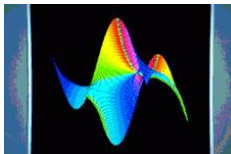


Calcul formel & Analyse d'algorithmes

Bruno Salvy

`Bruno.Salvy@inria.fr`

Algorithms Project, Inria



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I Introduction

Λ - Ω Demonstration (I)

```
type exponent = sequence(bit);
    bit = zero | one;
    zero,one = atom(1);
```

```
procedure binpow(c:exponent);
case c of
    () : nil;
    (zero,c1) : begin squaring; binpow(c1) end;
    (one,c1) : begin squaring; multiply; binpow(c1) end
end;
```

```
measure multiply : k1;
    squaring : k2;
to_analyze : binpow;
```

$\Lambda\tau\Omega$ Demonstration (II)

```
% luo
      Lambda-Upsilon-Omega
      (Version 1.3)
Initializing maple ...
For help about LUO, type help " ";

#analyze "binpow";
>>> ALGEBRAIC ANALYZER ...
      exponent(z) = Q(2 z)

      tau_binpow(z) = -  $\frac{-2 k_2 z Q(2 z) - k_1 z Q(2 z)}{1 - 2 z}$ 
```

```
>>> ANALYTIC ANALYZER ...
Number of exponent of size n is:
```

$$\frac{1 \sqrt{-\ln(2)}}{\exp(n)} + (0(\frac{\exp(n)}{n}))$$

```
Total cost on random inputs of size n:
```

$$((k_2 + 1/2 k_1) n \frac{1 \sqrt{-\ln(2)}}{\exp(n)}) + (0(\exp(n) \frac{\ln(2)}{n}))$$

```
Average cost on random inputs of size n:
```

$$((k_2 + 1/2 k_1) n) + (0(1))$$

Principle

Combinatorial Structure



Generating Function



Asymptotic Estimate

Computer Algebra

Program



Generating Function

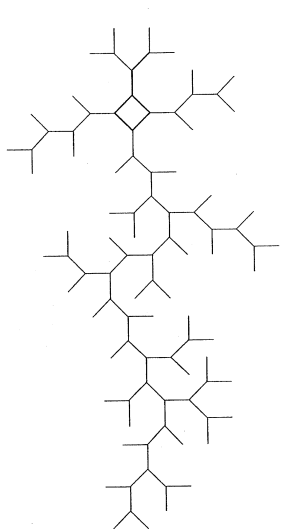


Asymptotic Estimate

Examples of Automatic Analysis of Algorithms

- Pollard's ρ algorithm;
- Automatic differentiation;
- Quicksort and quickselect;
- Patterns in DNA;
- Various parameters in various structures...

More at <http://algo.inria.fr>



[European site](#)

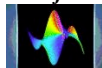
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Structure 1	
Specification	[S, {C = Prod(B,Z), S = Set(C), B = Sequence(C)}, labelled]
First terms in the sequence	[1, 1, 3, 19, 193, 2721, 49171, 1084483, 28245729, 848456353, 28875761731, 1098127402131, 46150226651233, 2124008553358849, 106246577894593683, 5739439214861417731, 332993721039856822081, 20651350143685984386753, 1363322103204314826347779, 95453198574445723828731283, 7064900016612187878152462721]
Generating function	$\exp(1/2-1/2 * (1-4 * x)^{(1/2)})$
Recurrence	{f(0) = 1, f(1) = 1, -f(n) + (-4 * n-2) * f(n+1) + f(n+2)}
Asymptotics of the coefficients	$1/4 * \pi^{(1/2)} * \exp(1/2) / n^{(3/2)} * 4^n$
References	EIS A001517 (up to a possible factor of n!)
ECS number	131

II Combinatorics

Language

Context-free grammars (Union, Prod, Sequence), plus Set, Powerset, Cycle. Origins: [Pólya37, Joyal81,...]
 Labelled and unlabelled universes.

Example

Binary trees	$B = \text{Union}(Z, \text{Prod}(B, B))$
Mappings	$M = \text{Set}(\text{Cycle}(\text{Tree})),$ $\text{Tree} = \text{Prod}(Z, \text{Set}(\text{Tree}))$
Permutations	$P = \text{Set}(\text{Cycle}(Z))$
Children rounds	$R = \text{Set}(\text{Prod}(Z, \text{Cycle}(Z)))$
Integer partitions	$P = \text{Set}(\text{Sequence}(Z))$
Set partitions	$P = \text{Set}(\text{Set}(Z, \text{card} > 0))$
Irreducible polynomials mod p	$P = \text{Set}(\text{Irred}), P = \text{Sequence}(\text{Coeff}).$

Aim: complete libraries

Complexity Descriptors [FIS87]

Definition (P program operating over $a \in \mathcal{A}$, $\tau P(a)$ its cost)

$$\tau P(z) := \sum_{a \in \mathcal{A}} \frac{\tau P(a)}{(|a|!)} z^{|a|}.$$

Translation Rules

	\mathcal{A}	$P(a)$	$\tau P(z)$
Constant		c	$A(z)\tau c$
Sequence		$Q(a); R(a)$	$\tau Q(z) + \tau R(z)$
Branching	$\mathcal{B} \cup \mathcal{C}$	if $a \in \mathcal{B}$ then $Q(a)$ else $R(a)$	$\tau Q(z) + \tau R(z)$
Loop	$\mathcal{B} \times \mathcal{C}$	$a =: (b, c); Q(b)$	$C(z)\tau Q(z)$

Proof (loop in labelled case)

$$\begin{aligned}
 \tau P(z) &= \sum_{(b,c) \in \mathcal{B} \times \mathcal{C}} \tau Q(b) \frac{z^{|b|+|c|}}{(|b|+|c|)!} \\
 &= \sum_{\substack{b \in \mathcal{B} \\ c \in \mathcal{C}}} \binom{|b|+|c|}{|b|} \tau Q(b) \frac{z^{|b|} z^{|c|}}{(|b|+|c|)!} \\
 &= \sum_{\substack{b \in \mathcal{B} \\ c \in \mathcal{C}}} \tau Q(b) \frac{z^{|b|}}{|b|!} \frac{z^{|c|}}{|c|!}.
 \end{aligned}$$

Relabelling!

Proof (loop in labelled case)

$$\begin{aligned}
 \tau P(z) &= \sum_{(b,c) \in \mathcal{B} \times \mathcal{C}} \tau Q(b) \frac{z^{|b|+|c|}}{(|b|+|c|)!} \\
 &= \sum_{\substack{b \in \mathcal{B} \\ c \in \mathcal{C}}} \binom{|b|+|c|}{|b|} \tau Q(b) \frac{z^{|b|} z^{|c|}}{(|b|+|c|)!} && \text{Relabelling!} \\
 &= \sum_{\substack{b \in \mathcal{B} \\ c \in \mathcal{C}}} \tau Q(b) \frac{z^{|b|}}{|b|!} \frac{z^{|c|}}{|c|!}.
 \end{aligned}$$

Exercise

$$\ell \in \text{Sequence}(\mathcal{A}) \mapsto \text{for } f \in \ell \text{ do } Q(f) \text{ od} \implies \tau P(z) = \frac{\tau Q(z)}{(1-A(z))^2}.$$

Example: formal differentiation

Input: $\mathcal{E} = 0|1|x|\text{Prod}(+, \mathcal{E}, \mathcal{E})|\text{Prod}(\times, \mathcal{E}, \mathcal{E})|\text{Prod}(\text{exp}, \mathcal{E})$.

Cost: size of result

casetype	e of	$\tau P(z) =$
	0 :0;	z
	1 :0;	$+ z$
	x :1;	$+ z$
	$u + v :u' + v'$;	$+ 2zE(z)\tau P(z)$
	$u \times v :u'v + uv'$;	$+ 2zE(z)zE'(z) + 3zE^2(z)$ <i>copy</i>
	$\text{exp}(u) : \text{exp}(u) \times u'$.	$+ 2zE(z) + z\tau P(z) + z^2E'(z)$

Average cost: $\frac{[z^n]\tau P(z)}{[z^n]E(z)}$.

Attribute Grammars

Grammar & functions over objects it defines.

[Knuth68; Delest, Fédou, Dutour (94–98)]

Construction	attribute defn	meaning
$C = \text{Union}(A, B)$	$F(C) = c + \text{Union}(\sum F_i(A), \sum F_j(B))$	if
$C = \text{Prod}(A, B)$	$F(C) = c + \sum F_i(A) + \sum F_j(B)$	records
$C = \Phi(A)$	$F(C) = c + \text{it}(\sum F_i(A))$	iteration

$\Phi \in \{\text{Sequence, Set, Cycle}\}.$

Generalizes Λ^{Ω} [Mishna03]

Attributes

Example

Number of cycles in a permutation

$$P = \text{Set}(\text{Cycle}(Z))$$

$$\text{cycle}(P) = \text{it}(1)$$

Area under Dyck paths

$$P = \text{Sequence}(M)$$

$$\text{area}(P) = \text{it}(\text{area}(M))$$

$$M = \text{Prod}(U, P, D)$$

$$\text{area}(M) = \text{area}(P) + \text{size}(P) + 1$$

Path Length in Binary Mappings

$$M = \text{Set}(\text{Cycle}(\text{Prod}(Z, B)))$$

$$\text{pl}(M) = \text{it}(\text{it}(\text{pl}(B)))$$

$$B = \text{Prod}(Z, \text{Set}(B, \text{card} = \{0, 2\}))$$

$$\text{pl}(B) = \text{it}(\text{size}(B) + \text{pl}(B))$$

Attributes and Multivariate Generating Functions

$$C(z_1, z_2, \dots, z_k) = \sum_{c \in \mathcal{C}} \frac{z_1^{|c|}}{(|c|!)} z_2^{F_2(c)} \dots z_k^{F_k(c)}$$

Average value of attribute F_i :

$$\frac{[z_1^n] \left. \frac{\partial C}{\partial z_i} \right|_{z_i=1}}{[z_1^n] C(z_1, 1, \dots, 1)}$$

Also **higher moments**.

Theorem (FeDu98, Mishna03)

“Decorated” translation rules give equations for multivariate generating functions.

See ?combstruct, agfeqns

Example: Path Length in Binary Trees

$$B(z, u) := \sum_{b \in B} z^{|b|} u^{\text{pl}(b)}.$$

Combinatorial description:

$$B = \text{Prod}(Z, \text{Set}(B, \text{card} = \{0, 2\})) \quad \text{pl}(B) = \text{it}(\text{size}(B) + \text{pl}(B))$$

$$\begin{aligned} B(z, u) &= z^1 u^0 \left(1 + \frac{1}{2} \sum_{(\ell, r) \in B \times B} z^{|\ell|} u^{|\ell| + \text{pl}(\ell)} z^{|r|} u^{|r| + \text{pl}(r)} \right) \\ &= z \left(1 + \frac{1}{2} B^2(zu, u) \right). \end{aligned}$$

More Examples

Number of cycles in a permutation

$$P = \text{Set}(\text{Cycle}(Z)) \quad \text{cycle}(P) = \text{it}(1)$$

$$P(z, u) = \exp(u \log \frac{1}{1-z})$$

Area of Dyck paths

$$P = \text{Sequence}(M) \quad \text{area}(P) = \text{it}(\text{area}(M))$$

$$P(z, u) = \frac{1}{1-M(z, u)}$$

$$M = \text{Prod}(U, P, D) \quad \text{area}(M) = \text{area}(P) + \text{size}(P) + 1$$

$$M(z, u) = z^2 u P(zu, u)$$

Path Length in Binary Mappings

$$M = \text{Set}(\text{Cycle}(\text{Prod}(Z, B)))$$

$$\text{pl}(M) = \text{it}(\text{it}(\text{pl}(B)))$$

$$M(z, u) = \frac{1}{1-zB(zu, u)}$$

$$B = \text{Prod}(Z, \text{Set}(B, \text{card}=\{0, 2\}))$$

$$\text{pl}(B) = \text{it}(\text{size}(B) + \text{pl}(B))$$

$$B(z, u) = z + \frac{z}{2} B^2(zu, u)$$

Path Length in Binary Mappings

Starting from the functional equations:

$$M(z, u) = \frac{1}{1 - zB(zu, u)}, \quad (1)$$

$$B(z, u) = z + \frac{z}{2}B^2(zu, u), \quad (2)$$

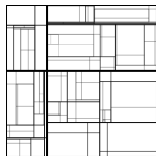
we want $M(z, 1)$, $\frac{\partial M}{\partial u}(z, 1)$.

From (2), we get $B(z, 1) = z + \frac{z}{2}B^2(z, 1)$ and a **linear** system:

$$\begin{aligned} \frac{\partial B}{\partial z}(z, 1) &= 1 + \frac{1}{2}B^2(z, 1) + B(z, 1)\frac{\partial B}{\partial z}(z, 1), \\ \frac{\partial B}{\partial u}(z, 1) &= zB(z, 1) \left(z\frac{\partial B}{\partial z}(z, 1) + \frac{\partial B}{\partial z}(z, 1) \right), \end{aligned}$$

whence the result. Similarly for higher moments.

Pathlength in Quadrees



Filling rate of the pages?

Model: points distributed uniformly at random in $(0, 1)^d$.

Translation in generating series:

$$\left(z(1-z) \frac{d}{dz} \right)^d \left(f(z) - \frac{1}{(1-z)^2} \right) - 2^d f(z) = 0.$$

Analysis:

1. Singularity at $z = 1$, local behaviour

$$f = \frac{2}{d} \frac{1}{(1-z)^2} \log \frac{1}{1-z} + \frac{c}{(1-z)^2} + \dots$$

2. Translation: $f_n = \frac{2}{d} n \log n + \mu_d n + O(\log n + n^{-1+2 \cos(2\pi/d)}).$

[FIGoPuRo91, FILaLaSa95]

Greene's Box Operator (I)

Labelled universe: $\mathcal{A} = \mathcal{B}^{\square} \times \mathcal{C}$

The smallest label goes in \mathcal{C}

Generating functions: $A(z) = \int_0^z B'(t)C(t) dt.$

Proof.

$$\begin{aligned}
 A(z) &= \sum_{(b,c) \in \mathcal{B} \times \mathcal{C}} \frac{z^{|b|+|c|}}{(|b|+|c|)!} \\
 &= \sum_{\substack{b \in \mathcal{B} \\ c \in \mathcal{C}}} \binom{|b|+|c|-1}{|c|} \frac{z^{|b|} z^{|c|}}{(|b|+|c|)!} = \sum_{\substack{b \in \mathcal{B} \\ c \in \mathcal{C}}} \frac{|b|}{|b|+|c|} \frac{z^{|b|}}{|b|!} \frac{z^{|c|}}{|c|!}.
 \end{aligned}$$

□

Greene's Box Operator (II)

Example

Increasing trees ($B = z^{\square} \times B \times B$). Automatic analysis of Quicksort, Quickselect.

More generally, partial orders over labels [Greene83].

Extends to Sequence, Set, Cycle

Extends to attributes [Mishna03].

Differential equations of combinatorial origin

D-finite Series

Definition

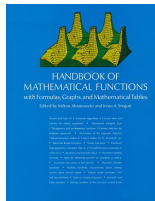
A power series $y(z)$ is **differentially finite** (D-finite) if there exist polynomials $a_i \in \mathbb{Q}[z]$ such that

$$a_k(z)y^{(k)}(z) + \cdots + a_0(z)y(z) = 0. \quad (\text{E})$$

Equivalent definition: $y(z), y'(z), y''(z), \dots$ span a finite-dimensional vector space over $\mathbb{Q}(z)$.

Examples of functions: exp, log, sin, cos, sinh, cosh, arccos, arccosh, arcsin, arcsinh, arctan, arctanh, arccot, arccoth, arccsc, arccsch, arcsec, arcsech, ${}_pF_q$ (includes Bessel J, Y, I and K , Airy Ai and Bi and polylogarithms), Struve, Weber and Anger fcn, the large class of **algebraic functions**, ...

About 60% of Abramowitz & Stegun.



Coefficients \leftrightarrow Series

Theorem

A series is D-finite if and only if its sequence of coefficients satisfies a linear recurrence.

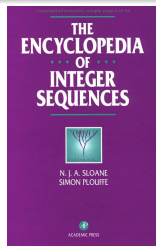
Proof. [sketch] $zD_z \leftrightarrow n$, $z^{-1} \leftrightarrow S_n$.

Corollary

- ① N first coefficients in complexity $O(N)$;
- ② N th coefficient in complexity $O_{\log}(N^{1/2})$ [ChCh90].

Examples of sequences: rational sequences, hypergeometric sequences (includes $n!$, multinomials, . . .), classical orthogonal polynomials.

About 25% of Sloane & Plouffe.



Examples

Ex. 1. From an algorithm in number theory
*k*th coefficient of $P(x)^n$ (*k* and *n* large)

Computation (given *n* and *k*):

- ① 1st order LDE;
- ② linear recurrence of order $\deg P$ satisfied by coefficients;
- ③ fast evaluation.

Ex. 2. Related to a complexity analysis of Gröbner bases

Computation of $P_n(x)$ defined by

$$\sum_{n \geq 0} P_n(x) \frac{z^n}{n!} = \left(\frac{1+z}{1+z^2} \right)^x.$$

Computation (given *n* and *x*):

- ① Same as above!
- ② fast evaluation (without computing the polynomials).

Closure Properties

Theorem

- 1 The set of D -finite series in $\mathbb{Q}[[z]]$ forms a sub-*algebra* of $\mathbb{Q}[[z]]$.
- 2 The set of D -finite series is closed under *Hadamard product*.
- 3 The set of D -finite series is closed under formal Laplace & Borel transforms (*ogf* \leftrightarrow *egf*).

Proof.

linear algebra! □

Mehler Identity for Hermite Polynomials

```
> L:= [seq(orthopoly[H](n,x),n=0..5)];
```

```
L := [1, 2x, 4x2-2, 8x3-12x, 16x4-48x2+12, 32x5-160x3+120x]
```

```
> gfun[listtodiffeq](L,u(z));
```

$$[\{u(0) = 1, \frac{d}{dz}u(z) + (2z - 2x)u(z)\}, \text{egf}]$$

```
> deq:= %[1]:hadamardproduct(deq,subs(x=y,deq),u(z)):
```

```
> Laplace(deq,u(z),'diffeq');
```

$$\{u(0) = 1, (16z^4 - 8z^2 + 1) \frac{d}{dz}u(z) + (16z^3 - 16z^2xy + 8zy^2 - 4z + 8zx^2 - 4xy)\}$$

```
> dsolve(%,u(z));
```

$$u(z) = \frac{\exp\left(\frac{4z(xy - z(x^2 + y^2))}{1 - 4z^2}\right)}{\sqrt{1 - 4z^2}}$$

Algebraic Series

Theorem (Tannery 1874)

- 1 *Algebraic* power series are *D-finite*.
- 2 If f is *D-finite* and g is algebraic, $f \circ g$ is *D-finite*.

Proof.

Bézout identity! □

Motzkin Numbers (Unary-Binary Trees)

$$M(z) - (1 + zM(z) + zM(z)^2) =: P(M) = 0.$$

$$\text{Bézout: } AP + BP_M = 1 \Rightarrow M' = -BP_z \text{ mod } P =: cM + d1.$$

Vector space of dimension 2

> gfun[algeqtodiffeq](M=1+z*M+z*M^2,M(z));

$$-1 - z + (-3z + 1)M(z) + (z - 6z^2 + z^3) \frac{d}{dz}M(z)$$

> gfun[diffeqtorec](%,M(z),u(n));

$$\{nu(n) + (-9 - 6n)u(1 + n) + (3 + n)u(n + 2), u(0) = 1, u(1) = 2\}$$

→ fast computation.

Works for arbitrary degree.

Forests of Catalan Trees

$$Y(z) = \exp\left(\frac{1 - \sqrt{1 - 4z}}{2}\right).$$

Same computation \rightarrow

$$\{(n+2)(n+1)u(n+2) = u(n) + 2(n+1)(2n+1)u(n+1), \\ u(0) = 1, u(1) = 1\}$$

III Asymptotics

Automated Examples

- Conway's sequence: 1, 11, 21, 1211, 111221, 312211,...

$$\ell_n \simeq 2.042160077\rho^n, \quad \rho \simeq 1.3035772690343$$

ρ root of a polynomial of degree 71.

- Catalan numbers (binary trees): 1, 1, 2, 5, 14, 42, 132,...

$$B_n \sim \frac{1}{\sqrt{\pi}} \frac{4^n}{n^{3/2}}$$

- Cayley trees: 1, 2, 9, 64, 625, 7776, 117649, 2097152,...

$$\frac{T_n}{n!} \sim \frac{e^n}{\sqrt{2\pi n^{3/2}}}$$

- Bell numbers (set partitions): 1, 1, 2, 5, 15, 52, 203,...

$$\log \frac{B_n}{n!} \sim -n \log \log n$$

Starting point: generating function

Cauchy's Formula

$$[z^n]f(z) = \frac{1}{2i\pi} \oint \frac{f(z)}{z^{n+1}} dz$$

$$[z^2] \frac{z}{e^z - 1} = \frac{1}{12}$$



Singularity Analysis

Cauchy's formula: $[z^n]f(z) = \frac{1}{2i\pi} \oint \frac{f(z)}{z^{n+1}} dz$

Singularity of smallest modulus \rightarrow exponential growth

Local behaviour \rightarrow sub-exponential terms

Under mild conditions [FI04]

$$f(z) = g(z) + O(h(z)), \quad z \rightarrow \rho \Rightarrow [z^n]f(z) = [z^n]g(z) + O([z^n]h(z)),$$

A simple asymptotic scale translates

$$[z^n]\left(1 - \frac{z}{\rho}\right)^\alpha \log^\beta \frac{1}{1 - z/\rho} \sim \rho^{-n} \frac{n^{-\alpha-1}}{\Gamma(-\alpha)} \log^\beta n, \quad \alpha \notin \mathbb{N}.$$

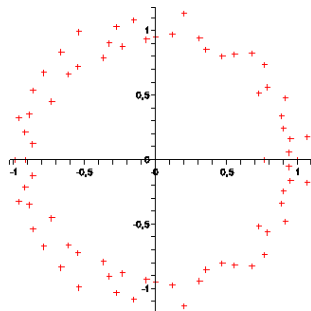
Method:

1. Find dominant sing. **Symbolic-Numeric**
2. Expand locally. **Symbolic Asymptotics**
3. If algebraico-logarithmic, translate.

Locating Dominant Singularities

Rational series: resultants, algebraic/numerical separation of roots by moduli [GoSa96];

Algebraic series: selection of branches, connexion problem (solution: semi-numerical separation of roots plus bounds on remainders of Puiseux expansions) [ChFISa01];

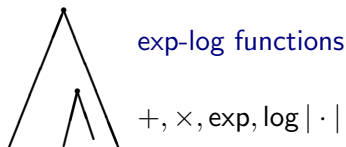


Th. [Pringsheim] Positive Taylor coefficients \Rightarrow one **real positive** dominant singularity.

Implicit functions: reduce to polynomial solving.

More general: heuristically reduce to solving. **Undecidability issues.**

Asymptotic Expansion



Problem: indefinite cancellation.

$$e^{1/x+e^{-x}} - e^{1/x} = 1 + \frac{1}{x} + \dots - (1 + \frac{1}{x} + \dots) = O(x^{-K}).$$

Algorithm [RiSaShvdH96]:

- ① Build a tower of diff. fields $\mathbb{R}(x) \subset \dots \subset \mathbb{R}(t_1, \dots, t_n)$ s.t. t_1, \dots, t_n is the “right” asymptotic scale;
- ② Express fcn in t_1, \dots, t_n ;
- ③ Expand w.r.t. t_n and recurse.

Rely on **zero-equivalence** tests.

Algorithm (by induction)

$$l_k(x) = t_1 \prec \cdots \prec t_n$$

$$f \mapsto \sum_{\alpha \in S} \underbrace{c_\alpha(t_1, \dots, t_{n-1})}_{\neq 0} t_n^\alpha.$$

Elementary functions (Sum, product, $\exp(f)$ with $f \rightarrow 0, \dots$).

Equality-check between function and truncatures of its expansion.

Logarithm $f \sim Ct_1^{\alpha_1} \cdots t_n^{\alpha_n} (=: f_0)$.

If $\alpha_1 = 0$,

$$\log |f| = \log |C| + \sum \alpha_i \underbrace{\log |t_i|}_{\in \mathbb{R}[[t_1, \dots, t_n]]} + \log \left(1 - \underbrace{\frac{f - f_0}{f_0}}_{\rightarrow 0} \right);$$

otherwise, add $t_0 = \log t_1$ to the scale first.

Algorithm II

Exponential $f \rightarrow \infty$. Check whether

$$f \sim \alpha \log t_i, \quad i > 1, \alpha \in \mathbb{R} \setminus \{0\}.$$

If so, $\exp(f) = t_i^\alpha \exp(f - \alpha \log t_i)$ and recurse.
Otherwise, insert $\exp(f)$ in the scale.

Theorem (RiSaShvdH96)

It always works!

Example

$$f = \log \log(xe^{xe^x} + 1) - \exp \exp(\log \log x + \frac{1}{x}), \quad x \rightarrow \infty$$

Example

$$f = \log \log(xe^{xe^x} + 1) - \exp \exp(\log \log x + \frac{1}{x}), \quad x \rightarrow \infty$$

Scale $\{\log \log x, \log x, x, e^x, \exp(xe^x)\}$, i.e.,

$$f = \sum_{i \in \mathbb{N}} c_i (\log \log x, \log x, x, e^x) e^{-\alpha_i x e^x},$$

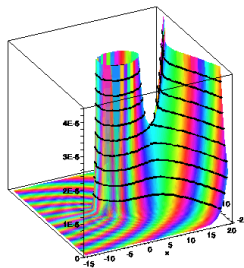
each (α_i, c_i) can be computed explicitly and expanded recursively.
For instance, $\alpha_0 = 0, \dots$

$$\longrightarrow f \sim -\frac{\log^2 x}{2x}.$$

Saddle-Point Method

(Functions with fast singular growth)

$$[z^n]f(z) = \frac{1}{2i\pi} \oint \underbrace{\frac{f(z)}{z^{n+1}}}_{=: \exp(h(z))} dz$$



Saddle-point equation $h'(R_n) = 0$ i.e. $R_n \frac{f'(R_n)}{f(R_n)} - 1 = n$

Change of variables $h(z) = h(\rho) - u^2$

Termwise integration

$$f_n \approx \frac{f(R_n)}{R_n^{n+1} \sqrt{2\pi h''(R_n)}}$$

Sufficient conditions: Hayman (1st order), Harris & Schoenfeld, Odlyzko & Richmond, Wyman

Hayman admissibility

A set of analytic conditions and **easy-to-use sufficient conditions**.

Hyp. f, g admissible, P polynomial

- ① $\exp(f)$, fg and $f + P$ admissible.
- ② $\text{lc}(P) > 0 \Rightarrow fP$ and $P(f)$ admissible.
- ③ if e^P has ultimately positive coefficients, it is admissible.

Examples: Stirling's formula ($\exp(z)$), involutions ($\exp(z + z^2/2)$), set partitions ($\exp(\exp(z) - 1)$), ...

Example: Parts in a Partition

$$F(z, u) = e^{u(e^z-1)} = \sum S_{n,k} u^k \frac{z^n}{n!}$$

Stirling numbers of the 2nd kind

$u = 1 \rightarrow$ Bell numbers

Saddle-point: $Re^R - 1 = n$

$$\text{Result: } \frac{B_n}{n!} = \frac{e^{e^R-1} e^{-R}}{R^{n+1/2} \sqrt{2\pi(1+Re^{-R})}} (1 + \dots)$$

$\frac{\partial}{\partial u} \Big|_{u=1} \rightarrow \sum_k k S_{n,k}$

Saddle-point: $R_1 e^{R_1} - 1 + \frac{R_1}{1-e^{-R_1}} = n$

$$\text{Result: } \frac{\sum k S_{n,k}}{n!} = \text{BIG}(R_1, n) (1 + \dots)$$

Ratio: expected number of parts in a partition of size n

Variance: $\frac{\partial^2}{\partial u^2} \Big|_{u=1} \dots$ (even worse)

Problems

Expansion of the saddle-point (automation?)

$$R = \log n - \log \log n + \frac{\log \log n}{\log n} + \frac{\log \log n (\log \log n - 2)}{2 \log^2 n} + \dots$$

Substitution in the estimate (use?)

$$\frac{B_n}{n!} = \exp \left(-n \log \log n + n \frac{\log \log n + 1}{\log n} + n \frac{(\log \log n)^2}{2 \log^2 n} + \dots \right)$$

Indefinite cancellation

$$R_1 = \log n - \log \log n + \frac{\log \log n}{\log n} + \frac{\log \log n (\log \log n - 2)}{2 \log^2 n} + \dots$$

$R_1 - R = ?$, $e^{e^{R_1}} / e^{e^R} \sim ?$, average number of parts? variance?

Asymptotic Inversion [SaSh97]

Complete algorithm for asymptotic inverses of exp-log functions.

Application:

$$\mu_n = \frac{n}{\log n} \left(1 + \frac{\log \log n}{\log n} + \frac{\log \log^2 n - \log \log n}{\log^2 n} + \dots \right)$$

$$\sigma_n = \frac{n}{\log^2 n} \left(1 + \frac{2 \log \log n - 1}{\log n} + \dots \right)$$

Also, higher towers of exponentials.

IV Conclusion

Next Steps

- More automatic asymptotic analysis of **functional** equations;
- Automatic derivation of **distributions** ;
- Automatic handling of **Pólya**'s operators;
- Computational **preprocessing** of algorithms into attribute grammars;
- Speed!
- ...