

# Theory and Practice of Symbolic Integration in Maple

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# Introduction

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Yes.

## Two Related Problems

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Unfortunately, not always as related as we might hope.

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Moses later went on to write the integration engine for Macsyma, the system that would inspire Geddes and Gonnet to start writing Maple in the late 1970s.

## Derivative Divides - First Weapon of SIN

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Most first year calculus integration problems can be solved by this simple method together with expanding and splitting over sums.

## The Rest of SIN

1. Matches patterns and uses known formulae to compute integrals.
2. If the integral doesn't match a known pattern, break up using integration by parts or try the Risch algorithm.

## The Risch Theorem

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His method builds on work 19th century work of Liouville and is a generalization of partial fraction algorithm for rational polynomials.

$$\int p(x) + \sum_{i,j} \frac{a_{i,j}}{(x - \alpha_i)^j} dx = v(x) + \sum_i c_i \log(u_i(x))$$

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Techniques based on Algebra: resultants and differential field theory

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Risch can be extended to integrate elementary functions together with erf.

$$\int e^{-(ax^2+2bx+c)} dx = 1/2 \sqrt{\pi/a} e^{\frac{b^2-ac}{a}} \operatorname{erf}(\sqrt{a}x + b/\sqrt{a})$$

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In practice, Maple works much like SIN - it analyses the integrand and tries many simple techniques and known formulae before applying the its implementation of the Risch algorithm.

# Fundamental Theorem of Calculus (FToC)

As we all learned in first year, the indefinite integral

$$F(x) = \int f(x) dx$$

is related to the definite integral

$$\int_a^b f(x) dx = F(b) - F(a)$$

Don't forget the fine print:  $f$  must be continuous on  $[a, b]$

And the missing print:  $F$  must also be continuous on  $[a, b]$

## Algebraic vs. Analytic Indefinite Integrals

Consider the indefinite integral:

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$F$  is an indefinite integral algebraically, but it is not the continuous antiderivative that we know exists from analysis:

$$\hat{F}(x) = \int_0^x 1/(x^2 - 8x + 17) dx = \arctan(x - 4)$$

## Computer Analysis

Since indefinite integrals are computed using algebra, we must be very careful applying the FToC to compute definite integrals.

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1. Singularity and discontinuity detection - check if indefinite integrals are continuous
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Key Tools:

1. Singularity and discontinuity detection - check if indefinite integrals are continuous
2. Computation of (one-sided) limits - we can use these to “fix” discontinuous integrals and use them for FToC.

This is can be very hard when the integrand contains symbols other than  $x$ .

## FToC in Maple

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$$\hat{F}(x) = \begin{cases} F(x) & x < c \\ F(x) - \lim_{x \rightarrow c^+} F(x) + \lim_{x \rightarrow c^-} F(x) & c \leq x \end{cases}$$

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- Compute definite integral

$$\int_a^b f(x) dx = \lim_{x \rightarrow b^-} \hat{F}(x) - \lim_{x \rightarrow a^+} \hat{F}(x)$$

## FToC Methods in Maple

Maple's `int` command accepts several options:

`int(expr, x=a..b, 'continuous');` avoids checking for discontinuities

`int(expr, x=a..b, 'CauchyPrincipalValue');` computes the limits at the end points, and one-sided limits at singularities simultaneously (cancels infinities)

`int(expr, x=a..b, 'method'='FTOC');` forces only FToC to be tried computing limits with the method by D. Gruntz (i.e. the `limit` command)

`int(expr, x=a..b, 'method'='FTOCMS');` forces only FToC to be tried computing limits with the method by B. Salvy (i.e. the `MultiSeries` package)

## Other Methods of Definite Integration

Due to difficulties with FToC and the fact that some integrals do not have closed form indefinite integrals, other techniques are needed.

Most integration engines use pattern matching and heuristic search methods to try to solve many integrals by applying known formulae such as are cataloged in tomes like: Abramowitz & Stegun, Gradshteyn & Ryzhik, and Prudnikov, Brychkov, & Marichev.

In Maple we take care when using these formulae, since these references are known to have many errors.

## Elliptic Integrals

All integrals of the form

$$\int_0^a \frac{f_1(x) + f_2(x)\sqrt{T(x)}}{f_3(x) + f_4(x)\sqrt{T(x)}},$$

where the  $f_i$  are polynomials, and  $T$  is a polynomial of degree at most four, can be written in terms of the three canonical elliptic functions `EllipticF`, `EllipticE`, and `EllipticPi`. e.g.

$$E(x, k) = \int_0^x \sqrt{\frac{1 - k^2 t^2}{1 - t^2}} dt$$

`int(expr, x=a..b, 'method'='Elliptic');`  
forces only this technique to be tried.

# MeijerG Functions

The Meijer G functions are a broad class of generalized hypergeometric functions

$$G_{p,q}^{m,n} \left( \begin{matrix} a_1, \dots, a_p \\ b_1, \dots, b_q \end{matrix} \middle| z \right) = \frac{1}{2\pi i} \int_L \frac{\prod_{j=1}^m \Gamma(b_j - s) \prod_{j=1}^n \Gamma(1 - a_j + s)}{\prod_{j=m+1}^q \Gamma(1 - b_j + s) \prod_{j=n+1}^p \Gamma(a_j - s)} z^s ds .$$

with two useful properties:

1. Elementary and many higher functions can be written as MeijerG functions
2. There are simple formulas for integrals of MeijerG functions and products of MeijerG functions in terms of  $\Gamma$  and other MeijerG functions.

## Examples

$$e^x = G_{0,1}^{1,0} \left( 0 \mid -x \right)$$

$$\arcsin x = \frac{-i}{2\sqrt{\pi}} G_{2,2}^{1,2} \left( \begin{matrix} 1, 1 \\ \frac{1}{2}, 0 \end{matrix} \mid -x^2 \right)$$

$$\ln(1+x) = G_{2,2}^{1,2} \left( \begin{matrix} 1, 1 \\ 1, 0 \end{matrix} \mid x \right)$$

$$J_\nu(x) = G_{0,2}^{1,0} \left( \begin{matrix} \frac{\nu}{2}, \frac{-\nu}{2} \\ \frac{x^2}{4} \end{matrix} \right)$$

# MeijerG Functions

Integration via MeijerG is very powerful. For example:

$$\int_0^\infty G_{p,q}^{m,n} \left( \begin{matrix} \mathbf{a} \\ \mathbf{b} \end{matrix} \middle| \eta x \right) G_{\sigma,\tau}^{\mu,\nu} \left( \begin{matrix} \mathbf{c} \\ \mathbf{d} \end{matrix} \middle| \omega x \right) dx = \frac{1}{\eta} G_{q+\sigma, p+\tau}^{n+\mu, m+\nu} \left( \begin{matrix} -b_1, \dots, -b_m, \mathbf{c}, -b_{m+1}, \dots, -b_q \\ -a_1, \dots, -a_n, \mathbf{d}, -a_{n+1}, \dots, -a_p \end{matrix} \middle| \frac{\omega}{\eta} \right)$$

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```
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# Definite Integration in Maple

Creating good integration software is about balancing the strengths and weaknesses of the various integration techniques. In Maple 14 it goes something like this:

1. use quick techniques for simple polynomial and rational integrands
2. try to match various formulae, including Elliptic formulae
3. if the integrand has special/higher functions, try MeijerG
4. if not, try FToC using Gruntz limits
5. try MeijerG for any integrand
6. try FToC using MultiSeries limits

Thank you for listening