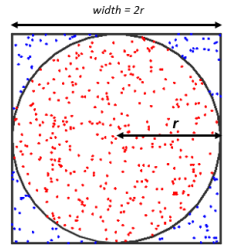


Estimating π using the Monte Carlo Method

Explanation

Assume we have a circle of radius r . This circle can be inscribed inside a square of width $2r$. Pi can then be estimated by randomly selecting an x and y point inside the square and looking at the number of points that land inside and outside the circle

$$\begin{aligned}Area_c &= \pi r^2 \\Area_s &= (2r)^2 = 4r^2 \\ \frac{Area_c}{Area_s} &= \frac{\pi r^2}{4r^2} = \frac{\pi}{4} \\ \pi &\approx \frac{4Area_c}{Area_s}\end{aligned}$$



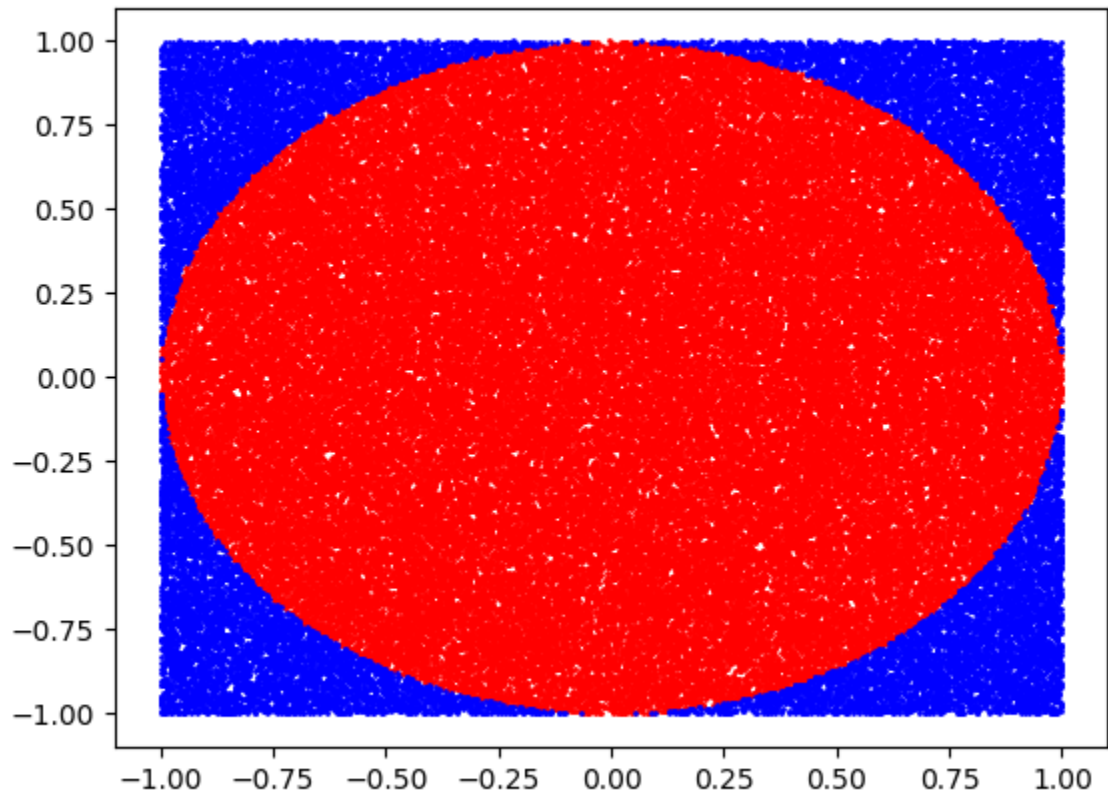
This means that computing the ratio of the areas and multiplying by 4 should approximate π

```
In [9]: ▶ 1 import random
          2 import math
          3 import numpy as np
          4 import matplotlib.pyplot as plt
          5 from ipywidgets import IntProgress
          6 from IPython.display import display
          7 %matplotlib notebook
```

In [34]: ▶

```
1  NUMBER_OF_SAMPLES = 10**5
2  REDRAW EVERY_X = NUMBER_OF_SAMPLES/10
3
4  inside_circle, outside_circle = [], []
5  fig, ax = plt.subplots()
6
7  def plot_animate():
8      ax.clear()
9      _inside_points = np.array(inside_circle)
10     _outside_points = np.array(outside_circle)
11
12     _inside_x = 0 if len(_inside_points) == 0 else _inside_points[:,0]
13     _inside_y = 0 if len(_inside_points) == 0 else _inside_points[:,1]
14     _outside_x = 0 if len(_outside_points) == 0 else _outside_points[:,0]
15     _outside_y = 0 if len(_outside_points) == 0 else _outside_points[:,1]
16
17     ax.plot(_inside_x, _inside_y, marker='o', markersize=1, color='r',linestyle
18     ax.plot(_outside_x, _outside_y, marker='o', markersize=1, color='b',linesty
19
20     fig.canvas.draw()
21
22     # Will Loop through randomly generated x and y points centered at zero
23     # ranging from -1 to 1. Distance will be calculated and x and y points
24     # added to a list for plotting
25     for i in range(NUMBER_OF_SAMPLES):
26         x = -1 + 2*random.random()
27         y = -1 + 2*random.random()
28         r = math.sqrt(x**2 + y**2)
29         inside_circle.append([x,y]) if (r<1) else outside_circle.append([x,y])
30         if not (i % REDRAW EVERY_X): plot_animate()
31
32
33
34     _inside, _outside = len(inside_circle), len(outside_circle)
35     print("Points inside circle: {}".format(_inside))
36     print("Points outside circle: {}".format(_outside))
37     print("Estimate for Pi: {}".format(4*_inside/(_inside+_outside)))
```

Figure 1



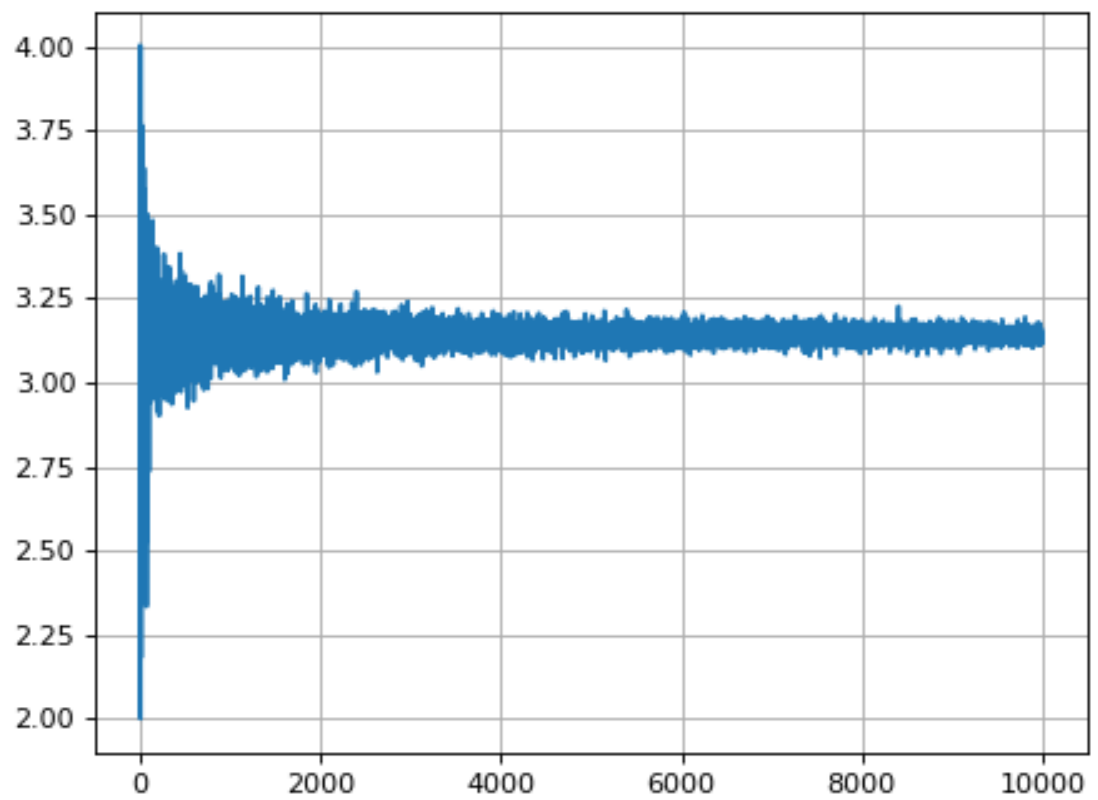
x=0.753578 y=0.0794593

Points inside circle: 78688
Points outside circle: 21312
Estimate for Pi: 3.14752

Calculate how good the approximation gets as the number of samples increases

```
In [11]: ► 1 NUMBER_OF_SAMPLES = 10**4
2 pi_estimate = []
3
4 f = IntProgress(min=1, max=NUMBER_OF_SAMPLES)
5 display(f)
6 print("Checking values up to {}".format(NUMBER_OF_SAMPLES))
7 for i in range(1, NUMBER_OF_SAMPLES):
8     f.value += 1
9     _estimate = 0
10    inside_circle, outside_circle = 0, 0
11    for j in range(i):
12        x = -1 + 2*random.random()
13        y = -1 + 2*random.random()
14        r = math.sqrt(x**2 + y**2)
15        if r<1:
16            inside_circle += 1
17        else:
18            outside_circle+= 1
19    _estimate = 4*inside_circle/(inside_circle+outside_circle)
20    pi_estimate.append(_estimate)
21
22 print("Done simulating. Plotting {} points...".format(len(pi_estimate)))
23 fig, ax = plt.subplots()
24 ax.grid(True)
25 ax.plot(pi_estimate)
```

Checking values up to 10000...
Done simulating. Plotting 9999 points...



Out[11]: [<matplotlib.lines.Line2D at 0x19b32ed0f60>]