

## Assignment: enhancement and superresolution

Code the assignment by yourself. Ask if you need help. Plagiarism is not tolerated.

### 1 Introduction

#### 1.1 Goal

To have the students implementing their first pixel and histogram-based enhancement methods as well as present the concept of superresolution for the first time.

#### 1.2 Task

In this assignment you have to implement 3 distinct image enhancement techniques, as well as a superresolution method based on multiple views of the same image. Students are required to use `python 3` and the libraries `numpy` and `imageio` to complete the task.

Follow the instructions carefully.

Load the `imageio` library by using the following command to avoid an unnecessary warning message:

```
import imageio.v3 as imageio
```

Also, please **do not import** the library `matplotlib` when submitting your assignment. You can just comment the line that imports it. Note that `run.codes` does not have a graphical interface to run your code.

1. Find and load all low resolution images  $l_i \in L$  that match the basename `imglow` (i.e. filenames that start with `imglow`)
2. Apply the selected enhancement method  $F$  to all low resolution images, using parameter  $\gamma$  when appropriate
3. Combine the low resolution images into a high resolution version  $\hat{H}$
4. Compare  $\hat{H}$  against reference image  $H$  using Root Mean Squared Error (RMSE)

#### 1.3 Input Parameters

The following parameters will be input to your program in the following order through `stdin`, as usual for `run.codes`:

1. basename `imglow` for low resolution images  $l_i \in L$ . The basename references the start of the filenames for 4 low resolution images  $l_1, l_2, l_3, l_4$ .<sup>1</sup>
2. filename `imghigh` for the high resolution image  $H$
3. enhancement method identifier  $F$  (0, 1, 2 or 3)
4. enhancement method parameter  $\gamma$  for  $F = 3$

## 2 Image Enhancement

There are three options for Image Enhancement, with Option 0 indicating that no enhancement is to be done:

**Option 0: No Enhancement** : Do not apply any enhancement technique to the image and instead skip to the superresolution step.

Options 1 and 2 are histogram-based methods while Option 3 uses pixel-based Gamma correction.

### 2.1 Histogram-based Enhancement

You should implement two methods of Histogram Equalization and apply them to all low resolution images  $L$ . For Option 1 you should use the cumulative histogram of each image as the transform function for your image, as presented in class. For Option 2 however you should compute the cumulative histogram based on all images in the  $L$  set *together* (as if they were a single image), and then use it as the transform function.

**Option 1: Single-image Cumulative Histogram** : Compute the Cumulative Histogram  $hc(l_i)$  for each image  $l_i \in L$  and use it as a transform function to equalize the histogram of each image

**Option 2: Joint Cumulative Histogram** : Compute a single Cumulative Histogram  $hc(L)$  over all images in  $L$  and use it as a transform function to equalize each image

### 2.2 Gamma Correction

**Option 3: Gamma Correction Function** : Implement the pixel-wise enhancement function called Gamma Correction, using the following:

$$\hat{L}_i(x, y) = \left\lfloor 255 \cdot \left( (L_i(x, y) / 255.0)^{1/\gamma} \right) \right\rfloor,$$

where  $\hat{L}_i$  is the resulting image and  $\gamma$  is a parameter input by the user as described in Sec 1.3.

---

<sup>1</sup>They are all .png files and follow the pattern `[imglow]1.png`, `[imglow]2.png`, `[imglow]3.png` e `[imglow]4.png`

### 3 Superresolution

Let's assume that each of the low resolution images  $L$  is a different “view” of the exact same scene. We can use those images (post enhancement) to compose a higher resolution version  $\hat{H}$  (to simplify our task, this higher resolution will always be double the original). We propose a very simple composition method, as in the example below:

$$l_1 = \begin{bmatrix} 100 & 101 \\ 110 & 111 \end{bmatrix}, l_2 = \begin{bmatrix} 200 & 201 \\ 210 & 211 \end{bmatrix}, l_3 = \begin{bmatrix} 300 & 301 \\ 310 & 311 \end{bmatrix}, l_4 = \begin{bmatrix} 400 & 401 \\ 410 & 411 \end{bmatrix}$$

$$\hat{H} = \begin{bmatrix} 100 & 300 & 101 & 301 \\ 200 & 400 & 201 & 401 \\ 110 & 310 & 111 & 311 \\ 210 & 410 & 211 & 411 \end{bmatrix}$$

Even though it is simple, this method can yield impressive results on some images. You can assume the resolution of reference image  $H$  (and your version  $\hat{H}$ ) will be double the resolution of the images  $L$  and that images  $L$  will always share the same resolution.

### 4 Comparing against reference

Your program must compare your enhanced image  $\hat{H}$  against reference image  $H$ . This comparison must use the root mean squared error (RMSE). Print this error in the screen, rounding to 4 decimal places.

$$\mathcal{L}_{RMSE}(H, \hat{H}) = \sqrt{\frac{\sum_i \sum_j (H(i, j) - \hat{H}(i, j))^2}{N \cdot N}}$$

where  $N \times N$  is the resolution of images  $H$  and  $\hat{H}$ .

### Better Superresolution Methods

Your evaluation will take into consideration the results expected by the superresolution method suggested for this assignment (in Sec. 3); this method is however very simple, so you can, to learn more and for fun, look for and implement better post-processing or pixel composition methods that yield better RSME results. If it decreases the error more than the suggested method, you are good to go!

### 5 Input and Output

**Input Example 01:** Low resolution images  $L$  `boat1.png`, `boat2.png`, `boat3.png`, `boat4.png`; High resolution reference image  $H$  `boathigh.png`; Enhancement method  $F = 2$  (joint cumulative histogram); Parameter  $\gamma$  is ignored and can be anything:

```
boat
boathigh
2
1
```

**Output Example 01:** Just the RSME result with 4 decimal points:

10.1864

## 6 Submission

Submit your source code to <https://runcodes.icmc.usp.br> (only the .py file).

1. **Use your USP number as the filename for your code.**
2. **Include a header.** Use a header with name, USP number, course code, year/semester and the title of the assignment. A penalty on the evaluation will be applied if your code is missing the header.
3. **Comment your code.** For any computation that is not obvious from function names and variables, add a comment explaining.
4. **Organize your code in programming functions.** Use one function for each enhancement method and a separate function for your superresolution method.