
pyfod
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The `pyfod` package is a Python repository for performing fractional-order derivative operations. Several different definitions of fractional derivative are available within the package:

- Riemann-Liouville
- Caputo (development)
- Grünwald-Letnikov

For now, the package is designed specifically for problems where the fractional order is between 0 and 1. Accommodating a broader range of fractional order values will be a feature added as time permits.

INSTALLATION

This code can be found on the [Github project page](#). To install the master branch directly from Github,

```
pip install git+https://github.com/prmiles/pyfod.git
```

You can also clone the repository and run `python setup.py install`.

GETTING STARTED

- [Tutorial notebooks](#)
- [Release history](#)

FEEDBACK

- Feature request
- Bug report

CONTENTS

4.1 pyfod package

4.1.1 Submodules

4.1.2 pyfod.fod module

This module provides support for three common definitions of fractional derivative in the limiting case of $\alpha \in [0, 1)$. The definitions available include:

- Riemann-Liouville - `riemannliouville()`
- Caputo - `caputo()`
- Grünwald-Letnikov - `grunwaldletnikov()`

For more details regarding this definitions of fractional derivatives please see [Pod98].

Note: In each method you are required to provide a function handle. Depending on the method being used, you may need to define your function using `sympy` to allow for extended numerical precision.

`pyfod.fod.caputo(f, lower, upper, dt=0.0001, alpha=0.0, df=None, quadrature='GLegRS', **kwargs)`
Caputo fractional derivative calculator for $\alpha \in [0, 1)$.

The general definition for Caputo fractional derivative is

$$D_C^\alpha[f(t)] = \frac{1}{\Gamma(n - \alpha)} \int_0^t \frac{f(s)^{(n)}}{(t - s)^{\alpha+1-n}} ds,$$

where $n = \lceil \alpha \rceil$. In the limiting case where $\alpha \in [0, 1)$ this further simplifies to

$$D_C^\alpha[f(t)] = \frac{1}{\Gamma(1 - \alpha)} \int_0^t \frac{f(s)^{(1)}}{(t - s)^\alpha} ds.$$

To evaluate this we simply need to define a finite-difference scheme for approximating $f(s)^{(1)}$.

Args:

- **f** (def): Function handle.
- **lower** (float): Lower limit - should be zero.
- **upper** (float): Upper limit, i.e., point at which fractional derivative is being evaluated.

Kwargs: name (type) - default

- **dt** (`float`) - *1e-4*: Time step, $t_{j+1} - t_j$.
- **alpha** (`float`) - *0*: Order of fractional derivative.
- **df** (`def`) - *None*: Finite difference function. See tutorials for examples of how to utilize this feature.
- **quadrature** (`str`) - *'glegrs'*: Quadrature method
- **kwargs**: Quadrature specific settings.

Returns: `dict`

- *fd*: Fractional derivative.
- *il*: Value of integral.
- *ql*: Quadrature object.

`pyfod.fod.grunwaldletnikov` (*f*, *lower*, *upper*, *n=100*, *dt=None*, *alpha=0.0*)
Grünwald-Letnikov fractional derivative calculator.

We have implemented the reverse Grünwald-Letnikov definition.

$$D_G^\alpha[f(t)] = \lim_{h \rightarrow 0} \frac{1}{h^\alpha} \sum_{0 \leq m < \infty} (-1)^m \binom{\alpha}{m} f(t - mh).$$

Note: The package as a whole was built for problems where $\alpha \in [0, 1)$; however, this definition for Grünwald-Letnikov does not necessarily have the same constraints. It has not been tested for values of $\alpha \geq 1$, but in principle it will work.

Args:

- **f** (`def`): Function handle.
- **lower** (`float`): Lower limit - should be zero.
- **upper** (`float`): Upper limit, i.e., point at which fractional derivative is being evaluated.

Kwargs: `name (type) - default`

- **n** (`int`) - *100*: Number of terms to be used in approximation.
- **dt** (`float`) - *1e-4*: Time step. If *dt* is *None*, then the value of *dt* will be $(upper - lower)/n$.
- **alpha** (`float`) - *0*: Order of fractional derivative.

Returns: `dict`

- *fd*: Fractional derivative.

`pyfod.fod.riemannliouville` (*f*, *lower*, *upper*, *dt=0.0001*, *alpha=0.0*, *quadrature='GLegRS'*,
***kwargs*)

Riemann-Liouville fractional derivative calculator for $\alpha \in [0, 1)$.

The general definition for Riemann-Liouville fractional derivative is

$$D_{RL}^\alpha[f(t)] = \frac{1}{\Gamma(n - \alpha)} \frac{d^n}{dt^n} \int_0^t \frac{f(s)}{(t - s)^{\alpha+1-n}} ds,$$

where $n = \lceil \alpha \rceil$. In the limiting case where $\alpha \in [0, 1)$ this further simplifies to

$$D_{RL}^\alpha[f(t)] = \frac{1}{\Gamma(1 - \alpha)} \frac{d}{dt} \int_0^t \frac{f(s)}{(t - s)^\alpha} ds.$$

By defining

$$F[t] = \int_{t_0}^t (t-s)^{-\alpha} f(s) ds,$$

we can numerically approximate this definition of fractional derivative as

$$D_{RL}^{\alpha}[f(t)] = \chi \frac{d}{dt} F[t] \approx \chi \frac{F(t_{j+1}) - F(t_j)}{t_{j+1} - t_j},$$

where $\chi = \Gamma(1 - \alpha)^{-1}$. For more details regarding this approach please see [AGomezA17] and [MPOS18].

Args:

- **f** (def): Function handle.
- **lower** (float): Lower limit - should be zero.
- **upper** (float): Upper limit, i.e., point at which fractional derivative is being evaluated.

Kwargs: name (type) - default

- **dt** (float) - *1e-4*: Time step, $t_{j+1} - t_j$.
- **alpha** (float) - *0*: Order of fractional derivative.
- **quadrature** (str) - *'glegrs'*: Quadrature method
- **kwargs**: Quadrature specific settings.

Returns: dict

- *fd*: Fractional derivative
- *i1*: Value of integral $F(t_{j+1})$.
- *i2*: Value of integral $F(t_j)$.
- *q1*: Quadrature object for $F(t_{j+1})$.
- *q2*: Quadrature object for $F(t_j)$.

4.1.3 pyfod.quadrature module

This module contains a variety of classes for performing quadrature. While this module was developed to support the fractional derivative calculators in *fod*, the quadrature methods themselves are still applicable to a wide variety of integration problems.

The quadrature methods are defined to approximate integrals of the form

$$I = \int_{t_0}^t \frac{f(t)}{(b-s)^{\alpha}} ds,$$

where b is typically equal to t . The user is only required to provide the function $f(t)$ and the limits of integration. We observe that by setting $\alpha = 0$, this integral is transformed to

$$I = \int_{t_0}^t f(t) ds,$$

which is applicable to many problems.

Classes:

- *GaussLegendre*

- *GaussLaguerre*
- *RiemannSum*
- *GaussLegendreRiemannSum*
- *GaussLegendreGaussLaguerre*

class pyfod.quadrature.**GaussLaguerre** (*deg=5, lower=0.0, upper=1.0, alpha=0.0, f=None, extend_precision=True, n_digits=30, singularity=None*)

Bases: `object`

Gauss-Laguerre quadrature.

Kwargs: name (type) - default

- **deg** (`int`) - 5: Degree of laguerre polynomials.
- **lower** (`float`) - 0.0: Lower limit of integration.
- **upper** (`float`) - 1.0: Upper limit of integration.
- **alpha** (`float`) - 0.0: Exponent of singular kernel.
- **f** (def) - *None*: Function handle.
- **extend_precision** (`bool`) - *True*: Flag to use sympy extended precision.
- **n_digits** (`int`) - 30: Number of digits in extended precision.
- **singularity** (`float`) - *None*: Location of singularity.

integrate (*f=None*)

Evaluate the integral.

The user can assign a function during initial creation of the quadrature object, or they can send it here.

Kwargs: name (type) - default

- **f** (def) - *None*: Function handle.

Note: The function, **f**, should output an array, with shape (n,) or (n, 1).

update_weights (*alpha=None*)

Update quadrature weights.

The quadrature weights are a function of α . To facilitate usage of the quadrature object, you can update the weights with a new α without creating a whole new object.

Args:

- **alpha** (`float`): Exponent of singular kernel.

class pyfod.quadrature.**GaussLegendre** (*ndom=5, deg=5, lower=0.0, upper=1.0, alpha=0.0, f=None, singularity=None*)

Bases: `object`

Gauss-Legendre quadrature.

Kwargs: name (type) - default

- **ndom** (`int`) - 5: Number of quadrature intervals.
- **deg** (`int`) - 5: Degree of legendre polynomials.
- **lower** (`float`) - 0.0: Lower limit of integration.

- **upper** (`float`) - *1.0*: Upper limit of integration.
- **alpha** (`float`) - *0.0*: Exponent of singular kernel.
- **f** (`def`) - *None*: Function handle.
- **singularity** (`float`) - *None*: Location of singularity.

integrate (*f=None*)

Evaluate the integral.

The user can assign a function during initial creation of the quadrature object, or they can send it here.

Kwargs: name (type) - default

- **f** (`def`) - *None*: Function handle.

Note: The function, **f**, should output an array, with shape (n,) or (n, 1).

update_weights (*alpha=None*)

Update quadrature weights.

The quadrature weights are a function of α . To facilitate usage of the quadrature object, you can update the weights with a new α without creating a whole new object.

Args:

- **alpha** (`float`): Exponent of singular kernel.

```
class pyfod.quadrature.GaussLegendreGaussLaguerre (ndom=5, gleg_deg=4,  
                                                glag_deg=20, percent=0.9,  
                                                ts=None, lower=0.0, up-  
                                                per=1.0, alpha=0.0, f=None, ex-  
                                                tend_precision=True, n_digits=30)
```

Bases: `object`

Gauss-Legendre, Gauss-Laguerre quadrature.

Kwargs: name (type) - default

- **ndom** (`int`) - *5*: Number of Gauss-Legendre quadrature intervals.
- **gleg_deg** (`int`) - *4*: Degree of legendre polynomials.
- **glag_deg** (`int`) - *20*: Degree of laguerre polynomials.
- **percent** (`float`) - *0.9*: Percentage of interval in which to use Gauss-Legendre method.
- **ts** (`float`) - *None*: User-defined time to switch from Gauss-Legendre to Riemann-Sum quadrature.
- **lower** (`float`) - *0.0*: Lower limit of integration.
- **upper** (`float`) - *1.0*: Upper limit of integration.
- **alpha** (`float`) - *0.0*: Exponent of singular kernel.
- **f** (`def`) - *None*: Function handle.
- **extend_precision** (`bool`) - *True*: Flag to use sympy extended precision.
- **n_digits** (`int`) - *30*: Number of digits in extended precision.

integrate (*f=None*)

Evaluate the integral.

The user can assign a function during initial creation of the quadrature object, or they can send it here.

Kwargs: name (type) - default

- **f** (def) - *None*: Function handle.

Note: The function, **f**, should output an array, with shape (n,) or (n, 1).

update_weights (*alpha=None*)

Update quadrature weights.

The quadrature weights are a function of α . To facilitate usage of the quadrature object, you can update the weights with a new α without creating a whole new object.

Args:

- **alpha** (float): Exponent of singular kernel.

```
class pyfod.quadrature.GaussLegendreRiemannSum (ndom=5, deg=4, nrs=20, percent=0.9,
                                                ts=None, lower=0.0, upper=1.0, al-
                                                pha=0.0, f=None)
```

Bases: `object`

Gauss-Legendre, Riemann-Sum quadrature.

Kwargs: name (type) - default

- **ndom** (int) - 5: Number of Gauss-Legendre quadrature intervals.
- **deg** (int) - 4: Degree of legendre polynomials.
- **nrs** (int) - 20: Number of Riemann-Sum quadrature intervals.
- **percent** (float) - 0.9: Percentage of interval in which to use Gauss-Legendre method.
- **ts** (float) - *None*: User-defined time to switch from Gauss-Legendre to Riemann-Sum quadrature.
- **lower** (float) - 0.0: Lower limit of integration.
- **upper** (float) - 1.0: Upper limit of integration.
- **alpha** (float) - 0.0: Exponent of singular kernel.
- **f** (def) - *None*: Function handle.

integrate (*f=None*)

Evaluate the integral.

The user can assign a function during initial creation of the quadrature object, or they can send it here.

Kwargs: name (type) - default

- **f** (def) - *None*: Function handle.

Note: The function, **f**, should output an array, with shape (n,) or (n, 1).

update_weights (*alpha=None*)

Update quadrature weights.

The quadrature weights are a function of α . To facilitate usage of the quadrature object, you can update the weights with a new α without creating a whole new object.

Args:

- **alpha** (float): Exponent of singular kernel.

```
class pyfod.quadrature.RiemannSum (n=5, lower=0.0, upper=1.0, alpha=0.0, f=None, singularity=None)
```

Bases: `object`

Riemann-Sum quadrature.

Kwargs: name (type) - default

- **n** (`int`) - 5: Number of quadrature intervals.
- **lower** (`float`) - 0.0: Lower limit of integration.
- **upper** (`float`) - 1.0: Upper limit of integration.
- **alpha** (`float`) - 0.0: Exponent of singular kernel.
- **f** (`def`) - *None*: Function handle.
- **singularity** (`float`) - *None*: Location of singularity.

integrate (*f=None*)

Evaluate the integral.

The user can assign a function during initial creation of the quadrature object, or they can send it here.

Kwargs: name (type) - default

- **f** (`def`) - *None*: Function handle.

Note: The function, **f**, should output an array, with shape (n,) or (n, 1).

update_weights (*alpha=None*)

Update quadrature weights.

The quadrature weights are a function of α . To facilitate usage of the quadrature object, you can update the weights with a new α without creating a whole new object.

Args:

- **alpha** (`float`): Exponent of singular kernel.

4.1.4 pyfod.utilities module

`pyfod.utilities.check_alpha` (*alpha*)

Check value of fractional order.

The package is designed to work on problems where the fractional order has a value in in the range [0, 1).

Args:

- **alpha** (`float`): Order of fractional derivative.

Raises:

- System exit for *ZeroDivisionError*.

`pyfod.utilities.check_input` (*value, varname=None*)

Check value is defined.

This routine checks that value is defined.

Args:

- **value** (user defined): Value being tested

Kwargs: name (type) - default

- **varname** (`str`) - *None*: Name of variable/value being tested. This provides a more descriptive output for debugging.

If not properly defined

Raises:

- System exist for no value defined.

`pyfod.utilities.check_node_type(n)`

Check that number of nodes is an integer.

Args:

- **n** (user defined): Number of nodes.

Returns:

- `int(n)`

`pyfod.utilities.check_range(lower, upper, value)`

Check that value falls within [lower, upper] range.

Args:

- **lower** (`float`): Lower limit
- **upper** (`float`): Upper limit
- **value** (`float`): Value to check with respect to range

If **value** in range,

Returns:

- **value** (`float`)

else

Raises:

- System exit for value out of domain.

`pyfod.utilities.check_singularity(singularity, upper)`

Check singularity was defined.

This routine checks if user provided a singularity location. Default behavior is to use the upper limit of integration as the singularity location.

Args:

- **singularity** (`float`): User defined location
- **upper** (`float`): Upper limit

Returns:

- **upper** - if *singularity* is *None*
- **singularity** - if *singularity* not *None*

`pyfod.utilities.check_value(value, default_value, varname=None)`

Check value with respect to default.

This routine checks that value is defined by either a user-defined value or default value. If still *None*, then something went wrong and this raises an error message.

Args:

- **value** (user defined): Value being tested
- **default_value** (method defined): Default value

Kwargs: name (type) - default

- **varname** (`str`) - *None*: Name of variable/value being tested. This provides a more descriptive output for debugging.

If properly defined

Returns:

- **value**

else

Raises:

- System exist for no value defined.

4.1.5 Module contents

REFERENCES

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BIBLIOGRAPHY

- [AGomezA17] Abdon Atangana and JF Gómez-Aguilar. Numerical approximation of riemann-liouville definition of fractional derivative: from riemann-liouville to atangana-baleanu. *Numerical Methods for Partial Differential Equations*, 2017.
- [MPOS18] Paul R. Miles, Graham T. Pash, William S. Oates, and Ralph C. Smith. Numerical techniques to model fractional-order nonlinear viscoelasticity in soft elastomers. In *ASME 2018 Conference on Smart Materials, Adaptive Structures and Intelligent Systems*, V001T03A021. American Society of Mechanical Engineers, 2018.
- [Pod98] Igor Podlubny. *Fractional differential equations: an introduction to fractional derivatives, fractional differential equations, to methods of their solution and some of their applications*. Volume 198. Elsevier, 1998.

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