

## PMDS508L - Python Programming

### Integration using `scipy.integrate` Package

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##### Single Integration:

- Let us demonstrate the one-dimensional integration through an example by numerically evaluating  $\int_0^4 e^{-x^2} dx$
- For this we use `scipy.integrate.quad` function which takes three parameters `integrand_func`, `lower_limit`, `upper_limit` and returns the integral value and error.

```
[1]: import numpy as np
from scipy.integrate import quad

fx = lambda x: np.exp(-x**2)

val, err = quad(fx,0,4)
print('Integration value is: ',val)
print('Error in integration is: ',err)
```

Integration value is: 0.8862269117895689  
Error in integration is: 1.318014947623546e-08

##### Double Integration:

- Let us evaluate the double integration  $\int_{x=x_0}^{x_1} \int_{y=f_1(x)}^{f_2(x)} g(x,y) dy dx$
- For this we use `scipy.integrate.dblquad` function which takes five parameters `integrand_func`, `lower_x_limit`, `upper_x_limit`, `lower_y_limit`, `upper_y_limit` and returns the integral value and error.
- Note that the ordering of the arguments in the definition of  $g$  should correspond to the ordering of integrations in the case of variable integration limits. The first (last) argument of  $g$  is the last (first) to be integrated. If the limits are constants then, the ordering is irrelevant.
- For our understanding let us evaluate the following two integrals  $\int_{x=0}^2 \int_{y=0}^5 x^2 + y dy dx$  and

$$\int_{x=0}^2 \int_{y=0}^x x^2 + y dy dx$$

```
[2]: import numpy as np
from scipy.integrate import dblquad

# integration of x^2+y between x in (0,2) and y in (0,5)
fxy = lambda y,x: x**2 + y

val, err = dblquad(fxy,0,2,0,5)
print('Integration value is: ',val)

# integration of x^2+y between x in (0,2) and y in (0,x)
fxy = lambda y,x: x**2 + y
ly = lambda x: 0
uy = lambda x: x

val, err = dblquad(fxy,0,2,ly,uy)
print('Integration value is: ',val)
```

Integration value is: 38.33333333333333

Integration value is: 5.333333333333333

### Triple Integration:

- Let us evaluate the double integration  $\int_{x=x_0}^{x_1} \int_{y=f_1(x)}^{f_2(x)} \int_{z=g_1(x,y)}^{g_2(x,y)} h(x,y,z) dz dy dx$
  - For this we use `scipy.integrate.tplquad` function which takes seven parameters `integrand_func`, `lower_x_limit`, `upper_x_limit`, `lower_y_limit`, `upper_y_limit`, `lower_z_limit`, `upper_z_limit` and returns the integral value and error.
  - Note that the ordering of the arguments in the definition of  $h$  should correspond to the ordering of integrations in the case of variable integration limits. The first (last) argument of  $h$  is the last (first) to be integrated. If the limits are constants then, the ordering is irrelevant.
  - For our understanding let us evaluate the following two integrals  $\int_{x=0}^2 \int_{y=0}^5 \int_{z=-2}^2 x^2+y+z^3 dz dy dx$
- and  $\int_{x=0}^2 \int_{y=0}^x \int_{z=x+y}^{xy} x^2 + y + z^3 dz dy dx$

```
[3]: import numpy as np
from scipy.integrate import tplquad

fxyz = lambda z,y,x: x**2 + y + z**3
ly = lambda x: 0
uy = lambda x: 5
lz = lambda x,y: -2
uz = lambda x,y: 2

val, err = tplquad(fxyz,0,2,ly,uy,lz,uz)
print('Integration value is: ',val)
```

```

fxyz = lambda z,y,x: x**2 + y + z**3
ly = lambda x: 0
uy = lambda x: x
lz = lambda x,y: x+y
uz = lambda x,y: x*y

val, err = tplquad(fxyz,0,2,ly,uy,lz,uz)
print('Integration value is: ',val)

```

Integration value is: 153.33333333333331  
Integration value is: -16.88

**Example for change of order of integration** Consider the evaluating the integration

$$\int_{x=0}^{0.5} \int_{z=-x}^x \int_{y=z}^{1-2x+z} xy^2 + z \, dy \, dz \, dx$$

```

[4]: from scipy.integrate import tplquad

#function defintion. As the limits are in the order x,z,y
#in the lambda function we use the arguments in the order y,z,x
h = lambda y,z,x : x*y**2 + z

#lambda function for y-limits (which are functions of x and z)
ly = lambda x,z : z
uy = lambda x,z : 1-2*x+z

#lambda function for z-limits (which are functions of x)
lz = lambda x: -x
uz = lambda x: x

#Evaluating the integration
area, err = tplquad(h, 0,0.5, lz, uz, ly, uy)
print('The Integration value is: ',area)

```

The Integration value is: 0.0020833333333333337

### Integration of tabular data

- When we need to integrate a tabular data, we can use `scipy.integrate.trapezoid` for Trapezoidal rule integration or `scipy.integrate.simpson` for Simpson's rule of integration.

Below we will demonstrate the use of the above two integration functions. For the let us consider evaluating the  $\int_0^2 \frac{\sin(x)}{1 + \cos(x)} dx$  by taking  $n = 10$ .

To evaluate the above integral first we need to generate the 10 data points between  $x = 0$  to  $x = 2$  and then evaluate the function value at these points and tabulate them as below:

$x$	0	0.22222222	0.44444444	0.66666667	0.88888889
$f(x)$	0	0.11157063	0.22595393	0.34625355	0.47622143

$x$	1.11111111	1.33333333	1.55555556	1.77777778	2.0
$f(x)$	0.6207753	0.78684289	0.9848742	1.23179859	1.55740772

```
[5]: import numpy as np
import matplotlib.pyplot as plt
from scipy.integrate import trapezoid, simpson
```

```
[6]: x = np.linspace(0,2,10)
y = np.sin(x)/(1+np.cos(x))

#Area by Trapezoidal rule:
area = trapezoid(x,y)
print("Area by Trapezoidal Rule is: ",area)
area = simpson(x,y)
print("Area by Simpon's Rule is: ",area)

#Visualising the area bounded by the curve:
xs = np.linspace(0,2,100)
ys = np.sin(xs)/(1+np.cos(xs))

fig,ax = plt.subplots(figsize=(15,5))
ax.plot(x,y,'or',ms=10,label='Data')
ax.plot(xs,ys,'-b',lw = 2, label = r'$f(x) = \frac{\sin(x)}{1+\cos(x)}$')
ax.fill_between(xs,ys,alpha=0.4,label='Bounded Area')
ax.set_xlabel('x-data')
ax.set_ylabel('f(x)')
plt.legend()
ax.set_title(r'Area bounded by the curve $f(x) = \frac{\sin(x)}{1+\cos(x)}$
↳between $x=0$ and $x=2$')
plt.show()
```

Area by Trapezoidal Rule is: 1.8785944752976969

Area by Simpon's Rule is: 1.8827451321613613

