

Numerical Evaluation of D-Finite Functions

NumGfun and Beyond

Marc MEZZAROBBA

RISC, JKU Linz

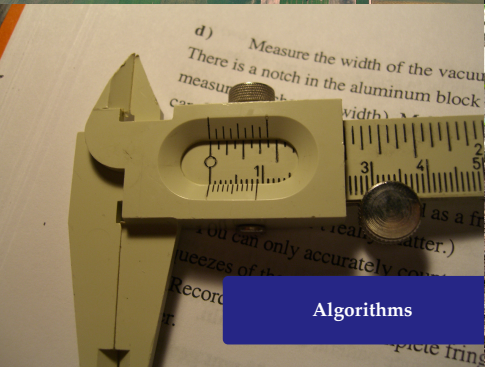
Sage Days 49, Orsay
2013-06-20



D-Finite Functions

0.9900	0.42345	08779	18527	0.83850	80695	55370
01	.42336	70387	10965	.83855	04104	51134
02	.42328	32076	37097	.83859	27429	63383
03	.42319	93846	98665	.83863	50670	92932
04	.42311	55698	97410	.83867	73828	40594
0.9905	0.42303	17632	35074	0.83871	96902	07183
06	.42294	79647	13396	.83876	19891	93512
07	.42286	41743	34116	.83880	42798	00397
08	.42278	03920	98971	.83884	65620	28651
09	.42269	66180	09698	.83888	88358	79088
0.9910	0.42261	28520	68035	0.83893	11013	52524
11	.42252	90942	75717	.83897	33584	49774
12	.42244	53446	54478	.83901	56071	71651
13	.42236	16031	46054	.83905	78475	18972
14	.42227	78698	12177	.83910	00794	92552
0.9915	0.42219	41446	34579	0.83914	23030	93207
16	.42211	04276	1			
17	.42202	67187	5			
18	.42194	30180	5			
19	.42185	93255	2			
0.9920	0.42177	56411	51354	0.83935	32955	31151

NumGfun



Algorithms

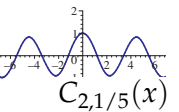
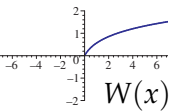
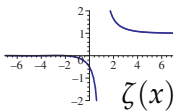
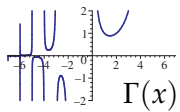
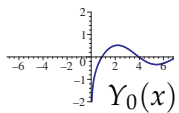
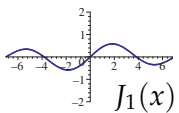
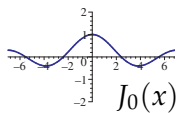
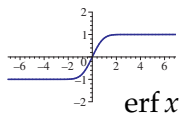
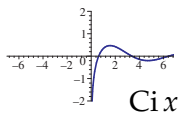
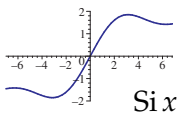
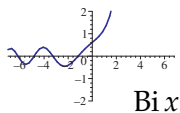
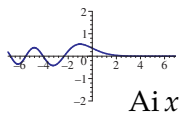
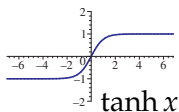
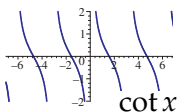
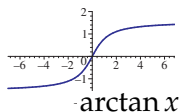
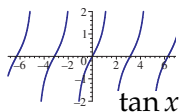
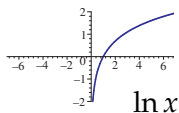
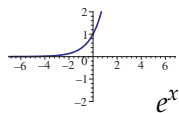
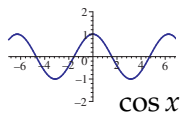
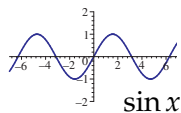


Outlook



D-Finite Functions

Elementary and Special Functions



D-Finite Functions

An analytic function $y(z) : \mathbb{C} \rightarrow \mathbb{C}$ is said to be **D-finite** (holonomic) iff it satisfies a linear (homogeneous) ODE with polynomial coefficients:

$$a_r(z) y^{(r)}(z) + \cdots + a_1(z) y'(z) + a_0(z) y(z) = 0, \quad a_j \in \mathbb{K}[z].$$

- ▶ The sequence of Taylor coefficients of a D-finite function obeys a linear *recurrence relation* with polynomial coefficients.

Example: $y(z) = \sin z$

$$y''(z) + y(z) = 0 \quad y(0) = 0, \quad y'(0) = 1$$

D-Finite Functions

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- ▶ The sequence of Taylor coefficients of a D-finite function obeys a linear *recurrence relation* with polynomial coefficients.

Example: $y(z) = K_0(z)$ (modified Bessel function)

$$z y''(z) + y'(z) - z y(z) = 0$$

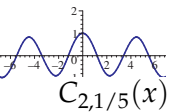
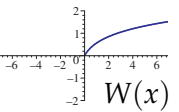
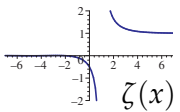
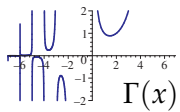
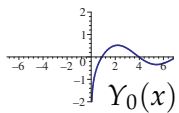
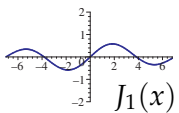
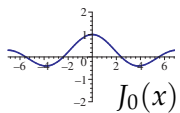
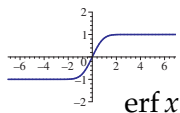
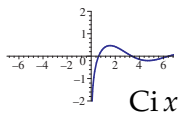
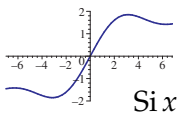
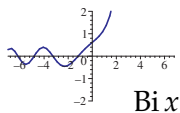
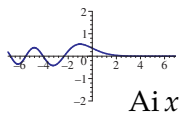
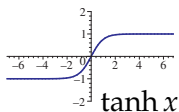
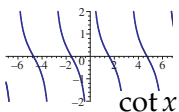
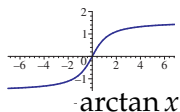
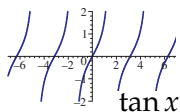
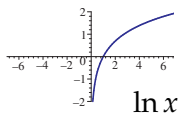
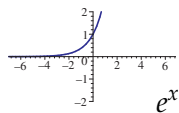
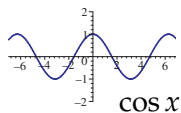
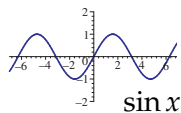
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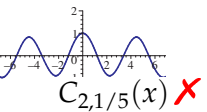
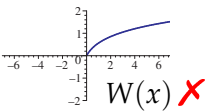
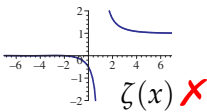
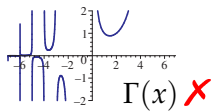
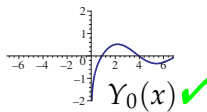
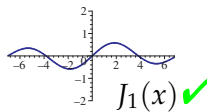
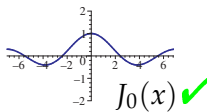
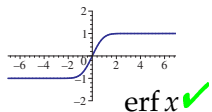
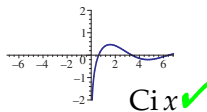
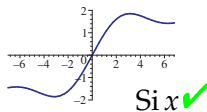
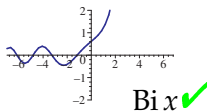
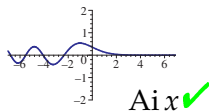
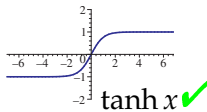
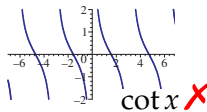
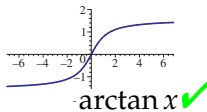
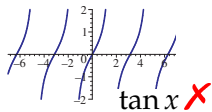
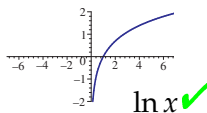
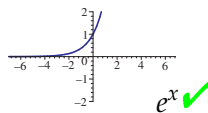
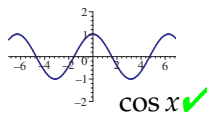
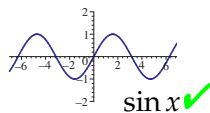
- ▶ A formal power series is D-finite iff its coefficients obey a linear recurrence relation with polynomial coefficients.
- ▶ Symbolic specifications [Joyal, Flajolet...] translate into algebraic / differential equations

Example:
$$y(z) = \sum_{n=0}^{\infty} n! z^n$$
$$z^2 y''(z) + (3z - 1) y'(z) + y(z) = 0$$

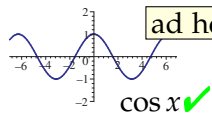
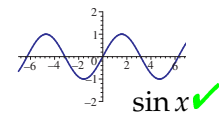
Elementary and Special Functions



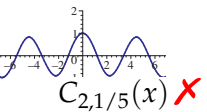
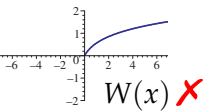
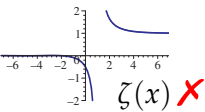
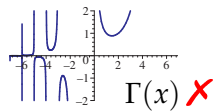
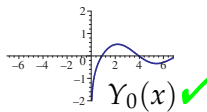
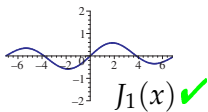
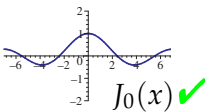
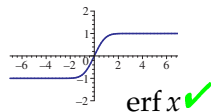
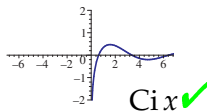
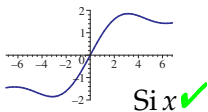
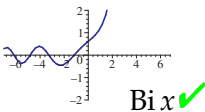
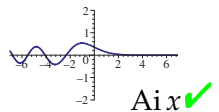
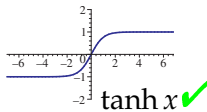
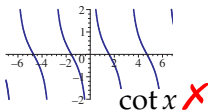
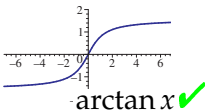
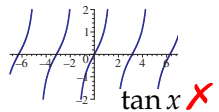
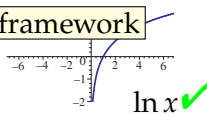
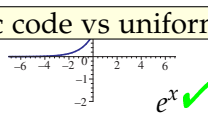
Elementary and Special Functions



Elementary and Special Functions



ad hoc code vs uniform framework



A Dictionary of D-Finite Functions

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Dynamic Dictionary of Mathematical Functions

Home Glossary

Dynamic Dictionary of Mathematical Functions

Welcome to this interactive site on [Mathematical Functions](#), with properties, truncated expansions, numerical evaluations, plots, and more. The functions currently presented are elementary functions and special functions of a single variable. More functions — special functions with parameters, orthogonal polynomials, sequences — will be added with the project advances.

Contents [rendering](#) [link](#)

Select a special function from the list

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A Dictionary of D-Finite Functions

<http://ddmf.msr-inria.inria.fr>

Dynamic Dictionary of Mathematical Functions

Home Glossary

Dynamic Dictionary of Mathematical Functions

Welcome to this interactive site on [Mathematical Functions](#), with properties, truncated expansions, numerical evaluations, plots, and more. The functions currently presented are elementary functions and special functions of a single variable. More functions — special functions with parameters, orthogonal polynomials, sequences — will be added with the project advances.

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- The [inverse cosecant](#) $\operatorname{arccsc}(x)$
- The [inverse cosine](#) $\operatorname{arccos}(x)$
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- The [inverse hyperbolic cosecant](#) $\operatorname{arcsch}(x)$
- The [Airy function of the first kind](#) $\operatorname{Ai}(x)$
- The [inverse secant](#) $\operatorname{arcsec}(x)$
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- The [Airy function \(of the second kind\)](#) $\operatorname{Bi}(x)$
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- The [cosine integral](#) $\operatorname{Ci}(x)$
- The [cosine](#) $\cos(x)$
- The [exponential integral](#) $\operatorname{Ei}(x)$
- The [error function](#) $\operatorname{erf}(x)$
- The [complementary error function](#) $\operatorname{erfc}(x)$
- The [imaginary error function](#) $\operatorname{erfi}(x)$

Benoit, Chyzak, Darrasse, Gerhold, M. & Salvy (2010) + Grégoire, Henriot, Koutschan

• [DDMF developers list](#)

• [Motivation of the project](#)

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A Dictionary of D-Finite Functions

The Special Function Ai(x) - Iceweasel

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wikipedia.org

[01] Loading...

Home Glossary

The Special Function $Ai(x)$

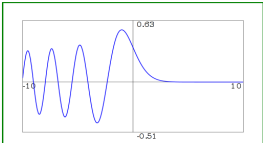
1. Differential equation rendering [link](#)

The function $Ai(x)$ satisfies

$$\frac{d^2}{dx^2}y(x) - xy(x) = 0$$

with initial values $y(0) = 1/3 \frac{\sqrt[3]{3}}{\Gamma(2/3)}$, $(y')(0) = -1/2 \frac{\sqrt[6]{3}\Gamma(2/3)}{\pi}$. [metadata](#)

2. Plot of $Ai(x)$



Done Proxy: None | zotero

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A Dictionary of D-Finite Functions

The Special Function Ai(x) - Iceweasel

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Home

The Special

Our data structure:
LODE with polynomial coefficients
+ initial values
(D-finite function)

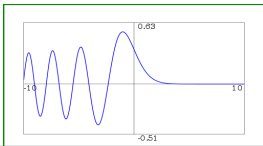
1. Differential equation

The function $Ai(x)$ satisfies

$$\frac{d^2}{dx^2}y(x) - xy(x) = 0$$

with initial values $y(0) = 1/3 \frac{\sqrt[3]{3}}{\Gamma(2/3)}$, $(y')(0) = -1/2 \frac{\sqrt[6]{3}\Gamma(2/3)}{\pi}$.

2. Plot of $Ai(x)$



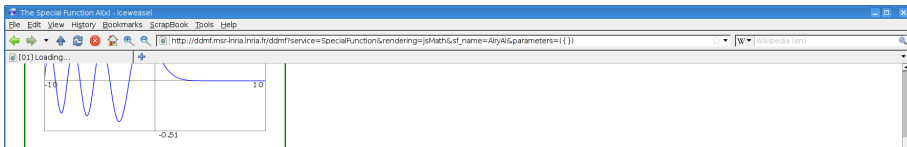
metadata

jsMath

Done

Proxy: None | zotero

A Dictionary of D-Finite Functions



min =

max =

3. Numerical Evaluation

$$\text{Ai}(1/4 + 1/4i) \approx 0.28881085 - 0.06285935i.$$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.) [metadata](#)

path =

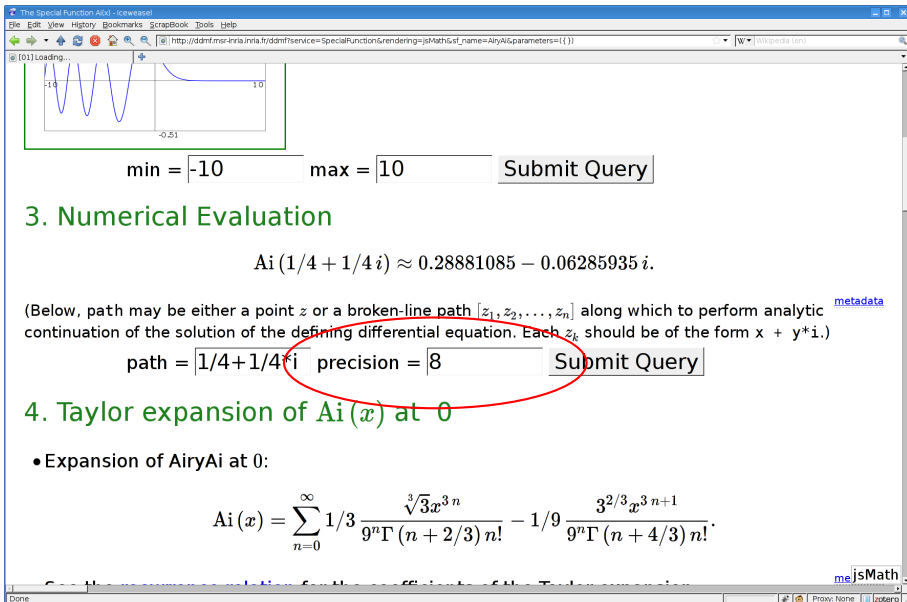
precision =

4. Taylor expansion of $\text{Ai}(x)$ at 0

- Expansion of AiryAi at 0:

$$\text{Ai}(x) = \sum_{n=0}^{\infty} \frac{1}{3} \frac{\sqrt[3]{3} x^{3n}}{9^n \Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{9^n \Gamma(n + 4/3) n!}.$$

A Dictionary of D-Finite Functions

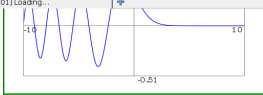


The Special Function Ai(x) - Iceweasel

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http://ddmf.msr-inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&sf_name=AiryAi¶meters={}

[01] Loading...



min = max =

3. Numerical Evaluation

$Ai(1/4 + 1/4i) \approx 0.28881085 - 0.06285935i.$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.) [metadata](#)

path = precision =

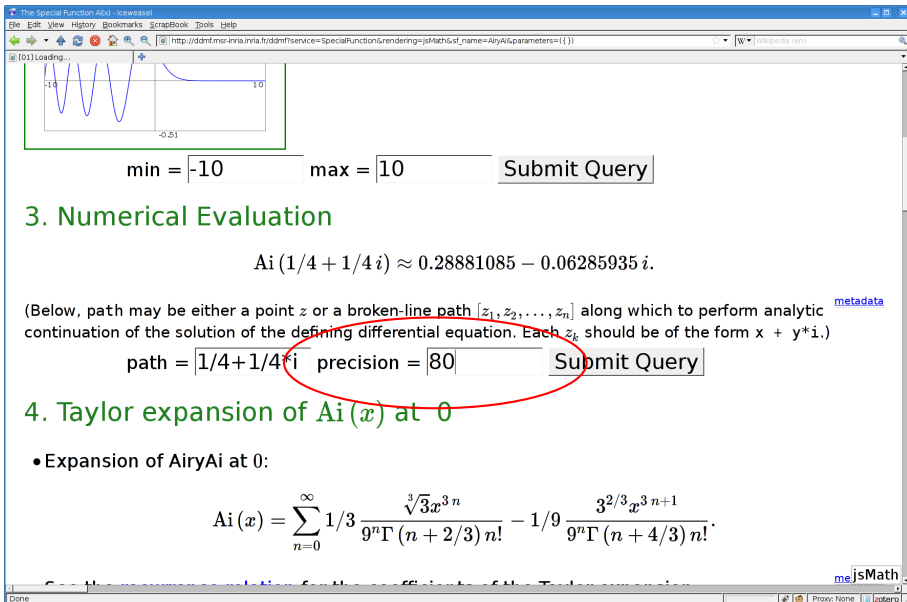
4. Taylor expansion of $Ai(x)$ at 0

- Expansion of AiryAi at 0:

$$Ai(x) = \sum_{n=0}^{\infty} \frac{1}{9} \frac{\sqrt[3]{3} x^{3n}}{9^n \Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{9^n \Gamma(n + 4/3) n!}.$$

Done Proxy: None | zotero

A Dictionary of D-Finite Functions



The Special Function Ai(x) - Iceweasel
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http://ddmf.mzi.irnia.inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&st_name=AiryAi¶meters={ }
[01] Loading...
min = max =
3. Numerical Evaluation
$$\text{Ai}(1/4 + 1/4i) \approx 0.28881085 - 0.06285935i.$$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.) [metadata](#)

path = precision =

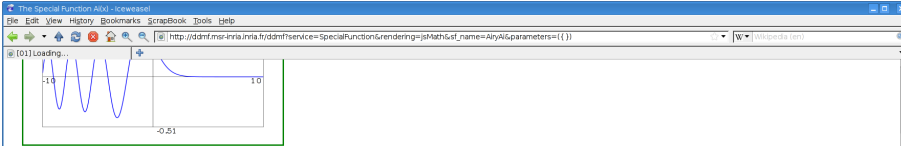
4. Taylor expansion of $\text{Ai}(x)$ at 0

- Expansion of AiryAi at 0:

$$\text{Ai}(x) = \sum_{n=0}^{\infty} \frac{1}{9} \frac{\sqrt[3]{3} x^{3n}}{9^n \Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{9^n \Gamma(n + 4/3) n!}.$$

Done Proxy: None

A Dictionary of D-Finite Functions



The screenshot shows a web browser window with the URL `http://ddmf.mzi-inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&st_name=AiryAi¶meters={}`. The main content area displays a plot of the Airy function $Ai(x)$ with a green bounding box around it. The x-axis ranges from -10 to 10, and the y-axis ranges from -0.51 to 1.0. Below the plot, there are input fields for `min = -10` and `max = 10`, followed by a `Submit Query` button.

`min = -10` `max = 10` `Submit Query`

3. Numerical Evaluation

$Ai(1/4 + 1/4i) \approx 0.28881085384820872173256483671407046811262524805800436861749378392647$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic [metadata](#) continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.)

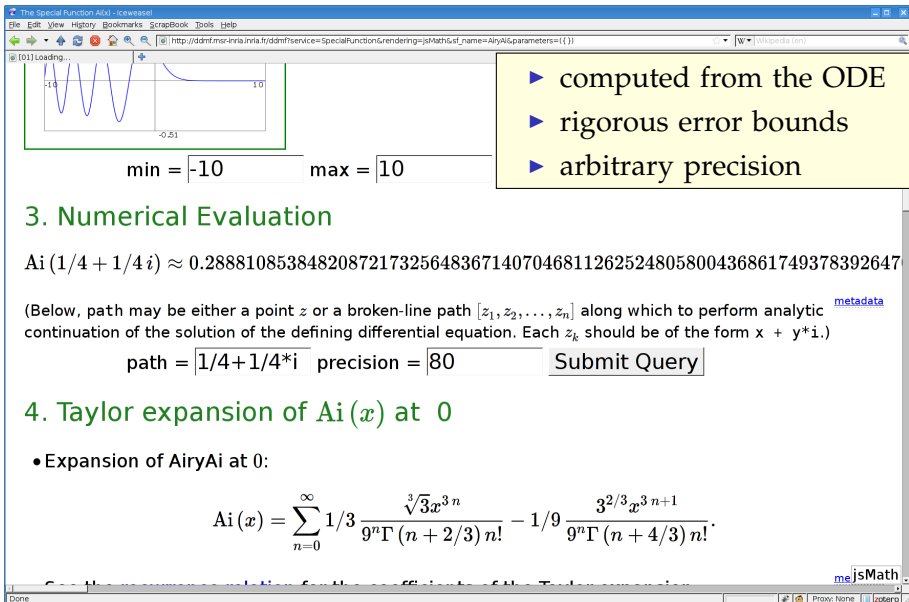
`path = 1/4+1/4*i` `precision = 80` `Submit Query`

4. Taylor expansion of $Ai(x)$ at 0

- Expansion of $AiryAi$ at 0:

$$Ai(x) = \sum_{n=0}^{\infty} \frac{1}{3} \frac{\sqrt[3]{3} x^{3n}}{9^n \Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{9^n \Gamma(n + 4/3) n!}.$$

A Dictionary of D-Finite Functions



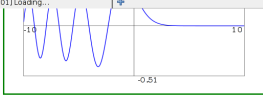
The Special Function Ai(x) - Iceweasel

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http://ddmf.mzi-iriia.inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&st_name=AiryAi¶meters={}

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[01] Loading...



min = max =

- ▶ computed from the ODE
- ▶ rigorous error bounds
- ▶ arbitrary precision

3. Numerical Evaluation

$Ai(1/4 + 1/4i) \approx 0.28881085384820872173256483671407046811262524805800436861749378392647$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.)

path = precision =

4. Taylor expansion of $Ai(x)$ at 0

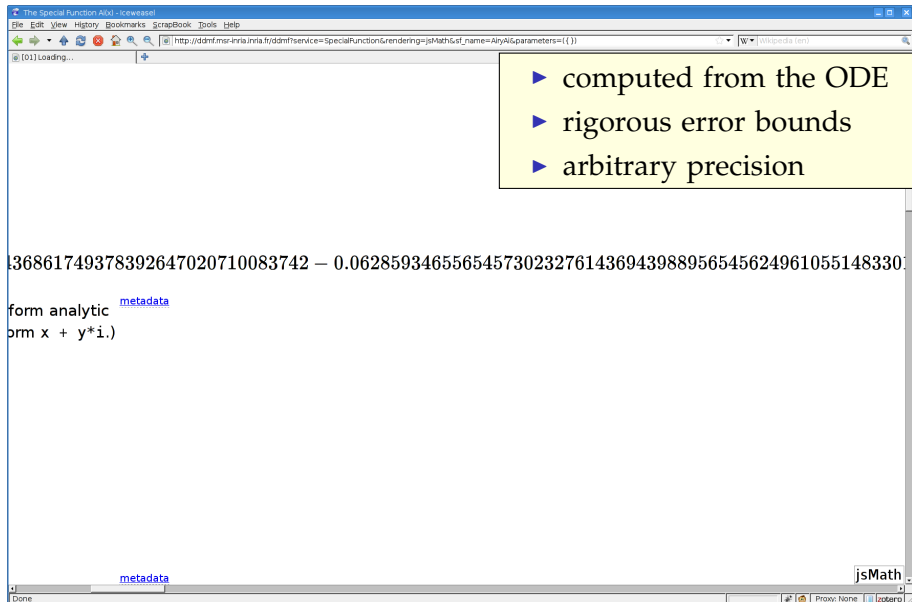
- Expansion of AiryAi at 0:

$$Ai(x) = \sum_{n=0}^{\infty} \frac{1}{9} \frac{\sqrt[3]{3} x^{3n}}{9^n \Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{9^n \Gamma(n + 4/3) n!}.$$

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Done

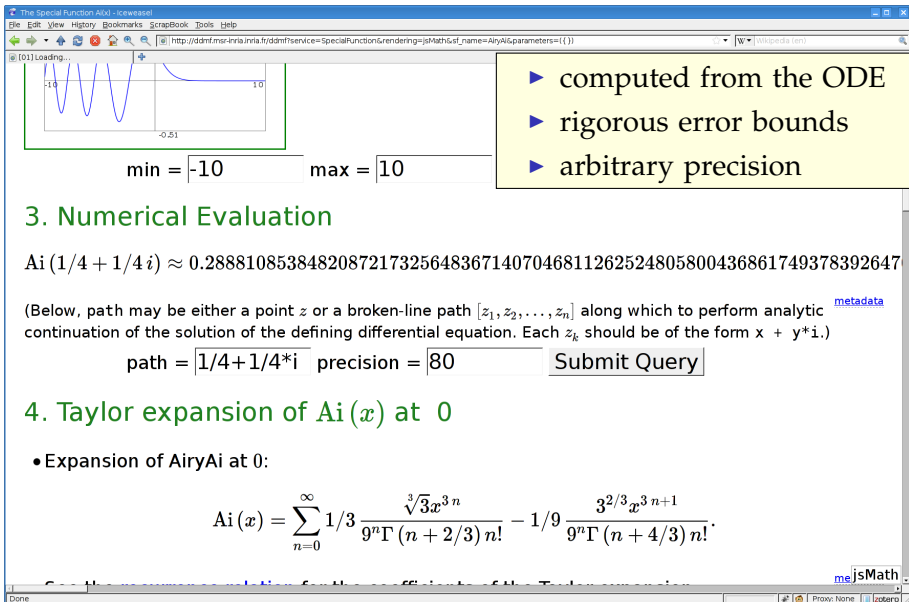
A Dictionary of D-Finite Functions



The screenshot shows a web browser window with the URL `http://ddmf.msr-inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&st_name=AlyA¶meters={}`. The main content area displays a long numerical value: `136861749378392647020710083742 - 0.062859346556545730232761436943988956545624961055148330`. Below this, there is a link to `form analytic metadata` and a partially visible line `orm x + y*i.)`. A yellow callout box on the right contains three bullet points:

- ▶ computed from the ODE
- ▶ rigorous error bounds
- ▶ arbitrary precision

A Dictionary of D-Finite Functions



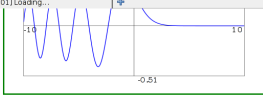
The Special Function Ai(x) - Iceweasel

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http://ddmf.mzi-iriia.jku.at/ddmf/service=SpecialFunction&rendering=jsMath&st_name=AiryAi¶meters={}

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[01] Loading...



min = max =

- ▶ computed from the ODE
- ▶ rigorous error bounds
- ▶ arbitrary precision

3. Numerical Evaluation

$Ai(1/4 + 1/4i) \approx 0.28881085384820872173256483671407046811262524805800436861749378392647$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.)

path = precision =

4. Taylor expansion of $Ai(x)$ at 0

- Expansion of AiryAi at 0:

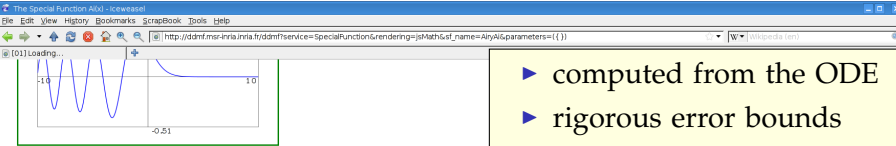
$$Ai(x) = \sum_{n=0}^{\infty} \frac{1}{9} \frac{\sqrt[3]{3} x^{3n}}{9^n \Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{9^n \Gamma(n + 4/3) n!}.$$

Done

jsMath

Proxy: None | zotero

A Dictionary of D-Finite Functions



The screenshot shows a web browser window with the URL `http://ddmf.mzr-inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&st_name=AiyAi¶meters={}`. The main content area displays a plot of the Airy function $\text{Ai}(x)$ with a green box around it. Below the plot are input fields for `min = -10` and `max = 10`. To the right, a yellow box contains three bullet points:

- ▶ computed from the ODE
- ▶ rigorous error bounds
- ▶ arbitrary precision

3. Numerical Evaluation

$\text{Ai}(1/4 + 1/4i) \approx 0.28881085384820872173256483671407046811262524805800436861749378392647$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.)

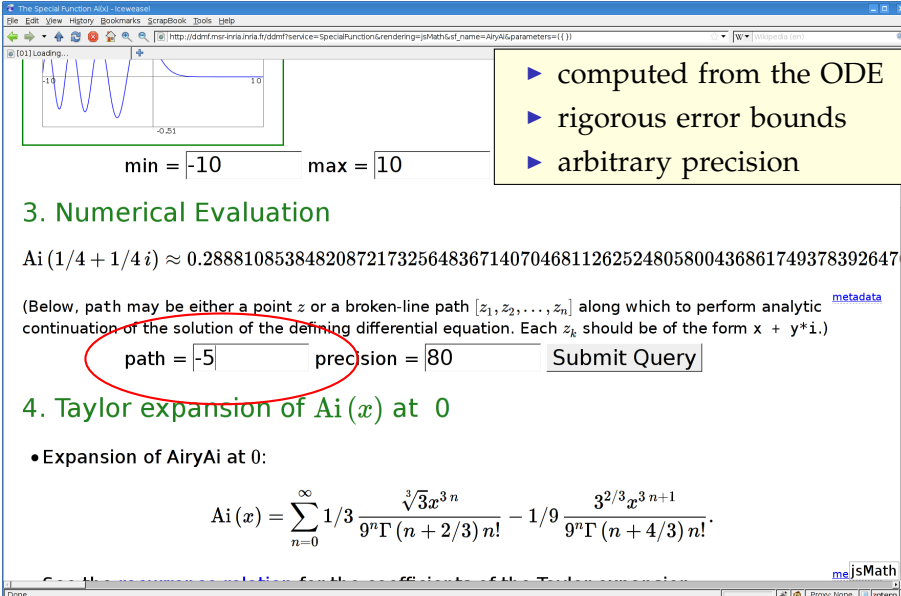
path = `1/4+1/4*i` precision = `80`

4. Taylor expansion of $\text{Ai}(x)$ at 0

- Expansion of $\text{Ai}(x)$ at 0:

$$\text{Ai}(x) = \sum_{n=0}^{\infty} \frac{1}{9^n} \frac{\sqrt[3]{3} x^{3n}}{\Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{\Gamma(n + 4/3) n!}.$$

A Dictionary of D-Finite Functions



The screenshot shows a web browser window titled "The Special Function AIxI - Iceweasel". The address bar contains a URL from the Maxima project. The main content area features a plot of the Airy function $Ai(x)$ with a green box around it. Below the plot are input fields for "min = -10" and "max = 10". To the right, a yellow box contains three bullet points: "computed from the ODE", "rigorous error bounds", and "arbitrary precision". Below this is a section titled "3. Numerical Evaluation" with a text input field containing $Ai(1/4 + 1/4i) \approx 0.28881085384820872173256483671407046811262524805800436861749378392647$. A paragraph explains that the path can be a point or a broken-line path, and each z_k should be of the form $x + y*i$. Below this is a form with "path = -5" (circled in red), "precision = 80", and a "Submit Query" button. The next section is "4. Taylor expansion of $Ai(x)$ at 0", followed by a bullet point "Expansion of AiryAi at 0:" and a mathematical formula for the expansion. The browser's status bar at the bottom shows "Done" and "Proxy: None".

min = max =

- ▶ computed from the ODE
- ▶ rigorous error bounds
- ▶ arbitrary precision

3. Numerical Evaluation

$Ai(1/4 + 1/4i) \approx 0.28881085384820872173256483671407046811262524805800436861749378392647$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.)

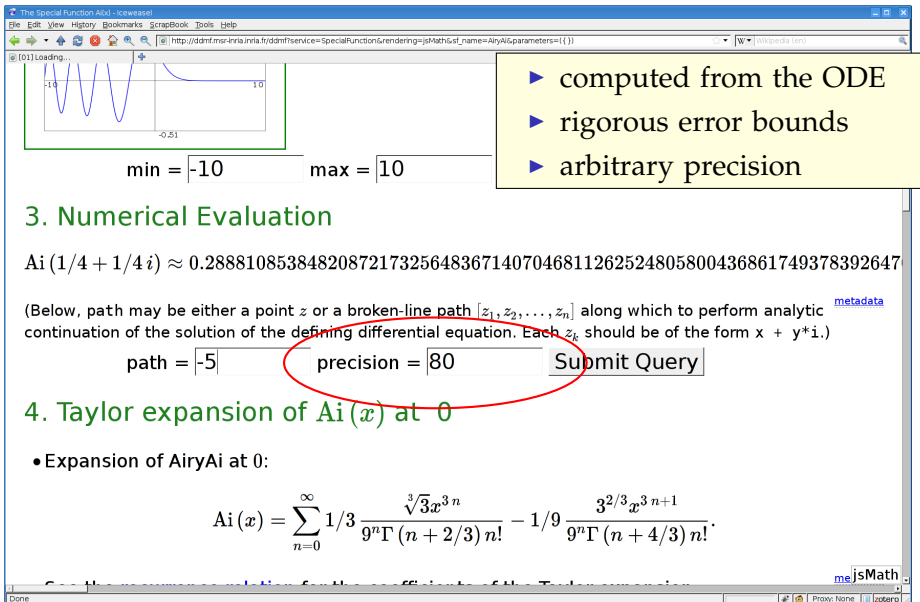
path = precision =

4. Taylor expansion of $Ai(x)$ at 0

- Expansion of AiryAi at 0:

$$Ai(x) = \sum_{n=0}^{\infty} \frac{1}{9^n} \frac{\sqrt[3]{3} x^{3n}}{\Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{\Gamma(n + 4/3) n!}.$$

A Dictionary of D-Finite Functions



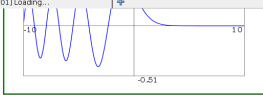
The Special Function Ai(x) - Iceweasel

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http://ddmf.mzi-inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&st_name=AiryAi¶meters={}

Wikipedia.com

[01] Loading...



min = max =

- ▶ computed from the ODE
- ▶ rigorous error bounds
- ▶ arbitrary precision

3. Numerical Evaluation

$Ai(1/4 + 1/4i) \approx 0.28881085384820872173256483671407046811262524805800436861749378392647$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.) [metadata](#)

path = precision =

4. Taylor expansion of $Ai(x)$ at 0

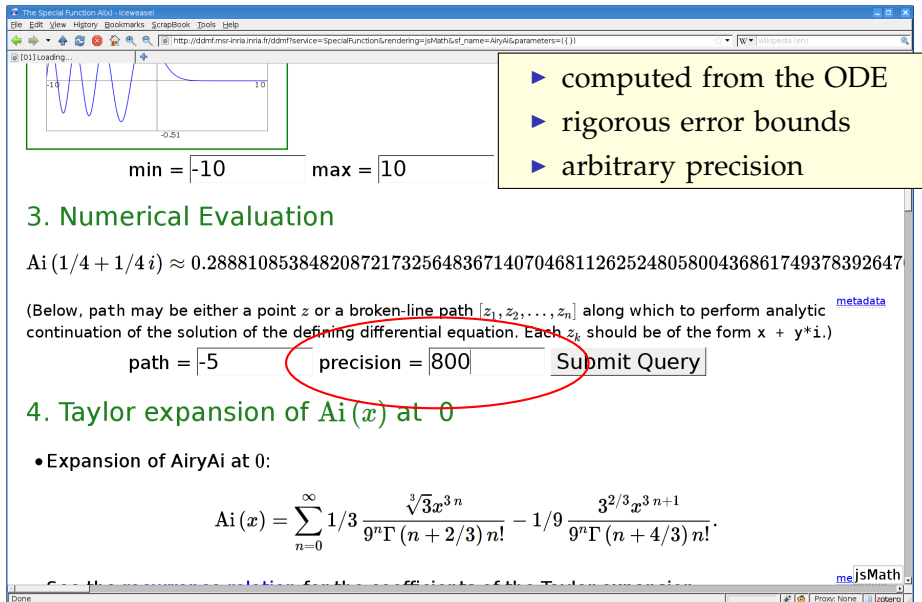
- Expansion of AiryAi at 0:

$$Ai(x) = \sum_{n=0}^{\infty} \frac{1}{9^n} \frac{\sqrt[3]{3} x^{3n}}{\Gamma(n + 2/3) n!} - \frac{1}{9} \frac{x^{2/3}}{\Gamma(n + 4/3) n!}$$

jsMath

Done

A Dictionary of D-Finite Functions



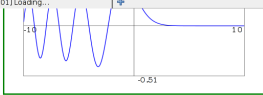
The Special Function Ai(x) - Iceweasel

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http://ddmf.mzr-inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&st_name=AiryAi¶meters={}

Wikipedia.org

[01] Loading...



min = max =

- ▶ computed from the ODE
- ▶ rigorous error bounds
- ▶ arbitrary precision

3. Numerical Evaluation

$Ai(1/4 + 1/4i) \approx 0.28881085384820872173256483671407046811262524805800436861749378392647$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.) [metadata](#)

path = precision =

4. Taylor expansion of $Ai(x)$ at 0

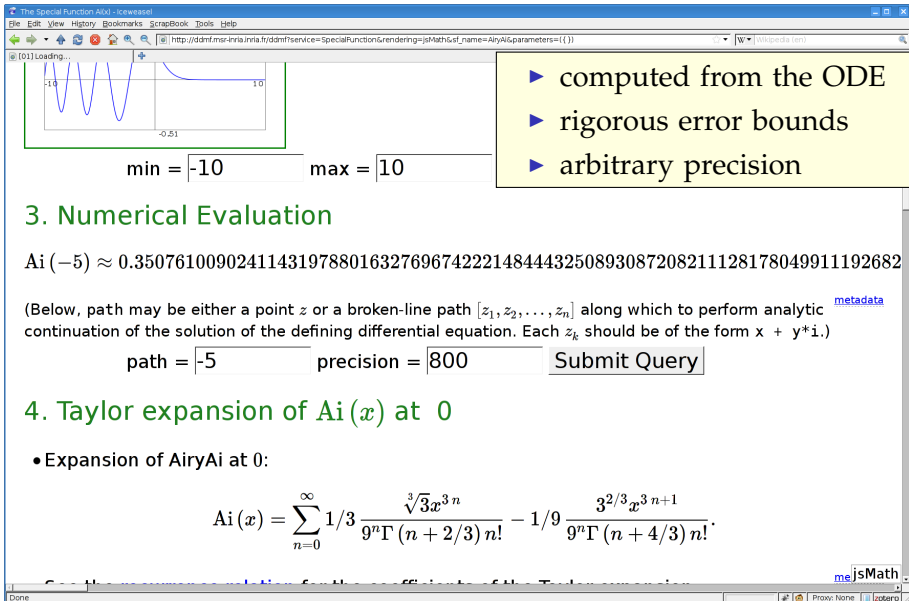
- Expansion of AiryAi at 0:

$$Ai(x) = \sum_{n=0}^{\infty} \frac{1}{9^n} \frac{\sqrt[3]{3} x^{3n}}{\Gamma(n + 2/3) n!} - \frac{1}{9} \frac{x^{2/3}}{\Gamma(n + 4/3) n!}$$

jsMath

Done

A Dictionary of D-Finite Functions



min = max =

- ▶ computed from the ODE
- ▶ rigorous error bounds
- ▶ arbitrary precision

3. Numerical Evaluation

$Ai(-5) \approx 0.350761009024114319788016327696742221484443250893087208211128178049911192682$

(Below, path may be either a point z or a broken-line path $[z_1, z_2, \dots, z_n]$ along which to perform analytic [metadata](#) continuation of the solution of the defining differential equation. Each z_k should be of the form $x + y*i$.)

path = precision =

4. Taylor expansion of $Ai(x)$ at 0

- Expansion of AiryAi at 0:

$$Ai(x) = \sum_{n=0}^{\infty} \frac{1}{9} \frac{\sqrt[3]{3} x^{3n}}{9^n \Gamma(n + 2/3) n!} - \frac{1}{9} \frac{3^{2/3} x^{3n+1}}{9^n \Gamma(n + 4/3) n!}.$$

0.9900	0.42345	08779	18527	0.83850	80695	55370
01	.42336	70387	10965	.83855	04104	51134
02	.42328	32076	37097	.83859	27429	63383
03	.42319	93846	98665	.83863	50670	92932
04	.42311	55698	97410	.83867	73828	40594

0.9905	0.42303	17632	35074	0.83871	96902	07183
06	.42294	79647	13396	.83876	19891	93512
07	.42286	41743	34116	.83880	42798	00397
08	.42278	03920	98971	.83884	65620	28651
09	.42269	66180	09698	.83888	88358	79088

0.9910	0.42261	28520	68035	0.83893	11013	52524
11	.42252	90942	75717	.83897	33584	49774
12	.42244	53446	34478	.83901	56071	71651
13	.42236	16031	46054	.83905	78475	18972
14	.42227	78698	12177	.83910	00794	92552

0.9915	0.42219	41446	34579	0.83914	23030	93207
16	.42211	04276	1			
17	.42202	67187	5			
18	.42194	30180	5			
19	.42185	93255	2			

NumGfun

0.9920	0.42177	56411	51354	0.83935	32955	31151
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NumGfun



<http://algo.inria.fr/libraries/> (GNU LGPL)



<http://algo.inria.fr/libraries/papers/gfun.html>



B. Salvy and P. Zimmermann. Gfun: a Maple package for the manipulation of generating and holonomic functions in one variable. *ACM TOMS*, 1994.

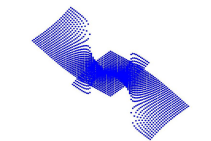
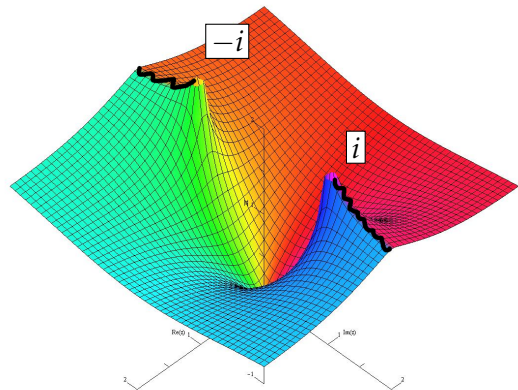


M. Mezzarobba. NumGfun: a Package for Numerical and Analytic Computation with D-finite functions. *ISSAC* 2010.

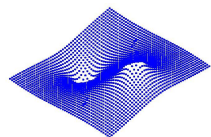


M. Mezzarobba. Autour de l'évaluation numérique des fonctions D-finies. PhD thesis, École polytechnique, 2011.

arctan z



(Re)



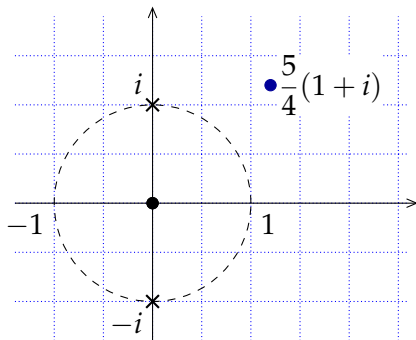
(Im)



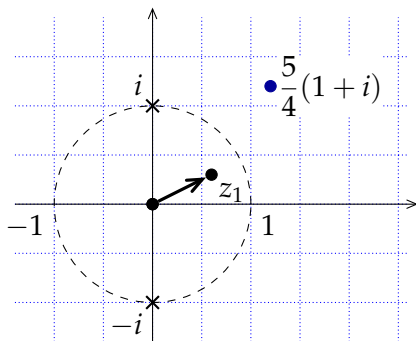
(arg)

$$(1 + z^2) y''(z) + 2z y'(z) = 0,$$
$$y(0) = 0, \quad y'(0) = 1$$

Numerical Analytic Continuation

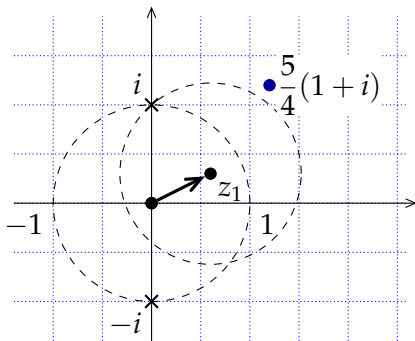


Numerical Analytic Continuation



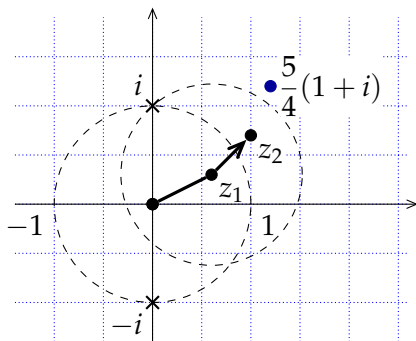
$$\begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix} = \begin{bmatrix} 1 & 0,5705170238 \dots + 0,2200896807 \dots i \\ 0 & 0,7288378766 \dots - 0,2065997130 \dots i \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$

Numerical Analytic Continuation



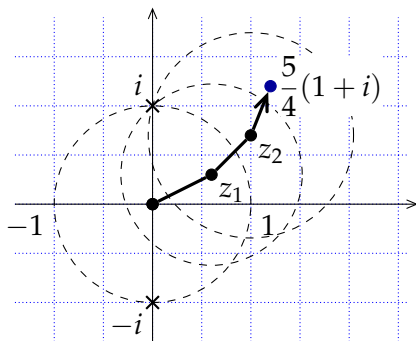
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Numerical Analytic Continuation



$$\begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix} = \begin{bmatrix} 1 & 0,5705170238 \dots + 0,2200896807 \dots i \\ 0 & 0,7288378766 \dots - 0,2065997130 \dots i \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$
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Regular Singular Points

$$z^2 y''(z) + z y'(z) + (z^2 - \nu^2) y(z)$$

0 singular point

regular singular

irregular singular

for any solution y ,

$$\exists N \text{ s.t. } y(z) = O(1/|z|^N) \\ \text{as } z \rightarrow 0$$

$$\text{Ex.: } y(z) = z^{\sqrt{2}}, y(z) = \frac{\log z}{z}$$

non-poly. growth
(w.r.t. $1/|z|$) possible
as $z \rightarrow 0$

$$\text{Ex.: } y(z) = e^{1/z}$$

Solutions at Regular Singular Points

Theorem

[Fuchs, 1866]

Assume 0 is a regular singular point of an ODE with meromorphic coefficients.

Then, on some neighborhood D of 0, there exists a basis of solutions of the form

$$z^\lambda (y_0(z) + y_1(z) \log z + \cdots + y_t(z) \log^t z), \quad z \in D \setminus \{0\}$$

where $\lambda \in \bar{\mathbb{Q}}$ and the y_i are **analytic** on D .

Asymptotics of Linear Recurrence Sequences

*This is AsyRec, A Maple package
accompanying Doron Zeilberger's article:*

*It finds the asymptotics of solutions of (homog.) linear recurrence
equations with polynomial coefficients, using the Birkhoff-Trjitzinsky
method.*

```
> recop := (n+2)^2*N^2-(7*n^2+21*n+16)*N-8*(n+1)^2;  
recop := (n + 2)^2 N^2 - (7 n^2 + 21 n + 16) N - 8 (n + 1)^2
```

```
> AsyC(recop, n, N, 5, [2, 10], 1000);  
0.36755259694786136634,
```

$$\frac{8^n \left(1 - \frac{1}{3n} + \frac{1}{27n^2} + \frac{1}{81n^3} + \frac{1}{243n^4} + \frac{11}{2187n^5} \right)}{n}$$

[Wimp & Zeilberger 1985, Zeilberger 2008-2009]

Principle

asymptotic behaviour of $y(z) = \sum_n y_n z^n$ at its singularities



mechanical transfer

asymptotic behaviour of (y_n) at infinity

- ▶ Constants by singularity analysis
+ numerical analytic continuation
[Flajolet & Puech 1986]



Outlook

D-Finite Functions in Sage

What is there

- ▶ Nothing right now
- ▶ Arithmetic of diff. operators via PLURAL's G-algebras

Main goals

Modern versions of
the main features of

- ▶ gfun
- ▶ Mgfund
- ▶ NumGfund
- ▶ (part of) DEtools
- ▶ ...

A more ambitious goal

D-Finite functions as
“first-class citizens”

Use them to implement
special functions

(Cf. DDMF)

Developments Planned or in Progress (that I know of)

- ▶ Fredrik Johansson, Manuel Kauers, Maximilian Jaroschek
ore_algebra 0.1 released two days ago!
Ore operators, closure properties, guessing. . .
- ▶ ANR Magnum
tools for analytic combinatorics project(?)
- ▶ Matthieu Dien, Marguerite Zamansky
multivariate lazy power series prototype
- ▶ Eviatar Bach (mentored by Burcin Erocal and Flavia Stan)
special functions, in part via D-finiteness GSOC project

Beyond NumGfun

Why Maple?

Historical reasons...

It was a **pain**.

Current plans

- ▶ C/C++ library
- ▶ basic analytic continuation code in arb
(with Fredrik Johansson)
- ▶ Sage interface?


Wishlist

	Maple	Sage
a compiled language	✗	limited
a type system	✗	✗
sane semantics	✗	✓
differential operators, D-finite funs	✓	soon?
floating-point, interval arithmetic	minimal	✓
algebraic numbers	limited	✓ (?)
symbolic special functions, branch cuts...	✓	minimal
asymptotics	✓	✗
ability to fix/extend the system!	✗	✓

Making Numerics Reliable

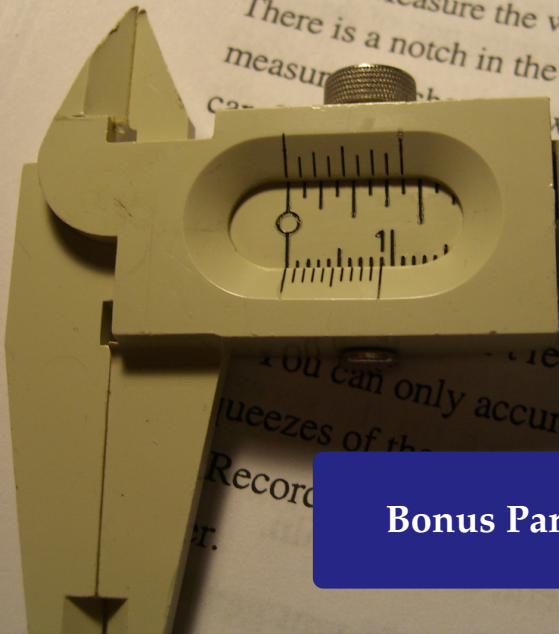
Real/complex **mid-rad interval arithmetic**, aka **ball arithmetic**

$$(3.14159265358979323846264338328, \quad 2 \cdot 10^{-30})$$



multiple-precision floating-point number	machine precision (rel?) error bound
---	---

- ▶ Make balls the **default** for RR, CC?
- ▶ ...in a backward-compatible way?
- ▶ Functions that do not provide guaranteed results would still be allowed to return (accurate-in-practice result, ∞)



d) Measure the width of the vacuum
There is a notch in the aluminum block
measure (width) λ

as a fr
(You can only accurately count
squeezes of the
Record

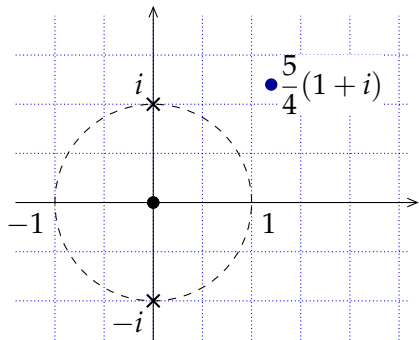
Bonus Part: Algorithms

plete fring

Main Ideas

- 0 fast integer multiplication
- 1 binary splitting
- 2 analytic continuation
- 3 *bit burst*

2. Taylor series method for ODEs

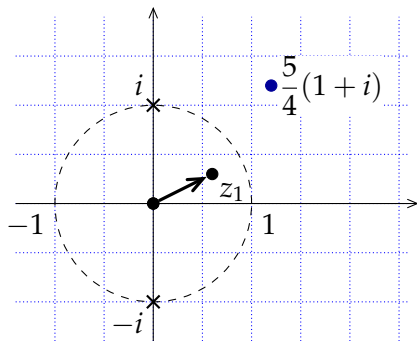


$$\arctan\left(\frac{5}{4}(1+i)\right) = ?$$

Main Ideas

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2. Taylor series method for ODEs



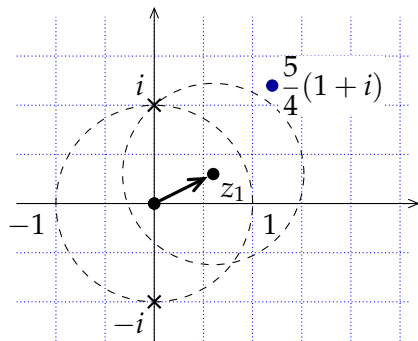
$$\arctan\left(\frac{5}{4}(1+i)\right) = ?$$

$$\begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix} = \begin{bmatrix} 1 & 0,570\dots+0,220\dots i \\ 0 & 0,728\dots-0,206\dots i \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$

Main Ideas

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2. Taylor series method for ODEs



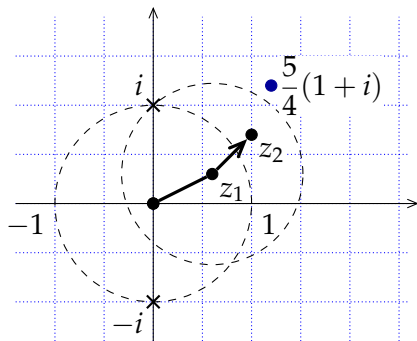
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Main Ideas

- | | |
|-------------------------------|-------------------------|
| 0 fast integer multiplication | 2 analytic continuation |
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2. Taylor series method for ODEs



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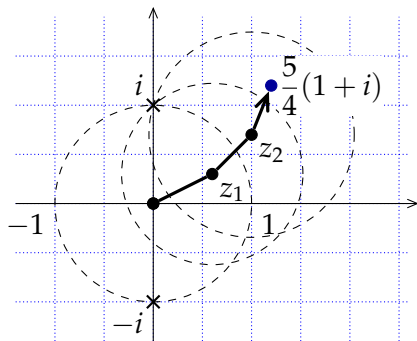
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$$\begin{bmatrix} y(z_2) \\ y'(z_2) \end{bmatrix} = \begin{bmatrix} 1 & 0,365\dots+0,329\dots i \\ 0 & 0,751\dots-0,079\dots i \end{bmatrix} \begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix}$$

Main Ideas

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2. Taylor series method for ODEs



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...

Main Ideas

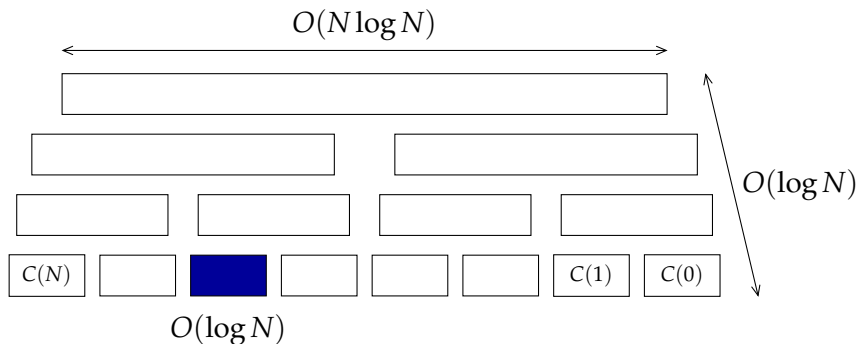
- | | |
|-------------------------------|-------------------------|
| 0 fast integer multiplication | 2 analytic continuation |
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0. One can multiply two integers of $\leq n$ bits in
 $M(n) = O(n \log n 2^{O(\log^* n)})$ bit ops [Fürer 2007].

Main Ideas

- 0 fast integer multiplication
- 1 binary splitting
- 2 analytic continuation
- 3 *bit burst*

1. Within the disk of convergence of a Taylor expansion:
fast series summation algorithm based on the recurrence



Main Ideas

- 0 fast integer multiplication
- 1 binary splitting
- 2 analytic continuation
- 3 *bit burst*

3. High-precision inputs:
use analytic continuation even if the series converges!

$$\begin{aligned}z_0 &= 10_2 \rightarrow z_1 = 10,1_2 \\ &\rightarrow z_2 = 10,101_2 & \sin(e) = \sin(2,718\dots) = ? \\ &\rightarrow z_3 = 10,1011011_2 \\ &\rightarrow z_4 = 10,101101110010100_2 \\ &\rightarrow \dots \\ &\rightarrow z = 10.101101110010100110000\dots_2 \simeq e\end{aligned}$$

Main Ideas

- 0 fast integer multiplication
- 1 binary splitting
- 2 analytic continuation
- 3 *bit burst*

Theorem

[(Chudnovsky², van der Hoeven, M.)]

The evaluation point z being fixed, one may compute $y(z)$ with error bounded by 2^{-n} in

$$O\left(M(n \cdot (\log n)^2)\right)$$

bit operations using $O(n)$ bits of memory.

Error Bounds

$$\sum_{n=0}^{\infty} y_n z^n = \sum_{n=0}^{N-1} y_n z^n + \underbrace{\sum_{n=N}^{\infty} y_n z^n}_{?}$$

Compute suitable truncation orders (and other bounds)?

A priori bounds tend to be easier to use in fast algorithms.

Idea: Replace y , by a **simpler** function that “dominates” it.

Differential equation /
Recurrence



Bound Parameters

$\kappa, \alpha, \dots \in \mathbb{Q}$ or $\bar{\mathbb{Q}}$ s.t.

$$|y_n| \leq n!^\kappa \cdot \alpha^n \cdot \varphi(n)$$

Main Tools:

Cauchy majorants

Saddle-point method

Symbolic Bounds

- ▶ Human-Readable (as far as possible!)
- ▶ Asymptotically tight

Numeric Bounds

- ▶ Conservative approx. of parameters
- ▶ Faster (no algebraic numbers)

Credits

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- ▶ *Tables of the error function and its derivative*. US National Bureau of Standards, 1954 (public domain)
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