detekcija_tock

June 2, 2025

```
[1]: import cv2
     import random
     import math
     import matplotlib.pyplot as plt
     import numpy as np
     import torch
     import torch.nn as nn
     import torch.optim as optim
     import torchinfo
     from torch.utils.tensorboard import SummaryWriter
     from IPython.display import Image
     import time
     from scipy import ndimage
     from skimage import transform
     from os import listdir
     from os.path import isfile, join
     loss_diagram = SummaryWriter()
[2]: #generating samples
     def generate_points(center, radius, number):
```

```
def generate_points(center, radius, number):
    points = []
    for i in range(number):
        r = radius * math.sqrt(random.random())
        theta = random.uniform(0, 2 * math.pi)
        x = int(center[0] + r * math.cos(theta))
```

```
y = int(center[1] + r * math.sin(theta))
        points.append((x, y))
    return points
def points_far_enough(points, min_distance):
    for i in range(len(points) - 1):
        for j in range(i + 1, len(points)):
            distance = math.hypot(points[i][0] - points[j][0], points[i][1] -
 →points[j][1])
            if (distance < min_distance):</pre>
                return False
    return True
# https://docs.opencv.org/3.4/de/d25/imgproc_color_conversions.html
def lum(color):
    return (0.299 * color[0] + 0.587 * color[1] + 0.114 * color[2])
def generate_shape_color(bg_color, number, luminance_difference):
    # luminance_difference = 20 # 100
    checking_prev_colors = 4
    colors = []
    color_generated = True
    while True:
        new_color = tuple(random.randint(0, 255) for i in range(3))
        #check if bg_color and new_color have sufficiently different luminances
        if (abs(lum(bg_color) - lum(new_color)) >= luminance_difference):
            #check if new color and every color in colors[] have sufficiently_
 \hookrightarrow different luminances
            # this needs to be calculated based on neighboring colors,
 →otherwise it cant find a suitable color
            if (len(colors) >= checking_prev_colors):
```

```
if (abs(lum(colors[len(colors) - 1]) - lum(new_color)) <__
 →luminance difference
                   or abs(lum(colors[len(colors) - 3]) - lum(new_color)) <
 →luminance difference):
                    color_generated = False
            else:
                for color in colors:
                    if (abs(lum(color) - lum(new_color)) <__
 →luminance_difference):
                        color_generated = False
            if (color_generated == False):
                color_generated = True
                continue
            colors.append(new_color)
        if (len(colors) == number):
            return colors
def add_noise(img):
    noise = np.random.normal(0, 6, img.shape).astype(np.float32)
    noisy_image = img.astype(np.float32) + cv2.GaussianBlur(noise, (7, 7),__
 ⇒sigmaX=0)
    # Clip values to valid range [0, 255] and convert back to uint8
    noisy_image = np.clip(noisy_image, 0, 255).astype(np.uint8)
    return noisy_image
def apply_h(img, points):
    height_half = len(img) // 2
    width_half = len(img[0]) // 2
    point_distance = 10
    x = random.randint(point_distance, width_half - point_distance)
    y = random.randint(point_distance, height_half - point_distance)
    rect = np.array([[x, y], [x + width_half, y], [x + width_half, y +_u
 →height_half], [x, y + height_half]])
    #4 kotičke okna pomaknemo za naključne pomike v intervalu [-16, 16]
```

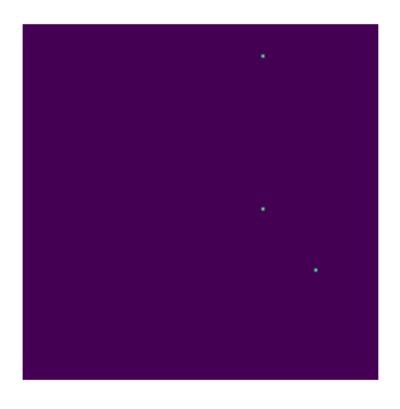
```
rect_prim = np.array([[rect[0][0] + random.randint(-16, 16), rect[0][1] +_L
⇔random.randint(-16, 16)],
                [rect[1][0] + random.randint(-16, 16), rect[1][1] + random.
\negrandint(-16, 16)],
                [rect[2][0] + random.randint(-16, 16), rect[2][1] + random.
\rightarrowrandint(-16, 16)],
                [rect[3][0] + random.randint(-16, 16), rect[3][1] + random.
→randint(-16, 16)]], np.int32)
  shift = random.randint(0, 3)
  rect_prim = np.roll(rect_prim, shift, axis=-1)
  #iz 4 kotičkov in njihovih pomikov izračunamo homografijo H
  H, _ = cv2.findHomography(rect, rect_prim)
  H = np.linalg.inv(H)
  #inverz ocenjene homografije H^-1 apliciramo na sliko, dobimou
⇔transformirano sliko
  warped_image = cv2.warpPerspective(img, H, (img.shape[1], img.shape[0]),__
⇒borderMode=cv2.BORDER_REPLICATE)
  #project points
  # Convert to numpy array in shape (H, W, 2)
  points = np.array(points)
  # Flatten to shape (H*W, 2)
  flat_points = points.reshape(-1, 2)
  # Add homogeneous coordinate (x, y) \rightarrow (x, y, 1)
  ones = np.ones((flat_points.shape[0], 1))
  points_homogeneous = np.hstack([flat_points, ones]) # shape (N, 3)
  # Apply homography
  projected = H @ points_homogeneous.T # shape (3, N)
  projected = projected.T
                                         # shape (N, 3)
  # Convert back to 2D
  transformed_points = projected[:, :2] / projected[:, 2:3]
  # Reshape to original shape (rows, cols, 2)
  transformed_array = transformed_points.reshape(points.shape)
  h_points_img = np.zeros(img.shape, dtype=np.uint8)
```

```
[3]: def generate_triangle(width, height):
         center = (width // 2, height // 2)
         radius = width // 2 - 5 #staying within bounds
         min_distance = 10
         while True:
             points = generate_points(center, radius, 3)
             if points_far_enough(points, min_distance):
                 break
         background_color = tuple(random.randint(0, 255) for i in range(3))
         img = np.full((height, width, 3), background_color, dtype=np.uint8)
         pts_array = np.array([points], dtype=np.int32)
         cv2.fillPoly(img, pts_array, color=generate_shape_color(background_color,_
      41, 100)[0]
         img_gray = cv2.cvtColor(img, cv2.COLOR_BGR2GRAY)
         final_img, points_img = apply_h(img_gray, points)
         final_img = add_noise(final_img)
         # #build the points image
         # points_img = np.zeros(img.shape)
         # for point in points:
               cv2.circle(points_img, point, 1, (0, 255, 0), -1)
         return final_img, points_img
     for i in range(1):
         image, points_image = generate_triangle(128, 128)
```

```
plt.imshow(image, cmap='gray')
plt.axis('off')
plt.show()

plt.imshow(points_image)
plt.axis('off')
plt.show()
```



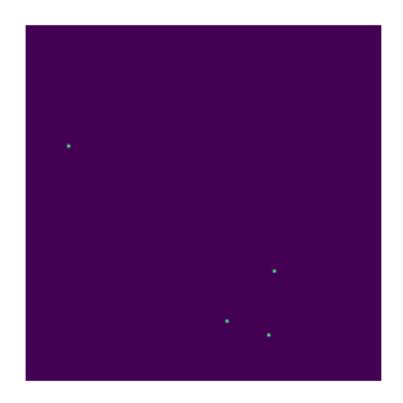


```
[4]: # https://stackoverflow.com/questions/9608148/
     \rightarrow python-script-to-determine-if-x-y-coordinates-are-colinear-getting-some-e
     def colinear_points(points):
         # check if any 3 of the generated points are colinear (prevents generating
      ⇔triangle)
         for i in range(4):
             x1, y1 = points[i % 4]
             x2, y2 = points[(i + 1) \% 4]
             x3, y3 = points[(i + 2) \% 4]
             if (abs(((x1 * (y2 - y3)) + (x2 * (y3 - y1) + (x3 * (y1 - y2)))) / 2.0)_{\bot})
      return True
         return False
     # https://stackoverflow.com/questions/18583214/
      \hookrightarrow calculate-angle-of-triangle-python
     def check_angles(points):
         # prevents square overlapping itself and colinearity
         angle_min = 10
```

```
for i in range(4):
        x1, y1 = points[i % 4]
        x2, y2 = points[(i + 1) \% 4]
        x3, y3 = points[(i + 2) \% 4]
        dx1 = x1 - x2
        dy1 = y1 - y2
        dx2 = x3 - x2
        dy2 = y3 - y2
        numerator = dx1 * dx2 + dy1 * dy2
        denominator = math.sqrt((math.pow(dx1, 2) + math.pow(dy1, 2)) * (math.
 \rightarrowpow(dx2, 2) + math.pow(dy2, 2)))
        angle = abs(180 - math.degrees(math.acos(numerator / denominator)))
        if (angle < angle_min):</pre>
            return False
    return True
#https://stackoverflow.com/questions/3838329/
 \hookrightarrow how-can-i-check-if-two-segments-intersect
def ccw(p1, p2, p3):
    return (p3[1] - p1[1]) * (p2[0] - p1[0]) > (p2[1] - p1[1]) * (p3[0] - p1[0])
def is_valid_square(points):
    return ((ccw(points[0], points[1], points[3]) != ccw(points[2], points[1],
 →points[3])
                 and ccw(points[0], points[2], points[1]) != ccw(points[0], ___
 ⇔points[2], points[3])))
def sort_by_angle(points, center):
    def angle(point):
        return math.atan2(point[1] - center[1], point[0] - center[0])
    return sorted(points, key=angle)
def generate_square(width, height):
    center = (width // 2, height // 2)
    radius = width // 2 - 5 #staying within bounds
    min_distance = 10
```

```
while True:
       points = generate_points(center, radius, 4)
       points = sort_by_angle(points, center)
       if points_far_enough(points, min_distance) and is_valid_square(points)_
 →and check_angles(points) and not colinear_points(points):
            break
   background_color = tuple(random.randint(0, 255) for i in range(3))
   img = np.full((height, width, 3), background_color, dtype=np.uint8)
   pts_array = np.array([points], dtype=np.int32)
   cv2.fillPoly(img, pts_array, color=generate_shape_color(background_color,_u
 →1, 100)[0])
   img_gray = cv2.cvtColor(img, cv2.COLOR_BGR2GRAY)
   final_img, points_img = apply_h(img_gray, points)
   final_img = add_noise(final_img)
   # points_img = np.zeros(img.shape)
   # for point in points:
    # cv2.circle(points_imq, point, 1, (0, 255, 0), -1)
   return final_img, points_img
for i in range(1):
   image, points_image = generate_square(128, 128)
   plt.imshow(image, cmap='gray')
   plt.axis('off')
   plt.show()
   plt.imshow(points_image)
   plt.axis('off')
   plt.show()
```

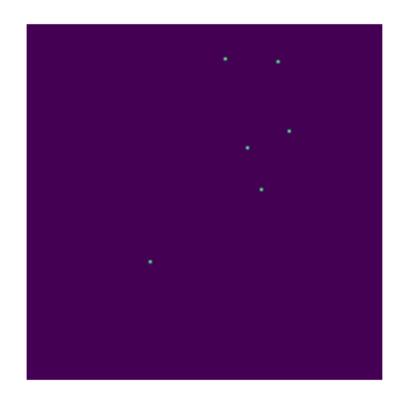




```
[6]: def check_angles_star(points, center_point):
         # prevents square overlapping itself and colinearity
         angle_min = 40
         for i in range(len(points) - 1):
             for j in range(i + 1, len(points)):
                 x1, y1 = points[i]
                 x2, y2 = points[j]
                 x3, y3 = center_point
                 dx1 = x1 - x2
                 dy1 = y1 - y2
                 dx2 = x3 - x2
                 dy2 = y3 - y2
                 numerator = dx1 * dx2 + dy1 * dy2
                 denominator = math.sqrt((math.pow(dx1, 2) + math.pow(dy1, 2)) *__
      \hookrightarrow (math.pow(dx2, 2) + math.pow(dy2, 2)))
                 if (denominator == 0):
                     return False
                 angle = abs(180 - math.degrees(math.acos(numerator / denominator)))
                 if (angle < angle_min):</pre>
                     return False
         return True
     def generate_star(width, height):
         center = (width // 2, height // 2)
         radius = width // 2 - 30
         min_distance = 15
         center_point = generate_points(center, radius, 1)
         while True:
             points = generate_points(center, radius, 5)
             if check_angles_star(points, center_point[0]):
                 points.append(center_point[0])
                 if points_far_enough(points, min_distance):
```

```
break
   background_color = tuple(random.randint(0, 255) for i in range(3))
   img = np.full((height, width, 3), background_color, dtype=np.uint8)
   pts_array = np.array(points, dtype=np.int32)
   color = generate_shape_color(background_color, 1, 100)[0]
   for i in range(len(pts_array) - 1):
       cv2.line(img, pts_array[i], pts_array[len(pts_array) - 1], color=color, __
 →thickness=2)
   img_gray = cv2.cvtColor(img, cv2.COLOR_BGR2GRAY)
   final_img, points_img = apply_h(img_gray, points)
   final_img = add_noise(final_img)
   # points_img = np.zeros(img.shape)
   # for point in points:
    # cv2.circle(points_img, point, 1, (0, 255, 0), -1)
   return final_img, points_img
for i in range(1):
   image, points_image = generate_star(128, 128)
   plt.imshow(image, cmap='gray')
   plt.axis('off')
   plt.show()
   plt.imshow(points_image)
   plt.axis('off')
   plt.show()
```





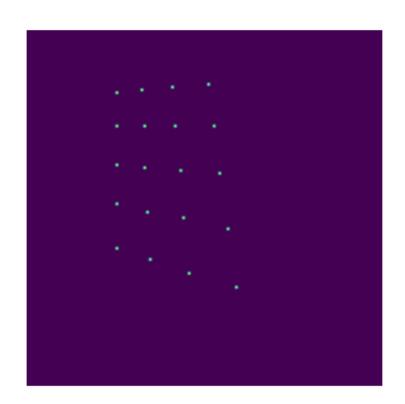
```
[7]: def generate_chessboard(width, height):
         rows = 3
         columns = 4
         square_dimension = width // 8
         center = (width // 2, height // 2)
         # radius = width // 2 - (square_dimension * rows // 2)
         radius = width // 2
         min_distance = 10
         while True:
             points = generate_points(center, radius, 1)
             if ((points[0][0] + (rows * square_dimension)) < width</pre>
                 and (points[0][1] + (columns * square_dimension)) < height):</pre>
                 break
         matrix = [[points[0]]]
         for i in range(rows + 1):
             if (i > 0):
                 matrix.append([(int(matrix[i - 1][0][0] + square_dimension),__
      →matrix[i - 1][0][1])])
             for j in range(1, columns + 1):
                 matrix[i].append((matrix[i][j-1][0], int(matrix[i][j-1][1] + [i]))

¬square_dimension)))
         background_color = tuple(random.randint(0, 255) for i in range(3))
         colors = generate_shape_color(background_color, rows * columns, 25)
         color_counter = 0
         img = np.full((height, width, 3), background_color, dtype=np.uint8)
         pts_array = []
         for i in range(len(matrix) - 1):
             for j in range(len(matrix[i]) - 1):
                 pts_array.append(matrix[i][j])
                 pts_array.append(matrix[i][j + 1])
                 pts_array.append(matrix[i + 1][j + 1])
```

```
pts_array.append(matrix[i + 1][j])
            cv2.fillPoly(img, np.array([pts_array]),__

¬color=colors[color_counter])
            color_counter += 1
            pts_array = []
    img_gray = cv2.cvtColor(img, cv2.COLOR_BGR2GRAY)
    final_img, points_img = apply_h(img_gray, matrix)
    final_img = add_noise(final_img)
    #build the points image
    # points_img = np.zeros(img.shape)
    # for line in matrix:
         for point in line:
              cv2.circle(points_img, point, 1, (0, 255, 0), -1)
    return final_img, points_img
for i in range(1):
    image, points_image = generate_chessboard(128, 128)
    plt.imshow(image, cmap='gray')
    plt.axis('off')
    plt.show()
    plt.imshow(points_image)
    plt.axis('off')
    plt.show()
```





```
[8]: class ResnetBlock(nn.Module):
         def __init__(self, in_channels, out_channels):
             super().__init__()
             self.in_channels = in_channels
             self.out_channels = out_channels
             self.conv1 = nn.Conv2d(in_channels, out_channels, 3, padding=1,__
      ⇔bias=False)
             self.conv2 = nn.Conv2d(out_channels, out_channels, 3, padding=1, __
      ⇔bias=False)
             self.conv3 = nn.Conv2d(in_channels, out_channels, 1, bias=False)
             self.bn1 = nn.BatchNorm2d(out_channels)
             self.bn2 = nn.BatchNorm2d(out_channels)
             self.relu1 = nn.ReLU()
             self.relu2 = nn.ReLU()
         def forward(self, x):
             output = self.conv1(x)
             output = self.bn1(output)
             output = self.relu1(output)
             output = self.conv2(output)
             output = self.bn2(output)
             if (self.in_channels != self.out_channels):
                 tmp = self.conv3(x)
                 output += tmp
             output = self.relu2(output)
             return output
     class Encoder(nn.Module):
         def __init__(self):
             super().__init__()
             self.resnet1 = ResnetBlock(1, 64)
             self.resnet2 = ResnetBlock(64, 64)
             self.resnet3 = ResnetBlock(64, 64)
             self.resnet4 = ResnetBlock(64, 64)
```

```
self.resnet5 = ResnetBlock(64, 128)
        self.resnet6 = ResnetBlock(128, 128)
        self.resnet7 = ResnetBlock(128, 128)
        self.resnet8 = ResnetBlock(128, 128)
        self.mp1 = nn.MaxPool2d(2, stride=2)
        self.mp2 = nn.MaxPool2d(2, stride=2)
        self.mp3 = nn.MaxPool2d(2, stride=2)
        self.mp4 = nn.MaxPool2d(2, stride=2)
    def forward(self, x):
        output = self.resnet1(x)
        output = self.resnet2(output)
        output = self.mp1(output)
        output = self.resnet3(output)
        output = self.resnet4(output)
        output = self.mp2(output)
        output = self.resnet5(output)
        output = self.resnet6(output)
        output = self.mp3(output)
        output = self.resnet7(output)
        output = self.resnet8(output)
        return output
class Decoder(nn.Module):
    def __init__(self):
        super().__init__()
        self.conv1 = nn.Conv2d(128, 256, 3, padding=1, bias=False)
        self.conv2 = nn.Conv2d(256, 65, 1, bias=False)
        self.bn1 = nn.BatchNorm2d(256)
        self.relu1 = nn.ReLU()
    def forward(self, x):
        output = self.conv1(x)
        output = self.bn1(output)
        output = self.relu1(output)
        output = self.conv2(output)
```

```
return output

class Network(nn.Module):

    def __init__(self):
        super().__init__()

        self.enc = Encoder()
        self.dec = Decoder()

    def forward(self, x):

        output = self.enc(x)
        output = self.dec(output)

        return output

device = torch.device("cuda" if torch.cuda.is_available() else "cpu")

model = Network().to(device)
torchinfo.summary(model, input_size=(1,1,256,256))
```

========

Layer (type:depth-idx)	rer (type:depth-idx) Output Shape	
=======		
Network	[1, 65, 32, 32]	
Encoder: 1-1	[1, 128, 32, 32]	
ResnetBlock: 2-1	[1, 64, 256, 256]	
Conv2d: 3-1	[1, 64, 256, 256]	576
BatchNorm2d: 3-2	[1, 64, 256, 256]	128
ReLU: 3-3	[1, 64, 256, 256]	
Conv2d: 3-4	[1, 64, 256, 256]	36,864
BatchNorm2d: 3-5	[1, 64, 256, 256]	128
Conv2d: 3-6	[1, 64, 256, 256]	64
ReLU: 3-7	[1, 64, 256, 256]	
ResnetBlock: 2-2	[1, 64, 256, 256]	4,096
Conv2d: 3-8	[1, 64, 256, 256]	36,864
BatchNorm2d: 3-9	[1, 64, 256, 256]	128
ReLU: 3-10	[1, 64, 256, 256]	
Conv2d: 3-11	[1, 64, 256, 256]	36,864
BatchNorm2d: 3-12	[1, 64, 256, 256]	128
ReLU: 3-13	[1, 64, 256, 256]	
MaxPool2d: 2-3	[1, 64, 128, 128]	
ResnetBlock: 2-4	[1, 64, 128, 128]	4,096

Conv2d: 3-14		[1, 64,	128,	128]	36,864
BatchNorm2d:	3-15	[1, 64,	128,	128]	128
ReLU: 3-16		[1, 64,			
Conv2d: 3-17			-		
		[1, 64,			36,864
BatchNorm2d:	3-18	[1, 64,	128,	128]	128
ReLU: 3-19		[1, 64,	128,	128]	
ResnetBlock: 2-5		[1, 64	. 128.	1287	4,096
Conv2d: 3-20		[1, 64,			36,864
	2 01				
BatchNorm2d:	3-21	[1, 64,			128
ReLU: 3-22		[1, 64,	128,	128]	
Conv2d: 3-23		[1, 64,	128,	128]	36,864
BatchNorm2d:	3-24	[1, 64,	128,	128]	128
ReLU: 3-25		[1, 64,			
MaxPool2d: 2-6		[1, 64]			
ResnetBlock: 2-7		[1, 128			
Conv2d: 3-26		[1, 128			73,728
BatchNorm2d:	3-27	[1, 128	, 64,	64]	256
ReLU: 3-28		[1, 128	, 64,	64]	
Conv2d: 3-29		[1, 128	. 64.	641	147,456
BatchNorm2d:	3-30	[1, 128			256
	3 30				
Conv2d: 3-31		[1, 128			8,192
ReLU: 3-32		[1, 128	, 64,	64]	
ResnetBlock: 2-8		[1, 128]	3, 64,	64]	16,384
Conv2d: 3-33		[1, 128	, 64,	64]	147,456
BatchNorm2d:	3-34	[1, 128	. 64.	641	256
ReLU: 3-35		[1, 128			
Conv2d: 3-36		[1, 128			147,456
	0.07				=
BatchNorm2d:	3-31	[1, 128			256
ReLU: 3-38		[1, 128	, 64,	64]	
MaxPool2d: 2-9		[1, 128]	3, 32,	32]	
ResnetBlock: 2-10		[1, 128	3, 32,	32]	16,384
Conv2d: 3-39		[1, 128			147,456
BatchNorm2d:	3-40	[1, 128			256
	3 40				
ReLU: 3-41		[1, 128			
Conv2d: 3-42		[1, 128			147,456
BatchNorm2d:	3-43	[1, 128	, 32,	32]	256
ReLU: 3-44		[1, 128	, 32,	32]	
ResnetBlock: 2-11		[1, 128	3. 32.	321	16,384
Conv2d: 3-45		[1, 128		_	147,456
	2.46	-	-		
BatchNorm2d:	3-40	[1, 128			256
ReLU: 3-47		[1, 128			
Conv2d: 3-48		[1, 128	, 32,	32]	147,456
BatchNorm2d:	3-49	[1, 128	, 32,	32]	256
ReLU: 3-50		[1, 128	, 32.	32]	
Decoder: 1-2		[1, 65			
Conv2d: 2-12		[1, 256			
		-			294,912
BatchNorm2d: 2-13		[1, 256]	5, 32,	32]	512

```
[1, 65, 32, 32]
          Conv2d: 2-15
                                                               16,640
     ______
     Total params: 1,749,376
     Trainable params: 1,749,376
     Non-trainable params: 0
     Total mult-adds (G): 12.78
     Input size (MB): 0.26
     Forward/backward pass size (MB): 419.96
     Params size (MB): 6.75
     Estimated Total Size (MB): 426.98
     _____
[17]: #priprava ucnih primerov
     def generate_batch(batch_size, width, height, device):
        images = []
        point_images = []
        for i in range(batch_size):
            #0 -> triangle; 1 -> square; 2 -> star; 3 -> checkerboard
            rand_img = random.randint(0, 3)
            if (rand img == 0):
                img, points_img = generate_triangle(width, height)
            elif (rand_img == 1):
                img, points_img = generate_square(width, height)
            elif (rand img == 2):
                img, points_img = generate_star(width, height)
            elif (rand img == 3):
                img, points_img = generate_chessboard(width, height)
            img = torch.tensor(img).to(device).unsqueeze(0).to(torch.float32)
            points_img = torch.tensor(points_img).to(device).unsqueeze(0).to(torch.
      →float32)
            #Reshape v velikost H/8, 8, W/8, 8
            points_img = torch.reshape(points_img, (height // 8, 8, width // 8, 8))
            #Permute kanalov v vrstni red H/8, W/8, 8, 8
```

[1, 256, 32, 32]

ReLU: 2-14

points_img = torch.permute(points_img, (0, 2, 1, 3))

```
#Dodamo kanal 65
              points_img_new = torch.zeros((height // 8, width // 8, 1))
              points_img = torch.cat((points_img, points_img_new), 2)
              #Za vsak izmed H/8, 8, W/8 pikslov preverimo, da je nastavljena enau
       ⇒izmed 65 točk
              for j in range(0, len(points_img)):
                  for k in range(0, len(points_img[0])):
                      found_points = []
                      for 1 in range(len(points_img[j][k])):
                          if (points_img[j][k][l] == 1):
                              found_points.append(1)
                      if (len(found_points) == 0):
                         #kjer ni nastavljena nobena nastavimo kanal 65
                          points_img[j][k][64] = 1
                      elif (len(found_points) > 1):
                          #kjer je nastavljenih več ohranimo eno naključno
                          keep_rand = random.randint(0, len(found_points) - 1)
                          for 1 in range(len(found_points)):
                              if (keep_rand == 1):
                                  continue
                              points_img[j][k][found_points[1]] = 0
              points_img = torch.permute(points_img, (2, 0, 1))
              images.append(img)
              point_images.append(points_img)
          return torch.stack(images), torch.stack(point_images)
      # generate_batch(1, 256, 256, device)
 []: # import sys
      # np.set_printoptions(threshold=sys.maxsize)
[14]: image, point_image = generate_batch(1, 128, 128, device)
[15]: device = torch.device("cuda" if torch.cuda.is_available() else "cpu")
```

points_img = torch.reshape(points_img, (height // 8, width // 8, 64))

#Reshape v velikost H/8, W/8, 64

```
model = Network().to(device)
iterations = 1 \#1000
batch_size = 1
epochs = 100 #10
loss_function = nn.CrossEntropyLoss()
optimizer = optim.Adam(model.parameters(), 1e-3)
steps_train = 0
steps_val = 0
for epoch in range(epochs):
    train_loss = 0
    val_loss = 0
    start_time = 0
    #train
   model.train()
    for iteration in range(iterations):
        optimizer.zero_grad()
        outputs = model(image)
        loss = loss_function(outputs, point_image)
        loss.backward()
        optimizer.step()
        train_loss += loss.item()
        steps_train += 1
    print("Epoch done: ", str(epoch + 1), " (training). Loss: ", train_loss / ____
 →iterations)
    #validate
    with torch.no_grad():
        model.eval()
        for iteration in range(iterations):
            outputs = model(image)
```

```
loss = loss_function(outputs, point_image)

val_loss += loss.item()
steps_val += 1

print("Epoch: ", str(epoch + 1), " (validating). Loss: ", val_loss / □
iterations)
```

```
Epoch done: 1 (training). Loss: 4.0841755867004395
Epoch: 1 (validating). Loss: 4.1583733558654785
Epoch done: 2 (training). Loss: 3.8184568881988525
Epoch: 2 (validating). Loss: 4.117103576660156
Epoch done: 3 (training). Loss: 3.5323801040649414
Epoch: 3 (validating). Loss: 4.054582118988037
Epoch done: 4 (training). Loss: 3.1867599487304688
Epoch: 4 (validating). Loss: 3.984454393386841
Epoch done: 5 (training). Loss:
                                 2.8472490310668945
Epoch: 5 (validating). Loss: 3.9032199382781982
Epoch done: 6 (training). Loss: 2.554046869277954
Epoch: 6 (validating). Loss: 3.8493564128875732
Epoch done: 7 (training). Loss: 2.296175718307495
Epoch: 7 (validating). Loss: 3.7438199520111084
Epoch done: 8 (training). Loss: 2.0507984161376953
Epoch: 8 (validating). Loss: 3.5413694381713867
Epoch done: 9 (training). Loss: 1.8305491209030151
Epoch: 9 (validating). Loss: 3.2093992233276367
Epoch done: 10 (training). Loss: 1.6276065111160278
Epoch: 10 (validating). Loss: 2.9780216217041016
Epoch done: 11 (training). Loss: 1.4426217079162598
Epoch: 11 (validating). Loss: 2.7503838539123535
Epoch done: 12 (training). Loss: 1.2755956649780273
Epoch: 12 (validating). Loss: 2.386049270629883
Epoch done: 13 (training). Loss: 1.1233842372894287
Epoch: 13 (validating). Loss: 2.0353822708129883
Epoch done: 14 (training). Loss: 0.9839590191841125
Epoch: 14 (validating). Loss: 1.8458869457244873
Epoch done: 15 (training). Loss: 0.8581812381744385
Epoch: 15 (validating). Loss: 1.6422412395477295
Epoch done: 16 (training). Loss: 0.7452664375305176
Epoch: 16 (validating). Loss: 1.3957420587539673
Epoch done: 17 (training). Loss: 0.6434639096260071
Epoch: 17 (validating). Loss: 1.1443485021591187
Epoch done: 18 (training). Loss: 0.5550420880317688
Epoch: 18 (validating). Loss: 0.9680818915367126
Epoch done: 19 (training). Loss: 0.4770165681838989
Epoch: 19 (validating). Loss: 0.9525731205940247
Epoch done: 20 (training). Loss: 0.4096740782260895
Epoch: 20 (validating). Loss: 0.6999013423919678
```

```
Epoch done: 21 (training). Loss: 0.35183680057525635
       21 (validating). Loss: 0.4252578616142273
Epoch:
Epoch done: 22 (training). Loss: 0.30248090624809265
       22 (validating). Loss: 0.34055355191230774
Epoch:
Epoch done: 23 (training). Loss: 0.26053285598754883
       23 (validating). Loss: 0.29113075137138367
Epoch done: 24 (training). Loss: 0.22512242197990417
Epoch:
       24 (validating). Loss: 0.25082752108573914
Epoch done: 25 (training). Loss: 0.1952367126941681
       25 (validating). Loss: 0.21974320709705353
Epoch:
Epoch done: 26 (training). Loss: 0.16982293128967285
       26 (validating). Loss: 0.19077320396900177
Epoch:
Epoch done: 27 (training). Loss: 0.14851415157318115
       27 (validating). Loss: 0.16751526296138763
Epoch done: 28 (training). Loss: 0.13049183785915375
       28 (validating). Loss: 0.147809237241745
Epoch:
Epoch done: 29 (training). Loss: 0.11503102630376816
       29 (validating). Loss: 0.12842980027198792
Epoch:
Epoch done: 30 (training). Loss: 0.10197168588638306
Epoch:
       30 (validating). Loss: 0.10943365842103958
Epoch done: 31 (training). Loss: 0.09080441296100616
       31 (validating). Loss: 0.09250738471746445
Epoch done: 32 (training). Loss: 0.08131113648414612
       32 (validating). Loss: 0.07802760601043701
Epoch:
Epoch done: 33 (training). Loss: 0.0731702595949173
       33 (validating). Loss: 0.06648527085781097
Epoch:
Epoch done: 34 (training). Loss: 0.06612753868103027
       34 (validating). Loss: 0.05717872083187103
Epoch:
Epoch done: 35 (training). Loss: 0.0600917711853981
Epoch:
       35 (validating). Loss: 0.04955727234482765
Epoch done: 36 (training). Loss: 0.05486239120364189
Epoch:
       36 (validating). Loss: 0.043364886194467545
Epoch done: 37 (training). Loss: 0.05030905827879906
Epoch:
       37 (validating). Loss: 0.03856273740530014
Epoch done: 38 (training). Loss: 0.04634307697415352
       38 (validating). Loss: 0.0349244624376297
Epoch:
Epoch done: 39 (training). Loss: 0.04286237806081772
Epoch:
       39 (validating). Loss: 0.032068535685539246
Epoch done: 40 (training). Loss: 0.03981362283229828
Epoch: 40 (validating). Loss: 0.029734011739492416
Epoch done: 41 (training). Loss: 0.03714175522327423
Epoch: 41 (validating). Loss: 0.027716755867004395
Epoch done: 42 (training). Loss: 0.03476613387465477
Epoch: 42 (validating). Loss: 0.025878511369228363
Epoch done: 43 (training). Loss: 0.03264352306723595
Epoch: 43 (validating). Loss: 0.02422848716378212
Epoch done: 44 (training). Loss: 0.030756842344999313
Epoch: 44 (validating). Loss: 0.02281446009874344
```

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Epoch done: 45 (training). Loss: 0.02907460927963257
Epoch: 45 (validating). Loss: 0.02167087234556675
Epoch done: 46 (training). Loss: 0.027561357244849205
       46 (validating). Loss: 0.020778577774763107
Epoch:
Epoch done: 47 (training). Loss: 0.026199834421277046
Epoch: 47 (validating). Loss: 0.02008778229355812
Epoch done: 48 (training). Loss: 0.02497464045882225
Epoch: 48 (validating). Loss: 0.019544851034879684
Epoch done: 49 (training). Loss: 0.02386399731040001
Epoch: 49 (validating). Loss: 0.01909082755446434
Epoch done: 50 (training). Loss: 0.022853044793009758
Epoch: 50 (validating). Loss: 0.01869601011276245
Epoch done: 51 (training). Loss: 0.021932493895292282
       51 (validating). Loss: 0.01834098808467388
Epoch:
Epoch done: 52 (training). Loss: 0.021093130111694336
       52 (validating). Loss: 0.018011368811130524
Epoch:
Epoch done: 53 (training). Loss: 0.020324859768152237
       53 (validating). Loss: 0.017687790095806122
Epoch:
Epoch done: 54 (training). Loss: 0.019618427380919456
Epoch:
       54 (validating). Loss: 0.0173509381711483
Epoch done: 55 (training). Loss: 0.018967701122164726
Epoch: 55 (validating). Loss: 0.016989264637231827
Epoch done: 56 (training). Loss: 0.018366528674960136
       56 (validating). Loss: 0.016604043543338776
Epoch:
Epoch done: 57 (training). Loss: 0.017809562385082245
Epoch: 57 (validating). Loss: 0.016220832243561745
Epoch done: 58 (training). Loss: 0.017293332144618034
Epoch:
       58 (validating). Loss: 0.015871454030275345
Epoch done: 59 (training). Loss: 0.01681383326649666
Epoch:
       59 (validating). Loss: 0.015575464814901352
Epoch done: 60 (training). Loss: 0.01636638306081295
Epoch:
       60 (validating). Loss: 0.015339707024395466
Epoch done: 61 (training). Loss: 0.015947051346302032
Epoch:
       61 (validating). Loss: 0.015156455338001251
Epoch done: 62 (training). Loss: 0.015553843230009079
       62 (validating). Loss: 0.015008452348411083
Epoch:
Epoch done: 63 (training). Loss: 0.015185341238975525
Epoch:
       63 (validating). Loss: 0.014865415170788765
Epoch done: 64 (training). Loss: 0.014839209616184235
       64 (validating). Loss: 0.014699254184961319
Epoch:
Epoch done: 65 (training). Loss: 0.014512891881167889
       65 (validating). Loss: 0.014496617950499058
Epoch:
Epoch done: 66 (training). Loss: 0.014204644598066807
       66 (validating). Loss: 0.014259380288422108
Epoch:
Epoch done: 67 (training). Loss: 0.013912982307374477
Epoch: 67 (validating). Loss: 0.013999875634908676
Epoch done: 68 (training). Loss: 0.013636220246553421
Epoch: 68 (validating). Loss: 0.013738354668021202
```

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Epoch done: 69 (training). Loss: 0.013372855260968208
Epoch: 69 (validating). Loss: 0.013494455255568027
Epoch done: 70 (training). Loss: 0.013122009113430977
       70 (validating). Loss: 0.013281872496008873
Epoch done: 71 (training). Loss: 0.012882944196462631
Epoch: 71 (validating). Loss: 0.013105697929859161
Epoch done: 72 (training). Loss: 0.012654771097004414
Epoch: 72 (validating). Loss: 0.012962288223206997
Epoch done: 73 (training). Loss: 0.01243650447577238
Epoch: 73 (validating). Loss: 0.012842326425015926
Epoch done: 74 (training). Loss: 0.012227335013449192
Epoch: 74 (validating). Loss: 0.012732954695820808
Epoch done: 75 (training). Loss: 0.012026607990264893
       75 (validating). Loss: 0.012625849805772305
Epoch done: 76 (training). Loss: 0.011833634227514267
       76 (validating). Loss: 0.012515608221292496
Epoch:
Epoch done: 77 (training). Loss: 0.011647802777588367
       77 (validating). Loss: 0.012400135397911072
Epoch:
Epoch done: 78 (training). Loss: 0.011468632146716118
Epoch: 78 (validating). Loss: 0.012281166389584541
Epoch done: 79 (training). Loss: 0.01129584014415741
Epoch: 79 (validating). Loss: 0.012160951271653175
Epoch done: 80 (training). Loss: 0.011129113845527172
       80 (validating). Loss: 0.012039821594953537
Epoch:
Epoch done: 81 (training). Loss: 0.010967935435473919
Epoch: 81 (validating). Loss: 0.011916186660528183
Epoch done: 82 (training). Loss: 0.010811822488904
       82 (validating). Loss: 0.011789718642830849
Epoch:
Epoch done: 83 (training). Loss: 0.010660496540367603
Epoch:
       83 (validating). Loss: 0.011658762581646442
Epoch done: 84 (training). Loss: 0.010513762943446636
       84 (validating). Loss: 0.011524975299835205
Epoch:
Epoch done: 85 (training). Loss: 0.01037132740020752
Epoch:
       85 (validating). Loss: 0.011388944461941719
Epoch done: 86 (training). Loss: 0.01023288443684578
       86 (validating). Loss: 0.011251921765506268
Epoch:
Epoch done: 87 (training). Loss: 0.010098189115524292
Epoch:
       87 (validating). Loss: 0.01111737173050642
Epoch done: 88 (training). Loss: 0.009967061690986156
Epoch: 88 (validating). Loss: 0.010988189838826656
Epoch done: 89 (training). Loss: 0.009839341044425964
       89 (validating). Loss: 0.01086657028645277
Epoch:
Epoch done: 90 (training). Loss: 0.009714895859360695
       90 (validating). Loss: 0.010752849280834198
Epoch done: 91 (training). Loss: 0.009593553841114044
Epoch: 91 (validating). Loss: 0.010645067319273949
Epoch done: 92 (training). Loss: 0.009475141763687134
Epoch: 92 (validating). Loss: 0.010540495626628399
```

```
Epoch: 93 (validating). Loss: 0.010435700416564941
     Epoch done: 94 (training). Loss: 0.009246603585779667
     Epoch: 94 (validating). Loss: 0.010328459553420544
     Epoch done: 95 (training). Loss: 0.009136219508945942
     Epoch: 95 (validating). Loss: 0.010218141600489616
     Epoch done: 96 (training). Loss: 0.00902824942022562
     Epoch: 96 (validating). Loss: 0.010106056928634644
     Epoch done: 97 (training). Loss: 0.008922592736780643
     Epoch: 97 (validating). Loss: 0.009993158280849457
     Epoch done: 98 (training). Loss: 0.008819153532385826
     Epoch: 98 (validating). Loss: 0.009880969300866127
     Epoch done: 99 (training). Loss: 0.008717851713299751
     Epoch: 99 (validating). Loss: 0.009770284406840801
     Epoch done: 100 (training). Loss: 0.0086186109110713
     Epoch: 100 (validating). Loss: 0.009661532007157803
[12]: def reshape_to_original_size(pred):
          #Reshape v velikost H/8, W/8, 8, 8
         pred = torch.permute(pred, (1, 2, 0)) # [16, 16, 65]
         pred = pred[:, :, :-1] # [16, 16, 64]
         pred = torch.reshape(pred, (pred.shape[0], pred.shape[1], 8, 8)) # [16, 16, 16]
       ⇔8,8]
          #Permute kanalov v vrstni red H/8, 8, W/8, 8
         pred = torch.permute(pred, (0, 2, 1, 3)) # [16, 8, 16, 8]
         #Reshape v velikost H, W
         pred = torch.reshape(pred, (pred.shape[0] * 8, pred.shape[2] * 8)) # [128,__
       →128]
         return pred
[16]: device = torch.device("cuda" if torch.cuda.is_available() else "cpu")
      # pretvori cilj
     target = reshape_to_original_size(point_image[0])
     py_tar, px_tar = np.where(target>0)
     plt.imshow(image[0][0], cmap='gray')
     plt.axis('off')
     plt.show()
     plt.plot(px_tar, py_tar, 'go', label='cilji')
     plt.imshow(target)
     plt.axis('off')
```

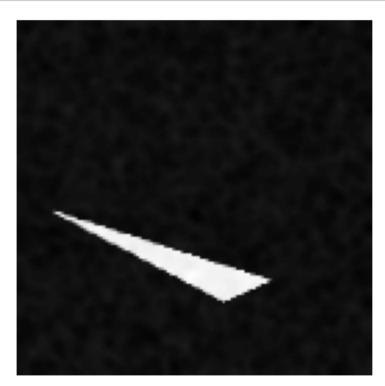
Epoch done: 93 (training). Loss: 0.009359538555145264

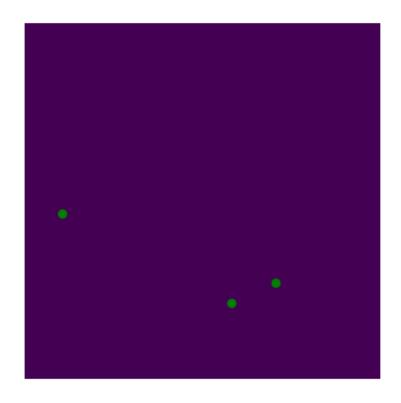
```
plt.show()

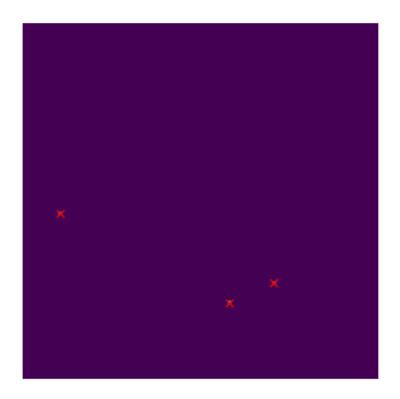
pred = model(image)
soft = nn.Softmax(0)
pred = soft(pred[0])
pred = reshape_to_original_size(pred)
pred = pred.detach().numpy()

# # najdi lokalne maksimume predikcije, vecje od minimalne vrednosti
local_max = (pred==ndimage.grey_dilation(pred, size=3))*pred>0.3
py_est, px_est = np.where(local_max)

plt.plot(px_est, py_est, 'rx', label='napovedi')
plt.imshow(pred)
plt.axis('off')
plt.show()
```







```
[29]: device = torch.device("cuda" if torch.cuda.is_available() else "cpu")
      model = Network().to(device)
      iterations = 10
      batch_size = 8
      epochs = 1000
      loss_function = nn.CrossEntropyLoss()
      optimizer = optim.Adam(model.parameters(), 1e-3)
      steps_train = 0
      steps_val = 0
      for epoch in range(epochs):
          train_loss = 0
          val_loss = 0
          start_time = 0
          #train
          model.train()
          for iteration in range(iterations):
              images, point_images = generate_batch(batch_size, 128, 128, device)
              optimizer.zero_grad()
              outputs = model(images)
              loss = loss_function(outputs, point_images)
              loss.backward()
              optimizer.step()
              train_loss += loss.item()
              loss_diagram.add_scalar("Loss/train/det", loss.item(), steps_train)
              steps_train += 1
          print("Epoch done: ", str(epoch + 1), " (training). Loss: ", train_loss / __
       ⇔iterations)
          #validate
          with torch.no_grad():
```

```
model.eval()
for iteration in range(iterations):
    images, point_images = generate_batch(batch_size, 128, 128, device)
    outputs = model(images)
    loss = loss_function(outputs, point_images)

    val_loss += loss.item()
    loss_diagram.add_scalar("Loss/test/det", loss.item(), steps_val)
    steps_val += 1

print("Epoch: ", str(epoch + 1), " (validating). Loss: ", val_loss /u
iterations)

loss_diagram.flush()

torch.save(model, ("save_detection.pt"))
```

Epoch done: 1 (training). Loss: 3.004988598823547 Epoch: 1 (validating). Loss: 3.361141037940979 Epoch done: 2 (training). Loss: 1.1854448795318604 Epoch: 2 (validating). Loss: 1.0480110049247742 Epoch done: 3 (training). Loss: 0.46863395273685454 Epoch: 3 (validating). Loss: 0.5336500406265259 Epoch done: 4 (training). Loss: 0.29433100372552873 Epoch: 4 (validating). Loss: 0.2846026197075844 Epoch done: 5 (training). Loss: 0.24772001802921295 Epoch: 5 (validating). Loss: 0.2991391524672508 Epoch done: 6 (training). Loss: 0.2472882926464081 Epoch: 6 (validating). Loss: 0.24778223633766175 Epoch done: 7 (training). Loss: 0.23014751672744752 Epoch: 7 (validating). Loss: 0.22799151986837388 Epoch done: 8 (training). Loss: 0.24208882600069045 Epoch: 8 (validating). Loss: 0.21622908264398574 Epoch done: 9 (training). Loss: 0.24667733162641525 Epoch: 9 (validating). Loss: 0.2197430431842804 Epoch done: 10 (training). Loss: 0.25488186776638033 Epoch: 10 (validating). Loss: 0.27108432054519654 Epoch done: 11 (training). Loss: 0.23564811646938325 Epoch: 11 (validating). Loss: 0.24977402687072753 Epoch done: 12 (training). Loss: 0.21081662476062774 Epoch: 12 (validating). Loss: 0.2457079291343689 Epoch done: 13 (training). Loss: 0.2095161572098732 Epoch: 13 (validating). Loss: 0.23872412741184235 Epoch done: 14 (training). Loss: 0.20729168504476547 Epoch: 14 (validating). Loss: 0.22983990758657455

```
Epoch done: 15 (training). Loss: 0.22679151594638824
Epoch: 15 (validating). Loss: 0.20322632193565368
Epoch done: 16 (training). Loss: 0.23516547083854675
       16 (validating). Loss: 0.2418278157711029
Epoch done: 17 (training). Loss: 0.23452878892421722
Epoch: 17 (validating). Loss: 0.24292128086090087
Epoch done: 18 (training). Loss: 0.21640573292970658
Epoch:
       18 (validating). Loss: 0.19876976311206818
Epoch done: 19 (training). Loss: 0.21711573451757432
       19 (validating). Loss: 0.2274477332830429
Epoch:
Epoch done: 20 (training). Loss: 0.22182178050279616
       20 (validating). Loss: 0.24596045762300492
Epoch:
Epoch done: 21 (training). Loss: 0.2082040473818779
       21 (validating). Loss: 0.22415565699338913
Epoch done: 22 (training). Loss: 0.19201046526432036
       22 (validating). Loss: 0.22821066975593568
Epoch:
Epoch done: 23 (training). Loss: 0.20865005850791932
       23 (validating). Loss: 0.2226639710366726
Epoch:
Epoch done: 24 (training). Loss: 0.22739994823932647
Epoch:
       24 (validating). Loss: 0.23404911831021308
Epoch done: 25 (training). Loss: 0.20349781215190887
       25 (validating). Loss: 0.23369759321212769
Epoch:
Epoch done: 26 (training). Loss: 0.21223628968000413
       26 (validating). Loss: 0.1973541796207428
Epoch:
Epoch done: 27 (training). Loss: 0.21828893572092056
Epoch: 27 (validating). Loss: 0.26223505437374117
Epoch done: 28 (training). Loss: 0.2481669083237648
Epoch:
       28 (validating). Loss: 0.22174171954393387
Epoch done: 29 (training). Loss: 0.21528032273054123
Epoch:
       29 (validating). Loss: 0.22932229191064835
Epoch done: 30 (training). Loss: 0.22482053190469742
Epoch:
       30 (validating). Loss: 0.25545835196971894
Epoch done: 31 (training). Loss: 0.20304316356778146
Epoch:
       31 (validating). Loss: 0.22222791463136674
Epoch done: 32 (training). Loss: 0.24759840220212936
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Epoch done: 33 (training). Loss: 0.2365198940038681
Epoch:
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Epoch done: 34 (training). Loss: 0.19750136882066727
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Epoch:
Epoch done: 35 (training). Loss: 0.17470945566892623
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Epoch:
Epoch done: 36 (training). Loss: 0.20820052847266196
       36 (validating). Loss: 0.2607946082949638
Epoch done: 37 (training). Loss: 0.19115436896681787
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Epoch done: 38 (training). Loss: 0.1837475411593914
Epoch: 38 (validating). Loss: 0.2968025729060173
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Epoch done: 39 (training). Loss: 0.2083793506026268
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Epoch done: 40 (training). Loss: 0.20266789048910142
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Epoch: 41 (validating). Loss: 0.18130835443735122
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Epoch: 42 (validating). Loss: 0.18124504536390304
Epoch done: 43 (training). Loss: 0.14721105322241784
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Epoch:
Epoch done: 44 (training). Loss: 0.1683615952730179
Epoch: 44 (validating). Loss: 0.17708926498889924
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Epoch: 45 (validating). Loss: 0.187028668820858
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Epoch: 46 (validating). Loss: 0.16117172688245773
Epoch done: 47 (training). Loss: 0.14457419365644456
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Epoch:
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Epoch: 48 (validating). Loss: 0.18920896500349044
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Epoch: 49 (validating). Loss: 0.20418578535318374
Epoch done: 50 (training). Loss: 0.14867057874798775
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Epoch done: 51 (training). Loss: 0.15583696216344833
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Epoch done: 52 (training). Loss: 0.1305013805627823
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Epoch:
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Epoch done: 54 (training). Loss: 0.13027545884251596
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Epoch:
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Epoch:
Epoch done: 57 (training). Loss: 0.12839887291193008
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Epoch:
Epoch done: 59 (training). Loss: 0.13850802853703498
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Epoch:
Epoch done: 60 (training). Loss: 0.1208894208073616
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Epoch done: 61 (training). Loss: 0.13249928876757622
Epoch:
       61 (validating). Loss: 0.16018958911299705
Epoch done: 62 (training). Loss: 0.11424175947904587
Epoch: 62 (validating). Loss: 0.1392515130341053
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Epoch: 63 (validating). Loss: 0.1429739311337471
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Epoch:
Epoch done: 66 (training). Loss: 0.1518608085811138
Epoch:
       66 (validating). Loss: 0.1341943211853504
Epoch done: 67 (training). Loss: 0.13125825375318528
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       69 (validating). Loss: 0.10163314118981362
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Epoch done: 73 (training). Loss: 0.11250576749444008
Epoch: 73 (validating). Loss: 0.11346823051571846
Epoch done: 74 (training). Loss: 0.11360948383808137
Epoch: 74 (validating). Loss: 0.09933001324534416
Epoch done: 75 (training). Loss: 0.11374328210949898
Epoch: 75 (validating). Loss: 0.08699263334274292
Epoch done: 76 (training). Loss: 0.11280458942055702
       76 (validating). Loss: 0.11197481825947761
Epoch done: 77 (training). Loss: 0.0943115770816803
Epoch:
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Epoch done: 78 (training). Loss: 0.10542980916798114
Epoch:
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Epoch: 79 (validating). Loss: 0.11837985441088676
Epoch done: 80 (training). Loss: 0.12342218980193138
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Epoch:
Epoch done: 82 (training). Loss: 0.09995061531662941
Epoch: 82 (validating). Loss: 0.12095649763941765
Epoch done: 83 (training). Loss: 0.11219712123274803
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Epoch:
Epoch done: 84 (training). Loss: 0.09265771880745888
Epoch: 84 (validating). Loss: 0.11164646185934543
Epoch done: 85 (training). Loss: 0.09093251377344132
Epoch:
       85 (validating). Loss: 0.11199580058455468
Epoch done: 86 (training). Loss: 0.11099337935447692
Epoch: 86 (validating). Loss: 0.09792536720633507
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Epoch done: 87 (training). Loss: 0.09336302429437637
Epoch: 87
           (validating). Loss: 0.11407779306173324
Epoch done: 88 (training). Loss: 0.10776675269007682
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Epoch:
Epoch done: 89 (training). Loss: 0.08900880441069603
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Epoch:
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Epoch:
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Epoch done: 91 (training). Loss: 0.1024582915008068
Epoch:
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Epoch done: 92 (training). Loss:
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Epoch:
Epoch done: 94
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Epoch:
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Epoch:
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Epoch done:
Epoch:
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Epoch done: 97 (training). Loss: 0.08595681376755238
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           (validating). Loss: 0.09526056200265884
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Epoch:
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            (validating). Loss: 0.09672841280698777
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Epoch done:
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Epoch done:
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Epoch: 106
Epoch done:
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Epoch: 107
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Epoch done:
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Epoch: 108
            (validating). Loss: 0.08154960088431835
Epoch done:
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Epoch: 109
            (validating). Loss:
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Epoch done:
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Epoch: 110
            (validating). Loss: 0.07508254423737526
```

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111 (training). Loss:
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Epoch: 111
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Epoch done:
            112 (training). Loss:
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             (validating). Loss:
Epoch:
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                 (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch: 116
Epoch done:
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Epoch: 121
Epoch done:
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             (validating). Loss:
Epoch: 123
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             (validating). Loss: 0.09014274328947067
                  (training). Loss:
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Epoch:
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             (validating). Loss:
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                 (training). Loss:
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Epoch:
             (validating). Loss: 0.08736469186842441
Epoch done:
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                  (training). Loss:
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Epoch: 128
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Epoch done:
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Epoch done:
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Epoch done:
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Epoch done:
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Epoch:
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Epoch done:
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                 (training). Loss:
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Epoch: 134
             (validating). Loss: 0.08467706479132175
```

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135 (training). Loss:
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Epoch: 135
             (validating). Loss: 0.09534090608358384
Epoch done:
                 (training). Loss:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch:
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Epoch: 140
Epoch done:
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Epoch:
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Epoch done:
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Epoch: 143
Epoch done:
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Epoch done:
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             (validating). Loss:
Epoch:
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                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss: 0.08172003701329231
                  (training). Loss:
Epoch done:
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             (validating). Loss: 0.07788147740066051
Epoch done:
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Epoch:
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             (validating). Loss: 0.08205416649580002
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Epoch done:
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Epoch done:
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Epoch: 156
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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                 (training). Loss:
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Epoch: 158
             (validating). Loss: 0.07765340395271778
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(training). Loss:
Epoch done:
             159
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Epoch: 159
             (validating). Loss:
                                  0.06382055282592773
Epoch done:
             160 (training). Loss:
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             (validating). Loss:
Epoch:
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Epoch done:
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Epoch:
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Epoch:
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Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
Epoch:
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Epoch:
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Epoch done:
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Epoch: 171
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Epoch:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch done:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch: 180
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Epoch:
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Epoch: 182
             (validating). Loss: 0.06312275715172291
```

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183 (training). Loss:
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Epoch: 183
             (validating). Loss:
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Epoch done:
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Epoch:
             (validating). Loss:
        184
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Epoch done:
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             (validating). Loss:
Epoch:
        185
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Epoch done:
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Epoch:
        186
             (validating). Loss:
                                 0.078887490183115
                  (training). Loss:
Epoch done:
                                     0.06161835715174675
Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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                                     0.06900420375168323
             (validating). Loss: 0.06537405252456666
Epoch: 188
Epoch done:
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                                     0.05930241011083126
Epoch:
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             (validating). Loss: 0.07790753804147243
Epoch done:
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             (validating). Loss:
Epoch: 190
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Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss: 0.07757187858223916
Epoch done:
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             (validating). Loss:
Epoch: 193
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Epoch done:
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Epoch:
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss: 0.07000358961522579
                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch done:
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                  (training). Loss:
Epoch done:
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Epoch done:
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Epoch done:
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             (validating). Loss:
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                 (training). Loss:
Epoch done:
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Epoch:
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Epoch:
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             (validating). Loss:
                                 0.06447499543428421
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
             (validating). Loss: 0.07157321870326996
       206
```

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207 (training). Loss:
Epoch done:
                                    0.04851790741086006
Epoch:
       207
             (validating). Loss: 0.054824288189411166
Epoch done:
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Epoch:
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             (validating). Loss:
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                 (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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                 (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
                                 0.05654923431575298
                  (training). Loss:
Epoch done:
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             (validating). Loss: 0.06731716990470886
Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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             (validating). Loss:
Epoch:
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                                 0.06360325664281845
Epoch done:
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                  (training). Loss:
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             (validating). Loss:
Epoch:
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                                 0.07866379357874394
Epoch done:
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Epoch:
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                  (training). Loss:
Epoch done:
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             (validating). Loss:
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Epoch:
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             (validating). Loss:
Epoch:
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Epoch done:
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                  (training). Loss:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss: 0.07442602217197418
                 (training). Loss:
Epoch done:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch:
             (validating). Loss:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss: 0.06384907364845276
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231 (training). Loss:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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             (validating). Loss:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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                  (training). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
Epoch:
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             (validating). Loss:
Epoch:
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             (validating). Loss:
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             (validating). Loss:
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Epoch done:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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279 (training). Loss:
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Epoch:
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Epoch done:
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Epoch:
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303 (training). Loss:
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Epoch done:
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             (validating). Loss:
                                  0.05444024614989758
                  (training). Loss:
Epoch done:
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                                     0.0579045444726944
             (validating). Loss:
Epoch:
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                                  0.049314581975340846
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
                                  0.058241241797804835
Epoch done:
             326
                  (training). Loss:
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Epoch:
             (validating). Loss: 0.051501878350973126
       326
```

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327 (training). Loss:
Epoch done:
                                     0.05694005154073238
Epoch:
       327
             (validating). Loss: 0.07643514759838581
Epoch done:
             328 (training). Loss:
                                     0.05829985849559307
Epoch:
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             (validating). Loss:
                                  0.05192905627191067
                  (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch:
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                                  0.0543773528188467
Epoch done:
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Epoch:
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             (validating). Loss:
                                  0.053285595029592514
                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
                                  0.05277143344283104
                  (training). Loss:
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Epoch done:
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             (validating). Loss:
Epoch:
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                                  0.057361890375614163
Epoch done:
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Epoch:
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             (validating). Loss:
                                  0.06494905427098274
Epoch done:
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Epoch:
             (validating). Loss:
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                                  0.05524196922779083
Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss:
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                                  0.04551030583679676
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
             (validating). Loss:
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Epoch:
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Epoch:
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                                     0.056369461864233014
Epoch:
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Epoch done:
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Epoch:
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Epoch done:
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             (validating). Loss:
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Epoch:
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             (validating). Loss:
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Epoch done:
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                  (training). Loss:
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Epoch:
             (validating). Loss: 0.05266949012875557
       350
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351 (training). Loss:
Epoch done:
                                     0.05663381740450859
Epoch:
       351
             (validating). Loss:
                                  0.05551308989524841
Epoch done:
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Epoch:
             (validating). Loss:
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                                  0.05252853408455849
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Epoch done:
Epoch:
             (validating). Loss:
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                                  0.050871627405285835
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
                                  0.057601916044950484
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Epoch done:
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                                     0.05919581316411495
             (validating). Loss:
Epoch:
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                                  0.06056322008371353
Epoch done:
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Epoch:
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             (validating). Loss:
                                  0.05559736676514149
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Epoch:
             (validating). Loss:
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Epoch done:
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Epoch:
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                                  0.04963420480489731
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Epoch:
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             (validating). Loss:
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Epoch done:
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             (validating). Loss:
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                                  0.05161588098853827
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             (validating). Loss:
Epoch:
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Epoch:
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                                  0.05390834994614124
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Epoch done:
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             (validating). Loss:
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             (validating). Loss:
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Epoch done:
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             (validating). Loss:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch done:
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             (validating). Loss:
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Epoch done:
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Epoch:
       374
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375 (training). Loss:
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Epoch:
             (validating). Loss:
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Epoch done:
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             (validating). Loss:
Epoch:
        377
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             (validating). Loss:
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             (validating). Loss:
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Epoch:
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Epoch:
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             (validating). Loss:
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             (validating). Loss:
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             (validating). Loss:
Epoch:
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             (validating). Loss:
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Epoch:
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             (validating). Loss: 0.04747394435107708
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Epoch done:
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Epoch:
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Epoch: 402
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Epoch done:
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Epoch done:
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Epoch done:
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Epoch done:
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Epoch: 422
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423 (training). Loss:
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Epoch done:
            424 (training). Loss:
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Epoch:
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Epoch: 446
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Epoch done:
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                                     0.05002118535339832
Epoch done:
            459
             (validating). Loss:
Epoch:
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                                 0.05529255028814077
                  (training). Loss:
Epoch done:
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                                     0.060193562880158424
Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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            462 (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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                 (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch:
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                                 0.04938674531877041
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Epoch done:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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                                     0.045124633237719536
             (validating). Loss:
Epoch:
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                                 0.049191539734601976
                  (training). Loss:
Epoch done:
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                                     0.042652690783143044
             (validating). Loss:
Epoch:
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                                 0.04601628594100475
                 (training). Loss:
Epoch done:
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                                     0.047183625400066376
Epoch: 468
             (validating). Loss:
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Epoch done:
            469 (training). Loss:
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             (validating). Loss:
                                 0.050955872610211374
Epoch done:
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                 (training). Loss:
                                     0.04919405914843082
             (validating). Loss: 0.050029545277357104
Epoch: 470
```

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471 (training). Loss:
Epoch done:
                                    0.044025751389563085
Epoch: 471
             (validating). Loss: 0.05258209109306335
Epoch done:
            472 (training). Loss:
                                    0.05127581171691418
             (validating). Loss:
Epoch:
       472
                                 0.05367591977119446
                 (training). Loss:
Epoch done:
                                    0.042981992848217486
             (validating). Loss:
Epoch:
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                                 0.0526123221963644
Epoch done:
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                                    0.05241292752325535
Epoch: 474
             (validating). Loss:
                                 0.04931625090539456
                 (training). Loss:
Epoch done:
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                                    0.047427660599350926
Epoch:
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             (validating). Loss:
                                 0.052777744457125665
                 (training). Loss:
            476
Epoch done:
                                    0.05132980067282915
             (validating). Loss: 0.04994043558835983
Epoch: 476
Epoch done:
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                                    0.05139669924974442
Epoch: 477
             (validating). Loss: 0.052259635925292966
Epoch done:
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                                    0.04782330244779587
             (validating). Loss: 0.052331724762916566
Epoch: 478
Epoch done:
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                                    0.05132244750857353
             (validating). Loss: 0.049180205911397934
Epoch:
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Epoch done:
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                                    0.04675148483365774
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                  (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch: 481
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             (validating). Loss:
Epoch:
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                                 0.05065841805189848
                 (training). Loss:
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Epoch done:
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             (validating). Loss:
Epoch:
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                                 0.05212339907884598
                 (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss: 0.0477256003767252
                 (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss: 0.05160549283027649
                 (training). Loss:
Epoch done:
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Epoch:
             (validating). Loss: 0.04722502492368221
Epoch done:
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Epoch:
             (validating). Loss: 0.05199347473680973
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                 (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch:
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                                 0.044816973991692065
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Epoch done:
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Epoch:
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             (validating). Loss:
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                 (training). Loss:
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             (validating). Loss: 0.04979650117456913
Epoch: 490
                 (training). Loss:
Epoch done:
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Epoch:
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                                 0.05152333229780197
Epoch done:
                 (training). Loss:
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Epoch: 492
             (validating). Loss:
                                 0.04983869083225727
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
            494
                 (training). Loss:
                                    0.04104576371610165
Epoch: 494
             (validating). Loss: 0.050034362636506555
```

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495 (training). Loss:
Epoch done:
                                     0.0503205556422472
Epoch: 495
             (validating). Loss:
                                 0.05003133863210678
Epoch done:
                 (training). Loss:
             496
                                     0.05899019129574299
Epoch:
             (validating). Loss:
       496
                                 0.052892630361020564
                  (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch:
       497
                                 0.053204672783613204
Epoch done:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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                                     0.05279727503657341
             (validating). Loss:
Epoch:
        500
                                 0.05324164927005768
Epoch done:
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Epoch:
        501
             (validating). Loss:
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Epoch done:
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             (validating). Loss:
Epoch:
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                                 0.048464955762028694
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Epoch:
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Epoch:
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             (validating). Loss:
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             (validating). Loss:
Epoch:
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                                 0.05601705722510815
Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss: 0.05132953710854053
                  (training). Loss:
Epoch done:
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             (validating). Loss:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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                  (training). Loss:
Epoch done:
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Epoch: 512
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Epoch done:
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Epoch:
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                  (training). Loss:
Epoch done:
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Epoch: 514
             (validating). Loss:
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Epoch done:
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Epoch:
             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch:
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             (validating). Loss:
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Epoch done:
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                 (training). Loss:
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Epoch: 518
             (validating). Loss: 0.04931092523038387
```

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Epoch done:
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Epoch:
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             (validating). Loss:
                                 0.04205145183950663
                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
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Epoch done:
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             (validating). Loss: 0.04739183634519577
Epoch:
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Epoch done:
                  (training). Loss:
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                                    0.04125407412648201
Epoch:
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             (validating). Loss:
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Epoch done:
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                                     0.03959349580109119
             (validating). Loss:
Epoch:
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                                 0.04240769818425179
Epoch done:
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             (validating). Loss:
Epoch:
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Epoch:
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             (validating). Loss: 0.04946255460381508
Epoch done:
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             (validating). Loss:
Epoch:
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss:
Epoch:
       531
                                 0.05348206907510757
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Epoch done:
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Epoch:
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             (validating). Loss: 0.05104997679591179
                 (training). Loss:
Epoch done:
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Epoch:
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Epoch:
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                  (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss:
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Epoch done:
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                                    0.04994299001991749
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Epoch:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch: 542
             (validating). Loss: 0.03942492213100195
```

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             (validating). Loss:
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                                     0.04093165323138237
Epoch:
             (validating). Loss:
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                                  0.053998330235481264
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Epoch done:
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Epoch:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
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                                     0.04716159477829933
             (validating). Loss:
Epoch:
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                                 0.0398171991109848
Epoch done:
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             (validating). Loss:
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Epoch:
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             (validating). Loss:
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             (validating). Loss:
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                                  0.04761538561433554
                                     0.051222344674170014
Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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Epoch:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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             (validating). Loss:
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Epoch:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch:
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Epoch:
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Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
             (validating). Loss: 0.04362123906612396
       566
```

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567 (training). Loss:
Epoch done:
                                     0.04621752500534058
Epoch:
       567
             (validating). Loss:
                                  0.04733477644622326
Epoch done:
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Epoch:
             (validating). Loss:
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                                  0.05487509611994028
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Epoch done:
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             (validating). Loss:
Epoch:
        569
                                  0.04885816127061844
Epoch done:
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Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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                  (training). Loss:
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Epoch:
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Epoch done:
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Epoch:
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Epoch done:
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Epoch done:
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Epoch:
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             (validating). Loss: 0.05556631237268448
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591 (training). Loss:
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Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch:
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Epoch done:
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Epoch:
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Epoch done:
                                     0.04561210498213768
Epoch:
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Epoch:
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Epoch:
             (validating). Loss:
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Epoch done:
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                                    0.04504970479756594
Epoch: 732
             (validating). Loss:
                                 0.048820510506629944
Epoch done:
            733 (training). Loss:
                                    0.04208043999969959
Epoch:
       733
             (validating). Loss:
                                 0.048518260940909386
Epoch done:
            734
                 (training). Loss:
                                    0.0390016432851553
Epoch: 734
             (validating). Loss: 0.04428451377898455
```

```
735 (training). Loss:
Epoch done:
                                     0.042419769987463954
Epoch: 735
             (validating). Loss:
                                 0.04093381687998772
Epoch done:
                  (training). Loss:
             736
                                     0.04282072484493256
             (validating). Loss:
Epoch:
       736
                                 0.043121955916285516
                  (training). Loss:
Epoch done:
                                     0.043836293555796144
             (validating). Loss:
Epoch:
       737
                                 0.04352980330586433
Epoch done:
                  (training). Loss:
                                     0.03610137104988098
Epoch:
       738
             (validating). Loss:
                                 0.04040902592241764
                  (training). Loss:
Epoch done:
                                     0.04626836683601141
Epoch:
       739
             (validating). Loss:
                                 0.043599429354071614
                  (training). Loss:
             740
Epoch done:
                                     0.0384826559573412
             (validating). Loss:
Epoch: 740
                                 0.04385495483875275
Epoch done:
                  (training). Loss:
                                     0.04094429835677147
Epoch:
       741
             (validating). Loss:
                                 0.04211135860532522
Epoch done:
                  (training). Loss:
                                     0.0398877577856183
Epoch:
             (validating). Loss:
       742
                                 0.046194515004754064
Epoch done:
             743
                 (training). Loss:
                                     0.037346276082098485
             (validating). Loss:
Epoch:
       743
                                 0.03899775631725788
Epoch done:
                  (training). Loss:
                                     0.04258494060486555
Epoch:
       744
             (validating). Loss:
                                 0.037780051864683625
Epoch done:
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             (validating). Loss:
Epoch: 745
                                 0.05275842044502497
Epoch done:
                  (training). Loss:
                                     0.04111387189477682
             (validating). Loss:
Epoch:
       746
                                 0.042182544246315956
                  (training). Loss:
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Epoch done:
             747
             (validating). Loss:
Epoch: 747
                                 0.03996135517954826
                  (training). Loss:
Epoch done:
             748
                                     0.040015580132603645
Epoch:
       748
             (validating). Loss:
                                 0.03972449135035276
                  (training). Loss:
Epoch done:
             749
                                     0.04451105147600174
Epoch:
       749
             (validating). Loss:
                                 0.04328320473432541
Epoch done:
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                                     0.03911417573690414
Epoch:
       750
             (validating). Loss:
                                 0.043261011317372325
Epoch done:
             751
                  (training). Loss:
                                     0.03904522843658924
             (validating). Loss:
                                 0.03852231949567795
Epoch:
       751
                  (training). Loss:
Epoch done:
                                     0.043807871080935
             (validating). Loss:
Epoch:
       752
                                 0.03923511356115341
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Epoch done:
                                     0.03978081662207842
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             (validating). Loss:
                                 0.041040295735001564
Epoch:
                  (training). Loss:
Epoch done:
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                                     0.04058117847889662
Epoch: 754
             (validating). Loss:
                                 0.04160926565527916
                  (training). Loss:
Epoch done:
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                                     0.0401065044105053
             (validating). Loss:
Epoch:
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                                 0.04413190670311451
Epoch done:
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                  (training). Loss:
                                     0.044055923074483874
Epoch:
       756
             (validating). Loss:
                                 0.045973698049783705
Epoch done:
             757 (training). Loss:
                                     0.04149668775498867
Epoch:
       757
             (validating). Loss:
                                 0.04232522249221802
Epoch done:
             758
                 (training). Loss:
                                     0.0366706196218729
Epoch: 758
             (validating). Loss: 0.04011002965271473
```

```
(training). Loss:
Epoch done:
             759
                                     0.04212483633309603
Epoch: 759
             (validating). Loss:
                                  0.05390661768615246
Epoch done:
                  (training). Loss:
             760
                                     0.04214217457920313
Epoch:
             (validating). Loss:
       760
                                  0.037039979733526705
                  (training). Loss:
Epoch done:
                                     0.04368569739162922
             (validating). Loss:
Epoch:
       761
                                  0.03687232211232185
Epoch done:
                  (training). Loss:
                                     0.04366435594856739
Epoch:
       762
             (validating). Loss:
                                  0.03658314365893602
                  (training). Loss:
Epoch done:
                                     0.03648143634200096
Epoch:
       763
             (validating). Loss:
                                  0.04269417151808739
                  (training). Loss:
             764
Epoch done:
                                     0.038374833203852175
             (validating). Loss:
Epoch: 764
                                  0.046930718794465066
Epoch done:
                  (training). Loss:
                                     0.048670271039009096
Epoch:
       765
             (validating). Loss:
                                  0.052439231798052786
Epoch done:
                  (training). Loss:
                                     0.04612493403255939
             (validating). Loss:
Epoch:
       766
                                  0.04737115167081356
Epoch done:
                  (training). Loss:
                                     0.04064956288784742
             767
             (validating). Loss:
Epoch:
       767
                                  0.04085322376340628
Epoch done:
                  (training). Loss:
                                     0.04079250507056713
Epoch:
       768
             (validating). Loss:
                                  0.04768902901560068
Epoch done:
                  (training). Loss:
                                     0.043876026570796964
             (validating). Loss:
Epoch:
       769
                                  0.04345686919987202
Epoch done:
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                                     0.04740328025072813
             (validating). Loss:
Epoch:
       770
                                  0.04453968089073897
                  (training). Loss:
                                     0.04520973265171051
Epoch done:
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             (validating). Loss:
Epoch: 771
                                  0.040607995353639126
                  (training). Loss:
Epoch done:
             772
                                     0.04515288695693016
Epoch:
       772
             (validating). Loss:
                                  0.04713856093585491
                  (training). Loss:
Epoch done:
                                     0.0391823336482048
Epoch:
       773
             (validating). Loss:
                                  0.04781741090118885
Epoch done:
             774 (training). Loss:
                                     0.05048079378902912
Epoch:
       774
             (validating). Loss:
                                  0.039404246211051944
Epoch done:
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                  (training). Loss:
                                     0.03793137297034264
Epoch:
             (validating). Loss:
       775
                                  0.0407316355034709
                  (training). Loss:
Epoch done:
                                     0.0364161778241396
             (validating). Loss:
Epoch: 776
                                  0.04185155481100082
                  (training). Loss:
Epoch done:
                                     0.0449125949293375
Epoch:
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             (validating). Loss:
                                  0.0427028626203537
                  (training). Loss:
Epoch done:
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                                     0.03571874294430018
             (validating). Loss:
Epoch: 778
                                  0.03913061898201704
                  (training). Loss:
Epoch done:
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                                     0.044497567042708394
             (validating). Loss:
Epoch:
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                                  0.041985602118074894
Epoch done:
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                                     0.03692095037549734
Epoch:
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             (validating). Loss:
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Epoch done:
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                                     0.04016649834811688
Epoch:
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             (validating). Loss:
                                  0.03600858505815267
Epoch done:
             782
                  (training). Loss:
                                     0.04679429940879345
             (validating). Loss: 0.042529087513685226
Epoch: 782
```

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783 (training). Loss:
Epoch done:
                                     0.04310250524431467
Epoch: 783
             (validating). Loss:
                                  0.04046778082847595
Epoch done:
                  (training). Loss:
             784
                                     0.03923497181385756
Epoch:
             (validating). Loss:
       784
                                  0.044770583137869836
                  (training). Loss:
Epoch done:
                                     0.04060884229838848
             (validating). Loss:
Epoch:
       785
                                  0.03947160914540291
Epoch done:
                  (training). Loss:
                                     0.046615789830684665
Epoch:
       786
             (validating). Loss:
                                  0.03521738089621067
                  (training). Loss:
Epoch done:
                                     0.04242662191390991
Epoch:
       787
             (validating). Loss:
                                  0.045374198257923125
                  (training). Loss:
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                                     0.04225349817425013
Epoch done:
             (validating). Loss:
Epoch: 788
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Epoch done:
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Epoch:
       789
             (validating). Loss:
                                  0.04742332547903061
Epoch done:
             790
                  (training). Loss:
                                     0.04629976507276297
             (validating). Loss:
Epoch:
       790
                                  0.049129364639520647
Epoch done:
             791
                  (training). Loss:
                                     0.04027291368693113
             (validating). Loss:
Epoch:
       791
                                  0.038635138981044294
                  (training). Loss:
Epoch done:
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                                     0.03463329989463091
Epoch:
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             (validating). Loss:
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Epoch done:
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             (validating). Loss:
Epoch: 793
                                  0.041762398183345796
Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss:
Epoch:
       795
                                  0.041972368396818636
                  (training). Loss:
Epoch done:
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                                     0.04402669332921505
Epoch:
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             (validating). Loss:
                                  0.048897206969559195
                  (training). Loss:
Epoch done:
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                                     0.03919216357171536
Epoch:
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             (validating). Loss:
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                 (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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                                     0.04943411983549595
Epoch: 802
             (validating). Loss:
                                  0.0399156553670764
             803 (training). Loss:
Epoch done:
                                     0.04614904522895813
             (validating). Loss:
Epoch:
        803
                                  0.03768481109291315
Epoch done:
                  (training). Loss:
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                                     0.04511321634054184
Epoch:
       804
             (validating). Loss:
                                  0.045367581397295
Epoch done:
             805 (training). Loss:
                                     0.04299403354525566
Epoch:
       805
             (validating). Loss:
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Epoch done:
                  (training). Loss:
                                     0.04858234189450741
Epoch: 806
             (validating). Loss: 0.04036750476807356
```

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807 (training). Loss:
Epoch done:
                                     0.04786631390452385
Epoch: 807
             (validating). Loss:
                                 0.04617844596505165
Epoch done:
             808 (training). Loss:
                                     0.04095715861767531
Epoch:
       808
             (validating). Loss:
                                 0.04062439296394586
                  (training). Loss:
Epoch done:
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Epoch:
             (validating). Loss:
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                                 0.03819336872547865
Epoch done:
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Epoch:
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             (validating). Loss:
                                 0.04550146646797657
                  (training). Loss:
Epoch done:
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                                     0.04362509362399578
Epoch:
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             (validating). Loss:
                                 0.042501501739025116
                  (training). Loss:
Epoch done:
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                                     0.03953506536781788
             (validating). Loss:
Epoch: 812
                                 0.03925430178642273
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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                                     0.042869564704597
             (validating). Loss:
Epoch:
       814
                                 0.04234640058130026
Epoch done:
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                  (training). Loss:
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             (validating). Loss:
Epoch:
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                                 0.03811468426138163
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Epoch done:
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Epoch:
             (validating). Loss: 0.041211112216114995
       816
Epoch done:
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             (validating). Loss:
Epoch:
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                                 0.040092536993324754
Epoch done:
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             (validating). Loss:
Epoch:
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                                 0.03767801877111197
                  (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch:
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                                 0.050170211121439934
                  (training). Loss:
Epoch done:
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                                     0.039968952909111975
Epoch:
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             (validating). Loss:
                                 0.032579866237938404
                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
                                 0.04723573364317417
             822 (training). Loss:
Epoch done:
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Epoch:
       822
             (validating). Loss:
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Epoch done:
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                  (training). Loss:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
                                     0.04306263793259859
             (validating). Loss:
Epoch:
       824
                                 0.037597795203328135
             825 (training). Loss:
Epoch done:
                                     0.03809788562357426
Epoch:
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             (validating). Loss:
                                 0.039959728717803955
                  (training). Loss:
Epoch done:
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                                     0.03889740966260433
Epoch: 826
             (validating). Loss:
                                 0.03666341733187437
                  (training). Loss:
Epoch done:
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                                     0.03414663057774305
Epoch:
             (validating). Loss:
       827
                                 0.03527953252196312
Epoch done:
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                  (training). Loss:
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Epoch: 828
             (validating). Loss:
                                 0.031545836664736274
Epoch done:
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Epoch:
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             (validating). Loss:
                                  0.03888485562056303
Epoch done:
             830
                  (training). Loss:
                                     0.03540398497134447
Epoch: 830
             (validating). Loss: 0.04800993259996176
```

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831 (training). Loss:
Epoch done:
                                     0.04577282294631004
Epoch: 831
             (validating). Loss:
                                 0.0428875669836998
Epoch done:
             832 (training). Loss:
                                     0.044792826287448406
Epoch:
             (validating). Loss:
       832
                                 0.04786175526678562
                  (training). Loss:
Epoch done:
                                     0.03463353365659714
             (validating). Loss:
Epoch:
       833
                                 0.039718134142458436
Epoch done:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
                                 0.03713706433773041
                  (training). Loss:
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                                     0.04247940629720688
Epoch done:
             (validating). Loss:
Epoch:
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                                 0.036201507598161695
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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                                 0.03545148763805628
Epoch done:
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                  (training). Loss:
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Epoch:
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Epoch done:
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Epoch:
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Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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             (validating). Loss:
Epoch:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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                                     0.04401730578392744
Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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                  (training). Loss:
Epoch done:
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Epoch:
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                 (training). Loss:
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Epoch:
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                  (training). Loss:
Epoch done:
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             (validating). Loss:
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Epoch:
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                                 0.04041694831103086
Epoch done:
                  (training). Loss:
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Epoch: 852
             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
                                 0.04784374460577965
Epoch done:
             854
                  (training). Loss:
                                     0.04998858999460935
Epoch: 854
             (validating). Loss: 0.04132656585425139
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(training). Loss:
Epoch done:
             855
                                     0.04756216797977686
Epoch: 855
             (validating). Loss:
                                  0.03957319054752588
Epoch done:
                  (training). Loss:
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                                     0.03991164118051529
Epoch:
             (validating). Loss:
       856
                                  0.03859440237283707
                  (training). Loss:
Epoch done:
                                     0.03618871010839939
             (validating). Loss:
Epoch:
       857
                                  0.04598323907703161
Epoch done:
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Epoch:
       858
             (validating). Loss:
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                  (training). Loss:
Epoch done:
                                     0.034801530092954634
Epoch:
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             (validating). Loss:
                                  0.04248714037239552
                  (training). Loss:
Epoch done:
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                                     0.04016150441020727
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Epoch:
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                                  0.043838339298963545
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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                                  0.046404583379626274
Epoch done:
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Epoch:
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                                  0.04505131915211678
Epoch done:
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Epoch:
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Epoch done:
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Epoch:
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                                  0.04034453779459
Epoch done:
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                                  0.04932052046060562
                  (training). Loss:
Epoch done:
             867
                                     0.03924743440002203
             (validating). Loss:
Epoch:
                                  0.043355754017829894
       867
                  (training). Loss:
Epoch done:
             868
                                     0.04428573064506054
Epoch:
        868
             (validating). Loss:
                                  0.042050466500222684
                  (training). Loss:
Epoch done:
                                     0.04084522686898708
Epoch:
       869
             (validating). Loss:
                                  0.04433340337127447
             870 (training). Loss:
Epoch done:
                                     0.04807283114641905
Epoch:
       870
             (validating). Loss:
                                  0.03348768539726734
Epoch done:
             871
                  (training). Loss:
                                     0.03825695849955082
Epoch:
             (validating). Loss:
       871
                                  0.040149583294987676
                  (training). Loss:
Epoch done:
                                     0.03977759685367346
             (validating). Loss:
Epoch:
       872
                                  0.037322250194847584
                  (training). Loss:
Epoch done:
                                     0.038537624105811116
Epoch:
       873
             (validating). Loss:
                                  0.0320193724706769
                  (training). Loss:
Epoch done:
             874
                                     0.03660276457667351
Epoch: 874
             (validating). Loss:
                                  0.04100275598466396
                  (training). Loss:
Epoch done:
             875
                                     0.04222937989979982
Epoch:
             (validating). Loss:
       875
                                  0.04630377423018217
Epoch done:
                  (training). Loss:
             876
                                     0.044509246945381165
Epoch: 876
             (validating). Loss:
                                  0.03975294940173626
Epoch done:
             877 (training). Loss:
                                     0.038703763857483864
Epoch:
       877
             (validating). Loss:
                                  0.034900817647576333
Epoch done:
             878
                 (training). Loss:
                                     0.03907178491353989
             (validating). Loss: 0.04423551000654698
Epoch: 878
```

```
879 (training). Loss:
Epoch done:
                                     0.04321986306458712
Epoch:
       879
             (validating). Loss:
                                  0.04340568594634533
Epoch done:
                  (training). Loss:
             880
                                     0.035828996635973456
             (validating). Loss:
Epoch:
        880
                                  0.03843408208340406
                  (training). Loss:
Epoch done:
                                     0.03640668392181397
             (validating). Loss:
Epoch:
       881
                                  0.03832058012485504
Epoch done:
                  (training). Loss:
                                     0.03603778462857008
Epoch:
       882
             (validating). Loss:
                                  0.03907962441444397
                  (training). Loss:
Epoch done:
                                     0.04365088231861591
Epoch:
       883
             (validating). Loss:
                                  0.04012640528380871
                  (training). Loss:
Epoch done:
             884
                                     0.04008405487984419
             (validating). Loss:
Epoch:
       884
                                  0.04382596854120493
Epoch done:
                  (training). Loss:
                                     0.040573956444859505
Epoch:
       885
             (validating). Loss:
                                  0.03956300113350153
Epoch done:
                  (training). Loss:
                                     0.04309176132082939
Epoch:
       886
             (validating). Loss:
                                  0.03310235310345888
Epoch done:
             887
                  (training). Loss:
                                     0.038136206567287445
             (validating). Loss:
Epoch:
       887
                                  0.037694446928799155
Epoch done:
                  (training). Loss:
                                     0.047014006040990354
Epoch:
       888
             (validating). Loss:
                                  0.05345070473849774
Epoch done:
                  (training). Loss:
                                     0.035589862056076525
             (validating). Loss:
Epoch:
       889
                                  0.038160391710698606
Epoch done:
                  (training). Loss:
                                     0.041645032539963725
             (validating). Loss:
Epoch:
       890
                                  0.046758923679590225
                  (training). Loss:
Epoch done:
             891
                                     0.04158633351325989
             (validating). Loss:
Epoch:
       891
                                  0.0363596111536026
                  (training). Loss:
Epoch done:
                                     0.03772657811641693
Epoch:
       892
             (validating). Loss:
                                  0.04265726339071989
                  (training). Loss:
Epoch done:
                                     0.04095967523753643
Epoch:
       893
             (validating). Loss:
                                  0.039187576808035376
             894 (training). Loss:
Epoch done:
                                     0.04119983911514282
Epoch:
       894
             (validating). Loss:
                                  0.036173362843692304
Epoch done:
             895
                  (training). Loss:
                                     0.03783112838864326
Epoch:
             (validating). Loss:
       895
                                  0.0384342210367322
                  (training). Loss:
Epoch done:
                                     0.04299234729260206
Epoch:
       896
             (validating). Loss:
                                  0.034122674353420736
             897 (training). Loss:
Epoch done:
                                     0.0401156160980463
Epoch:
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             (validating). Loss:
                                  0.042559108883142474
                  (training). Loss:
Epoch done:
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                                     0.04763422608375549
Epoch:
       898
             (validating). Loss:
                                  0.03430060278624296
                  (training). Loss:
Epoch done:
             899
                                     0.03693484179675579
             (validating). Loss:
Epoch:
        899
                                  0.040885197930037975
                  (training). Loss:
Epoch done:
             900
                                     0.03689271155744791
Epoch:
       900
             (validating). Loss:
                                  0.035065932944417
Epoch done:
             901 (training). Loss:
                                     0.03725032098591328
Epoch:
       901
             (validating). Loss:
                                  0.04024497494101524
Epoch done:
             902 (training). Loss:
                                     0.04513903800398111
Epoch: 902
             (validating). Loss: 0.03755766730755568
```

```
903 (training). Loss:
Epoch done:
                                     0.03418249674141407
Epoch:
       903
             (validating). Loss:
                                 0.042691987752914426
Epoch done:
            904 (training). Loss:
                                     0.031588573940098286
Epoch:
       904
             (validating). Loss:
                                 0.037231346033513545
                  (training). Loss:
Epoch done:
                                     0.036779405921697615
Epoch:
             (validating). Loss:
        905
                                 0.03197924438863993
Epoch done:
                  (training). Loss:
                                     0.050529603473842145
Epoch:
        906
             (validating). Loss:
                                 0.03487270288169384
                  (training). Loss:
Epoch done:
            907
                                     0.04455390051007271
Epoch:
       907
             (validating). Loss:
                                 0.036278627999126914
                  (training). Loss:
            908
Epoch done:
                                     0.032746114768087864
             (validating). Loss: 0.04092205185443163
Epoch:
       908
Epoch done:
                  (training). Loss:
                                     0.04246051535010338
Epoch:
        909
             (validating). Loss:
                                 0.0411004027351737
Epoch done:
                  (training). Loss:
                                     0.04009906202554703
             (validating). Loss:
Epoch:
       910
                                 0.043166828155517575
Epoch done:
            911
                  (training). Loss:
                                     0.039387446269392966
             (validating). Loss:
Epoch:
       911
                                 0.0362514091655612
Epoch done:
                 (training). Loss:
            912
                                     0.03714170139282942
Epoch:
       912
             (validating). Loss: 0.0378903204575181
Epoch done:
                  (training). Loss:
                                     0.041651290655136106
             (validating). Loss:
Epoch:
       913
                                 0.037209021113812926
Epoch done:
                 (training). Loss:
                                     0.04022029787302017
            (validating). Loss:
Epoch:
       914
                                 0.040566007420420644
                  (training). Loss:
                                     0.0402314955368638
Epoch done:
            915
             (validating). Loss:
Epoch:
       915
                                 0.04049206152558327
                  (training). Loss:
Epoch done:
            916
                                     0.03340050876140595
Epoch:
        916
             (validating). Loss: 0.03567270338535309
                  (training). Loss:
Epoch done:
             917
                                     0.03918043337762356
Epoch:
       917
             (validating). Loss:
                                 0.040467200055718425
Epoch done:
                 (training). Loss:
            918
                                     0.038086308538913725
Epoch:
       918
             (validating). Loss:
                                 0.03258107043802738
Epoch done:
            919
                  (training). Loss:
                                     0.04024281110614538
Epoch:
             (validating). Loss:
                                 0.04104805346578359
       919
                  (training). Loss:
Epoch done:
                                     0.03199329134076834
             (validating). Loss:
Epoch:
       920
                                 0.03787071444094181
                 (training). Loss:
Epoch done:
                                     0.04295789822936058
Epoch:
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             (validating). Loss:
                                 0.039705438539385796
                  (training). Loss:
Epoch done:
            922
                                     0.04017112161964178
             (validating). Loss:
Epoch: 922
                                 0.04102492742240429
                 (training). Loss:
Epoch done:
            923
                                     0.040345894172787666
Epoch:
             (validating). Loss:
        923
                                 0.04324781037867069
Epoch done:
                  (training). Loss:
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                                     0.03597111124545336
Epoch:
       924
             (validating). Loss:
                                 0.040137449465692046
Epoch done:
             925 (training). Loss:
                                     0.04033977296203375
Epoch:
       925
             (validating). Loss:
                                 0.03840231951326132
Epoch done:
            926
                 (training). Loss:
                                     0.036741153337061405
Epoch:
             (validating). Loss: 0.04609798528254032
       926
```

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927 (training). Loss:
Epoch done:
                                    0.03919895924627781
Epoch: 927
             (validating). Loss: 0.03861621357500553
Epoch done:
            928 (training). Loss:
                                    0.038266228139400484
Epoch:
       928
             (validating). Loss:
                                 0.03876236155629158
                  (training). Loss:
Epoch done:
                                    0.040234454348683356
Epoch:
             (validating). Loss:
       929
                                 0.03723413962870836
Epoch done:
                  (training). Loss:
                                    0.036374759115278724
Epoch:
       930
             (validating). Loss:
                                 0.037842216156423095
                 (training). Loss:
Epoch done:
                                    0.03534077163785696
Epoch:
       931
             (validating). Loss:
                                 0.040004602447152135
                  (training). Loss:
            932
Epoch done:
                                    0.04512766152620316
             (validating). Loss: 0.03828275185078382
Epoch:
       932
                  (training). Loss:
Epoch done:
                                    0.036453465931117535
Epoch:
       933
             (validating). Loss:
                                 0.037977070361375806
Epoch done:
                 (training). Loss:
                                    0.03857428934425115
             (validating). Loss:
Epoch:
       934
                                 0.038004344701766966
Epoch done:
            935
                  (training). Loss:
                                    0.0436341205611825
             (validating). Loss:
Epoch:
       935
                                 0.03811221085488796
Epoch done:
                 (training). Loss:
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                                    0.04099426008760929
Epoch:
       936
             (validating). Loss: 0.04273452572524548
                  (training). Loss:
Epoch done:
                                    0.04319689981639385
             (validating). Loss:
Epoch:
       937
                                 0.03822608012706041
Epoch done:
                 (training). Loss:
                                    0.04094535708427429
             (validating). Loss:
Epoch:
       938
                                 0.036120891384780404
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Epoch done:
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             (validating). Loss: 0.036927513778209686
Epoch:
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                 (training). Loss:
Epoch done:
            940
                                    0.04171420820057392
Epoch:
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             (validating). Loss: 0.038786289468407634
                  (training). Loss:
Epoch done:
                                    0.0435125470161438
Epoch:
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             (validating). Loss:
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Epoch done:
            942 (training). Loss:
                                    0.03547361791133881
Epoch:
       942
             (validating). Loss:
                                 0.03754064906388521
Epoch done:
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                 (training). Loss:
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Epoch:
             (validating). Loss: 0.03705977816134691
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                 (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch:
       944
                                 0.03919760473072529
                 (training). Loss:
Epoch done:
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Epoch:
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             (validating). Loss:
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                  (training). Loss:
Epoch done:
            946
                                    0.03881494197994471
             (validating). Loss:
Epoch:
       946
                                 0.03928795587271452
                  (training). Loss:
Epoch done:
            947
                                    0.040112325362861155
Epoch:
             (validating). Loss:
       947
                                 0.03787056021392345
Epoch done:
             948 (training). Loss:
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Epoch:
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             (validating). Loss:
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Epoch done:
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Epoch:
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             (validating). Loss:
                                 0.04195213075727224
Epoch done:
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Epoch:
             (validating). Loss: 0.03086130879819393
       950
```

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951 (training). Loss:
Epoch done:
                                     0.042860382422804835
Epoch: 951
             (validating). Loss:
                                  0.036848430335521695
Epoch done:
             952 (training). Loss:
                                     0.040911987982690336
Epoch:
       952
             (validating). Loss:
                                  0.03650538716465235
                  (training). Loss:
Epoch done:
                                     0.03744413685053587
Epoch:
             (validating). Loss:
       953
                                  0.03860515803098678
Epoch done:
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Epoch:
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             (validating). Loss:
                                  0.028526560962200166
                  (training). Loss:
Epoch done:
                                     0.03511122446507216
Epoch:
       955
             (validating). Loss:
                                  0.03915830105543137
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Epoch done:
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                                     0.037190698087215424
             (validating). Loss: 0.039631730131804946
Epoch:
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Epoch done:
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                                     0.03733236733824015
Epoch:
        957
             (validating). Loss:
                                  0.0350292107090354
Epoch done:
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Epoch:
             (validating). Loss:
       958
                                  0.039685442484915255
Epoch done:
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                  (training). Loss:
                                     0.043198867328464986
             (validating). Loss:
Epoch:
       959
                                  0.047197620198130605
Epoch done:
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Epoch:
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             (validating). Loss:
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Epoch done:
                                     0.036739764735102654
             (validating). Loss:
Epoch:
        961
                                  0.03696507345885038
Epoch done:
             962 (training). Loss:
                                     0.03295390252023935
             (validating). Loss:
Epoch:
        962
                                  0.036110786534845826
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Epoch done:
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             (validating). Loss:
Epoch:
        963
                                  0.03530328553169966
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Epoch done:
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                                     0.038139675930142405
Epoch:
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Epoch:
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Epoch done:
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                                     0.03402004074305296
Epoch:
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             (validating). Loss:
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Epoch done:
             967
                  (training). Loss:
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Epoch:
             (validating). Loss:
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                                 0.03816608507186174
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Epoch done:
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Epoch:
        968
                                  0.03789665438234806
                  (training). Loss:
Epoch done:
                                     0.03843029960989952
Epoch:
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                  (training). Loss:
Epoch done:
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             (validating). Loss:
Epoch:
       970
                                  0.04597471449524164
                  (training). Loss:
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             971
                                     0.041936236806213854
Epoch:
             (validating). Loss:
       971
                                  0.04387546889483929
Epoch done:
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                                     0.04393659122288227
Epoch:
       972
             (validating). Loss:
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Epoch done:
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                                     0.04232881776988506
Epoch:
       973
             (validating). Loss:
                                  0.04025281071662903
Epoch done:
             974
                 (training). Loss:
                                     0.03194443304091692
Epoch: 974
             (validating). Loss: 0.041637306474149226
```

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975 (training). Loss:
Epoch done:
                                     0.04062792900949717
Epoch: 975
             (validating). Loss:
                                 0.037215388007462026
Epoch done:
             976 (training). Loss:
                                     0.038299037516117095
Epoch:
             (validating). Loss:
        976
                                 0.040471011959016326
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Epoch done:
                                     0.03744971472769976
Epoch:
             (validating). Loss:
       977
                                 0.032560087740421295
Epoch done:
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Epoch:
       978
             (validating). Loss:
                                 0.03753322958946228
                  (training). Loss:
Epoch done:
                                     0.03525787219405174
Epoch:
       979
             (validating). Loss:
                                 0.03647070378065109
                  (training). Loss:
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                                     0.03501058518886566
             (validating). Loss: 0.04411294423043728
Epoch:
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Epoch done:
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Epoch:
        981
             (validating). Loss:
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Epoch done:
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             (validating). Loss:
Epoch:
       982
                                 0.04018029067665339
Epoch done:
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             (validating). Loss:
Epoch:
       983
                                 0.0399421151727438
Epoch done:
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Epoch:
       984
             (validating). Loss:
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Epoch done:
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                                     0.030938507989048958
             (validating). Loss:
Epoch:
        985
                                 0.03506754972040653
Epoch done:
             986 (training). Loss:
                                     0.02996939541772008
             (validating). Loss:
Epoch:
        986
                                 0.03991986382752657
                  (training). Loss:
Epoch done:
             987
                                     0.041107113286852834
             (validating). Loss:
Epoch:
                                 0.03719141837209463
        987
                  (training). Loss:
Epoch done:
             988
                                     0.0338398726657033
Epoch:
        988
             (validating). Loss:
                                 0.03815895356237888
                  (training). Loss:
Epoch done:
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Epoch:
       989
             (validating). Loss:
                                 0.03857847526669502
Epoch done:
             990 (training). Loss:
                                     0.03285514563322067
Epoch:
       990
             (validating). Loss:
                                 0.03846258632838726
Epoch done:
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                  (training). Loss:
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Epoch:
       991
             (validating). Loss:
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                  (training). Loss:
Epoch done:
                                     0.032396286725997925
             (validating). Loss:
Epoch:
       992
                                 0.0379116190597415
                 (training). Loss:
Epoch done:
                                     0.039104977250099184
Epoch:
        993
             (validating). Loss:
                                 0.039677122980356215
                  (training). Loss:
Epoch done:
             994
                                     0.03610248323529959
             (validating). Loss:
Epoch:
       994
                                 0.038551211915910245
             995 (training). Loss:
Epoch done:
                                     0.03743304703384638
Epoch:
             (validating). Loss:
        995
                                 0.03636530600488186
Epoch done:
                  (training). Loss:
             996
                                     0.037875952944159505
Epoch:
       996
             (validating). Loss:
                                 0.04404582493007183
Epoch done:
             997 (training). Loss:
                                     0.03915467094630003
Epoch:
       997
             (validating). Loss:
                                 0.033660198003053664
Epoch done:
                 (training). Loss:
                                     0.047058578208088876
Epoch:
       998
             (validating). Loss: 0.03879191130399704
```

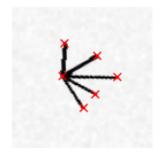
```
Epoch done: 999 (training). Loss: 0.0397196426987648

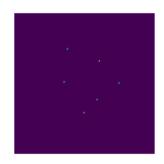
Epoch: 999 (validating). Loss: 0.039254814572632316

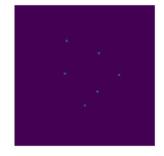
Epoch done: 1000 (training). Loss: 0.04199779275804758

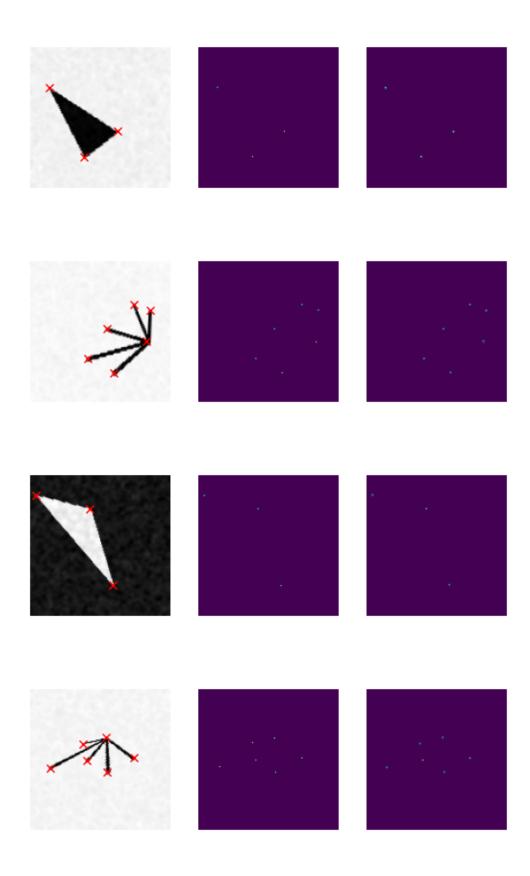
Epoch: 1000 (validating). Loss: 0.03584388941526413
```

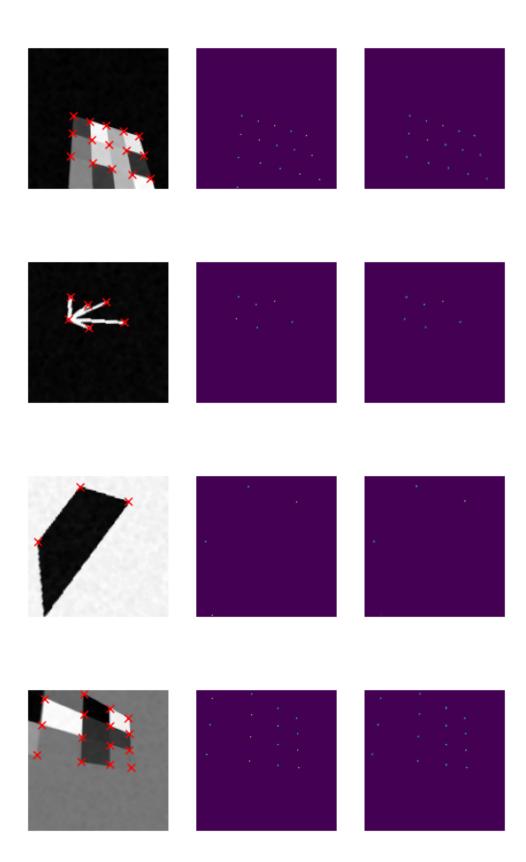
```
[57]: device = torch.device("cuda" if torch.cuda.is_available() else "cpu")
     model = torch.load("save_detection.pt", device)
      for i in range(10):
          image, point_image = generate_batch(1, 128, 128, device)
          # pretvori cilj
          target = reshape_to_original_size(point_image[0])
          # py_tar, px_tar = np.where(target>0)
          pred = model(image)
          soft = nn.Softmax(0)
          pred = soft(pred[0])
          pred = reshape_to_original_size(pred)
          pred = pred.detach().numpy()
          # najdi lokalne maksimume predikcije, vecje od minimalne vrednosti
          local_max = (pred==ndimage.grey_dilation(pred, size=3))*pred>0.2
          py_est, px_est = np.where(local_max)
          fig, ax = plt.subplots(1, 3)
          ax[0].imshow(image[0][0], cmap='gray')
          ax[0].plot(px_est, py_est, 'rx', label='napovedi')
          ax[0].set_axis_off()
          ax[1].imshow(target)
          ax[1].set_axis_off()
          ax[2].imshow(pred)
          ax[2].set_axis_off()
```











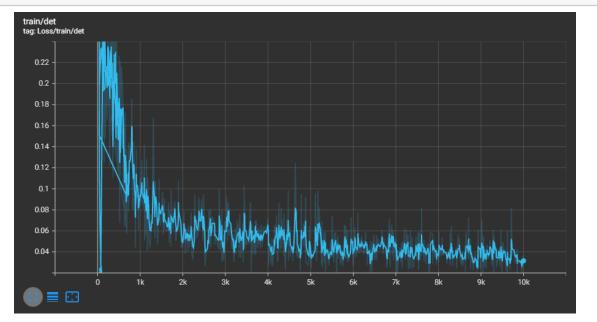






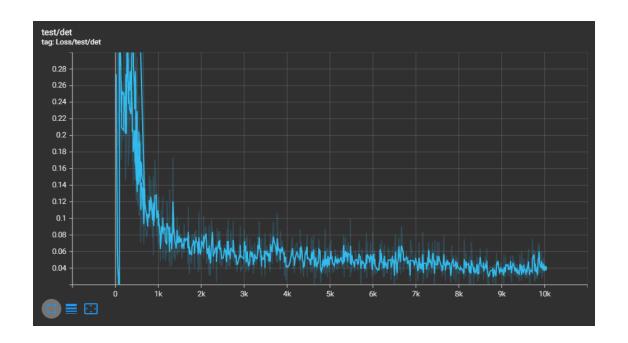
[64]: Image(filename='train_det.png')

[64]:



[66]: Image(filename='test_det.png')

[66]:



```
[63]: def apply_h_image(img):
          height half = len(img) // 2
          width_half = len(img[0]) // 2
          point_distance = 10
          x = random.randint(point_distance, width_half - point_distance)
          y = random.randint(point_distance, height_half - point_distance)
          rect = np.array([[x, y], [x + width_half, y], [x + width_half, y +__
       ⇔height_half], [x, y + height_half]])
          #4 kotičke okna pomaknemo za naključne pomike v intervalu [-16, 16]
          rect_prim = np.array([[rect[0][0] + random.randint(-16, 16), rect[0][1] +
       ⇔random.randint(-16, 16)],
                        [rect[1][0] + random.randint(-16, 16), rect[1][1] + random.
       \negrandint(-16, 16)],
                        [rect[2][0] + random.randint(-16, 16), rect[2][1] + random.
       \rightarrowrandint(-16, 16)],
                        [rect[3][0] + random.randint(-16, 16), rect[3][1] + random.
       →randint(-16, 16)]], np.int32)
          #iz 4 kotičkov in njihovih pomikov izračunamo homografijo H
          H, _ = cv2.findHomography(rect, rect_prim)
```

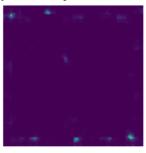
```
H = np.linalg.inv(H)
    #inverz ocenjene homografije H^-1 apliciramo na sliko, dobimou
 \hookrightarrow transformirano sliko
    warped_image = cv2.warpPerspective(img, H, (img.shape[1], img.shape[0]),__
 ⇔borderMode=cv2.BORDER REPLICATE)
    return warped_image, H
def inverse_h(pred, H):
    #inverz ocenjene homografije H^-1 apliciramo na sliko, dobimo_{\sqcup}
 \hookrightarrow transformirano sliko
    return cv2.warpPerspective(img, np.linalg.inv(H), (img.shape[1], img.
 ⇒shape[0]), borderMode=cv2.BORDER_REPLICATE)
model = torch.load("save_detection.pt", device)
path = "train"
files = [f for f in listdir(path) if isfile(join(path, f))]
for n in range(10):
    img = cv2.imread(join(path, files[random.randint(0, len(files) - 1)]))
    img = cv2.resize(img, (128, 128))
    img = cv2.cvtColor(img, cv2.COLOR_BGR2GRAY)
    img_tensor = torch.tensor(img).to(device).unsqueeze(0).to(torch.float32)
    # prva detekcija, brez homografske adaptacije
    pred = model(torch.stack([img_tensor]))
    pred = soft(pred[0])
    pred = reshape_to_original_size(pred)
    pred = pred.detach().numpy()
    pred_cum = pred.copy()
    pred_no_ha = pred_cum.copy()
    for i in range (99):
        # ostale detekcije, vsaka z homografsko adaptacijo - naključno⊔
 ⇔homografsko transformacijo
        # transformacija slike, pridobitev transformacijske matrike
        img_ha, H = apply_h_image(img)
        img_ha = torch.tensor(img_ha).to(device).unsqueeze(0).to(torch.float32)
```

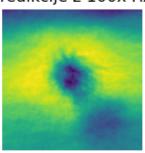
```
pred = model(torch.stack([img_ha]))
      pred = soft(pred[0])
      pred = reshape_to_original_size(pred)
      pred = pred.detach().numpy()
       # poravnava predikcije z originalno sliko
      pred_inv = inverse_h(pred, H)
       # akumulacija predikcij
      pred_cum += pred_inv
  # odstranimo morebitne nan vrednosti, normaliziramo
  pred = np.nan_to_num(pred_cum)
  pred /= pred.max()
  # najdi lokalne maksimume predikcije, vecje od rocno izbranega minimalnega
\hookrightarrow pragu
  local_max = (pred==ndimage.grey_dilation(pred, size=3))*pred>0.8
  py_est, px_est = np.where(local_max)
  fig, ax = plt.subplots(1, 3)
  ax[0].imshow(img, cmap='gray')
  ax[0].plot(px_est, py_est, 'rx', label='napovedi')
  ax[0].set_axis_off()
  ax[0].set_title('vhodna slika')
  ax[0].legend()
  ax[1].imshow(pred_no_ha)
  ax[1].set_title('predikcije brez HA')
  ax[1].set_axis_off()
  ax[2].imshow(pred)
  ax[2].set_title('predikcije z 100x HA')
  ax[2].set_axis_off()
```

vhodna slika

predikcije brez HA predikcije z 100x HA





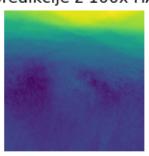


vhodna slika



predikcije brez HA predikcije z 100x HA



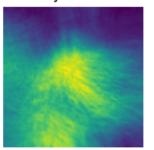


vhodna slika



predikcije brez HA predikcije z 100x HA



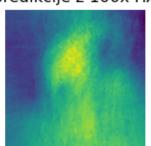


vhodna slika



predikcije brez HA predikcije z 100x HA



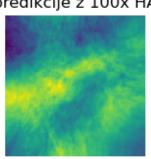


vhodna slika

predikcije brez HA predikcije z 100x HA



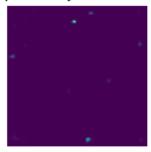


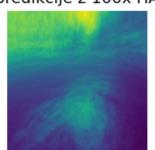


vhodna slika

napovedi

predikcije brez HA predikcije z 100x HA



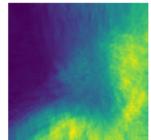


vhodna slika



predikcije brez HA predikcije z 100x HA

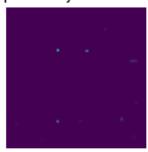


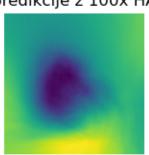


vhodna slika

× napovedi

predikcije brez HA predikcije z 100x HA



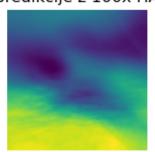


vhodna slika



predikcije brez HA predikcije z 100x HA





vhodna slika



predikcije brez HA predikcije z 100x HA



