## HOUGH TRANSFORM: CIRCLE

Ph.D. / Golden Gate Ave, San Francisco / Seoul National Univ / Carnegie Mellon / UC Berkeley / DevOps / Deep Learning / Visualization



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# Hough transform

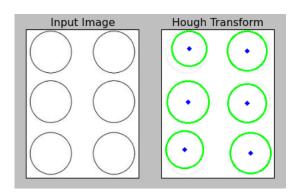
The classical Hough transform was developed to identify lines in the image, but later the Hough transform has been extended to identify the positions of arbitrary shapes, most commonly circles or ellipses.

"In many cases an edge detector can be used as a pre-processing stage to obtain image points or image pixels that are on the desired curve in the image space. Due to imperfections in either the image data or the edge detector, however, there may be missing points or pixels on the desired curves as well as spatial deviations between the ideal line/circle/ellipse and the noisy edge points as they are obtained from the edge detector. For these reasons, it is often non-trivial to group the extracted edge features to an appropriate set of lines, circles or ellipses. The purpose of the Hough transform is to address this problem by making it possible to perform groupings of edge points into object candidates by performing an explicit voting procedure over a set of **parameterized** image objects." - wiki - Hough transform (http://en.wikipedia.org/wiki/Hough\_transform).



```
import cv2
import numpy as np
from matplotlib import pyplot as plt
bgr img = cv2.imread('b.jpg') # read as it is
if bgr img.shape[-1] == 3:
                                     # color image
   b,g,r = cv2.split(bgr img)
                                     # get b,g,r
                                     # switch it to rgb
    rgb img = cv2.merge([r,g,b])
    gray img = cv2.cvtColor(bgr img, cv2.COLOR BGR2GRAY)
    gray img = bgr img
img = cv2.medianBlur(gray img, 5)
cimg = cv2.cvtColor(img,cv2.COLOR GRAY2BGR)
circles = cv2.HoughCircles(img,cv2.HOUGH GRADIENT,1,20,
                            param1=50, param2=30, minRadius=0, maxRadius=0)
circles = np.uint16(np.around(circles))
for i in circles[0,:]:
    # draw the outer circle
    cv2.circle(cimg,(i[0],i[1]),i[2],(0,255,0),2)
    # draw the center of the circle
    cv2.circle(cimg,(i[0],i[1]),2,(0,0,255),3)
plt.subplot(121),plt.imshow(rgb_img)
plt.title('Input Image'), plt.xticks([]), plt.yticks([])
plt.subplot(122),plt.imshow(cimg)
plt.title('Hough Transform'), plt.xticks([]), plt.yticks([])
plt.show()
```

The function we use here is **cv2.HoughCircles()**. It has plenty of arguments which are well explained in the documentation. So we directly go to the code.



Edge Detection - Sobel and Laplacian Kernels (/python/OpenCV\_Python/pythor

Canny Edge Detection (/python/OpenCV\_Python/pythor

Hough Transform - Circles (/python/OpenCV\_Python/pythor

Watershed Algorithm : Markerbased Segmentation I (/python/OpenCV\_Python/pythor

Watershed Algorithm : Markerbased Segmentation II (/python/OpenCV\_Python/pythor

Image noise reduction: Nonlocal Means denoising algorithm (/python/OpenCV\_Python/pythor local\_Means\_Denoising\_Algorithr

Image object detection : Face detection using Haar Cascade Classifiers (/python/OpenCV\_Python/pythor

Image segmentation -Foreground extraction Grabcut algorithm based on graph cuts (/python/OpenCV\_Python/pythor

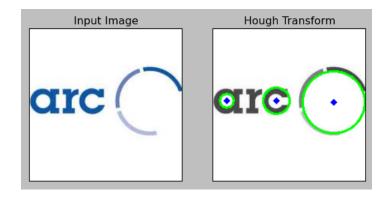
Image Reconstruction Inpainting (Interpolation) - Fast
Marching Methods
(/python/OpenCV\_Python/pythor

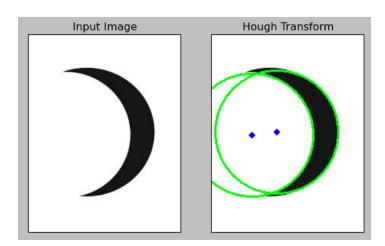
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Machine Learning:





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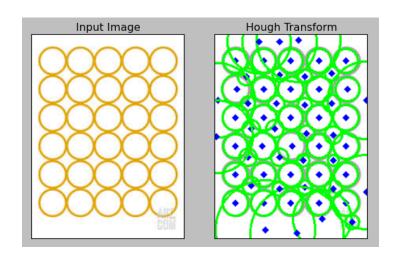


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# **Spurious Circles**

So far so good.

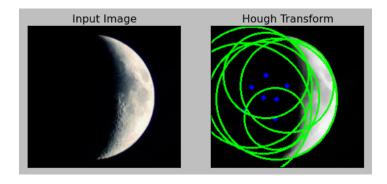
In the following cases, however, the Hough transform finds hidden circles which are not meant to be perceived as circles:



# Python tutorial

Python Home (/python/pytut.php)

Introduction

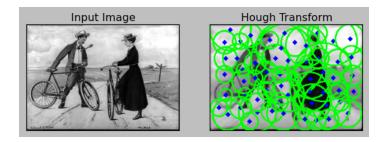


In this Crescent case, we can make it better by blurring more:

img = cv2.medianBlur(gray\_img,5) => img = cv2.medianBlur(gray\_img,25)



In general, without blurring, the algorithms tends to extract too many circular features. So, to be more successful, the prepocessing seems to be crucial.



With blurring value 51:

img = cv2.medianBlur(gray\_img,51)

(/python/python\_introduction.ph

Running Python Programs (os, sys, import)
(/python/python\_running.php)

Modules and IDLE (Import, Reload, exec) (/python/python\_modules\_idle.p

Object Types - Numbers, Strings, and None (/python/python\_numbers\_string

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Functions def, \*args, \*\*kargs (/python/python\_functions\_def.p

Functions lambda (/python/python\_functions\_lamb

Built-in Functions (/python/python\_functions\_built\_



### **Parameterization**

A circle can be fully defined with three parameters: the center coordinates (a, b) and the radius (R):

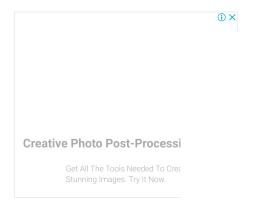
$$x = a + R\cos\theta$$

$$y = b + R \sin \theta$$

As the  $\theta$  varies from 0 to 360, a complete circle of radius R is created.

So with the Circle Hough Transform, we expect to find triplets of (x, y, R) from the image. In other words, our purpose is to find those three parameters.

Therefore, we need to construct a 3D accumulator for Hough transform, which would be highly ineffective. So, OpenCV uses more trickier method, Hough Gradient Method which uses the gradient information of edges.



## Hough transform Code

# OpenCV 3 image and video processing with Python

OpenCV 3 with Python (/python/OpenCV\_Python/pythor

Image - OpenCV BGR :
Matplotlib RGB
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Basic image operations - pixel access (/python/OpenCV\_Python/pythor

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- FFT and DFT for sine, square
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Signal Processing with NumPy II
- Image Fourier Transform: FFT
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Inverse Fourier Transform of an Image with low pass filter: cv2.idft()
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Video Capture and Switching colorspaces - RGB / HSV (/python/OpenCV\_Python/pythor

Adaptive Thresholding - Otsu's clustering-based image thresholding (/python/OpenCV\_Python/pythor





# OpenCV 3 Tutorial image & video processing

Installing on Ubuntu 13 (/OpenCV/opencv\_3\_tutorial\_ubuntu14\_install\_cmake.php)

Mat(rix) object (Image Container) (/OpenCV/opencv\_3\_tutorial\_mat\_object\_image\_matrix\_image\_container.php)

Creating Mat objects (/OpenCV/opencv\_3\_tutorial\_creating\_mat\_objects.php)

The core: Image - load, convert, and save (/OpenCV/opencv\_3\_tutorial\_load\_convert\_save\_image.php)

Smoothing Filters A - Average, Gaussian (/OpenCV/opencv\_3\_tutorial\_imgproc\_gausian\_median\_blur\_bilateral\_filter\_image\_smoothing.php)

Smoothing Filters B - Median, Bilateral (/OpenCV/opencv\_3\_tutorial\_imgproc\_gausian\_median\_blur\_bilateral\_filter\_image\_smoothing\_B.php)

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Generator Functions and Expressions (/python/python\_generators.php

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lterators
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Classes and Instances (\_\_init\_\_, \_\_call\_\_, etc.)
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if\_\_name\_\_ == '\_\_main\_\_'
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Watershed Algorithm: Marker-based Segmentation I

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Machine Learning: Clustering - K-Means clustering II

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