Efficient Experimental Mathematics for Lattice Path Combinatorics

Alin Bostan



Based on joint works with M. Bousquet-Mélou, F. Chyzak, M. van Hoeij, M. Kauers, I. Kurkova, S. Melczer, L. Pech, K. Raschel, B. Salvy

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▷ $f_{n;0,0}$ = number of walks returning to (0,0), a.k.a. "excursions", of length n. ▷ $f_n = \sum_{i,j \ge 0} f_{n;i,j}$ = number of total walks with length n. ▷ Complete generating series:

$$F(t;x,y) = \sum_{n=0}^{\infty} \left(\sum_{i,j=0}^{\infty} f_{n;i,j} x^i y^j \right) t^n \in \mathbb{Q}[x,y][[t]].$$

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Special, combinatorially meaningful specializations:

- *F*(*t*;0,0) counts excursions;
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Combinatorial questions: Given \mathfrak{S} , what can be said about F(t; x, y), resp. $f_{n;i,j}$, and their variants?

- Properties of F: algebraic? transcendental? D-finite?
- Explicit form: of *F*? of *f*?
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Our goal: Use computer algebra to give computational answers.

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One is left with 79 interesting distinct models.

simple,



Singular

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Efficient Experimental Mathematics for Lattice Path Combinatorics

Two important models: Kreweras and Gessel walks

$$\mathfrak{S} = \{\downarrow, \leftarrow, \nearrow\} \qquad F_{\mathfrak{S}}(t; x, y) \equiv K(t; x, y)$$

$$\mathfrak{S} = \{\nearrow, \checkmark, \leftarrow, \rightarrow\} \quad F_{\mathfrak{S}}(t; x, y) \equiv G(t; x, y)$$





Example: A Kreweras excursion.





Algebraic: $S(t) \in \mathbb{Q}[[t]]$ root of a polynomial $P \in \mathbb{Q}[t, T]$, i.e., P(t, S(t)) = 0.



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Algebraic: $S(t) \in \mathbb{Q}[[t]]$ root of a polynomial $P \in \mathbb{Q}[t, T]$, i.e., P(t, S(t)) = 0. *D-finite:* $S(t) \in \mathbb{Q}[[t]]$ satisfying a linear differential equation with polynomial coefficients $c_r(t)S^{(r)}(t) + \cdots + c_0(t)S(t) = 0$. *Hypergeometric:* $S(t) = \sum_{n=0}^{\infty} s_n t^n$ such that $\frac{s_{n+1}}{s_n} \in \mathbb{Q}(n)$. E.g.,

$$_{2}F_{1}\begin{pmatrix}a & b \\ c & l\end{pmatrix} = \sum_{n=0}^{\infty} \frac{(a)_{n}(b)_{n}}{(c)_{n}} \frac{t^{n}}{n!}, \quad (a)_{n} = a(a+1)\cdots(a+n-1).$$



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 $S \in \mathbb{Q}[[x, y, t]]$ is *D-finite* if the set of all partial derivatives of *S* spans a finite-dimensional vector space over $\mathbb{Q}(x, y, t)$.

Theorem [Kreweras 1965; 100 pages combinatorial proof!] $K(t;0,0) = {}_{3}F_{2} \begin{pmatrix} 1/3 & 2/3 & 1 \\ 3/2 & 2 \end{pmatrix} | 27 t^{3} \end{pmatrix} = \sum_{n=0}^{\infty} \frac{4^{n} \binom{3n}{n}}{(n+1)(2n+1)} t^{3n}.$

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▷ Fresh news: recent human proof [B., Kurkova & Raschel 2014].

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▷ Guess'n'Prove method, using Hermite-Padé approximants.

Main results (II): Explicit form for G(t; x, y)

Theorem [B., Kauers & van Hoeij 2010] Let $V = 1 + 4t^2 + 36t^4 + 396t^6 + \cdots$ be a root of $(V - 1)(1 + 3/V)^3 = (16t)^2$, let $U = 1 + 2t^2 + 16t^4 + 2xt^5 + 2(x^2 + 83)t^6 + \cdots$ be a root of $x(V - 1)(V + 1)U^3 - 2V(3x + 5xV - 8Vt)U^2$ $-xV(V^2 - 24V - 9)U + 2V^2(xV - 9x - 8Vt) = 0$, let $W = t^2 + (y + 8)t^4 + 2(y^2 + 8y + 41)t^6 + \cdots$ be a root of $y(1 - V)W^3 + y(V + 3)W^2 - (V + 3)W + V - 1 = 0$.

Then G(t; x, y) is equal to

$$\frac{\frac{64(U(V+1)-2V)V^{3/2}}{x(U^2-V(U^2-8U+9-V))^2}-\frac{y(W-1)^4(1-Wy)V^{-3/2}}{t(y+1)(1-W)(W^2y+1)^2}}{(1+y+x^2y+x^2y^2)t-xy}-\frac{1}{tx(y+1)}$$

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▷ Computer-driven discovery and proof; no human proof yet. ▷ Proof uses guessed minimal polynomials for G(t; x, 0) & G(t; 0, y)

Main results (III): Conjectured D-Finite *F*(*t*; 1, 1) [B. & Kauers 2009]

	OEIS	\mathfrak{S}	Pol size	ODE size		OEIS	S	Pol size	ODE size
1	A005566	⇔	_	3, 4	13	A151275	X	_	5, 24
2	A018224	Х	_	3,5	14	A151314	\mathbb{X}	_	5, 24
3	A151312	X	—	3, 8	15	A151255	$\mathbf{\hat{\mathbf{X}}}$	—	4, 16
4	A151331	畿	—	3,6	16	A151287	捡	—	5, 19
5	A151266	Ŷ	—	5, 16	17	A001006	÷,	2, 2	2, 3
6	A151307	₩	—	5, 20	18	A129400	敎	2, 2	2, 3
7	A151291	Υ.	—	5, 15	19	A005558		—	3, 5
8	A151326	₩.	—	5, 18					
9	A151302	X	—	5, 24	20	A151265	\checkmark	6,8	4, 9
10	A151329	翜	_	5, 24	21	A151278	\rightarrow	6,8	4, 12
11	A151261	÷.	_	4, 15	22	A151323	₩	4, 4	2, 3
12	A151297	鏉	_	5, 18	23	A060900	\mathbf{A}	8,9	3, 5

Equation sizes = {order, degree}@(algeq, diffeq)

Computerized discovery by enumeration + Hermite–Padé

- ▷ 1–22: Confirmed by human proofs in [Bousquet-Mélou & Mishna 2010]
- ▷ 23: Confirmed by a human proof in [B., Kurkova & Raschel 2014]

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	OEIS	S	alg	asympt		OEIS	\mathfrak{S}	alg	asympt
1	A005566	\Leftrightarrow	N	$\frac{4}{\pi} \frac{4^n}{n}$	13	A151275	\mathbb{X}	N	$\frac{12\sqrt{30}}{\pi} \frac{(2\sqrt{6})^n}{n^2}$
2	A018224	X	Ν	$\frac{2}{\pi} \frac{4^n}{n}$	14	A151314	₩	Ν	$\frac{\sqrt{6}\lambda\mu C^{5/2}}{5\pi} \frac{(2C)^n}{n^2}$
3	A151312	8	Ν	$\frac{\sqrt{6}}{\pi} \frac{6^n}{n}$	15	A151255	ک	Ν	$\frac{24\sqrt{2}}{\pi} \frac{(2\sqrt{2})^n}{n^2}$
4	A151331	鋖	Ν	$\frac{8}{3\pi}\frac{8^n}{n}$	16	A151287	☆	Ν	$\frac{2\sqrt{2}A^{7/2}}{\pi} \frac{(2A)^n}{n^2}$
5	A151266	Y	Ν	$\frac{1}{2}\sqrt{\frac{3}{\pi}\frac{3^n}{n^{1/2}}}$	17	A001006	÷,	Y	$\frac{3}{2}\sqrt{\frac{3}{\pi}\frac{3^n}{n^{3/2}}}$
6	A151307	₩	Ν	$\frac{1}{2}\sqrt{\frac{5}{2\pi}}\frac{5^n}{n^{1/2}}$	18	A129400	敎	Y	$\frac{3}{2}\sqrt{\frac{3}{\pi}}\frac{6^n}{n^{3/2}}$
7	A151291	.₩.	Ν	$\frac{4}{3\sqrt{\pi}}\frac{4^n}{n^{1/2}}$	19	A005558		Ν	$\frac{8}{\pi}\frac{4^n}{n^2}$
8	A151326	₩.	Ν	$\frac{2}{\sqrt{3\pi}} \frac{6^n}{n^{1/2}}$					
9	A151302	:X:	Ν	$\frac{1}{3}\sqrt{\frac{5}{2\pi}}\frac{5^n}{n^{1/2}}$	20	A151265	\checkmark	Y	$\frac{2\sqrt{2}}{\Gamma(1/4)}\frac{3^n}{n^{3/4}}$
10	A151329	翜	Ν	$\frac{1}{3}\sqrt{\frac{7}{3\pi}}\frac{7^n}{n^{1/2}}$	21	A151278	≁	Y	$\frac{3\sqrt{3}}{\sqrt{2}\Gamma(1/4)}\frac{3^n}{n^{3/4}}$
11	A151261		Ν	$\frac{12\sqrt{3}}{\pi} \frac{(2\sqrt{3})^n}{n^2}$	22	A151323	∯	Y	$\frac{\sqrt{23^{3/4}}}{\Gamma(1/4)} \frac{6^n}{n^{3/4}}$
12	A151297	鏉	Ν	$\frac{\sqrt{3}B^{7/2}}{2\pi} \frac{(2B)^n}{n^2}$	23	A060900	Å	Y	$\frac{4\sqrt{3}}{3\Gamma(1/3)}\frac{4^n}{n^{2/3}}$
$A = 1 + \sqrt{2}, \ B = 1 + \sqrt{3}, \ C = 1 + \sqrt{6}, \ \lambda = 7 + 3\sqrt{6}, \ \mu = \sqrt{\frac{4\sqrt{6}-1}{19}}$									

Computerized discovery by enumeration + Hermite-Padé + LLL/PSLQ.
The group of a walk: an example



The characteristic polynomial $\chi_{\mathfrak{S}} := x + \frac{1}{x} + y + \frac{1}{y}$

The group of a walk: an example



The characteristic polynomial $\chi_{\mathfrak{S}} := x + \frac{1}{x} + y + \frac{1}{y}$ is left invariant under

$$\psi(x,y) = \left(x, \frac{1}{y}\right), \quad \phi(x,y) = \left(\frac{1}{x}, y\right),$$

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and thus under any element of the group

$$\langle \psi, \phi \rangle = \left\{ (x, y), \left(x, \frac{1}{y} \right), \left(\frac{1}{x}, \frac{1}{y} \right), \left(\frac{1}{x}, y \right) \right\}.$$

The group of a walk: the general case



The polynomial $\chi_{\mathfrak{S}} := \sum_{(i,j)\in\mathfrak{S}} x^i y^j = \sum_{i=-1}^1 B_i(y) x^i = \sum_{j=-1}^1 A_j(x) y^j$

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The group of a walk: the general case



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and thus under any element of the group

$$\mathcal{G}_{\mathfrak{S}} := \langle \psi, \phi \rangle.$$



Order 4,

18 / 45



Order 4,

order 6,



Order 4,

order 6,

order 8,



Order 4,

order 6,

order 8,

order ∞ .

79 models







The 23 models with a finite group

(i) 16 with a *vertical symmetry*, and group isomorphic to D_2



(ii) 5 with a *diagonal* or *anti-diagonal symmetry*, and group isomorphic to D_3



(iii) 2 with group isomorphic to D_4



(i): vertical symmetry; (ii)+(iii): zero drift $\sum_{s \in \mathfrak{S}} s$ In red, models with algebraic generating functions



$$\begin{split} J &= -\frac{1}{t} + \sum_{(i,j) \in \mathfrak{S}} x^i y^j = x + \frac{1}{x} + y + \frac{1}{y} - \frac{1}{t} \text{ is invariant under} \\ \text{the change of } (x,y) \text{ into, respectively:} \\ & \left(\frac{1}{x}, y\right), \left(\frac{1}{x}, \frac{1}{y}\right), \left(x, \frac{1}{y}\right). \end{split}$$



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"Kernel equation":

J(t;x,y)xytF(t;x,y) = txF(t;x,0) + tyF(t;0,y) - xy



$$J = -\frac{1}{t} + \sum_{(i,j) \in \mathfrak{S}} x^i y^j = x + \frac{1}{x} + y + \frac{1}{y} - \frac{1}{t} \text{ is invariant under the change of } (x, y) \text{ into, respectively:} \\ \left(\frac{1}{x}, y\right), \left(\frac{1}{x}, \frac{1}{y}\right), \left(x, \frac{1}{y}\right).$$

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▷ Implies D-finiteness of F(t; x, y), but does not yield easily an ODE for it

Main results (IV): explicit expressions for the 19 D-finite transcendental models

Theorem [B., Chyzak, van Hoeij, Kauers & Pech 2014]

Let \mathfrak{S} be one of the 19 models with finite group $\mathcal{G}_{\mathfrak{S}}$, and such that the generating series $F = F_{\mathfrak{S}}(t; x, y)$ is not algebraic. Then *F* is expressible using iterated integrals of $_2F_1$ expressions.

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Example (King walks in the quarter plane, A025595)

$$F_{\text{resc}}(t;1,1) = \frac{1}{t} \int_0^t \frac{1}{(1+4x)^3} \cdot {}_2F_1\left(\frac{3}{2} \cdot \frac{3}{2}\right) \left|\frac{16x(1+x)}{(1+4x)^2}\right) dx$$
$$= 1 + 3t + 18t^2 + 105t^3 + 684t^4 + 4550t^5 + 31340t^6 + 219555t^7 + \cdots$$

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 $= 1 + 3t + 18t^{2} + 105t^{3} + 684t^{4} + 4550t^{5} + 31340t^{6} + 219555t^{7} + \cdots$

▷ Computer-driven discovery and proof; no human proof yet.

▷ Proof uses creative telescoping, ODE factorization, ODE solving.

Theorem [B., Rachel & Salvy 2013]

Let \mathfrak{S} be one of the 51 non-singular models with infinite group $\mathcal{G}_{\mathfrak{S}}$. Then $F_{\mathfrak{S}}(t;0,0)$, and in particular $F_{\mathfrak{S}}(t;x,y)$, are non-D-finite. Theorem [B., Rachel & Salvy 2013]

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▷ *Algorithmic proof*. Uses Gröbner basis computations, polynomial factorization, cyclotomy testing.

▷ Based on *two ingredients*: asymptotics + irrationality.

▷ [Kurkova & Raschel 2013] Human proof that $F_{\mathfrak{S}}(t; x, y)$ is non-D-finite. ▷ No human proof yet for $F_{\mathfrak{S}}(t; 0, 0)$ non-D-finite. The 56 models with infinite group



In blue, non-singular models, solved by [B., Raschel & Salvy 2013] In red, singular models, solved by [Melczer & Mishna 2013] [B., Raschel & Salvy 2013]: $F_{\mathfrak{S}}(t;0,0)$ is not D-finite for the models



For the 1st and the 3rd, the excursions sequence $[t^n] F_{\mathfrak{S}}(t;0,0)$

1, 0, 0, 2, 4, 8, 28, 108, 372, ...

is $\sim K \cdot 5^n \cdot n^{-\alpha}$, with $\alpha = 1 + \pi / \arccos(1/4) = 3.383396...$

The *irrationality* of α prevents $F_{\mathfrak{S}}(t;0,0)$ from being D-finite.

Summary - classification of 2D non-singular walks

The Main Theorem Let \mathfrak{S} be one of the 74 non-singular models. The following assertions are equivalent:

- (1) The full generating series $F_{\mathfrak{S}}(t; x, y)$ is D-finite
- (2) the excursions generating series $F_{\mathfrak{S}}(t;0,0)$ is D-finite
- (3) the excursions seq. $[t^n] F_{\mathfrak{S}}(t;0,0)$ is $\sim K \cdot \rho^n \cdot n^{\alpha}$, with $\alpha \in \mathbb{Q}$
- (4) the group $\mathcal{G}_{\mathfrak{S}}$ is finite (and $|\mathcal{G}_{\mathfrak{S}}| = 2 \cdot \min\{\ell \in \mathbb{N}^* \mid \frac{\ell}{\alpha+1} \in \mathbb{Z}\}$)
- (5) the step set 𝔅 has either an axial symmetry, or zero drift and cardinal different from 5.

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Moreover, under (1)–(5), $F_{\mathfrak{S}}(t; x, y)$ is algebraic if and only if the step set \mathfrak{S} has positive covariance $\sum_{(i,j)\in\mathfrak{S}} ij - \sum_{(i,j)\in\mathfrak{S}} i \cdot \sum_{(i,j)\in\mathfrak{S}} j > 0$.

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In this case, $F_{\mathfrak{S}}(t;x,y)$ is expressible using nested radicals. If not, $F_{\mathfrak{S}}(t;x,y)$ is expressible using iterated integrals of $_2F_1$ expressions.

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Main methods

(1) for proving algebraicity / D-finiteness

- (1a) Guess'n'Prove
- (1b) Diagonals of rational functions
- (2) for proving non-D-finiteness
 - (2a) Infinite number of singularities, or lacunary
 - (2b) Asymptotics

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Hermite-Padé approximants Creative telescoping

(2) for proving non-D-finiteness

- (2a) Infinite number of singularities, or lacunary
- (2b) Asymptotics

▷ All methods are *algorithmic*.

Guess'n'Prove
Methodology for proving algebraicity

Experimental mathematics -Guess'n'Prove- approach:

(S1) Generate data

(S2) Conjecture

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compute a high order expansion of the series $F_{\mathfrak{S}}(t; x, y)$;

(S2) Conjecture

guess candidates for minimal polynomials of $F_{\mathfrak{S}}(t; x, 0)$ and $F_{\mathfrak{S}}(t; 0, y)$, using Hermite-Padé approximation;

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+ Efficient Computer Algebra

Step (S1): high order series expansions

 $f_{\mathfrak{S}}(n; i, j)$ satisfies the recurrence with constant coefficients

$$f_{\mathfrak{S}}(n+1;i,j) = \sum_{(u,v)\in\mathfrak{S}} f_{\mathfrak{S}}(n;i-u,j-v) \quad \text{for} \quad n,i,j \ge 0$$

+ init. cond. $f_{\mathfrak{S}}(0; i, j) = \delta_{0, i, j}$ and $f_{\mathfrak{S}}(n; -1, j) = f_{\mathfrak{S}}(n; i, -1) = 0$.

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Example: for the Kreweras walks,

$$k(n + 1; i, j) = k(n; i + 1, j) + k(n; i, j + 1) + k(n; i - 1, j - 1)$$



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▷ Recurrence is used to compute $F_{\mathfrak{S}}(t; x, y) \mod t^N$ for large *N*.

$$\begin{split} \mathsf{K}(t;x,y) &= 1 + xyt + (x^2y^2 + y + x)t^2 + (x^3y^3 + 2xy^2 + 2x^2y + 2)t^3 \\ &+ (x^4y^4 + 3x^2y^3 + 3x^3y^2 + 2y^2 + 6xy + 2x^2)t^4 \\ &+ (x^5y^5 + 4x^3y^4 + 4x^4y^3 + 5xy^3 + 12x^2y^2 + 5x^3y + 8y + 8x)t^5 + \cdots \end{split}$$

Step (S2): guessing equations for $F_{\mathfrak{S}}(t; x, y)$, a first idea

In terms of generating series, the recurrence on k(n; i, j) reads

$$(xy - (x + y + x^2y^2)t)K(t; x, y) = xy - xt K(t; x, 0) - yt K(t; 0, y)$$
 (KerEq)

▷ A similar kernel equation holds for $F_{\mathfrak{S}}(t; x, y)$, for any \mathfrak{S} -walk.

Corollary. $F_{\mathfrak{S}}(t; x, y)$ is algebraic (resp. D-finite) if and only if $F_{\mathfrak{S}}(t; x, 0)$ and $F_{\mathfrak{S}}(t; 0, y)$ are both algebraic (resp. D-finite).

▷ Crucial simplification: equations for G(t; x, y) are huge (≈30Gb)

Step (S2): guessing equations for $F_{\mathfrak{S}}(t; x, 0) \& F_{\mathfrak{S}}(t; 0, y)$

Task 1: Given the first *N* terms of $S = F_{\mathfrak{S}}(t; x, 0) \in \mathbb{Q}[x][[t]]$, search for a *differential equation* satisfied by *S* at precision *N*:

$$c_r(x,t) \cdot \frac{\partial^r S}{\partial t^r} + \cdots + c_1(x,t) \cdot \frac{\partial S}{\partial t} + c_0(x,t) \cdot S = 0 \mod t^N.$$

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- Both tasks amount to linear algebra in size *N* over $\mathbb{Q}(x)$.
- In practice, we use modular Hermite-Padé approximation (Beckermann-Labahn algorithm) combined with (rational) evaluation-interpolation and rational number reconstruction.
- Fast (FFT-based) arithmetic in $\mathbb{F}_p[t]$ and $\mathbb{F}_p[t]\langle \frac{t}{\partial t}\rangle$.

Step (S2): guessing equations for G(t; x, 0) and G(t; 0, y)

Using N = 1200 terms of G(t; x, y), we guessed candidates

• $\mathcal{P}_{x,0}$ in $\mathbb{Z}[x, t, T]$ of degree (32, 43, 24), coefficients of 21 digits • $\mathcal{P}_{0,y}$ in $\mathbb{Z}[y, t, T]$ of degree (40, 44, 24), coefficients of 23 digits

such that

 $\mathcal{P}_{x,0}(x,t,G(t;x,0)) = \mathcal{P}_{0,y}(y,t,G(t;0,y)) = 0 \mod t^{1200}.$

⁺ of order 11, and bidegree (96,78) for G(t; x, 0), and (68,28) for G(t; 0, y)

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▷ We actually first guessed *differential equations*[†], then computed their *p*-curvatures to empirically certify them. This led to suspect the algebraicity of G(t; x, 0) and G(t; 0, y), using a conjecture of Grothendieck (on differential equations modulo *p*) as an oracle.

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▷ Guessing $\mathcal{P}_{x,0}$ by *undetermined coefficients* would require solving a dense linear system of size ≈ 100 000, and ≈ 1000 digits entries!

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Theorem.
$$g(t) := G(\sqrt{t}; 0, 0) = \sum_{n=0}^{\infty} \frac{(5/6)_n (1/2)_n}{(5/3)_n (2)_n} (16t)^n$$
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1. Such a *P* can be *guessed* from the first 100 terms of g(t).

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$$r(t) = \sum_{n=0}^{\infty} r_n t^n$$
 being algebraic, it is D-finite, and so is (r_n) :

$$(n+2)(3n+5)r_{n+1} - 4(6n+5)(2n+1)r_n = 0, \quad r_0 = 1$$

⇒ solution
$$r_n = \frac{(5/6)_n (1/2)_n}{(5/3)_n (2)_n} 16^n = g_n$$
, thus $g(t) = r(t)$ is algebraic.

Step (S3): rigorous proof for Kreweras walks

 $\stackrel{!}{=} 0$

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$$y_0 = \frac{x - t - \sqrt{x^2 - 2tx + t^2(1 - 4x^3)}}{2tx^2} = t + \frac{1}{x}t^2 + \frac{x^3 + 1}{x^2}t^3 + \cdots$$
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$$\underbrace{(xy - (x + y + x^2y^2)t)}_{(xy - 1)}K(t; x, y) = xy - xtK(t; x, 0) - ytK(t; 0, y)$$

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- 4. Resultant computations + verification of initial terms $\implies U = H(t, x)$ also satisfies (RKerEq).
- 5. Uniqueness: $H(t, x) = K(t; x, 0) \implies K(t; x, 0)$ is algebraic!

Algebraicity of Kreweras walks: our Maple proof in a nutshell

```
[bostan@inria ~]$ maple
    1\^/1
              Maple 19 (APPLE UNIVERSAL OSX)
. [\] . Copyright (c) Maplesoft, a division of Waterloo Maple Inc. 2014
\ MAPLE / All rights reserved. Maple is a trademark of
 <____> Waterloo Maple Inc.
              Type ? for help.
# HIGH ORDER EXPANSION (S1)
> st,bu:=time(),kernelopts(bytesused):
> f:=proc(n.i.i)
 option remember:
    if i<0 or j<0 or n<0 then 0
    elif n=0 then if i=0 and j=0 then 1 else 0 fi
    else f(n-1,i-1,j-1)+f(n-1,i,j+1)+f(n-1,i+1,j) fi
  end:
> S:=series(add(add(f(k,i,0)*x^i,i=0..k)*t^k,k=0..80),t,80):
# GUESSING (S2)
> libname:=".",libname:gfun:-version();
                                       3.62
> gfun:-seriestoalgeq(S,Fx(t)):
> P:=collect(numer(subs(Fx(t)=T,%[1])),T):
# RIGOROUS PROOF (S3)
> ker := (T,t,x) -> (x+T+x^2*T^2)*t-x*T:
> pol := unapply(P,T,t,x):
> p1 := resultant(pol(z-T,t,x),ker(t*z,t,x),z):
> p2 := subs(T=x*T,resultant(numer(pol(T/z,t,z)),ker(z,t,x),z)):
> normal(primpart(p1,T)/primpart(p2,T));
                                         1
# time (in sec) and memory consumption (in Mb)
> trunc(time()-st),trunc((kernelopts(bytesused)-bu)/1000^2);
                                     7, 617
                                      Alin Bostan
                                                    Efficient Experimental Mathematics for Lattice Path Combinatorics
```

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Step (S3): rigorous proof for Gessel walks

Same philosophy, but several complications:

- stepset diagonal symmetry is lost: $G(t; x, y) \neq G(t; y, x)$;
- *G*(*t*; 0, 0) occurs in (KerEq);
- equations are ≈ 5000 times bigger.
- \rightarrow replace equation (RKerEq) by a system of 2 reduced kernel equations.
- \rightarrow fast algorithms needed (e.g., [B., Flajolet, Salvy & Schost 2006] for computations with algebraic series).



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Fast computation of special resultants

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> Received 3 September 2003; accepted 9 July 2005 Available online 25 October 2005

Summary

- © 2D classification of F(t; 0, 0) and F(t; x, y) is fully completed
- © robust algorithmic methods, based on computer algebra algorithms:
 - Guess'n'Prove
 - Creative Telescoping for integration of rational functions
- © Brute-force and/or use of naive algorithms = hopeless. E.g. size of algebraic equations for $G(t; x, y) \approx 30$ Gb.
- © Remarkable properties discovered experimentally. E.g.:

all algebraic models have solvable Galois groups

w

$$\begin{aligned} G(t;1,1) &= -\frac{3}{6t} + \frac{\sqrt{3}}{6t} \sqrt{U(t) + \sqrt{\frac{16t(2t+3)+2}{(1-4t)^2 U(t)} - U(t)^2 + 3}} \\ \text{where} \quad U(t) &= \sqrt{1+4t^{1/3}(4t+1)^{1/3}/(4t-1)^{4/3}}. \end{aligned}$$

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$$\begin{split} G(t;1,1) &= -\frac{3}{6t} + \frac{\sqrt{3}}{6t} \sqrt{U(t)} + \sqrt{\frac{16t(2t+3)+2}{(1-4t)^2U(t)}} - U(t)^2 + 3 \\ \text{where} \quad U(t) &= \sqrt{1+4t^{1/3}(4t+1)^{1/3}/(4t-1)^{4/3}}. \end{split}$$

- © lack of "purely human" proofs for many results. E.g.: ${}_{2}F_{1}s$ expressions for F(t; 1, 1); asymptotics of f_{n}
- $\ensuremath{\textcircled{}}$ still missing a unified proof of: finite group \leftrightarrow D-finite
- © open: is F(t; 1, 1) non-D-finite in the 51 non-singular models with infinite group?

Extensions

- 3D walks [B., Bousquet-Mélou, Kauers & Melczer 2014] Many distinct models: 11 074 225 (instead of 79)
 - We focus on the 20 804 models with at most 6 steps.
 - [B. & Kauers, 2009] conjectured 35 D-finite. Now proved.
 - 116 new D-finite models: guessed, then proved.
 - New phenomenon (empirically discovered, no proof yet): 19 models (e.g. 3D Kreweras) with finite group, but possibly non-D-finite GF (?!)

- ▷ Longer 2D steps [B., Bousquet-Mélou & Melczer 2014]
 - 680 models with one large step, 643 proved non D-finite, 32 of 37 have differential equations guessed.
 - 5910 models with two large steps, 5754 proved non D-finite, 69 of 156 have differential equations guessed.

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Thanks for your attention!