

# A SAGE PACKAGE FOR THE SYMBOLIC-NUMERIC FACTORIZATION OF LINEAR DIFFERENTIAL OPERATORS

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## Object of interest:

(E) :  $a_n(z)f^{(n)}(z) + \cdots + a_1(z)f'(z) + a_0(z)f(z) = 0$  whose  $a_i$  are rational fractions.

**Point of view:** linear differential operator  $L = a_n\partial^n + \cdots + a_1\partial + a_0 \in \mathbb{K}(z)\langle\partial\rangle$ .

Action of  $\mathbb{K}(z)\langle\partial\rangle$  on functions in such a way that  $f$  is a solution of (E) if and only if  $L \cdot f = 0$ .

**Commutation rule:**  $\partial z = z\partial + 1$  (reflecting Leibniz's rule  $(zf)' = zf' + f$ ).

My package `diffop_factorization` mainly provides the function `Dfactor`.

**input:** a linear differential operator  $L$

**output:** a list of irreducible operators  $L_1, \dots, L_k$  such that  $L$  is equal to the composition  $L_1 \cdots L_k$

▷ available at [https://github.com/a-goyer/diffop\\_factorization](https://github.com/a-goyer/diffop_factorization)



**Example:** (the package `ore_algebra` is available at [https://github.com/mkauers/ore\\_algebra](https://github.com/mkauers/ore_algebra))

```
from ore_algebra import DifferentialOperators
Diffops, z, Dz = DifferentialOperators(QQ, 'z')

L = (4*z^3 + 2*z^2 - 4*z - 2)*Dz^3 + (16*z^2 + 2*z - 6)*Dz^2 + (7*z - 1)*Dz - 1
```

```
from diffop_factorization import Dfactor
Dfactor(L)
```

```
[(4*z - 4)*Dz + 4, (z^2 + 3/2*z + 1/2)*Dz^2 + (z + 1/2)*Dz - 1/4]
```

```
L1, L2 =
L1 * L2 == L
```

```
True
```

**Note:** Here, the output ensures that  $(z^2 + \frac{3}{2}z + \frac{1}{2})\partial^2 + (z + \frac{1}{2})\partial - \frac{1}{4}$  is irreducible.

## HISTORY: ALGORITHMS OF FACTORIZATION

- 1894: Beke
  - “second exterior power method”
  - first order right factor computation
- 1996: Singer
  - reducibility test (“eigenring” method)
- 1997: van Hoeij
  - “local to global” algorithm
- 2004: Cluzeau, van Hoeij
  - modular tricks



Improvements of  
Beke's algorithm

- 1989: Schwarz
- 1990: Grigor'ev
- 1994: Bronstein
- 1996: Tsarev

Symbolic-numeric  
approaches

### Complexity analysis:

- 1990: Grigor'ev
- 2020: Bostan, Rivoal, Salvy
- 2007: van der Hoeven
- 2013: Johansson, Kauers, Mezzarobba
  - first order right factor computation

# van der Hoeven's algorithm

**Key idea:**  $L_2 \mapsto \text{Solutions}(L_2)$  is a bijection between the right factors of  $L$  and the subspaces of  $\text{Solutions}(L)$  invariant under the "monodromy" action (under a regularity assumption).

**Function** `right_Dfactor`

**input:** a linear differential operator  $L$

**output:** a nontrivial right factor  $L_2$  of  $L$  or `Irreducible`

1. compute a basis of  $V := \text{Solutions}(L)$
2. compute a generating set  $\mathcal{M}$  of the monodromy group *by approximation*
3. search for a nontrivial  $\mathcal{M}$ -invariant subspace  $U$  of  $V$ :
  4. if any:
    5. guess a candidate  $L_2$  from  $U$
    6. if  $L_2$  does not divide exactly  $L$ : restart with higher precision
    7. else: return  $L_2$
  8. else: return `Irreducible`

# Step-by-step presentation of my package with the previous example:

```
from diffop_factorization import right_Dfactor  
  
L = (4*z^3 + 2*z^2 - 4*z - 2)*Dz^3 + (16*z^2 + 2*z - 6)*Dz^2 + (7*z - 1)*Dz - 1  
  
L2 = right_Dfactor(L); L2  
  
(z^2 + 3/2*z + 1/2)*Dz^2 + (z + 1/2)*Dz - 1/4
```

# Computing a basis of solutions

Write  $L = q(p_n \partial^n + \cdots + p_1 \partial + p_0)$  with  $q \in \mathbb{K}(z)$  and  $p_i \in \mathbb{K}[z]$  coprime.

**Definition:**  $z_0$  is a singular point of  $L$  if a  $z_0$  is a root of  $p_n$ .

**Proposition:**  $z_0$  is not singular  $\Rightarrow$  there is a full set of power series solutions at  $z_0$ .

**Cauchy-type theorem:**  $f \in \text{Solutions}(L, z_0) \longmapsto (f(z_0), f'(z_0), \dots, f^{(n-1)}(z_0)) \in \mathbb{C}^n$  is bijective.

$L \# z0 = 0$  is not a singular point

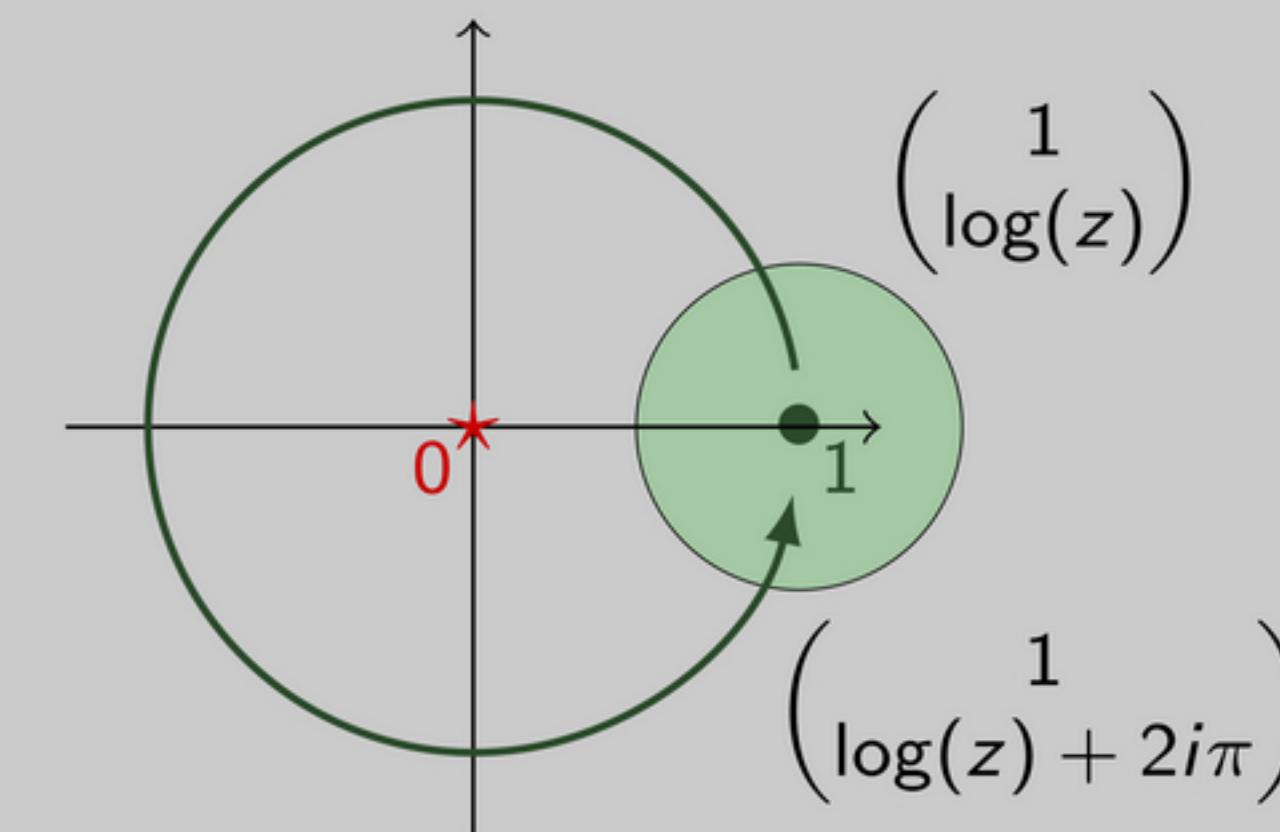
$$(4*z^3 + 2*z^2 - 4*z - 2)*Dz^3 + (16*z^2 + 2*z - 6)*Dz^2 + (7*z - 1)*Dz - 1$$

`L.power_series_solutions(n=8) # differential equation <-> polynomial recurrence on coefficients`

$$\begin{aligned} & [z^2 - z^3 + 31/24*z^4 - 193/120*z^5 + 3161/1440*z^6 - 4427/1440*z^7 + 243773/53760*z^8 + 0(z^9), \\ & z - 1/12*z^3 + 11/48*z^4 - 161/480*z^5 + 187/360*z^6 - 30973/40320*z^7 + 126773/107520*z^8 + 0(z^9), \\ & 1 - 1/12*z^3 + 5/48*z^4 - 77/480*z^5 + 319/1440*z^6 - 13273/40320*z^7 + 52691/107520*z^8 + 0(z^9)] \end{aligned}$$

## MONODROMY AND FACTORIZATION

Example:  $L = z\partial^2 + \partial$



$$\underbrace{\begin{pmatrix} 1 & 0 \\ 2i\pi & 1 \end{pmatrix}}_{\text{monodromy of } L \text{ around the singularity 0}} \begin{pmatrix} 1 \\ \log(z) \end{pmatrix} = \begin{pmatrix} 1 \\ \log(z) + 2i\pi \end{pmatrix}$$

monodromy of  $L$  around the singularity 0

**Proposition.** Let  $L \in \mathcal{F}\langle\partial\rangle$  be a Fuchsian operator. There is an one-to-one correspondance:

$$\begin{array}{c} L = L_1 L_2 \\ \Updownarrow \\ U = \text{Solutions}(L_2) \end{array}$$

subspace  $U$  invariant under the action of the monodromy matrices

*Ingredients:* differential Galois theory + density theorem of Schlesinger

- rigorous arbitrary-precision computation of monodromy matrices is now available in SageMath [Mezzarobba, 2016]

# Computing a generating set of the monodromy group

Note: Interval arithmetic is used for tracking error bounds (C library `Arb`, see <https://arblib.org/>)

```
from ore_algebra.analytic import monodromy_matrices  
  
prec = 200 # number of bits of precision  
mono = monodromy_matrices(L, 0, eps=RR.one()>>prec)  
len(mono), mono[0].parent()
```

```
(3,  
 Full MatrixSpace of 3 by 3 dense matrices over Complex ball field with 204 bits of precision)
```

mono[1]

```
[ [0.9023752279903480744087375221937813832946680049763035596478 +/- 2.70e-59] + [0.802753157000938896925  
1856842904631105096949991669769234085 +/- 6.92e-59]*I [0.1952495440193038511825249556124372334106639900  
473928807044 +/- 5.86e-59] + [2.3944936859981222061496286314190737789806100016660461531831 +/- 5.99e-59]*  
I [-3.265073560317101300634683069156592226072813860023866305746 +/- 2.16e-58] + [4.7889873719962444122  
99257262838147557961220003332092306366 +/- 3.11e-58]*I]  
[ [0.8295760190096610927236970403644779845772403178330170085085 +/- 3.21e-59] + [0.508199537747157031741  
0443674642944122148556664842497535518 +/- 7.80e-59]*I [3.717727192433631092226145800679973117364264809  
985099427222 +/- 4.98e-58] + [0.9836009245056859365179112650714111755702886670315004928965 +/- 7.81e-59]*  
I [3.607668060689407682952425111169212888281458699910872820866 +/- 4.76e-58] + [5.9672018490113718730  
35822530142822351140577334063000985793 +/- 1.91e-58]*I]  
[ [-0.4391942025072435277596641396337936464649531576724326143423 +/- 9.66e-60] + [-0.053411479623343791639  
2257626595314284800040834503806459238 +/- 4.61e-59]*I [-1.3100512102119895833174416614368772503294664074  
807014934347 +/- 3.60e-59] + [0.1068229592466875832784515253190628569600081669007612918475 +/- 4.80e-59]*  
I [-1.6201024204239791666348833228737545006589328149614029868694 +/- 8.15e-59] + [-1.7863540815066248334  
43096949361874286079983666198477416305 +/- 1.06e-58]*I]
```

# Computing an invariant subspace

## Function invariant subspace

**input:** a list  $[M_1, \dots, M_r]$  of matrices with interval coefficients

**output:** a nontrivial subspace invariant under the action of  $M_1, \dots, M_r$  or **none**

**Note:** 1) Some computation can fail if the precision is insufficient.

2) The output `none` is rigorous (whatever the exact matrices represented by  $M_1, \dots, M_r$ , there is no nontrivial invariant subspace).

```
from diffop factorization import invariant subspace
```

```
U = invariant subspace(mono); U
```

# Guessing a candidate right factor

Hermite–Padé approximants:  $\mathbb{C}^\simeq[[z]]_{\leq T} \rightarrow \mathbb{C}^\simeq(z)$

LLL algorithm:  $\mathbb{C}^{\sim} \rightarrow \overline{\mathbb{Q}}$

```
from diffop_factorization.complex_optimistic_field import ComplexOptimisticField
C = ComplexOptimisticField(prec, eps=RR.one()>>(prec//4))

basis = L.power_series_solutions(20); basis.reverse()
f = (vector(basis)*U[0].change_ring(C)).truncate() # candidate solution of a right factor of L

from diffop_factorization.guessing import hp_approximants, guess_exact_numbers
p, q, r = hp_approximants([f, f.derivative(), f.derivative().derivative()], 15); p, q, r
```

---

```
([-0.25000000000000000000000000000000 +/- 1.32e-37] + [+/- 1.32e-37]*I,
 ([1.00000000000000000000000000000000 +/- 2.82e-37] + [+/- 2.82e-37]*I)*z + [0.50000000000000000000000000000000
 000000000000 +/- 1.34e-37] + [+/- 1.34e-37]*I,
 z^2 + ([1.50000000000000000000000000000000 +/- 1.75e-38] + [+/- 1.75e-38]*I)*z + [0.50000000000000000000000000000000
 0000000000000000 +/- 1.02e-38] + [+/- 1.02e-38]*I)
```

p, q, r

```
[p, q, r] = guess_exact_numbers([p, q, r])  
p, q, r
```

$$(-1/4, z + 1/2, z^2 + 3/2*z + 1/2)$$

```
L2 = Diffops([p, q, r])  
L2
```

$$(z^2 + 3/2*z + 1/2)*Dz^2 + (z + 1/2)*Dz - 1/4$$

## Validating the result by Euclidean division

```
L % L2 # remainder of the right Euclidean division
```

```
0
```

```
L1 = L // L2 # quotient of the right Euclidean division
L1, L2, L1 * L2 == L
```

```
((4*z - 4)*Dz + 4, (z^2 + 3/2*z + 1/2)*Dz^2 + (z + 1/2)*Dz - 1/4, True)
```

Is  $L_2$  irreducible?

```
invariant_subspace(monodromy_matrices(L2, 0)) is None
```

```
True
```

## COMPARISON OF RUNNING TIMES

operator	order, deg. in $z$	DEtools (  )	new package	
fcc3 (  )	3, 5	.182s	.148s (150*)	the time of monodromy computation > 95% of the total time
fcc4 (  )	4, 10	.630s	1.29s (306*)	
fcc5 (  )	6, 17	61.9s	<b>7.98s</b> (475*)	
fcc6 (  )	8, 43	>10h	<b>159s</b> (1125*)	
fcc4 $\times$ fcc3	7, 15	<b>1.88s</b>	27.6s (1659*)	
fcc3 $\times$ fcc4	7, 15	<b>4.59s</b>	66.2s (3415*)	
lclm(fcc3, fcc4)	7, 28	66.6s	85.0s (1636*)	
fcc4 <sup>2</sup>	8, 20	122.s	108s (3387*)	
random4 $\times$ fcc3	7, 15	<b>2.04s</b>	144s (958*)	
random4 $\times$ random3	7, 15	<b>2.40s</b>	205s (1095*)	
( $z^2\partial + 3)((z - 3)\partial + 4z^5)$	2, 5	>10h	<b>1.74s</b> (150*)	

() command DFactor of the Maple package DEtools (author: van Hoeij)

() irreducible operators at <http://koutschan.de/data/fcc1/> (probabilistic walks)

\* = number of bits of precision needed

the time of monodromy computation  
> 95% of the total time

## **Future work:**

- *implementing some tricks for simplest cases*
- *trying to adapt van der Hoeven's approach for the computation of an LCLM-decomposition*
- *clarifying the theoretical complexity (at least in function of the sufficient precision)*
- *experimenting symbolic-numeric approach on linked questions (e.g. algebraicity of solutions)*
- *extending our code to the non-Fuchsian case*

**Thank you for listening!**