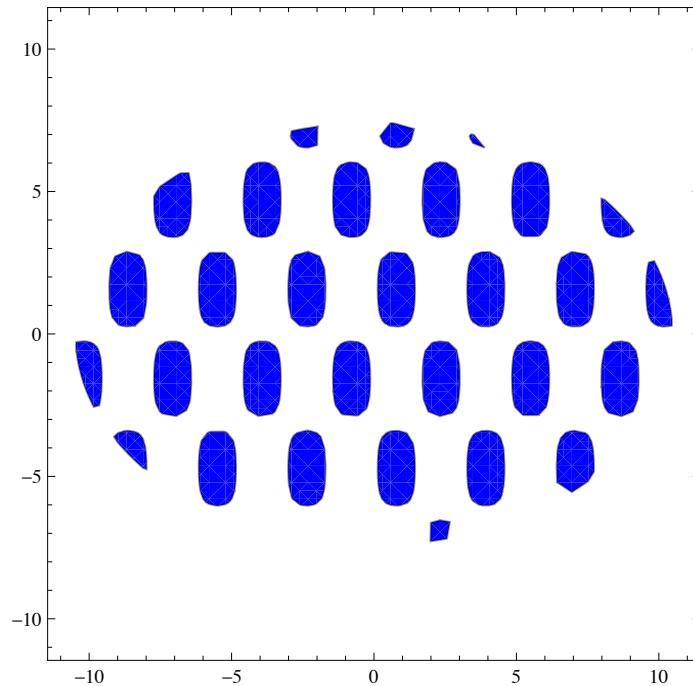


## MC Integration to find a area/volume



**Task:** Your task is to find the area of the region that satisfies following two conditions:

(a)  $(\sin(2x) \sin y > \frac{1}{4})$

(b)  $x^2 + 2y^2 \leq 110$

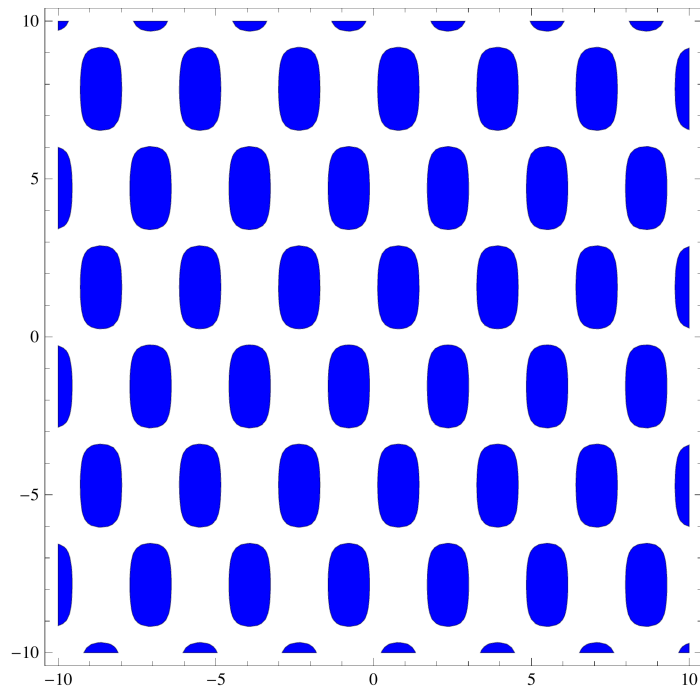
**Algorithm for area** (you generalize it for an  $n$ -dimensional volume):

1. Enclose the required region in a box of width  $w$  and height  $h$
2. Generate 10000 random points in the box that is 10000 pairs of  $(x_i, y_i)$
3. Verify if each point satisfies the condition (a) and (b). Count the points that satisfy the conditions.

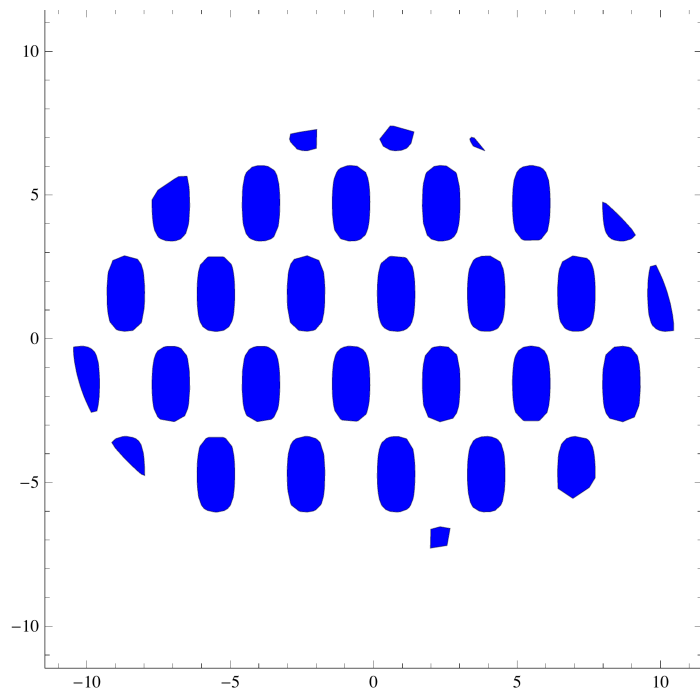
4. Area of the blue region =  $\frac{\text{number of successes in step 3}}{10\,000} (w h)$

5. Repeat Steps 2 to 4 ten times to obtain 10 values for area of the required region

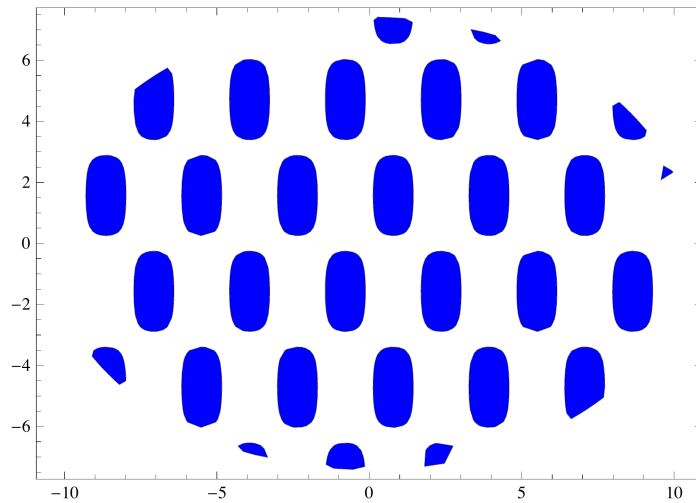
```
RegionPlot[Sin[2 x] Sin[y] > 1 / 4, {x, -10, 10}, {y, -10, 10}, PlotStyle -> Blue]
```



```
RegionPlot[Sin[2 x] Sin[y] > 1 / 4 && x2 + 2 y2 < 110, {x, -11, 11}, {y, -11, 11}, PlotStyle -> Blue]
```



```
RegionPlot[Sin[2 x] Sin[y] > 1/4 && x^2 + 2 y^2 < 110, {x, -sqrt[110], sqrt[110]},
{y, -sqrt[110/2], sqrt[110/2]}, PlotStyle -> Blue, AspectRatio -> 1/sqrt[2]]
```



```
MCpoints = 10^4;
trials = 100;
w = 2 sqrt[110];
h = 2 sqrt[110/2];
AreaOfBox = hw;
For[i = 1, i <= trials, i++,
successes = Count[Table[x = RandomReal[{ -w/2, w/2 }]; y = RandomReal[{ -h/2, h/2 }];
Sin[2 x] Sin[y] > 1/4 && x^2 + 2 y^2 < 110, {MCpoints}], True];
AreaOfBlue[i] = (successes / MCpoints) AreaOfBox // N;]
measurements = Table[AreaOfBlue[i], {i, 1, trials}]
{74.7949, 73.5504, 74.3282, 74.2038, 74.1416, 74.0793, 76.0083, 74.9505, 74.2349, 74.266, 73.9549, 75.7905, 75.7905,
74.9816, 75.1683, 75.1061, 73.3326, 75.915, 72.2748, 74.3905, 73.4571, 72.4304, 75.1061, 74.8572, 73.9549, 71.1547,
74.3282, 74.8572, 72.8659, 71.5281, 74.6083, 76.475, 73.3949, 72.2748, 72.2748, 74.6083, 73.0526, 72.0881, 75.4483,
74.8883, 71.6214, 73.4882, 72.4304, 72.8659, 75.5416, 73.4882, 75.2927, 73.5815, 74.6083, 75.4172, 77.4706,
72.7726, 72.8348, 73.7371, 77.0662, 74.9194, 72.7104, 74.7949, 75.2305, 72.8037, 73.3637, 71.217, 74.7327,
73.5815, 72.3059, 73.7371, 73.5815, 72.4615, 74.0482, 77.5328, 74.2038, 75.6661, 75.5727, 75.3238, 74.3593,
74.2971, 73.2704, 74.3593, 74.8883, 74.7327, 74.0482, 74.7016, 72.8348, 73.1148, 74.7327, 73.4571, 71.6525,
73.5504, 74.0171, 74.6083, 73.1771, 75.5727, 72.0881, 72.617, 73.1771, 72.7104, 72.9904, 72.617, 76.2261, 72.0259}
```

Mean and Standard Deviation when each run was done with 1000 points:

```
Print[Style["<area> = ", 24], Style[Mean[measurements], 24]]
```

<area> = 74.21

```
Print[Style["σ = ", 24], Style[StandardDeviation[measurements], 24]]
```

σ = 4.16611

Mean and Standard Deviation when each run was done with

10000 points:

```
Print[Style["⟨area⟩ = ", 24], Style[Mean[measurements], 24]]
```

⟨area⟩ = 74.0075

```
Print[Style["σ = ", 24], Style[StandardDeviation[measurements], 24]]
```

σ = 1.34996

---

## MC Integration to get total observed cross-section in Bhabha scattering

**Task:** Your task is to find the total cross-section between  $\theta = 0.4$  and  $\theta = \pi - 0.4$  by MC integration method for Bhabha scattering cross-section.

$$\sigma(\theta) = \frac{1 + \cos^4 \frac{\theta}{2}}{\sin^4 \frac{\theta}{2}} - \frac{2 \cos^4 \frac{\theta}{2}}{\sin^2 \frac{\theta}{2}} + \frac{1 + \cos^2 \theta}{2} \quad (1)$$

**Following are the steps to do MC Integration in general:**

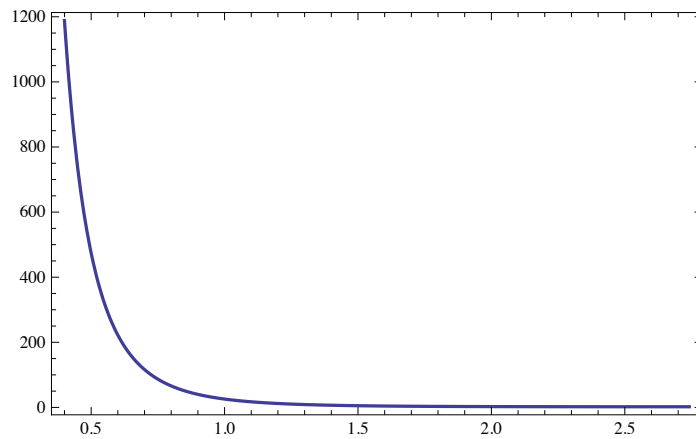
1. Obtain  $N_{\max}$  random values of  $\theta$  in the region of interest ( $\theta_{\min}, \theta_{\max}$ )
2. Evaluate the integrand at all the values of  $\theta$  from step 1, and store it in an array
3. Calculate the Mean of values in array from step 2. Call this mean  $\mu$ .
4. integral =  $\mu (\theta_{\max} - \theta_{\min})$
5. Repeat Steps 1 to 4 hundred times to obtain 100 values for the integral
6. Calculate mean and standard deviation of the integral

For the Bhabha scattering cross-section we will follow stratified sampling method. That is we will divide the entire region in two regions and generate a different number of points in each region according to its approximate standard deviation. First define the cross-section function:

$$\text{diffCrossSection}[\theta\_] = \frac{1 + \text{Cos}[\theta / 2]^4}{\text{Sin}[\theta / 2]^4} - \frac{2 \text{Cos}[\theta / 2]^4}{\text{Sin}[\theta / 2]^2} + \frac{1 + \text{Cos}[\theta]^2}{2};$$

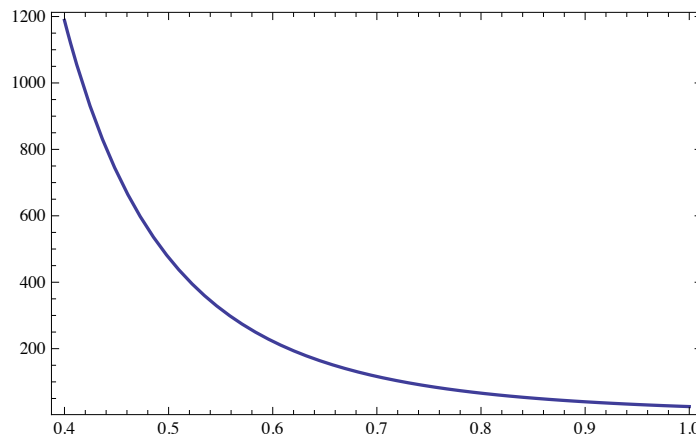
Here is the plot of the cross-section function in the range  $\theta = 0.4$  radians to  $\theta = \pi - 0.4$  radians.

```
Plot[{diffCrossSection[ $\theta$ ]}, { $\theta$ , 0.4,  $\pi - 0.4$ }, PlotStyle  $\rightarrow$  Thickness[0.005],
  AxesLabel  $\rightarrow$  {" $\theta$ ", " $d\sigma/d\Omega$ "}, Frame  $\rightarrow$  True, PlotRange  $\rightarrow$  Full]
```

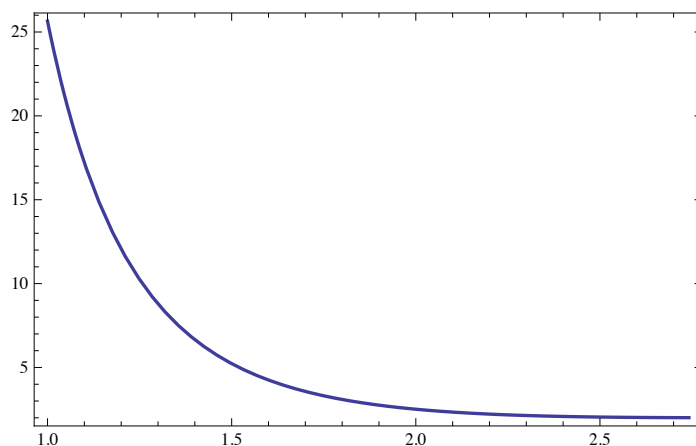


We note that most of the cross-section comes from region  $\theta < 1.0$ . So we should pick more points in that region and less for  $\theta > 1.0$ . Below are the plots in the two regions:

```
Plot[{diffCrossSection[ $\theta$ ]}, { $\theta$ , 0.4, 1}, PlotStyle  $\rightarrow$  Thickness[0.005],
  AxesLabel  $\rightarrow$  {" $\theta$ ", " $d\sigma/d\Omega$ "}, Frame  $\rightarrow$  True, PlotRange  $\rightarrow$  Full]
```



```
Plot[{diffCrossSection[ $\theta$ ]}, { $\theta$ , 1,  $\pi - 0.4$ }, PlotStyle  $\rightarrow$  Thickness[0.005],
  AxesLabel  $\rightarrow$  {" $\theta$ ", " $d\sigma/d\Omega$ "}, Frame  $\rightarrow$  True, PlotRange  $\rightarrow$  Full]
```



How many points we should choose in each range of  $\theta$ ? This is decided by the following relation: (subscript  $a$  and  $b$  corresponds to two regions and  $N_{\text{total}}$  is the total number of random numbers available to you or you can generate in allotted computer time)

$$N_a = \frac{\sigma_a}{\sigma_a + \sigma_b} N_{\text{total}}, \text{ and } N_b = \frac{\sigma_b}{\sigma_a + \sigma_b} N_{\text{total}} \quad (2)$$

So we need to get at least a rough estimate of  $\sigma_{a,b}$  to get the idea. This we will do by evaluating cross-section at min, max and mid point in each range and calculating st. dev.

```
σa = diffCrossSection[[{0.4,  $\frac{1.0 + 0.4}{2}$ , 1.0}]] // StandardDeviation
```

```
646.722
```

```
σb = diffCrossSection[[{1.0,  $\frac{1.0 + \pi - 0.4}{2}$ ,  $\pi - 0.4$ }]] // StandardDeviation
```

```
13.4111
```

Taking  $N_{\text{total}} = 10\,000$ , we get

```
Ntotal = 104;
```

```
Na =  $\frac{\sigma_a}{\sigma_a + \sigma_b}$  Ntotal // Round
```

```
9797
```

```
Nb =  $\frac{\sigma_b}{\sigma_a + \sigma_b}$  Ntotal // Round
```

```
203
```

Now we calculate the area in each region according to the algorithm. First get the array of random  $\theta_i$  in two ranges:

```
θa = RandomReal[{0.4, 1}, Na];  
θb = RandomReal[{1,  $\pi - 0.4$ }, Nb];
```

Now evaluate cross-section at these values:

```
CSlista = diffCrossSection[θa];  
CSlistb = diffCrossSection[θb];
```

Now calculate their mean and multiply by their respective ranges:

```
CSa = Mean[CSlista] (1 - 0.4);  
CSb = Mean[CSlistb] ( $\pi - 0.4 - 1$ );
```

Get total crosssection by adding CS in two regions:

```
CS = CSa + CSb
```

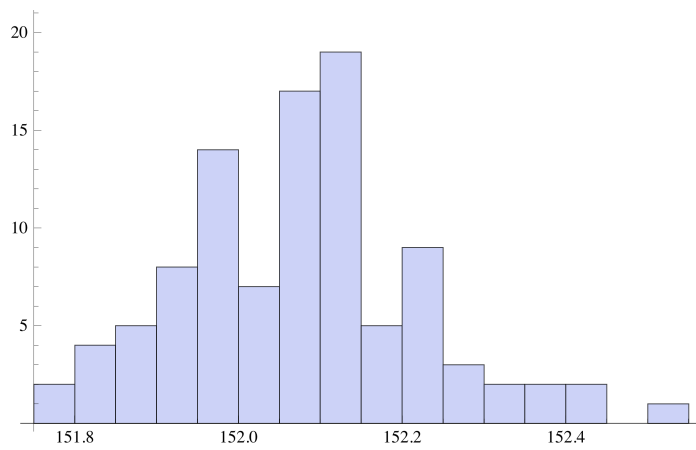
```
149.061
```

This was result of one Monte Carlo experiment. I want to repeat this at least 100 times to get a distribution in the cross-section value obtained by this method. Remember, since  $\theta_i$  are random variables then so is the cross-section obtained by MC method, thus it must have a distribution. To do the loop I will combine the steps of previous lines in one line here and use the power of *Mathematica*: (I am going to do this for  $N_{a,b} \leftarrow 100 N_{a,b}$  to get a nice histogram and more precise result)

```
CSbyMCList = Table[Mean[diffCrossSection[RandomReal[{0.4, 1}, 100 Na]]] (1 - 0.4) + Mean[diffCrossSection[RandomReal[{1,  $\pi - 0.4$ }, 100 Nb]]] ( $\pi - 0.4 - 1$ ), {100}]; // Timing
```

```
{78.0941, Null}
```

**Histogram[CSbyMlist, 10]**



Mean and Standard Deviation for this purpose are:

**Mean[CSbyMlist]**

152.076

**StandardDeviation[CSbyMlist]**

0.145636

**TrueValue = Integrate[diffCrossSection[ $\theta$ ], { $\theta$ , 0.4,  $\pi - 0.4$ }] // Timing**

{0.086097, 152.081}