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1  import numpy as np
2
3  from nndl.layers import *
4  from nndl.conv_layers import *
5  from utils.fast_layers import *
6  from nndl.layer_utils import *
7  from nndl.conv_layer_utils import *
8
9  import pdb
10
11 class ThreeLayerConvNet(object):
12     """
13     A three-layer convolutional network with the following architecture:
14
15     conv - relu - 2x2 max pool - affine - relu - affine - softmax
16
17     The network operates on minibatches of data that have shape (N, C, H, W)
18     consisting of N images, each with height H and width W and with C input
19     channels.
20     """
21
22     def __init__(self, input_dim=(3, 32, 32), num_filters=32, filter_size=7,
23                 hidden_dim=100, num_classes=10, weight_scale=1e-3, reg=0.0,
24                 dtype=np.float32, use_batchnorm=False):
25         """
26         Initialize a new network.
27
28         Inputs:
29         - input_dim: Tuple (C, H, W) giving size of input data
30         - num_filters: Number of filters to use in the convolutional layer
31         - filter_size: Size of filters to use in the convolutional layer
32         - hidden_dim: Number of units to use in the fully-connected hidden layer
33         - num_classes: Number of scores to produce from the final affine layer.
34         - weight_scale: Scalar giving standard deviation for random initialization
35           of weights.
36         - reg: Scalar giving L2 regularization strength
37         - dtype: numpy datatype to use for computation.
38         """
39         self.use_batchnorm = use_batchnorm
40         self.params = {}
41         self.reg = reg
42         self.dtype = dtype
43
44
45         # ===== #
46         # YOUR CODE HERE:
47         #   Initialize the weights and biases of a three layer CNN. To initialize:
48         #   - the biases should be initialized to zeros.
49         #   - the weights should be initialized to a matrix with entries
50         #     drawn from a Gaussian distribution with zero mean and
51         #     standard deviation given by weight_scale.
52         # ===== #
53         C,H,W = input_dim
54         shapes = {}
55         shapes['W1'] = (num_filters, C, filter_size, filter_size)
56         shapes['W2'] = ((H//2) * (W//2) * num_filters, hidden_dim)
57         shapes['W3'] = (hidden_dim, num_classes)
58         shapes['b1'] = num_filters
59         shapes['b2'] = hidden_dim
60         shapes['b3'] = num_classes
61
62         for i in range(1,4):
63             str_W = 'W' + str(i)
64             str_b = 'b' + str(i)
65             self.params[str_W] = np.random.normal(loc = 0.0, scale = weight_scale, size =
66             shapes[str_W])
67             self.params[str_b] = np.zeros(shapes[str_b])

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67
68 # ===== #
69 # END YOUR CODE HERE
70 # ===== #
71
72 for k, v in self.params.items():
73     self.params[k] = v.astype(dtype)
74
75
76 def loss(self, X, y=None):
77     """
78     Evaluate loss and gradient for the three-layer convolutional network.
79
80     Input / output: Same API as TwoLayerNet in fc_net.py.
81     """
82     W1, b1 = self.params['W1'], self.params['b1']
83     W2, b2 = self.params['W2'], self.params['b2']
84     W3, b3 = self.params['W3'], self.params['b3']
85
86     # pass conv_param to the forward pass for the convolutional layer
87     filter_size = W1.shape[2]
88     conv_param = {'stride': 1, 'pad': (filter_size - 1) / 2}
89
90     # pass pool_param to the forward pass for the max-pooling layer
91     pool_param = {'pool_height': 2, 'pool_width': 2, 'stride': 2}
92
93     scores = None
94
95     # ===== #
96     # YOUR CODE HERE:
97     # Implement the forward pass of the three layer CNN. Store the output
98     # scores as the variable "scores".
99     # ===== #
100
101     h1, cache1 = conv_relu_pool_forward(X, W1, b1, conv_param, pool_param)
102     h2, cache2 = affine_relu_forward(h1, W2, b2)
103     scores, cache3 = affine_forward(h2, W3, b3)
104
105     # ===== #
106     # END YOUR CODE HERE
107     # ===== #
108
109     if y is None:
110         return scores
111
112     loss, grads = 0, {}
113     # ===== #
114     # YOUR CODE HERE:
115     # Implement the backward pass of the three layer CNN. Store the grads
116     # in the grads dictionary, exactly as before (i.e., the gradient of
117     # self.params[k] will be grads[k]). Store the loss as "loss", and
118     # don't forget to add regularization on ALL weight matrices.
119     # ===== #
120
121     loss, dz = softmax_loss(scores, y)
122     loss += 0.5 * self.reg * (np.sum(W1**2) + np.sum(W2**2) + np.sum(W3**2))
123
124     dh2, dw3, grads['b3'] = affine_backward(dz, cache3)
125     dh1, dw2, grads['b2'] = affine_relu_backward(dh2, cache2)
126     _, dw1, grads['b1'] = conv_relu_pool_backward(dh1, cache1)
127
128     grads['W1'] = dw1 + self.reg * W1
129     grads['W2'] = dw2 + self.reg * W2
130     grads['W3'] = dw3 + self.reg * W3
131
132
133     # ===== #

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```
134         # END YOUR CODE HERE
135         # ===== #
136
137         return loss, grads
138
139
140     pass
141
```