P2 Q2 B

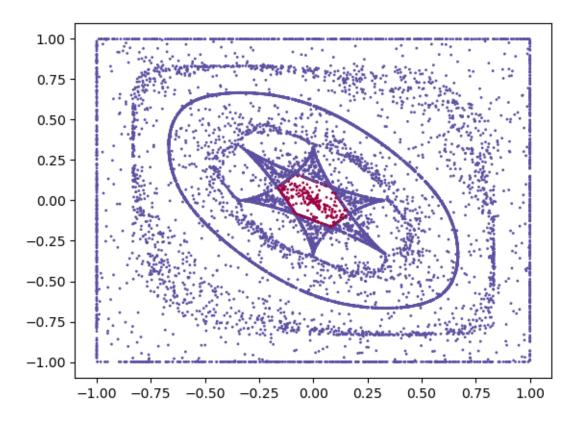
November 15, 2022

[7]: import torch

```
import torch.nn as nn
     import torch.nn.functional as F
     import pandas as pd
     import numpy as np
     import matplotlib.pyplot as plt
[8]: class Net(nn.Module):
         def __init__(self):
             super(Net, self).__init__()
             self.fc1 = nn.Linear(2, 32)
             self.fc2 = nn.Linear(32, 32)
             \#self.fc3 = nn.Linear(256, 256)
             \#self.fc4 = nn.Linear(128, 128)
             \#self.fc5 = nn.Linear(128, 128)
             \#self.fc6 = nn.Linear(128, 128)
             self.fc7 = nn.Linear(32, 2)
         def forward(self, x):
             x = F.relu(self.fc1(x))
             x = F.relu(self.fc2(x))
             \#x = F.relu(self.fc3(x))
             \#x = F.relu(self.fc4(x))
             \#x = F.relu(self.fc5(x))
             \#x = F.relu(self.fc6(x))
             x = self.fc7(x)
             return F.log_softmax(x)
             \#return F.softmax(x)
[9]: def plot_data(X, y, filename):
         plt.scatter(X[:, 0], X[:, 1], c=y, cmap=plt.cm.Spectral, s = 1)
         plt.savefig(filename)
         plt.close()
     def plot_decision_boundary(clf, X, y, filename):
         # Set min and max values and give it some padding
```

```
\#x_{min}, x_{max} = X[:, 0].min() - .1, X[:, 0].max() + .1
    \#y_{min}, y_{max} = X[:, 1].min() - .1, X[:, 1].max() + .1
    x_{min}, x_{max} = -1, 1
    y_min, y_max = -1, 1
    h = 0.01
    # Generate a grid of points with distance h between them
    xx, yy = np.meshgrid(np.arange(x_min, x_max, h), np.arange(y_min, y_max, h))
    # Predict the function value for the whole gid
    #Z = clf.predict(np.c_[xx.ravel(), yy.ravel()])
    X_out = net(torch.tensor(np.c_[xx.ravel(), yy.ravel()], dtype = torch.
 ⇔float))
    Z = X_{out.data.max(1)[1]}
    # Z.shape
    Z = Z.reshape(xx.shape)
    # Plot the contour and training examples
    plt.contourf(xx, yy, Z, cmap=plt.cm.Spectral)
    plt.scatter(X[:, 0], X[:, 1], c=y, cmap=plt.cm.Spectral, s = 1)
    plt.savefig(filename)
    plt.close()
data = pd.read_csv("FeedForward_Data_hexa.csv") # UPDATE THE FILE NAME AND PATH_
→ TO MATCH YOUR REQUIREMENT
X = data.values[:, 0:2] # Take only the first two features.
X = torch.tensor(X, dtype = torch.float)
y = data.values[:, 2]
y = torch.tensor(y, dtype = torch.long)
plt.scatter(X[:, 0], X[:, 1], c=y, cmap=plt.cm.Spectral, s = 1)
```

[9]: <matplotlib.collections.PathCollection at 0x17ae2b7cbe0>



```
[4]: #%% train
     net = Net()
     # create a stochastic gradient descent optimizer
     learning_rate = 0.01
     optimizer = torch.optim.Adam(net.parameters(), lr=learning_rate)
     #optimizer = torch.optim.SGD(net.parameters(), lr=learning_rate, momentum=0.9)
     # create a loss function
     criterion = nn.CrossEntropyLoss()
     #criterion = nn.NLLLoss()
     \#nepochs = 600
     nepochs = 10000
     #10000
     data, target = X, y
     for epoch in range(nepochs):
          adjust learning rate if desired
          if epoch % 3000 == 0 and epoch <= 24000:
     #
              for g in optimizer.param_groups:
                  g['lr'] = g['lr']/2
```

```
optimizer.zero_grad()
  # forward propagate
  net_out = net(data)
  # compute loss
  loss = criterion(net_out, target)
  # backpropagate
  loss.backward()
  # update parameters
  optimizer.step()
  # print out report
  if epoch \% 10 == 0:
      print('Epoch ', epoch, 'Loss ', loss.item())
      #if(loss.item()<0.0001):
        #break
      net_out = net(data)
      pred = net_out.data.max(1)[1] # get the index of the max_
\hookrightarrow log-probability
      correctidx = pred.eq(target.data)
      ncorrect = correctidx.sum()
      accuracy = ncorrect.item()/len(data)
      print('Training accuracy is ', accuracy)
      if (accuracy==1):
           break
```

C:\Users\aradh\AppData\Local\Temp\ipykernel_57672\3878313576.py:21: UserWarning: Implicit dimension choice for log_softmax has been deprecated. Change the call to include dim=X as an argument.

```
return F.log_softmax(x)
```

Epoch 0 Loss 0.8406838774681091 Training accuracy is 0.05942453609796409 Epoch 10 Loss 0.2082149237394333 Training accuracy is 0.940575463902036 Epoch 20 Loss 0.24280154705047607 Training accuracy is 0.940575463902036 Epoch 30 Loss 0.18550577759742737 Training accuracy is 0.940575463902036 Epoch 40 Loss 0.16519393026828766 Training accuracy is 0.940575463902036 Epoch 50 Loss 0.14880849421024323 Training accuracy is 0.940575463902036 Epoch 60 Loss 0.1339007467031479 Training accuracy is 0.940575463902036 Epoch 70 Loss 0.12227896600961685 Training accuracy is 0.940575463902036 Epoch 80 Loss 0.11154074966907501

Training accuracy is 0.940575463902036 Epoch 90 Loss 0.10206683725118637 Training accuracy is 0.940575463902036 Epoch 100 Loss 0.09338100254535675 Training accuracy is 0.940575463902036 Epoch 110 Loss 0.08600346744060516 Training accuracy is 0.940575463902036 Epoch 120 Loss 0.08014880120754242 Training accuracy is 0.9510930809105251 Epoch 130 Loss 0.07572832703590393 Training accuracy is 0.9557508827285703 Epoch 140 Loss 0.07236476987600327 Training accuracy is 0.9656674930508602 Epoch 150 Loss 0.06977000832557678 Training accuracy is 0.9676207647810082 Epoch 160 Loss 0.06769127398729324 Training accuracy is 0.9693486590038314 Epoch 170 Loss 0.06580854207277298 Training accuracy is 0.9707009240477801 Epoch 180 Loss 0.06467310339212418 Training accuracy is 0.9710765532266546 Epoch 190 Loss 0.06298872828483582 Training accuracy is 0.9723536924348284 Epoch 200 Loss 0.06251967698335648 Training accuracy is 0.9676207647810082 Epoch 210 Loss 0.06115339696407318 Training accuracy is 0.9734805799714522 Epoch 220 Loss 0.06046389415860176 Training accuracy is 0.9744572158365262 Epoch 230 Loss 0.05950034037232399 Training accuracy is 0.973630831643002 Epoch 240 Loss 0.05876874923706055 Training accuracy is 0.973705957478777 Epoch 250 Loss 0.058286335319280624 Training accuracy is 0.9743820900007513 Epoch 260 Loss 0.05748633295297623 Training accuracy is 0.9752836000300503 Epoch 270 Loss 0.05715125799179077 Training accuracy is 0.9748328450154008 Epoch 280 Loss 0.05643099173903465 Training accuracy is 0.974607467508076 Epoch 290 Loss 0.05608601123094559 Training accuracy is 0.9755089775373751 Epoch 300 Loss 0.0553017295897007 Training accuracy is 0.974607467508076 Epoch 310 Loss 0.05553416535258293 Training accuracy is 0.9764104875666741 Epoch 320 Loss 0.05534091964364052

Training accuracy is 0.9764856134024491 Epoch 330 Loss 0.05379638075828552 Training accuracy is 0.9751333483585005 Epoch 340 Loss 0.054263584315776825 Training accuracy is 0.9753587258658253 Epoch 350 Loss 0.052843499928712845 Training accuracy is 0.9752084741942754 Epoch 360 Loss 0.05283001437783241 Training accuracy is 0.9752836000300503 Epoch 370 Loss 0.053189441561698914 Training accuracy is 0.9750582225227256 Epoch 380 Loss 0.0519474595785141 Training accuracy is 0.9775373751032981 Epoch 390 Loss 0.052066244184970856 Training accuracy is 0.9770866200886484 Epoch 400 Loss 0.051302772015333176 Training accuracy is 0.9761099842235745 Epoch 410 Loss 0.05080393701791763 Training accuracy is 0.9757343550446999 Epoch 420 Loss 0.050444699823856354 Training accuracy is 0.9762602358951243 Epoch 430 Loss 0.050131842494010925 Training accuracy is 0.9764856134024491 Epoch 440 Loss 0.05010674521327019 Training accuracy is 0.9770866200886484 Epoch 450 Loss 0.049870815128088 Training accuracy is 0.9778378784463977 Epoch 460 Loss 0.04929308965802193 Training accuracy is 0.9770114942528736 Epoch 470 Loss 0.049068745225667953 Training accuracy is 0.9770114942528736 Epoch 480 Loss 0.04882371798157692 Training accuracy is 0.9770866200886484 Epoch 490 Loss 0.048580773174762726 Training accuracy is 0.9756592292089249 Epoch 500 Loss 0.048590272665023804 Training accuracy is 0.9788145143114717 Epoch 510 Loss 0.04896320402622223 Training accuracy is 0.9757343550446999 Epoch 520 Loss 0.04788380488753319 Training accuracy is 0.9758846067162498 Epoch 530 Loss 0.04826220124959946 Training accuracy is 0.9800916535196454 Epoch 540 Loss 0.047599781304597855 Training accuracy is 0.9777627526106228 Epoch 550 Loss 0.04744936153292656 Training accuracy is 0.9764104875666741 Epoch 560 Loss 0.047589484602212906

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Training accuracy is 0.9846743295019157 Epoch 2010 Loss 0.03508244827389717 Training accuracy is 0.9812185410562693 Epoch 2020 Loss 0.03386897221207619 Training accuracy is 0.986251972053189 Epoch 2030 Loss 0.03383639082312584 Training accuracy is 0.9855007136954399 Epoch 2040 Loss 0.0353953018784523 Training accuracy is 0.9789647659830215 Epoch 2050 Loss 0.03300640359520912 Training accuracy is 0.9848997070092405 Epoch 2060 Loss 0.03585593402385712 Training accuracy is 0.9861017203816392 Epoch 2070 Loss 0.03312313184142113 Training accuracy is 0.9840733228157164 Epoch 2080 Loss 0.035377830266952515 Training accuracy is 0.9812936668920442 Epoch 2090 Loss 0.033172912895679474 Training accuracy is 0.9861768462174142 Epoch 2100 Loss 0.03425729647278786 Training accuracy is 0.9860265945458643 Epoch 2110 Loss 0.034339334815740585 Training accuracy is 0.9809180377131695 Epoch 2120 Loss 0.032751500606536865 Training accuracy is 0.9857260912027647 Epoch 2130 Loss 0.03567780554294586 Training accuracy is 0.9858763428743145 Epoch 2140 Loss 0.034133415669202805 Training accuracy is 0.9809180377131695 Epoch 2150 Loss 0.03261920437216759 Training accuracy is 0.9858012170385395 Epoch 2160 Loss 0.034803010523319244 Training accuracy is 0.986402223724739 Epoch 2170 Loss 0.03396700322628021 Training accuracy is 0.9812185410562693 Epoch 2180 Loss 0.032529011368751526 Training accuracy is 0.9855007136954399 Epoch 2190 Loss 0.03463313356041908 Training accuracy is 0.9856509653669897 Epoch 2200 Loss 0.03244144469499588 Training accuracy is 0.9852002103523402 Epoch 2210 Loss 0.03458166494965553 Training accuracy is 0.9798662760123207 Epoch 2220 Loss 0.032280512154102325 Training accuracy is 0.9849748328450154 Epoch 2230 Loss 0.03569548949599266 Training accuracy is 0.986327097888964 Epoch 2240 Loss 0.03266742080450058

Training accuracy is 0.9835474419652919 Epoch 2250 Loss 0.03289114683866501 Training accuracy is 0.9845240778303659 Epoch 2260 Loss 0.034176334738731384 Training accuracy is 0.9859514687100894 Epoch 2270 Loss 0.03210645169019699 Training accuracy is 0.9852002103523402 Epoch 2280 Loss 0.03433987870812416 Training accuracy is 0.9818195477424686 Epoch 2290 Loss 0.03231218084692955 Training accuracy is 0.9864773495605138 Epoch 2300 Loss 0.033317308872938156 Training accuracy is 0.9866276012320637 Epoch 2310 Loss 0.03197833523154259 Training accuracy is 0.9855007136954399 Epoch 2320 Loss 0.031976375728845596 Training accuracy is 0.9860265945458643 Epoch 2330 Loss 0.03498890623450279 Training accuracy is 0.9865524753962888 Epoch 2340 Loss 0.034475818276405334 Training accuracy is 0.979490646833446 Epoch 2350 Loss 0.03182411938905716 Training accuracy is 0.9860265945458643 Epoch 2360 Loss 0.03418303281068802 Training accuracy is 0.9868529787393885 Epoch 2370 Loss 0.03173305466771126 Training accuracy is 0.9858012170385395 Epoch 2380 Loss 0.035635728389024734 Training accuracy is 0.9792652693261212 Epoch 2390 Loss 0.03217659518122673 Training accuracy is 0.9867778529036135 Epoch 2400 Loss 0.03198777884244919 Training accuracy is 0.9864773495605138 Epoch 2410 Loss 0.034544285386800766 Training accuracy is 0.9799414018480955 Epoch 2420 Loss 0.031875837594270706 Training accuracy is 0.9865524753962888 Epoch 2430 Loss 0.0322592668235302 Training accuracy is 0.986327097888964 Epoch 2440 Loss 0.032899610698223114 Training accuracy is 0.9813687927278191 Epoch 2450 Loss 0.03159752115607262 Training accuracy is 0.9857260912027647 Epoch 2460 Loss 0.032704662531614304 Training accuracy is 0.9869281045751634 Epoch 2470 Loss 0.03174855187535286 Training accuracy is 0.9858012170385395 Epoch 2480 Loss 0.03291492909193039

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Training accuracy is 0.9891067538126361 Epoch 7770 Loss 0.023130638524889946 Training accuracy is 0.9907595221996844 Epoch 7780 Loss 0.02527669630944729 Training accuracy is 0.9886559987979866 Epoch 7790 Loss 0.023231927305459976 Training accuracy is 0.9903838930208099 Epoch 7800 Loss 0.025714702904224396 Training accuracy is 0.9869281045751634 Epoch 7810 Loss 0.0240549985319376 Training accuracy is 0.9903838930208099 Epoch 7820 Loss 0.02587076462805271 Training accuracy is 0.9908346480354594 Epoch 7830 Loss 0.02296440489590168 Training accuracy is 0.9909848997070092 Epoch 7840 Loss 0.023208176717162132 Training accuracy is 0.9898580121703854 Epoch 7850 Loss 0.029778052121400833 Training accuracy is 0.9861768462174142 Epoch 7860 Loss 0.026623956859111786 Training accuracy is 0.9895575088272857 Epoch 7870 Loss 0.022991785779595375 Training accuracy is 0.9910600255427842 Epoch 7880 Loss 0.02508584037423134 Training accuracy is 0.9868529787393885 Epoch 7890 Loss 0.02455856464803219 Training accuracy is 0.9901585155134851 Epoch 7900 Loss 0.025633998215198517 Training accuracy is 0.9908346480354594 Epoch 7910 Loss 0.02285821922123432 Training accuracy is 0.9910600255427842 Epoch 7920 Loss 0.025476446375250816 Training accuracy is 0.986402223724739 Epoch 7930 Loss 0.023592045530676842 Training accuracy is 0.9908346480354594 Epoch 7940 Loss 0.025425618514418602 Training accuracy is 0.9909097738712344 Epoch 7950 Loss 0.02282438613474369 Training accuracy is 0.9912854030501089 Epoch 7960 Loss 0.02527768351137638 Training accuracy is 0.9867778529036135 Epoch 7970 Loss 0.023497354239225388 Training accuracy is 0.9907595221996844 Epoch 7980 Loss 0.025635967031121254 Training accuracy is 0.9909848997070092 Epoch 7990 Loss 0.022795241326093674 Training accuracy is 0.991210277214334 Epoch 8000 Loss 0.02653622254729271

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Training accuracy is 0.9909097738712344 Epoch 8970 Loss 0.02569088526070118 Training accuracy is 0.9909848997070092 Epoch 8980 Loss 0.024033689871430397 Training accuracy is 0.9891818796484111 Epoch 8990 Loss 0.023770257830619812 Training accuracy is 0.9900833896777101 Epoch 9000 Loss 0.022376541048288345 Training accuracy is 0.9911351513785591 Epoch 9010 Loss 0.029323719441890717 Training accuracy is 0.9885808729622118 Epoch 9020 Loss 0.022397765889763832 Training accuracy is 0.9904590188565848 Epoch 9030 Loss 0.02472001500427723 Training accuracy is 0.9897828863346104 Epoch 9040 Loss 0.023000432178378105 Training accuracy is 0.9910600255427842 Epoch 9050 Loss 0.02709338441491127 Training accuracy is 0.9901585155134851 Epoch 9060 Loss 0.02230459824204445 Training accuracy is 0.9909848997070092 Epoch 9070 Loss 0.024987589567899704 Training accuracy is 0.9882052437833371 Epoch 9080 Loss 0.023073513060808182 Training accuracy is 0.9906092705281346 Epoch 9090 Loss 0.022480212152004242 Training accuracy is 0.9908346480354594 Epoch 9100 Loss 0.03240834176540375 Training accuracy is 0.9879798662760123 Epoch 9110 Loss 0.023043332621455193 Training accuracy is 0.9901585155134851 Epoch 9120 Loss 0.023961203172802925 Training accuracy is 0.9899331380061603 Epoch 9130 Loss 0.022504590451717377 Training accuracy is 0.9908346480354594 Epoch 9140 Loss 0.031036395579576492 Training accuracy is 0.9885808729622118 Epoch 9150 Loss 0.022968411445617676 Training accuracy is 0.9902336413492601 Epoch 9160 Loss 0.023464925587177277 Training accuracy is 0.9903087671850349 Epoch 9170 Loss 0.022967074066400528 Training accuracy is 0.9906092705281346 Epoch 9180 Loss 0.02831759862601757 Training accuracy is 0.9899331380061603 Epoch 9190 Loss 0.022436367347836494 Training accuracy is 0.9905341446923597 Epoch 9200 Loss 0.02445927821099758

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Training accuracy is 0.9906843963639096 Epoch 9450 Loss 0.023891864344477654 Training accuracy is 0.9896326346630606 Epoch 9460 Loss 0.022056709975004196 Training accuracy is 0.9912854030501089 Epoch 9470 Loss 0.02355894446372986 Training accuracy is 0.9912854030501089 Epoch 9480 Loss 0.02534673735499382 Training accuracy is 0.9913605288858839 Epoch 9490 Loss 0.025375135242938995 Training accuracy is 0.9876793629329126 Epoch 9500 Loss 0.02210286259651184 Training accuracy is 0.991210277214334 Epoch 9510 Loss 0.02420765534043312 Training accuracy is 0.991210277214334 Epoch 9520 Loss 0.026151806116104126 Training accuracy is 0.9913605288858839 Epoch 9530 Loss 0.024092338979244232 Training accuracy is 0.9893321313199609 Epoch 9540 Loss 0.022697513923048973 Training accuracy is 0.9907595221996844 Epoch 9550 Loss 0.02256520465016365 Training accuracy is 0.9909097738712344 Epoch 9560 Loss 0.030710585415363312 Training accuracy is 0.989257005484186 Epoch 9570 Loss 0.023379893973469734 Training accuracy is 0.9894823829915108 Epoch 9580 Loss 0.02317606844007969 Training accuracy is 0.9904590188565848 Epoch 9590 Loss 0.022672362625598907 Training accuracy is 0.9912854030501089 Epoch 9600 Loss 0.029310360550880432 Training accuracy is 0.9891818796484111 Epoch 9610 Loss 0.02229774184525013 Training accuracy is 0.9903838930208099 Epoch 9620 Loss 0.023566339164972305 Training accuracy is 0.9898580121703854 Epoch 9630 Loss 0.021983131766319275 Training accuracy is 0.9911351513785591 Epoch 9640 Loss 0.02199947088956833 Training accuracy is 0.9914356547216587 Epoch 9650 Loss 0.03447504714131355 Training accuracy is 0.9860265945458643 Epoch 9660 Loss 0.02629399672150612 Training accuracy is 0.9875291112613628 Epoch 9670 Loss 0.024715039879083633 Training accuracy is 0.9914356547216587 Epoch 9680 Loss 0.023001374676823616

Training accuracy is 0.9900082638419352 Epoch 9690 Loss 0.022426258772611618 Training accuracy is 0.9907595221996844 Epoch 9700 Loss 0.022091936320066452 Training accuracy is 0.9906843963639096 Epoch 9710 Loss 0.02602793090045452 Training accuracy is 0.9864773495605138 Epoch 9720 Loss 0.022221894934773445 Training accuracy is 0.9910600255427842 Epoch 9730 Loss 0.026242278516292572 Training accuracy is 0.9900833896777101 Epoch 9740 Loss 0.021942351013422012 Training accuracy is 0.991210277214334 Epoch 9750 Loss 0.02521471120417118 Training accuracy is 0.9870783562467133 Epoch 9760 Loss 0.022683436051011086 Training accuracy is 0.9909097738712344 Epoch 9770 Loss 0.024569183588027954 Training accuracy is 0.9909848997070092 Epoch 9780 Loss 0.023018252104520798 Training accuracy is 0.9910600255427842 Epoch 9790 Loss 0.02216833457350731 Training accuracy is 0.9906843963639096 Epoch 9800 Loss 0.028148243203759193 Training accuracy is 0.9848997070092405 Epoch 9810 Loss 0.021974312141537666 Training accuracy is 0.9914356547216587 Epoch 9820 Loss 0.025721462443470955 Training accuracy is 0.9906843963639096 Epoch 9830 Loss 0.021978572010993958 Training accuracy is 0.9908346480354594 Epoch 9840 Loss 0.025288812816143036 Training accuracy is 0.987303733754038 Epoch 9850 Loss 0.022627798840403557 Training accuracy is 0.9906843963639096 Epoch 9860 Loss 0.02381783165037632 Training accuracy is 0.9913605288858839 Epoch 9870 Loss 0.025973143056035042 Training accuracy is 0.9910600255427842 Epoch 9880 Loss 0.022753315046429634 Training accuracy is 0.9901585155134851 Epoch 9890 Loss 0.024769114330410957 Training accuracy is 0.9887311246337616 Epoch 9900 Loss 0.02188412845134735 Training accuracy is 0.9910600255427842 Epoch 9910 Loss 0.023882895708084106 Training accuracy is 0.9911351513785591 Epoch 9920 Loss 0.026443002745509148

Training accuracy is 0.9909097738712344

Epoch 9930 Loss 0.024677827954292297

Training accuracy is 0.9888813763053114

Epoch 9940 Loss 0.021909110248088837

Training accuracy is 0.9913605288858839

Epoch 9950 Loss 0.023738695308566093

Training accuracy is 0.9914356547216587

Epoch 9960 Loss 0.027674639597535133

Training accuracy is 0.9906092705281346

Epoch 9970 Loss 0.023708760738372803

Training accuracy is 0.9894823829915108

Epoch 9980 Loss 0.022481735795736313

Training accuracy is 0.9906843963639096

Epoch 9990 Loss 0.02214541658759117

Training accuracy is 0.991210277214334

Epoch 9350 Loss 0.022177480161190033 Training accuracy is 0.9916610322289835

```
[5]: plt.scatter(X[:, 0], X[:, 1], c=pred, cmap=plt.cm.Spectral, s = 1)
plot_decision_boundary(net, X, y, 'P2_Q2_B.pdf')
```

C:\Users\aradh\AppData\Local\Temp\ipykernel_57672\3878313576.py:21: UserWarning: Implicit dimension choice for log_softmax has been deprecated. Change the call to include dim=X as an argument.

return F.log_softmax(x)

```
[6]: plot_decision_boundary(net, X, y, 'P2_Q2_B')
```

C:\Users\aradh\AppData\Local\Temp\ipykernel_57672\3878313576.py:21: UserWarning: Implicit dimension choice for log_softmax has been deprecated. Change the call to include dim=X as an argument.

return F.log_softmax(x)

[]: