

# fitting-circles

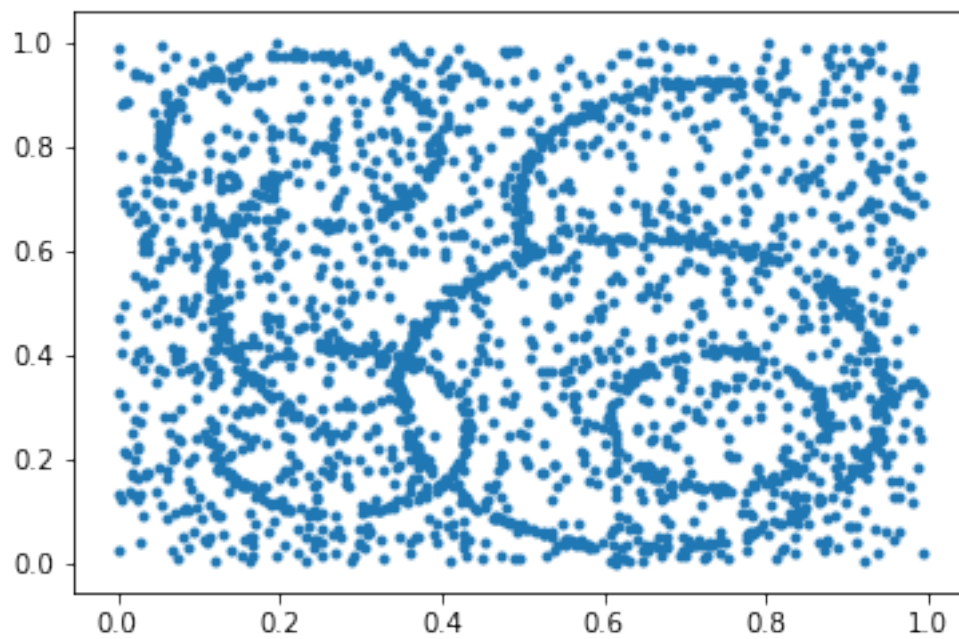
December 19, 2017

## 0.1 3.1

```
In [1]: import numpy as np
import matplotlib.pyplot as plt

data = np.load("circles.npy")

plt.scatter(data[:,0], data[:,1], marker=".")
plt.show()
```



In this picture I can see four clearly recognizable circles

```
In [2]: # RANSAC Test if the parameters are correct

xdata = data[:,0]
ydata = data[:,1]
```

```
dim = np.shape(xdata)
```

```
N = 1
```

```
for i in range(N):
```

```
    rands = np.random.choice(dim[0], 3, replace=False)
```

```
    X = xdata[rands]
```

```
    Y = ydata[rands]
```

```
    cy = (Y[2]**2+X[2]**2-X[0]**2-Y[0]**2+((Y[2]**2-Y[1]**2+X[2]**2-X[1]**2)/(X[1]-X[2]))
```

```
    cy = cy/(-2*Y[0]+2*Y[2]+2*Y[2]*(X[2]-X[0])/(X[1]-X[2])-2*Y[1]*(X[2]-X[0])/(X[1]-X[2]))
```

```
    cx = ((Y[2]-cy)**2-(Y[1]-cy)**2+X[2]**2-X[1]**2)/(-2*X[1]+2*X[2])
```

```
    r = np.sqrt((Y[2]-cy)**2+(X[2]-cx)**2)
```

```
plt.scatter(X[0],Y[0],marker="x", color = 'r') # First point, color red
```

```
plt.scatter(X[1],Y[1],marker="x", color = 'g') # Second Point
```

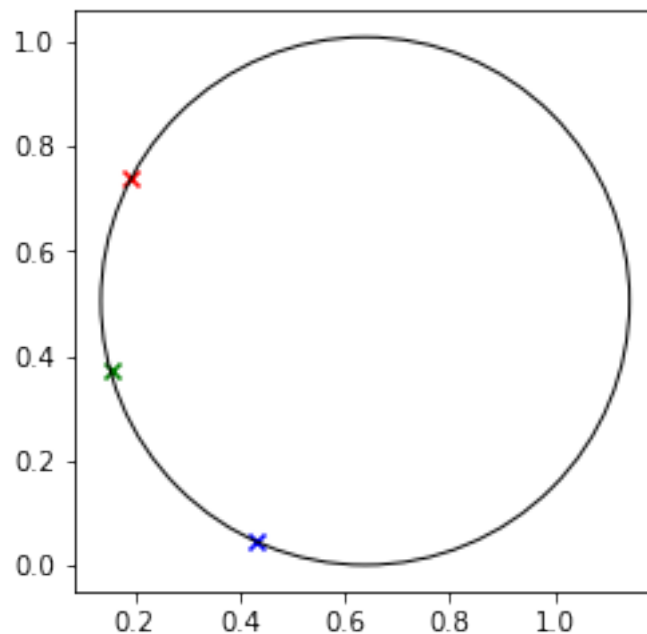
```
plt.scatter(X[2],Y[2],marker="x", color = 'b') # Third Point
```

```
circle = plt.Circle((cx, cy), radius=r, fill=False) # Create a circle
```

```
plt.gca().add_patch(circle) # Add it to the plot
```

```
plt.axis('scaled')
```

```
plt.show()
```



```
In [18]: # RANSAC function
```

```
def ransac(data, e, N):
```

```

xdata = data[:,0]
ydata = data[:,1]
dim = np.shape(xdata)

max_inliers = 0

for i in range(N):
    rands = np.random.choice(dim[0], 3, replace=False)
    X = xdata[rands]
    Y = ydata[rands]
    cy = (Y[2]**2+X[2]**2-X[0]**2-Y[0]**2+((Y[2]**2-Y[1]**2+X[2]**2-X[1]**2)/(X[1]-X[2])))/((X[1]-X[2])*(-2*Y[0]+2*Y[2]+2*Y[2]*(X[2]-X[0])/(X[1]-X[2])-2*Y[1]*(X[2]-X[0])/(X[1]-X[2])))
    cx = ((Y[2]-cy)**2-(Y[1]-cy)**2+X[2]**2-X[1]**2)/(-2*X[1]+2*X[2])
    r = np.sqrt((Y[2]-cy)**2+(X[2]-cx)**2)

    index = np.arange(dim[0])
    X_rest = xdata
    Y_rest = ydata

    inliers = 0
    inlier_points = []
    inlier_index = []
    for j in range(np.shape(index)[0]):
        dist = np.sqrt((X_rest[j]-cx)**2+(Y_rest[j]-cy)**2)
        if (dist < r+e) and (dist > r-e):
            inliers = inliers + 1
            inlier_points.append([X_rest[j], Y_rest[j]])
            inlier_index.append(j)

    if inliers > max_inliers:
        parameters = [cx, cy, r]
        max_inliers = inliers
        max_inlier_points = inlier_points
        max_inlier_index = inlier_index

    return parameters, max_inliers, max_inlier_points, max_inlier_index

fig = plt.figure(figsize=(9, 9))
plt.scatter(xdata,ydata,marker=".")

e = 0.008 #accuracy
parameters, max_inliers, max_inlier_points, max_inlier_index = ransac(data, e, 400)

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2], fill=False)
plt.gca().add_patch(circle) # Add it to the plot

```

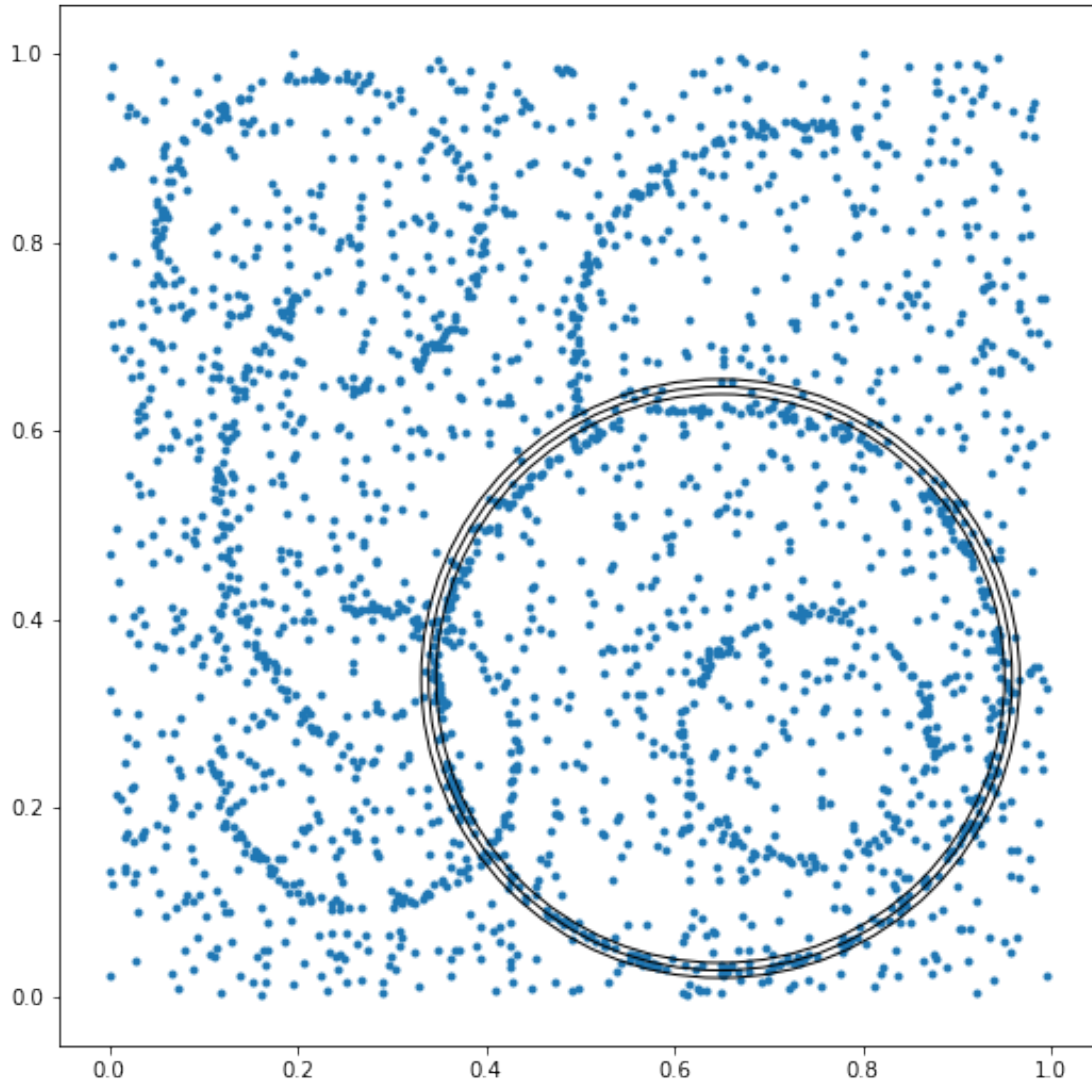
```

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2]-e, fill=False)
plt.gca().add_patch(circle) # Add it to the plot

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2]+e, fill=False)
plt.gca().add_patch(circle) # Add it to the plot

plt.axis('scaled')
plt.show()
print("The Inliers for the best fit are: ", max_inliers)

```



The Inliers for the best fit are: 218

In [43]: data = np.load("circles.npy")

```

xdata = np.array(data[:,0])
ydata = np.array(data[:,1])

#FIRST CIRCLE
e = 0.008 #accuracy
parameters, max_inliers, max_inlier_points, max_inlier_index = ransac(data, e, 400)

max_inlier_index = np.array(max_inlier_index)
max_inlier_points = np.array(max_inlier_points)

N = np.shape(xdata)[0]

red_index = np.setdiff1d(np.arange(N), max_inlier_index)
red_x = xdata[red_index]
red_y = ydata[red_index]

red_data = np.array([red_x,red_y]).T
print(np.shape(red_data))

fig = plt.figure(figsize=(9, 9))
plt.scatter(xdata,ydata,marker=".")

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2], fill=False)
plt.gca().add_patch(circle) # Add it to the plot

print("The Inliers for the best fit are: ", max_inliers)

#SECOND CIRCLE

parameters, max_inliers, max_inlier_points, max_inlier_index = ransac(red_data, e, 400)

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2], fill=False)
plt.gca().add_patch(circle) # Add it to the plot

print("The Inliers for the best fit are: ", max_inliers)

max_inlier_index = np.array(max_inlier_index)

red_index = np.setdiff1d(red_index, max_inlier_index)
red_x = xdata[red_index]
red_y = ydata[red_index]

red_data = np.array([red_x,red_y]).T
print(np.shape(red_data))

```

### *#THIRD CIRCLE*

```
parameters, max_inliers, max_inlier_points, max_inlier_index = ransac(red_data, e, 40)

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2], fill=False)
plt.gca().add_patch(circle) # Add it to the plot

print("The Inliers for the best fit are: ", max_inliers)
max_inlier_index = np.array(max_inlier_index)

red_index = np.setdiff1d(red_index, max_inlier_index)
red_x = xdata[red_index]
red_y = ydata[red_index]

red_data = np.array([red_x, red_y]).T
print(np.shape(red_data))
```

### *#FOURTH CIRCLE*

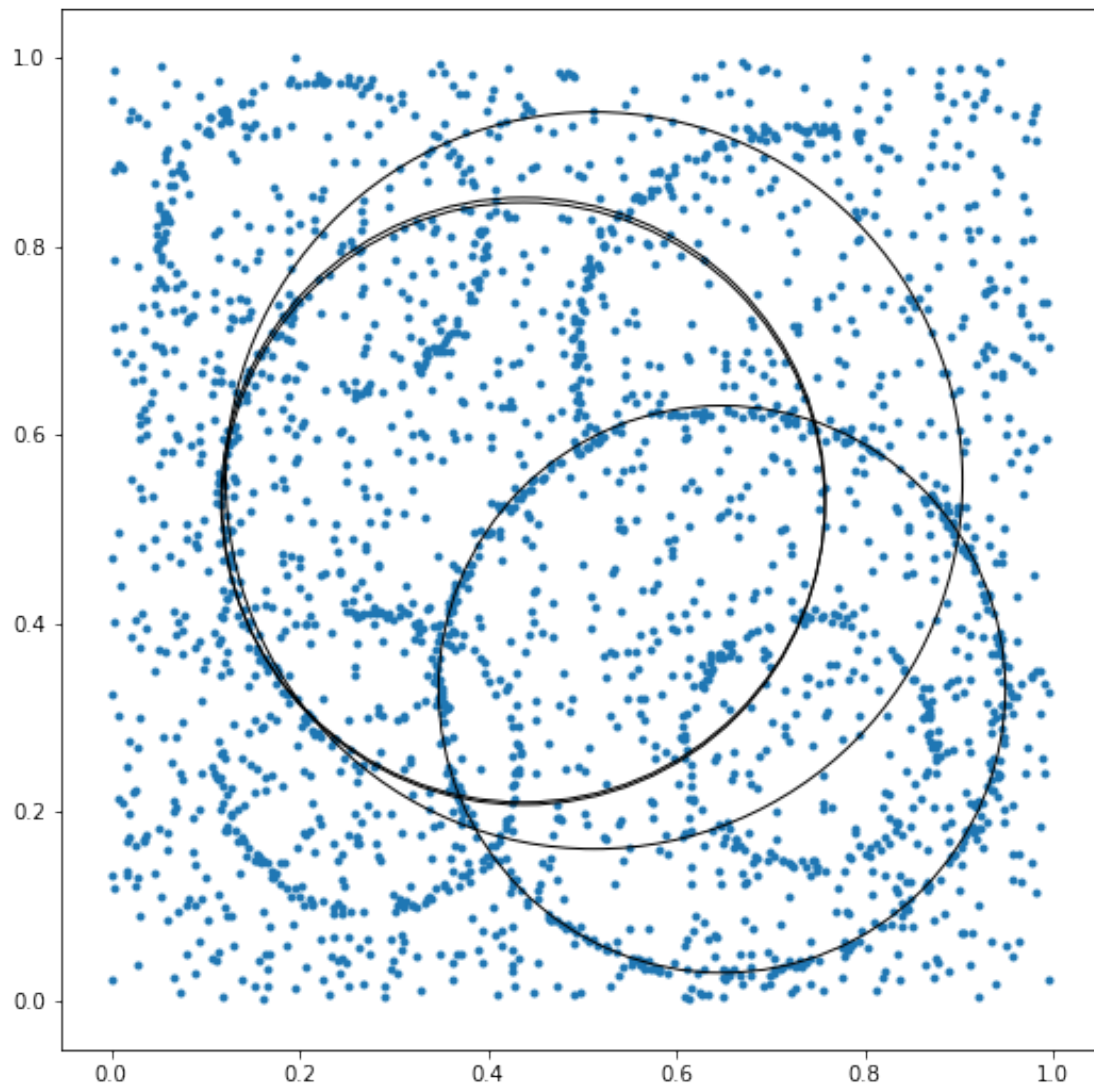
```
parameters, max_inliers, max_inlier_points, max_inlier_index = ransac(red_data, e, 40)

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2], fill=False)
plt.gca().add_patch(circle) # Add it to the plot

plt.axis('scaled')
print("The Inliers for the best fit are: ", max_inliers)

plt.show()
```

```
(2081, 2)
The Inliers for the best fit are: 350
The Inliers for the best fit are: 150
(1947, 2)
The Inliers for the best fit are: 133
(1833, 2)
The Inliers for the best fit are: 119
```



The result is sensitive to  $\epsilon$  because if you choose it to be big, then there is no difference if the circle is shifted in an arbitrary direction. If it's too small none of the points get detected.

## 0.2 3.2

```
In [5]: data = np.load("circles.npy")

xdata = data[:,0]
ydata = data[:,1]

fig = plt.figure(figsize=(9, 9))
plt.scatter(xdata,ydata,marker=".")

e = 0.008 #accuracy
```

```

parameters, max_inliers, max_inlier_points = ransac(data, e, 400)

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2], fill=False)
plt.gca().add_patch(circle) # Add it to the plot

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2]-e, fill=False)
plt.gca().add_patch(circle) # Add it to the plot

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2]+e, fill=False)
plt.gca().add_patch(circle) # Add it to the plot

plt.axis('scaled')
print("The Inliers for the best fit are: ", max_inliers)

max_inlier_points = np.array(max_inlier_points)

Y = []
for i in range(np.shape(max_inlier_points)[0]):
    Y.append(max_inlier_points[i,:].T.dot(max_inlier_points[i,:]))

inlier_x = max_inlier_points[:,0]
inlier_y = max_inlier_points[:,1]

X = np.ones((inlier_x.shape[0],3))

X[:,0] = inlier_x
X[:,1] = inlier_y

b = np.linalg.lstsq(X,Y)[0]

cx = b[0]/2
cy = b[1]/2
r = np.sqrt(b[2]+cx**2+cy**2)

parameters = [cx,cy,r]

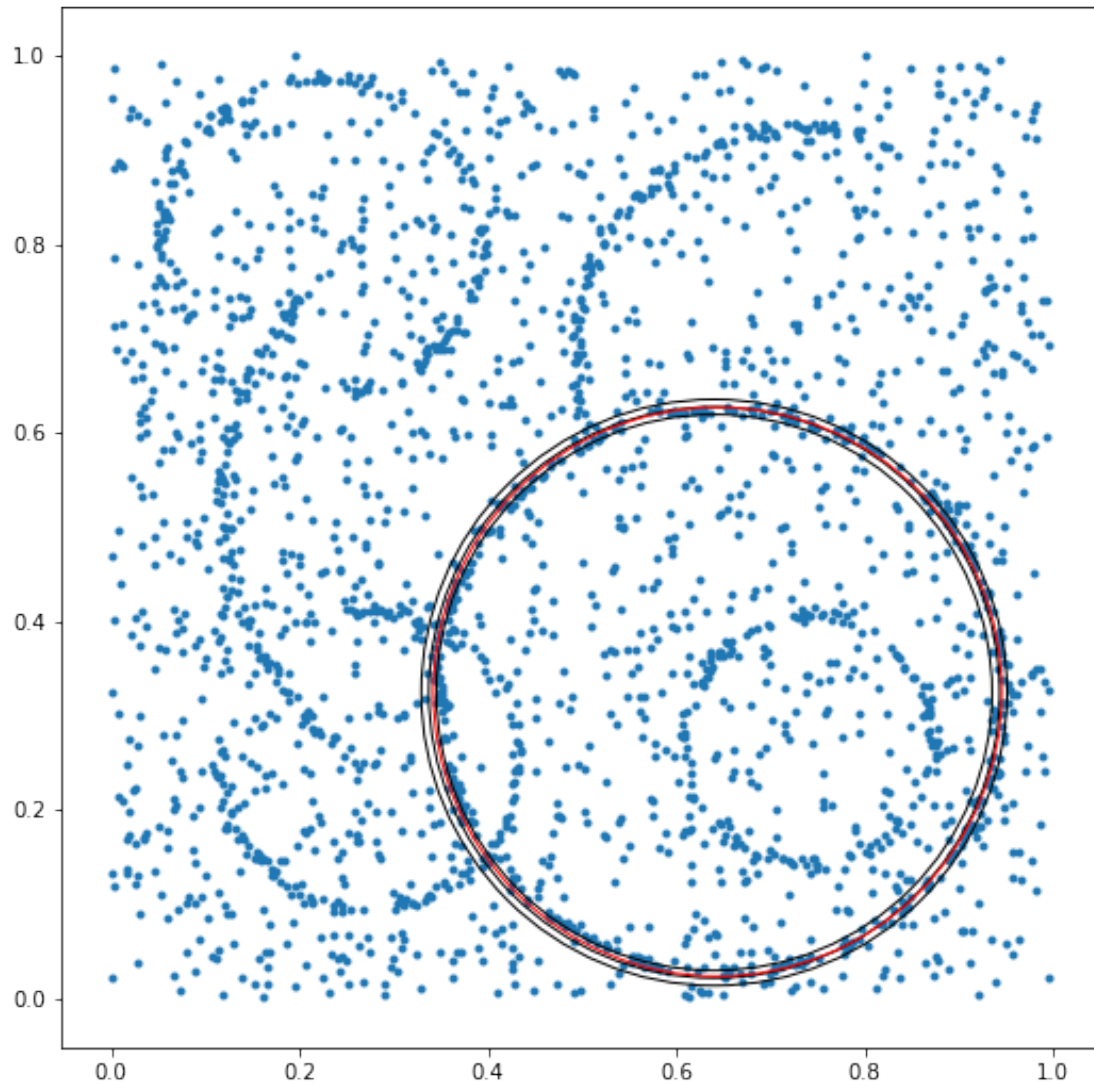
print(cx,cy,r)

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2], fill=False)
plt.gca().add_patch(circle) # Add it to the plot
plt.show()

```

The Inliers for the best fit are: 259  
0.643612382035 0.32526563289 0.301740050641

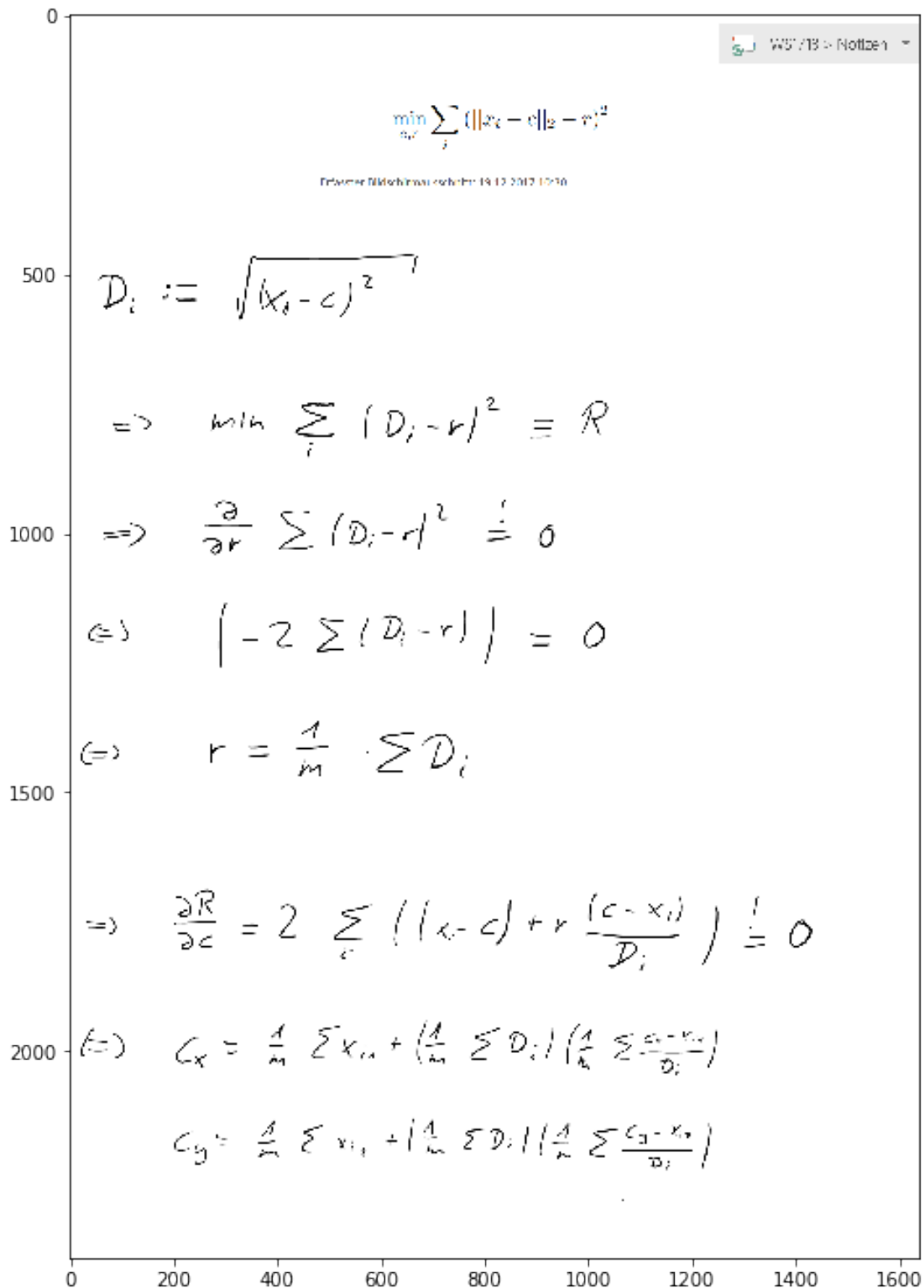




As one can see in the plot, the algebraic-distance-method (red circle) gives a similar result as the RANSAC-algorithm

### 0.3 3.3

```
In [48]: import matplotlib.pyplot as plt
import matplotlib.image as mpimg
fig = plt.figure(figsize=(12, 12))
img=mpimg.imread('derivation.png')
imgplot = plt.imshow(img)
plt.show()
```



In [13]: `import scipy.optimize as opt`

```

data = np.load("circles.npy")

xdata = data[:,0]
ydata = data[:,1]

fig = plt.figure(figsize=(9, 9))
plt.scatter(xdata,ydata,marker=".")

e = 0.008 #accuracy
parameters, max_inliers, max_inlier_points = ransac(data, e, 400)

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2], fill=False)
plt.gca().add_patch(circle) # Add it to the plot

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2]-e, fill=False)
plt.gca().add_patch(circle) # Add it to the plot

circle = plt.Circle((parameters[0], parameters[1]), radius=parameters[2]+e, fill=False)
plt.gca().add_patch(circle) # Add it to the plot

plt.axis('scaled')

print("The Inliers for the best fit are: ", max_inliers)

max_inlier_points = np.array(max_inlier_points)

def f(x, c):
    xdata = x[:,0]
    ydata = x[:,1]
    m = xdata.shape[0]
    cx = 1/m*np.sum(xdata) + (1/m*np.sum(np.sqrt((xdata-c[0])**2+(ydata-c[1])**2))*1/m)
    cy = 1/m*np.sum(ydata) + (1/m*np.sum(np.sqrt((xdata-c[0])**2+(ydata-c[1])**2))*1/m)
    return [cx,cy]

def residual(p, data):
    return f(data, *p)

p0 = [1]

popt, pcov = opt.leastsq(residual, p0, args=(data))

print(popt)

```

The Inliers for the best fit are: 350

-----

IndexError

Traceback (most recent call last)

```
<ipython-input-13-42afd07d6355> in <module>()
    42 p0 = [1]
    43
---> 44 popt, pcov = opt.leastsq(residual, p0, args=(data))
    45
    46 print(popt)

~\Anaconda3\lib\site-packages\scipy\optimize\minpack.py in leastsq(func, x0, args, Dfun)
    375     if not isinstance(args, tuple):
    376         args = (args,)
--> 377     shape, dtype = _check_func('leastsq', 'func', func, x0, args, n)
    378     m = shape[0]
    379     if n > m:

~\Anaconda3\lib\site-packages\scipy\optimize\minpack.py in _check_func(checker, argname,
    24 def _check_func(checker, argname, thefunc, x0, args, numinputs,
    25                   output_shape=None):
---> 26     res = atleast_1d(thefunc(*((x0[:numinputs],) + args)))
    27     if (output_shape is not None) and (shape(res) != output_shape):
    28         if (output_shape[0] != 1):

<ipython-input-13-42afd07d6355> in residual(p, data)
    38
    39 def residual(p, data):
---> 40     return f(data, *p)
    41
    42 p0 = [1]

<ipython-input-13-42afd07d6355> in f(x, c)
    33     ydata = x[:,1]
    34     m = xdata.shape[0]
---> 35     cx = 1/m*np.sum(xdata) + (1/m*np.sum(np.sqrt((xdata-c[0])**2+(ydata-c[1])**2)))
    36     cy = 1/m*np.sum(ydata) + (1/m*np.sum(np.sqrt((xdata-c[0])**2+(ydata-c[1])**2)))
    37     return [cx,cy]
```

IndexError: invalid index to scalar variable.