Mr. CAS- A Minimalistic (pure) Ruby CAS for Fast Prototyping and Code Generation

Matteo Ragni^a

^aDepartment of Industrial Engineering, University of Trento, 9, Sommarive, Povo di Trento, Italy

Abstract

There are complete **Computer Algebra System** (CAS) systems on the market with complete solutions for manipulation of analytical models. But exporting a model to a given target language is often a rigid procedure that requires some manual post-processing, even with a good software. This work presents a *Ruby* library that exposes core CAS capabilities—i.e. simplification, substitution, evaluation, etc. The library aims at rapid prototyping of numerical interfaces, and code generation for different target languages, separating mathematical expression from code generation rules supporting best practices for numerical conditioning. The library is implemented in pure *Ruby* language and is compatible with most *Ruby* interpreters.

Keywords: CAS, code-generation, Ruby

1. Motivation and significance

- Ruby [1] is a purely object-oriented scripting language designed in the mid-1990s by Yukihiro Matsumoto, internationally standardized since 2012 as ISO/IEC 30170.
- With the advent of the *Internet of Things*, a compact version of the *Ruby* interpreter called mRuby (eMbedded Ruby) [2] has been published on GitHub
- by Matsumoto, in 2014. The new interpreter is a lightweight implementation,
- 8 aimed at both low power devices and PC, and complies with the standard[3].
- mRuby has a completely new API, and it is designed to be embedded in
- complex projects as a front-end interface—e.g., a numerical optimization suite may use mRuby to for problem definition.
- The *Ruby* code-base exposes a large set of utilities in core and standard libraries, that can be furthermore expanded through third party libraries,

Email address: matteo.ragni@unitn.it (Matteo Ragni)

or gems. Among the large number of available gems, Ruby still lacks an **automatic symbolic differentiation** (ASD) [4] engine that handles basic computer algebra routines, compatible with all different Ruby interpreters.

Nowadays *Ruby* is mainly known thanks to the web-oriented *Rails* framework, Its expressiveness and elegance though make it intriguing for use in the scientific/technical field. An ASD-capable gem would prove a foundamental step in this direction, including the support for flexible code generation for high-level software—e.g., IPOPT [5, 6].

 $Mr.CAS^1$ is a gem implemented in pure Ruby that supports symbolic differentiation (SD) and some computer algebra operations [7]. The library aims at:

- support rapid prototyping of numerical algorithms and code generation to different target languages;
- when dealing with mathematical models, support a clean and separate formulation of conditioning rules for numerical issues, in order to support more robust code generation;
- create a complete open-source CAS system for the standard *Ruby* language, as a long-term effort.

Other CAS libraries for *Ruby* are available:

15

16

17

18

19

20

21

22

23

25

26

27

28

29

30

31

32

Rucas [8], Symbolic [9]: milestone gems, yet at early stage and with discontinued development status. Both offer basic simplification routines, although they lack differentiation.

Symengine [10]: is a wrapper of the symengine C++ library. The back end library is very complete, but it is compatible only with the vanilla
 C Ruby interpreter and has several dependencies. At best of Author
 knowledge, at the moment it seems not working using the Ruby 2.x
 interpreter.

In Section 2, Mr.CAS container and tree structure is explained in detail and applied to basic CAS tasks. In Section 3, two examples on how to use the library as code generator or as interface are described. Finally, the reasons behind the implementation and the long term desired impact are depicted in Section 4. All code listings are available at http://bit.ly/Mr_GCAS_examples.

¹Minimalistic Ruby Computer Algebra System

2. Software description

48 2.1. Software Architecture

49

50

51

52

53

54

Mr.CAS is an object oriented ASD gem that supports some computer algebra routines such as *simplifications* and *substitutions*. When gem is required, it overloads methods of Fixnum and Float classes, making them compatible with foundamental symbolic classes.

Each symbolic expression (or operation) is the instance of an object, that inherits from a common virtual ancestor: CAS::Op. An operation encapsulates sub-operations recursively, building a tree, that is the mathematical equivalent of function composition:

$$(f \circ g) \tag{1}$$

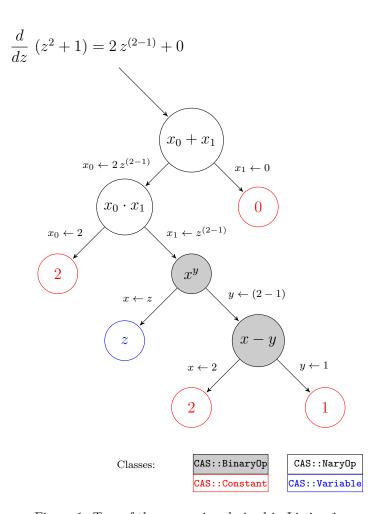


Figure 1: Tree of the expression derived in Listing $\mathbf{1}$

When a new operation is created, it is appended to the tree. The number of branches are determined by the parent container class of the current symbolic function. There are three possible containers:

60 CAS::Op single sub-tree operation — e.g. $\sin(\cdot)$.

cas::BinaryOp dual sub-tree operation — e.g. exponent x^y — that inherits from CAS::Op.

63 CAS::NaryOp operation with arbitrary number of sub-tree — e.g. sum $x_1 + \cdots + x_N$ — that inherits from CAS::Op.

Figure 1 contains a graphical representation. The different kind of containers allows to introduce some properties — i.e. associativity and commutativity for sums and multiplications [11]. Each container exposes the sub-tree as instance properties. Containers interfaces and inheritances are shown in Figure 2.

Terminal leaves of the graph are the classes CAS::Constant, CAS::Variable and CAS::Function. The first models a simple numerical value, while the second represents an independent variable, that can be used to perform derivatives and evaluations, and the latter is a prototype of implicit functions. As for now, those leaves exemplify only real scalar expressions, with definition of complex, vectorial and matricial extensions as milestones for the next major release.

SD (CAS::Op#diff) crosses the graph until it reaches ending nodes. A terminal node is the starting point for derivatives accumulation, the mathematical equivalent of the chain rule:

$$(f \circ g)' = (f' \circ g) g' \tag{2}$$

The recursiveness is used also for simplifications (CAS::Op#simplify), substitutions (CAS::Op#subs), evaluations (CAS::Op#call) and code generation.

83 2.2. Software Functionalities

70

71

75

76

77

78

2.2.1. Basic Functionalities

No additional dependencies are required. The gem can be installed through rubygems.org provider². Functionalities must be required runtime using the Kernel method: require r.CAS. All methods and classes are incapsulated in the module CAS.

²gem install Mr.CAS

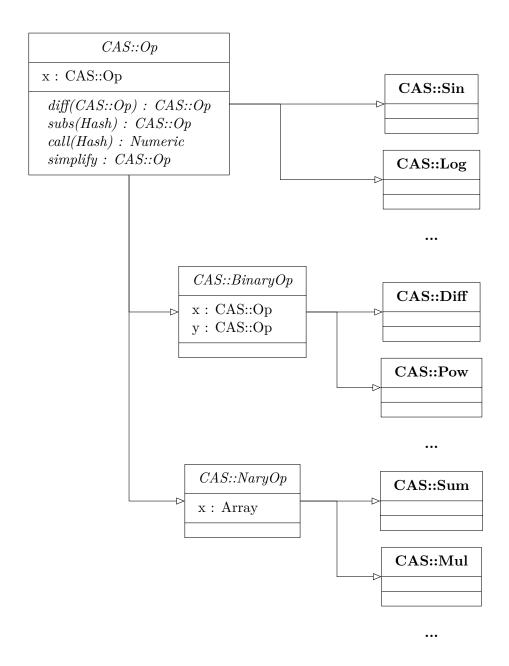


Figure 2: Simplified version of classes interface and inheritance

SD is performed with respect to independent variables (CAS::Varia-ble) through forward accumulation, even for implicit functions. The differentiation is done by the method CAS::Op#diff, having a CAS::Varia-ble as argument:

Listing 1: Differentiation example

```
z = CAS.vars 'z'
                                       # creates a variable
94
         f = z ** 2 + 1
                                       # define a symbolic expression
95
         f.diff(z)
                                       # derivative w.r.t. z
96
         \# \Rightarrow (((z)^{(2-1)}) * 2 * 1) + 0)
97
                                       # creates implicit expression
         g = CAS.declare :g, f
98
         g.diff(z)
                                       # derivative w.r.t. z
99
         \# \Rightarrow ((((z)^{(2-1)}) * 2 * 1) + 0) * Dg[0](((z)^{(2)} + 1)))
189
```

102

103

104

105

106

107

109

110

111

119

120

121

128

129

130

131

Automatic differentiation (AD) is included as plugin and exploits properties of dual numbers to efficiently perform differentiation, see [12] details. This differentiation strategy is useful in case of complex expressions, when explicit derivative's tree may exceed the call stack depth, that is platform dependent.

Simplifications are not executed automatically, after differentiations. Each node of the tree knows rules for simplify itself, and rules are called recursively, exactly like ASD. Simplifications that require an *heuristic expansion* of the subgraph — i.e. some trigonometric identities — are not defined for now, but can be easily achieved through **substitutions**:

Listing 2: Simplification example

The tree is numerically **evaluated** when independent variables values are provided in a feed dictionary. The graph is reduced recursively to a single numeric value:

Listing 3: Tree evaluation example

Symbolic expressions can be used to create comparative expressions, that are stored in special container classes, modeled by the ancestor CAS::Condition — e.g. $f(\cdot) \geq g(\cdot)$. This allow the definition of piecewise functions — e.g. $\max(f(\cdot),g(\cdot))$.

Listing 4: Expressions and Piecewise functions

2.2.2. Metaprogramming and Code-Generation

141

142

143

144

153

154

155

156

157

158

159

162

Mr.CAS is developed explicitly for **metaprogramming** and **code generation**. Expressions can be exported as source code or used as prototypes for callable *closures* (Proc objects):

Listing 5: Graph evaluation example

Compiling a closure of a tree is like making its snapshot, thus any further manipulation of the expression do not update the callable object. This drawback is balanced by the faster execution time of a Proc: when a graph needs *only to be evaluated* in a iterative algorithm, transforming it in a *closure* reduces the execution time per iteration.

Code generation should be flexible enough to export expressions' trees in a user's target language. Generation methods for common languages are included in specific **plugins**. Users can furthemore expand exporting capabilities by writing specific exportation rules, overriding method for existing plugin, or desining their own exporter:

Listing 6: Example of Ruby code generation plugin

```
163
         # Rules definition for Fortran Language
164
         module CAS
165
           {
166
167
             CAS::Variable => Proc.new { "#{name}" }
168
             CAS::Sin
                            => Proc.new { "sin(#{x.to_fortran})" },
169
170
           }.each do |cls, prc|
171
             cls.send(:define_method, :to_fortran, &prc)
172
           end
173
         end
174
175
         # Usage
176
              = CAS.vars 'x'
177
178
         code = (CAS.sin(x)).to_fortran
         \# => \sin(x)
188
```

3. Illustrative Examples

181

183

184

185

207

3.1. Code Generation as C Library

In this example a model is exported as C library. c-opt plugin implements advanced features such as code optimization and generation of libraries.

The library example implements the model:

$$f(x,y) = x^y + g(x) \log(\sin(x^y)) \tag{3}$$

Expression g(x) belongs to a external object, declared as g_impl, and its interface is described in g_impl.h header. The code is optimized: the intermediate operation x^y is evaluated once, even if appears twice in our model. The C function that implements our model f(x,y) is declared with the token f_impl. The exporter uses as default type double for variables and function returned values.

Listing 7: Calling optimized-C exporter for library generation

```
192
         # Model
193
         x, y = CAS.vars : x, :y
194
         g = CAS.declare :g, x
195
196
         f = x ** y + g * CAS.log(CAS.sin(x ** y))
197
198
         # Code Generation
199
         g.c_name = 'g_impl'
                                            # g token
200
201
         CAS::CLib.create "example" do
202
           include_local "g_impl"
                                            # g header
203
           implements_as "f_impl", f
                                            # token for f
204
385
```

Library created by CLib contains the following code:

209

211

212

213

214

```
// Header file for library: example.c
                                                // Source file for library: example.c
#ifndef example H
                                                #include "example.h"
#define example H
// Standard Libraries
                                                double f_impl(double x, double y) {
#include <math.h>
                                                  double _{-t_0} = pow(x, y);
                                                  double _{-}t_{1} = g_{impl(x)};
// Local Libraries
                                                  double _{-t_2} = \sin(_{-t_0});
#include "g_impl"
                                                  double _{-t_3} = log(_{-t_2});
                                                  double _{t_4} = (_{t_1} + _{t_3});
// Definitions
                                                  double _{t_5} = (_{t_0} + _{t_4});
// Functions
                                                  return __t_5;
double f_impl(double x, double y);
#endif // example_H
                                                // end of example.c
```

The function g(x) models the following operation:

$$g(x) = (\sqrt{x+a} - \sqrt{x}) + \sqrt{\pi + x} \tag{4}$$

and may suffer from catastrophic cancellation [13]. Users can specialize code generation rules for this particular expression, conditioned through rationalization and instead of modifying the model g(x), in Listing 10, the rationalization is extended to all differences of square roots ³. For more insight about __to_c and __to_c_impl please refer to the software manual.

Listing 10: Conditioning in exporting function

```
215
         # Model
216
217
         a = CAS.declare "PARAM_A"
218
         g = (CAS.sqrt(x + a) - CAS.sqrt(x)) + CAS.sqrt(CAS::Pi + x)
219
220
         # Particular Code Generation for difference between square roots.
221
         module CAS
222
           class Diff
223
             alias :__to_c_impl_old :__to_c_impl
224
225
             def __to_c_impl(v)
226
               if @x.is_a? CAS::Sqrt and @y.is_a? CAS::Sqrt
227
                  "(#{@x.x.__to_c(v)} + #{@y.x.__to_c(v)}) / " +
228
                 "( #{@x.__to_c(v)} + #{@y.__to_c(v)} )"
229
```

³i.e.:
$$\sqrt{\phi(\cdot)} - \sqrt{\psi(\cdot)} = \frac{\phi(\cdot) - \psi(\cdot)}{\sqrt{\phi(\cdot)} + \sqrt{\psi(\cdot)}}$$

```
230
                else
                  self.__to_c_impl_old(v)
231
232
                end
233
             end
           end
234
         end
235
236
237
         CAS::CLib.create "g_impl" do
           define "PARAM_A()", 1.0 # Arbitrary value for PARAM_A
238
           define "M_PI", Math::Pi
239
           implements_as "g_impl", g
240
341
```

It should be noted the **separation between the model** — that does not contain conditioning — and the code generation rule — that overloads, for this particular case and this particular language, the predefined code generation rule. Obviously, a user can decide to apply directly the conditioning on the model. The result of Listing 10 is reported:

Listing 11: g_impl Header

244

245

246

247

249

250

252

253

Listing 12: g_impl Source

```
// Header file for library: g_impl.c
                                                // Source file for library: g_impl.c
#ifndef g_impl_H
                                                #include "g_impl.h"
#define g_impl_H
                                                double g_impl(double x) {
// Standard Libraries
                                                  double __t_0 = PARAM_A();
#include <math.h>
                                                  double _{t_1} = (x + _{t_0});
                                                  double __t_2 = sqrt(__t_1);
// Local Libraries
                                                  double _{-}t_{3} = sqrt(x);
                                                  double _{-}t_{4} = (_{-}t_{1} + x) / (_{-}t_{2} +
                                                       __t_3 );
// Definitions
                                                  double _{t_5} = (M_PI + x);
#define PARAM_A() 1.0
                                                  double __t_6 = sqrt(__t_5);
#define M PI 3.141592653589793
                                                  double _{-t_7} = (_{-t_4} + _{-t_6});
// Functions
                                                  return __t_7;
double g_impl(double x);
#endif // g_impl_H
                                                // end of g_impl.c
```

3.2. Using the module as interface

As example, an implementation of an algorithm that extimates the order of convergence for trapezoidal integration scheme [14] is provided, using the symbolic differentiation as interface.

Given a function f(x), the trapezoidal rule for primitive estimation in the

interval [a, b] is:

$$I_n(a,b) = h\left(\frac{f(a) + f(b)}{2} + \sum_{k=1}^{n-1} f(a+kh)\right)$$
 (5)

with h = (b-a)/n, where n mediates the integration's step size. When exact primitive F(x) is known, approximation error is:

$$E[n] = F(b) - F(a) - I_n(a, b)$$
(6)

The error has an asymptotic expansion of the form:

$$E[n] \propto C \, n^{-p} \tag{7}$$

where p is the convergence order. Using a different value for n, for example 2n, the ratio 8 takes the approximate vale:

$$\frac{E[n]}{E[2\,n]} \approx 2^p \quad \to \quad p \approx \log_2\left(\frac{E[n]}{E[2\,n]}\right) \tag{8}$$

Following Listings contain the implementation of the described procedure using the proposed gem and the well known *Python* [15] library *SymPy* [16].

Listing 14: Python version

```
require 'Mr.CAS'
                                                   import sympy
                                                   import math
    def integrate(f, a, b, n)
                                                   def integrate(f, a, b, n):
      h = (b - a) / n
                                                       h = (b - a)/n
                                                       x = sympy.symbols('x')
      func = f.as_proc
                                                       func = sympy.lambdify((x), f)
      sum = ((func.call 'x' => a) +
                                                       sums = (func(a) +
            (func.call 'x' => b)) / 2.0
                                                               func(b)) / 2.0
      for i in (1...n)
                                                       for i in range(1, n):
        sum += (func.call 'x' => (a + i*h))
                                                           sums += func(a + i*h)
      end
                                                       return sums * h
      return sum * h
    end
    def order(f, a, b, n)
                                                   def order(f, a, b, n):
      x = CAS.vars 'x'
                                                       x = sympy.symbols('x')
      f_ab = (f.call x => b) -
                                                       f_ab = sympy.Subs(f, (x), (b)).n() - \
             (f.call x => a)
                                                              sympy.Subs(f, (x), (a)).n()
      df = f.diff(x).simplify
                                                          = f.diff(x)
      f_1n = integrate(df, a, b, n)
                                                       f_1n = integrate(df, a, b, n)
      f_2n = integrate(df, a, b, 2 * n)
                                                       f_2n = integrate(df, a, b, 2 * n)
      return Math.log(
                                                       return math.log(
        (f_ab - f_1n) /
                                                         (f_ab - f_1n) /
        (f_ab - f_2n),
                                                         (f_ab - f_2n),
      2)
    end
    x = CAS.vars 'x'
                                                   x = sympy.symbols('x')
    f = CAS.arctan x
                                                   f = sympy.atan(x)
    puts(order f, -1.0, 1.0, 100)
                                                   print(order(f, -1.0, 1.0, 100))
    # => 1.999999974244451
                                                   # => 1.999999974244451
263
```

4. Impact

264

265

266

267

268

Mr.CAS is a midpoint between a CAS and an ASD library. It allows to manipulate expressions while mantaining the complete control on how the code is exported. Each rule is overloaded and applied runtime, without the need of compilation. Each user's model may include the mathematical description, code generation rules and high level logic that should be intrisic to such a rule — e.g. exporting gradients as **patterns** instead of matrices.

Our research group is including Mr.CAS in a solver for optimal control problem with indirect methods, as interface for problems' description [17].

As a long term ambitious impact, this library will become a complete CAS for Ruby language, filling the empty space reported by SciRuby for symbolic math engines.

276 5. Conclusions

270

271

272

273

275

277

278

279

280

281

282

283

284

285

286

287

288

289

This work presents a pure Ruby library that implements a minimalistics CAS with automatic and symbolic differentiation that is aimed at code generation and metaprogramming. Although at an early developing stage, Mr.CAS has promising feature, some of them shown in Section 3. Also, this is the only gem that implements symbolic manipulation for this language.

Language features and lack of dependencies simplify the use of the module as interface, extending model definition capabilities for numerical algorithms. All core functionalities and basic mathematics are defined, with the plan to include more features in next releases. Reopening a class guarantees a *liquid* behaviour, in which users are free to modify core methods and their needs.

Library is published in *rubygems.org* repository and versioned on *github.com*, under MIT license. It can be included easily in projects and in inline interpreter, or installed as a standalone gem.

290 Acknowledgements

This research did not receive any specific grant from funding agencies in the public, commercial, or not-for-profit sectors.

- ²⁹³ [1] D. Flanagan, Y. Matsumoto, The ruby programming language, O'Reilly Media, Inc., 2008.
- [2] K. Tanaka, A. D. Nagumanthri, Y. Matsumoto, mruby-rapid software development for embedded systems, in: 15th International Conference on Computational Science and Its Applications (ICCSA), IEEE, 2015, pp. 27–32.
- [3] ISO/IEC 30170 Information technology Programming languages Ruby, Standard, International Organization for Standardization, Geneva, CH (april 2000).
- J. E. Tolsma, P. I. Barton, On computational differentiation, Computers & chemical engineering 22 (4) (1998) 475–490.

- [5] A. Wächter, C. Laird, Ipopt-an interior point optimizer, https://projects.coin-or.org/Ipopt, online; accessed: 2016-11-28 (2009).
- ³⁰⁶ [6] A. Wächter, L. T. Biegler, On the implementation of an interior-point filter line-search algorithm for large-scale nonlinear programming, Mathematical Programming 106 (1) (2006) 25–57.
- [7] J. Von Zur Gathen, J. Gerhard, Modern computer algebra, Cambridge university press, 2013.
- [8] J. Lees-Miller, Rucas, https://github.com/jdleesmiller/rucas, online; commit: 047a38b541966482d1ad0d40d2549683cf193082 (2010).
- 9] R. Bayramgalin, Symbolic, https://github. com/brainopia/symbolic, online; commit: bbd588e8676d5bed0017a3e1900ebc392cfe35c3 (2012).
- 116 [10] O. Certik, D. L. Peterson, T. B. Rathnayake, et al., Symengine, https://github.com/symengine/symengine.rb, online; commit: 8cf9e08c972085788c17da9f4e9f22898e79d93b (2016).
- ³¹⁹ [11] J. S. Cohen, Computer algebra and symbolic computation: Mathematical methods, Universities Press, 2003.
- [12] M. Bartholomew-Biggs, S. Brown, B. Christianson, L. Dixon, Automatic differentiation of algorithms, Journal of Computational and Applied Mathematics 124 (1) (2000) 171–190.
- ³²⁴ [13] N. Higham, Accuracy and Stability of Numerical Algorithms, Society for Industrial and Applied Mathematics, 2002.
- ³²⁶ [14] J. A. C. Weideman, Numerical integration of periodic functions: A few examples, The American mathematical monthly 109 (1) (2002) 21–36.
- [15] G. Van Rossum, F. L. Drake, The python language reference manual, Network Theory Ltd., 2011.
- ³³⁰ [16] C. Smith, A. Meurer, M. Paprocki, et al., Sympy 1.0, https://doi.org/10.5281/zenodo.47274, online; accessed: 2016-10-15 (2016).
- [17] F. Biral, E. Bertolazzi, P. Bosetti, Notes on numerical methods for solving optimal control problems, IEEJ Journal of Industry Applications 5 (2) (2016) 154–166.

335 Current code version

Nr.	Code metadata description	Please fill in this column
C1	Current code version	0.2.7
C2	Permanent link to code/repository	github.com/MatteoRagni/cas-rb &
	used for this code version	rubygems.org/gems/Mr.CAS
С3	Legal Code License	MIT
C4	Code versioning system used	git (GitHub)
C5	Software code languages, tools, and	Ruby language
	services used	
C6	Compilation requirements, operat-	$Ruby \ge 2.x$
	ing environments	
C7	If available Link to developer docu-	rubydoc.info/gems/Mr.CAS
	mentation/manual	
C8	Support email for questions	info@ragni.me

Table 1: Code metadata (mandatory)