

**Chapter 31-5: Elliptic PDEs Using the Monte Carlo Method.**

Monte Carlo Methods are a class of computational solutions that can be applied to various problems which rely on repeated random sampling to provide generally approximate solutions. Monte Carlo is a stochastic approach, in which a series of simulations (trials), representing the analyzed problem, with randomly selected input values, are performed. Among these trials, a specified number of properly defined successes is achieved. The ratio between the number of success trials to the number of all trials, scaled by dimensional quantity (e.g., area or function value) allows for the estimation of the unknown solution, providing the number of trials is large enough.

A capacitor is constructed out of two infinite metal plates spaced 10 cm apart from one another. One plate is placed at 5V potential with respect to the other and the space between the plates is free of charges. The number of random walks is taken to be 400 and the number of lattice points is taken to be 30.

(The description of the problem and the code solution was taken from the repository of s-ankur.)

```
In [1]: 1 """
2 All calculations in SI units
3 """
4 import random
5 from mpl_toolkits.mplot3d import axes3d
6 import matplotlib.pyplot as plt
7 from matplotlib import cm
8 import numpy as np
9 %config InlineBackend.figure_formats = ['svg']
10
11 h = 10e-2 # Distance between plates = 10cm
12 lattice_points = 30 # Number of Points in lattice
13 d = h / lattice_points # Lattice size
14 boundary_voltage_high = 5.0 # 5 Volts at Positive Plate
15 boundary_voltage_low = 0.0 # 0 Volts at Negative Plate
16 epsilon_naught = 8.854e-12 # Permittivity of Vacuum
17 charge_density = 6e-16 # Coulomb per meter cube
18 N = 400 # Number of Random Walks
19
20
21 def f(x):
22     # The Function  $\nabla^2(\phi) = f$ 
23     # For Laplace  $f = 0$ 
24     return 0
25
26
27 def g(x):
28     # Two Dimensional Boundary Conditions: two parallel metal plates at  $x=0, x=h$ 
29     # the plate at  $x=h$  is at high potential and  $x=0$  is low potential
30     # Assume that there are metal plates along  $y=0$  and  $y=h$  (uncharged)
31     # this is because I dont know how to simulate open boundary conditions
32     if x[0] <= 0:
33         return boundary_voltage_low
34     if x[0] >= h:
35         return boundary_voltage_high
36     if x[1] <= 0 or x[1] >= h:
37         return boundary_voltage_low
38
39 """
40 def f_2(x):
41     # Alternative charge distribution: A charged Sphere in the centre of metal box
42     if (h / 2 - x[0]) ** 2 + (h / 2 - x[1]) ** 2 <= (h / 5) ** 2:
43         return -charge_density * 5 / epsilon_naught
44     else:
45         return 0
46
47
48 def g_2(x):
49     # Two Dimensional Alternative Boundary Conditions: uncharged metal box
50     return 0
51
52 """
53
54 def f_3(x):
55     # Alternative charge distribution: TWO charged Sphere in the centre of metal box
56     if (h / 3 - x[0]) ** 2 + (h / 2 - x[1]) ** 2 <= (h / 5) ** 2:
57         return -charge_density * 5 / epsilon_naught
58     if (2 * h / 3 - x[0]) ** 2 + (h / 2 - x[1]) ** 2 <= (h / 5) ** 2:
59         return charge_density * 5 / epsilon_naught
60     else:
61         return 0
62
63
64 @np.vectorize
65 def poisson_approximation_fixed_step(*A):
66     # Returns the Value of Potential Field at a given point A with N random walks
67     result = 0
68     F = 0
69     for i in range(N):
70         x = list(A)
71         while True:
72             if x[0] <= 0 or x[0] >= h or x[1] <= 0 or x[1] >= h:
73                 break
74             random_number = random.randint(0, 3)
75             if random_number == 0:
76                 x[0] += d
77             elif random_number == 1:
78                 x[0] -= d
79             elif random_number == 2:
80                 x[1] += d
81             elif random_number == 3:
82                 x[1] -= d
83             F += f(x) * h ** 2
84             result += g(x) / N
85         result = result - F
86     return result
87
88
89 def plot(x, y, z):
90     # Function for plotting the potential
91     fig = plt.figure()
92     ax = fig.add_subplot(111, projection="3d")
93
94     ax.plot_surface(x, y, np.array(z), cmap=cm.jet, linewidth=0.1)
95     plt.xlabel("X (Meters)")
96     plt.ylabel("Y (Meters)")
97     ax.set_zlabel("Potential (Volts)")
98     plt.show()
99
100
101 if __name__ == "__main__":
102     # Experiment E: 2D Capacitor
103     print(
104         f"Calculating Monte Carlo with {lattice_points}x{lattice_points} lattice points and {N} random walks"
105     )
106     lattice_x, lattice_y = np.mgrid[
107         0 : h : lattice_points * 1j, 0 : h : lattice_points * 1j
108     ]
109     z = poisson_approximation_fixed_step(lattice_x.ravel(), lattice_y.ravel()).reshape(
110         lattice_x.shape
111     )
112     plot(lattice_x, lattice_y, z)
113
114     # Experiment F: Metal box with positively charged metal ball inside
115     # f = f2
116     # g = g2
117     print(
118         f"Calculating Monte Carlo with {lattice_points}x{lattice_points} lattice points and {N} random walks for {'Laplace' if laplace else 'f2'}"
119     )
120     lattice_x, lattice_y = np.mgrid[
121         0 : h : lattice_points * 1j, 0 : h : lattice_points * 1j
122     ]
123     z = poisson_approximation_fixed_step(lattice_x.ravel(), lattice_y.ravel()).reshape(
124         lattice_x.shape
125     )
126     plot(lattice_x, lattice_y, z)
```

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