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import cv2
import numpy as np
import tensorflow as tf
def get_last_conv_layer(model):
  Returns the last conv layer of a given model.
  Returns the last layer of a given model with "conv" in name.
  :param keras_model model: The model in which a conv layer is searched for
  :return: Last concolution layer in model or None if there no conv layer is found
  :rtype: layer or None
  111
  all_conv_layers = [layer for layer in model.layers if "conv" in layer.name]
  if (len(all_conv_layers) == 0):
    return None
  last_conv_layer = all_conv_layers[-1]
  return last_conv_layer
def grad_cam(model, x, class_index= None):
  111
  Returns a grad-CAM heat map.
```

Returns a grad-CAM heat map for a given image x in relation to one class (class_index) for a given model.

```
:param keras model model: The model to calculate the heatmap for
:param np x: The image to calculate the heatmap for
:param int class index: The class index to calculate the heat map in relation to
:return: grad-CAM heat map
:rtype: np
111
x = np.expand_dims(x, axis=0)
x = tf.Variable(x, dtype=float)
last_conv_layer = get_last_conv_layer(model)
# First, we create a model that maps the input image to the activations
# of the last conv layer as well as the output predictions
grad_model = tf.keras.models.Model(
  [model.inputs], [last conv layer.output, model.output]
)
# Then, we compute the gradient of the top predicted class for our input image
# with respect to the activations of the last conv layer
with tf.GradientTape() as tape:
  last_conv_layer_output, preds = grad_model(x)
  if class index is None:
    class_index = tf.argmax(preds[0])
  class channel = preds[:, class index]
# This is the gradient of the output neuron (top predicted or chosen)
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# with regard to the output feature map of the last conv layer
grads = tape.gradient(class_channel, last_conv_layer_output)
# This is a vector where each entry is the mean intensity of the gradient
# over a specific feature map channel
pooled_grads = tf.reduce_mean(grads, axis=(0, 1, 2))
# We multiply each channel in the feature map array
# by "how important this channel is" with regard to the top predicted class
# then sum all the channels to obtain the heatmap class activation
last_conv_layer_output = last_conv_layer_output[0]
heatmap = last_conv_layer_output @ pooled_grads[..., tf.newaxis]
heatmap = tf.squeeze(heatmap)
# For visualization purpose, we will also normalize the heatmap between 0 & 1
heatmap = tf.maximum(heatmap, 0) / tf.math.reduce_max(heatmap)
# Resize the heatmap to the size of the input image
heatmap = cv2.resize(heatmap.numpy(), (x.shape[2],x.shape[1]))
return heatmap
```