

# Workshop Notebook 3: Process a Single Image with Pillow

## Mandatory Disclosures

1. This is a whirlwind introduction, not exhaustive instruction
2. All images are by courtesy of the University Archives at Texas State University: <http://www.univarchives.txstate.edu> (<http://www.univarchives.txstate.edu>)
3. img\_qc\_workshop is licensed under the GNU General Public License v3.0, [https://github.com/photosbyjeremy/img\\_qc\\_workshop/blob/master/LICENSE](https://github.com/photosbyjeremy/img_qc_workshop/blob/master/LICENSE) ([https://github.com/photosbyjeremy/img\\_qc\\_workshop/blob/master/LICENSE](https://github.com/photosbyjeremy/img_qc_workshop/blob/master/LICENSE))
4. *Any and all code provided is done so without any warranty or expectation of support by Jeremy Moore, Todd Peters, or Texas State University*

```
In [ ]: # import necessary modules
        from pathlib import Path
        from PIL import Image
        import matplotlib.pyplot as plt
        import img_qc.img_qc as img_qc
```

```
In [ ]: # matplotlib options

        # magic that lets us plot directly in the notebook
        %matplotlib inline

        # parameters for matplotlib to increase our default figure size -- NOTE: figure sizes are in INCHES
        plt.rcParams["figure.figsize"] = (20, 12) # set as needed for your screen and eyes (width, height)

        # on a high-dpi monitor this will increase the quality of plots on-screen
        %config InlineBackend.figure_format = 'retina'
```

```
In [ ]: # set current_directory with Path function cwd() [Current Working Directory]
        current_directory = Path.cwd()

        # path to access our image
        image_path = current_directory.joinpath('data/workshop-3/AS-36-T4-E9-1943-c2_0002.tif')

        print(f'current_directory: {current_directory}')
        print(f'image_path: {image_path}')
```

```
In [ ]: # open image with Pillow
        image = Image.open(image_path)

        # display image with Matplotlib
        plt.imshow(image)
```

## Rotate Image

```
In [ ]: # rotate image 23 degrees clockwise
        rotated_image = image.rotate(-23) # negative angle is Clockwise

        # show rotated image
        plt.imshow(rotated_image)
```

## Interpolation

Rotating in anything other than 90 degree increments will result in the interpolation of pixel data -- the computer has to make up new tones. There are different algorithms available for interpolation while rotating and there's a trade-off between performance (how intensive the calculations are) and quality.

shift+tab keyboard shortcut will show options

Performance < ---- > Quality

- Nearest Neighbor <> Bilinear <> Bicubic

Always TEST and VERIFY which algorithm is right for your use case.

<http://pillow.readthedocs.io/en/5.1.x/handbook/concepts.html#filters> (<http://pillow.readthedocs.io/en/5.1.x/handbook/concepts.html#filters>)

```
In [ ]: # rotate with higher quality interpolation and expand size to not crop
        rotated_image = image.rotate(-23, resample=Image.BICUBIC, expand=True) # negative angle is Clockwise

        # show rotated image
        plt.imshow(rotated_image)
```

## Resize with Image.resize()

```
In [ ]: # resize image
        image_resized = image.resize((500, 500)) # (width, height)

        # show resized image
        plt.imshow(image_resized)
```

## Resize with image.thumbnail() WARNING!!

```
In [ ]: # create a copy of our image as Image.thumbnail() MODIFIES THE IMAGE IN-PLACE
        thumbnail = image.copy()

        # resize the image with thumbnail
        thumbnail.thumbnail((500,500))

        # show the resized image
        plt.imshow(thumbnail)
```

## Resize with img\_qc.get\_image\_resized\_pillow()

```
In [ ]: # resize image
        image_resized = img_qc.get_image_resized_pillow(image, width=500) # (width, height)

        # show resized image
        plt.imshow(image_resized)
```

## Jupyter Magic: %timeit

Compare the speed of 3 different interpolation settings for rotate on image\_resized

```
In [ ]: # create resample dictionary with names and Pillow resize methods
        resample_dictionary = {'Nearest Neighbor': Image.NEAREST, 'Bilinear 2x2': Image.BILINEAR, 'Bicubic 4x4': Image.BICUBIC}

        for name in resample_dictionary:

            print(name)

            # get resample_method by accessing the resample_dictionary with the key `name`
            resample_method = resample_dictionary[name]

            # call magic %timeit to time this line in our loop
            %timeit rotated_image = image_resized.rotate(-23, resample=resample_method, expand=True) # negative angle is Clockwise
```

## Crop

As previously mentioned, digital images are graphs of pixels channels and intensities in a 2D plane.

The graph's origin (0, 0) is the starting point of the image and the x-value increases with each pixel of width.

Even though we're technically graphing into negative y-values, the y-value increases with each pixel of height and extends BELOW the image.

We will use this coordinate system to crop our image.

<http://pillow.readthedocs.io/en/5.1.x/handbook/concepts.html#coordinate-system>  
(<http://pillow.readthedocs.io/en/5.1.x/handbook/concepts.html#coordinate-system>)

```

In [ ]: # Pillow needs a box with upper-left (x, y) values and lower-right (x, y) values to crop an image
image_cropped = image.crop(box=(0, 0, 500, 500)) # start in upper-left and go right 500 pixels, down 500
pixels

plt.imshow(image_cropped)

In [ ]: # show image
plt.imshow(image)

In [ ]: # crop image around page and color bar
image_cropped = image.crop(box=(2450, 800, 6450, 6000))

# print width & height
print(f'width: {image_cropped.size[0]}') # (width, height)
print(f' height: {image_cropped.size[1]}')

# show image
plt.imshow(image_cropped)

```

## Channels

Our RGB image has 3 color channels that we can access using Pillow

```

In [ ]: # split into separate channels
red_channel, green_channel, blue_channel = image_cropped.split()

figure, (red, green, blue) = plt.subplots(ncols=3, figsize=(18, 8)) # figsize is (width, height) in inches

red.imshow(red_channel)
red.set_title("Red Channel")

green.imshow(green_channel)
green.set_title("Green Channel")

blue.imshow(blue_channel)
blue.set_title("Blue Channel")

# some Matplotlib code that draws subplots close together while padding axes so they don't overlap
plt.tight_layout()

In [ ]: # Let's crop our cropped image down to the color bar to better see our different color channels
color_bar = image_cropped.crop(box=(0, 4600, 4000, 5200))

plt.imshow(color_bar)

In [ ]: # split into separate channels
red_channel, green_channel, blue_channel = color_bar.split()

figure, (color, red, green, blue) = plt.subplots(nrows=4, figsize=(20, 15)) # figsize is (width, height)
in inches

color.imshow(color_bar)
# Matplotlib code to remove the tick marks on the respective x- and y-axis
color.set_xticks([]), color.set_yticks([])
color.set_title("RGB Image")

red.imshow(red_channel)
red.set_xticks([]), red.set_yticks([])
red.set_title("Red Channel")

green.imshow(green_channel)
green.set_xticks([]), green.set_yticks([])
green.set_title("Green Channel")

blue.imshow(blue_channel)
blue.set_xticks([]), blue.set_yticks([])
blue.set_title("Blue Channel")

#plt.tight_layout()

```

## Convert to Grayscale

<http://pillow.readthedocs.io/en/5.1.x/handbook/tutorial.html?highlight=convert#color-transforms>

<http://pillow.readthedocs.io/en/5.1.x/handbook/tutorial.html?highlight=convert#color-transforms>

When converting from color to grayscale a choice is made on how much to weigh the intensity of each color band on each pixel. By default, Pillow uses the ITU-R 601-2 luma transform:

$$L(\text{luminance}) = \text{Red} * 299/1000 + \text{Green} * 587/1000 + \text{Blue} * 114/1000$$

<http://pillow.readthedocs.io/en/5.1.x/reference/Image.html#PIL.Image.Image.convert>

```
In [ ]: # convert image to grayscale
        image_grayscale = color_bar.convert(mode='L')

        # parameters for matplotlib to increase our default figure size -- NOTE: figure sizes are in INCHES
        plt.rcParams["figure.figsize"] = (20,12) # set as needed for your screen and eyes (width, height)

        # show grayscale image
        plt.imshow(image_grayscale)
```

## Convert to Bitonal with Image.convert()

When converting from color (RGB) or grayscale (L) to Bitonal (1) using Image.convert the default is to use the Floyd-Steinberg dither, which we DON'T want if we're converting images for OCR

We can alternatively set the dither to Image.NONE, but this just converts non-zero to white according to the documentation.

```
In [ ]: # convert image to bitonal with Floyd-Steinberg dithering
        image_bitonal_floyd_steinberg = image_grayscale.convert(mode='1')

        # convert image to bitonal with no dithering
        image_bitonal_no_dithering = image_grayscale.convert(mode='1', dither=Image.NONE)

        plt.figure()
        # show bitonal image with Floyd-Steinberg dithering
        plt.imshow(image_grayscale)

        plt.figure()
        # show bitonal image with Floyd-Steinberg dithering
        plt.imshow(image_bitonal_floyd_steinberg)

        plt.figure()
        # show bitonal image with no dithering
        plt.imshow(image_bitonal_no_dithering)
```

## The documentation is wrong

If you look at our third image with dither=Image.NONE, it actually looks like it used a 50% threshold. Values up to 50% of the intensity range round down to 0 (black) and those above 50% round up to 255 (white).

## Convert to Bitonal with Image.point()

We can convert our image to bitonal and choose a threshold using the Image.point() function.

Image.point() does something to every pixel in the image. We can set a threshold value and use lambda with point to process each pixel in the image.

```
In [ ]: # set threshold value on 0-255 scale
        threshold = 85

        # threshold image where every pixel with value
        image_bitonal_85 = image_grayscale.point(lambda pixel: pixel > threshold and 255)

        plt.figure()
        # show image
        plt.imshow(image_bitonal_85)

        # set threshold value on 0-255 scale
        threshold = 120

        # threshold image where every pixel with value
        image_bitonal_120 = image_grayscale.point(lambda pixel: pixel > threshold and 255)
```

```
plt.figure()
# show image
plt.imshow(image_bitonal_120)
```

## Process Page into Bitonal

```
In [ ]: # crop scan down to the page
        image_page_crop = image_cropped.crop(box=(300, 125, 3800, 4600))

        # convert to grayscale
        image_page_gray = image_page_crop.convert(mode='L')

        # set threshold value
        threshold = 185

        # convert to bitonal with Image.point() method
        image_page_bitonal = image_page_gray.point(lambda pixel: pixel > threshold and 255)

        # show image
        plt.imshow(image_page_bitonal)
```