

Combinatorial Models and Algebraic Continued Fractions

Philippe Flajolet
INRIA-Rocquencourt, France



**Orthogonal Polynomials, Special Functions and
Applications**

Leuven, Belgium, July 2009



Analytic Combinatorics

Philippe Flajolet and
Robert Sedgewick

CAMBRIDGE

ANALYTIC COMBINATORICS,

by P. Flajolet & R. Sedgewick

Cambridge 2009, 824p

free download: algo.inria.fr/flajolet/

= exactly solvable models + asymptotics

CF

Continued fractions associated with power series
are tightly linked to lattice paths

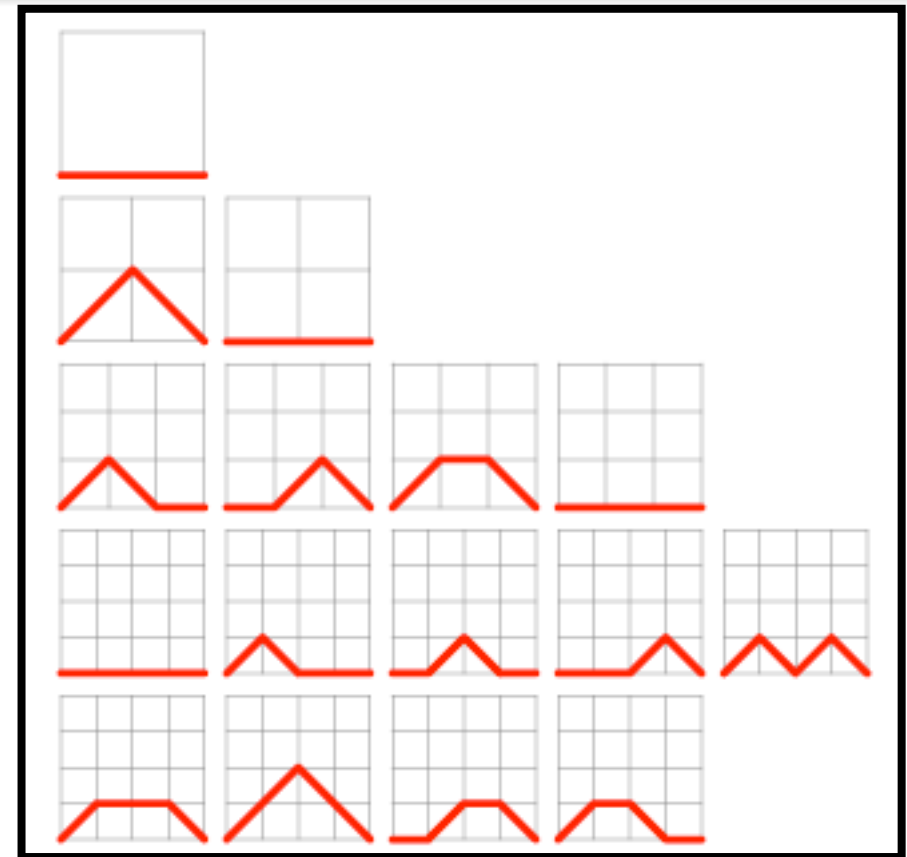
- Read off CF identities from combinatorics
- Solve combinatorial & discrete probabilistic models via CFs and Orthogonal Polynomials

OPS

LATTICE PATHS

- are comprised of steps
 - Ascents ($a : \nearrow$);
 - Descents ($b : \searrow$);
 - Levels ($c : \rightarrow$);
- never go below horizontal axis.

Excursions start and end at 0–altitude.



Main theorem: *Equivalence between:*

- **Sum of all excursions encoded with altitudes;**
- **Universal continued fraction of Jacobi type.**

FORMALITIES (i)

- Quasi-inverses. Let \mathcal{A} be a **ring**; by *telescoping*:

$$(1 - f)(1 + f + \dots + f^n) = 1 - f^{n+1}.$$

If $f^n \rightarrow 0$, then $\frac{1}{1 - f} = 1 + f + f^2 + f^3 + \dots$.

- Distributivity: $(x + y)^n = \sum_{|w|=n} w$ (all words of length n).

Corollary A. If $a = \nearrow, b = \searrow, c = \rightarrow$, then [e.g., $n \equiv 3$]

$$(c + ab)^n = \overbrace{\rightarrow \rightarrow \rightarrow + \nearrow \searrow \rightarrow \rightarrow + \rightarrow \nearrow \searrow \rightarrow + \nearrow \searrow \nearrow \searrow \nearrow \searrow + \dots}^{n \text{ blocks}}.$$

Corollary B. Combining with the *sum of a geometric progression*

$$\frac{1}{1 - c - ab} = \sum \overbrace{(\rightarrow \nearrow \searrow \rightarrow \rightarrow \nearrow \searrow)}^{\text{any } \# \text{ blocks}}.$$

FORMALITIES (ii)

Recall: $\frac{1}{1 - c - ab} = \sum \rightarrow \nearrow \searrow \rightarrow \rightarrow \nearrow \searrow \cdot$

Substitute further $ab \mapsto a \frac{1}{1-d} b$. Then:

Corollary C. With $a = \nearrow$, $b = \searrow$, $c = \rightarrow$, $d = \Rightarrow$, in $\mathbb{C}[[a, b, c, d]]$:

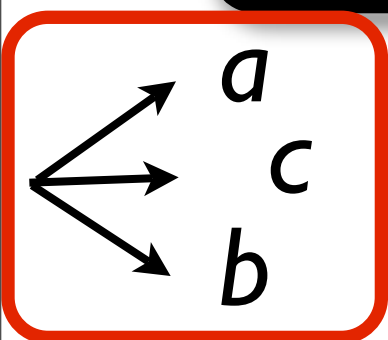
$$\begin{aligned} \frac{1}{1 - c - a \frac{1}{1-d} b} &= \sum (\text{all diagrams of height } \leq 1) \\ &= \sum \rightarrow \nearrow \Rightarrow \Rightarrow \Rightarrow \searrow \rightarrow \rightarrow \nearrow \Rightarrow \searrow \cdot \end{aligned}$$



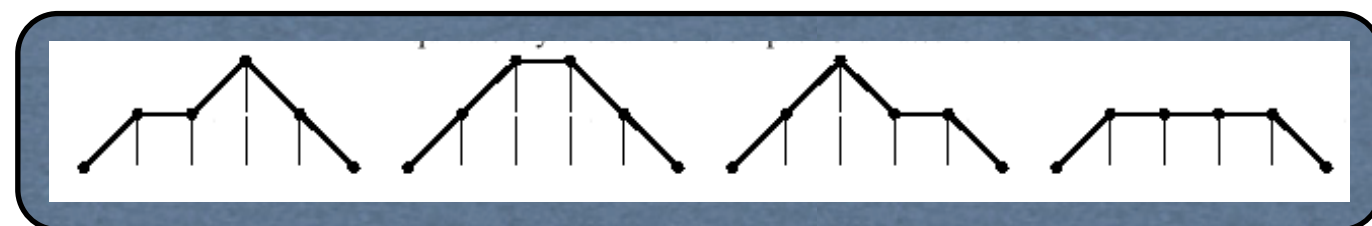
FORMALITIES GIVE A THEOREM...

Theorem [The main continued fraction theorem]

$$\frac{1}{1 - c_0 - \frac{a_0 b_1}{1 - c_1 - \frac{a_1 b_2}{1 - c_2 - \ddots}}} = \sum (\text{all lattice paths})$$



$$\frac{1}{1 - c_0 - \frac{a_0 b_1}{1 - c_1 - \frac{a_1 b_2}{1 - c_2 - \frac{\ddots}{1 - c_h}}}} = \sum \left(\begin{array}{l} \text{all lattice paths} \\ \text{with height } \leq h \end{array} \right) = P_h / Q_h$$

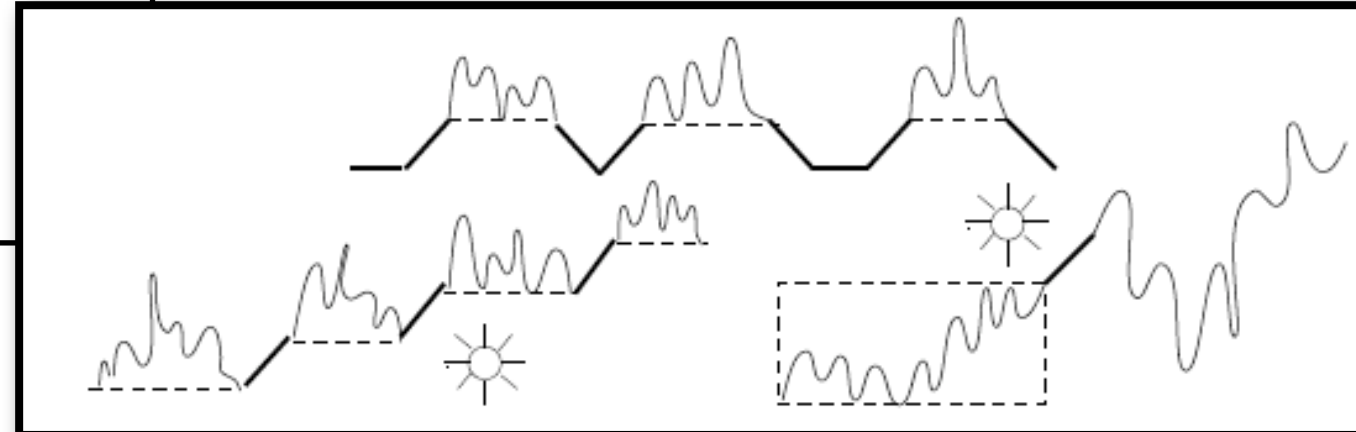


Equivalently, with **weighting rules**, $a_j \mapsto \alpha_j z$, $b_j \mapsto \beta_j z$, $c_j \mapsto \gamma_j z$:

$$\frac{1}{1 - \gamma_0 z - \frac{\alpha_0 \beta_1 \cdot z^2}{1 - \gamma_1 z - \frac{\alpha_1 \beta_2 \cdot z^2}{1 - \gamma_2 z - \ddots}}} \equiv \sum_{\pi: \text{excursion}} z^{|\pi|} \text{weight}(\pi)$$

universal J -fraction \equiv generating function of [weighted] excursions

Excursions :	J -fraction
—, bounded height :	$\frac{P_h}{Q_h}$ (convergent)
Paths ending at k :	$Q_k J - P_k$
—, traversing k -strip :	$\frac{1}{Q_k}$





- J. Touchard [1952]: chord diagrams (i)
- I.J. Good [1958]: discrete birth-death processes
- A. Lenard [1961]: statistical physics
- G. Szekeres [1968]: Rogers-Ramanujan identities
- D. Jackson [1978]: Ising model
- R. Read [1979]: chord diagrams (ii)
- P. Flajolet [1978-80]: “File histories”. *Discr. Math.*

What next?

- ◆ 1. Simple applications
- ◆ 2. Convergents and orthogonal polynomials
- ◆ 3. Arches
- ◆ 4. Snakes
- ◆ 5. Addition formulae
- ◆ 6. Elliptic matters



1. Simple applications (ballots, coins)

A SOLUTION (?!) TO THE BALLOT PROBLEM

*“Two candidates, Alice and Bob, with (eventually) each n votes.
What is the probability that Alice is always ahead or tied?”*

Do $a \mapsto z; b \mapsto z; c \mapsto 0$. By main theorem:

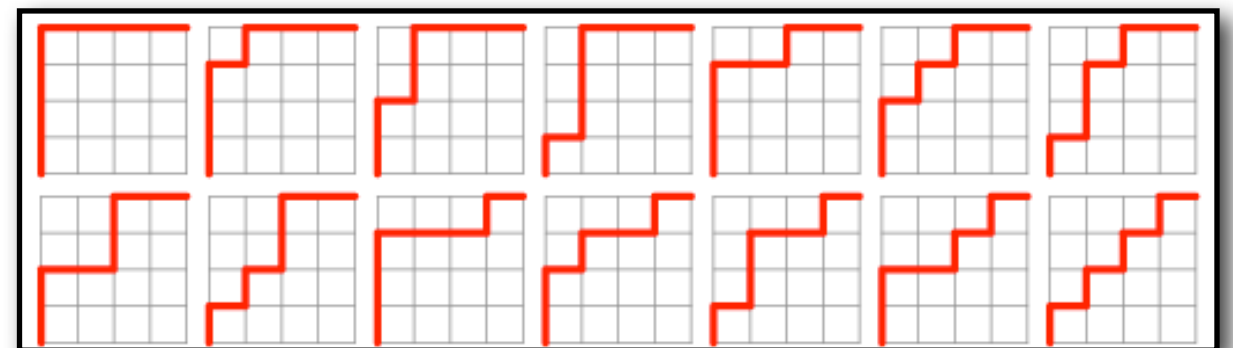
$$C := \frac{1}{1 - \frac{z^2}{1 - \frac{z^2}{\ddots}}} = \sum_{\beta \text{ ballot sequence}} z^{|\beta|} = \sum_n C_n z^{2n}.$$



We get **Catalan numbers** [Euler-Segner 1750; Catalan 1850]

$$C = \frac{1}{1 - z^2 C} \implies C = \frac{1 - \sqrt{1 - 4z^2}}{2z^2} \implies C_n = \frac{1}{n+1} \binom{2n}{n}.$$

The probability is $\frac{C_n}{\binom{2n}{n}} = \frac{1}{n+1}$.

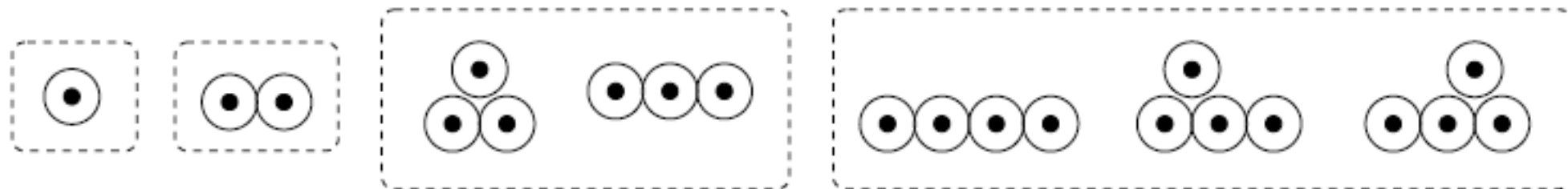


COIN FOUNTAINS

[Odlyzko-Wilf, 1988]



$$C(q) = 1 + q + q^2 + 2q^3 + 3q^4 + 5q^5 + 9q^6 + 15q^7 + 26q^8 + \dots$$



Greetings from [The On-Line Encyclopedia of Integer Sequences!](#)

Search: 1, 2, 3, 5, 9, 15, 26, 45

Displaying 1-2 of 2 results found.

pag

Format: long | [short](#) | [internal](#) | [text](#) Sort: relevance | [references](#) | [number](#) Highlight: on | [off](#)

[A005169](#) Number of fountains of n coins.
(Formerly M0708)

1, 1, 1, 2, 3, 5, 9, 15, 26, 45, 78, 135, 234, 406, 704, 1222, 2120, 3679, 6385, 11081, 19232, 33379, 57933, 100550, 174519, 302903, 525734, 912493, 1583775, 2748893, 4771144, 8281088, 14373165, 24946955, 43299485, 75153286, 130440740 ([list](#); [graph](#); [listen](#))

OFFSET 0,4

COMMENT A fountain is formed by starting with a row of coins, then stacking additional coins on top so that each new coin touches two in the previous row.

Do: $a_j \mapsto 1, b_j \mapsto q^j$. Then:

$$C(q) = \frac{1}{1 - \frac{q}{1 - \frac{q^2}{1 - \frac{q^3}{\dots}}}} = \frac{\sum (-1)^n \frac{q^{n^2+n}}{(1-q)(1-q^2)\cdots(1-q^n)}}{\sum (-1)^n \frac{q^{n^2}}{(1-q)(1-q^2)\cdots(1-q^n)}}.$$



Number of coin fountains: $C_n \sim 0.31 \cdot 1.73566^n$.

Ramanujan's fraction:

$$\frac{1}{1 + \frac{e^{-2\pi\sqrt{5}}}{1 + \frac{e^{-4\pi\sqrt{5}}}{1 + \frac{e^{-6\pi\sqrt{5}}}{\dots}}}} = e^{2\pi/\sqrt{5}} \left(\frac{\sqrt{5}}{1 + \sqrt[5]{\frac{5^{3/4}}{(1/2+1/2\sqrt{5})^{5/2}}}} - 1 - \frac{1+\sqrt{5}}{2} \right) = 0.9999992087\dots$$



$$e^{\pi\sqrt{163}} = 262537412640768743.99999999999999\dots$$

2. Convergent polynomials

- ◆ Revisiting the ballot problem
- ◆ Orthogonality

*“Two candidates, Alice and Bob, with (eventually) each n votes. If Alice is always ahead (or tied), what is the probability that she never **leads** by more than h ?”*

The number of favorable cases has generating function (GF), with $z^2 \mapsto z$:

$$C^{[h]}(z) = \left. \begin{array}{c} \frac{1}{1 - \frac{z}{1 - \frac{\ddots}{1 - z}}} \end{array} \right\} h \text{ stages.}$$

$$\frac{1}{1}, \quad \frac{1}{1-z}, \quad \frac{1-z}{1-2z}, \quad \frac{1-2z}{1-3z+z^2}, \quad \dots, \quad \frac{F_{h+1}(z)}{F_{h+2}(z)},$$

where $F_{h+2} = F_{h+1} - zF_h$ are Fibonacci polynomials.

- “Constant-coefficient” recurrence; Lagrange inversion.
- Roots are $1/(4 \cos^2 \theta)$, $\theta = \frac{k\pi}{h}$; partial fractions.

+ Chebyshev



Lagrange [1775] & Lord Kelvin & De Bruijn, Knuth, Rice [1973]

$$C_n^{[h]} = \sum_k \cdots 4^n \cos^{2n} \left(\frac{k\pi}{h} \right) = \sum_k \cdots \binom{2n}{n - kh}.$$

partial fraction / Lagrange inversion

- Related to Kolmogorov–Smirnov tests in **statistics**:
Compare X_1, \dots, X_n and Y_1, \dots, Y_n ? “Sort and vote!”
- Pólya [1927]: **totally elementary proof of elliptic-theta transformation**:

$$\sum_{\nu=-\infty}^{\infty} e^{-\nu^2 t^2} = \sqrt{\frac{\pi}{t^2}} \sum_{\nu=-\infty}^{\infty} e^{-\pi^2 \nu^2 / t^2}.$$

= *Do multisection of $(1+z)^{2n}$, with $h = t\sqrt{n}$, in two ways!*

+ asymptotics!



Orthogonal polynomials

Linear fractional transformations [homographies] get composed like 2×2 matrices:

$$\frac{ax + b}{cx + d} \mapsto \begin{pmatrix} a & b \\ c & d \end{pmatrix}.$$

- Convergent polynomials $\frac{P_h(z)}{Q_h(z)}$ satisfy a three-term recurrence with numerators/denominators of the continued fraction.
- Reciprocals of convergent polynomials are **orthogonal** with respect to $\langle f, g \rangle = \langle f \cdot g \rangle$, where moments $\langle z^n \rangle$ are coefficients in the expansion of the continued fraction.



In all generality:

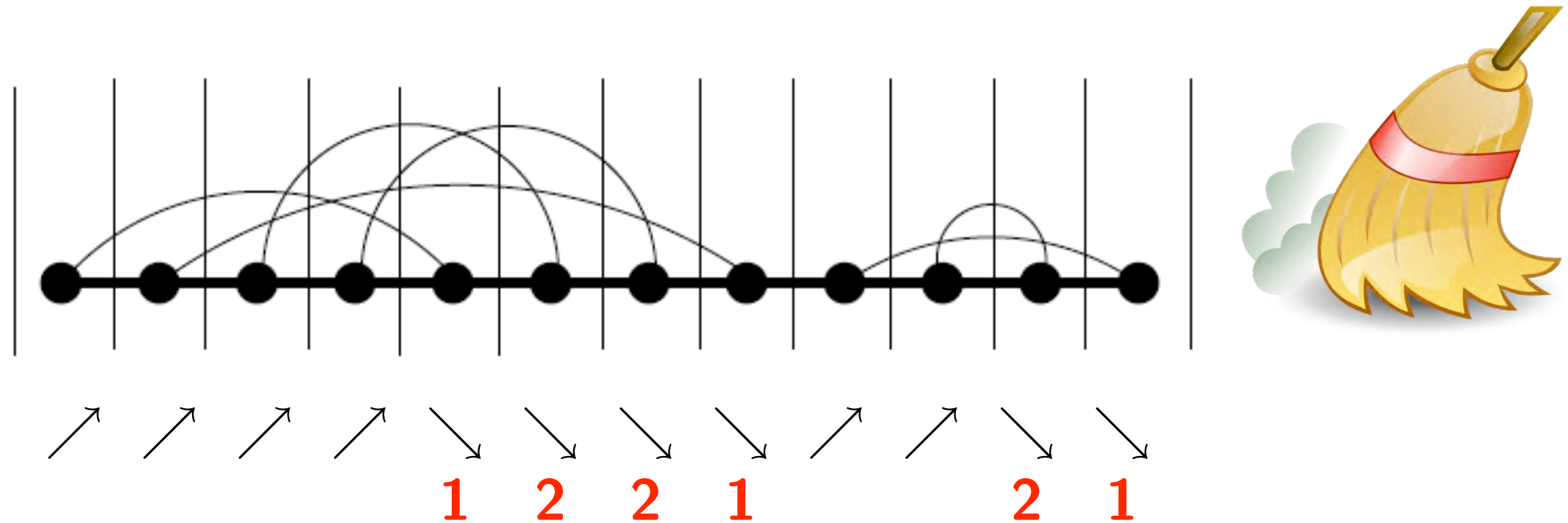
- **Orthogonal polynomials** must appear in counting of *paths of bounded height* and in “equivalent” structures.



3. Arches and such

- ◆ Colouring rules
- ◆ Hermite polynomials

In how many ways can one join $2n$ points on the line in pairs?



A descent from altitude j has j possibilities: $d_j \mapsto jz$, $a_j \mapsto z$.

$$\sum_{n \geq 1} (1 \cdot 3 \cdots (2n - 1)) z^{2n} = \frac{1}{1 - \frac{1 \cdot z^2}{1 - \frac{2 \cdot z^2}{1 - \frac{3 \cdot z^2}{\ddots}}}}.$$



Gauss !!

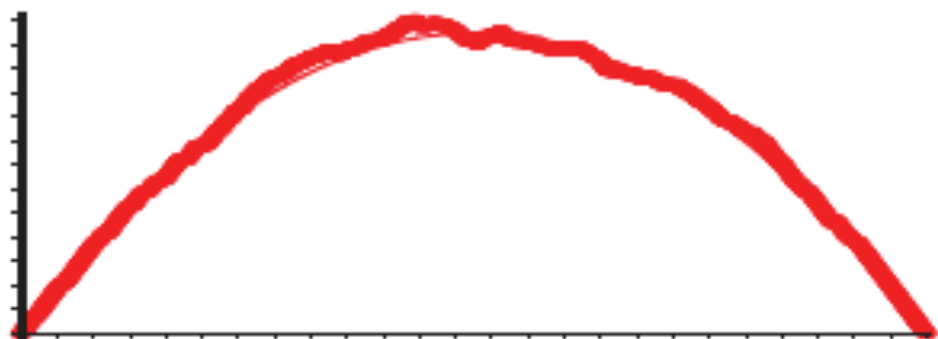
Lagarias-Odlyzko-Zagier [1985]: Which capacity do we need to arrange pairwise connections between $2n$ points, with high probability?

- The answer lies in the zeroes of **Hermite polynomials**.

$$\langle f, g \rangle = \int_{-\infty}^{\infty} f(x) \cdot g(x) e^{-x^2/2} dx.$$

Proof. **height** h :

$$\left. \begin{array}{c} 1 \\ 1 - \frac{1 \cdot z^2}{1 - \frac{2 \cdot z^2}{\ddots \frac{1}{1 - h \cdot z^2}}} \end{array} \right\} h \text{ levels.}$$

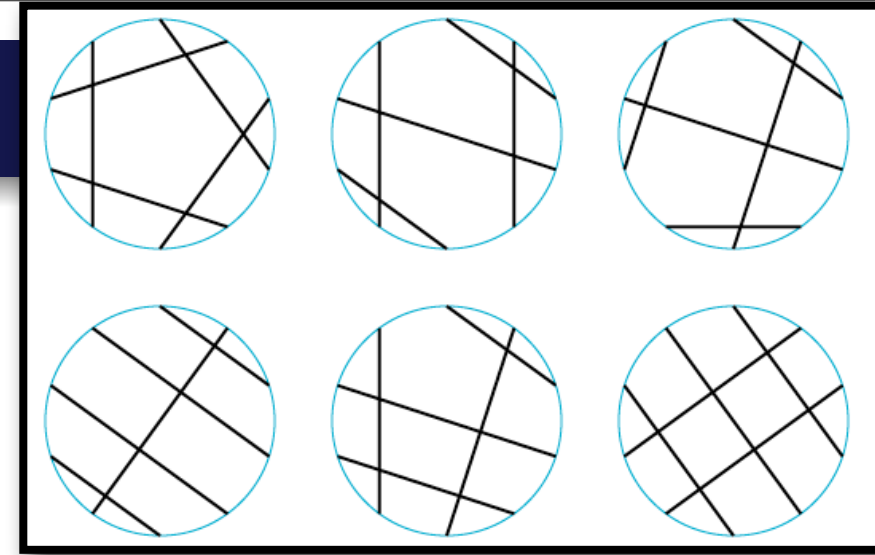


Louchard & Janson: a Gaussian process = deterministic parabola + Brownian noise.

+ Airy connection



Chord systems



Join $2n$ points on circle by chords. How many crossings?

Sweeping: $T(z, q) \equiv \sum_{\sigma} z^{|\sigma|} q^{\# \text{xings}(\sigma)} =$



$$= \frac{1}{1 - \frac{[1] \cdot z^2}{1 - \frac{[2] \cdot z^2}{1 - \frac{[3] \cdot z^2}{\ddots}}}}}, \quad [n] = \frac{1 - q^n}{1 - q}.$$

Theorem [Touchard]. *Number of crossings has generating function*

$$T(z(1 - q), q) = \sum_{k \geq 0} q^{\binom{k+1}{2}} (-z^k) C^{2k+1}; \quad C := \frac{1}{2z} (1 - \sqrt{1 - 4z}).$$

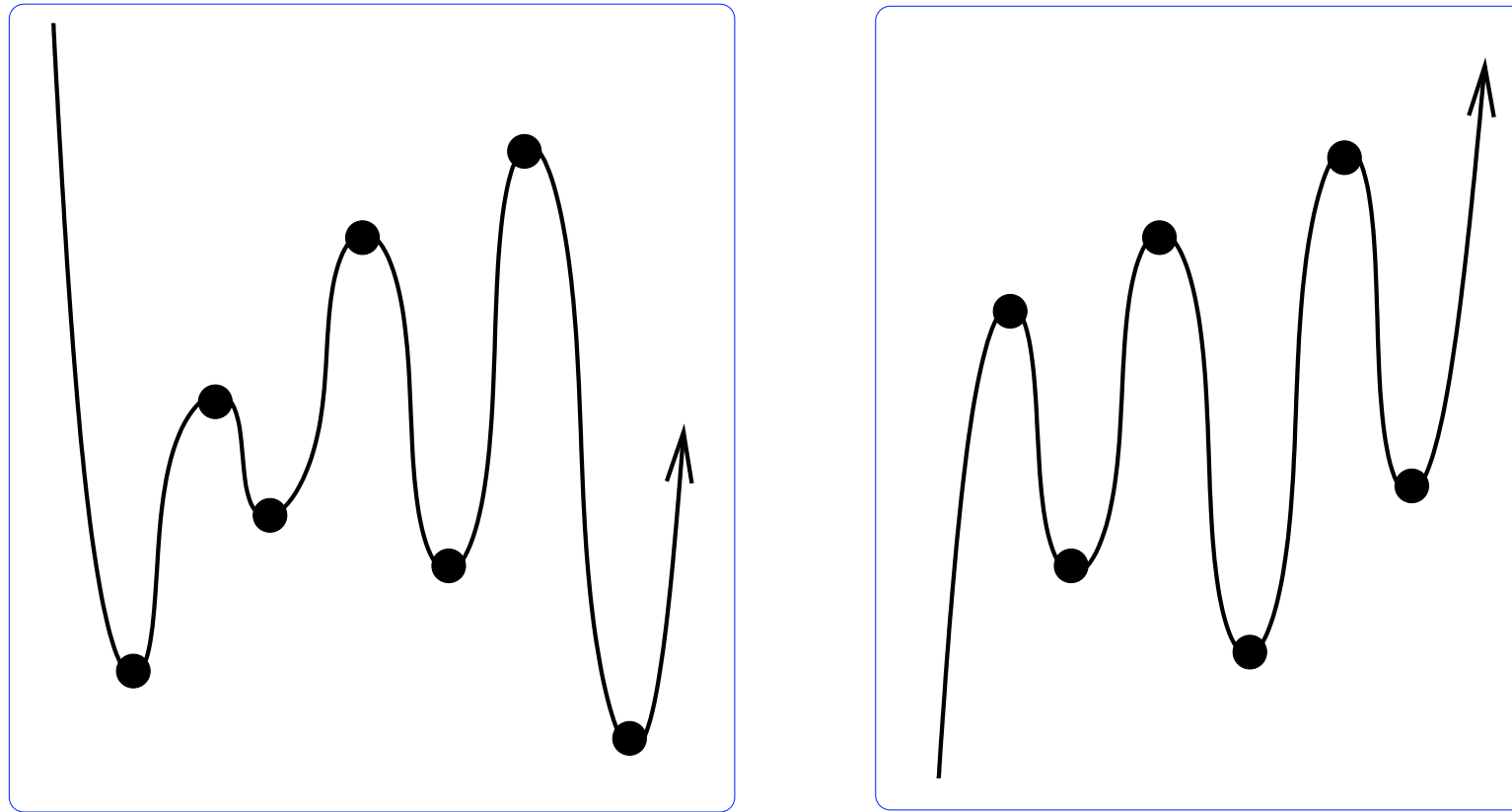
Corollary [F-Noy 2000]: *# crossings is asympt. Gaussian.*

Cf [Ismail, Stanton, Viennot 1987] for nice combinatorics (q -Hermite).

4. Snakes and curves

- ◆ Arnold's snakes
- ◆ Stieltjes' fraction
- ◆ Postnikov's Morse links

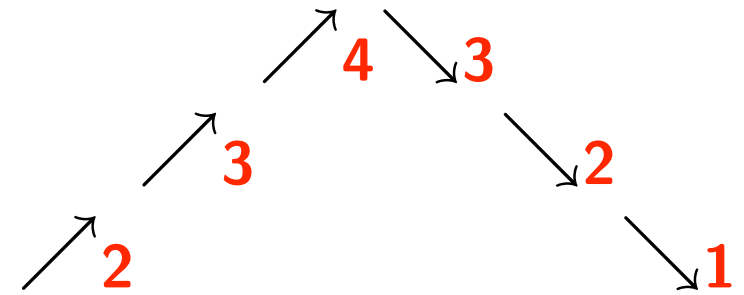
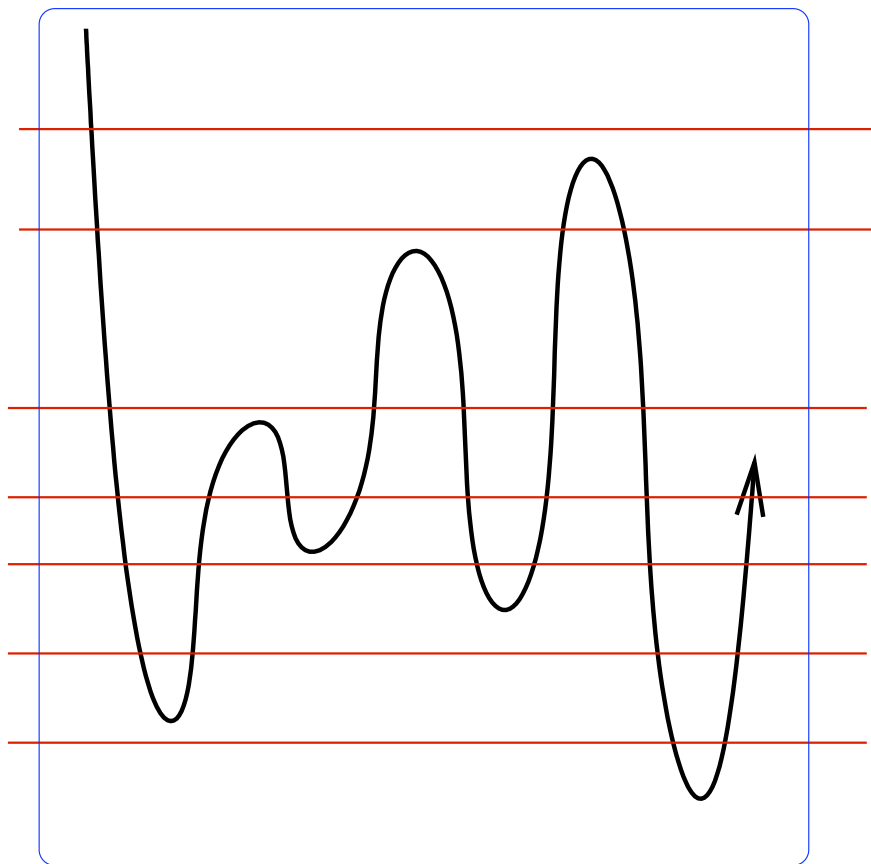
Arnold [1992]: How many topological types of “smooth” functions?



D. André [1881]: alternating perms = the coefficients of $\tan(z)$ and $\sec(z)$.

$$\begin{cases} \tan z = 1 \frac{z}{1!} + 2 \frac{z^3}{3!} + 16 \frac{z^5}{5!} + 272 \frac{z^7}{7!} + \dots \\ \sec z = 1 + 1 \frac{z^2}{2!} + 5 \frac{z^4}{4!} + 61 \frac{z^6}{6!} + \dots \end{cases}$$

Proof. Decompose according to minimum and get ODE: $Y' = 1 + Y^2$ via recurrence.



$$\sum (\tan)_{2n+1} z^{2n+1} = \left\langle \int_0^\infty e^t \tan(zt) dt \right\rangle = \frac{z}{1 - \frac{1 \cdot 2 z^2}{1 - \frac{2 \cdot 3 z^3}{\dots}}}$$

↓

1, 2, 16, 272, ...

Related to a bijection of Françon and Viennot

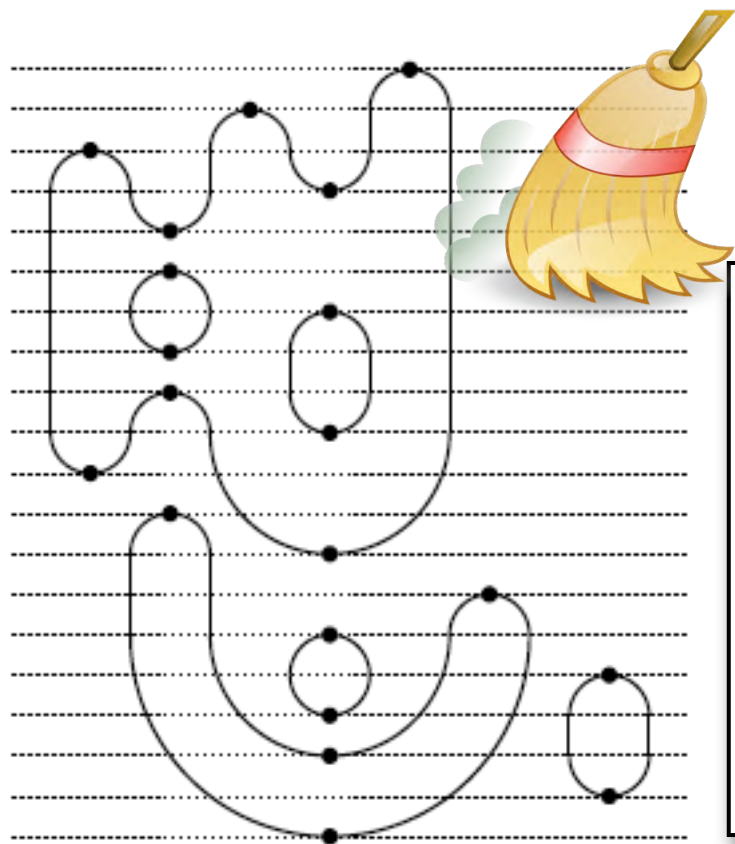
= A continued fraction of Stieltjes

Ann. Fac. Sci. Toulouse, 1894



A continued fraction of Postnikov (2000)

= *Morse links* (systems of closed Morse curves)



$$\left\{ \frac{\Gamma(x - \frac{1}{2}a + \frac{1}{4}) \Gamma(x + \frac{1}{2}a + \frac{1}{4})}{\Gamma(x - \frac{1}{2}a + \frac{3}{4}) \Gamma(x + \frac{1}{2}a + \frac{3}{4})} = \right. \\ \left. = \frac{4}{4x} + \frac{1^2 - 4a^2}{8x} + \frac{3^2 - 4a^2}{8x} + \frac{5^2 - 4a^2}{8x} + \frac{7^2 - 4a^2}{8x} + \dots \right.$$

Theorem [F.2008]. *The Morse–Postnikov numbers satisfy*

$$L_n \sim \hat{L}_n, \quad \text{where} \quad \hat{L}_n = \frac{1}{2}(2n-1)! \left(\frac{4}{\pi}\right)^{2n+1}.$$

$$\text{E.g.: } \frac{L_4}{\hat{L}_4} \doteq 0.99949.$$

5. Addition formulae &c.

- ◆ Stieltjes-Rogers
- ◆ Addition formulae, paths, and OPs are all belong to a single family of identities
- ◆ Applications to “processes”...

The Stieltjes–Rogers Theorem

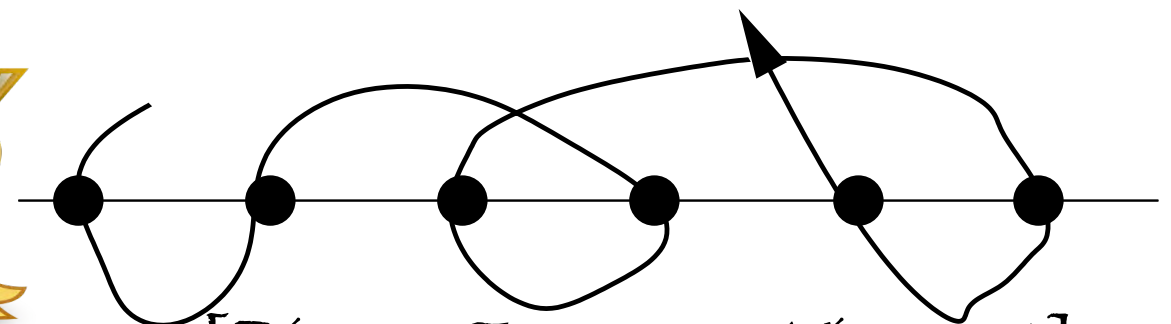
Definition. $\phi(z) = \sum_{n=0}^{\infty} \phi_n \frac{z^n}{n!}$ satisfies an addition formula if

$$\phi(x+y) = \sum_k \omega_k \phi_k(x) \phi_k(y), \text{ where } \phi_k(x) = \frac{x^k}{k!} + O(x^{k+1}).$$

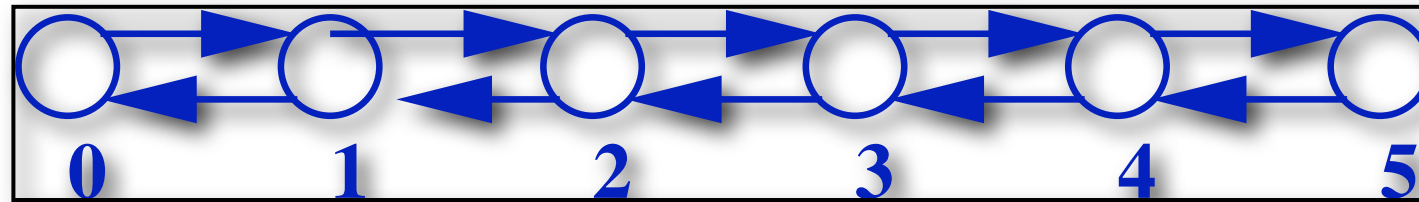
Theorem. An addition formula gives automatically a continued fraction for $f(z) = \sum_{n=0}^{\infty} \phi_n z^n = \langle\langle \int_0^{\infty} e^t \phi(z t) dt \rangle\rangle$.

$$\frac{1}{1-x-y} = \sum_k (k!)^2 \frac{x^k/k!}{(1-x)^{k+1}} \frac{y^k/k!}{(1-y)^{k+1}}$$

$$\sum n! z^n = \frac{1}{1-z - \frac{1^2 z^2}{1-3z - \frac{2^2 z^2}{\ddots}}}$$



[Biane, Françon-Viennot]



Systems of paths and birth–death processes:

Number & probability of weighted paths from a to b ;

- Discrete time processes: I.J. Good [1950's];
- Continuous time processes: Karlin–McGregor; F–Guillemin [AAP 2000];
- Combinatorial processes = “file histories”, [F–François–Vuillemin–Puech, 1980+]

⇒ Paths from 0 to k have exp. gen. function φ_k of addition formula.

Meixner's class of special OP's

Classical orthogonal polynomials appear to share many properties.

Theorem [Meixner 1934]: *If the exponential generating function satisfies a strong decomposability property,*

$$\sum_h \bar{Q}_h(z) \frac{t^n}{n!} = A(t) e^{zB(t)},$$

then there are only five possibilities.



Laguerre	Hermite	Poisson-Charlier	Meixner I	Meixner II
Perms	Arcs	Set partitions	Snakes	Pref. arrang.
$\frac{1}{1-z}$	$e^{z^2/2}$	e^{e^z-1}	$\sec(z)$	$\frac{1}{2-e^z}$

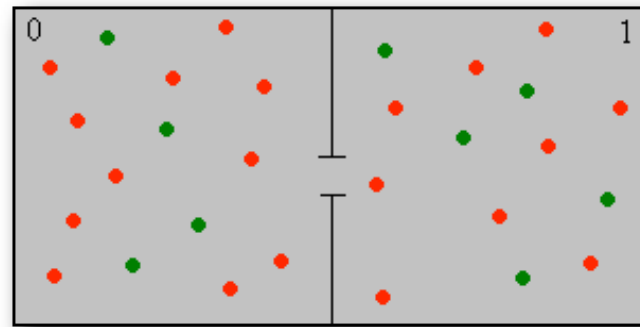
★ ★ ★

Computations for *linear possibilities* are automatic:

unified theory of “libraries”, basic queueing systems

The Ehrenfest urn model

Particles switching chambers



addition formula

$$(\cosh(z))^N$$

&

$$\frac{1}{1 - \frac{1 \cdot N z^2}{1 - \frac{2 \cdot (N-1) z^2}{\dots}}}$$

Stieltjes; Kac 1947;
Edelman-Kostlan 1994

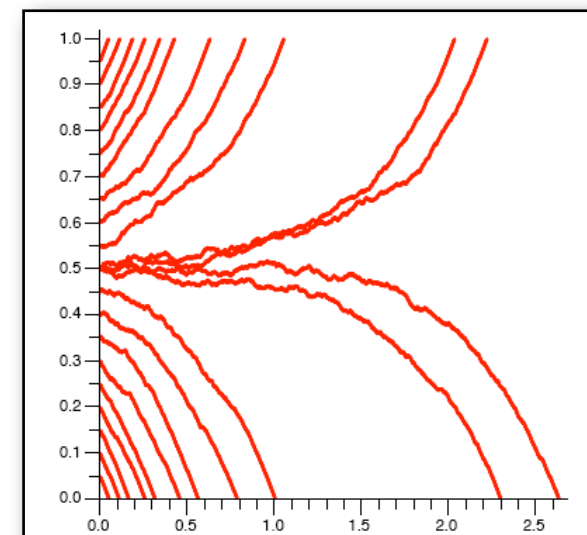
The Mabinogion urn model



- Spread of influence in populations:

$$A \implies (B \longrightarrow A), \quad B \implies (A \longrightarrow B).$$

Theorem [F-Huillet 2008]. Fair urn: absorption time is $\sim \frac{1}{2} N \log N$, with limit distribution of density $\asymp e^{-t} e^{-e^{-2t}}$.



6. Some Elliptic matters

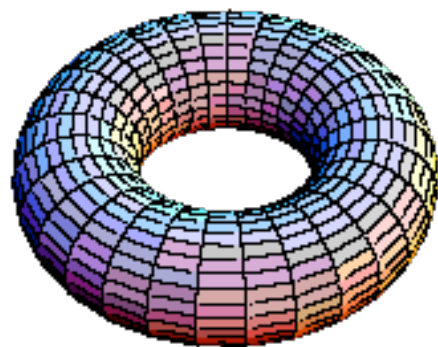
- ◆ Jacobian functions
- ◆ Dixonian functions
- ◆ Bacher's numbers

- Pollaczek fractions have coefficients that are polynomials in the level = a mysterious class!
- Includes some Hurwitz zeta; cf Stieltjes-Apéry

$$\zeta(3) = \frac{6}{\varpi(0) - \frac{1^6}{\varpi(1) - \frac{2^6}{\varpi(2) - \frac{3^6}{\ddots}}}},$$

- An interesting “sporadic” subclass appears to be related to elliptic functions

[Pollaczek, *Mem. Sc. Math.*, 1956]



- **Algebraic curves of genus 1 are doughnuts.** The integrals have two “periods”. The inverse functions are **elliptic functions**; i.e., doubly periodic meromorphic.

- Weierstraß \wp arises from $y^2 = P_3(z)$;
- Jacobian sn, cn arise from $y^2 = (1 - z^2)(1 - k^2 z^2)$;
- Dixonian sm, cm arise from $y^3 + z^3 = 1$.

They satisfy addition formulae!
(≠Stieltjes-Rogers)



- **Theorem [F; Dumont 1980].** *Jacobian elliptic functions count alternating perms w/parity of peaks.*

- **Theorem [Conrad+F, 2006].** *Dixonian functions have continued fractions*

$$\int_0^\infty \text{sm}(u) e^{-u/x} du = \frac{x^2}{1 + b_0 x^3 - \frac{1 \cdot 2^2 \cdot 3^2 \cdot 4 x^6}{1 + b_1 x^3 - \frac{4 \cdot 5^2 \cdot 6^2 \cdot 7 x^6}{\dots}}};$$



\equiv levels in trees and an urn model (\approx Yule process), &c

- **Theorem [Bacher+F, 2006].** *Pseudofactorials $a_{n+1} = (-1)^{n+1} \sum \binom{n}{k} a_k a_{n-k}$ have a CF*

$$\sum a_n z^n = \frac{1}{1 + z + \frac{3 \cdot 1^2 z^2}{1 - z + \frac{2^2 z^2}{1 + 3z + \dots}}}.$$

[A098777](#)

$a(0)=0, a(n+1)=(-1)^{n+1} \sum (\text{binomial}(n,k) * a(k) * a(n-k)), k'=0..n), n \geq 0.$

1, -1, -2, 2, 16, -40, -320, 1040, 12160, -52480, -742400, 3872000, 6645
411136000, -8202444800, 58479872000, 1335009280000, -10791497728000, -27

$$\text{Pseudo-factorials: } a_{n+1} = (-1)^{n+1} \sum \binom{n}{k} a_k a_{n-k}.$$

Theorem [Bacher+F, 2008]. *The exponential generating function of the orthogonal polynomials attached to (a_n) is*

$$\eta(t) \cosh(zJ(t)) + \chi(t) \sin(zJ(t)),$$

where $J(t) := \int_0^t \frac{du}{\sqrt{1 - 3u^2 + 3u^4}}$ and η, χ are algebraic functions.

≠ Carlitz 1960+; Ismail & Masson 1999; Lomont & Brillhart 2001;
cf. Gilewicz et al 2006 for “sm”.

Cf also: Flajolet--Bacher (an octic fraction, unpub.);
Rivoal (deg=12(!)) relative to $\Gamma(1/3)^3$

Probabilistic
Processes

Urn models, branching pr.,
Brownian motion,...

Special
Functions

Continued
Fractions

Ortho
Polys

Meixner class, q-
Hermite,...

Combinatorics

Permutations,
chords, set partitions, ...

