

Machine Learning

Project 4

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Forward-propagate:

```
0516251.py
14
15 def forward_propagate(X, theta1, theta2):
16     m = X.shape[0]
17
18     #Write codes here
19     a1 = np.insert(X, 0, values=np.ones(m), axis=1)
20     z2 = a1 * theta1.T
21     a2 = np.insert(sigmoid(z2), 0, values=np.ones(m), axis=1)
22     z3 = a2 * theta2.T
23     h = sigmoid(z3)
24
25     return a1, z2, a2, z3, h
26
```

Back-propagate:

```
0516251.py
66
67 def backprop(params, input_size, hidden_size, num_labels, X, y, learning_rate, regularize = True):
68     m = X.shape[0]
69     #Write codes here
70     X = np.matrix(X)
71     y = np.matrix(y)
72     theta1 = np.matrix(np.reshape(params[:hidden_size * (input_size + 1)], (hidden_size, (input_size + 1))))
73     theta2 = np.matrix(np.reshape(params[hidden_size * (input_size + 1):], (num_labels, (hidden_size + 1))))
74
75     # run forward prop
76     a1, z2, a2, z3, h = forward_propagate(X, theta1, theta2)
77
78     # initializations
79     J = 0
80     delta1 = np.zeros(theta1.shape)
81     delta2 = np.zeros(theta2.shape)
82
83     # compute the cost
84     for i in range(m):
85         first_term = np.multiply(-y[i, :], np.log(h[i, :]))
86         second_term = np.multiply((1 - y[i, :]), np.log(1 - h[i, :]))
87         J += np.sum(first_term - second_term)
88
89     J = J / m
90
91     if regularize:
92         J += (float(learning_rate) /
93              (2 * m)) * (np.sum(np.power(theta1[:, 1:], 2)) + np.sum(np.power(theta2[:, 1:], 2)))
94
95     # perform backpropagation
96     for t in range(m):
97         a1t = a1[t, :]
98         z2t = z2[t, :]
99         a2t = a2[t, :]
100        ht = h[t, :]
101        yt = y[t, :]
102
103        d3t = ht - yt
104
105        z2t = np.insert(z2t, 0, values=np.ones(1))
106        d2t = np.multiply((theta2.T * d3t.T).T, sigmoid_gradient(z2t))
107
108        delta1 = delta1 + (d2t[:, 1:].T * a1t
109        delta2 = delta2 + d3t.T * a2t
110
111    delta1 = delta1 / m
112    delta2 = delta2 / m
113
114    # add regularization term if needed
115    if regularize:
116        delta1[:, 1:] = delta1[:, 1:] + (theta1[:, 1:] * learning_rate) / m
117        delta2[:, 1:] = delta2[:, 1:] + (theta2[:, 1:] * learning_rate) / m
118
119    # unravel the gradient matrices into a single array
120    grad = np.concatenate((np.ravel(delta1), np.ravel(delta2)))
121
122    return J, grad
```

Accuracy

```
(josPython) Gueters-MacBook-Pro:MLHW4 josmy$ python3 hw4.py
/Users/josmy/josPython/lib/python3.7/site-packages/sklearn/preprocessing/_encoders.py:368: FutureWarning: The
handling of integer data will change in version 0.22. Currently, the categories are determined based on
the range [0, max(values)], while in the future they will be determined based on the unique values.
If you want the future behaviour and silence this warning, you can specify "categories='auto'".
In case you used a LabelEncoder before this OneHotEncoder to convert the categories to integers, then you c
an now use the OneHotEncoder directly.
  warnings.warn(msg, FutureWarning)
accuracy = 97.76%
```

