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1 # Python packages used for this test. Feel free to use other packages, if
  needed.
2 import cv2
3 import numpy as np
4 from tensorflow import keras
5 from keras.models import Model, load_model
6 from keras.layers.core import Lambda
7 from keras.layers import Dropout, Input, concatenate
8 from keras.layers.convolutional import Conv2D, Conv2DTranspose
9 from keras.layers.pooling import MaxPooling2D
10 from keras.optimizers import Adam
11 from keras import backend as K
12 ##### 1 #####
13 # Load image (W0001_0001.png) in color.
14 # Load bin_image (W0002_0001.png) in color.
15 # Load bounding box file (XYCoordinates.txt)
16 # Format is (x1,x2,y1,y2)
17
18 #define image directory
19 load_dir = 'Load These Files/'
20
21 #load data into numpy arrays, in color by default
22 image = cv2.imread(load_dir + 'W0001_0001.png')
23 bin_image = cv2.imread(load_dir + 'W0002_0001.png')
24 file = np.loadtxt(load_dir + 'XYCoordinates.txt', dtype=float).astype(int)
25
26 ##### 2 #####
27 # Save full weld image with bounding boxes (append boxes to image)
28 # See: bound_test.png image for a smaller example.
29
30 #create copy of bound image
31 bound_image = image.copy()
32
33 #iterate through rows of file to place red bounding boxes at given
  coordinates
34 for f in file:
35     bound_image = cv2.rectangle(bound_image,(f[0],f[2]),(f[1],f[3]),
  (0,0,255),1)
36
37 #save bound images to working directory
38 cv2.imwrite('bound_image.png',bound_image)
39
40 ##### 3 #####
41 # Save cropped images from bounding box coordinates
42 # (Example initially withheld) See: cropped_test_{integer}.png images
43 # file.seek(0,0)
44
45 # iterate through file rows and crop images by given coordinates
46 for i,f in enumerate(file):
47     cropped_image = image[f[2]:f[3], f[0]:f[1], :]
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47 cropped_image = image[[12]:[15],[10]:[11],:]
48 # save cropped and numbered images to working directory
49 cv2.imwrite('cropped_image_{}.png'.format(i),cropped_image)
50
51 ##### 4 #####
52 # Load 4 cropped images one by one and put images in grayscale
53 # Then resize images using Bilinear Interpolation and save images.
54 # (Example initially withheld) See: resized_test_{integer}.png images
55
56 # iterate through the 4 previously saved cropped images to resize
57 # resized to (256,256) to allow for input to U-Net model below
58 for i in range(4):
59     cropped_image = cv2.imread('cropped_image_{}.png'.format(i), 0) # 0 for
    grayscale
60     resized_image = cv2.resize(cropped_image, (256, 256),
    interpolation=cv2.INTER_LINEAR)
61     #save resized images to working directory
62     cv2.imwrite('resized_image_{}.png'.format(i), resized_image)
63
64 ##### 5 #####
65 # Load 4 resized_test_{integer}.png images
66 # one by one and rotate 90 degrees clockwise and save images.
67 # (Example initially withheld)See: rotated_test_{integer}.png images
68
69 # iterate through the 4 previously saved resized images to rotate
70 for i in range(4):
71     resized_image = cv2.imread('resized_image_{}.png'.format(i), 0)
72     rotated_image = cv2.rotate(resized_image, cv2.ROTATE_90_CLOCKWISE)
73     # save rotated images to working directory
74     cv2.imwrite('rotated_image_{}.png'.format(i), rotated_image)
75
76 ##### 6 #####
77 # Turn temp_bin_image values from black/white to black/red.
78 # Ie, [[[0,0,0],[255,255,255],...]] to [[[0,0,0],[0,0,255],...]] when BGR.
79 # Get max of "image" and "temp_bin_image" together to show defect overlay and
    save image.
80 # See: red_overlay.png image
81
82 # create copy of bin_image for manipulation
83 temp_bin_image = bin_image.copy()
84
85 #replace all white pixels with red
86 temp_bin_image[temp_bin_image[:, :, 2]==255] = [0,0,255]
87
88 # superimpose and output maximum of image and temp_bin
89 red_overlay = np.maximum(temp_bin_image,image)
90
91 # save red_overlay image to working directory
92 cv2.imwrite('red_overlay.png',red_overlay)
93

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94 ##### / #####
95 # Show an example of: (AB)T = (BT)(AT)
96 A = np.array([[1,2,3,4], [5,6,7,8], [9,10,11,12]])
97 B = np.array([[1,2,3], [4,5,6], [7,8,9], [10,11,12]])
98
99 # transpose matrix multiplcation product of A and B
100 left_side = np.dot(A,B).T
101
102 # matrix multiplication product of transpose(B) and transpose(A)\
103 # by definition of tranpose multiplication identity
104 right_side = np.dot(B.T,A.T)
105 print(np.equal(left_side, right_side))
106
107 ##### 8 #####
108
109 # convolution layers: CXX, max pooling layers: PXX, upscaling layers: UXX
110 def build_model(input_layer, start_filters, start_kernal_size):
111     C1 =
112     Conv2D(start_filters,start_kernal_size,padding='same',activation='relu')
113     (input_layer)
114     C2 =
115     Conv2D(start_filters,start_kernal_size,padding='same',activation='relu')(C1)
116     P1 = MaxPooling2D(pool_size=(2,2))(C2)
117     C3 =
118     Conv2D(2*start_filters,start_kernal_size,padding='same',activation='relu')
119     (P1)
120     C4 = Conv2D(2*start_filters, start_kernal_size,padding='same',
121     activation='relu')(C3)
122     P2 = MaxPooling2D(pool_size=(2,2))(C4)
123     C5 =
124     Conv2D(4*start_filters,start_kernal_size,padding='same',activation='relu')
125     (P2)
126     C6 = Conv2D(4*start_filters, start_kernal_size,padding='same',
127     activation='relu')(C5)
128     P3 = MaxPooling2D(pool_size=(2,2))(C6)
129     C7 = Conv2D(4*start_filters, start_kernal_size,padding='same',
130     activation='relu')(P3)
131     C8 = Conv2D(4*start_filters, start_kernal_size,padding='same',
132     activation='relu')(C7)
133     U1 =
134     Conv2DTranspose(4*start_filters,start_kernal_size,padding='same',strides=
135     (2,2))(C8)
136     U1 = Dropout(0.1)(concatenate([U1,C6]))
137     C9 =
138     Conv2D(2*start_filters,start_kernal_size,padding='same',activation='relu')
139     (U1)
140     C10 =
141     Conv2D(2*start_filters,start_kernal_size,padding='same',activation='relu')
142     (C9)
143     U2 = Conv2DTranspose(2*start_filters, start_kernal_size,padding='same',

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strides=(2, 2))(C10)
127     U2 = Dropout(0.1)(concatenate([U2, C4]))
128     C11 = Conv2D(start_filters, start_kernal_size,padding='same',
activation='relu')(U2)
129     C12 = Conv2D(start_filters, start_kernal_size,padding='same',
activation='relu')(C11)
130     U3 = Conv2DTranspose(start_filters, start_kernal_size,padding='same',
strides=(2, 2))(C12)
131     U3 = Dropout(0.1)(concatenate([U3, C2]))
132     C13 = Conv2D(start_filters, start_kernal_size,padding='same',
activation='relu')(U3)
133     C14 = Conv2D(start_filters, start_kernal_size,padding='same',
activation='relu')(C13)
134     output_layer = Conv2D(1, start_kernal_size,padding='same',
activation='sigmoid')(C14)
135
136     model = Model(input_layer, output_layer)
137     model.compile(optimizer=Adam(learning_rate=1e-4),
loss='binary_crossentropy')
138     return model
139
140 if __name__ == '__main__':
141     input_img = np.expand_dims(cv2.imread('resized_image_1.png',0),axis=2)
142     input = Input((np.shape(input_img)))
143     input_layer = Lambda(lambda input_img: input_img / 255)(input)
#normalized input data
144     model = build_model(input_layer=input_layer, start_filters=112,
start_kernal_size=3)
145     model.save('U-Net')
146     print(model.summary())
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