

# Department of Mathematics and Statistics

620–295

## Real analysis with applications

Before starting, copy the folder `Lab3` from the lab server `M&S Lab Materials\620-295` to `D:\MATLAB` and set the path to `D:\MATLAB` including subfolders.

# Laboratory Class 4: Numerical integration

Since many functions that are (Riemann) integrable do not have a closed form indefinite integral in terms of simple functions, it is useful to evaluate definite integrals

$$I = \int_a^b f(x) dx$$

using approximations with well-understood error behaviour.

All numerical approximations for  $I$  involve sampling the integrand  $f$  at a set of points  $\{x_j\} \in [a, b]$  and approximating  $I$  as a weighted sum of the sampled values of  $f$ . Any such process is called *numerical integration* or *quadrature*.

$$Q_N = \sum_{j=0}^N w_j f(x_j) \approx \int_a^b f(x) dx.$$

## 1 Trapezoid rule

Adding up areas of trapezoids gives an approximation to  $\int_a^b f(x) dx$  given by

$$T_N = \frac{\Delta x}{2} (f(a) + 2f(a + \Delta x) + 2f(a + 2\Delta x) + \cdots + 2f(b - \Delta x) + f(b)), \quad \text{where } \Delta x = (b - a)/N.$$

The M-file `trapez.m` computes the approximation  $T_N$  for  $\int_a^b f(x) dx$  with  $N$  intervals.

The M-file `trapDriver.m` specifies the integrand  $f$  and interval  $[a, b]$  and produces trapezoid rule estimates for a range of  $N$  values. It is set up to use the trapezoid rule to approximate

$$\int_0^1 x^4 - x^2 dx = 1/5 - 1/3 = -2/15 \approx -0.1333333333333333.$$

### 1.0.1 Exercise

Run `trapDriver`. By editing `trapDriver`, find out (experimentally) how large  $N$  has to be for the trapezoid estimate to be accurate to 5 significant figures.

Numerical integration is most useful when you don't know the exact answer. The function  $f = \exp(-x^2)$  is integrable but the indefinite integral  $\int e^{-x^2} dx$  does not have an expansion in terms of simple functions.

## 1.0.2 Exercise

Edit and run `trapDriver` to estimate the integral  $\int_0^1 \exp(-x^2) dx$  to 6 significant figures.

Using the Taylor expansion of  $e^{-x^2}$ , express  $\int_0^1 \exp(-x^2) dx$  as a (convergent) infinite series.

## 1.1 Testing the error bound

The trapezoid rule has an error estimate if  $f'' : [a, b] \rightarrow \mathbb{R}$  is continuous,

$$\left| \int_a^b f(x) dx - T_N \right| \leq (\Delta x)^2 \frac{(b-a)M}{12}, \quad \text{where } \Delta x = \frac{b-a}{N}, \quad (1)$$

and  $M$  is an upper bound for  $\{|f''(x)| \mid x \in [a, b]\}$ .

We can see how well this error bound describes the performance of the trapezoid rule by computing successive estimates with finer and finer meshes (smaller and smaller values of  $\Delta x$ ).

### 1.1.1 Exercise

If you compute successive trapezoid rule estimates with  $N = 10, 20, 40, 80 \dots$ , how would you expect the errors to behave, according to the error bound? Explain why a log-log plot is a sensible way to plot the errors versus  $N$ .

The M-file `trapErrors.m` extends `trapDriver` by computing, displaying and plotting the errors, if the exact value of the integral is known. It is set up to use the trapezoid rule to approximate

$$\int_0^1 x^4 - x^2 dx = 1/5 - 1/3 = -2/15 \approx -0.1333333333333333.$$

### 1.1.2 Exercise

Run `trapErrors`. Do the errors behave the way you expect? How can you tell? By editing `trapErrors`, find out (experimentally) how large  $n$  has to be for the trapezoid estimate to be accurate to 5 decimal places.

## 1.2 Non-smooth integrand

Apart from  $(\Delta x)^2$  behaviour, the other important information from the error bound is that it relies on the continuity of the second derivative  $f'' : [a, b] \rightarrow \mathbb{R}$ . What happens if that is not the case?

### 1.2.1 Exercise

Edit and run `trapErrors` to estimate the integral  $\int_0^1 \sqrt{x} dx = 2/3$ .

Do the errors behave the way you expect? How can you tell? How large does  $N$  have to be for the trapezoid estimate to be accurate to 5 significant figures? *Don't try to explain what you see — it's enough to see it!*

## 1.3 Unusually accurate cases

### 1.3.1 Exercise

Edit and run `trapDriver` to estimate the integral  $\int_0^1 x dx = 1/2$ .

How big are the errors? Is this what you expect? Are the results consistent with Eq. 1? *Errors  $\approx 10^{-16}$  can be taken to be numerical approximations to zero in this context.*

### 1.3.2 Exercise

Edit and run `trapErrors` to estimate the integral  $\int_0^{2\pi} \frac{1}{2 + \cos(x)} dx = 2\pi/\sqrt{3}$ .

How big are the errors? Is this what you expect? Are the results consistent with Eq. 1?

## 2 Simpson's rule

Simpson's approximation rule to  $\int_a^b f(x)dx$  is obtained by adding up parabola topped slices,

$$S_N = \frac{\Delta x}{3} (f(a) + 4f(a + \Delta x) + 2f(a + 2\Delta x) + \cdots + 4f(b - \Delta x) + f(b)), \quad \text{where } \Delta x = \frac{b-a}{N}$$

and  $N$  must be even. The M-file `simpson.m` computes the Simpson's rule estimate for  $\int_a^b f(x)dx$  with  $N$  intervals.

### 2.0.3 Exercise

Modify `trapDriver.m` to create an M-file `simpDriver.m` and test it on the integral

$$\int_0^1 x^4 - x^2 dx = 1/5 - 1/3 = -2/15 \approx -0.1333333333333333.$$

### 2.0.4 Exercise

Edit and run `simpDriver` to estimate the integral  $\int_0^1 \exp(-x^2) dx$  to 6 significant figures.

## 2.1 Testing the error bound

Simpson's rule has an error estimate if the fourth derivative  $f^{(4)}: [a, b] \rightarrow \mathbb{R}$  is continuous,

$$\left| \int_a^b f(x)dx - S_N \right| \leq (\Delta x)^4 \frac{(b-a)M}{180}, \quad \text{where } \Delta x = \frac{b-a}{N} \quad (2)$$

and  $M$  is an upper bound for  $\{|f^{(4)}(x)| \mid x \in [a, b]\}$ .

### 2.1.1 Exercise

Modify `trapErrors.m` to create an M-file `simpErrors.m` and test it on the integral

$$\int_0^1 (x^4 - x^2) dx = 1/5 - 1/3 = -2/15 \approx -0.1333333333333333.$$

## 2.2 Non-smooth integrand

### 2.2.1 Exercise

Edit and run `simpErrors` to estimate the integral  $\int_0^1 \sqrt{x} dx = 2/3$ .

Do the errors behave the way you expect? How can you tell?

## 2.3 An unusually accurate case

### 2.3.1 Exercise

Edit and run `simpDriver` to estimate the integral  $\int_0^1 x^2 dx = 1/3$ .

How big are the errors? Is this what you expect?

### 2.3.2 Exercise

Edit and run `simpDriver` to estimate the integral  $\int_0^1 x^3 dx = 1/4$ .

How big are the errors? Is this what you expect? Are the results consistent with Eq. 2?