

# NumGfun

A Package for Numerical and Analytic Computation  
with D-finite Functions

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INSTITUT NATIONAL  
DE RECHERCHE  
EN INFORMATIQUE  
ET EN AUTOMATIQUE



centre de recherche **PARIS - ROCQUENCOURT**



ISSAC 2010

# Motivation

Dynamic Dictionary of Mathematical Functions - Iceweasel

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http://ddmf.msr-inria.fr/ddmf?service=MainIndex&rendering=jsMath

Wikipedia (en)

[01] Dynamic Dictionary of Ma...

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](#)

- The [inverse cosecant](#)  $\operatorname{arccsc}(x)$
- The [inverse cosine](#)  $\operatorname{arccos}(x)$
- The [inverse cotangent](#)  $\operatorname{arccot}(x)$
- The [inverse hyperbolic cosecant](#)  $\operatorname{arcsch}(x)$
- The [Airy function of the first kind](#)  $\operatorname{Ai}(x)$
- The [inverse secant](#)  $\operatorname{arcsec}(x)$
- The [inverse sine](#)  $\operatorname{arcsin}(x)$
- The [inverse tangent](#)  $\operatorname{arctan}(x)$
- The [Airy function \(of the second kind\)](#)  $\operatorname{Bi}(x)$
- The [hyperbolic cosine integral](#)  $\operatorname{Chi}(x)$
- 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](#)  $\operatorname{erfi}(x)$

**Select a special function from the list**

- [Help](#) on selecting and configuring the mathematical rendering
- [DDMF developers](#) list
- [Motivation](#) of the project

jsMath

Done Proxy: None | Zotero

# Motivation

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

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**Select a special function from the list**

Benoit, Chyzak, Darrasse, Gerhold, M. & Salvy (2010)

• [Motivation of the project](#)

jsMath

# Motivation

The Special Function Ai(x) - Iceweasel

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http://ddmf.msr.inria.fr/ddmf?service=SpecialFunction&rendering=jsMath&sf\_name=AiyA&parameters={}

[01] Loading...

Home Glossary

## The Special Function $Ai(x)$

rendering [link](#)

### 1. Differential equation

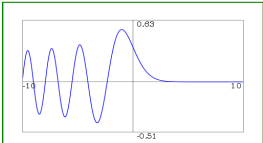
The function  $Ai(x)$  satisfies

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

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

[metadata](#)

### 2. Plot of $Ai(x)$



jsMath

Done Proxy: None | zotero

# Motivation

The Special Function Ai(x) - Iceweasel

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http://ddmf.msr.inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&sf\_name=AiyA&parameters={}

[01] Loading...

Home

The Special Function Ai(x)

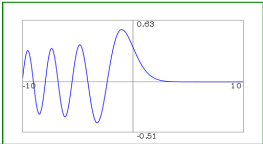
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2. Plot of  $Ai(x)$



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

metadata

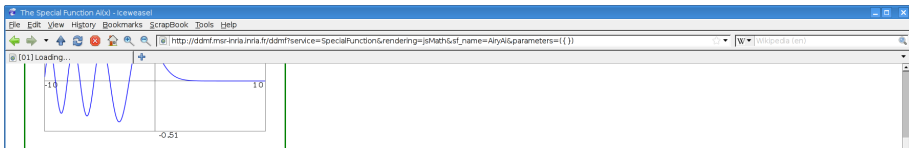
jsMath

Done

Proxy: None

zotero

# Motivation



min =

max =

## 3. Numerical Evaluation

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

(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 =

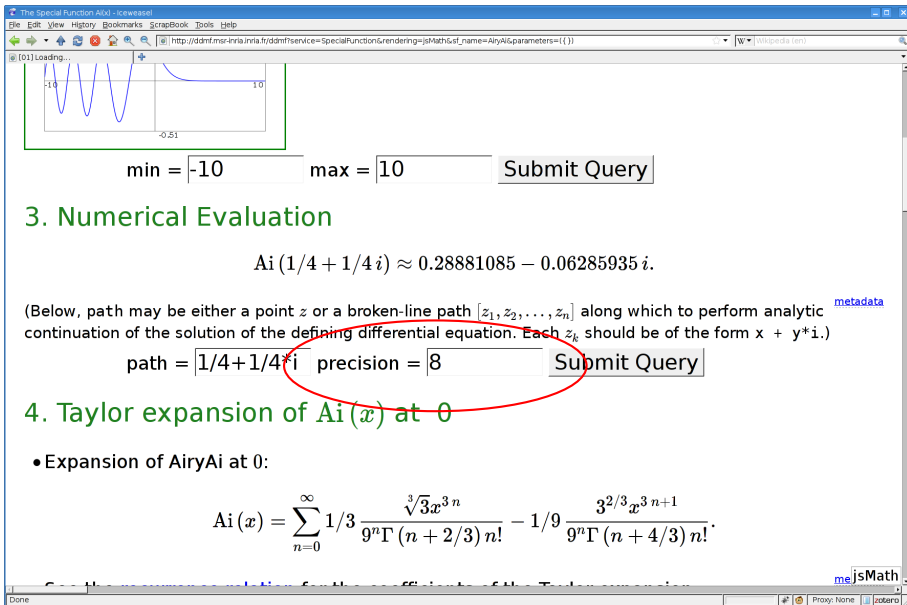
precision =

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

- Expansion of AiryAi at 0:

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

# Motivation



The screenshot shows a web browser window titled "The Special Function Ai(x) - Iceweasel". The address bar contains the URL: `http://ddmf.msr-inria.fr/ddmf/service=SpecialFunction&rendering=jsMath&sf_name=AiyAi&parameters={}`. The browser shows a plot of the Airy function  $Ai(x)$  with a y-axis ranging from -10 to 10 and an x-axis with a tick at -0.51. Below the plot, there are input fields for "min = -10" and "max = 10", and a "Submit Query" button.

### 3. Numerical Evaluation

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

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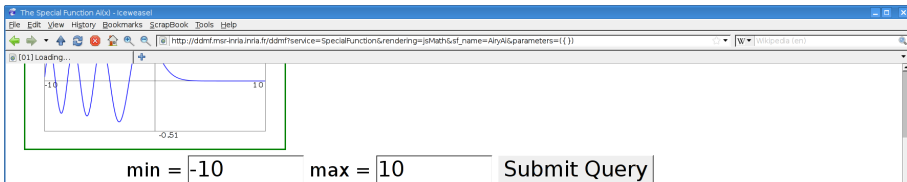
path =  precision =

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# Motivation



min =  max =

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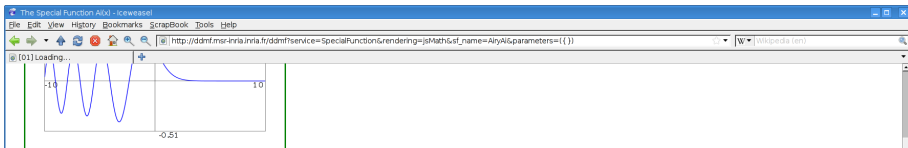
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# Motivation



min =

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## 3. Numerical Evaluation

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

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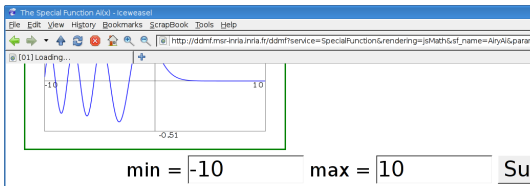
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# Motivation



- arbitrary precision
- guaranteed results
- computed from the diff. equation

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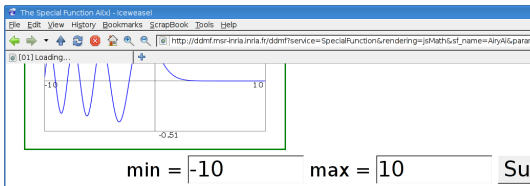
36861749378392647020710083742 - 0.062859346556545730232761436943988956545624961055148330

form analytic [metadata](#)  
(form  $x + y*i$ .)

[metadata](#)

jsMath

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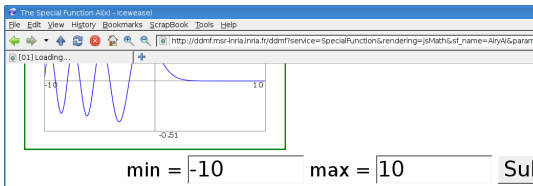
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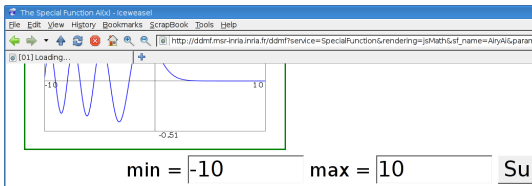
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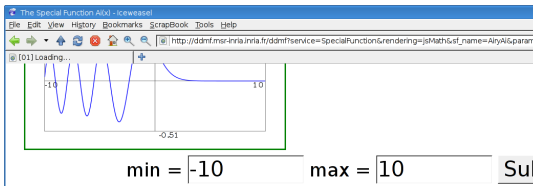
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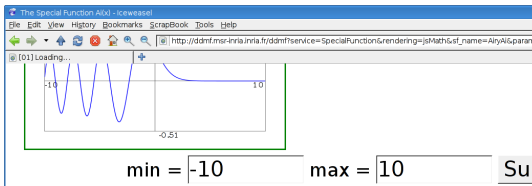
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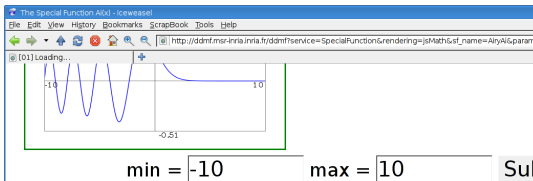
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# Motivation



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## 3. Numerical Evaluation

$\text{Ai}(-5) \approx 0.350761009024114319788016327696742221484443250893087208211128178049911192682$

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# Previous Work

- Schroepfel (1972) – Evaluation at special points
- Brent (1976) – Narrow class of functions (at any point)
- Chudnovsky & Chudnovsky (1988) – General method
- van der Hoeven (1999) – Complete algorithm with error bounds
- M. & Salvy (2009) – Improved bounds

No general implementation so far

# This Talk

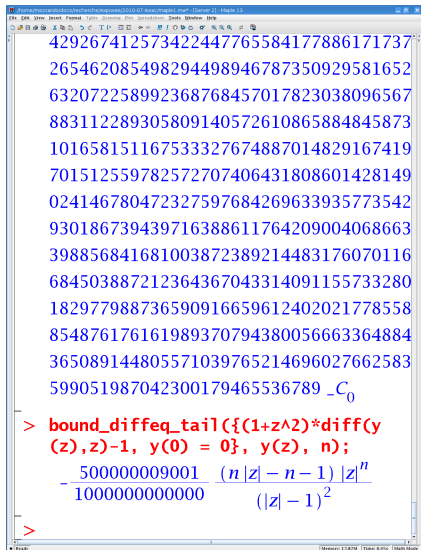
```

> with(gfun):
> with(NumGfun);
[abs_with_RootOf, analytic_continuation,
 bound_diffeq, bound_diffeq_tail,
 bound_ratpoly, bound_rec, bound_rec_tail,
 diffeqtoproc, dominant_root, evaldiffeq,
 fnth_term, make_waksman_proc,
 needed_terms, transition_matrix]
> evaldiffeq(diff(y(z),z)=y(z), y
(z), 1, 10000);
2.7182818284590452353602874713526624977
572470936999595749669676277240766303
535475945713821785251664274274663919
320030599218174135966290435729003342
952605956307381323286279434907632338
298807531952510190115738341879307021
540891499348841675092447614606680822
648001684774118537423454424371075390
777449920695517027618386062613313845
830007520449338265602976067371132007

```

- $\text{NumGfun} \hat{=}$  Maple package behind the “analytic” features of DDMF
- Numerical evaluation  
First general implementation of the Chudnovsky’s algorithm  
(with various improvements)
- Symbolic bounds

# This Talk



```
429267412573422447765584177886171737
265462085498294498946787350929581652
632072258992368768457017823038096567
883112289305809140572610865884845873
101658151167533327674887014829167419
701512559782572707406431808601428149
024146780472327597684269633935773542
930186739439716388611764209004068663
398856841681003872389214483176070116
684503887212364367043314091155733280
182977988736590916659612402021778558
854876176161989370794380056663364884
365089144805571039765214696027662583
599051987042300179465536789 _C0
> bound_diffeq_tail({(1+z^2)*diff(y
(z),z)-1, y(0) = 0}, y(z), n);
- 500000009001 (n |z| - n - 1) |z|^n
1000000000000 (|z| - 1)^2
>
```

- NumGfun  $\hat{=}$  Maple package behind the “analytic” features of DDMF
- Numerical evaluation  
First general implementation of the Chudnovsky’s algorithm  
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- Symbolic bounds

# A Less Common Special Function

## The Double Confluent Heun Function

```
> diffeq := collect({diff(y(z),z,z)-(-2*  
z^5+4*z^3+z^4*a-2*z-a)*(diff(y(z),z))/(  
(z-1)^3*(z+1)^3)-(-z^2*b+(-c-2*a)*z-d)*y  
(z)/((z-1)^3*(z+1)^3),y(0)=1,D(y)(0)=0},  
diff,factor);
```

# A Less Common Special Function

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(z)/((z-1)^3*(z+1)^3),y(0)=1,D(y)(0)=0},  
diff,factor);
```

$$\text{diffeq} := \left\{ \frac{d^2}{dz^2} y(z) - \frac{(-2z^3 + z^2 a + 2z + a) \left( \frac{d}{dz} y(z) \right)}{(z+1)^2 (z-1)^2} \right. \\ \left. + \frac{(z^2 b + z c + 2z a + d) y(z)}{(z-1)^3 (z+1)^3}, y(0) = 1, D(y)(0) = 0 \right\}$$

```
>
```

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```
> a, b, c, d := 1, 1/3, 1/2, 3;
```

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> diffeq := collect({diff(y(z),z,z)-(-2*  
z^5+4*z^3+z^4*a-2*z-a)*(diff(y(z),z))/(  
(z-1)^3*(z+1)^3)-(-z^2*b+(-c-2*a)*z-d)*y  
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diff,factor);
```

$$\text{diffeq} := \left\{ \frac{d^2}{dz^2} y(z) - \frac{(-2z^3 + z^2 a + 2z + a) \left( \frac{d}{dz} y(z) \right)}{(z+1)^2 (z-1)^2} \right. \\ \left. + \frac{(z^2 b + z c + 2z a + d) y(z)}{(z-1)^3 (z+1)^3}, y(0) = 1, D(y)(0) = 0 \right\}$$

```
> a, b, c, d := 1, 1/3, 1/2, 3;
```

$$a, b, c, d := 1, \frac{1}{3}, \frac{1}{2}, 3$$

```
>
```



# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));
```

# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
[>
```

# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
[> myHeunD := diffeqtoproc(diffeq, y(z)):
```

# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
[> myHeunD := diffeqtoprod(diffeq, y(z));  
[>
```

# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
[> myHeunD := diffeqtoprod(diffeq, y(z));  
[> myHeunD(1/3, 50);
```

# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
[> myHeunD := diffeqtoprod(diffeq, y(z));  
[> myHeunD(1/3, 50);  
1.23715744756395253918007831405821000395447403052075  
[>
```

# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
[> myHeunD := diffeqtoproc(diffeq, y(z));  
[> myHeunD(1/3, 50);  
1.23715744756395253918007831405821000395447403052075  
[>
```

# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
[> myHeunD := diffeqtoproc(diffeq, y(z));  
[> myHeunD(1/3, 50);  
1.23715744756395253918007831405821000395447403052075  
[> myHeunD(1/3, 2000);
```



# Accuracy Issues

More General Code Often Means Less Bugs

```
[> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
[> myHeunD := diffeqtoproc(diffeq, y(z)):  
[> myHeunD(1/3, 50);  
1.23715744756395253918007831405821000395447403052075  
[> myHeunD(1/3, 2000);
```

(1.3 s later...)

# Accuracy Issues

More General Code Often Means Less Bugs

```
> evalf[51](HeunD(a, b, c, d, 1/3));  
1.23715744756395253918007831405821000395447403052069  
> myHeunD := diffeqtoproc(diffeq, y(z)):  
> myHeunD(1/3, 50);  
1.23715744756395253918007831405821000395447403052075  
> myHeunD(1/3, 2000);  
1.237157447563952539180078314058210003954474030520747249\  
77368122339910479272634279104260366917046868224326693\  
22058740005957868869065637255063771378117634825003548\  
.....  
96170152380808246265230916158732964496323766777357428\  
28214335810166903875586333320334746574757060060591160\  
33361999970684428816250827723506800809  
>
```

# Accuracy Issues

## Approaching Singularities

```
[> evalf(HeunD(a, b, c, d, -0.9));
```

# Accuracy Issues

## Approaching Singularities

```
[> evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
[>
```

# Accuracy Issues

## Approaching Singularities

```
[> evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
[> myHeunD(-0.9, 9);
```

# Accuracy Issues

## Approaching Singularities

```
[> evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
[> myHeunD(-0.9, 9);  
2.695836219  
[>
```

# Accuracy Issues

## Approaching Singularities

```
[> evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
[> myHeunD(-0.9, 9);  
2.695836219  
[>
```

# Accuracy Issues

## Approaching Singularities

```
[> evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
[> myHeunD(-0.9, 9);  
2.695836219  
[> evalf(HeunD(a, b, c, d, -0.99));
```



# Accuracy Issues

## Approaching Singularities

```
[ > evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
[ > myHeunD(-0.9, 9);  
2.695836219  
[ > evalf(HeunD(a, b, c, d, -0.99));  
Warning, breaking after 2000 terms, the series  
is not converging  
undefined  
[ >
```

# Accuracy Issues

## Approaching Singularities

```
> evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
> myHeunD(-0.9, 9);  
2.695836219  
> evalf(HeunD(a, b, c, d, -0.99));  
Warning, breaking after 2000 terms, the series  
is not converging  
undefined  
> myHeunD(-0.99);
```

# Accuracy Issues

## Approaching Singularities

```
[ > evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
[ > myHeunD(-0.9, 9);  
2.695836219  
[ > evalf(HeunD(a, b, c, d, -0.99));  
Warning, breaking after 2000 terms, the series  
is not converging  
undefined  
[ > myHeunD(-0.99);  
4.6775585280  
[ >
```

# Accuracy Issues

## Approaching Singularities

```
> evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
> myHeunD(-0.9, 9);  
2.695836219  
> evalf(HeunD(a, b, c, d, -0.99));  
Warning, breaking after 2000 terms, the series  
is not converging  
undefined  
> myHeunD(-0.99);  
4.6775585280  
> myHeunD(-0.99, 500);
```

# Accuracy Issues

## Approaching Singularities

```
> evalf(HeunD(a, b, c, d, -0.9));  
2.695836763  
> myHeunD(-0.9, 9);  
2.695836219  
> evalf(HeunD(a, b, c, d, -0.99));  
Warning, breaking after 2000 terms, the series  
is not converging  
undefined  
> myHeunD(-0.99);  
4.6775585280  
> myHeunD(-0.99, 500);  
(6.1 s later...)
```

# Accuracy Issues

## Approaching Singularities

```
> evalf(HeunD(a, b, c, d, -0.9));
```

```
2.695836763
```

```
> myHeunD(-0.9, 9);
```

```
2.695836219
```

```
> evalf(HeunD(a, b, c, d, -0.99));
```

```
Warning, breaking after 2000 terms, the series  
is not converging
```

```
undefined
```

```
> myHeunD(-0.99);
```

```
4.6775585280
```

```
> myHeunD(-0.99, 500);
```

```
4.677558527966890481646371616414130565650323560409922037\
```

```
.....  
89542201276207762696563032189351846152496641167932588\
```

```
4660460023972873078881
```

```
>
```

# Accuracy Issues

## Approaching Singularities

```
> evalf(HeunD(a, b, c, d, -0.9));
```

```
2.695836763
```

```
> myHeunD(-0.9, 9);
```

```
2.695836219
```

```
> evalf(HeunD(a, b, c, d, -0.99));
```

```
Warning, breaking after 2000 terms, the series  
is not converging
```

```
undefined
```

```
> myHeunD(-0.99);
```

```
4.6775585280
```

```
> myHeunD(-0.99, 500);
```

```
4.677558527966890481646371616414130565650323560409922037\
```

```
89542201276207762696563032189351846152496641167932588\
```

```
4660460023972873078881
```

```
No numerical instability issues
```

# A “Random” Example

```
> random_diffeq := proc(ord, d)
  uses RandomTools; local myrat;
  myrat := 'rational'('denominator'=60);
  { add(Generate('polynom'(myrat, z,
    'degree'=d)) * diff(y(z), [z$k]),
    k=0..ord),
    seq((D@@k)(y)(0) = Generate(myrat),
    k=0..ord-1) };
end proc;
```



# A “Random” Example

```
[> random_diffeq := proc(ord, d)
    uses RandomTools; local myrat;
    myrat := 'rational'('denominator'=60);
    { add(Generate('polynom'(myrat, z,
        'degree'=d)) * diff(y(z), [z$k]),
        k=0..ord),
        seq((D@@k)(y)(0) = Generate(myrat),
            k=0..ord-1) };
end proc:
[> diffeq := random_diffeq(3, 2);
```

# A “Random” Example

```
[> diffeq := random_diffeq(3, 2);
```

# A “Random” Example

```
> diffeq := random_diffeq(3, 2);
```

$$\begin{aligned} \text{diffeq} := & \left\{ \left( \frac{13}{30} + \frac{8}{15} z + \frac{7}{30} z^2 \right) y(z) + \left( -\frac{9}{20} + \frac{29}{30} z \right. \right. \\ & \left. \left. - \frac{1}{12} z^2 \right) \left( \frac{d}{dz} y(z) \right) + \left( -\frac{43}{60} + \frac{49}{60} z \right. \right. \\ & \left. \left. + \frac{11}{30} z^2 \right) \left( \frac{d^2}{dz^2} y(z) \right) + \left( -\frac{7}{12} + \frac{17}{30} z \right. \right. \\ & \left. \left. - \frac{3}{5} z^2 \right) \left( \frac{d^3}{dz^3} y(z) \right), y(0) = 0, D(y)(0) = \frac{7}{30}, D^{(2)}(y)(0) = \right. \\ & \left. -\frac{43}{60} \right\} \end{aligned}$$

# A “Random” Example

```
> diffeq := random_diffeq(3, 2);
```

$$\begin{aligned} \text{diffeq} := & \left\{ \left( \frac{13}{30} + \frac{8}{15} z + \frac{7}{30} z^2 \right) y(z) + \left( -\frac{9}{20} + \frac{29}{30} z \right. \right. \\ & \left. \left. - \frac{1}{12} z^2 \right) \left( \frac{d}{dz} y(z) \right) + \left( -\frac{43}{60} + \frac{49}{60} z \right. \right. \\ & \left. \left. + \frac{11}{30} z^2 \right) \left( \frac{d^2}{dz^2} y(z) \right) + \left( -\frac{7}{12} + \frac{17}{30} z \right. \right. \\ & \left. \left. - \frac{3}{5} z^2 \right) \left( \frac{d^3}{dz^3} y(z) \right), y(0) = 0, D(y)(0) = \frac{7}{30}, D^{(2)}(y)(0) = \right. \\ & \left. -\frac{43}{60} \right\} \end{aligned}$$

```
> evaldiffeq(diffeq, y(z), (1+I)/5, 40);
```

# A “Random” Example

```
> diffeq := random_diffeq(3, 2);
```

$$\begin{aligned} \text{diffeq} := & \left\{ \left( \frac{13}{30} + \frac{8}{15} z + \frac{7}{30} z^2 \right) y(z) + \left( -\frac{9}{20} + \frac{29}{30} z \right. \right. \\ & \left. \left. - \frac{1}{12} z^2 \right) \left( \frac{d}{dz} y(z) \right) + \left( -\frac{43}{60} + \frac{49}{60} z \right. \right. \\ & \left. \left. + \frac{11}{30} z^2 \right) \left( \frac{d^2}{dz^2} y(z) \right) + \left( -\frac{7}{12} + \frac{17}{30} z \right. \right. \\ & \left. \left. - \frac{3}{5} z^2 \right) \left( \frac{d^3}{dz^3} y(z) \right), y(0) = 0, D(y)(0) = \frac{7}{30}, D^{(2)}(y)(0) = \right. \\ & \left. -\frac{43}{60} \right\} \end{aligned}$$

```
> evaldiffeq(diffeq, y(z), (1+I)/5, 40);
```

```
0.0448555748776784313189330814759311548663
```

```
+ 0.0199048983021280530504789772581099788282 I
```

# High Precision

It Scales!

```
[> evaldiffeq(diffeq, y(z), 1/5, 1000000);
```

# High Precision

It Scales!

```
[> evaldiffeq(diffeq, y(z), 1/5, 1000000);
```

(29 min later...)

# High Precision

It Scales!

```
> evaldiffeq(diffeq, y(z), 1/5, 1000000);  
0.033253281257567506772459381920024394391065961347292863\  
13611785593075654371610784719859620906805710762776061\  
65993844793918297941976188620650536691082179149605904\  
31080482988558239935175505111768194891591740446771304\  
74730251896359727561534310095807343639273056518962333\  
97217595138842309884016425632431029577130431472108646\  
95485154767624024297343851584414126056237771911489680\  
.....  
97933258259972366466573219602501650218139747781157348\  
78322628655747195818205282428148240800376913561455564\  
29598794491231828039584256430669932365880956101719727\  
33806130243940574539991121877851105270752378138422728\  
76176859592508040781771637205060431902227437673286901\  
71292574098466950906705927590030494460150099288210121\  
868701569
```



# Complexity

## Theorem (Chudnovsky<sup>2</sup>)

Let  $y$  be a D-finite function. Let  $z$  be a point on the Riemann surface of  $y$ .

The value  $y(z)$  may be computed with error bounded by  $2^{-n}$  in

$$O\left(M\left(n \cdot (\log n)^3\right)\right)$$

bit operations.

Note: this is for fixed  $y$  and  $z$ . See the paper for some results about the dependency on  $y$ .

# Complexity

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bit operations.

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# Complexity

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bit operations.

Note: this is for fixed  $y$  and  $z$ . See the paper for some results about the dependency on  $y$ .

# What NumGfun Really Computes

```
[> deq := (1+z^2)*diff(y(z),z,z)  
      + 2*z*diff(y(z),z);
```

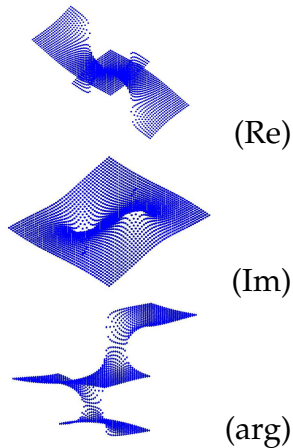
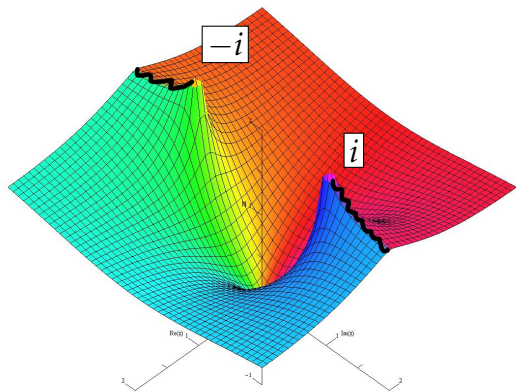
# What NumGfun Really Computes

```
> deq := (1+z^2)*diff(y(z),z,z)  
      + 2*z*diff(y(z),z);
```

$$deq := (1 + z^2) \left( \frac{d^2}{dz^2} y(z) \right) + 2 \left( \frac{d}{dz} y(z) \right) z$$

```
>
```

# arctan $z$



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

# What NumGfun Really Computes

```
> deq := (1+z^2)*diff(y(z),z,z)  
      + 2*z*diff(y(z),z);
```

$$deq := (1 + z^2) \left( \frac{d^2}{dz^2} y(z) \right) + 2 \left( \frac{d}{dz} y(z) \right) z$$

```
>
```

# What NumGfun Really Computes

```
> deq := (1+z^2)*diff(y(z),z,z)
      + 2*z*diff(y(z),z);
```

$$deq := (1 + z^2) \left( \frac{d^2}{dz^2} y(z) \right) + 2 \left( \frac{d}{dz} y(z) \right) z$$

```
> evaldiffeq(deq, y(z), 1/2, 20);
```













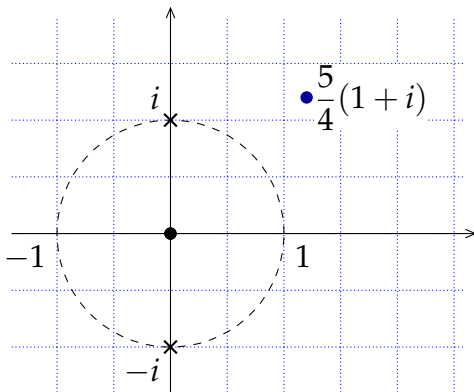
# What NumGfun Really Computes

## Numerical Analytic Continuation

```
[> evaldiffseq(deq, y(z), [0,5/4*(1+I)], 20);
```

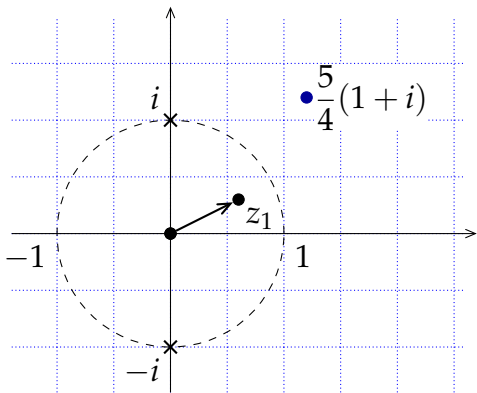


# Numerical Analytic Continuation



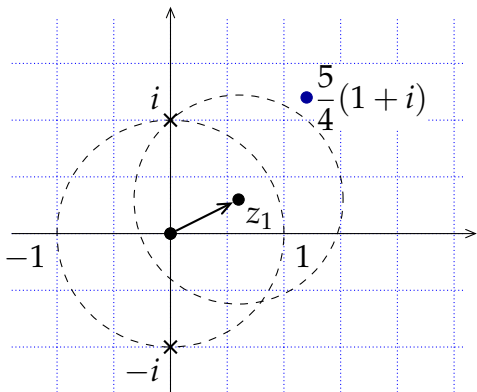


# Numerical Analytic Continuation



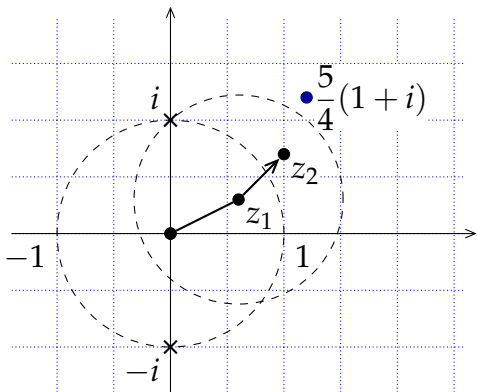
$$\begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix} = \begin{bmatrix} 1 & 0.5705170238 \dots + 0.2200896807 \dots i \\ 0 & 0.7288378766 \dots - 0.2065997130 \dots i \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$

# Numerical Analytic Continuation



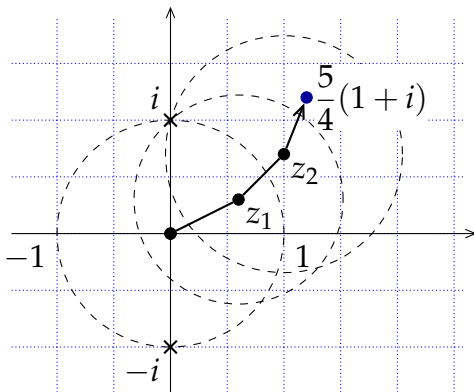
$$\begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix} = \begin{bmatrix} 1 & 0.5705170238 \dots + 0.2200896807 \dots i \\ 0 & 0.7288378766 \dots - 0.2065997130 \dots i \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$

# Numerical Analytic Continuation



$$\begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix} = \begin{bmatrix} 1 & 0.5705170238 \dots + 0.2200896807 \dots i \\ 0 & 0.7288378766 \dots - 0.2065997130 \dots i \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$
$$\begin{bmatrix} y(z_2) \\ y'(z_2) \end{bmatrix} = \begin{bmatrix} 1 & 0.3656231471 \dots + 0.3290407483 \dots i \\ 0 & 0.7515011402 \dots - 0.0792619810 \dots i \end{bmatrix} \begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix}$$

# Numerical Analytic Continuation



$$\begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix} = \begin{bmatrix} 1 & 0.5705170238 \dots + 0.2200896807 \dots i \\ 0 & 0.7288378766 \dots - 0.2065997130 \dots i \end{bmatrix} \begin{bmatrix} y(0) \\ y'(0) \end{bmatrix}$$
$$\begin{bmatrix} y(z_2) \\ y'(z_2) \end{bmatrix} = \begin{bmatrix} 1 & 0.3656231471 \dots + 0.3290407483 \dots i \\ 0 & 0.7515011402 \dots - 0.0792619810 \dots i \end{bmatrix} \begin{bmatrix} y(z_1) \\ y'(z_1) \end{bmatrix}$$











# Bounds and Error Control

Core idea: Replace  $y$  by a **simpler function** that “dominates” it

## Bound parameters

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

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

Tools: Cauchy-Kovalevskaya  
majorant series method  
+ basic asymptotic analysis  
(M. & Salvy 2009)

## Symbolic bounds

- Human-readable
- Asymptotically tight

## Numeric bounds

- Conservative approximations of parameters
- Faster (no algebraic numbers)



## Recap: Numerical evaluation

- general whole class of D-finite functions
- guaranteed rigorous bounds
- automatic input = diff. eq. + ini. val. (no “hints”)
- asymptotically fast quasi-linear complexity w.r.t. precision



## Get NumGfun at

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



## See the paper for

- other features: recurrence unrolling, more bounds, ...
- new techniques for regular singular points
- a new faster way to compute the transition matrices
- details that matter in practice
- ...



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- other features: recurrence unrolling, more bounds, ...
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- a ...
- the transition matrices
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**Thank you for  
your attention!**



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- details that matter in practice
- ...

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