

578hw5

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CSC 578 (sect. 901) - Spring 2022

Assignment: HW 5

(0) Tiny experiment with One-training-One-test Iris data

[You can run the start-up code as is to generate this.]

In [1]:

```
import NN578_network2 as network2
import numpy as np

# Test with one-data Iris data

inst1 = (np.array([5.7, 3, 4.2, 1.2]), np.array([0., 1., 0.]))
x1 = np.reshape(inst1[0], (4, 1))
y1 = np.reshape(inst1[1], (3, 1))
sample1 = [(x1, y1)]
inst2 = (np.array([4.8, 3.4, 1.6, 0.2]), np.array([1., 0., 0.]))
x2 = np.reshape(inst2[0], (4, 1))
y2 = np.reshape(inst2[1], (3, 1))
sample2 = [(x2, y2)]

net4 = network2.load_network("iris-423.dat")
net4.set_parameters(cost=network2.QuadraticCost)

net4.SGD(sample1, 2, 1, 1.0, evaluation_data=sample2, monitor_evaluation_cost=True,
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)
```

Epoch 0 training completed:
Cost on training data: 0.26673128660052947
Accuracy on training data: 1 / 1
Cost on evaluation data: 0.3244002758397572
Accuracy on evaluation data: 0 / 1

Epoch 1 training completed:
Cost on training data: 0.2107866577006649
Accuracy on training data: 1 / 1
Cost on evaluation data: 0.37647122809828165
Accuracy on evaluation data: 0 / 1

Out[1]:

```
([0.3244002758397572, 0.37647122809828165],
 [0, 0],
 [0.26673128660052947, 0.2107866577006649],
 [1, 1])
```

Load the iris_train, iris_test datasets

```
In [2]: # Load the iris train-test (separate) data files
def my_load_csv(fname, no_trainfeatures, no_testfeatures):
    ret = np.genfromtxt(fname, delimiter=',')
    data = np.array([(entry[:no_trainfeatures], entry[no_trainfeatures:]) for entry in ret])
    temp_inputs = [np.reshape(x, (no_trainfeatures, 1)) for x in data[:,0]]
    temp_results = [np.reshape(y, (no_testfeatures, 1)) for y in data[:,1]]
    dataset = list(zip(temp_inputs, temp_results))
    return dataset

iris_train = my_load_csv('iris-train-1.csv', 4, 3)
iris_test = my_load_csv('iris-test-1.csv', 4, 3)
```

C:\Users\Home\AppData\Local\Temp\ipykernel_12848\1570339441.py:4: VisibleDeprecationWarning: Creating an ndarray from ragged nested sequences (which is a list-or-tuple of lists-or-tuples-or ndarrays with different lengths or shapes) is deprecated. If you meant to do this, you must specify 'dtype=object' when creating the ndarray.

```
data = np.array([(entry[:no_trainfeatures], entry[no_trainfeatures:]) for entry in ret])
```

1.) Sigmoid + Sigmoid + QuadraticCost

[You can run the start-up code as is to generate this.]

```
In [3]: net2 = network2.load_network("iris-423.dat")

# Set hyper-parameter values individually after the network
net2.set_parameters(cost=network2.QuadraticCost, act_hidden=network2.Sigmoid, act_output=network2.Sigmoid)

net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=True,
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)
```

Epoch 0 training completed:
 Cost on training data: 0.3392795030659105
 Accuracy on training data: 21 / 95
 Cost on evaluation data: 0.34444833747414394
 Accuracy on evaluation data: 15 / 55

Epoch 1 training completed:
 Cost on training data: 0.3332680387432046
 Accuracy on training data: 33 / 95
 Cost on evaluation data: 0.3357508215659017
 Accuracy on evaluation data: 17 / 55

Epoch 2 training completed:
 Cost on training data: 0.33169864345910943
 Accuracy on training data: 33 / 95
 Cost on evaluation data: 0.33331819877313307
 Accuracy on evaluation data: 17 / 55

Epoch 3 training completed:
 Cost on training data: 0.3280047701277544
 Accuracy on training data: 33 / 95
 Cost on evaluation data: 0.32931297694327877
 Accuracy on evaluation data: 17 / 55

Epoch 4 training completed:
Cost on training data: 0.3105024143021552
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.311452504680719
Accuracy on evaluation data: 35 / 55

Epoch 5 training completed:
Cost on training data: 0.2822226213778409
Accuracy on training data: 64 / 95
Cost on evaluation data: 0.28266644748693787
Accuracy on evaluation data: 39 / 55

Epoch 6 training completed:
Cost on training data: 0.26185308519985034
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.2622221163236103
Accuracy on evaluation data: 40 / 55

Epoch 7 training completed:
Cost on training data: 0.24637620748622577
Accuracy on training data: 64 / 95
Cost on evaluation data: 0.24693122708939252
Accuracy on evaluation data: 40 / 55

Epoch 8 training completed:
Cost on training data: 0.23397287354343002
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.23484243915532602
Accuracy on evaluation data: 41 / 55

Epoch 9 training completed:
Cost on training data: 0.2240389321795399
Accuracy on training data: 67 / 95
Cost on evaluation data: 0.22523745295521982
Accuracy on evaluation data: 41 / 55

Epoch 10 training completed:
Cost on training data: 0.21604989548512998
Accuracy on training data: 70 / 95
Cost on evaluation data: 0.2175515310927702
Accuracy on evaluation data: 44 / 55

Epoch 11 training completed:
Cost on training data: 0.20957620155325693
Accuracy on training data: 73 / 95
Cost on evaluation data: 0.21134700807259035
Accuracy on evaluation data: 47 / 55

Epoch 12 training completed:
Cost on training data: 0.2042808031846783
Accuracy on training data: 81 / 95
Cost on evaluation data: 0.20628846293823358
Accuracy on evaluation data: 52 / 55

Epoch 13 training completed:
Cost on training data: 0.19990418595499362
Accuracy on training data: 94 / 95
Cost on evaluation data: 0.2021204428263281
Accuracy on evaluation data: 54 / 55

```
Epoch 14 training completed:
Cost on training data: 0.1962475462149834
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.19864854335473608
Accuracy on evaluation data: 35 / 55
```

```
Out[3]: ([0.34444833747414394,
0.3357508215659017,
0.33331819877313307,
0.32931297694327877,
0.311452504680719,
0.28266644748693787,
0.2622221163236103,
0.24693122708939252,
0.23484243915532602,
0.22523745295521982,
0.2175515310927702,
0.21134700807259035,
0.20628846293823358,
0.2021204428263281,
0.19864854335473608],
[15, 17, 17, 17, 35, 39, 40, 40, 41, 41, 44, 47, 52, 54, 35],
[0.3392795030659105,
0.3332680387432046,
0.33169864345910943,
0.3280047701277544,
0.3105024143021552,
0.2822226213778409,
0.26185308519985034,
0.24637620748622577,
0.23397287354343002,
0.2240389321795399,
0.21604989548512998,
0.20957620155325693,
0.2042808031846783,
0.19990418595499362,
0.1962475462149834],
[21, 33, 33, 33, 65, 64, 65, 64, 65, 67, 70, 73, 81, 94, 65])
```

2.) Sigmoid + Sigmoid + CrossEntropy

```
In [4]: net2 = network2.load_network("iris-423.dat")
net2.set_parameters(cost=network2.CrossEntropyCost, act_hidden=network2.Sigmoid, act_out=network2.Sigmoid)
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=True,
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)
```

```
Epoch 0 training completed:
Cost on training data: 1.8603802674198153
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.86801026041802
Accuracy on evaluation data: 18 / 55
```

```
Epoch 1 training completed:
Cost on training data: 1.460606534019205
Accuracy on training data: 69 / 95
Cost on evaluation data: 1.4660555356377223
```

Accuracy on evaluation data: 44 / 55

Epoch 2 training completed:

Cost on training data: 1.2667163241805766

Accuracy on training data: 92 / 95

Cost on evaluation data: 1.2774861545892018

Accuracy on evaluation data: 54 / 55

Epoch 3 training completed:

Cost on training data: 1.157146339882345

Accuracy on training data: 65 / 95

Cost on evaluation data: 1.1718471307186424

Accuracy on evaluation data: 35 / 55

Epoch 4 training completed:

Cost on training data: 1.0668798505712163

Accuracy on training data: 65 / 95

Cost on evaluation data: 1.086639159620854

Accuracy on evaluation data: 35 / 55

Epoch 5 training completed:

Cost on training data: 1.0269316288572257

Accuracy on training data: 65 / 95

Cost on evaluation data: 1.0468525231446604

Accuracy on evaluation data: 35 / 55

Epoch 6 training completed:

Cost on training data: 1.0030159043215205

Accuracy on training data: 65 / 95

Cost on evaluation data: 1.0230817418856184

Accuracy on evaluation data: 35 / 55

Epoch 7 training completed:

Cost on training data: 0.9876051818657172

Accuracy on training data: 65 / 95

Cost on evaluation data: 1.008345450466028

Accuracy on evaluation data: 35 / 55

Epoch 8 training completed:

Cost on training data: 0.9772276017636307

Accuracy on training data: 65 / 95

Cost on evaluation data: 0.999039774981281

Accuracy on evaluation data: 35 / 55

Epoch 9 training completed:

Cost on training data: 0.9690604086884841

Accuracy on training data: 65 / 95

Cost on evaluation data: 0.9916782036368461

Accuracy on evaluation data: 35 / 55

Epoch 10 training completed:

Cost on training data: 0.9623999454604479

Accuracy on training data: 64 / 95

Cost on evaluation data: 0.9856464279019425

Accuracy on evaluation data: 35 / 55

Epoch 11 training completed:

Cost on training data: 0.9564443218222219

Accuracy on training data: 64 / 95

Cost on evaluation data: 0.9800468983199269

Accuracy on evaluation data: 35 / 55

Epoch 12 training completed:

Cost on training data: 0.9519759891060913

Accuracy on training data: 64 / 95

Cost on evaluation data: 0.9761371328834577

Accuracy on evaluation data: 34 / 55

Epoch 13 training completed:

Cost on training data: 0.9459190082319816

Accuracy on training data: 64 / 95

Cost on evaluation data: 0.969683184172588

Accuracy on evaluation data: 35 / 55

Epoch 14 training completed:

Cost on training data: 0.9566747295347074

Accuracy on training data: 64 / 95

Cost on evaluation data: 0.9846220534440595

Accuracy on evaluation data: 34 / 55

```
Out[4]: ([1.86801026041802,
 1.4660555356377223,
 1.2774861545892018,
 1.1718471307186424,
 1.086639159620854,
 1.0468525231446604,
 1.0230817418856184,
 1.008345450466028,
 0.999039774981281,
 0.9916782036368461,
 0.9856464279019425,
 0.9800468983199269,
 0.9761371328834577,
 0.969683184172588,
 0.9846220534440595],
 [18, 44, 54, 35, 35, 35, 35, 35, 35, 35, 35, 35, 34, 35, 34],
 [1.8603802674198153,
 1.460606534019205,
 1.2667163241805766,
 1.157146339882345,
 1.0668798505712163,
 1.0269316288572257,
 1.0030159043215205,
 0.9876051818657172,
 0.9772276017636307,
 0.9690604086884841,
 0.9623999454604479,
 0.9564443218222219,
 0.9519759891060913,
 0.9459190082319816,
 0.9566747295347074],
 [33, 69, 92, 65, 65, 65, 65, 65, 65, 65, 64, 64, 64, 64, 64])
```

3.) Sigmoid + Softmax + CrossEntropy

```
In [5]: net2 = network2.load_network("iris-423.dat")
net2.set_parameters(cost=network2.CrossEntropyCost, act_hidden=network2.Sigmoid, act_out=network2.Softmax,
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=True)
```

```
monitor_evaluation_accuracy=True,  
monitor_training_cost=True,  
monitor_training_accuracy=True)
```

Epoch 0 training completed:
Cost on training data: 2.0796657352958428
Accuracy on training data: 33 / 95
Cost on evaluation data: 2.07795549824303
Accuracy on evaluation data: 17 / 55

Epoch 1 training completed:
Cost on training data: 2.1081016503185976
Accuracy on training data: 30 / 95
Cost on evaluation data: 2.084467814912433
Accuracy on evaluation data: 20 / 55

Epoch 2 training completed:
Cost on training data: 1.4541543371504533
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.471013185139868
Accuracy on evaluation data: 35 / 55

Epoch 3 training completed:
Cost on training data: 1.3593731962677664
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.3771843148926954
Accuracy on evaluation data: 35 / 55

Epoch 4 training completed:
Cost on training data: 1.2951970290596304
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.312657405577991
Accuracy on evaluation data: 35 / 55

Epoch 5 training completed:
Cost on training data: 1.2681191220733508
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.28409225197581
Accuracy on evaluation data: 35 / 55

Epoch 6 training completed:
Cost on training data: 1.2516090174753143
Accuracy on training data: 90 / 95
Cost on evaluation data: 1.2674210708592946
Accuracy on evaluation data: 54 / 55

Epoch 7 training completed:
Cost on training data: 1.2380695869912535
Accuracy on training data: 82 / 95
Cost on evaluation data: 1.2530388157445334
Accuracy on evaluation data: 53 / 55

Epoch 8 training completed:
Cost on training data: 1.9852822105249133
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.986221001850633
Accuracy on evaluation data: 17 / 55

Epoch 9 training completed:
Cost on training data: 1.5469199772545184

Accuracy on training data: 65 / 95
Cost on evaluation data: 1.5700675916962603
Accuracy on evaluation data: 35 / 55

Epoch 10 training completed:
Cost on training data: 1.4192901931260125
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.4369537506240186
Accuracy on evaluation data: 35 / 55

Epoch 11 training completed:
Cost on training data: 1.3627170578384147
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.3786635371360327
Accuracy on evaluation data: 35 / 55

Epoch 12 training completed:
Cost on training data: 1.3301597588377747
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.3454699199602322
Accuracy on evaluation data: 35 / 55

Epoch 13 training completed:
Cost on training data: 1.3088172090796717
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.3238931293763883
Accuracy on evaluation data: 35 / 55

Epoch 14 training completed:
Cost on training data: 1.2936066661058043
Accuracy on training data: 65 / 95
Cost on evaluation data: 1.3085501395134322
Accuracy on evaluation data: 35 / 55

Out[5]: ([2.07795549824303,
2.084467814912433,
1.471013185139868,
1.3771843148926954,
1.312657405577991,
1.28409225197581,
1.2674210708592946,
1.2530388157445334,
1.986221001850633,
1.5700675916962603,
1.4369537506240186,
1.3786635371360327,
1.3454699199602322,
1.3238931293763883,
1.3085501395134322],
[17, 20, 35, 35, 35, 35, 54, 53, 17, 35, 35, 35, 35, 35, 35],
[2.0796657352958428,
2.1081016503185976,
1.4541543371504533,
1.3593731962677664,
1.2951970290596304,
1.2681191220733508,
1.2516090174753143,
1.2380695869912535,
1.9852822105249133,
1.5469199772545184,


```
1.4192901931260125,  
1.3627170578384147,  
1.3301597588377747,  
1.3088172090796717,  
1.2936066661058043],  
[33, 30, 65, 65, 65, 65, 90, 82, 33, 65, 65, 65, 65, 65, 65])
```

4.) Sigmoid + Softmax + LogLikelihood

In [6]:

```
net2 = network2.load_network("iris-423.dat")  
net2.set_parameters(cost=network2.LogLikelihood, act_hidden=network2.Sigmoid, act_output=network2.Softmax)  
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=True,  
         monitor_evaluation_accuracy=True,  
         monitor_training_cost=True,  
         monitor_training_accuracy=True)
```

Epoch 0 training completed:

Cost on training data: 0.6939243673335762

Accuracy on training data: 33 / 95

Cost on evaluation data: 0.7031655365603354

Accuracy on evaluation data: 17 / 55

Epoch 1 training completed:

Cost on training data: 0.6730652668308285

Accuracy on training data: 65 / 95

Cost on evaluation data: 0.6777321600362607

Accuracy on evaluation data: 35 / 55

Epoch 2 training completed:

Cost on training data: 0.5367911920292118

Accuracy on training data: 62 / 95

Cost on evaluation data: 0.5379424339473955

Accuracy on evaluation data: 38 / 55

Epoch 3 training completed:

Cost on training data: 0.4514534117603832

Accuracy on training data: 76 / 95

Cost on evaluation data: 0.4548586660780302

Accuracy on evaluation data: 48 / 55

Epoch 4 training completed:

Cost on training data: 0.39804390388092464

Accuracy on training data: 65 / 95

Cost on evaluation data: 0.40323109144970604

Accuracy on evaluation data: 35 / 55

Epoch 5 training completed:

Cost on training data: 0.36183435942190195

Accuracy on training data: 65 / 95

Cost on evaluation data: 0.36806978016245706

Accuracy on evaluation data: 35 / 55

Epoch 6 training completed:

Cost on training data: 0.3354020988700623

Accuracy on training data: 65 / 95

Cost on evaluation data: 0.3422726187823812

Accuracy on evaluation data: 35 / 55

Epoch 7 training completed:
Cost on training data: 0.31450402496867513
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.3218231140418876
Accuracy on evaluation data: 35 / 55

Epoch 8 training completed:
Cost on training data: 0.29527887251633794
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.30305997493736614
Accuracy on evaluation data: 35 / 55

Epoch 9 training completed:
Cost on training data: 0.27647172570197487
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.28470876038901277
Accuracy on evaluation data: 35 / 55

Epoch 10 training completed:
Cost on training data: 0.2627274252603041
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.27132925460559537
Accuracy on evaluation data: 35 / 55

Epoch 11 training completed:
Cost on training data: 0.2559923749291393
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.26490353136483763
Accuracy on evaluation data: 35 / 55

Epoch 12 training completed:
Cost on training data: 0.25766716116151905
Accuracy on training data: 65 / 95
Cost on evaluation data: 0.2661945900587034
Accuracy on evaluation data: 35 / 55

Epoch 13 training completed:
Cost on training data: 0.26090806873534517
Accuracy on training data: 64 / 95
Cost on evaluation data: 0.2678074258190117
Accuracy on evaluation data: 34 / 55

Epoch 14 training completed:
Cost on training data: 0.26672994719457715
Accuracy on training data: 64 / 95
Cost on evaluation data: 0.27060475155253877
Accuracy on evaluation data: 34 / 55

```
Out[6]: ([0.7031655365603354,  
         0.6777321600362607,  
         0.5379424339473955,  
         0.4548586660780302,  
         0.40323109144970604,  
         0.36806978016245706,  
         0.3422726187823812,  
         0.3218231140418876,  
         0.30305997493736614,  
         0.28470876038901277,  
         0.27132925460559537,  
         0.26490353136483763,
```

```

0.2661945900587034,
0.2678074258190117,
0.27060475155253877],
[17, 35, 38, 48, 35, 35, 35, 35, 35, 35, 35, 35, 34, 34],
[0.6939243673335762,
0.6730652668308285,
0.5367911920292118,
0.4514534117603832,
0.39804390388092464,
0.36183435942190195,
0.3354020988700623,
0.31450402496867513,
0.29527887251633794,
0.27647172570197487,
0.2627274252603041,
0.2559923749291393,
0.25766716116151905,
0.26090806873534517,
0.26672994719457715],
[33, 65, 62, 76, 65, 65, 65, 65, 65, 65, 65, 65, 64, 64])

```

5.) ReLU + Softmax + CrossEntropy

In [7]:

```

net2 = network2.load_network("iris-423.dat")
net2.set_parameters(cost=network2.CrossEntropyCost, act_hidden=network2.ReLU, act_output=network2.Softmax)
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=True,
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)

```

C:\Users\Home\NN578_network2.py:61: RuntimeWarning: invalid value encountered in true_divide

```
    return -( (a-y) / ((a-1) * a) )
```

C:\Users\Home\NN578_network2.py:61: RuntimeWarning: divide by zero encountered in true_divide

```
    return -( (a-y) / ((a-1) * a) )
```

Epoch 0 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 1 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 2 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 3 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 4 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 5 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 6 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 7 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 8 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 9 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 10 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 11 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 12 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 13 training completed:

Cost on training data: nan

Accuracy on training data: 32 / 95

Cost on evaluation data: nan

Accuracy on evaluation data: 18 / 55

Epoch 14 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Out[7]: ([nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan],
[18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18],
[nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan],
[32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32])

6.) ReLU + Softmax + LogLikelihood

```
In [8]: net2 = network2.load_network("iris-423.dat")
net2.set_parameters(cost=network2.LogLikelihood, act_hidden=network2.ReLU, act_output=n
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=Tr
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)
```

C:\Users\Home\NN578_network2.py:75: RuntimeWarning: divide by zero encountered in true_d
ivide

a[x] = y[x] * (-1 / a[x])

C:\Users\Home\NN578_network2.py:75: RuntimeWarning: invalid value encountered in multipl
y

a[x] = y[x] * (-1 / a[x])

Epoch 0 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 1 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 2 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 3 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 4 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 5 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 6 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 7 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 8 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 9 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 10 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 11 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 12 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 13 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 14 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

```
Out[8]: ([nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan],
        [18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18],
        [nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan],
        [32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32])
```

7.) Tanh + Sigmoid + Quadratic

```
In [ ]: net2 = network2.load_network("iris-423.dat")
net2.set_parameters(cost=network2.QuadraticCost, act_hidden=network2.Tanh, act_output=n
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=Tr
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)
```

8.) Tanh + Tanh + Quadratic

```
In [9]: net2 = network2.load_network("iris-423.dat")
net2.set_parameters(cost=network2.QuadraticCost, act_hidden=network2.Tanh, act_output=n
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=Tr
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)
```

Epoch 0 training completed:
Cost on training data: 1.5632335301768185
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.6447817575121952
Accuracy on evaluation data: 17 / 55

Epoch 1 training completed:
Cost on training data: 1.7700632291149812
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.8449848877025194
Accuracy on evaluation data: 17 / 55

Epoch 2 training completed:
Cost on training data: 1.5001812828599652
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.535184506261475
Accuracy on evaluation data: 17 / 55

Epoch 3 training completed:
Cost on training data: 1.5570778586672658
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.5640765577972784
Accuracy on evaluation data: 17 / 55

Epoch 4 training completed:
Cost on training data: 1.4008025520994258
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.4146963617569082
Accuracy on evaluation data: 17 / 55

Epoch 5 training completed:
Cost on training data: 1.7515323813261168
Accuracy on training data: 33 / 95

Cost on evaluation data: 1.822561918834206
Accuracy on evaluation data: 17 / 55

Epoch 6 training completed:
Cost on training data: 1.6150277995757572
Accuracy on training data: 30 / 95
Cost on evaluation data: 1.562815581775495
Accuracy on evaluation data: 20 / 55

Epoch 7 training completed:
Cost on training data: 1.6128596745896908
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.6450335179710491
Accuracy on evaluation data: 17 / 55

Epoch 8 training completed:
Cost on training data: 1.5134550423863589
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.572842449392096
Accuracy on evaluation data: 17 / 55

Epoch 9 training completed:
Cost on training data: 1.7513250664487554
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.8214008099324173
Accuracy on evaluation data: 17 / 55

Epoch 10 training completed:
Cost on training data: 1.449075407934458
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.4702884872086581
Accuracy on evaluation data: 17 / 55

Epoch 11 training completed:
Cost on training data: 1.5583619128024333
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.565074829644671
Accuracy on evaluation data: 17 / 55

Epoch 12 training completed:
Cost on training data: 1.457975318609516
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.5021151270177782
Accuracy on evaluation data: 17 / 55

Epoch 13 training completed:
Cost on training data: 1.5744342087312004
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.590566592898297
Accuracy on evaluation data: 17 / 55

Epoch 14 training completed:
Cost on training data: 1.4493504814476035
Accuracy on training data: 33 / 95
Cost on evaluation data: 1.464352906434339
Accuracy on evaluation data: 17 / 55

Out[9]: ([1.6447817575121952,
1.8449848877025194,
1.535184506261475,


```

1.5640765577972784,
1.4146963617569082,
1.822561918834206,
1.562815581775495,
1.6450335179710491,
1.572842449392096,
1.8214008099324173,
1.4702884872086581,
1.565074829644671,
1.5021151270177782,
1.590566592898297,
1.464352906434339],
[17, 17, 17, 17, 17, 17, 20, 17, 17, 17, 17, 17, 17, 17, 17],
[1.5632335301768185,
1.7700632291149812,
1.5001812828599652,
1.5570778586672658,
1.4008025520994258,
1.7515323813261168,
1.6150277995757572,
1.6128596745896908,
1.5134550423863589,
1.7513250664487554,
1.449075407934458,
1.5583619128024333,
1.457975318609516,
1.5744342087312004,
1.4493504814476035],
[33, 33, 33, 33, 33, 33, 30, 33, 33, 33, 33, 33, 33, 33, 33])

```

9.) Sigmoid + Sigmoid + Quadratic + L2 regularization + Imdba = 3.0

```

In [10]: net2 = network2.load_network("iris-423.dat")
net2.set_parameters(cost=network2.QuadraticCost, act_hidden=network2.Sigmoid, act_output=network2.Sigmoid,
                    regularization='L2', lmbda = 3.0)
net2.SGD(iris_train, 15, 10, 1.0, 3.0, evaluation_data=iris_test, monitor_evaluation_cost=True,
        monitor_evaluation_accuracy=True, monitor_training_cost=True, monitor_training_accuracy=True)

```

Epoch 0 training completed:
Cost on training data: 0.45886398333113254
Accuracy on training data: 30 / 95
Cost on evaluation data: 0.5509298016398527
Accuracy on evaluation data: 18 / 55

Epoch 1 training completed:
Cost on training data: 0.396623357612462
Accuracy on training data: 31 / 95
Cost on evaluation data: 0.4441627862193589
Accuracy on evaluation data: 20 / 55

Epoch 2 training completed:
Cost on training data: 0.35964315066025077
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.38666765720485874
Accuracy on evaluation data: 38 / 55

Epoch 3 training completed:
Cost on training data: 0.34262845791173324
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.36158436118873444
Accuracy on evaluation data: 38 / 55

Epoch 4 training completed:
Cost on training data: 0.33416123022543753
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.35010483170635776
Accuracy on evaluation data: 38 / 55

Epoch 5 training completed:
Cost on training data: 0.3294987724480264
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.34509465468848194
Accuracy on evaluation data: 38 / 55

Epoch 6 training completed:
Cost on training data: 0.3266100283714264
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.3430922517975508
Accuracy on evaluation data: 38 / 55

Epoch 7 training completed:
Cost on training data: 0.3246207815335592
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.34246860387826106
Accuracy on evaluation data: 38 / 55

Epoch 8 training completed:
Cost on training data: 0.32317949516790373
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.3425544533429334
Accuracy on evaluation data: 38 / 55

Epoch 9 training completed:
Cost on training data: 0.3221101647238849
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.3430183499957253
Accuracy on evaluation data: 38 / 55

Epoch 10 training completed:
Cost on training data: 0.3213076417081684
Accuracy on training data: 62 / 95
Cost on evaluation data: 0.34366623702130267
Accuracy on evaluation data: 39 / 55

Epoch 11 training completed:
Cost on training data: 0.3207007860256327
Accuracy on training data: 63 / 95
Cost on evaluation data: 0.3443769166605408
Accuracy on evaluation data: 39 / 55

Epoch 12 training completed:
Cost on training data: 0.32023794744722905
Accuracy on training data: 66 / 95
Cost on evaluation data: 0.3450754538270465
Accuracy on evaluation data: 42 / 55

Epoch 13 training completed:
Cost on training data: 0.3198807020878355
Accuracy on training data: 71 / 95
Cost on evaluation data: 0.3457187003821495
Accuracy on evaluation data: 44 / 55

Epoch 14 training completed:
Cost on training data: 0.3196005230464391
Accuracy on training data: 74 / 95
Cost on evaluation data: 0.34628541820429487
Accuracy on evaluation data: 47 / 55

```
Out[10]: ([0.5509298016398527,
 0.4441627862193589,
 0.38666765720485874,
 0.36158436118873444,
 0.35010483170635776,
 0.34509465468848194,
 0.3430922517975508,
 0.34246860387826106,
 0.3425544533429334,
 0.3430183499957253,
 0.34366623702130267,
 0.3443769166605408,
 0.3450754538270465,
 0.3457187003821495,
 0.34628541820429487],
 [18, 20, 38, 38, 38, 38, 38, 38, 38, 38, 39, 39, 42, 44, 47],
 [0.45886398333113254,
 0.396623357612462,
 0.35964315066025077,
 0.34262845791173324,
 0.33416123022543753,
 0.3294987724480264,
 0.3266100283714264,
 0.3246207815335592,
 0.32317949516790373,
 0.3221101647238849,
 0.3213076417081684,
 0.3207007860256327,
 0.32023794744722905,
 0.3198807020878355,
 0.3196005230464391],
 [30, 31, 62, 62, 62, 62, 62, 62, 62, 62, 62, 63, 66, 71, 74])
```

10.) Sigmoid + Sigmoid + Quadratic + L1 regularization + Imdb = 3.0

```
In [11]: net2 = network2.load_network("iris-423.dat")
net2.set_parameters(cost=network2.QuadraticCost, act_hidden=network2.Sigmoid, act_output=network2.Sigmoid,
                    regularization='L1', lambda = 3.0)
net2.SGD(iris_train, 15, 10, 1.0, 3.0, evaluation_data=iris_test, monitor_evaluation_cost=True,
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)
```

Epoch 0 training completed:

Cost on training data: inf
Accuracy on training data: 32 / 95
Cost on evaluation data: inf
Accuracy on evaluation data: 18 / 55

Epoch 1 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 2 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 3 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 4 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 5 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 6 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 7 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 8 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 9 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55

Epoch 10 training completed:

```
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55
```

```
Epoch 11 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55
```

```
Epoch 12 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55
```

```
Epoch 13 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55
```

```
Epoch 14 training completed:
Cost on training data: nan
Accuracy on training data: 32 / 95
Cost on evaluation data: nan
Accuracy on evaluation data: 18 / 55
```

```
C:\Users\Home\NN578_network2.py:365: RuntimeWarning: overflow encountered in multiply
  self.weights = [(w - eta*(lmbda/n))*w-(eta/len(mini_batch))*nw
Out[11]: ([inf, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan],
  [18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18, 18],
  [inf, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan, nan],
  [32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32, 32])
```

11.) Sigmoid + Sigmoid + Quadratic + dropout = 0.1

```
In [12]: net2 = network2.load_network("iris4-20-7-3.dat")
net2.set_parameters(cost=network2.QuadraticCost, act_hidden=network2.Sigmoid, act_output=network2.Sigmoid,
                    dropoutpercent = 0.1)
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=True,
        monitor_evaluation_accuracy=True,
        monitor_training_cost=True,
        monitor_training_accuracy=True)
```

```
Epoch 0 training completed:
Cost on training data: 0.3336667955156058
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3340502318609861
Accuracy on evaluation data: 17 / 55
```

```
Epoch 1 training completed:
Cost on training data: 0.3332282953779683
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3341661334651754
Accuracy on evaluation data: 17 / 55
```

Epoch 2 training completed:
Cost on training data: 0.3330813506592155
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3341394037726516
Accuracy on evaluation data: 17 / 55

Epoch 3 training completed:
Cost on training data: 0.33293080948950937
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33400907837859
Accuracy on evaluation data: 17 / 55

Epoch 4 training completed:
Cost on training data: 0.3327648217001155
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3338341628370756
Accuracy on evaluation data: 17 / 55

Epoch 5 training completed:
Cost on training data: 0.332576419330871
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33362469576413845
Accuracy on evaluation data: 17 / 55

Epoch 6 training completed:
Cost on training data: 0.3323543612059436
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3333727906502334
Accuracy on evaluation data: 17 / 55

Epoch 7 training completed:
Cost on training data: 0.3320818502294503
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3330608493737543
Accuracy on evaluation data: 17 / 55

Epoch 8 training completed:
Cost on training data: 0.3317337158446753
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33266104171364164
Accuracy on evaluation data: 17 / 55

Epoch 9 training completed:
Cost on training data: 0.3312720769484439
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33213151921411743
Accuracy on evaluation data: 17 / 55

Epoch 10 training completed:
Cost on training data: 0.33064165296760584
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3314122377827083
Accuracy on evaluation data: 17 / 55

Epoch 11 training completed:
Cost on training data: 0.32976813842092795
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33042473815691026
Accuracy on evaluation data: 17 / 55

Epoch 12 training completed:
Cost on training data: 0.3285620500881858
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3290784066606187
Accuracy on evaluation data: 17 / 55

Epoch 13 training completed:
Cost on training data: 0.32691864943215937
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.32727188136489754
Accuracy on evaluation data: 17 / 55

Epoch 14 training completed:
Cost on training data: 0.3246967924196013
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.32486900864009394
Accuracy on evaluation data: 17 / 55

```
Out[12]: ([0.3340502318609861,
 0.3341661334651754,
 0.3341394037726516,
 0.33400907837859,
 0.3338341628370756,
 0.33362469576413845,
 0.3333727906502334,
 0.3330608493737543,
 0.33266104171364164,
 0.33213151921411743,
 0.3314122377827083,
 0.33042473815691026,
 0.3290784066606187,
 0.32727188136489754,
 0.32486900864009394],
 [17, 17, 17, 17, 17, 17, 17, 17, 17, 17, 17, 17, 17, 17, 17],
 [0.3336667955156058,
 0.3332282953779683,
 0.3330813506592155,
 0.33293080948950937,
 0.3327648217001155,
 0.332576419330871,
 0.3323543612059436,
 0.3320818502294503,
 0.3317337158446753,
 0.3312720769484439,
 0.33064165296760584,
 0.32976813842092795,
 0.3285620500881858,
 0.32691864943215937,
 0.3246967924196013],
 [33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33])
```

12.) Sigmoid + Sigmoid + Quadratic + dropout = 0.5

```
In [13]: net2 = network2.load_network("iris4-20-7-3.dat")
net2.set_parameters(cost=network2.QuadraticCost, act_hidden=network2.Sigmoid, act_output=network2.Sigmoid,
                    dropoutpercent = 0.5)
net2.SGD(iris_train, 15, 10, 1.0, evaluation_data=iris_test, monitor_evaluation_cost=True,
        monitor_evaluation_accuracy=True,
```

```
monitor_training_cost=True,  
monitor_training_accuracy=True)
```

Epoch 0 training completed:
Cost on training data: 0.3336667955156058
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3340502318609861
Accuracy on evaluation data: 17 / 55

Epoch 1 training completed:
Cost on training data: 0.3332282953779683
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3341661334651754
Accuracy on evaluation data: 17 / 55

Epoch 2 training completed:
Cost on training data: 0.3330813506592155
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3341394037726516
Accuracy on evaluation data: 17 / 55

Epoch 3 training completed:
Cost on training data: 0.33293080948950937
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33400907837859
Accuracy on evaluation data: 17 / 55

Epoch 4 training completed:
Cost on training data: 0.3327648217001155
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3338341628370756
Accuracy on evaluation data: 17 / 55

Epoch 5 training completed:
Cost on training data: 0.332576419330871
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33362469576413845
Accuracy on evaluation data: 17 / 55

Epoch 6 training completed:
Cost on training data: 0.3323543612059436
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3333727906502334
Accuracy on evaluation data: 17 / 55

Epoch 7 training completed:
Cost on training data: 0.3320818502294503
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3330608493737543
Accuracy on evaluation data: 17 / 55

Epoch 8 training completed:
Cost on training data: 0.3317337158446753
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33266104171364164
Accuracy on evaluation data: 17 / 55

Epoch 9 training completed:
Cost on training data: 0.3312720769484439
Accuracy on training data: 33 / 95

Cost on evaluation data: 0.33213151921411743
Accuracy on evaluation data: 17 / 55

Epoch 10 training completed:
Cost on training data: 0.33064165296760584
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3314122377827083
Accuracy on evaluation data: 17 / 55

Epoch 11 training completed:
Cost on training data: 0.32976813842092795
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.33042473815691026
Accuracy on evaluation data: 17 / 55

Epoch 12 training completed:
Cost on training data: 0.3285620500881858
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.3290784066606187
Accuracy on evaluation data: 17 / 55

Epoch 13 training completed:
Cost on training data: 0.32691864943215937
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.32727188136489754
Accuracy on evaluation data: 17 / 55

Epoch 14 training completed:
Cost on training data: 0.3246967924196013
Accuracy on training data: 33 / 95
Cost on evaluation data: 0.32486900864009394
Accuracy on evaluation data: 17 / 55

```
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           0.3323543612059436,  
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           0.33064165296760584,
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[33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33, 33])
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In []:

In []: