



Python Exercise

Digital Systems M, Module 2
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Python Exercise

In this lecture, we will play with Python libraries studied so far.

The main goal is to understand how carefully thought design choices impact on **efficiency**. You can either try on your own workstation (desktop or laptop), or on a **real embedded device** (NVIDIA Jetson Nano)



Python Exercise

If you want to check how efficient your code is on the NVIDIA Jetson Nano:

1) import the time package in your script and wrap your code as follows:

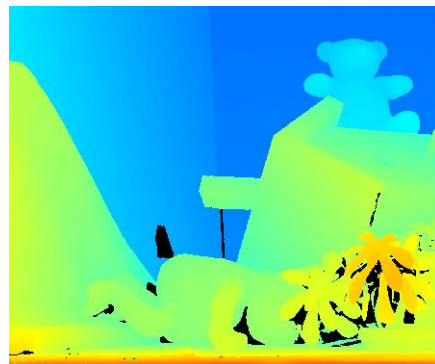
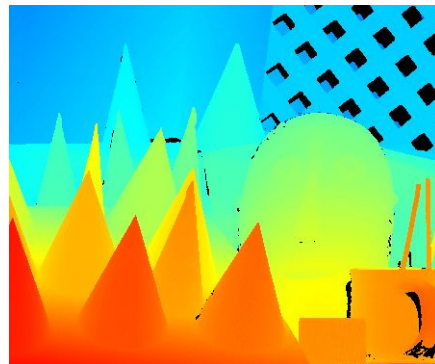
```
import time
start = time.time()
# your code ...
end = time.time()
print("Time elapsed: %f"%(start-end))
```

2) collect your code in a folder named “*YourSurname*” and send it over scp to:

```
scp -r YourSurname exercise@sisdigitali.ddns.net:/home/exercise/  
(password: sisdigitali2122)
```

(the board will be online only during this lecture)

Case study: Stereo depth estimation



Python Exercise

Some basics:

1) Stereo depth estimation is based solving **pixel matching** across two images.



2) Given a left and a right image, any pixel in the former will appear **shifted on its left** in the latter. This shift is called **disparity**.

3) Depth and disparity are linked by inverse proportionality

$$z \sim 1/d$$

Python Exercise

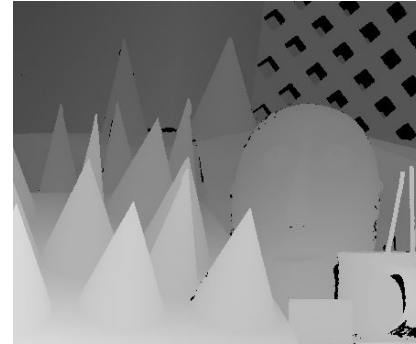
How to match pixels:

1) Two pixels on the two images match when they have the same **color** (to make it easier, we work on **grayscale** images)



2) For each pixel A on the left image, we look for D pixels on the right image and look for the **most similar one** B (basically, the one with the lowest color difference). The disparity of A is the difference between x coordinates of A and B.

3) After this is carried out for any pixel, we can draw a **disparity map**



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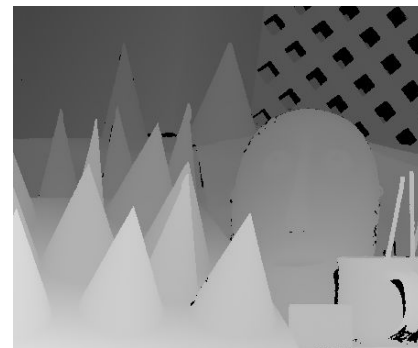
How to match pixels:

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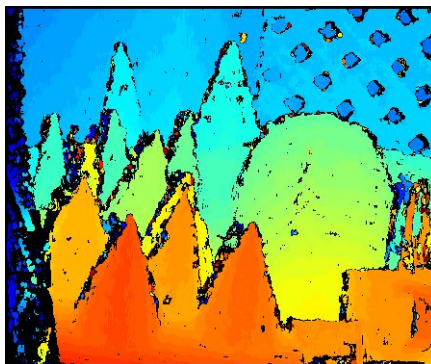
3) After this is carried out for any pixel, we can draw a **disparity map** (and apply a colormap, eventually)



Python Exercise

A basic stereo algorithm is provided by OpenCV and allows to obtain a quite nice disparity map with a few lines of code:

```
left = cv2.imread('cones0.png', cv2.IMREAD_GRAYSCALE)
right = cv2.imread('cones1.png', cv2.IMREAD_GRAYSCALE)
dmax = 64
block_size = 7
bm = cv2.StereoBM_create(dmax, block_size)
```



Let's try to implement this with our custom code!

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Problem:

Many pixels on the right image might have the same color, leading to **ambiguity**

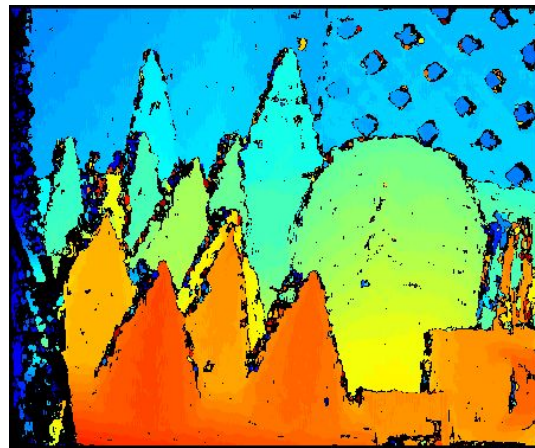
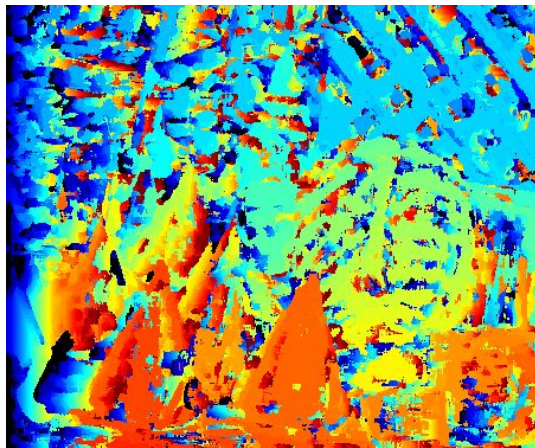


Solution (partial):

compare **image patches** rather than **single pixels** (block_size parameter in StereoBM is indeed the size of an image patch!)

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If we compare 7x7 image patches, our final disparity map looks better. However, it is still far from the one obtained with OpenCV algorithms...



Maybe looking at pixels color is not enough?

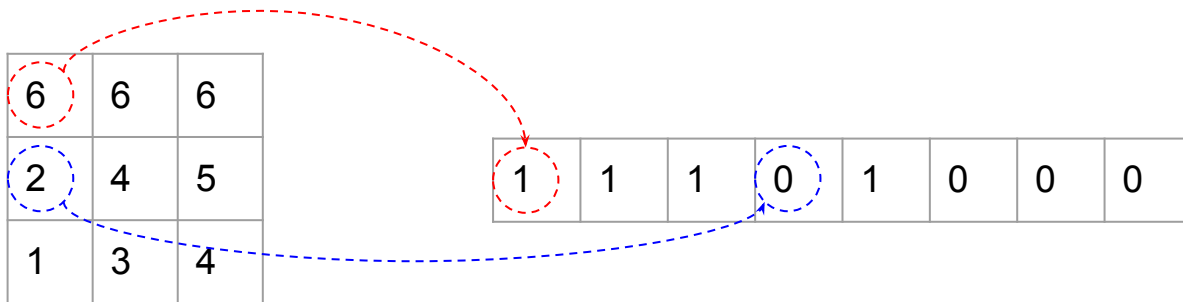
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Census transform:

Convert pixels color into a more meaningful information, better encoding the **local structure** of the image.

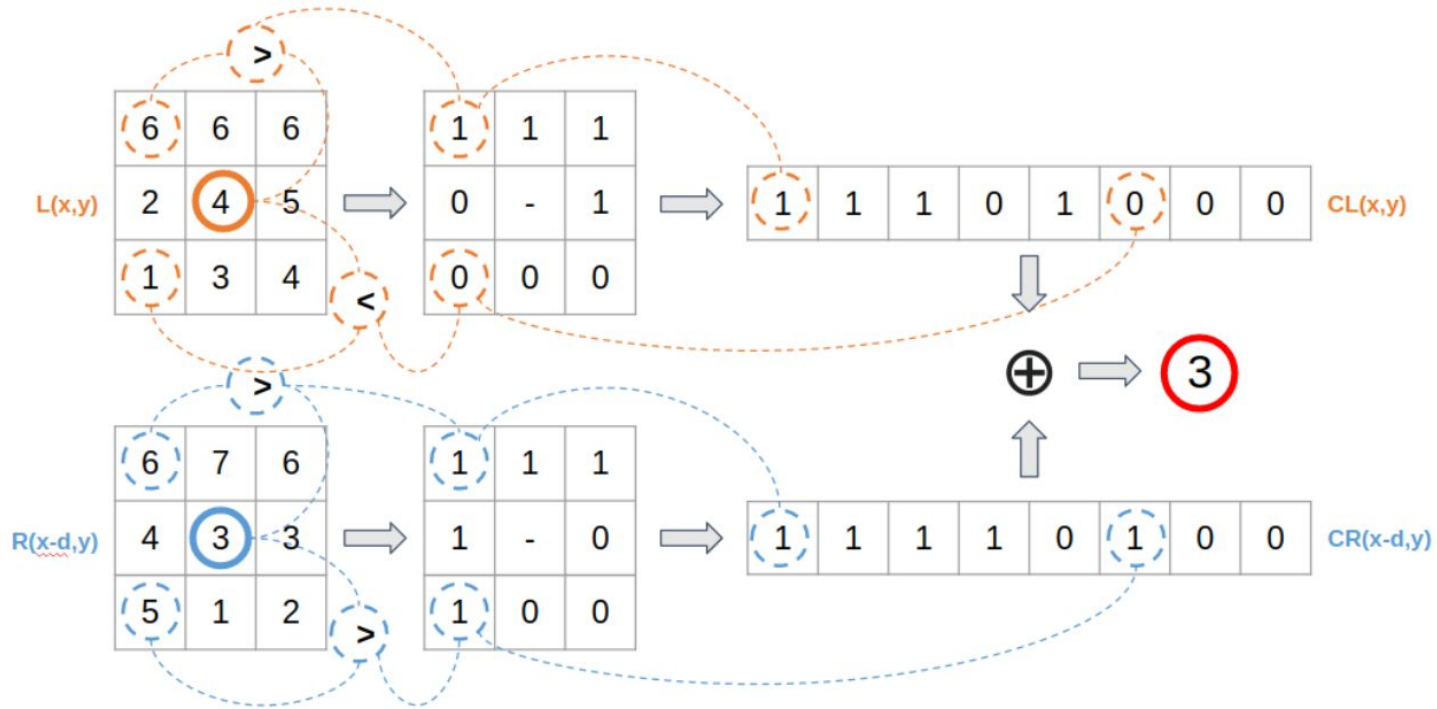
For a given pixel, we replace its color value with a **bit array**, obtained by comparing its intensity with the one of its neighbors (for instance, we assign 1 if the neighbor intensity is higher, 0 otherwise).

A string of **8 bits** (windows size - 1) is obtained.



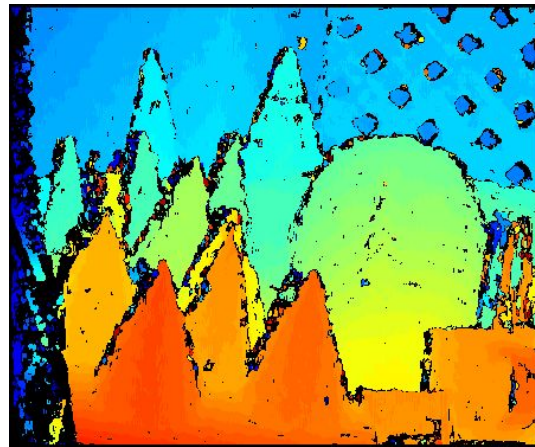
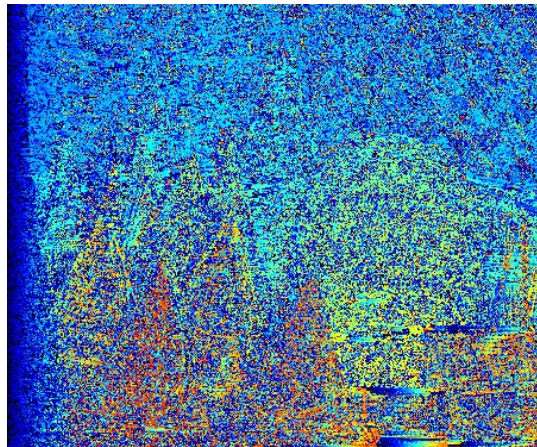
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Given two patches, we can compare them by computing the census transform for the central pixel and then the **Hamming Distance** between the two bit arrays



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Again, the result is quite disappointing...
Are we missing something?



What about comparing pixels bit arrays on a **local patch**?

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Here we are!

This implementation looks very similar to OpenCV StereoBM.

