

## **Numerical Integration**

3 minute read

In this lesson we will learn how to use <code>QuadGK</code> to perform numerical integration of uni-dimensional integrals. <code>QuadGK</code> performs an adaptive Gauss-Kronrod quadrature. You can find more information on the package <a href="https://github.com/JuliaMath/QuadGK.jl">here (https://github.com/JuliaMath/QuadGK.jl</a>).

First of all we need to install QuadGK, to do it type in the REPL:

```
1 using Pkg
2 Pkg.add("QuadGK")
```

Once you have installed the library you are ready to perform numerical integration.

## **Calculations**

The function used to perform numerical integration is <code>quadgk</code> . The first argument of <code>quadgk</code> is the function to be integrated, while the second and third are the integration boundaries. Let's compute a Gaussian integral:

```
1  using QuadGK
2
3  func1(x) = exp(-x^2)
4  res, err = quadgk(func1, -Inf, Inf)
5
6  >>> abs(res-sqrt(π))/sqrt(π)
7  1.25e-12
```

quadgk returns two values: the result of the integration and the estimated error. We know that the result of the Gaussian integral is:

$$\int_{-\infty}^{\infty}e^{-x^2}dx=\sqrt{\pi}$$

If we compare the result of the integration with  $sqrt(\pi)$ , as it is done at line 6, we get a relative error of 1.25e-12, which is a good approximation of the true result.

It is possible to get a better estimation of the value of the integral increasing the relative tolerance rtol. Basically, the integration continues until the relative difference between two successive refinement steps of the integration routine is less than rtol.

```
res, err = quadgk(func1, -Inf, Inf, rtol=1e-15)

>>> abs(res-sqrt(π))/sqrt(π)
2.51e-16
```

The Gauss-Kronrod formula is a modified version of the Gaussian quadrature

(https://en.wikipedia.org/wiki/Gaussian\_quadrature). This kind of algorithms have a parameter called the **order** of the quadrature rule which is linked to how complex the integral approximation scheme is. With a higher order integration rule, it is possible to integrate "exactly" polynomials of higher degree, so if we expect the argument of the integral to be pretty complex, a higher order of the integration rule may help achieving a better accuracy. That being said, the default order is 7 and it is generally enough to compute almost all the integrals you will face. In case you are having difficulty in achieving convergence, try increasing the order of the integration rule.

In our case, if we increase the order of the quadrature we can achieve a result coinciding with the analytical solution (with double-precision):

Increasing the order of the quadrature usually leads to longer integration time.

## **Functions with multiple arguments**

Let's suppose we have a function which takes more than one argument:

```
1 | func2(x, y, z) = x + y^3 + \sin(z)
```

If we want to integrate the function in y from 1 to 3, and we want x and z to be fixed, we need to define an "argument" function in this way:

```
1 x = 5

2 z = 3

3 arg(y) = func2(x, y, z)

4 quadgk(arg, 1, 3)
```

In this case arg takes only one argument, which is the integrated variable.

Another option is to use anonymous functions:

```
1 | quadgk(y -> func2(x, y, z), 1, 3)
```

Although the result is the same, in my opinion the first option is clearer and is particularly handy if we use a let block:

```
1  res, err = let x=5; z=3
2  arg(y) = func2(x, y, z)
3  quadgk(arg, 1, 3)
5  end
```

In this way we avoid fixing x and z outside of the let block (remember, a let block introduces a local scope and thus x and z won't be accessible outside of the let block) and we only get the result of the integration.

Another case where this notation is useful is when the integration appears inside a function:

```
func3(x,y) = x^2*exp(y)

function test_int(x, ymin, ymax)

arg(y) = func3(x, y)

return quadgk(arg, ymin, ymax)[1]

end

test_int(3, 1, 5)
```

For multidimensional integration, see the  $\underline{\text{HCubature.jl}}$  (<a href="https://github.com/stevengj/HCubature.jl">https://github.com/stevengj/Cubature.jl</a>), <a href="https://github.com/stevengj/HCubature.jl">Cubature.jl</a> (<a href="https://github.com/stevengj/HCubature.jl">https://github.com/stevengj/Cubature.jl</a>), and <a href="https://github.com/giordano/Cuba.jl">Cubature.jl</a> (<a href="https://github.com/stevengj/HCubature.jl">https://github.com/stevengj/Cubature.jl</a>), and <a href="https://github.com/giordano/Cuba.jl">Cubature.jl</a> (<a href="https://github.com/giordano/Cuba.jl</a>) packages.

## **Conclusions**

In this lesson we have learnt how to compute uni-dimensional integrals numerically. Furthermore we have seen how it is possible to integrate functions which take multiple arguments.

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