
                            2.521554733903031e-07
train batch loss[ 14100 ]:
                            2.0477409634622745e-07
train_batch_loss[ 14110 ]:
                            9.092036634683609e-08
train batch loss[ 14120 ]:
                            1.1443623293416749e-07
train batch loss[ 14130 ]:
                            1.3969838619232178e-07
train batch loss[ 14140 ]:
                            0.0
train loss: 1.6091775508087918e-07
epoch: 141
train batch loss[ 14150 ]:
                            7.584253580716904e-08
train batch loss[ 14160 ]:
                            1.0331859812140465e-07
train batch loss[ 14170 ]:
                            1.4295073924586177e-07
train batch loss[ 14180 ]:
                            5.5399141274392605e-08
train batch loss[ 14190 ]:
                            1.5753886373204296e-07
train batch loss[ 14200 ]:
                            9.493305697105825e-08
train batch loss[ 14210 ]:
                            6.425807441701181e-08
train batch loss[ 14220 ]:
                            4.6566128730773926e-08
train_batch_loss[ 14230 ]:
                            5.820765380804005e-08
                            3.6903657019138336e-08
train batch loss[ 14240 ]:
train loss: 1.0371717327784121e-07
epoch: 142
train batch loss[ 14250 ]:
                            4.417961463332176e-08
train_batch_loss[ 14260 ]:
                            9.493669494986534e-08
train batch loss[ 14270 ]:
                            1.0717553777794819e-07
train batch loss[ 14280 ]:
                            6.262723672989523e-08
train batch loss[ 14290 ]:
                            6.752087244876748e-08
train batch loss[ 14300 ]:
                            6.332629709504545e-08
train batch loss[ 14310 ]:
                            4.383036866784096e-08
train batch loss[ 14320 ]:
                            8.171627996489406e-08
train_batch_loss[ 14330 ]:
                            8.274167839772417e-08
                            3.311788532300852e-08
train batch loss[ 14340 ]:
train loss: 6.770901821553825e-08
epoch: 143
train batch loss[ 14350 ]:
                            4.0046757021627855e-08
train batch loss[ 14360 ]:
                            1.3969838619232178e-08
train batch loss[ 14370 ]:
                            4.1913150283789946e-08
train_batch_loss[ 14380 ]:
                            3.189779818058014e-08
train batch loss[ 14390 ]:
                            2.163869794458151e-08
train batch loss[ 14400 ]:
                            6.926711648702621e-08
train batch loss[ 14410 ]:
                            3.905734047293663e-08
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train batch loss[ 14420 ]: 3.3498054108349606e-08
train batch loss[ 14430 ]:
                           3.53898030880373e-08
train batch loss[ 14440 ]: 3.258537617512047e-08
train loss: 3.9707128508296875e-08
epoch: 144
train_batch_loss[ 14450 ]:
                            1.30385160446167e-08
train batch loss[ 14460 ]:
                            3.6961864680051804e-08
train batch loss[ 14470 ]:
                            2.7488567866384983e-08
train batch loss[ 14480 ]:
                            3.7252896323280993e-09
train batch loss[ 14490 ]:
                            2.0692823454737663e-08
train batch loss[ 14500 ]: 1.5831574273761362e-08
Evaluate: 100% | 12/12 [00:00<00:00, 29.60it/s]
valid evaluation: loss=0.8475994608515848, acc=0.9352112676056338
save model at
./torch checkpoints/22 3 24-14/crnn1 014500 loss0.8475994608515848.pt
train_batch_loss[ 14510 ]: 1.8044374883174896e-08
train batch loss[ 14520 ]:
                           1.8088030628859997e-08
train batch loss[ 14530 ]:
                            3.2071966415969655e-08
train batch loss[ 14540 ]:
                            2.654268982382746e-08
train loss: 2.3645128311076078e-08
epoch: 145
                            3.213062882423401e-08
train batch loss[ 14550 ]:
train batch loss[ 14560 ]:
                           7.436028681695461e-09
train batch loss[ 14570 ]:
                            3.3760443329811096e-09
train batch loss[ 14580 ]:
                           -6.984919309616089e-09
train batch loss[ 14590 ]:
                            1.1634224250656189e-08
train batch loss[ 14600 ]:
                            3.725290298461914e-09
train batch loss[ 14610 ]:
                            5.587935447692871e-09
train batch loss[ 14620 ]: 7.450580596923828e-09
train_batch_loss[ 14630 ]:
                            1.302305108197288e-08
train batch loss[ 14640 ]: 2.194065018557012e-08
train loss: 1.3110345705994686e-08
epoch: 146
train batch loss[ 14650 ]:
                            1.4551915228366852e-11
train_batch_loss[ 14660 ]:
                            6.51925802230835e-09
                            4.1763996705412865e-09
train batch loss[ 14670 ]:
train_batch_loss[ 14680 ]:
                            2.7939677238464355e-09
train batch loss[ 14690 ]:
                            -4.547473508864641e-13
train batch loss[ 14700 ]:
                            -3.259629011154175e-09
                            7.446885774697876e-09
train batch loss[ 14710 ]:
train batch loss[ 14720 ]:
                            1.5832483768463135e-08
train batch loss[ 14730 ]:
                            -2.7939677238464355e-09
train batch loss[ 14740 ]:
                            0.0
train_loss: 5.5280494307093995e-09
epoch: 147
train batch loss[ 14750 ]:
                            0.0
train_batch_loss[ 14760 ]:
                            3.259629011154175e-09
train batch loss[ 14770 ]:
                            0.0
```

```
train_batch loss[ 14780 ]:
                            1.862645149230957e-09
train batch loss[ 14790 ]:
                            9.313225746154785e-10
train batch loss[ 14800 ]:
                            4.190950697591234e-09
train batch loss[ 14810 ]:
                            9.313225746154785e-10
train batch loss[ 14820 ]:
                            0.0
train_batch_loss[ 14830 ]:
                            1.0943040251731873e-08
train batch loss[ 14840 ]:
                            0.0
train loss: 4.611922641057975e-09
epoch: 148
train batch loss[ 14850 ]:
                            5.215224518906325e-08
train batch loss[ 14860 ]:
                            4.190951585769653e-09
train batch loss[ 14870 ]:
                            1.0244491477351403e-08
train_batch_loss[ 14880 ]:
                            4.749017179506154e-08
train_batch loss[ 14890 ]:
                            7.450580596923828e-09
train batch loss[ 14900 ]:
                            3.725290298461914e-09
train batch loss[ 14910 ]:
                            0.702092707157135
train batch loss[ 14920 ]:
                            0.3209880590438843
train batch loss[ 14930 ]:
                            0.15951049327850342
train batch loss[ 14940 ]:
                            9.804096771404147e-05
train loss: 0.0486237592729579
epoch: 149
train batch loss[ 14950 ]:
                            0.0007715562824159861
train batch loss[ 14960 ]:
                            0.00034085812512785196
train batch loss[ 14970 ]:
                            4.1359242459293455e-05
train batch loss[ 14980 ]:
                            0.0006052699754945934
                            1.5331082977354527e-05
train batch loss[ 14990 ]:
train batch loss[ 15000 ]:
                            0.03426346555352211
Evaluate: 100% | 12/12 [00:00<00:00, 28.18it/s]
valid evaluation: loss=0.8071828311282984, acc=0.9380281690140845
save model at
./torch checkpoints/22 3 24-14/crnn1 015000 loss0.8071828311282984.pt
train batch loss[ 15010 ]: 2.1458636183524504e-05
train batch loss[ 15020 ]:
                            9.095905625144951e-06
train batch loss[ 15030 ]:
                            5.390524165704846e-06
train_batch_loss[ 15040 ]:
                            8.320579945575446e-05
train loss: 0.00956311374701052
epoch: 150
train batch loss[ 15050 ]:
                            0.00012425820750650018
train batch loss[ 15060 ]:
                            0.00016856459842529148
train batch loss[ 15070 ]:
                            1.3970306099508889e-05
train batch loss[ 15080 ]:
                            1.4950191143725533e-05
train batch loss[ 15090 ]:
                            2.816316964526777e-06
train batch loss[ 15100 ]:
                            3.7094464460096788e-06
train_batch_loss[ 15110 ]:
                            1.104342118196655e-05
train batch loss[ 15120 ]:
                            8.347647963091731e-06
train batch loss[ 15130 ]:
                            2.4809851311147213e-06
train_batch_loss[ 15140 ]:
                            1.4863885553495493e-06
train batch loss[ 15150 ]:
                            1.986821113556895e-07
```

```
train loss:
             0.009873137370342394
epoch: 151
train batch loss[ 15160 ]:
                            2.29008037422318e-06
train batch loss[ 15170 ]:
                            1.4005041521159e-05
train batch loss[ 15180 ]:
                            3.3378957596141845e-05
train_batch_loss[ 15190 ]:
                            4.37732960563153e-05
train batch loss[ 15200 ]:
                            1.0554532309470233e-05
train batch loss[ 15210 ]:
                            3.837993062916212e-06
train batch loss[ 15220 ]:
                            1.1567026376724243e-06
train batch loss[ 15230 ]:
                            5.061556294094771e-07
train_batch_loss[ 15240 ]:
                            2.3325032998400275e-06
train batch loss[ 15250 ]:
                            2.098508775816299e-05
train loss: 0.00176774811180629
epoch: 152
train batch loss[ 15260 ]:
                            2.3034383048070595e-05
train batch loss[ 15270 ]:
                            8.366312249563634e-05
train batch loss[ 15280 ]:
                            7.88751549407607e-06
train batch loss[ 15290 ]:
                            3.0179044188116677e-06
train batch loss[ 15300 ]:
                            2.031095164056751e-06
train batch loss[ 15310 ]:
                            7.129247023840435e-07
train batch loss[ 15320 ]:
                            0.00011867538705701008
train batch loss[ 15330 ]:
                            1.0759395081549883e-06
train batch loss[ 15340 ]:
                            6.1224395722092595e-06
                            5.121226422488689e-06
train batch loss[ 15350 ]:
train loss: 0.00089311361166598
epoch: 153
train_batch_loss[ 15360 ]:
                            1.5859478708080132e-06
train batch loss[ 15370 ]:
                            6.046364433132112e-06
train batch loss[ 15380 ]:
                            3.414330421946943e-06
train_batch_loss[ 15390 ]:
                            2.190517079725396e-06
train batch loss[ 15400 ]:
                            1.345295345345221e-06
train_batch_loss[ 15410 ]:
                            1.4421398191188928e-06
train batch loss[ 15420 ]:
                            0.00040612430893816054
train batch loss[ 15430 ]:
                            2.561973815318197e-06
train batch loss[ 15440 ]:
                            8.380336566915503e-07
train batch loss[ 15450 ]:
                            3.0497872103296686e-06
train loss: 7.76471757446627e-06
epoch: 154
train_batch_loss[ 15460 ]:
                            1.7578931874595582e-06
train batch loss[ 15470 ]:
                            8.289982815767871e-07
train batch loss[ 15480 ]:
                            7.492256486330007e-07
train batch loss[ 15490 ]:
                            5.350448191165924e-07
train_batch_loss[ 15500 ]:
                            6.888707275720662e-07
Evaluate: 100%
                 | 12/12 [00:00<00:00, 27.29it/s]
valid evaluation: loss=0.8353943915899948, acc=0.9380281690140845
save model at
./torch checkpoints/22 3 24-14/crnn1 015500 loss0.8353943915899948.pt
train batch loss[ 15510 ]: 4.5517654712057265e-07
```

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train batch loss[ 15520 ]:
                            7.126931791390234e-07
train batch loss[ 15530 ]:
                            1.5810933291504625e-06
train batch loss[ 15540 ]:
                            2.2194581106305122e-06
train batch loss[ 15550 ]:
                            0.0001377458102069795
train loss: 1.8308966975199214e-05
epoch: 155
train batch loss[ 15560 ]:
                            1.0925355127255898e-05
train batch loss[ 15570 ]:
                            1.343563781119883e-06
                            0.00018623955838847905
train batch loss[ 15580 ]:
train batch loss[ 15590 ]:
                            0.00030796206556260586
train batch loss[ 15600 ]:
                            4.969584915670566e-05
train batch loss[ 15610 ]:
                            1.985332346521318e-06
train_batch_loss[ 15620 ]:
                            5.300538759911433e-06
train batch loss[ 15630 ]:
                            0.013287543319165707
train batch loss[ 15640 ]:
                            2.5128572815447114e-05
train batch loss[ 15650 ]:
                            0.0035085580311715603
train loss: 0.011647338782019451
epoch: 156
train batch loss[ 15660 ]:
                            6.1747773543174844e-06
train batch loss[ 15670 ]:
                            0.003966913558542728
train batch loss[ 15680 ]:
                            0.012920837849378586
train batch loss[ 15690 ]:
                            4.558946784527507e-06
train batch loss[ 15700 ]:
                            7.752339115540963e-06
train batch loss[ 15710 ]:
                            1.1346679684720584e-06
train batch loss[ 15720 ]:
                            4.223529117552971e-07
train batch loss[ 15730 ]:
                            3.0859580874675885e-05
train_batch_loss[ 15740 ]:
                            1.9477129171718843e-06
                            1.8487428405933315e-06
train batch loss[ 15750 ]:
train loss: 0.010546300602546363
epoch: 157
train batch loss[ 15760 ]:
                            1.2789964785042685e-06
train_batch_loss[ 15770 ]:
                            0.002364842686802149
train batch loss[ 15780 ]:
                            9.204013622365892e-06
train batch loss[ 15790 ]:
                            5.822485945827793e-06
train batch loss[ 15800 ]:
                            5.665343906002818e-06
train batch loss[ 15810 ]:
                            6.727541403961368e-06
train batch loss[ 15820 ]:
                            0.0004660924314521253
train batch loss[ 15830 ]:
                            1.0427234883536585e-05
train_batch_loss[ 15840 ]:
                            3.79456491828023e-06
                            1.3835149729857221e-05
train batch loss[ 15850 ]:
train loss: 0.0015468236025102343
epoch: 158
train batch loss[ 15860 ]:
                            8.773286390351132e-05
train batch loss[ 15870 ]:
                            4.968936536897672e-06
train batch loss[ 15880 ]:
                            5.508488811756251e-06
train_batch_loss[ 15890 ]:
                            3.7312643144105095e-06
train batch loss[ 15900 ]:
                            3.891900632879697e-05
train batch loss[ 15910 ]:
                            2.658032144609024e-06
train batch loss[ 15920 ]:
                            4.2382735045976005e-06
```

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train batch loss[ 15930 ]:
                            3.2291347906721057e-06
train batch loss[ 15940 ]:
                            3.7915503980912035e-07
train batch loss[ 15950 ]: 1.7678967196843587e-05
train loss: 3.801339300754051e-05
epoch: 159
train_batch_loss[ 15960 ]:
                            5.176521517569199e-05
train batch loss[ 15970 ]:
                            6.514252163469791e-06
train batch loss[ 15980 ]:
                            8.04652227088809e-05
train batch loss[ 15990 ]:
                            1.711449272079335e-06
train batch loss[ 16000 ]:
                            1.0000658221542835e-06
Evaluate: 100% | 12/12 [00:00<00:00, 20.99it/s]
valid evaluation: loss=0.9126050940832832, acc=0.9352112676056338
save model at
./torch checkpoints/22 3 24-14/crnn1 016000 loss0.9126050940832832.pt
train batch loss[ 16010 ]: 2.9265216653584503e-05
train_batch_loss[ 16020 ]: 4.772691113430483e-07
train batch loss[ 16030 ]:
                            0.0001223977596964687
train batch loss[ 16040 ]:
                            1.7101942830777261e-06
train batch loss[ 16050 ]:
                            7.564120096503757e-06
train loss: 2.3806492671659737e-05
epoch: 160
train batch loss[ 16060 ]:
                            1.797870936570689e-06
train batch loss[ 16070 ]:
                            5.289803084451705e-07
train batch loss[ 16080 ]:
                            4.711545625468716e-05
train batch loss[ 16090 ]:
                            3.3252290450036526e-06
train batch loss[ 16100 ]:
                            1.1220397936995141e-05
train batch loss[ 16110 ]:
                            5.064159995527007e-05
train batch loss[ 16120 ]:
                            1.6127407889143797e-06
                            9.023274287756067e-07
train batch loss[ 16130 ]:
train_batch_loss[ 16140 ]:
                            3.565137092209625e-07
                            6.8781550908170175e-06
train batch loss[ 16150 ]:
train_batch_loss[ 16160 ]:
                            3.625946798517058e-06
train loss: 3.5706685916902375e-06
epoch: 161
train_batch_loss[ 16170 ]:
                            2.7170972316525877e-07
train batch loss[ 16180 ]:
                            4.384427029435756e-06
train_batch_loss[ 16190 ]:
                            7.573689799755812e-07
train batch loss[ 16200 ]:
                            2.668239176273346e-07
train batch loss[ 16210 ]:
                            9.12718974177551e-07
train batch loss[ 16220 ]:
                            9.194117183142225e-07
train batch loss[ 16230 ]:
                            8.520091796526685e-07
train batch loss[ 16240 ]:
                            6.167609853946487e-07
train batch loss[ 16250 ]:
                            1.4646734598500188e-06
train_batch_loss[ 16260 ]:
                            3.145093785406061e-07
train_loss: 1.1059139472328904e-06
epoch: 162
train batch loss[ 16270 ]:
                            3.7085987969476264e-07
train batch loss[ 16280 ]: 1.0430976544739679e-06
```

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train_batch loss[ 16290 ]:
                            5.24974723248306e-07
train batch loss[ 16300 ]:
                            9.908004585668095e-07
train batch loss[ 16310 ]:
                            6.952201374588185e-07
                            3.8032885640859604e-07
train batch loss[ 16320 ]:
train batch loss[ 16330 ]:
                            2.0675361156463623e-07
train_batch_loss[ 16340 ]:
                            7.561684469692409e-07
train batch loss[ 16350 ]:
                            5.243300620350055e-07
train batch loss[ 16360 ]:
                            4.123063717997866e-06
train loss: 7.348977230066067e-07
epoch: 163
train batch loss[ 16370 ]:
                            6.070546874070715e-07
train batch loss[ 16380 ]:
                            3.087318134475936e-07
train_batch_loss[ 16390 ]:
                            6.011686650708725e-07
train_batch loss[ 16400 ]:
                            7.951091447466752e-07
train batch loss[ 16410 ]:
                            6.756445145583712e-07
train batch loss[ 16420 ]:
                            8.19035847143823e-07
train batch loss[ 16430 ]:
                            1.9790604710578918e-07
train batch loss[ 16440 ]:
                            5.344477926882973e-07
                            1.0238544234653091e-07
train batch loss[ 16450 ]:
train_batch_loss[ 16460 ]:
                            3.59062823918066e-07
train loss: 5.161396450684416e-07
epoch: 164
train batch loss[ 16470 ]:
                            4.434783136275655e-07
train batch loss[ 16480 ]:
                            4.773027626470139e-07
train batch loss[ 16490 ]:
                            1.0238724712507974e-07
train batch loss[ 16500 ]:
                            4.876334287473583e-07
Evaluate: 100% | 12/12 [00:00<00:00, 28.36it/s]
valid evaluation: loss=0.8776617940246377, acc=0.9408450704225352
save model at
./torch checkpoints/22 3 24-14/crnn1 016500 loss0.8776617940246377.pt
train_batch loss[ 16510 ]:
                            4.806206561625004e-07
train batch loss[ 16520 ]:
                            6.79820288951305e-07
train batch loss[ 16530 ]:
                            2.5634653866291046e-07
train batch loss[ 16540 ]:
                            5.355103098736436e-07
train_batch_loss[ 16550 ]:
                            5.491262982104672e-07
train batch loss[ 16560 ]:
                            4.2623418039511307e-07
train_loss: 3.6877658901544746e-07
epoch: 165
train batch loss[ 16570 ]:
                            6.050177034921944e-07
train_batch_loss[ 16580 ]:
                            2.2895966367286746e-07
train batch loss[ 16590 ]:
                            3.506373786876793e-07
train batch loss[ 16600 ]:
                            4.7350465592899127e-07
train batch loss[ 16610 ]:
                            3.735621589839866e-07
train_batch_loss[ 16620 ]:
                            2.2631138563156128e-07
train batch loss[ 16630 ]:
                            1.219886911485446e-07
train batch loss[ 16640 ]:
                            2.022133571699669e-07
                            3.4594268072396517e-07
train_batch_loss[ 16650 ]:
train batch loss[ 16660 ]:
                            2.3218743194775016e-07
```

```
2.6671931764403034e-07
train loss:
epoch: 166
train batch loss[ 16670 ]:
                            1.6185728668460797e-07
train batch loss[ 16680 ]:
                            3.1972010106073867e-07
train batch loss[ 16690 ]:
                            9.515491683487198e-08
train_batch_loss[ 16700 ]:
                            4.227763952258101e-07
train batch loss[ 16710 ]:
                            8.086497871317988e-08
train batch loss[ 16720 ]:
                            2.9802322387695312e-08
train batch loss[ 16730 ]:
                            2.1624146029353142e-07
train batch loss[ 16740 ]:
                            8.900678949430585e-08
train_batch_loss[ 16750 ]:
                            1.0058185750949633e-07
train batch loss[ 16760 ]: 7.493424050153408e-07
train loss: 1.8579021233581143e-07
epoch: 167
train_batch_loss[ 16770 ]:
                            3.010461568919709e-07
train_batch loss[ 16780 ]:
                            8.799543138593435e-08
train batch loss[ 16790 ]:
                            1.0424987806345598e-07
train batch loss[ 16800 ]:
                            1.8597347661852837e-07
                            1.5459575308796047e-07
train batch loss[ 16810 ]:
train batch loss[ 16820 ]:
                            1.423177167225731e-07
train batch loss[ 16830 ]:
                            1.6015836479255086e-07
train batch loss[ 16840 ]:
                            1.0291113738958302e-07
                            1.6333052599293296e-07
train batch loss[ 16850 ]:
train batch loss[ 16860 ]:
                            4.470324910244017e-08
train loss: 1.257342629721043e-07
epoch: 168
train_batch_loss[ 16870 ]:
                            2.801095888571581e-07
train batch loss[ 16880 ]:
                            1.2275245353521314e-07
train batch loss[ 16890 ]:
                            1.2363302914764063e-07
train_batch_loss[ 16900 ]:
                            8.934853212849703e-08
train batch loss[ 16910 ]:
                            7.916241884231567e-08
train_batch_loss[ 16920 ]:
                            7.05440470483154e-08
                            8.987236554958145e-08
train batch loss[ 16930 ]:
train batch loss[ 16940 ]:
                            2.601882265196309e-08
train batch loss[ 16950 ]:
                            7.741243734926684e-08
train batch loss[ 16960 ]:
                            1.0398741778772091e-07
train loss: 8.848284212239812e-08
epoch: 169
train_batch_loss[ 16970 ]:
                            6.877235136926174e-08
train batch loss[ 16980 ]:
                            5.110629786031495e-08
train batch loss[ 16990 ]:
                            2.444721758365631e-08
train batch loss[ 17000 ]: 1.2175416941317962e-07
Evaluate: 100% | 12/12 [00:00<00:00, 23.73it/s]
valid evaluation: loss=0.8854518726648448, acc=0.9436619718309859
save model at
./torch checkpoints/22 3 24-14/crnn1 017000 loss0.8854518726648448.pt
train_batch_loss[ 17010 ]: 5.6461374242644524e-08
train batch loss[ 17020 ]: 3.445802576607093e-08
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train batch loss[ 17030 ]:
                            1.7695128917694092e-08
train batch loss[ 17040 ]:
                            4.316098056733608e-08
train batch loss[ 17050 ]:
                            5.77274477109313e-08
train batch loss[ 17060 ]:
                            5.21540641784668e-08
train loss: 6.064630293720562e-08
epoch: 170
train batch loss[ 17070 ]:
                            6.565824151039124e-08
train batch loss[ 17080 ]:
                            2.4905602913349867e-08
train batch loss[ 17090 ]:
                            8.087954483926296e-08
train batch loss[ 17100 ]:
                            4.6332615966093726e-08
train_batch_loss[ 17110 ]:
                            5.588661622368818e-08
train batch loss[ 17120 ]:
                            2.5596818886697292e-08
train_batch_loss[ 17130 ]:
                            1.0244548320770264e-08
train batch loss[ 17140 ]:
                            3.5388268315728055e-08
train batch loss[ 17150 ]:
                            6.120535545051098e-08
train batch loss[ 17160 ]:
                            1.1201336747035384e-08
train batch loss[ 17170 ]:
                            0.0
train loss: 4.166147839270611e-08
epoch: 171
train batch loss[ 17180 ]:
                            1.7113052308559418e-08
train batch loss[ 17190 ]:
                            1.4904799172654748e-08
train batch loss[ 17200 ]:
                            7.508731414418435e-09
train batch loss[ 17210 ]:
                            6.51925802230835e-09
train batch loss[ 17220 ]:
                            1.7636921256780624e-08
train batch loss[ 17230 ]:
                            1.9528556549630594e-08
train batch loss[ 17240 ]:
                            1.0652001947164536e-08
train_batch_loss[ 17250 ]:
                            7.392372936010361e-09
                            3.664172254502773e-08
train batch loss[ 17260 ]:
train batch loss[ 17270 ]:
                            4.831235145275059e-08
train_loss: 2.2475675306942464e-08
epoch: 172
train_batch_loss[ 17280 ]:
                            1.1175870895385742e-08
train batch loss[ 17290 ]:
                            0.0
train batch loss[ 17300 ]:
                            7.450580596923828e-09
train batch loss[ 17310 ]:
                            7.450580596923828e-09
train batch loss[ 17320 ]:
                            7.450580596923828e-09
train batch loss[ 17330 ]:
                            -3.259629011154175e-09
train batch loss[ 17340 ]:
                            7.887138053774834e-09
train_batch_loss[ 17350 ]:
                            0.0
train batch loss[ 17360 ]:
                            2.1420419216156006e-08
train_batch_loss[ 17370 ]:
                            -9.313225746154785e-10
train loss: 1.0360466209441375e-08
epoch: 173
train batch loss[ 17380 ]:
                            3.6961864680051804e-09
train batch loss[ 17390 ]:
                            1.4900926714744855e-08
train_batch_loss[ 17400 ]:
                            -9.349037100037094e-10
train batch loss[ 17410 ]:
                            1.862645149230957e-09
train batch loss[ 17420 ]:
                            7.436028681695461e-09
train batch loss[ 17430 ]:
                            3.725290298461914e-09
```

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train batch loss[ 17440 ]: 4.190923164060223e-09
train batch loss[ 17450 ]: 3.4924594327634395e-09
train batch loss[ 17460 ]: 3.7180143408477306e-09
train_batch_loss[ 17470 ]: 1.2318082553974818e-08
train loss: 1.0874516466411057e-08
epoch: 174
train batch loss[ 17480 ]: 3.725290298461914e-09
train batch loss[ 17490 ]: -9.313225746154785e-10
train batch loss[ 17500 ]: 4.097817196679898e-08
Evaluate: 100% | 12/12 [00:00<00:00, 29.39it/s]
valid evaluation: loss=0.8938975241651732, acc=0.9408450704225352
save model at
./torch checkpoints/22 3 24-14/crnn1 017500 loss0.8938975241651732.pt
train batch loss[ 17510 ]: -3.7216523196548223e-09
train batch loss[ 17520 ]:
                            0.0
train_batch_loss[ 17530 ]:
                           7.392372936010361e-09
train batch loss[ 17540 ]:
                           2.3283064365386963e-10
train_batch_loss[ 17550 ]:
                            1.4639226719737053e-08
train batch loss[ 17560 ]:
                            7.450580596923828e-09
train batch loss[ 17570 ]:
                            0.0
train loss: 3.4470590353385107e-09
epoch: 175
train_batch_loss[ 17580 ]:
                            -2.7939677238464355e-09
train batch loss[ 17590 ]: 7.450580596923828e-09
train batch loss[ 17600 ]:
                            0.0
train batch loss[ 17610 ]:
                            9.313225746154785e-09
train batch loss[ 17620 ]:
                            4.6566128730773926e-09
train batch loss[ 17630 ]:
                            0.0
                            4.6566128730773926e-09
train batch loss[ 17640 ]:
train_batch_loss[ 17650 ]:
                            4.656612873077393e-10
                           -3.6088749766349792e-09
train batch loss[ 17660 ]:
                            2.3283064365386963e-10
train_batch_loss[ 17670 ]:
train loss: 2.9552206659518066e-09
epoch: 176
train_batch_loss[ 17680 ]:
                            3.725290298461914e-09
                            -9.313223525708736e-10
train batch loss[ 17690 ]:
train_batch_loss[ 17700 ]:
                            2.7939675018018306e-09
train batch loss[ 17710 ]:
                            -7.105427357601002e-15
train batch loss[ 17720 ]:
                            -8.381903171539307e-09
train batch loss[ 17730 ]:
                            0.0
train batch loss[ 17740 ]:
                            -3.725290298461914e-09
train batch loss[ 17750 ]:
                            3.259629011154175e-09
train batch loss[ 17760 ]:
                            1.5532129964412889e-06
train_batch_loss[ 17770 ]:
                            0.11103792488574982
train loss: 0.016888276647886936
epoch: 177
train batch loss[ 17780 ]:
                            0.00017281710461247712
train batch loss[ 17790 ]: 0.01854357123374939
```

```
train batch loss[ 17800 ]:
                            6.601055065402761e-05
train batch loss[ 17810 ]:
                            0.01194697991013527
train batch loss[ 17820 ]:
                            1.7577207245267346e-06
train batch loss[ 17830 ]:
                            0.05464202165603638
train batch loss[ 17840 ]:
                            0.0665765255689621
train_batch_loss[ 17850 ]:
                            0.0106043154373765
train batch loss[ 17860 ]:
                            0.0018645953387022018
train batch loss[ 17870 ]:
                            0.0024535278789699078
train loss: 0.018485701377350672
epoch: 178
train batch loss[ 17880 ]:
                            2.1660589482053183e-06
train batch loss[ 17890 ]:
                            0.0005294470465742052
train_batch_loss[ 17900 ]:
                            3.9206966903293505e-05
train batch loss[ 17910 ]:
                            2.575601456555887e-06
train batch loss[ 17920 ]:
                            1.1890470887010451e-05
train batch loss[ 17930 ]:
                            1.8420715832689893e-06
train batch loss[ 17940 ]:
                            9.116316732615815e-07
train batch loss[ 17950 ]:
                            1.8777351442622603e-06
train batch loss[ 17960 ]:
                            4.2744351958390325e-05
train_batch_loss[ 17970 ]:
                            0.10765081644058228
train loss: 0.006756477644488038
epoch: 179
train batch loss[ 17980 ]:
                            3.41398526870762e-06
train batch loss[ 17990 ]:
                            5.61485649086535e-07
train batch loss[ 18000 ]: 1.372603128402261e-05
Evaluate: 100%
                 | 12/12 [00:00<00:00, 27.37it/s]
valid evaluation: loss=1.0402359507033523, acc=0.923943661971831
save model at
./torch checkpoints/22 3 24-14/crnn1 018000 loss1.0402359507033523.pt
train batch loss[ 18010 ]:
                            4.2670080802054144e-06
train batch loss[ 18020 ]:
                            1.990685996133834e-05
train batch loss[ 18030 ]:
                            4.493849701248109e-06
train batch loss[ 18040 ]:
                            1.723848981782794e-06
train batch loss[ 18050 ]:
                            7.774891855660826e-06
train_batch_loss[ 18060 ]:
                            6.512225922961079e-07
train batch loss[ 18070 ]:
                            0.0032516932114958763
train_loss: 0.004885577283369602
epoch: 180
train batch loss[ 18080 ]:
                            1.0387739166617393e-06
train batch loss[ 18090 ]:
                            2.8604890758288093e-05
train batch loss[ 18100 ]:
                            1.5371394965768559e-06
train batch loss[ 18110 ]:
                            3.970228135585785e-06
train batch loss[ 18120 ]:
                            1.042084363689355e-06
train_batch_loss[ 18130 ]:
                            7.560388439742383e-06
train batch loss[ 18140 ]:
                            4.579574579111068e-06
train batch loss[ 18150 ]:
                            1.774908469087677e-06
train_batch_loss[ 18160 ]:
                            9.917202987708151e-07
train batch loss[ 18170 ]:
                            5.887121915293392e-06
```

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train_batch_loss[ 18180 ]:
train loss: 1.206868472172559e-05
epoch: 181
train batch loss[ 18190 ]:
                            2.898155798902735e-06
train batch loss[ 18200 ]:
                            2.093111106660217e-07
train_batch_loss[ 18210 ]:
                            6.714834626109223e-07
train batch loss[ 18220 ]:
                            1.5940750017762184e-06
train batch loss[ 18230 ]:
                            9.945933925337158e-07
                            2.740171112236567e-06
train batch loss[ 18240 ]:
                            2.1127850686752936e-06
train batch loss[ 18250 ]:
train_batch_loss[ 18260 ]:
                            2.988756932609249e-06
train batch loss[ 18270 ]:
                            1.1664232033581357e-06
train_batch_loss[ 18280 ]:
                            1.4262980130297365e-06
train loss: 1.5607149113128867e-06
epoch: 182
train batch loss[ 18290 ]:
                            3.5131233744323254e-07
train batch loss[ 18300 ]:
                            1.1175814051966881e-06
train batch loss[ 18310 ]:
                            5.721219622500939e-07
train batch loss[ 18320 ]:
                            2.8147042030468583e-06
train batch loss[ 18330 ]:
                            1.545540726510808e-07
train batch loss[ 18340 ]:
                            9.679206414148211e-08
train batch loss[ 18350 ]:
                            6.310722824309778e-07
train batch loss[ 18360 ]:
                            3.683335307869129e-07
train batch loss[ 18370 ]:
                            1.5561204236291815e-06
train_batch_loss[ 18380 ]:
                            6.39589416095987e-07
train loss: 9.615340921003785e-07
epoch: 183
train batch loss[ 18390 ]:
                            5.015170927435975e-07
train batch loss[ 18400 ]:
                            6.705137138851569e-07
train_batch_loss[ 18410 ]:
                            4.14718670072034e-07
train batch loss[ 18420 ]:
                            7.176997769420268e-07
train_batch_loss[ 18430 ]:
                            2.0977311976366764e-07
                            4.565627023112029e-07
train batch loss[ 18440 ]:
train batch loss[ 18450 ]:
                            1.380685716867447e-07
train batch loss[ 18460 ]:
                            1.1098775303253205e-06
train batch loss[ 18470 ]:
                            8.082712952273141e-07
train batch loss[ 18480 ]:
                            2.7654243694996694e-07
train loss: 6.407686929291085e-07
epoch: 184
train batch loss[ 18490 ]:
                            3.7788183249176654e-07
train batch loss[ 18500 ]: 2.667288754309993e-07
Evaluate: 100% | 12/12 [00:00<00:00, 24.41it/s]
valid evaluation: loss=1.0222434142381478, acc=0.923943661971831
save model at
./torch_checkpoints/22 3 24-14/crnn1 018500 loss1.0222434142381478.pt
train batch loss[ 18510 ]: 2.7471105568110943e-07
train_batch_loss[ 18520 ]: 1.9068829715251923e-07
train batch loss[ 18530 ]: 1.0521398507989943e-06
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```
train batch loss[ 18540 ]:
                            3.420282155275345e-07
train batch loss[ 18550 ]:
                            1.2267264537513256e-07
train batch loss[ 18560 ]:
                            1.3655517250299454e-07
train batch loss[ 18570 ]:
                            2.7425994630903006e-07
train batch loss[ 18580 ]:
                            3.909206043317681e-07
train loss: 4.6146532807054907e-07
epoch: 185
train batch loss[ 18590 ]:
                            1.490041796614605e-07
train batch loss[ 18600 ]:
                            2.2075619199313223e-07
train batch loss[ 18610 ]:
                            3.1804614764041617e-07
train_batch_loss[ 18620 ]:
                            3.8616866504526115e-07
train batch loss[ 18630 ]:
                            3.142630475849728e-07
train_batch_loss[ 18640 ]:
                            3.961604306823574e-07
train batch loss[ 18650 ]:
                            4.5308792095966055e-07
train batch loss[ 18660 ]:
                            1.5832480926292192e-07
train batch loss[ 18670 ]:
                            2.3395111270474445e-07
train batch loss[ 18680 ]:
                            2.8148997444077395e-07
train loss: 3.4435059246608715e-07
epoch: 186
train_batch_loss[ 18690 ]:
                            8.207007340388373e-08
train batch loss[ 18700 ]:
                            1.6350520581909223e-07
train batch loss[ 18710 ]:
                            4.1896572611221927e-07
train batch loss[ 18720 ]:
                            3.7928106166873476e-07
train batch loss[ 18730 ]:
                            3.158493200317025e-07
train batch loss[ 18740 ]:
                            4.5122558844923333e-07
train batch loss[ 18750 ]:
                            3.685705962652719e-07
train_batch_loss[ 18760 ]:
                            3.785707463066501e-07
                            2.60770320892334e-08
train batch loss[ 18770 ]:
train batch loss[ 18780 ]:
                            2.009328454732895e-07
train_loss: 2.7771228590365185e-07
epoch: 187
train_batch_loss[ 18790 ]:
                            2.743254299275577e-07
train batch loss[ 18800 ]:
                            2.1692176233045757e-07
train batch loss[ 18810 ]:
                            7.802657364663901e-08
train batch loss[ 18820 ]:
                            5.587935447692871e-08
train batch loss[ 18830 ]:
                            2.1603945299375482e-07
train batch loss[ 18840 ]:
                            1.7512863337287854e-07
train batch loss[ 18850 ]:
                            1.420157786924392e-07
train_batch_loss[ 18860 ]:
                            6.565801413671579e-08
                            3.361928975209594e-07
train batch loss[ 18870 ]:
train_batch_loss[ 18880 ]:
                            2.8812792152166367e-08
train loss: 1.8521552742977262e-07
epoch: 188
train batch loss[ 18890 ]:
                            2.1327286958694458e-07
                            1.4473289411398582e-07
train batch loss[ 18900 ]:
train_batch_loss[ 18910 ]:
                            1.284934114664793e-07
train batch loss[ 18920 ]:
                            7.613562047481537e-08
train batch loss[ 18930 ]:
                            5.7159923017024994e-08
train batch loss[ 18940 ]:
                            3.958120942115784e-08
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train batch loss[ 18950 ]:
                            5.725269147660583e-08
train batch loss[ 18960 ]: 1.0523943672069436e-07
train batch loss[ 18970 ]:
                           1.33176754957276e-07
train batch loss[ 18980 ]: 1.5832483768463135e-07
train loss: 1.4207434981049232e-07
epoch: 189
train batch loss[ 18990 ]: 2.840351953636855e-08
train batch loss[ 19000 ]: 5.952892223604067e-08
Evaluate: 100% | 12/12 [00:00<00:00, 29.49it/s]
valid evaluation: loss=1.0294830283701, acc=0.9295774647887324
save model at
./torch checkpoints/22 3 24-14/crnn1 019000 loss1.0294830283701.pt
train batch loss[ 19010 ]: 9.53982635110151e-08
train batch loss[ 19020 ]:
                           8.148344221581283e-08
                           3.5841367207467556e-08
train batch loss[ 19030 ]:
train_batch_loss[ 19040 ]: 4.5605702325701714e-08
train batch loss[ 19050 ]:
                            5.497712862734261e-08
train batch loss[ 19060 ]:
                            6.43777653408506e-08
train batch loss[ 19070 ]:
                            2.8882556080134236e-07
train batch loss[ 19080 ]:
                            8.486671276841662e-08
train loss: 8.392465385091485e-08
epoch: 190
train_batch_loss[ 19090 ]:
                            6.740447133779526e-08
train batch loss[ 19100 ]:
                            3.4226104617118835e-08
train batch loss[ 19110 ]:
                            4.831235855817795e-08
train batch loss[ 19120 ]:
                           4.4235999752118005e-08
train batch loss[ 19130 ]:
                            8.032269960267513e-08
train batch loss[ 19140 ]:
                            1.452881406294182e-07
                           7.497146015111866e-08
train batch loss[ 19150 ]:
train_batch_loss[ 19160 ]:
                            2.0489096641540527e-08
train_batch loss[ 19170 ]:
                           7.869675044958058e-08
train batch loss[ 19180 ]:
                            5.2619725465774536e-08
train batch loss[ 19190 ]:
                            0.0
train loss: 5.996845284283799e-08
epoch: 191
train batch loss[ 19200 ]:
                            2.514570951461792e-08
train_batch_loss[ 19210 ]:
                            2.421438694000244e-08
train batch loss[ 19220 ]:
                            4.3568430641016676e-08
train batch loss[ 19230 ]:
                            3.14321368932724e-08
train batch loss[ 19240 ]:
                            4.423782229423523e-08
train batch loss[ 19250 ]:
                            3.350396582391113e-08
train batch loss[ 19260 ]:
                            3.535751602612436e-08
train batch loss[ 19270 ]:
                            3.314869445603108e-08
train_batch_loss[ 19280 ]:
                           3.0731825972907245e-08
train batch loss[ 19290 ]: 1.257285475730896e-08
train loss: 3.723922988852292e-08
epoch: 192
train batch loss[ 19300 ]: 2.130400389432907e-08
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train batch loss[ 19310 ]:
                            4.307366907596588e-08
train batch loss[ 19320 ]:
                            3.096647560596466e-08
train batch loss[ 19330 ]:
                            2.059823600575328e-08
train batch loss[ 19340 ]:
                            1.4901161193847656e-08
train batch loss[ 19350 ]:
                            9.255018085241318e-09
train_batch_loss[ 19360 ]:
                            1.0942585504380986e-08
train batch loss[ 19370 ]:
                            1.488660927861929e-08
train batch loss[ 19380 ]:
                            8.19563723553074e-08
train batch loss[ 19390 ]:
                            9.778887033462524e-09
train loss: 2.4834458507549834e-08
epoch: 193
train batch loss[ 19400 ]:
                            1.1176098269061185e-08
train_batch_loss[ 19410 ]:
                            1.862645149230957e-08
train batch loss[ 19420 ]:
                            5.587935447692871e-09
train batch loss[ 19430 ]:
                            2.0489096641540527e-08
train batch loss[ 19440 ]:
                            2.8867361834272742e-08
train batch loss[ 19450 ]:
                            1.4901161193847656e-08
train batch loss[ 19460 ]:
                            1.1161318980157375e-08
train batch loss[ 19470 ]:
                            2.1420419216156006e-08
train batch loss[ 19480 ]:
                            1.4901160305669237e-08
train batch loss[ 19490 ]: 7.82310962677002e-08
train loss: 1.5716967182261268e-08
epoch: 194
train_batch_loss[ 19500 ]: 2.514570951461792e-08
Evaluate: 100% | 12/12 [00:00<00:00, 29.63it/s]
valid evaluation: loss=1.0585174336839258, acc=0.9295774647887324
save model at
./torch checkpoints/22 3 24-14/crnn1 019500 loss1.0585174336839258.pt
train batch loss[ 19510 ]: 1.8626449271863521e-09
train_batch_loss[ 19520 ]:
                            0.0
train batch loss[ 19530 ]:
                            7.4505797087454084e-09
train batch loss[ 19540 ]:
                            5.587935447692871e-09
train batch loss[ 19550 ]:
                            5.587935447692871e-09
train batch loss[ 19560 ]:
                            1.862645149230957e-09
train_batch_loss[ 19570 ]:
                            -1.862645149230957e-09
                            7.916241884231567e-09
train batch loss[ 19580 ]:
train_batch_loss[ 19590 ]:
                            3.4924596548080444e-09
train loss: 1.2238056623526646e-08
epoch: 195
train batch loss[ 19600 ]:
                            3.725290298461914e-09
train batch loss[ 19610 ]:
                            3.941750037483871e-09
train batch loss[ 19620 ]:
                            -1.3445969671010971e-08
train batch loss[ 19630 ]:
                            -1.862645149230957e-09
train_batch_loss[ 19640 ]:
                            3.725290298461914e-09
train batch loss[ 19650 ]:
                            7.450580596923828e-09
train batch loss[ 19660 ]:
                            5.580659490078688e-09
train_batch_loss[ 19670 ]:
                            4.540197551250458e-09
train batch loss[ 19680 ]:
                            0.0
```

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train_batch_loss[ 19690 ]: 3.725290298461914e-09
train loss: 3.859880473800585e-09
epoch: 196
train batch loss[ 19700 ]:
                            -7.105427357601002e-15
train batch loss[ 19710 ]:
                            0.0
train_batch_loss[ 19720 ]:
                            0.0
train batch loss[ 19730 ]:
                            6.526533979922533e-09
train batch loss[ 19740 ]:
                            6.984919309616089e-09
train batch loss[ 19750 ]:
                            0.0
train batch loss[ 19760 ]:
                            9.313225746154785e-10
train_batch_loss[ 19770 ]:
                            3.725290298461914e-09
train batch loss[ 19780 ]:
                            3.725290298461914e-09
train_batch_loss[ 19790 ]:
                            3.725290076417309e-09
train loss: 2.2736341771731836e-09
epoch: 197
train batch loss[ 19800 ]:
                            0.0
train batch loss[ 19810 ]:
                            -7.450580596923828e-09
train batch loss[ 19820 ]:
                            -5.587907025983441e-09
train batch loss[ 19830 ]:
                            3.725290076417309e-09
train batch loss[ 19840 ]:
                            2.7939677238464355e-09
train batch loss[ 19850 ]:
                           -3.7252618767524837e-09
train batch loss[ 19860 ]:
                            7.449671102222055e-09
train batch loss[ 19870 ]:
                            2.7939677238464355e-09
train batch loss[ 19880 ]: 7.334165275096893e-09
train_batch_loss[ 19890 ]: 7.448761607520282e-09
train loss: 3.0303932190475596e-09
epoch: 198
train batch loss[ 19900 ]:
                            0.0
train batch loss[ 19910 ]:
                            0.6556535363197327
train_batch_loss[ 19920 ]:
                            0.064222551882267
train batch loss[ 19930 ]:
                            0.00019918008183594793
train_batch_loss[ 19940 ]:
                           7.878074370637478e-07
train batch loss[ 19950 ]:
                            5.0201371777802706e-05
train batch loss[ 19960 ]:
                            2.630028120620409e-06
train batch loss[ 19970 ]:
                           0.11489763855934143
train batch loss[ 19980 ]:
                            1.0894391380134039e-05
train batch loss[ 19990 ]:
                            3.2280866435030475e-05
train loss: 0.031189153823747272
epoch: 199
train batch loss[ 20000 ]: 9.187788236886263e-06
Evaluate: 100% | 12/12 [00:00<00:00, 29.13it/s]
valid evaluation: loss=0.8126347316271613, acc=0.9267605633802817
save model at
./torch checkpoints/22 3 24-14/crnn1 020000 loss0.8126347316271613.pt
train batch loss[ 20010 ]: 3.5929806472267956e-05
train batch loss[ 20020 ]: 3.14805620291736e-05
train_batch_loss[ 20030 ]:
                           6.970235517655965e-06
train batch loss[ 20040 ]: 1.526988489786163e-05
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train batch loss[ 20050 ]:
                            0.0007948977872729301
train batch loss[ 20060 ]:
                           8.602276466262992e-06
train batch loss[ 20070 ]:
                            1.2916279956698418e-06
train batch loss[ 20080 ]:
                            3.175800884491764e-07
train batch loss[ 20090 ]:
                            6.372115421982016e-07
train loss: 0.0005404033536069789
epoch: 200
train batch loss[ 20100 ]:
                            6.920588475622935e-07
train batch loss[ 20110 ]:
                            2.4302935344167054e-06
train batch loss[ 20120 ]:
                           9.352204415336018e-07
train_batch_loss[ 20130 ]:
                           6.4428531914018095e-06
train batch loss[ 20140 ]:
                           8.885342595021939e-07
train_batch_loss[ 20150 ]:
                           1.8404535921945353e-06
train_batch loss[ 20160 ]:
                            0.0006335830548778176
train_batch_loss[ 20170 ]:
                           7.037150498945266e-05
train_batch_loss[ 20180 ]: 7.73041756474413e-05
train batch loss[ 20190 ]:
                            3.9301428955695883e-07
train_batch_loss[ 20200 ]:
                            2.0464261372884116e-06
train loss: 0.000979545088030889
evaluation = evaluate(crnn, val loader, criterion,
decode method=train config['decode method'],
beam size=train config['beam size'])
loss = evaluation['loss']
acc = evaluation['acc']
print(f'valid evaluation: loss={loss}, acc={acc*100} %')
Evaluate: 100% | 12/12 [00:00<00:00, 19.46it/s]
valid_evaluation: loss=0.7536714319507001, acc=94.64788732394366 %
# torch.save(crnn.state dict(), 'torchmodel_weights_1.pt')
num class = len(LABEL2CHAR) + 1
crnn1 = CRNN(3, img height, img width, num class,
            map to seg hidden=common config['map to seg hidden'],
            rnn hidden=common config['rnn hidden'],
            leaky relu=common config['leaky relu'])
crnn1.load_state_dict(torch.load("./torch_checkpoints/22_3_24-14/crnn1
020000 loss1.125697967997739.pt"))
crnn1.to(device)
def decode(labels):
    chars=""
    for i in labels:
        chars=chars+LABEL2CHAR[i]
    return chars
```

```
with torch.no grad():
       for i, data in enumerate(val loader):
           if i == 5:
                break
           device = 'cuda' if next(crnn.parameters()).is cuda else
'cpu'
           images, targets, target lengths = [d.to(device) for d in
data1
           logits = crnn(images)
           log probs = torch.nn.functional.log softmax(logits, dim=2)
           batch size = images.size(⊙)
           preds = ctc decode(log probs, method="beam search",
beam size=10)
           reals = targets.cpu().numpy().tolist()
           target lengths = target lengths.cpu().numpy().tolist()
           print(f"-----
           _, ax = plt.subplots(8, 4, figsize=(25, 10))
           for k, (image, pred, real, target length) in
enumerate(zip(images, preds, reals, target lengths)):
               img = (image*255).cpu().numpy().astype(np.uint8)
               real = real[0:target length[0]]
               real=decode(real)
               pred=decode(pred)
               # print(f"prediction:{pred} , real:{real}")
               title = f"Prediction: {pred} , Real: {real}"
               img tr = np.transpose(img, (1,2,0))
               ax[k // 4, k % 4].imshow(img tr)
               ax[k // 4, k % 4].set_title(title)
               ax[k // 4, k % 4].axis("off")
           plt.show()
```

































Prediction: gue . Real: gue









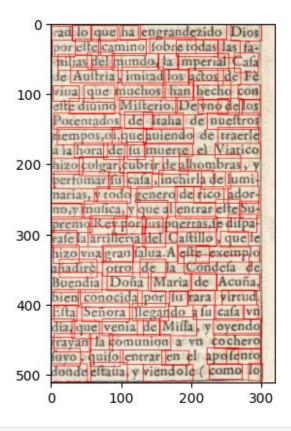


Text Detection

```
import torch.nn.init as init
from collections import namedtuple
from torchvision import models
import time
from torch.autograd import Variable
# from torchvision.models.vgg import model urls
import cv2
import numpy
import pytesseract
from pytesseract import image to string
def predict boxes(img path):
    img = cv2.imread(img path)
    H, W=img.shape[0], img.shape[1]
    img = cv2.resize(img,(320, 512))
    rW=W/256
    rH=H/512
    b,g,r = cv2.split(img)
    # text detection network
    net = cv2.dnn.readNet('./frozen_east_text_detection.pb')
    blob = cv2.dnn.blobFromImage(img, 1.0,
(img.shape[1],img.shape[0]), (b.mean(), g.mean(), r.mean()),
swapRB=False, crop=False)
    outputLayers = []
    outputLayers.append("feature_fusion/Conv_7/Sigmoid")
    outputLayers.append("feature_fusion/concat_3")
    net.setInput(blob)
    output = net.forward(outputLayers)
```

```
scores = output[0]
    geometry = output[1]
    (numRows, numCols) = scores.shape[2:4]
    rects = []
    confidences = []
    for y in range(0, numRows):
        scoresData = scores[0, 0, y]
        xData0 = geometry[0, 0, y]
        xData1 = geometry[0, 1, y]
        xData2 = geometry[0, 2, y]
        xData3 = geometry[0, 3, y]
        anglesData = geometry[0, 4, y]
        for x in range(0, numCols):
            # if our score does not have sufficient probability,
ignore it
            if scoresData[x] < 0.1:
                continue
            # compute the offset factor as our resulting feature maps
will
            # be 4x smaller than the input image
            (offsetX, offsetY) = (x * 4.0, y * 4.0)
            # extract the rotation angle for the prediction and then
            # compute the sin and cosine
            angle = anglesData[x]
            cos = np.cos(angle)
            sin = np.sin(angle)
            # use the geometry volume to derive the width and height
of
            # the bounding box
            h = xData0[x] + xData2[x]
            w = xData1[x] + xData3[x]
            \# compute both the starting and ending (x, y)-coordinates
for
            # the text prediction bounding box
            endX = int(offsetX + (cos * xData1[x]) + (sin *
xData2[x])
            endY = int(offsetY - (sin * xData1[x]) + (cos *
xData2[x])
            startX = int(endX - w)
            startY = int(endY - h)
            # add the bounding box coordinates and probability score
to
```

```
# our respective lists
            rects.append((startX, startY, endX, endY))
            confidences.append(scoresData[x])
    boxes = non max suppression(np.array(rects), probs=confidences,
overlapThresh=0.4)
    # print(len(boxes))
    # print(img.shape)
    orig = img.copy()
    \# orig = cv2.resize(orig, (320, 512))
    for i, (startX, startY, endX, endY) in enumerate(boxes):
        # scale the bounding box coordinates based on the respective
        # ratios
        startX = int(startX )
        startY = int(startY )
        endX = int(endX)
        endY = int(endY) + 5
        # draw the bounding box on the image
        cv2.rectangle(orig, (startX, startY), (endX, endY), (0, 0,
255), 1)
    # show the output image
    image = cv2.cvtColor(orig, cv2.COLOR BGR2RGB)
    plt.imshow(image)
    plt.show()
    return boxes
boxes = predict_boxes("./Data/p12_1.png")
print(len(boxes))
```



```
130
# sorting the boxes detected as we read the text from left to right
min height=100
for box in boxes:
    height=box[3]-box[1]
    if height<min height:</pre>
        min_height=height
# sort the text bixes based on the height
height sort = sorted(boxes, key = lambda x: x[1])
rows=[]
check=0
row no=0
for i, box in enumerate(height sort):
    if i==0:
        check = box[1]
        row no+=1
        rows.append([row no,box])
        continue
    if box[1]>=check+min_height:
        row no+=1
        check=box[1]
        rows.append([row_no, box])
        continue
    rows.append([row_no, box])
```

```
# cluster the text boxes belonging to a row
final sort={}
idx=0
for i in rows:
    if i[0]>idx:
        idx=i[0]
        final sort[idx]=[]
    final sort[idx].append(i[1])
# keeping the text bixes detected as we read from left to right and
top to bottom
final=[]
for index in final sort.keys():
    l=final sort[index]
    l=sorted(l, key = lambda x: x[0])
    for box in 1:
        final.append(box)
def recognize text(img path, boxes, file name: None):
    img = cv2.imread(img path)
    img = cv2.resize(img, (320,512))
    for i, (startX, startY, endX, endY) in enumerate(boxes):
        # print(startX, startY, endX, endY)
        if startX<0:</pre>
            startX=0
        if startY<0:
            startY=0
        cropped img = img[startY:endY+5, startX:endX]
        cropped img = cv2.cvtColor(cropped img, cv2.COLOR BGR2RGB)
        img\ height = 64
        img\ width = 160
        transform = transforms.Compose([
            transforms.ToPILImage(),
            transforms.Resize((img height, img width)), # Resize
image to a fixed size
            transforms.ToTensor(),
                                           # Convert image to tensor
        1)
        image = transform(cropped img)
        image = image.to(device)
        image = image.unsqueeze(0)
        logits = crnn(image)
        log probs = torch.nn.functional.log softmax(logits, dim=2)
        pred = ctc decode(log probs, method='beam search',
beam size=10)
        # pred = pred.squeeze(0)
        # print(pred)
        pred = decode(pred[0])
        print(pred)
        # plt.imshow(cropped img)
        # plt.show()
```

```
# if i==10:
          break
recognize_text("./Data/p12_1.png", boxes=final, file_name=None)
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