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1 import torch
2 import torch.nn as nn
3 import torch.nn.functional as F
4 import torch.utils.model_zoo as model_zoo
5 from torch.autograd.variable import Variable
6 from collections import OrderedDict
7 import re
8 import pdb
9
10 __all__ = ['DenseNet', 'densenet121', 'densenet169', 'densenet169_par',
11            'densenet201', 'densenet161']
12
13 model_urls = {
14     'densenet121':
15         'https://download.pytorch.org/models/densenet121-a639ec97.pth',
16     'densenet169':
17         'https://download.pytorch.org/models/densenet169-b2777c0a.pth',
18     'densenet201':
19         'https://download.pytorch.org/models/densenet201-c1103571.pth',
20     'densenet161':
21         'https://download.pytorch.org/models/densenet161-8d451a50.pth',
22 }
23
24 def densenet121(pretrained=False, **kwargs):
25     r"""Densenet-121 model from
26     `Densely Connected Convolutional Networks
27     <https://arxiv.org/pdf/1608.06993.pdf>`_
28
29     Args:
30         pretrained (bool): If True, returns a model pre-trained on ImageNet
31
32     """
33     model = DenseNet(num_init_features=64, growth_rate=32,
34                     block_config=(6, 12, 24, 16),
35                     **kwargs)
36     if pretrained:
37         # '.'s are no longer allowed in module names, but previous
38         # _DenseLayer
39         # has keys 'norm.1', 'relu.1', 'conv.1', 'norm.2', 'relu.2',
40         # 'conv.2'.
41         # They are also in the checkpoints in model_urls. This pattern is
42         # used
43         # to find such keys.
44         pattern = re.compile(
45             r'^(.*denselayer\d+\.(?:norm|relu|conv))\.((?:[12])\.(?:weight|bias|running
46             _mean|running_var))$')
47         state_dict = model_zoo.load_url(model_urls['densenet121'])
48         for key in list(state_dict.keys()):
49             res = pattern.match(key)
50             if res:
51                 new_key = res.group(1) + res.group(2)
52                 state_dict[new_key] = state_dict[key]
53                 del state_dict[key]
54         model.load_state_dict(state_dict)
55     model.classifier = None
56     features = model.features
57     features.block0 = nn.Sequential(features.conv0, features.norm0,
58                                     features.relu0)
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48
49     features.denseblock1 = nn.Sequential(*list(features.denseblock1))
50     features.transition1 = nn.Sequential(*list(features.transition1)[: -1])
51
52     features.denseblock2 = nn.Sequential(*list(features.denseblock2))
53     features.transition2 = nn.Sequential(*list(features.transition2)[: -1])
54
55     features.denseblock3 = nn.Sequential(*list(features.denseblock3))
56     features.transition3 = nn.Sequential(*list(features.transition3)[: -1])
57
58     features.denseblock4 =
nn.Sequential(*(list(features.denseblock4)+[features.norm5]))
59     model.features = features
60     return model
61
62
63 def densenet169_par(pretrained=False, **kwargs):
64     r"""Densenet-169 model from
65     `Densely Connected Convolutional Networks"
66     <https://arxiv.org/pdf/1608.06993.pdf>`_
67
68     Args:
69         pretrained (bool): If True, returns a model pre-trained on ImageNet
70
71     model = DenseNetPar(num_init_features=64, growth_rate=32,
72     block_config=(6, 12, 32, 32),
73     **kwargs)
74
75     if pretrained:
76         # '.'s are no longer allowed in module names, but pervious
77         _DenseLayer
78         # has keys 'norm.1', 'relu.1', 'conv.1', 'norm.2', 'relu.2',
79         # 'conv.2'.
80         # They are also in the checkpoints in model_urls. This pattern is
81         used
82         # to find such keys.
83         pattern = re.compile(
84             r'^(. *denselayer\d+\.((?:norm|relu|conv))\.((?:[12])\.(?:weight|bias|running
85             _mean|running_var))$')
86
87         state_dict = model_zoo.load_url(model_urls['densenet169'])
88         for key in list(state_dict.keys()):
89             res = pattern.match(key)
90             if res:
91                 new_key = res.group(1) + res.group(2)
92                 state_dict[new_key] = state_dict[key]
93                 del state_dict[key]
94         model.load_state_dict(state_dict)
95     model.classifier = None
96     features = model.features
97     features.block0 = nn.Sequential(features.conv0, features.norm0,
98     features.relu0)
99
100     features.denseblock1 = nn.Sequential(*list(features.denseblock1))
101     features.transition1 = nn.Sequential(*list(features.transition1)[: -1])
102
103     features.denseblock2 = nn.Sequential(*list(features.denseblock2))
104     features.transition2 = nn.Sequential(*list(features.transition2)[: -1])
105
106     features.denseblock3 = nn.Sequential(*list(features.denseblock3))
107     features.transition3 = nn.Sequential(*list(features.transition3)[: -1])

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99
100     features.denseblock4 = nn.Sequential(*(list(features.denseblock4)))
101     model.features = features
102     return model
103
104
105 def densenet169(pretrained=False, **kwargs):
106     r"""Densenet-169 model from
107     `Densely Connected Convolutional Networks"
108     <https://arxiv.org/pdf/1608.06993.pdf>`_
109
110     Args:
111         pretrained (bool): If True, returns a model pre-trained on ImageNet
112         num_init_features=64, growth_rate=32,
113         block_config=(6, 12, 32, 32),
114         **kwargs)
115     if pretrained:
116         # '.'s are no longer allowed in module names, but pervious
117         _DenseLayer
118         # has keys 'norm.1', 'relu.1', 'conv.1', 'norm.2', 'relu.2',
119         'conv.2'.
120         # They are also in the checkpoints in model_urls. This pattern is
121         used
122         # to find such keys.
123         pattern = re.compile(
124             r'^(.*denselayer\d+\.(?:norm|relu|conv))\.((?:[12])\.(?:weight|bias|running
125             _mean|running_var))$')
126         state_dict = model_zoo.load_url(model_urls['densenet169'])
127         for key in list(state_dict.keys()):
128             res = pattern.match(key)
129             if res:
130                 new_key = res.group(1) + res.group(2)
131                 state_dict[new_key] = state_dict[key]
132                 del state_dict[key]
133         model.load_state_dict(state_dict)
134     model.classifier = None
135     features = model.features
136     features.block0 = nn.Sequential(features.conv0, features.norm0,
137     features.relu0, features.pool0)
138
139     features.denseblock1 = nn.Sequential(*list(features.denseblock1))
140     features.transition1 = nn.Sequential(*list(features.transition1))
141
142     features.denseblock2 = nn.Sequential(*list(features.denseblock2))
143     features.transition2 = nn.Sequential(*list(features.transition2))
144
145     features.denseblock3 = nn.Sequential(*list(features.denseblock3))
146     features.transition3 = nn.Sequential(*list(features.transition3))
147
148     features.denseblock4 = nn.Sequential(*(list(features.denseblock4) +
149     [features.norm5]))
150     model.features = features
151     return model
152
153
154 def densenet201(pretrained=False, **kwargs):
155     r"""Densenet-201 model from
156     `Densely Connected Convolutional Networks"

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150 <https://arxiv.org/pdf/1608.06993.pdf>`_
151     Args:
152         pretrained (bool): If True, returns a model pre-trained on ImageNet
153         """
154         model = DenseNet(num_init_features=64, growth_rate=32,
155             block_config=(6, 12, 48, 32),
156             **kwargs)
157         if pretrained:
158             # '.'s are no longer allowed in module names, but previous
159             # _DenseLayer
160             # has keys 'norm.1', 'relu.1', 'conv.1', 'norm.2', 'relu.2',
161             # 'conv.2'.
162             # They are also in the checkpoints in model_urls. This pattern is
163             # used
164             # to find such keys.
165             pattern = re.compile(
166                 r'^(.*denselayer\d+\.(?:norm|relu|conv))\.((?:[12])\.(?:weight|bias|running
167                 _mean|running_var))$')
168             state_dict = model_zoo.load_url(model_urls['densenet201'])
169             for key in list(state_dict.keys()):
170                 res = pattern.match(key)
171                 if res:
172                     new_key = res.group(1) + res.group(2)
173                     state_dict[new_key] = state_dict[key]
174                     del state_dict[key]
175             model.load_state_dict(state_dict)
176             model.classifier = None
177             features = model.features
178             features.block0 = nn.Sequential(features.conv0, features.norm0,
179             features.relu0, features.pool0)
180
181             features.denseblock1 = nn.Sequential(*list(features.denseblock1))
182             features.transition1 = nn.Sequential(*list(features.transition1))
183
184             features.denseblock2 = nn.Sequential(*list(features.denseblock2))
185             features.transition2 = nn.Sequential(*list(features.transition2))
186
187             features.denseblock3 = nn.Sequential(*list(features.denseblock3))
188             features.transition3 = nn.Sequential(*list(features.transition3))
189
190             features.denseblock4 = nn.Sequential(*(list(features.denseblock4) +
191             [features.norm5]))
192             model.features = features
193             return model
194
195 def densenet161(pretrained=False, **kwargs):
196     r"""Densenet-161 model from
197     "Densely Connected Convolutional Networks"
198     <https://arxiv.org/pdf/1608.06993.pdf>`_
199
200     Args:
201         pretrained (bool): If True, returns a model pre-trained on ImageNet
202         """
203         model = DenseNet(num_init_features=96, growth_rate=48,
204             block_config=(6, 12, 36, 24),
205             **kwargs)
206         if pretrained:

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199         # '.'s are no longer allowed in module names, but pervious
    _DenseLayer
200         # has keys 'norm.1', 'relu.1', 'conv.1', 'norm.2', 'relu.2',
    'conv.2'.
201         # They are also in the checkpoints in model_urls. This pattern is
    used
202         # to find such keys.
203         pattern = re.compile(
204             r'^(*denselayer\d+\.(?:norm|relu|conv))\.((?:[12])\.(?:weight|bias|running
    _mean|running_var))$')
205         state_dict = model_zoo.load_url(model_urls['densenet161'])
206         for key in list(state_dict.keys()):
207             res = pattern.match(key)
208             if res:
209                 new_key = res.group(1) + res.group(2)
210                 state_dict[new_key] = state_dict[key]
211                 del state_dict[key]
212         model.load_state_dict(state_dict)
213         model.classifier = None
214         features = model.features
215         features.block0 = nn.Sequential(features.conv0, features.norm0,
    features.relu0)
216
217         features.denseblock1 = nn.Sequential(*list(features.denseblock1))
218         features.transition1 = nn.Sequential(*list(features.transition1)[: -1])
219
220         features.denseblock2 = nn.Sequential(*list(features.denseblock2))
221         features.transition2 = nn.Sequential(*list(features.transition2)[: -1])
222
223         features.denseblock3 = nn.Sequential(*list(features.denseblock3))
224         features.transition3 = nn.Sequential(*list(features.transition3)[: -1])
225
226         features.denseblock4 = nn.Sequential(*(list(features.denseblock4) +
    [features.norm5]))
227         model.features = features
228         return model
229
230
231 class _DenseLayer(nn.Sequential):
232     def __init__(self, num_input_features, growth_rate, bn_size,
    drop_rate, dilation):
233         super(_DenseLayer, self).__init__()
234         self.add_module('norm1', nn.BatchNorm2d(num_input_features)),
235         self.add_module('relu1', nn.ReLU(inplace=True)),
236         self.add_module('conv1', nn.Conv2d(num_input_features, bn_size *
    growth_rate, kernel_size=1, stride=1, bias=False)),
237         self.add_module('norm2', nn.BatchNorm2d(bn_size * growth_rate)),
238         self.add_module('relu2', nn.ReLU(inplace=True)),
239         self.add_module('conv2', nn.Conv2d(bn_size * growth_rate,
    growth_rate,
240                                             kernel_size=3, stride=1, padding=dilation,
    bias=False, dilation=dilation)),
241         self.drop_rate = drop_rate
242
243     def forward(self, x):
244         new_features = super(_DenseLayer, self).forward(x)
245         if self.drop_rate > 0:
246             new_features = F.dropout(new_features, p=self.drop_rate,
    training=self.training)

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248         return torch.cat([x, new_features], 1)
249
250
251 class _DenseBlock(nn.Sequential):
252     def __init__(self, num_layers, num_input_features, bn_size,
253 growth_rate, drop_rate, dilation=1):
254         super(_DenseBlock, self).__init__()
255         for i in range(num_layers):
256             layer = _DenseLayer(num_input_features + i * growth_rate,
257 growth_rate, bn_size, drop_rate, dilation)
258             self.add_module('denselayer%d' % (i + 1), layer)
259
260 class _Transition(nn.Sequential):
261     def __init__(self, num_input_features, num_output_features):
262         super(_Transition, self).__init__()
263         self.add_module('norm', nn.BatchNorm2d(num_input_features))
264         self.add_module('relu', nn.ReLU(inplace=True))
265         self.add_module('conv', nn.Conv2d(num_input_features,
266 num_output_features,
267                                         kernel_size=1, stride=1,
268 bias=False))
269         self.add_module('pool', nn.AvgPool2d(kernel_size=2, stride=2))
270
271 class DenseNet(nn.Module):
272     r"""Densenet-BC model class, based on
273     `Densely Connected Convolutional Networks
274     <https://arxiv.org/pdf/1608.06993.pdf>`_
275
276     Args:
277         growth_rate (int) - how many filters to add each layer (`k` in
278 paper)
279         block_config (list of 4 ints) - how many layers in each pooling
280 block
281         num_init_features (int) - the number of filters to learn in the
282 first convolution layer
283         bn_size (int) - multiplicative factor for number of bottle neck
284 layers
285             (i.e. bn_size * k features in the bottleneck layer)
286         drop_rate (float) - dropout rate after each dense layer
287         num_classes (int) - number of classification classes
288
289     """
290     def __init__(self, growth_rate=32, block_config=(6, 12, 24, 16),
291 num_init_features=64, bn_size=4, drop_rate=0,
292 num_classes=1000,
293 is_downsamples=[True, True, True, True], dilations=[1,
294 1, 1, 1, 1]):
295         super(DenseNet, self).__init__()
296         self.is_downsamples = is_downsamples
297         self.dilations = dilations
298         # First convolution
299         self.features = nn.Sequential(OrderedDict([
300             ('conv0', nn.Conv2d(3, num_init_features, kernel_size=7,
301 stride=2, padding=3, bias=False)),
302             ('norm0', nn.BatchNorm2d(num_init_features)),
303             ('relu0', nn.ReLU(inplace=True)),
304             ('pool0', nn.MaxPool2d(kernel_size=3, stride=2, padding=1)),
305 ]))

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296
297     # Each denseblock
298     num_features = num_init_features
299     for i, num_layers in enumerate(block_config):
300         block = _DenseBlock(num_layers=num_layers,
301                             num_input_features=num_features,
302                             bn_size=bn_size, growth_rate=growth_rate,
303                             drop_rate=drop_rate, dilation=dilations[i])
304         self.features.add_module('denseblock%d' % (i + 1), block)
305         num_features = num_features + num_layers * growth_rate
306         if i != len(block_config) - 1:
307             trans = _Transition(num_input_features=num_features,
308                                 num_output_features=num_features // 2)
309             self.features.add_module('transition%d' % (i + 1), trans)
310             num_features = num_features // 2
311
312     # Final batch norm
313     self.features.add_module('norm5', nn.BatchNorm2d(num_features))
314
315     # Linear layer
316     self.classifier = nn.Linear(num_features, num_classes)
317
318     # Official init from torch repo.
319     for m in self.modules():
320         if isinstance(m, nn.Conv2d):
321             nn.init.kaiming_normal(m.weight.data)
322         elif isinstance(m, nn.BatchNorm2d):
323             m.weight.data.fill_(1)
324             m.bias.data.zero_()
325         elif isinstance(m, nn.Linear):
326             m.bias.data.zero_()
327
328     def forward(self, x):
329         x = self.features.block0(x) # 1/2
330
331         x = self.features.denseblock1(x)
332         x = self.features.transition1(x)
333
334         x = self.features.denseblock2(x)
335         x = self.features.transition2(x)
336
337         x = self.features.denseblock3(x)
338         x = self.features.transition3(x)
339
340         x = self.features.denseblock4(x)
341         return x
342
343 if __name__ == "__main__":
344     net = densenet169(pretrained=True).cuda()
345     pdb.set_trace()
346     x = torch.Tensor(2, 3, 256, 256).cuda()
347     sb = net(Variable(x))
348     pdb.set_trace()

```