



# Numerical Integration

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## Newton - Cotes integration formulas

The Newton-Cotes technique for numerical integrations is similar to the one for finding numerical derivatives of functions. That is, we create the interpolating polynomial of degree  $P_n(x)$  for a given function  $y(x)$ . Then instead of integrating the function we integrate the polynomial i.e.

$$\int_a^b y(x)dx \rightarrow \int_a^b P_n(x)dx \quad (1)$$

where ( $x_s = x_0 + sh$ )

$$P_n(x_s) = f_0 + s\Delta f_0 + \frac{s(s-1)}{2!} \Delta^2 f_0 + \frac{s(s-1)(s-2)}{3!} \Delta^3 f_0 + \dots \quad (2)$$

The formulas that one can derive depend on the number of terms of the interpolating polynomial that we will use. The error will be estimate from the integration of the error of the interpolating polynomial used, i.e.

$$E = \int_a^b E_n(x_s)dx \quad (3)$$

where

$$E_n(x_s) = \frac{s(s-1)(s-2)\dots(s-n)}{(n+1)!} h^{n+1} f^{(n+1)}(\xi) \quad \text{where } \xi \in [a, b] \quad (4)$$

# 1st order interpolating polynomial

If we use a 1st order interpolating polynomial we get:

$$\begin{aligned} \int_{x_0}^{x_1} f(x) dx &\rightarrow \int_{x_0}^{x_1} P_1(x_s) dx = \int_{x_0}^{x_1} (f_0 + s\Delta f_0) dx = h \int_{s=0}^{s=1} (f_0 + s\Delta f_0) ds \\ &= [hf_0 s]_0^1 + \left[ h\Delta f_0 \frac{s^2}{2} \right]_0^1 = h \left( f_0 + \frac{1}{2}\Delta f_0 \right) = \frac{h}{2} (f_0 + f_1) \end{aligned} \quad (5)$$

The error introduced when a 1st order polynomial is used is:

$$f(x) - P(x) = \frac{1}{2}s(s-1)h^2 f''(\xi) \quad \text{for } x_0 \leq \xi \leq x_1 \quad (6)$$

Then the error in the relation for numerical integration will be estimated by integrating the above relation

$$\begin{aligned} E &= \int_{x_0}^{x_1} \frac{1}{2}s(s-1)h^2 f''(\xi) dx = \frac{h^3}{2} \int_{s=0}^{s=1} s(s-1) f''(\xi) ds \\ &= h^3 f''(\xi_1) \left( \frac{s^3}{6} - \frac{s^2}{4} \right)_0^1 = -\frac{1}{12} h^3 f''(\xi_1) \quad \text{where } \xi_1 \in [x_0, x_1] \end{aligned} \quad (7)$$

## 2nd order interpolating polynomial

Following the previous procedure we get

$$\begin{aligned}\int_{x_0}^{x_2} f(x)dx &\rightarrow \int_{x_0}^{x_2} P_2(x_s)dx = \int_{x_0}^{x_2} \left( f_0 + s\Delta f_0 + \frac{1}{2}s(s-1)\Delta^2 f_0 \right) dx \\ &= h \int_{s=0}^{s=2} \left( f_0 + s\Delta f_0 + \frac{1}{2}s(s-1)\Delta^2 f_0 \right) ds \\ &= h \left( 2f_0 + 2\Delta f_0 + \frac{1}{3}\Delta^2 f_0 \right) = \frac{h}{3} (f_0 + 4f_1 + f_2) \end{aligned} \quad (8)$$

It happens that the integration of the corresponding error term in our this case gives zero, i.e.

$$\frac{h^3}{3!} \int_0^2 s(s-1)(s-2)f^{(3)}(\xi)ds = 0. \quad (9)$$

Which means that due to this coincidence the error will be smaller than what one my expect and will be estimated by integrating the next term

$$E = \frac{h^4}{4!} \int_0^2 s(s-1)(s-2)(s-3)f^{(4)}(\xi)ds = \dots = -\frac{1}{90}h^5 f^{(4)}(\xi_1) \quad (10)$$

where  $\xi_1 \in [x_0, x_2]$ .

## 3rd order interpolating polynomial

Following the previous procedure we get

$$\int_{x_0}^{x_3} f(x) dx \rightarrow \int_{x_0}^{x_3} P_3(x_s) dx = \frac{3h}{8} (f_0 + 3f_1 + 3f_2 + f_3). \quad (11)$$

In a similar way we get the error:

$$E = -\frac{3}{80} h^5 f^{(4)}(\xi_1) \quad \text{for } \xi_1 \in [x_0, x_3] \quad (12)$$

i.e. the error is  $O(h^5)$  which is of the same order as the error found earlier by using an interpolating polynomial of 2nd order.

This “coincidence” in the order of the errors happens also for 4th and 5th order interpolating polynomials which give an error of the order of  $O(h^7)$ .

# Newton – Cotes Formulae

$$\int_{x_0}^{x_1} f(x)dx = \frac{h}{2} (f_0 + f_1) - \frac{1}{12} h^3 f^{(2)}(\xi_1)$$

$$\int_{x_0}^{x_2} f(x)dx = \frac{h}{3} (f_0 + 4f_1 + f_2) - \frac{1}{90} h^5 f^{(4)}(\xi_1)$$

$$\int_{x_0}^{x_3} f(x)dx = \frac{3h}{8} (f_0 + 3f_1 + 3f_2 + f_3) - \frac{3}{80} h^5 f^{(4)}(\xi_1)$$

**Table 1:** Newton-Cotes for numerical integration by using 1st, 2nd and 3rd order interpolating polynomials

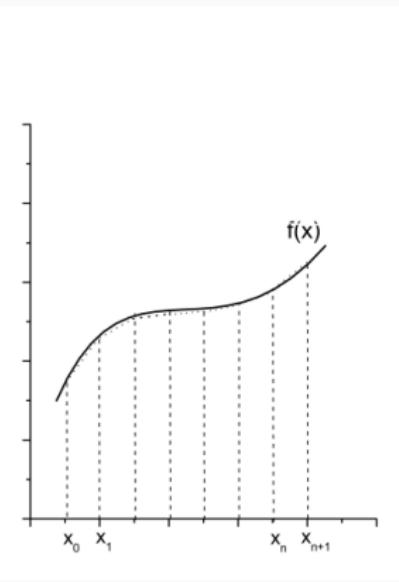
# The trapezoidal rule

If the interval  $(a, b)$  is quite long then we subdivide it into  $n$  subintervals  
i.e.  $\{a = x_0, \dots, x_n = b; n\}$  with  $h = \Delta x = x_{i+1} - x_i = (b - a)/n$

$$\begin{aligned}\int_a^b f(x) dx &= \int_{x_0}^{x_n} f(x) dx = \sum_{i=0}^{n-1} \int_{x_i}^{x_{i+1}} P_1(x) dx \\&= \int_{x_0}^{x_1} P_1(x) dx + \int_{x_1}^{x_2} P_1(x) dx + \dots + \int_{x_{n-1}}^{x_n} P_1(x) dx \\&= \sum_{i=0}^{n-1} \frac{h}{2} (f_i + f_{i+1}) = \frac{h}{2} (f_0 + 2f_1 + \dots + 2f_{n-1} + f_n) \quad (13)\end{aligned}$$

**Global Error:**

$$\begin{aligned}E &= -\frac{h^3}{12} [f''(\xi_1) + f''(\xi_2) + \dots + f''(\xi_n)] \approx -\frac{h^3}{12} n f''(\xi) \\&= -\frac{h^2}{12} (b - a) f''(\xi) \quad \text{where } a \leq \xi \leq b \quad (14)\end{aligned}$$



# Simpson's rules

## Simpson's 1/3 rule

$$\begin{aligned}\int_{a=x_0}^{b=x_n} f(x) dx &= \sum_{i=0}^{n-2} \int_{x_i}^{x_{i+2}} P_2(x) dx = \sum_{i=0}^{n-2} \frac{h}{3} (f_i + 4f_{i+1} + f_{i+2}) \\ &= \frac{h}{3} (f_1 + 4f_2 + 2f_3 + 4f_4 + \dots + 2f_{n-2} + 4f_{n-1} + f_n)\end{aligned}\quad (15)$$

Global Error:

$$E = -\frac{h^5}{90} \frac{n}{2} f^{(4)}(\xi) = -\frac{b-a}{180} h^4 f^{(4)}(\xi) \quad \text{for } a \leq \xi \leq b \quad (16)$$

## Simpson's 3/8 rule

$$\int_{a=x_0}^{b=x_n} f(x) dx = \frac{3h}{8} (f_0 + 3f_1 + 3f_2 + 2f_3 + \dots + 2f_{n-3} + 3f_{n-2} + 3f_{n-1} + f_n) \quad (17)$$

Global Error:

$$E = -\frac{b-a}{80} h^4 f^{(4)}(\xi) \quad \text{for } a \leq \xi \leq b \quad (18)$$

# Formulas for integration

$$\int_{x_0}^{x_n} f(x)dx = \frac{h}{2} (f_0 + 2f_1 + 2f_2 + \dots + 2f_{n-1} + f_n)$$

$$- \frac{b-a}{12} h^2 f^{(2)}(\xi_1)$$

$$\int_{x_0}^{x_n} f(x)dx = \frac{h}{3} (f_0 + 4f_1 + 2f_2 + 4f_3 + \dots + 2f_{n-2} + 4f_n + f_{n+1})$$

$$- \frac{b-a}{180} h^4 f^{(4)}(\xi_1) \quad \text{requires an even number of panels}$$

$$\int_{x_0}^{x_n} f(x)dx = \frac{3h}{8} (f_0 + 3f_1 + 3f_2 + 2f_3 + 3f_4 + \dots + 3f_{n-2} + 3f_{n-1} + f_n)$$

$$- \frac{b-a}{80} h^4 f^{(4)}(\xi_1) \quad \text{number of panels divisible by 3}$$

where  $x_0 \leq \xi_1 \leq x_n$

## Romberg integration i

- for step  $h$ : True value  $A = I_1 + ch^2$
- for step  $kh$ : True value  $A = I_2 + c(kh)^2$

from which we get:

$$A = \frac{k^2 I_1 - I_2}{k^2 - 1} \quad \text{and} \quad c = \frac{I_2 - I_1}{h^2(1 - k^2)} \quad (19)$$

which for example for  $k = 1/2$  gives

$$A = I_2 + \frac{1}{3} (I_2 - I_1) \quad (20)$$

and in the general case for methods with error  $O(h^n)$  and  $k = 1/2$  we can get:

$$A = I_2 + \frac{I_2 - I_1}{2^n - 1}. \quad (21)$$

# Romberg integration ii

## Application

If we start with the trapezoidal rule

$$I_1 = \frac{2h}{2} (f_0 + f_2) = h(f_0 + f_2)$$

$$I_2 = \frac{h}{2} (f_0 + f_1) + \frac{h}{2} (f_1 + f_2) = \frac{h}{2} (f_0 + 2f_1 + f_2)$$

then the **true value**, according to (20), will be

$$A = \frac{2h(f_0 + 2f_1 + f_2) - h(f_0 + f_2)}{3} = \frac{h}{3} (f_0 + 4f_1 + f_2) \quad !!!$$

**EXERCISE:** Test numerically the Romberg method for the Simpson 1/3 formula.

# Splines and integration

For every interval  $[x_i, x_{i+1}]$  we will have a 3rd order polynomial i.e.

$$\begin{aligned}\int_{x_0}^{x_n} f(x) dx &= \sum_{i=0}^{n-1} \int_{x_i}^{x_{i+1}} f(x) dx \\&= \sum_{i=0}^{n-1} \left[ \frac{a_i}{4}(x - x_i)^4 + \frac{b_i}{3}(x - x_i)^3 + \frac{c_i}{2}(x - x_i)^2 + d_i(x - x_i) \right]_{x_i}^{x_{i+1}} \\&= \sum_{i=0}^{n-1} \left[ \frac{a_i}{4}(x_{i+1} - x_i)^4 + \frac{b_i}{3}(x_{i+1} - x_i)^3 + \frac{c_i}{2}(x_{i+1} - x_i)^2 + d_i(x_{i+1} - x_i) \right].\end{aligned}$$
$$\int_{x_0}^{x_n} f(x) dx = \frac{h^4}{4} \sum_{i=0}^{n-1} a_i + \frac{h^3}{3} \sum_{i=0}^{n-1} b_i + \frac{h^2}{2} \sum_{i=0}^{n-1} c_i + h \sum_{i=0}^{n-1} d_i \quad (22)$$

# Gaussian Quadrature i

Mean value theorem:

$$\int_a^b f(x) dx = (b-a)f(\xi) \quad (23)$$

We can get an approximate value for the integral by writing

$$I = \int_a^b f(x) dx \equiv c_0 f(a) + c_1 f(b) \quad (24)$$

This will be exact for polynomials of the form  $f(x) = 1$  and  $f(x) = x$

$$f(x) = x \Rightarrow \int_a^b x \cdot dx = \frac{x^2}{2} \Big|_a^b = \frac{1}{2} (b^2 - a^2) \equiv c_0 \cdot a + c_1 \cdot b \quad (25)$$

$$f(x) = 1 \Rightarrow \int_a^b 1 \cdot dx = x \Big|_a^b = (b-a) \equiv c_0 \cdot 1 + c_1 \cdot 1 \quad (26)$$

$$c_0 = \frac{b-a}{2} \quad \text{and} \quad c_1 = \frac{b-a}{2} \quad (27)$$

## Gaussian Quadrature ii

Thus

$$\int_a^b f(x)dx \equiv \frac{b-a}{2} [f(a) + f(b)] \quad (28)$$

If we continue by creating according to (24), an relation with 3 terms we get:

$$\int_a^b f(x)dx \equiv c_0 f(a) + c_1 f\left(\frac{a+b}{2}\right) + c_2 f(b) \quad (29)$$

This will be exact for polynomials of the form  $f(x) = 1$ ,  $f(x) = x$  and  $f(x) = x^2$  and we can get:

$$\int_a^b f(x)dx = \frac{b-a}{6} \left[ f(a) + 4f\left(\frac{a+b}{2}\right) + f(b) \right] \quad (30)$$

## Euler-Maclaurin Formula i

This procedure can be extended by using the derivatives i.e.

$$\int_a^b f(x)dx = c_0f(a) + c_1f(b) + c_2f'(a) + c_3f'(b) \quad (31)$$

which can be generalized to the **Euler-Maclaurin** formula

$$\begin{aligned} \int_{x_0}^{x_n} f(x) dx &= \frac{h}{2} [f(x_0) + 2f(x_1) + \dots + 2f(x_{n-1}) + f(x_n)] \\ &\quad - \frac{h^2}{12} [f'(x_n) - f'(x_0)] \\ &\quad + \frac{h^4}{720} [f^{(3)}(x_n) - f^{(3)}(x_0)] \\ &\quad - \frac{h^6}{30240} [f^{(5)}(x_n) - f^{(5)}(x_0)] \end{aligned} \quad (32)$$

# Euler-Maclaurin Formula ii

## Example

$$I = \int_0^{\pi/2} \sin(x) dx$$

By using the formula (32) for only 2 points at the ends of the interval we get:

$$\begin{aligned}\int_0^{\pi/2} \sin(x) dx &= \frac{\pi}{4} \left( \sin 0 + \sin \frac{\pi}{2} \right) \quad (= 0.785398) \\ &+ \frac{\pi^2}{2^2 \cdot 12} \left( \cos 0 - \cos \frac{\pi}{2} \right) \quad (= 0.991015) \\ &- \frac{\pi^4}{2^4 \cdot 720} \left( \sin 0 - \sin \frac{\pi}{2} \right) \quad (= 0.999471) \\ &+ \frac{\pi^6}{2^6 \cdot 30240} \left( \cos 0 - \cos \frac{\pi}{2} \right) \quad (= 0.999967) \\ &= \frac{\pi}{4} + \frac{\pi^2}{48} + \frac{\pi^4}{16 \cdot 720} + \frac{\pi^6}{2^6 \cdot 30240} = 0.99996732 \\ &\text{Error} \sim 3 \times 10^{-5}.\end{aligned}$$

## Filon's method i

For integral of the type

$$\int_a^b f(x) \sin(x) dx \quad \text{and} \quad \int_a^b f(x) \cos(x) dx$$

we can try

$$\int_0^{2\pi} f(x) \sin(x) dx \approx A_1 f(0) + A_2 f(\pi) + A_3 f(2\pi)$$

which will be true for  $f(x) = 1$ ,  $f(x) = x$  and  $f(x) = x^2$

$$f(x) = 1 \quad \Rightarrow \quad 0 = A_1 + A_2 + A_3$$

$$f(x) = x \quad \Rightarrow \quad -2\pi = \pi A_2 + 2\pi A_3$$

$$f(x) = x^2 \quad \Rightarrow \quad -4\pi^2 = \pi^2 A_2 + 4\pi^2 A_3$$

with solution  $A_1 = 1$ ,  $A_2 = 0$  and  $A_3 = -1$ . Thus

$$\int_0^{2\pi} f(x) \sin x dx \approx f(0) - f(2\pi).$$

For  $f(x) = x^3$  the exact value is  $\approx -210$  and the approximate one  $\approx -248$ .

## the General Formula

$$\int_a^b y(x) \sin(kx) dx \approx h [Ay(a) \cos(ka) - Ay(b) \cos(kb) + BS_e + DS_o] \quad (33)$$

$$\int_a^b y(x) \cos(kx) dx \approx h [Ay(a) \cos(ka) - Ay(b) \cos(kb) + BC_e + DC_o] \quad (34)$$

$$A = \frac{1}{q} + \frac{\sin(2q)}{2q^2} - \frac{2\sin^2(q)}{q^3} \quad (35)$$

$$B = \frac{1}{q^2} + \frac{\cos^2(q)}{q^2} - \frac{\sin(2q)}{q^3} \quad (36)$$

$$D = \frac{4\sin(q)}{q^3} - \frac{4\cos(q)}{q^2} \quad (37)$$

## Filon's method iii

$$S_e = -y(a) \sin(ka) - y(b) \sin(kb) + 2 \sum_{i=0}^n y(a + 2ih) \sin(ka + 2iq) \quad (38)$$

$$S_o = \sum_{i=1}^n y[a + (2i - 1)h] \sin[ka + (2i - 1)q] \quad (39)$$

$$C_e = -y(a) \sin(ka) - y(b) \sin(kb) + 2 \sum_{i=0}^n y(a + 2ih) \sin(ka + 2iq) \quad (40)$$

$$C_o = \sum_{i=1}^n y[a + (2i - 1)h] \sin[ka + (2i - 1)q] \quad (41)$$

where  $q = kh$ .

## Filon's method iv

### Example

$$I = \int_0^{2\pi} e^{-x/2} \cos(100x) dx = \frac{2(1 - e^{-\pi})}{40001} \approx 4.783810813 \times 10^{-5} \quad (42)$$

Notice that Filon's method with only 4 points outperforms Simpson's method with 1000 points

$n$	Simpson	Filon
4	1.91733833E+0	4.77229440E-5
8	-5.73192992E-2	4.72338540E-5
16	2.42801799E-2	4.72338540E-5
128	5.55127202E-4	4.78308678E-5
256	-1.30263888E-4	4.78404787E-5
1024	4.77161559E-5	4.78381120E-5
2048	4.78309107E-5	4.78381084E-5

## Gauss' method i

It is an extension of the previous techniques but instead of fixing the points of the interval we calculate them together with the weighting coefficients. For example

$$\int_{-1}^1 f(x)dx \approx af(x_1) + bf(x_2) \quad (43)$$

this integral can be exact for  $f(x) = 1$ ,  $f(x) = x$ ,  $f(x) = x^2$  and  $f(x) = x^3$ . Thus we get the following system of equations:

$$\left. \begin{array}{l} f(x) = 1 \Rightarrow 2 = a + b \\ f(x) = x \Rightarrow 0 = ax_1 + bx_2 \\ f(x) = x^2 \Rightarrow \frac{2}{3} = ax_1^2 + bx_2^2 \\ f(x) = x^3 \Rightarrow 0 = ax_1^3 + bx_2^3 \end{array} \right\} \Rightarrow \begin{array}{l} a = b = 1 \\ x_1 = -x_2 = -\left(\frac{1}{3}\right)^{1/2} = -0.5773 \end{array}$$

$$\int_{-1}^1 f(x)dx \approx f(-0.5773) + f(0.5773)$$

Thus we need to evaluate the function only at only 2 appropriate points which are:  $x_1 = -0.5773$  and  $x_2 = 0.5773$ .

## Gauss' method ii

For arbitrary end-points we use the transformation:

$$t = \frac{1}{2}(b-a)x + \frac{1}{2}(b+a) \quad \text{and} \quad dt = \frac{b-a}{2}dx. \quad (44)$$

### EXAMPLE

$$I = \int_0^{\pi/2} \sin(x)dx$$

We change the variable of integration to get the limits of integration -1 and 1

$$x = \frac{1}{2}\left(\frac{\pi}{2}t + \frac{\pi}{2}\right) = \frac{\pi}{4}(t+1) \quad \text{and} \quad dx = \frac{\pi}{4}dt$$

and the new integral is:

$$\begin{aligned} I &= \frac{\pi}{4} \int_{-1}^1 \sin\left[\frac{\pi}{4}(t+1)\right] dt \\ &= \frac{\pi}{4} [1.0 \times \sin(0.10566 \times \pi) + 1.0 \times \sin(0.39434 \times \pi)] = 0.99849 \end{aligned}$$

i.e. an error  $1.53 \times 10^{-3}$  while the 2 point trapezoidal rule gives  $I = 0.7854$  and Simposn's 3 point formula 1.0023.

## Gauss-Legendre method

It is a generalization of Gauss' method of  $n$  points, i.e. if

$$\int_{-1}^1 f(x) dx \approx \sum_{i=1}^n A_i f(x_i) \quad (45)$$

we have to solve a system of  $2n$  equations to calculate the  $2n$  quantities  $A$  and  $x_i$ . This method will be exact for polynomials up to degree  $2(n - 1)$  thus the  $2n$  equations can be written as:

$$A_1 x_1^k + \dots + A_n x_n^k = \begin{cases} 0 & \text{for } k = 1, 3, 5, \dots, 2n - 1 \\ \frac{2}{k+1} & \text{for } k = 2, 4, 6, \dots, 2n - 2 \end{cases} \quad (46)$$

It can be proved that the  $x_i$  are roots of the **Legendre polynomial** of  $n$ th-degree which can be always found in the interval  $(-1, 1)$ .

The Legendre polynomials can be derived from the recursion relation:

$$(n + 1) L_{n+1}(x) - (2n + 1) x L_n(x) + n L_{n-1}(x) = 0 \quad (47)$$

where the first 3 are:

$$L_0(x) = 1, \quad L_1(x) = x \quad \text{and} \quad L_2(x) = \frac{3}{2}x^2 - \frac{1}{2} \quad (48)$$

Then the  $A_i$  are estimated from:

$$A_i = \frac{2(1-x^2)}{n^2 [L_{n-1}(x_i)]^2} \quad (49)$$

For example, if  $n = 4$  we should find the roots of 4th-degree Legendre polynomial

$$P_4 = \frac{1}{8} (35x^4 - 30x^2 + 3)$$

which are  $x_i = \pm \left[ (15 \pm 2\sqrt{30})/35 \right]^{1/2}$  and then by using (49) to calculate  $A_i$ .  
The exact values are given in the Table 2

$n$	$x_i$	$A_i$
2	$\pm 0.5773502692$	1.000000000
4	$\pm 0.8611363116$	0.3478548451
	$\pm 0.3394810436$	0.6521451549
8	$\pm 0.9602898565$	0.1012285363
	$\pm 0.7966664774$	0.2223810345
	$\pm 0.5255324099$	0.3137066459
	$\pm 0.1834346425$	0.3626837834

Table 2: The values of  $x_i$  and  $A_i$  for the Gauss-Legendre for 2, 4 and 8 points.

Table 25.4 ABSCISSAS AND WEIGHT FACTORS FOR GAUSSIAN INTEGRATION

$\int_{-1}^{+1} f(x)dx = \sum_{i=1}^n w_i f(x_i)$					
Abscissas= $\pm x_i$ (Zeros of Legendre Polynomials)			Weight Factors= $w_i$		
$\pm x_i$	$w_i$	$\pm x_i$			$w_i$
$n=2$					
0.57735 02691 89626	1.00000 00000 00000	0.18343 46424 95650	0.36268 37833 78362		
		0.52553 24099 16329	0.31370 66458 77887		
		0.79666 64774 13627	0.22238 10344 53374		
		0.96028 98564 97536	0.10122 85362 90376		
$n=3$					
0.00000 00000 00000	0.88888 88888 88889	0.00000 00000 00000	0.33023 93550 01260		
0.77459 66692 41483	0.55555 55555 55556	0.32425 34234 03809	0.31234 70770 40003		
		0.61337 14327 00590	0.26061 06964 02935		
0.33998 10435 84856	0.65214 51548 62546	0.83603 11073 26636	0.18061 81606 94857		
0.86113 63115 94053	0.34785 48451 37454	0.96816 02395 07626	0.08127 43883 61574		
$n=4$					
0.53846 93101 05683	0.56888 88888 88889	0.14887 43389 81631	0.29552 42247 14753		
0.90617 98459 38664	0.47862 86704 99366	0.43339 53941 29247	0.26296 67193 09996		
		0.67940 95682 99024	0.21908 63625 15982		
0.23861 91860 83179	0.46791 39345 72691	0.86505 33666 88985	0.14945 13491 50581		
0.46120 93864 66265	0.36076 15730 48139	0.97390 65285 17172	0.06667 13443 08688		
0.93246 95142 03152	0.17132 44923 79170	0.12523 34095 11469	0.24914 70458 13403		
$n=5$					
0.00000 00000 00000	0.56888 88888 88889	0.36783 14989 98180	0.23349 25365 38355		
0.53846 93101 05683	0.47862 86704 99366	0.58731 79542 86617	0.20316 74267 23066		
0.90617 98459 38664	0.23692 68850 56189	0.76990 26741 94305	0.16007 83285 43346		
0.23861 91860 83179	0.41795 91836 73469	0.98411 72563 70475	0.10693 93259 95188		
0.46120 93864 66265	0.34790 53914 89217	0.98156 06342 46719	0.04717 53363 86512		
0.93246 95142 03152	0.12948 49661 68870	0.12523 34095 11469	0.24914 70458 13403		
$n=6$					
0.00000 00000 00000	0.41795 91836 73469	0.12523 34095 11469	0.24914 70458 13403		
0.40584 51515 77397	0.34883 08565 05119	0.58731 79542 86617	0.20316 74267 23066		
0.74153 11855 99394	0.27970 53914 89217	0.76990 26741 94305	0.16007 83285 43346		
0.94910 79123 42759	0.12948 49661 68870	0.98411 72563 70475	0.10693 93259 95188		
0.93246 95142 03152	0.09349 91649 93256	0.98156 06342 46719	0.04717 53363 86512		
$n=7$					
0.00000 00000 00000	0.41795 91836 73469	0.12523 34095 11469	0.24914 70458 13403		
0.40584 51515 77397	0.34883 08565 05119	0.58731 79542 86617	0.20316 74267 23066		
0.74153 11855 99394	0.27970 53914 89217	0.76990 26741 94305	0.16007 83285 43346		
0.94910 79123 42759	0.12948 49661 68870	0.98411 72563 70475	0.10693 93259 95188		
0.93246 95142 03152	0.09349 91649 93256	0.98156 06342 46719	0.04717 53363 86512		
$n=8$					
0.09501 25098 37637 44018	0.18945 06104 55068 496285	0.18260 34150 44923 58867	0.14917 39864 72603 744789		
0.28160 35507 79259 91320	0.18260 34150 44923 58867	0.16915 65193 95922 53689	0.14917 39864 72603 744789		
0.45801 67776 22227 386342	0.18260 34150 44923 58867	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.61781 80287 02426 17417	0.18260 34150 44923 58867	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.73730 60887 15419 560673	0.18260 34150 44923 58867	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.51086 70019 50827 098004	0.18260 34150 44923 58867	0.13168 86384 49176 626898	0.111819 45319 61518 417312		
0.63605 36807 26515 025453	0.18260 34150 44923 58867	0.111819 45319 61518 417312	0.10193 01198 17240 435037		
0.74633 19064 60150 792614	0.18260 34150 44923 58867	0.10193 01198 17240 435037	0.08327 67415 76709 748725		
0.83911 69718 22218 823395	0.18260 34150 44923 58867	0.08327 67415 76709 748725	0.05267 20483 34109 063570		
0.91223 44282 51325 905868	0.18260 34150 44923 58867	0.05267 20483 34109 063570	0.04060 14298 00380 941331		
0.96597 19272 77913 791268	0.18260 34150 44923 58867	0.04060 14298 00380 941331	0.01761 40071 39152 118312		
$n=16$					
0.07652 65211 33497 33755	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.25779 88674 73616 309159	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.43700 60887 15419 560673	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.51086 70019 50827 098004	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.63605 36807 26515 025453	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.74633 19064 60150 792614	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.83911 69718 22218 823395	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.91223 44282 51325 905868	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.96597 19272 77913 791268	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.99312 85991 85094 924786	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
$n=20$					
0.06405 68928 62605 626085	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.19111 88674 73616 309159	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.31504 26796 96163 443487	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.43700 60887 15419 560673	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.54542 14713 88839 535658	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.64809 36519 36975 569252	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.74012 41915 78554 364244	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.82000 19859 73908 921954	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.88641 55270 04401 034213	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.93827 45520 02732 758524	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.97472 85552 49898 98998	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.99518 72199 97021 360180	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
$n=24$					
0.06405 68928 62605 626085	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.19111 88674 73616 309159	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.31504 26796 96163 443487	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.43700 60887 15419 560673	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.54542 14713 88839 535658	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.64809 36519 36975 569252	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.74012 41915 78554 364244	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.82000 19859 73908 921954	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.88641 55270 04401 034213	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.93827 45520 02732 758524	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.97472 85552 49898 98998	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		
0.99518 72199 97021 360180	0.15275 33871 30725 850698	0.14917 39864 72603 744789	0.14917 39864 72603 744789		

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## Generalization of Gauss's method

For integrals of the type

$$I = \int_a^b w(x)y(x)dx \quad (50)$$

one can use alternative orthogonal polynomials, and by writing

$$\int_a^b w(x)y(x)dx = \sum_{i=1}^n A_i y(x_i) \quad (51)$$

the unknowns  $x_i$  and  $A_i$  can be found from tables in mathematical handbooks.

Depending on the form of the weighting function  $w(x)$  we have the following choices:

- **Gauss-Legendre method** for weighting function  $w(x) = 1$ .
- **Gauss-Laguerre method** for integrals of the form

$$\int_0^\infty e^{-x} y(x) dx \approx \sum_{i=1}^n A_i y(x_i) \quad (52)$$

with weighting function  $w(x) = e^{-x}$  where  $x_i$  are roots of the **Laguerre polynomials** which can be created from the recursion:

$$L_n(x) = e^x \frac{d^n}{dx^n} (e^{-x} x^n) \quad (53)$$

while the coefficients  $A_i$  will be given by:

$$A_i = \frac{(n!)^2}{x_i [L'_n(x_i)]^2} \quad (54)$$

$n$	$x_i$	$A_i$
2	0.58578644	0.85355339
	3.41421356	0.14644661
4	0.32254769	0.60315410
	1.74576110	0.35741869
	4.53662030	0.03888791
	9.39507091	0.00053929
6	0.22284660	0.10122854
	1.18893210	0.41700083
	2.99273633	0.11337338
	5.77514357	0.01039920
	9.83746742	0.00026102
	15.98287398	0.00000090

**Table 3:** The values of  $x_i$  and  $A_i$  of Gauss-Laguerre method for 2, 4 and 6 points.

- **Gauss-Hermite method** for integrals of the form

$$\int_{-\infty}^{\infty} e^{-x^2} y(x) dx \approx \sum_{i=1}^n A_i y(x_i) \quad (55)$$

i.e. the weighting function is  $w(x) = e^{-x^2}$  while the  $x_i$  are roots of the **Hermite polynomials**. The Hermite polynomials can be created via the relation

$$H_n(x) = (-1)^n e^{x^2} \frac{d^n}{dx^n} \left( e^{-x^2} \right) \quad (56)$$

while the coefficients  $A_i$  can be found by the relation:

$$A_i = \frac{2^{n+1} n! \sqrt{\pi}}{[H'_n(x_i)]^2} \quad (57)$$

Both  $x_i$  and  $A_i$  are given in Table 4.

$n$	$x_i$	$A_i$
2	$\pm 0.70710678$	0.88622693
4	$\pm 0.52464762$	0.80491409
	$\pm 1.65068012$	0.08131284
6	$\pm 0.43607741$	0.72462960
	$\pm 1.33584907$	0.15706732
	$\pm 2.35060497$	0.00453001

**Table 4:** The values  $x_i$  and  $A_i$  of the Gauss-Hermite method for 2, 4 and 6 points.

- **Gauss-Chebyshev method** for integrals of the form:

$$\int_{-1}^1 \frac{y(x)}{\sqrt{1-x^2}} dx \approx \frac{\pi}{n} \sum_{i=1}^n y(x_i) \quad (58)$$

i.e. the weighting function is

$$w(x) = \frac{1}{\sqrt{1-x^2}} \quad (59)$$

while the  $x_i$  are the roots of the **Chebyshev polynomials**

$$T_n(x) = \cos[n \arccos(x)] \quad (60)$$

and given by the relations

$$x_i = \cos\left[\frac{\pi}{2n}(2i-1)\right]. \quad (61)$$

While the  $A_i$  are given by

$$A_i = \frac{\pi}{n} \quad (62)$$

where  $n$  is the degree of the polynomial that we use.

# Improper and Indefinite integrals

For example:

$$I = \int_0^{\infty} xe^{-x} dx$$

this can be written as

$$I = \int_0^1 xe^{-x} dx + \int_1^{\infty} xe^{-x} dx$$

and substitute  $y = 1/x$  in the 2nd part

But in general we can write it in the form

$$I = \lim_{A \rightarrow \infty} \int_0^A xe^{-x} dx$$

and try various values for A. For example

A	I
1	0.26424
10	0.9995006008
20	0.9999999567157739
100	1.00000000
$\infty$	1.0000000

## Multiple integrals

If the limits of integrations are constants then we can sequentially apply one of the previous integration methods

$$\int_A \int f(x, y) dA = \int_a^b \left( \int_c^d f(x, y) dy \right) dx = \int_c^d \left( \int_a^b f(x, y) dx \right) dy$$

If for example we use 4 points in the  $x$  direction and 5 in the  $y$  direction we can use the trapezoidal rule in the  $x$  direction and Simpson's rule in the  $y$  direction. This can be written as:

$$\begin{aligned} \int f(x, y) dx dy &= \sum_{j=1}^m v_j \sum_{i=1}^n w_i f_{ij} \\ &= \frac{\Delta y}{3} \frac{\Delta x}{2} [(f_{11} + 2f_{21} + 2f_{31} + f_{41}) + 4(f_{12} + 2f_{22} + 2f_{32} + f_{42}) \\ &\quad + \dots + (f_{15} + 2f_{25} + 2f_{35} + f_{45})] \end{aligned}$$

# Exercises on Multiple integrals

Try the following example:

$$\int_0^1 \left( \int_0^2 xy^2 dx \right) dy = \frac{2}{3}$$

$$\int_0^1 \left( \int_{2y}^2 xy^2 dx \right) dy = \frac{4}{15}$$

$$\int_0^2 \left( \int_0^{x/2} xy^2 dy \right) dx = ?$$