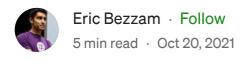
Bayer capture and processing with the Raspberry Pi HQ camera in Python



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We've already seen how to capture images with the Raspberry Pi HQ camera <u>via the</u> <u>command line</u>. In this tutorial, we will see how to do it with Python. Moreover, we'll also see how to capture raw sensor (Bayer filter) data, and how to reconstruct an RGB image from it.



Before you start:

- Your Raspberry Pi should be <u>flashed</u> with **Buster OS** as Bullseye does not support the Python package (<u>picamerax</u>) used to interface with the camera!
- A lens should be fitted and focused; we'll use a 6mm CS-mount lens as shown here.

Image capture in Python

In a <u>previous tutorial</u>, we saw how to capture images with the Raspberry Pi HQ camera via the command line.

For automation purposes, it may be of interest to trigger acquisitions from a scripting language such as Python. To this end, the library <u>PiCameraX</u> provides some useful functionality in order to configure camera settings (e.g. resolution, frame rate, exposure, ISO, etc).

PiCameraX can be installed via pip (note that the package requires Python 3.2 or above):

```
pip install picamerax
```

The following script captures an image to a file.

If you're working remotely, you can copy over the file as such:

```
scp pi@raspberrypi.local:/home/pi/test.jpg .
```

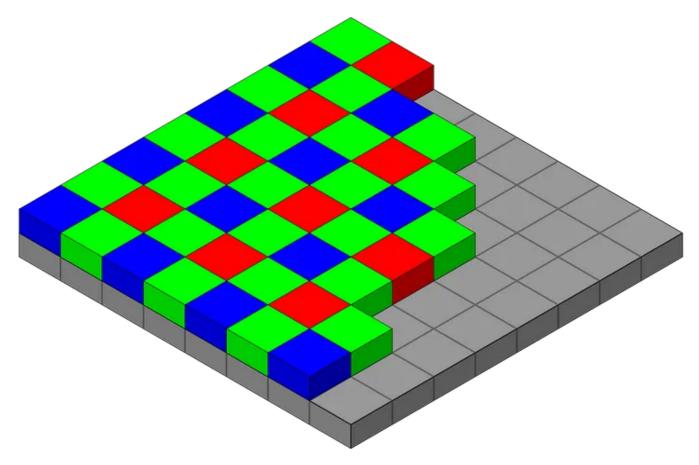


And that's it! Different recipes can be found on the PiCameraX documentation page (<u>basic</u> and <u>advanced</u>).

Capturing Bayer data via Python

For the rest of this tutorial, we will focus on Bayer data capture, for which PiCameraX offers some <u>functionality</u>. Bayer data is the raw data measured by the camera sensor before any GPU processing: demosaicing, color balancing, vignette compensation, smoothing, down-scaling, etc. <u>Wikipedia</u> provides a good overview about Bayer data / filters. For certain applications, we may require the raw Bayer data, as it has minimal non-linear processing and we can have full control over any subsequent processing.

A Bayer filter consists of a grid of red, green, and blue pixels with twice as many green pixels. On the HQ camera, the pixels are arranged in a BGGR pattern, as shown below.



Source: https://en.wikipedia.org/wiki/Bayer_filter#/media/File:Bayer_pattern_on_sensor.svg

That means if you were to simply extract the red, green, and blue channels from the Bayer data in order to form an RGB image, the resulting image would be too green. Interpolation methods can be used to combine the different pixel values in order to create a more natural-looking image. This process of building a full color image from a color filter array (CFA) such as Bayer is known as <u>demosaicing</u>.

PiCameraX has a <u>recipe</u> for capturing the Bayer data and demosaicing, which we've modified below to have the image as a PNG file.

```
import picamerax
     import picamerax.array
     import numpy as np
     from PIL import Image
5
     with picamerax.PiCamera() as camera:
7
         with picamerax.array.PiBayerArray(camera) as stream:
             camera.capture(stream, 'jpeg', bayer=True)
             output = (stream.demosaic() >> 2).astype(np.uint8)
9
             img = Image.fromarray(output)
10
             img.save("test_bayer.png")
11
bayer_capture.py hosted with \heartsuit by GitHub
                                                                                                view raw
```



Not so great 😟

The purple traces seem to be indicative of clipping, and we still need <u>color</u> <u>balancing</u> in order to adjust red, green, and blue levels appropriately. PiCameraX doesn't offer such functionality so we will show how to do this in order to get a natural-looking image, as well as deal with clipping.

From Bayer to RGB

We'll have quite a few differences and additions compared to the PiCameraX recipe. Specifically we will:

- Collect uint16 data as the HQ camera supports 12 bit raw data. Moreover, we need to use OpenCV in order to save 16 bit RGB data. Note that OpenCV expects channels in the BGR format.
- Use OpenCV's demosaicing algorithm, which uses bilinear interpolation (bottom of <u>these docs</u>). Note that OpenCV also has a particular way to define <u>Bayer filter patterns</u>, using the second row, second and third column sub-pixels colors to define the layout. So the conversion for our case is <u>COLOR BayerRG2RBG</u>.

- Apply color balancing using red and blue gains estimated by the Raspberry Pi's AWB (automatic white balance) algorithm. More info on this can be found in Section 5.7 of their documentation.
- Apply a color correction matrix (CCM), Section 5.11 of the <u>Raspberry Pi camera documentation</u>.

This recipe, largely inspired by <u>this blog</u> (which also provides the black level to subtract and the CCM values), can be found below.

```
1
    from time import sleep
 2
    import picamerax
 3
    import picamerax.array
 4
    import numpy as np
     import cv2
 5
 6
 7
 8
     camera = picamerax.PiCamera()
 9
10
     # get gains for white balancing
     sleep(2)
11
12
     awb_gains = camera.awb_gains
13
     camera.awb mode = "off"
14
     camera.awb_gains = awb_gains
15
16
     # perform capture
     stream = picamerax.array.PiBayerArray(camera)
17
     camera.capture(stream, "jpeg", bayer=True)
18
19
20
    # get raw Bayer data
    n bits = 12
21
     output = np.sum(stream.array, axis=2).astype(np.uint16)
22
23
24
     # demosaicing
25
     rgb = cv2.cvtColor(output, cv2.COLOR_BayerRG2RGB)
26
27
     # subtract black level
    black_level = 256.3
28
     rgb = rgb - black_level
29
30
31
     # white balance
     rgb[:, :, 0] *= float(awb_gains[0])
32
     rgb[:, :, 2] *= float(awb gains[1])
33
34
35
     # color correction
36
    M = np.array(
         [
37
            [2.0659, -0.93119, -0.13421],
38
            [-0.11615, 1.5593, -0.44314],
39
40
             [0.073694, -0.4368, 1.3636],
         1
41
42
     rgb_flat = rgb.reshape(-1, 3, order="F")
43
     rgb = (rgb_flat @ M.T).reshape(rgb.shape, order="F")
44
45
46
     # clip
     rgb = rgb / (2 ** n_bits - 1 - black_level)
47
1 Q
     ngh[ngh \ 1] = 1
```

Running the above recipe, we would...still not get an natural-looking image.



Perceptual adjustments

There are two reasons behind this very dark image:

- Our image data is 12 bit but we are storing it as 16 bits so we are not using the full dynamic range.
- Our eyes do not perceive light the way cameras do, i.e. we perceive light in a non-linear fashion as shown below.



Source: https://www.cambridgeincolour.com/tutorials/gamma-correction.htm

In order to account for this perception mismatch, we need to apply gamma correction and normalize before visualizing the image.

Applying solely normalization produces a much more pleasing image.

```
import cv2
 1
 2
    from PIL import Image
     import numpy as np
 3
     # need OpenCV to open 16 bit RGB
 5
 6 fp = "test_bayer_corrected.png"
     img = cv2.imread(fp, cv2.IMREAD_UNCHANGED)
     img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
 8
     # normalize and save
10
     img_float = img / img.max()
11
     data = 255 * img_float
12
     img_uint8 = data.astype(np.uint8)
13
     Image.fromarray(img_uint8).save("normalized.png")
save_normalized_image.py hosted with 💙 by GitHub
                                                                                            view raw
```



But the image is still rather dark, and the colors don't match our real world perception.

Gamma correction will remedy this discrepancy. To this end, there are some <u>simple</u> <u>approaches</u>, but we will use the <u>Rec. 709 standard</u>:

```
import cv2
 1
 2
    from PIL import Image
 3
     import numpy as np
 4
 5
 6
    def gamma_correction(vals, gamma=2.2):
 7
        cc = 0.018
         inv_gam = 1 / gamma
 8
         clip_val = (1.099 * np.power(cc, inv_gam) - 0.099) / cc
 9
         return np.where(vals < cc, vals * clip_val, 1.099 * np.power(vals, inv_gam) - 0.099)</pre>
10
11
12
13
    # need OpenCV to open 16 bit RGB
    fp = "test_bayer_corrected.png"
14
     img = cv2.imread(fp, cv2.IMREAD_UNCHANGED)
15
     img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
16
     img = gamma_correction(img, gamma=2.2)
17
18
    # normalize and save
19
    img_float = img / img.max()
20
    data = 255 * img_float
21
22
     img_uint8 = data.astype(np.uint8)
23
     Image.fromarray(img_uint8).save("gamma_corrected.png")
```

save_gamma_corrected_image.py hosted with \heartsuit by GitHub

view raw

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That looks much better

Extra links

Official post by Raspberry Pi: https://www.raspberrypi.com/news/processing-raw-image-files-from-a-raspberry-pi-high-quality-camera/

Stolls with my Dog has also done a very thorough analysis of the HQ camera performance: https://www.strollswithmydog.com/pi-hq-cam-sensor-performance/

Getting raw Bayer data without PiCameraX on the Bullseye OS: https://www.raspberrypi.com/documentation/accessories/camera.html#raw-image-capture

Bayer Python Raspberry Pi Color Correction Gamma Correction





Written by Eric Bezzam

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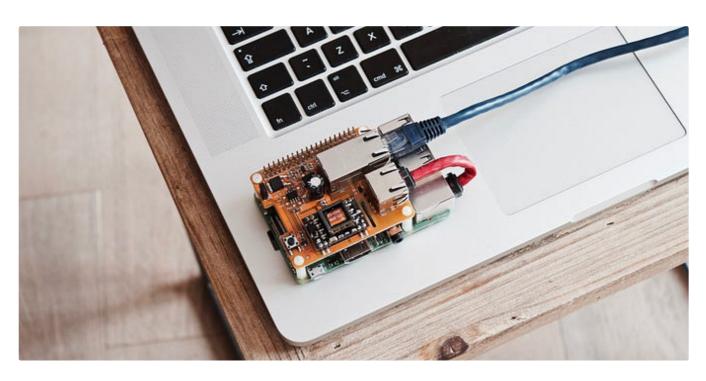
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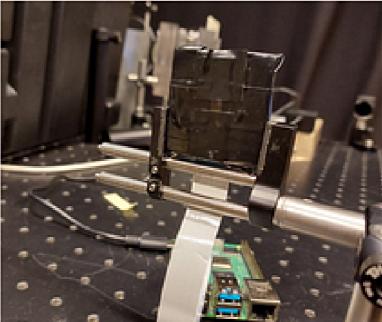
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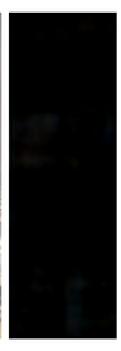




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A complete lensless imaging tutorial - hardware, software and algorithms

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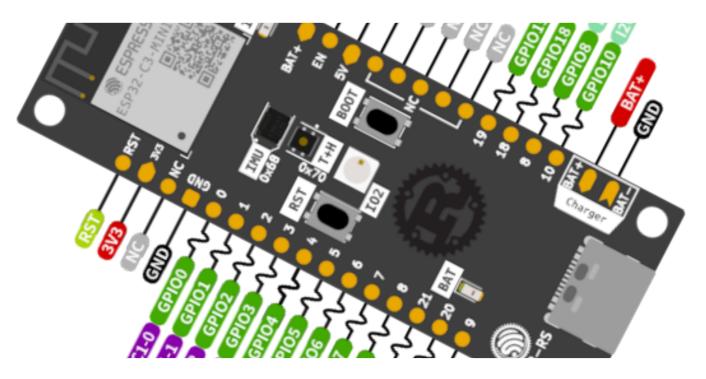




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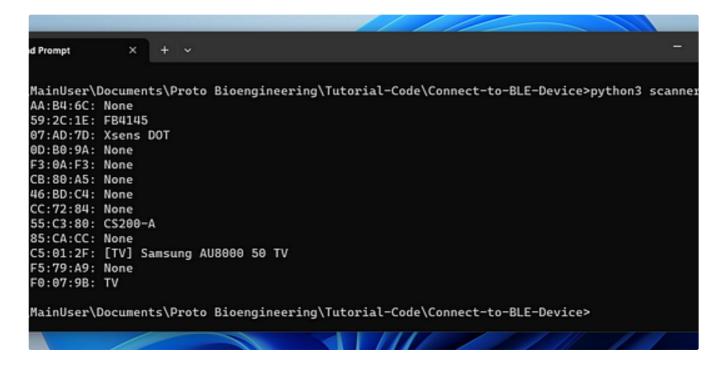
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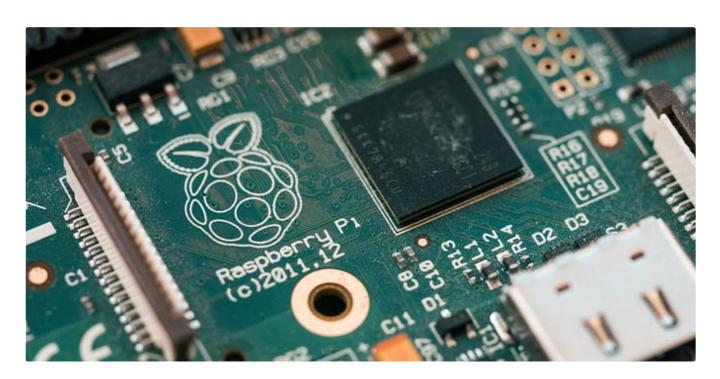
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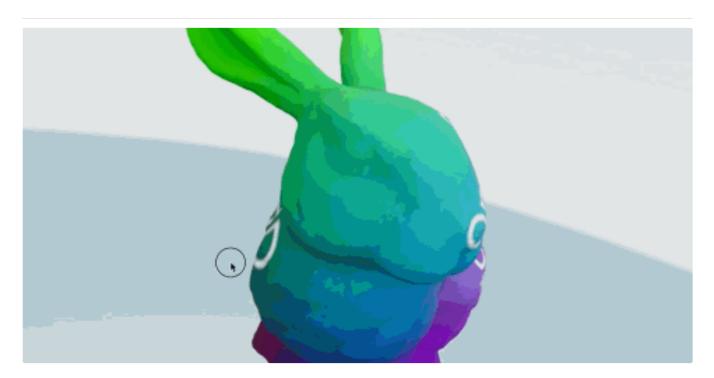
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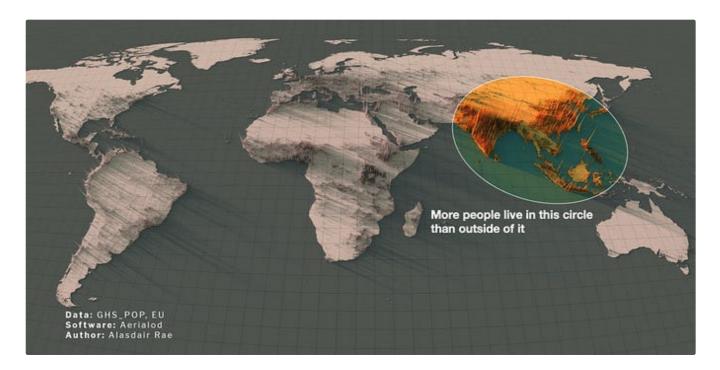
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