

# Algebraic Analytic Asymptotics

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The Seventh Seminar on Analysis of Algorithms

⇒ For COMBINATORIAL APPLICATIONS:

- ALGEBRAIC FUNCTIONS

$$P(z, Y) = 0$$

- ASYMPTOTICS OF COEFFICIENTS

$$\text{coeff. } [z^n]Y(z) \stackrel{?}{\approx} CA^n n^{p/q}$$

- by ANALYTIC METHODS, i.e., SINGULARITIES

Based on Fl-Sedgewick, 01/2001,

<http://algo.inria.fr/flajolet/Publications>

& B. Salvy, C. Chabaud.

**I. Algebraic functions:** what they are.

**II. Algebraic models of combinatorics:**

- Context-free languages and specifications
- Trees
- Walks and kernel method
- Maps and quadratic method
- ...

**III. Coefficient asymptotics** is essentially decidable!

- General algebraic functions
- Positive case
- Special systems: **Drmotá-Lalley-Woods'** Theorem

**IV. Applications**

# I. Algebraic functions

What are they?

Two equivalent definitions:

- As solutions over  $\mathbb{C}$  of

$$P(z, Y) = 0$$

= an *algebraic curve*.

- As components of systems of equations

$$y_1 : \begin{cases} y_1 = \Phi_1(z; y_1, \dots, y_r) \\ \vdots \\ y_r = \Phi_r(z; y_1, \dots, y_r) \end{cases}$$

= projection of an *algebraic variety*.

Theorem. Elimination is always possible:

$$\text{equation} \Leftrightarrow \text{system}$$

Proofs: Nonconstructive: Ideals;

Constructive: Resultants;

Constructive': Groebner bases.

Consider an algebraic curve

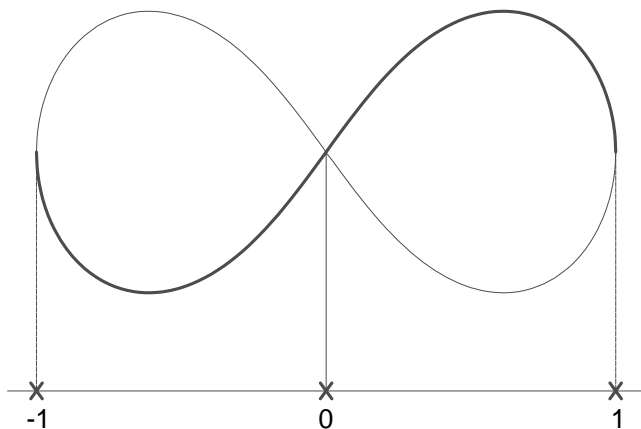
$$P(z, y) = 0$$

with  $d := \deg_y P(z, y)$ .

There are “usually”  $d$  distinct roots (finitely many exceptions) that organize themselves into **branches** of an analytic function (by Implicit Functions).

Exceptional points are **multiple points** and **branch points**.

Lemniscate:  $(z^2 + y^2)^2 - (z^2 - y^2) = 0$ .



EXAMPLE. The Catalan curve

$$\mathcal{B} = [] + \{\odot\} \times \mathcal{B} \times \mathcal{B}$$

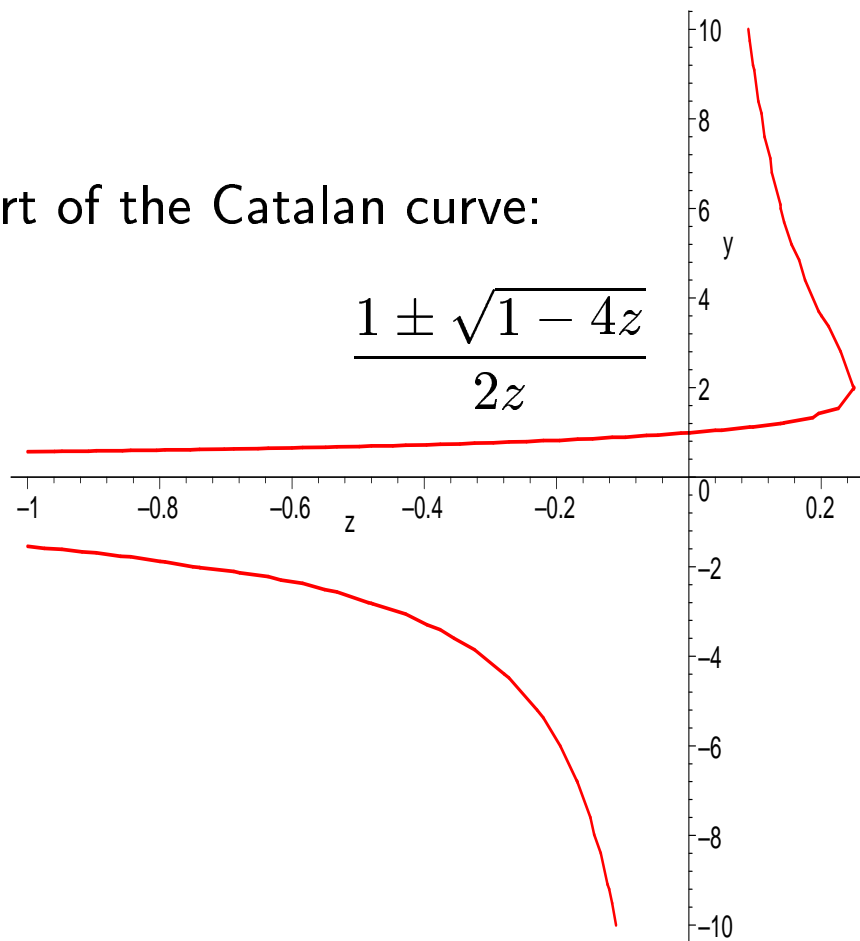
$$B(z) = 1 + zB(z)^2$$

The two branches over the reals are

$$Y_1 = \frac{1 - \sqrt{1 - 4z}}{2z}, \quad Y_2 = \frac{1 + \sqrt{1 - 4z}}{2z}$$

And  $B(z)$  coincides with  $Y_1$  near 0.

Real part of the Catalan curve:



Combinatorics dictates **initial conditions**

$$B(z) = 1 + 1z + 2z^2 + 5z^3 + 14z^4 + \dots$$

**CONNECTION PROBLEM:**

Which branch to choose?

Where does it lead to?

## II. Algebraic Models of Combinatorics

- context-free languages and specifications
- trees
- walks, excursions, . . .
- maps



## The SYMBOLIC DICTIONARY

From constructions to equations over GF's

<i>Combinatorial construction</i>	Generating Functions
$A = B + C$	$A(z) = B(z) + C(z)$
$A = B \times C$	$A(z) = B(z) \cdot C(z)$
$A = \text{Seq } B$	$A(z) = \frac{1}{1 - C(z)}$

Seq is definable rec.:  $A = 1 + A \times C$ .

Definition. A context-free specification involves unions and products only, possibly in recursive fashion.

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E.g. Catalan domain: Bin Trees, Gen Trees, Triangulations

In general defines a family of tree-like objects  
= Trees with various types of nodes.

Definition. A context-free language is the set of *words* obtained as leaf labels in preorder traversal.

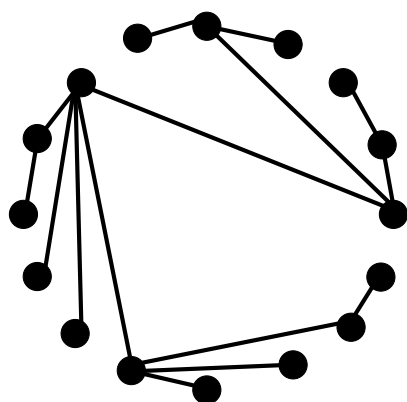
Unambiguous: unique reconstruction: word  $\leadsto$  tree.

Dyck paths, tree codes, parenthesis systems, generalized Dyck paths and walks (Banderier,...)

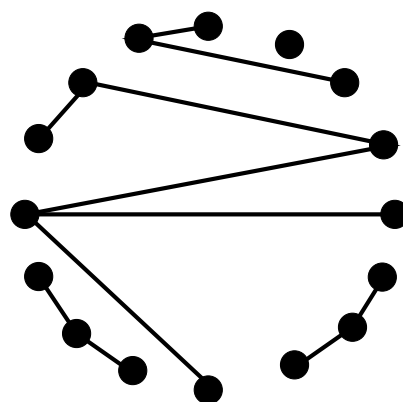
Theorem. The OGF of a context-free class or an unambiguous context-free language is an algebraic function.

A system of polynomials equations is obtained by the symbolic dictionary.

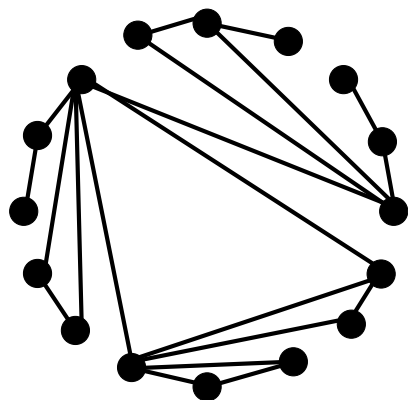
EXAMPLE. **Noncrossing graphs** [F.Noy, Disc. Math'99]



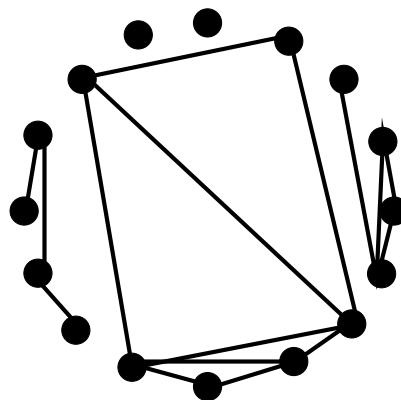
(tree)



(forest)



(connected graph)



(graph)

Configuration / OGF	Coefficients (exact / asymptotic)
<p>Trees (<i>EIS</i>: <b>A001764</b>)</p> $T^3 - zT + z^2 = 0$	$z + z^2 + 3z^3 + 12z^4 + 55z^5 + \dots$ $\frac{1}{2n-1} \binom{3n-3}{n-1}$ $\sim \frac{\sqrt{3}}{27\sqrt{\pi n^3}} \left(\frac{27}{4}\right)^n$
<p>Forests (<i>EIS</i>: <b>A054727</b>)</p> $F^3 + (z^2 - z - 3)F^2 + (z + 3)F - 1 = 0$	$1 + z + 2z^2 + 7z^3 + 33z^4 + 181z^5 + \dots$ $\sum_{j=1}^n \frac{1}{2n-j} \binom{n}{j-1} \binom{3n-2j-1}{n-j}$ $\sim \frac{0.07465}{\sqrt{\pi n^3}} (8.22469)^n$
<p>Connected graphs (<i>EIS</i>: <b>A007297</b>)</p> $C^3 + C^2 - 3zC + 2z^2 = 0$	$z + z^2 + 4z^3 + 23z^4 + 156z^5 + \dots$ $\frac{1}{n-1} \sum_{j=n-1}^{2n-3} \binom{3n-3}{n+j} \binom{j-1}{j-n+1}$ $\sim \frac{2\sqrt{6} - 3\sqrt{2}}{18\sqrt{\pi n^3}} (6\sqrt{3})^n$
<p>Graphs (<i>EIS</i>: <b>A054726</b>)</p> $G^2 + (2z^2 - 3z - 2)G + 3z + 1 = 0$	$1 + z + 2z^2 + 8z^3 + 48z^4 + 352z^5 + \dots$ $\frac{1}{n} \sum_{j=0}^{n-1} (-1)^j \binom{n}{j} \binom{2n-2-j}{n-1-j} 2^{n-1-j}$ $\sim \frac{\sqrt{140 - 99\sqrt{2}}}{4\sqrt{\pi n^3}} (6 + 4\sqrt{2})^n$

Dyck words: parenthesis systems

$a = '('$ ;  $b = ')'$

a a a b a b b a b b a b

Cf. Stein-Waterman 1979, DNA secondary structures.

$$\mathcal{D} = \varepsilon + \nearrow \underline{\mathcal{D}} \searrow \mathcal{D}$$

## Trees

$\Omega$ : = allowed set of node degrees.

$$\phi(u) := \sum_{\omega \in \Omega} u^\omega$$

$$T(z) = z\phi(T(z))$$

Lagrangean framework for  $T$

$$[z^n]T(z) = \frac{1}{n} [w^{n-1}] \phi(w)^n.$$

$\Omega$  finite  $\implies T$  is algebraic.

**Singularities** give useful information on parameters.

## Walks, bridges, meanders, excursions

[F.Banderier-01]

$\mathcal{S}$  a finite set of allowed  $\pm$  steps

$$P(u) = \sum_{s \in \mathcal{S}} u^s.$$

Characteristic equation is

$$1 - zP(u) = 0.$$

**Theorem.** GF's of W, B, M, E are algebraic. and involve rationally branches of characteristic equation.

Meanders ( $z$ : length;  $u$ : final altitude)

$$F(z, u) = 1 + zP(u)F(z, u) - \{u^{<0}\} \left( zP(u)F(z, u) \right).$$

**Kernel** method solves a functional equations

$$F(z, u) (1 - zP(u)) = \text{Lin. Comb. } [F_0(z), \dots, F_{c-1}(z)]$$

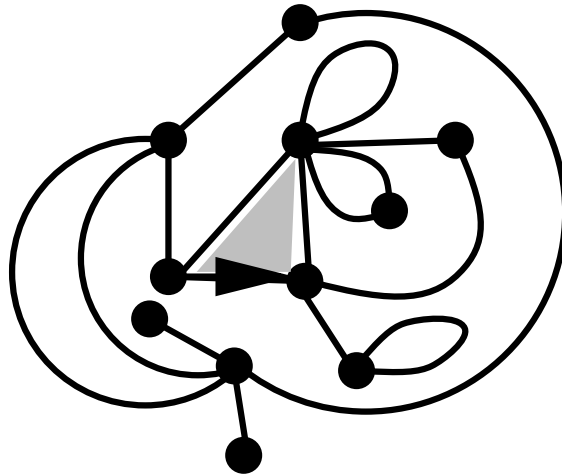
Excursions  $F(z, 0) = E(z)$

$$E(z) = \frac{(-1)^{c-1}}{z} u_1(z)u_2(z) \cdots u_c(z).$$

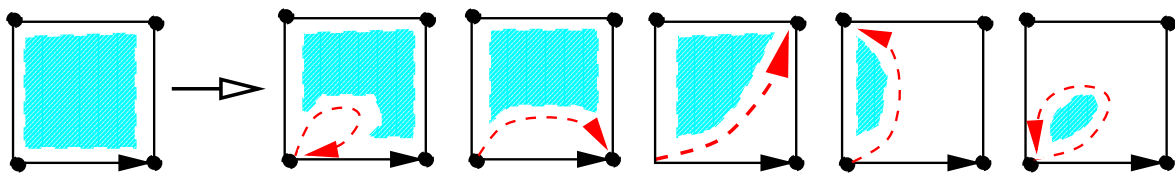
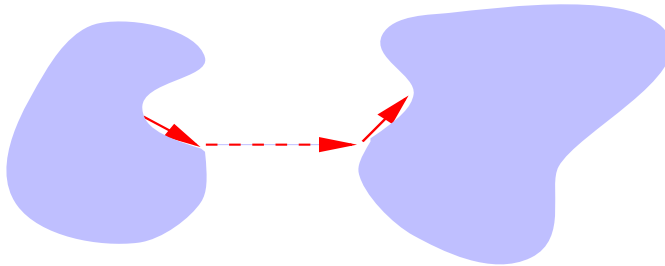
Grammars (Labelle-Yeh) don't give access to such a decomposability.



## Maps



$$M(z, u) = 1 + u^2 z M(z, u)^2 + u z \frac{M(z, 1) - u M(z, u)}{1 - z}.$$



$$u^4 \mapsto zu^5 + zu^4 + zu^3 + zu^2 + zu^1.$$

Tutte's Quadratic method gives algebraic functions

Cf Schaeffer, ...

# III. Coefficient Asymptotics

is decidable!

- Local analysis of singularities
- Global connections
  - General case
  - Positive functions

Special systems: positivity + irreducibility, DLW Thm

# Singularities

Darboux-Pólya method  $\rightsquigarrow$  singularity analysis [FI0d90]

A **DICTIONARY**

$$Y(z) \sim C \cdot \left(1 - \frac{z}{\rho}\right)^{-\alpha} \implies Y_n \sim \frac{C}{\Gamma(\alpha)} \rho^{-n} n^{\alpha-1}.$$

(under “Camembert” conditions).

*Coefficient extraction and asymptotic approximation commute!*

$$([z^n] \approx \sigma(z)) \approx ([z^n] \sigma(z)).$$

Asymptotic singular scale of functions  
 $\implies$  Asymptotic scale of coefficients

## Coefficients asymptotics —The problems

~> locate relevant singularities

~> determine exponents

Connection problem is intrinsic for algebraic functions.

## Local analysis

$$P(z, y) = 0, \quad \deg_y(P) = d.$$

- **Regular point**: all roots are distinct; each is locally continuable into an **analytic function element**.
- **Exceptional point**: two or more roots coincide
  - **Multiple point**: nothing happens, two<sup>+</sup> branches meet, but each is analytic; cf lemniscate
  - **Singularity**: cannot distinguish determinations that are analytic.

At any rate: exceptional points correspond to the presence of multiple roots, hence they solve:  $P = 0, P'_y = 0$ , e.g.,

$$\text{Resultant}_y \left( P(z, y), \frac{\partial}{\partial y} P(z, y); y \right) = 0$$

Includes **reduction in degree**:  $p_d(z) = 0$

## Ternary trees

```
> P:=T-1-z*T^3;
```

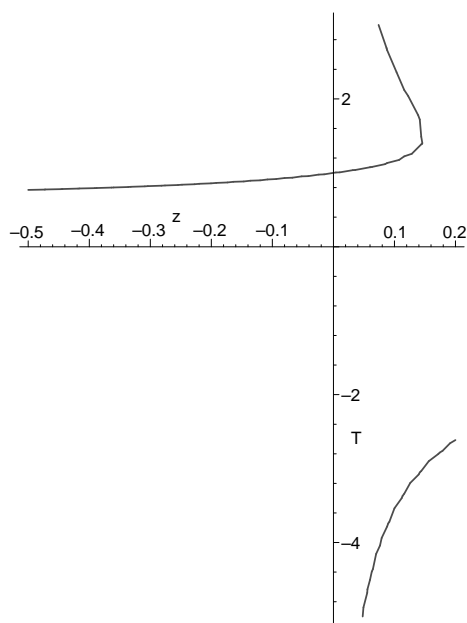
$$P := T - 1 - z T^3$$

```
> series(RootOf(P,T),z=0,10);
```

$$1 + z + 3 z^2 + 12 z^3 + 55 z^4 + 273 z^5 + \dots$$

```
> resultant(P,diff(P,T),T);
```

$$-z^2 (27 z - 4)$$



## Newton–Puisseux

At an exceptional point, there should be asymptotic cancellation: with  $Z = z - z_0$  and  $Y = y - y_0$ :

$$\cdots + Z^a Y^b + \cdots + Z^c Y^d + \cdots = 0$$

Try

$$Y \propto Z^{p/q}$$

where

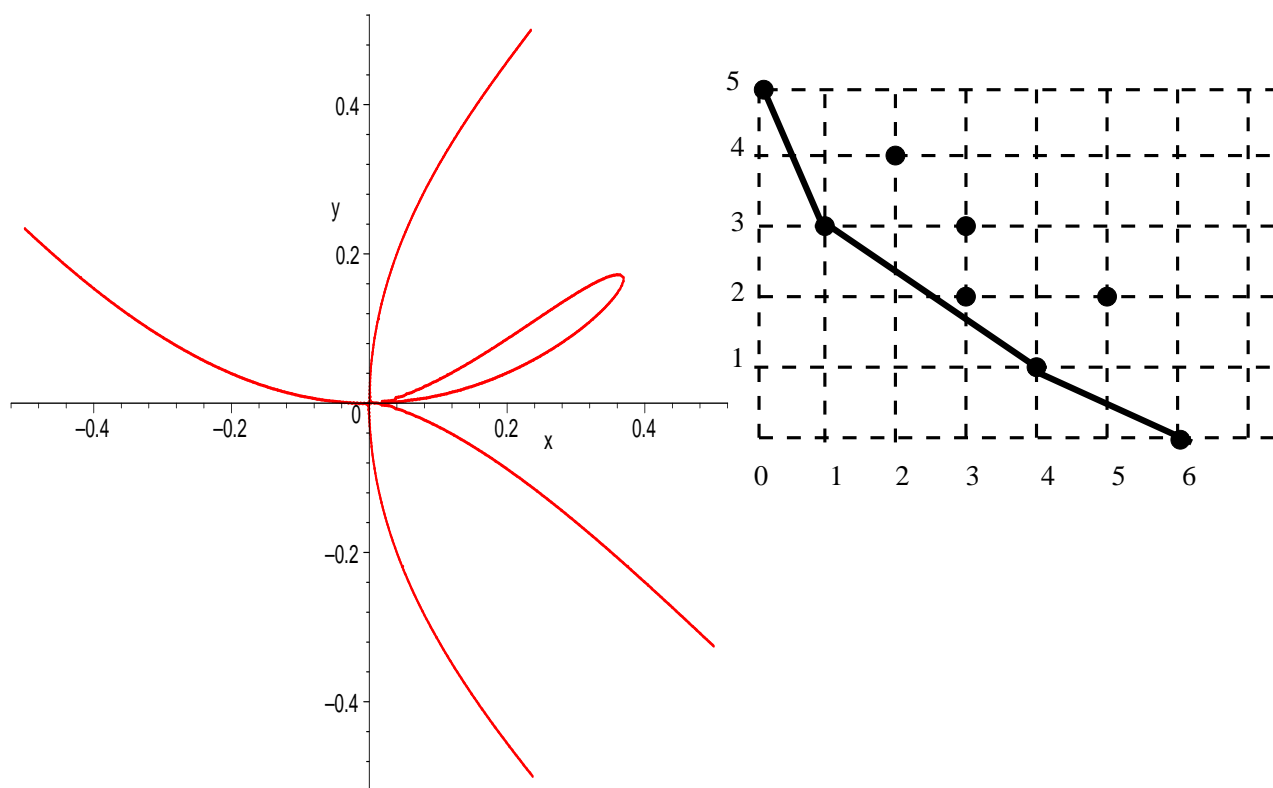
$$\frac{p}{q}a + b = \frac{p}{q}c + d, \quad \frac{p}{q} = \frac{d - b}{a - c}.$$

**Theorem** [Newton-Puisseux] At a singularity solutions group themselves into “cycles” that can be expanded into fractional power series (Puisseux series):

$$y(z) = H((z - z_0)^{1/r}), \quad H(w) = \sum_{j=-m}^{\infty} h_j w^j.$$

Next: Newton diagram

## Newton diagram



The real curve

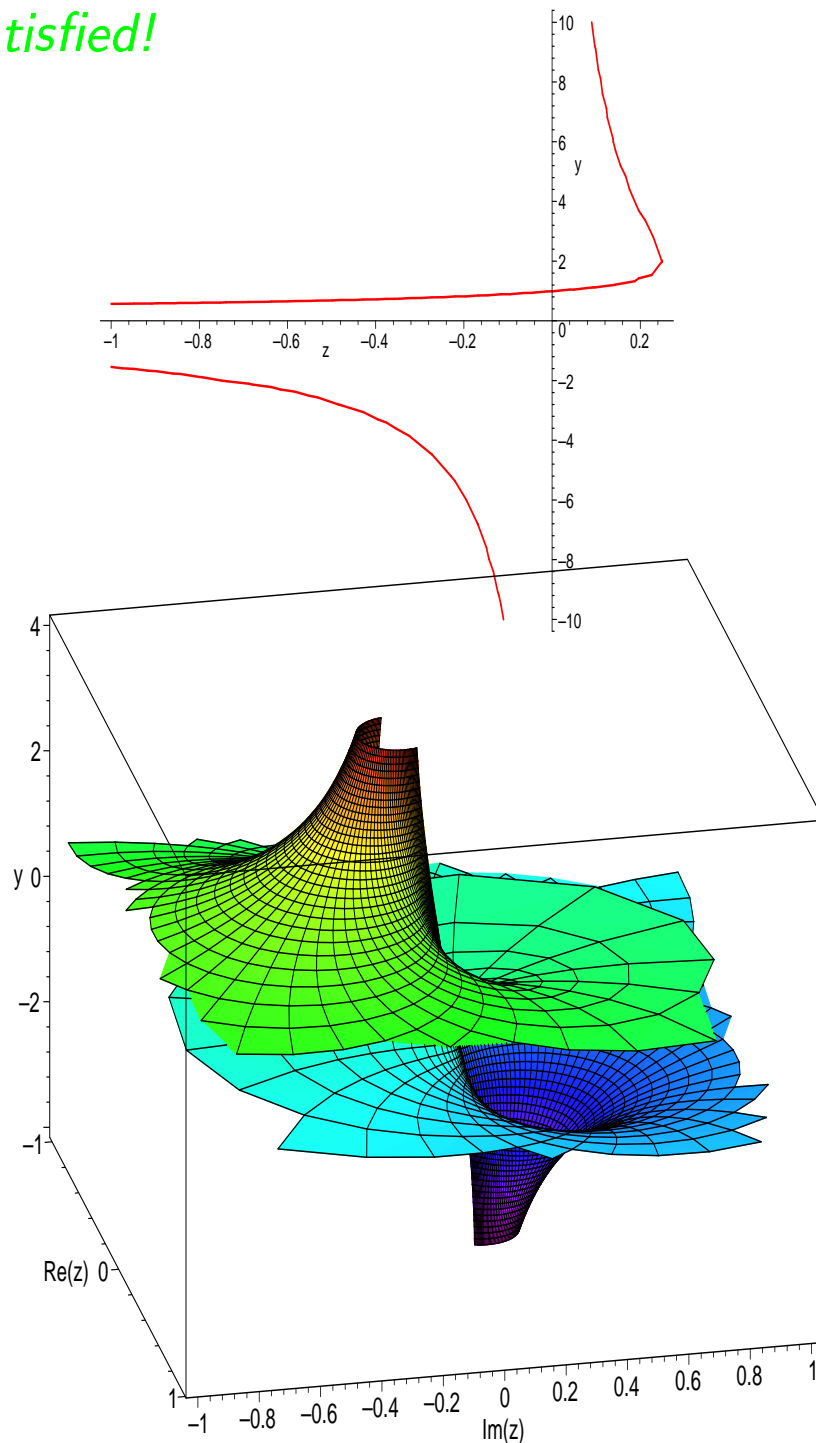
$$P = (y - x^2)(y^2 - x)(y^2 - x^3) - x^3y^3$$

near  $(0,0)$  and its Newton diagram.

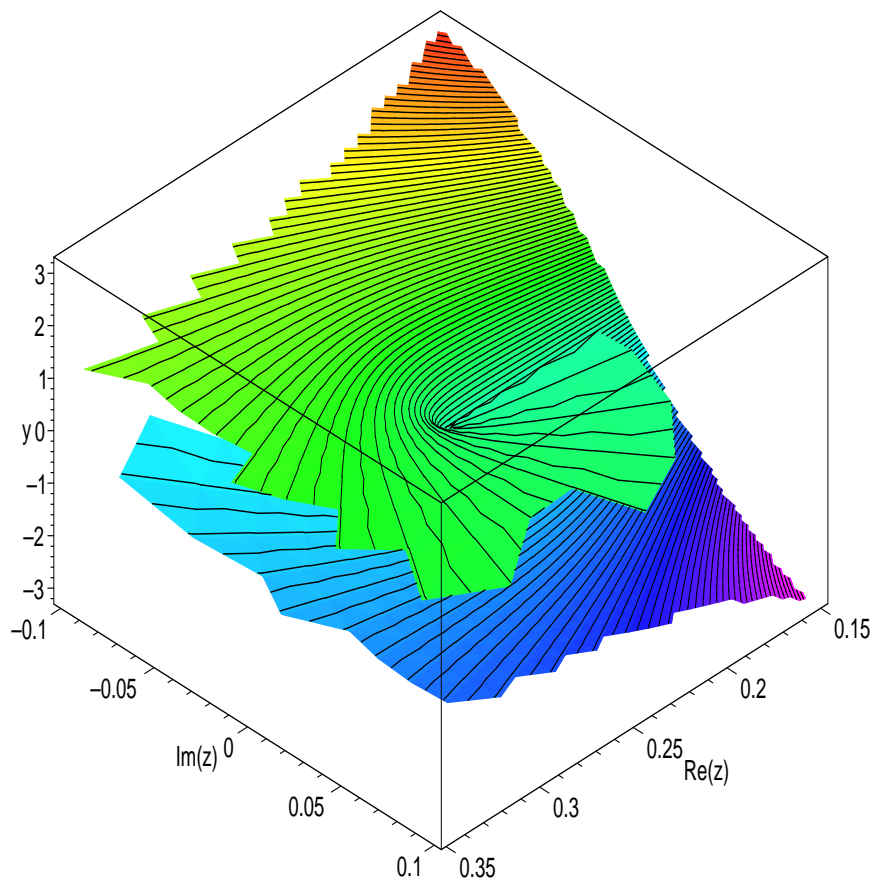


## Analytically

*Conditions of singularity analysis are automatically satisfied!*



The real section of the Catalan curve (top). The complex Catalan curve with a plot of  $\Im(y)$  as a function of  $z = (\Re(z), \Im(z))$ ;



A blowup of  $\Im(y)$  near the branch point at  $z = \frac{1}{4}$ .

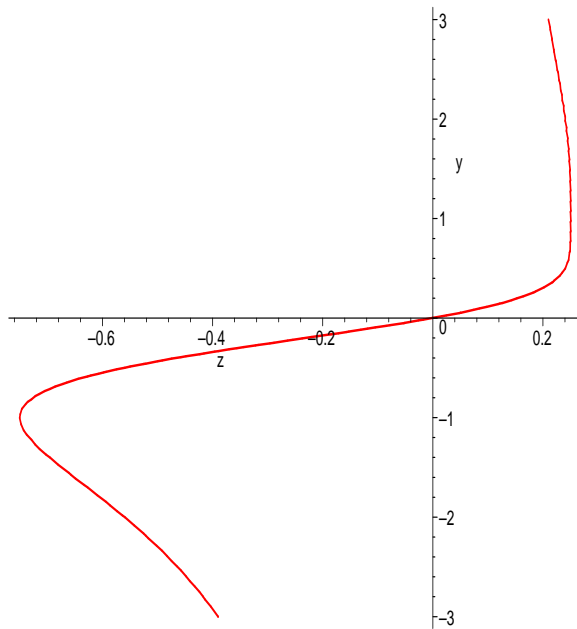
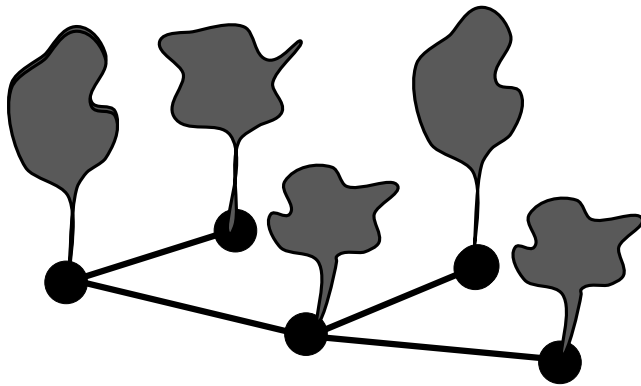
$$y(z) = c_0(1 - z/\sigma)^{p_0/q_0} + c_1(\sigma - z)^{p_1/q_1} + \dots$$

Each singular element translates into

$$\approx \frac{c_0}{\Gamma(-p_0/q_0)} \sigma^{-n} n^{-p_0/q_0-1}$$

EXAMPLE. **Supertrees** (Kemp's multiD trees?)

$$P(z, y) = zy^4 - y^3 + (2z + 1)y^2 - y + z.$$




---

This is “trees on trees”;  $y(z) = z + z^2 + 3z^3 + 8z^4 + \dots$ ;  
 $b(z) = (1 - \sqrt{1 - 4z^2})/2$ ; take  $y(z) := b(zb(z))_{z^2 \mapsto z}$ .

$$P(z, y) = zy^4 - y^3 + (2z + 1)y^2 - y + z.$$

$$\mathcal{R} = z(4z + 3)(4z - 1)^3,$$

The translation  $z = \frac{1}{2} - Z, y = 1 + Y$  transforms  $P$  into

$$\tilde{P}(Z, Y) = \frac{1}{4}Y^4 - ZY^4 - 4ZY^3 - 8ZY^2 - 8ZY - 4Z.$$

$$y(z) = 1 - 2\sqrt[4]{\frac{1}{4} - z} + \dots$$

so that

$$[z^n]y(z) \sim \frac{1}{\sqrt{8}\Gamma(\frac{3}{4})}4^n n^{-5/4},$$

## Coefficients Asymptotics for Algebraic Functions

**Theorem** Let  $f(z)$  be an alg. fun. (branch).

— One dominant singularity at  $\alpha_1$ :

$$f_n \sim \alpha_1^{-n} \left( \sum_{k \geq k_0} d_k n^{-1-k/\kappa} \right),$$

where  $k_0 \in \mathbb{Z}$  and  $\kappa$  is an integer  $\geq 2$ . — Several: a finite linear combination of such plus exponentially smaller error terms.

PROOF. Newton-Puiseux expansion + singularity analysis.

Folklore. E.g. F'87, on "Ambiguity and Transcendence"

QUESTION. How to determine which exceptional points are relevant? *Connection problem!*

Special cases: Trees, Meir and Moon;  $\sqrt{-}$ -sing &c.

Excursions: F-Banderier;  $\sqrt{-}$ -sing

→ General: Decision procedure for equations  
+ modification for positive functions.

→ Semi-general: Positive Irreducible systems.

Drmot-Lalley-Woods' structural theorem: also

$\sqrt{-}$ -singularity.

## Resultants.

Given  $P = a_0x^\ell + \dots$  and  $Q = b_0x^m + \dots$ :

$$\mathcal{R}(P, Q, x) = \det \begin{vmatrix} a_0 & a_1 & a_2 & \cdots & 0 & 0 \\ 0 & a_0 & a_1 & \cdots & 0 & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots & \vdots \\ 0 & 0 & 0 & \cdots & a_{\ell-1} & a_\ell \\ b_0 & b_1 & b_2 & \cdots & 0 & 0 \\ 0 & b_0 & b_1 & \cdots & 0 & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots & \vdots \\ 0 & 0 & 0 & \cdots & b_{m-1} & b_m \end{vmatrix}.$$

If  $P$  and  $Q$  have roots  $\alpha_j$  and  $\beta_j$ :

$$\mathcal{R} = a_0^\ell b_0^m \prod_{i,j} (\alpha_i - \beta_j) = a_0^m \prod_i Q(\alpha_i) = (-1)^{\ell m} b_0^\ell \prod_j P(\beta_j).$$

$$\mathcal{R}(P(x), P'(x), x) = a_0^\ell \prod_{i \neq j} (\alpha_i - \alpha_j).$$

If  $P$  is made monic, **separation distance between roots** is

$$\delta := \left( \mathcal{R}(P(x), P'(x), x) \right)^{2/(n(n-1))}.$$

**Algorithm ACA** (Algebraic Coeff. Asympt.)  $P(z, y) = 0$

1. *Preparation.* Discriminant  $R = \mathcal{R}(P, P'_y, y)$ ;

Compute **exceptional set**  $\Xi = \text{roots of } R$

Determine, by Newton-Puiseux, expansions of all branches, for  $\alpha \in \Xi \cup \{0\}$ .

Identify sought  $Y(z)$  from initial conditions.

2. *Dominant singularities.*

Arrange  $\Xi$  in layers,  $\Xi_1, \Xi_2, \dots$  according to  $|\alpha|$ ;

Examine each **candidate**  $\sigma \in \Xi_1$  by

matching  $Y(z)$  and the local expansion  $y_\sigma$  at a point between 0 and  $\sigma$ ; use **separation distance** and **truncation estimates**.

Iterate with successive layers till  $\rho = \text{r.o.c.}$  is detected.

3. *Collection.* Translate each singular element by **singularity analysis**.

Yet to be implemented!!!

**Algorithm** ROCPAF (radius of conv., positive alg. fun.)  
 $Y \gg 0$  ( $[z^n]Y \geq 0$ );  $P(z, Y) = 0$ .

Prigsheim's Theorem: a positive dominant singularity.

Use **SORTING** of real branches based on local Puiseux expansions and a plane sweep.



## Non-crossing forests, With Maple/Gfun

```
> # EXCEPTIONAL SET
```

```
> factor(resultant(P,diff(P,y),y));
```

$$-z^3 (4 - 8z^2 + 5z^3 - 32z)$$

```
> fsolve(%,z,complex);
```

```
-1.930283307, 0, 0, 0, .1215851069, 3.408698200
```

```
> P:=y^3+(z^2-z-3)*y^2+(z+3)*y-1;
```

$$P := y^3 + (z^2 - z - 3) y^2 + (z + 3) y - 1$$

```
> # PUISEUX EXPANSION AT 0 by GFUN (!)
```

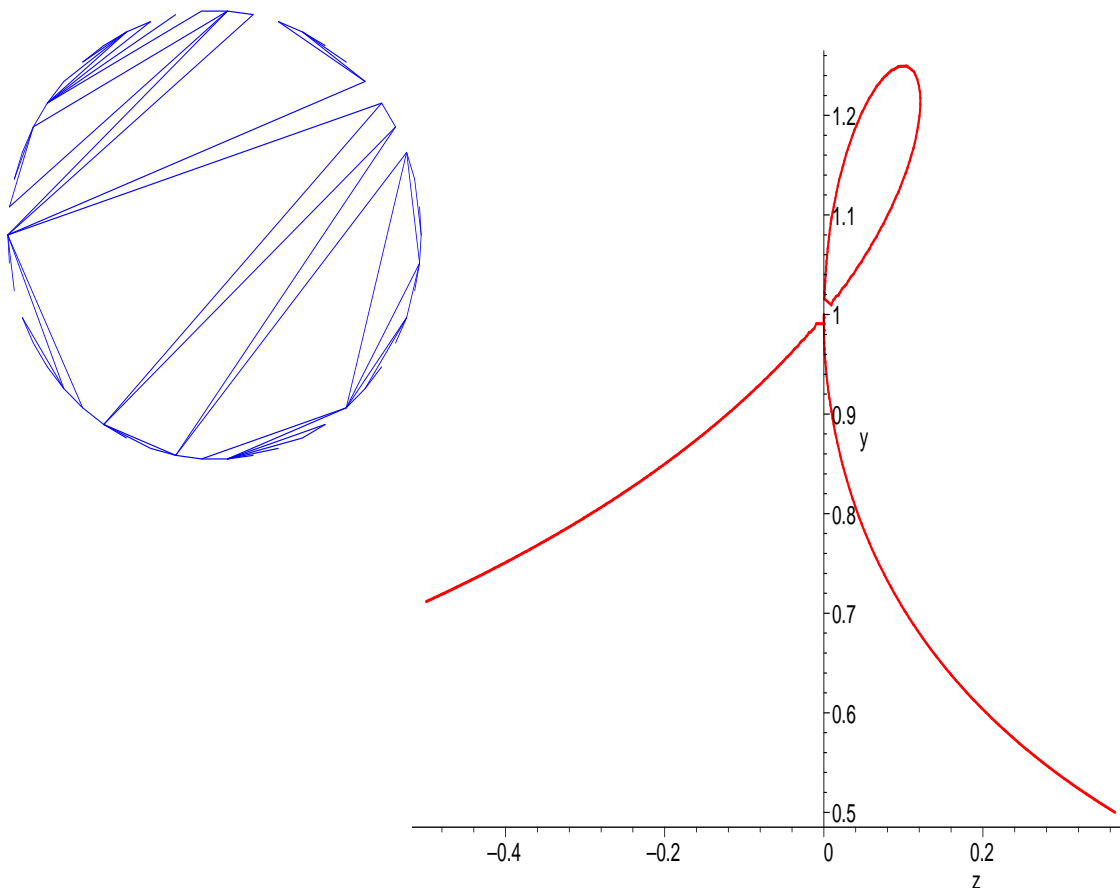
```
> algeqtoseries(P,z,y,6);
```

$$[1 + z + 2z^2 + 0(z^{8/3}), 1 - z^{1/2} + 0(z^{4/3}),$$

$$1 + z^{1/2} + 0(z^{4/3})]$$

```
> algeqtoseries(subs(z=z+sqrt(2),P),y,4): evalf(%);
```

$$.2593842053 - .1136868103 z + .05214226099 z^2 - \dots$$



Non-crossing graphs: (a) a random connected graph of size 50;  
 (b) the real algebraic curve corresponding to non-crossing forests.

$$\xi : \quad \text{Root of } 5z^3 - 8z^2 - 32z + 4 = 0$$

$$\beta = \frac{1}{37} \sqrt{228 - 981\xi - 5290\xi^2} \doteq 0.14931$$

$$F_n = \frac{\beta}{2\sqrt{\pi n^3}} \omega^n \left( 1 + O\left(\frac{1}{n}\right) \right), \quad \omega = \frac{1}{\xi} \doteq 8.22469$$

## The Drmota-Lalley-Woods Theorem

$$\{y_j = \Phi_j(z, y_1, \dots, y_m)\}, \quad j = 1, \dots, m.$$

**Theorem [DLW].** Assume positive irreducible system.

All  $y_j$  have same dominant singularity  $\rho$ .

$\exists$  functions  $h_j$  analytic at the origin such that

$$y_j = h_j \left( \sqrt{1 - z/\rho} \right) \quad (z \rightarrow \rho^-).$$

All other dominant sing. of the form  $\rho\omega^j$ , with  $\omega$  root of unity—this, iff strongly periodic.

Asymptotics of the form (single sing.)

$$[z^n]y_j(z) \sim \rho^{-n} \left( \sum_{k \geq 1} d_k n^{-1-k/2} \right).$$

Proof (DLW)

Linearize by **differentiating** a certain number of times.

“Everybody” must have the same r.o.c by **irreducibility**.

Look at **Jacobian** of nonlinear transformation  $\vec{\Phi}$ ;

**Perron-Frobenius** properties apply.

Look **locally** at what goes and exclude any behaviour other than **square-root type**.

*Explains the ubiquitous  $A^n n^{-3/2}$ .*

## What else?

- **Implement** in a Computer Algebra Package [Chabaud]
- **Find** more **structural theorems**, extending DLW to reducible cases.
- Find “good subclasses”
  - Trees, Walks, Maps are **OK**
  - **Others??**
- **Limit laws**
  - **Gaussian-ness** by perturbation and **quasipowers**: find “good” elegant conditions
  - **Classify** possible **nongaussian laws**: cf Pemantle; cf stable laws [BaFlScSa01] etc.