

# pySecDec for phenomenological predictions



Sophia Borowka

CERN



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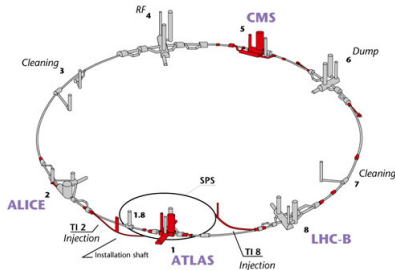
Based on:

**Comput.Phys.Commun.** **222 (2018) 313-326** **SB, G. Heinrich,**  
**S. Jahn, S.P. Jones, M. Kerner, J. Schlenk, T. Zirke**

1709.01266 **C. Bogner, SB, T. Hahn, G. Heinrich, S. Jahn, S.P. Jones,**  
**M. Kerner, A. von Manteuffel, M. Michel, E. Panzer, V. Papara**

CERN mini-workshop, CERN, Jan 11<sup>th</sup> 2018

# Higher order predictions



- ▶ we need accurate predictions at NLO and beyond
- ▶ we want differential predictions
- ▶ we want to take exact heavy quark mass dependences (and H, W, Z) into account
- ▶ phenomenological predictions involve complicated multi-loop multi-scale integrals

# Techniques for multi-loop multi-scale integrals

- ▶ Diverse approaches on the market to compute these
  - ▶ Feynman parametrization, Mellin-Barnes representation, differential equations, difference equations, dispersion integrals, integrals in coordinate space, gluing, experimental mathematics, combination of several methods

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- ▶ contribution lookup table: **loop encyclopedia** C. Bogner, SB, T. Hahn, G. Heinrich, S.P. Jones, M. Kerner, A. von Manteuffel, M. Michel, E. Panzer, V. Papara '17

Loopedia

# Loopedia start page

# Loopedia

Ex.: Edge list [(1,2),(2,3),(2,3),(3,4)] or 1 2 2 3 2 3 3 4 — Nickel index e11[e]

Enter your graph by its edge list (adjacency list) or Nickel index

or browse:

Loops   Legs   Scales

Fulltext must contain:  must not contain:

If you wish to add a new integral to the database, start by searching for its graph first.




The Loopedia Team is C. Bogner, S. Borowka, T. Hahn, G. Heinrich, S. Jones, M. Kerner, A. von Manteuffel, M. Michel, E. Panzer, V. Papara.  
Software version of 06 Nov 2017 16:01 UTC. In case of technical difficulties with this site please contact [Thomas Hahn](#) or [Viktor Papara](#).

This Web site uses the [GraphState library](#) [arXiv:1409.8227] for all graph-theoretical operations  
and the [neato](#) component of [Graphviz](#) for drawing graphs.

Loopedia is free and open to everyone. To acknowledge and support the work put into keeping Loopedia up to date, please cite [arXiv:1709.01266](#).

# Loopedia Graph Browser

Results for loops = 2, legs = 4, all scales — Row 6»

 #12 a3 34 34 a a	 000 000 00 0 0 0	 000 a00 00 0 0 0	 000 000 00 1 1 1	 000 1a0 00 0 1 1	 000 000 00 a a a	 000 a00 00 0 0 0				
 #12 a3 34 34 a a a	 000 00 00 0 0 0 0	 000 00 00 0 0 1 1	 000 10 00 0 0 0 1	 000 10 00 0 1 0 0	 110 10 00 0 1 1 1	 000 00 00 0 0 a a	 000 a0 00 0 0 0 a	 000 a0 00 0 0 a 0	 000 a0 00 0 0 a 0	 000 a0 00 0 0 a 0
 #12 a3 45 45 a a a	 000 00 00 00 0 0 0	 000 00 00 00 1 1 1	 000 10 00 00 1 0 1	 000 10 00 00 0 0 0	 000 00 00 00 a a a	 000 a0 00 00 0 0 0	 000 a0 00 00 0 0 0			
 #12 a3 a4 45 3 a	 000 00 a0 00 0 0 0	 000 00 00 00 0 0 0								

Prev Next Show 4 rows per page Home

# Loopedia Record Display

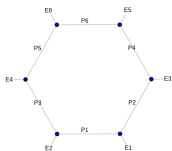
Graph **e12|e3|e4|e5|e1|e1** — Masses **000|00|00|00|00|0|0**

Edit   Edit  Browse   Home

Edge list: (e,010) (0,110) (0,210) (e,110) (1,310) (e,210) (2,410) (e,310) (3,510) (e,410) (4,510) (e,510)

Nickel index: **e12|e3|e4|e5|e5|e1|e1:000|00|00|00|00|0|0**

Database path: 1/6/6/e12|e3|e4|e5|e5|e1|e1/8/000|00|00|00|00|0|0



Propagator P1

Propagator P2

Propagator P3

Propagator P4

Propagator P5

Propagator P6

External Leg E1

External Leg E2

External Leg E3

External Leg E4

External Leg E5

External Leg E6

View public records for this configuration  or choose different configuration

Reference: [arXiv:1104.2787](#)

Authors: Lance J. Dixon, James M. Drummond, Johannes M. Henn

Description: The massless one-loop on-shell hexagon integral is computed by use of a differential equation. The integral is IR- and UV-finite. The result involves classical polylogarithms.

Submitter: [bogner@math.lmu-berlin.de](mailto:bogner@math.lmu-berlin.de)

Record 1502126180\_vmsg  
added 07 Aug 2017 17:16 UTC  
last modified 31 Aug 2017 22:39 UTC

Reference: [arXiv:1104.2787](#)

Authors: Vittorio Del Duca, Claude Duhr, Vladimir Smirnov

Description: The massless one-loop on-shell hexagon integral is computed in  $D = 6$  by use of Mellin-Barnes and direct integration techniques. The integral is IR- and UV-finite. The result involves

Record 1505802263\_T4Pa  
added 19 Sep 2017 06:04 UTC

# Analytic vs. numerical approach

## Analytical:

- + fast evaluation of result



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  - precision vs. speed
  - intuitive understanding of result harder

# PySecDec



# Numerical evaluation using sector decomposition

Public codes:

- ▶ `sector_decomposition` (uses GiNaC) Bogner & Weinzierl '07  
supplemented with `CSectors` Gluza, Kajda, Riemann, Yundin '10  
for construction of integrand in terms of Feynman parameters
- ▶ FIESTA\* (uses Mathematica, C) A.V. Smirnov, V.A. Smirnov,  
Tentyukov '08 '09, A.V. Smirnov '13, A.V. Smirnov '15
- ▶ (PY)SECDEC\* (uses Python, C++, FORM)  
Carter & Heinrich '10; SB, Carter, Heinrich '12; SB & Heinrich '13;  
SB, Heinrich, Jones, Kerner, Schlenk, Zirke '15; SB, Heinrich, Jahn, Jones,  
Kerner, Schlenk, Zirke '17

\*Multi-scale integrals not limited to the Euclidean region

SB, J. Carter & G. Heinrich '12; A.V. Smirnov '13

# The method of sector decomposition

- Idea and method of sector decomposition pioneered by Hepp '66, Denner & Roth '96, Binoth & Heinrich '00

$$\begin{aligned}
 & \int_0^1 dx_1 \int_0^1 dx_2 \frac{1}{(x_1 + x_2)^{2+\epsilon}} \\
 &= \int_0^1 dx_1 \int_0^{x_1} dx_2 \frac{1}{(x_1 + x_2)^{2+\epsilon}} + \int_0^1 dx_2 \int_0^{x_2} dx_1 \frac{1}{(x_1 + x_2)^{2+\epsilon}} \\
 &= \int_0^1 dx_1 \int_0^1 dt \frac{x_1}{(x_1 + x_1 t)^{2+\epsilon}} + \int_0^1 dx_2 \int_0^1 d\tilde{t} \frac{1}{x_2^{1+\epsilon} (\tilde{t} + 1)^{2+\epsilon}}
 \end{aligned}$$

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The diagram shows a square with side length 1 in the  $x_1$ - $x_2$  plane. This square is decomposed into two triangles: triangle (1) above the diagonal  $x_1 = x_2$  and triangle (2) below it. These two triangles are then mapped to two separate squares: one with side length  $t$  and another with side length  $y$ .

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 \end{aligned}$$

- iterative sector decomposition is highly automatable

# pySecDec use cases



*Feynman  
integral*

*parametric  
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- ▶ compute single
  - ▶ **multi-loop** multi-scale integrals
  - ▶ general **parametric** functions

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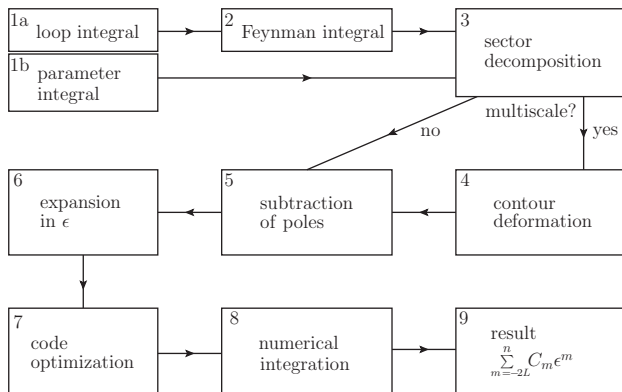


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- ▶ compute single
  - ▶ **multi-loop** multi-scale integrals
  - ▶ general **parametric** functions
- ▶ generate library of integrals
- ▶ use algebra package for symbolic manipulations on integrals

# Operational sequence of the program pySecDec



numerical integration: CUBA library Hahn '04, CQUAD GSL library

# pySecDec toolbox

## Primary objective:

- ▶ facilitate generation of integral libraries



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## Improved structure:

- ▶ dependences on open-source libraries only

NUMPY [www.numpy.org](http://www.numpy.org), SYMPY [www.sympy.org](http://www.sympy.org),

FORM [Vermaseren et al. '00 '13](#), NAUTY [McKay, Piperno '13](#)

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## More power:

- ▶ multiple regulators allowed
- ▶ iterated remapping of singularities on integration boundary
- ▶ decreased number of iterated sectors by finding graph isomorphisms
- ▶ no distinction between loop & parametric functions
- ▶ interface for evaluation of whole amplitude

# Download and Usage

# Download pySecDec: <https://github.com/mppmu/secdec>

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[mppmu / secdec](#) Watch 5 Star 2 Fork 1


[Code](#) [Issues 0](#) [Pull requests 0](#) [Projects 0](#) [Insights](#)

[Releases](#) [Tags](#)

**Latest release**




v1.2.2  
59cc62a



## pySecDec 1.2.2

 jPhy released this on Sep 24 · 30 commits to master since this release

- [loop\_integral] fix issues with sympy-1.1.1
- [symmetry\_finder] fix Pak's sorting algorithm
- [loop\_package] fix error with regulator in 'powerlist'

## Downloads

 <a href="#">pySecDec-1.2.2.tar.gz</a>	7.99 MB
 <a href="#">Source code (zip)</a>	
 <a href="#">Source code (tar.gz)</a>	

# Install pySecDec

- ▶ **Install:**

```
tar xzvf pySecDec-1.2.2.tar.gz
cd pySecDec-1.2.2
make
```

- ▶ **Prerequisites:**

- ▶ python 2.7 or 3
- ▶ python libraries numpy & sympy
- ▶ C++ compiler

- ▶ **Optional prerequisites:**

- ▶ geometric decomposition strategies:  
NORMALIZ [Bruns, Ichim, Roemer, Soeger '12](#)
- ▶ NEATO <http://www.graphviz.org>

- ▶ **All other dependences are shipped for easier installation**

# Input for pySecDec

- ▶ no input files needed, direct python interface
- ▶ many usage examples provided, e.g.

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```
#!/usr/bin/env python
from pySecDec.loop_integral import loop_package
import pySecDec as psd

li = psd.loop_integral.LoopIntegralFromGraph(
    internal_lines = [['m', [3,4]], ['m', [4,5]], ['m', [3,5]], [0, [1,2]], [0, [4,1]], [0, [2,5]]],
    external_lines = [['p1', 1], ['p2', 2], ['p3', 3]],

    replacement_rules = [
        ('p1*p1', 0),
        ('p2*p2', 0),
        ('p3*p3', 's'),
        ('p4*p4', 0),
        ('p1*p2', 's/2'),
        ('p2*p3', '-s/2'),
        ('p1*p3', '-s/2'),
        ('m**2', 'msq')
    ]
)

Mandelstam_symbols = ['s']
mass_symbols = ['msq']
```

# pySecDec as a library: example snippet

```
#include "yyyy_bubble/yyyy_bubble.hpp"
#include "yyyy_box6Dim/yyyy_box6Dim.hpp"

/*
 * pySecDec Master Integrals
 */

// one loop bubble
yyyy_bubble::nested_series_t<secdecutil::UncorrelatedDeviation<yyyy_bubble::integrand_return_t>> bubble(yyyy_bubble::real_t uOrt)
{
    using namespace yyyy_bubble;

    const std::vector<real_t> real_parameters{uOrt};
    const std::vector<complex_t> complex_parameters{};

    // optimize contour
    const std::vector<nested_series_t<yyyy_bubble::integrand_t>> integrands = yyyy_bubble::make_integrands(real_parameters, complex_parameters
        // The number of samples for the contour optimization, the minimal and maximal deformation parameters, and the decrease factor can be
        // optionally set here as additional arguments.
    );

    // add integrands of sectors (together flag)
    const yyyy_bubble::nested_series_t<yyyy_bubble::integrand_t> summed_integrands = std::accumulate(++integrands.begin(), integrands.end(), *int
    );

    // define the integrator
    auto integrator = secdecutil::cuba::Vegas<std::complex<double>>();
    integrator.flags = 2; // verbose output
    integrator.epsrel = 1e-5;
    integrator.epsabs = 1e-7;
    integrator.maxeval = 1e7;

    // integrate
    return secdecutil::deep_apply(summed_integrands, integrator.integrate) * yyyy_bubble::prefactor(real_parameters, complex_parameters);
}

...
/*
 * numerical amplitude using pySecDec Master Integrals
 */
secdecutil::Series<secdecutil::UncorrelatedDeviation<std::complex<double>>> yyyy_numerical(double s, double
{
    return -8.*( 1. + (t*t + u*u)/s * box6Dim(t,u) + (t-u)/s*( bubble(u)-bubble(t) ) );
}
```



# Timings

# Comparison of pySecDec to SecDec 3 & Fiesta

	PYSECDEC time (s) (algebraic, num.)	SECDEC 3 time (s) (algebraic, num.)	FIESTA time (s) (algeb., num.)
triangle 2L	(40.5, 9.6)	(56.9, 28.5)	(211.4, 10.8)
triangle 3L	(110.1, 0.5)	(131.6, 1.5)	(48.9, 2.5)
box2L6 (Eucl.)	(8.2, 0.2)	(4.2, 0.1)	(4.9, 0.04)
box2L6 (Phys.)	(21.5, 1.8)	(26.9, 4.5)	(115.3, 4.4)
box2L7 (invprop)	(345.7, 2.8)	(150.4, 6.3)	(21.5, 8.8)

4-core Intel(R) Core(TM) i7-4770 CPU @ 3.40GHz

- ▶ relative accuracy goal set to  $10^{-2}$
- ▶ algebraic part usually takes longer, but is only done once in (PY)SECDEC

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→ **pySecDec is ready for many more applications!** ←



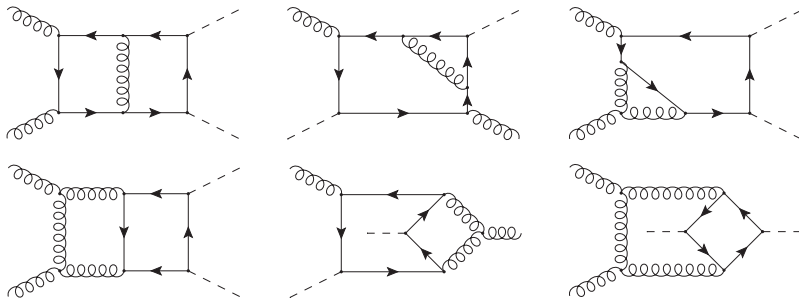
# A bit of extra motivation

# $gg \rightarrow hh$ @ NLO with full top mass dependence

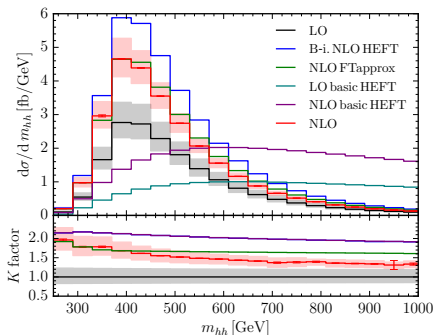
SB, N. Greiner, G. Heinrich, S.P. Jones, M. Kerner, J. Schlenk, U. Schubert, T. Zirke '16

Some of most complicated diagrams entering calculation:

- ▶ two-loop integrals, with numerators (4 independent mass scales:  $\hat{s}$ ,  $\hat{t}$ ,  $m_t^2$ ,  $m_h^2$  or 3 ratios), e.g.



# Exact result vs approximations at 100 TeV



- ▶ NLO HEFT good approximation for  $m_{hh} < 2m_t$
- ▶ scale uncertainties of HEFT and  $FT_{approx}$  do not enclose central value of full result in  $m_{hh}$  tail  $\rightarrow$  HEFT breaks down
- ▶ fast evaluation using interpolated grid [Heinrich, Jones, Kerner, Luisoni, Vryonidou '17](#); [Jones, Kuttimalai '17](#)

# Summary

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- ▶ PYSECDEC is the successor of SECDEC 3
- ▶ code is fully rewritten in python, all former Mathematica parts now work much more efficiently
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Thank you!