# Computational Variations on Linear Differential Equations

### Bruno Salvy Bruno.Salvy@inria.fr

Algorithms Project, Inria



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# Computer Algebra

- Effective mathematics (what can we compute?);
- their complexity (how fast?).

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- their complexity (how fast?).

Thesis in this talk: linear differential equations are a good data-structure.

# Menu dégustation

- Dynamic Dictionary of Mathematical Functions
- Fast numerical evaluation
- Algebraic series and matters of size
- Combinatorial walks
- Automatic proofs of identities

# I Dynamic Dictionary of Mathematical Functions

# Dynamic Dictionary of Mathematical Functions



 In the beginning, there were handbooks of identities.
 Among the most cited documents in the scientific literature.
 Thousands of useful mathematical formulas, computed, compiled and edited by hand.

# Dynamic Dictionary of Mathematical Functions



- **1** In the beginning, there were handbooks of identities.
- Then, came computer algebra. Computation with exact mathematical objects.

Several million users.

30 years of algorithmic progress in effective mathematics.

# Dynamic Dictionary of Mathematical Functions



- In the beginning, there were handbooks of identities.
- 2 Then, came computer algebra.
- Last, came the Web. New kinds of interaction with documents.

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#### Aim of the project

DDMF = Mathematical Handbooks + Computer Algebra + Web

- Develop and use computer algebra algorithms to generate the formulas;
- Provide web-like interaction with the document and the computation.

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

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Heavy work by F. Chyzak

# **II** Fast Numerical Evaluation

Fast Fourier Transform (Gauss, Cooley-Tuckey, Schönhage-Strassen)

Two integers of *n* digits can be multiplied with  $O(n \log n \log \log n)$  bit operations.

Applications (in the 70's & 80's) (Brent, Schroeppel, Chudnovsky<sup>2</sup>):

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$$n! = \underbrace{n \times \cdots \times \lceil n/2 \rceil}_{\text{size } O(n \log n)} \times \underbrace{\lfloor n/2 \rfloor \times \cdots \times 1}_{\text{size } O(n \log n)}$$

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- any linear recurrence of order 1 (coeffs in  $\mathbb{Q}(n)$ ): idem;
- arbitrary order: same idea, same cost (matrix factorial).

# Numerical Evaluation of Solutions of LDEs

Principle:



f solution of a LDE with coefficients in  $\mathbb{Q}(x)$  (our data-structure!)

- linear recurrence in N for the first sum (easy);
- tight bounds on the tail (technical);
- no numerical roundoff errors.

The technique used for recent records of  $\pi$ :

$$\frac{1}{\pi} = \frac{12}{C^{3/2}} \sum_{n=0}^{\infty} \frac{(-1)^n (6n)! (A+nB)}{(3n)! n!^3 C^{3n}}$$

with A = 13591409, B = 545140134, C = 640320.

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Analytic Continuation: compute  $f(x), f'(x), \ldots, f^{(d)}(x)$  as new initial conditions and handle propagation of errors.

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Ad.: Marc Mezzarobba's package NumGfun; his defense next Thursday at École polytechnique.

# III Algebraic Series and Matters of Size

# Algebraic Series can be Computed Fast

$$P(X,Y) \in \mathbb{Q}[X,Y]$$
 irreducible, deg  $P = D$ ,  $S \in \mathbb{Q}[[X]]$ ,

$$P(X,S)=0.$$

Wanted: first N coefficients of S, for large N.

Application: combinatorics (context-free languages).

Idea:

- S satisfies a LDE of order  $\leq D$  (Abel, Cockle, Harley, Tannery);
- translate into a linear recurrence;
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Idea:

- S satisfies a LDE of order  $\leq D$  (Abel, Cockle, Harley, Tannery); Algorithm:
  - invert  $P_Y \mod P$  in  $\mathbb{Q}(X)[Y]$ ;
  - 2  $S' = P_Y^{-1}(S)P_X(S) = Q_1(S)$  with deg<sub>Y</sub>  $Q_1 < \deg_Y P$ ;
  - **3** obtain  $S^{(i)} = Q_i(S)$  for i = 2, ..., d, with  $\deg_Y Q_i < \deg_Y P$ ;
  - linear algebra to eliminate  $S^2, \ldots, S^{d-1}$ .
- translate into a linear recurrence;
- unroll the recurrence  $\rightarrow O(N)$  operations.

Question: dependence on D?

# Minimality has a cost







Creative telescoping: an algorithm for differentiation under  $\int$  and integration by parts.

• Find  $\Lambda = A(z, \partial_z) + \partial_y B(z, \partial_z, y, \partial_y)$  s.t.  $\Lambda \cdot F = 0$ ;

2 return A.



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Bounds by counting dimensions

$$z^i \partial_z^j \partial_y^k \cdot F = rac{Q}{P^{j+k+1}}, \qquad \deg Q \leq i + (j+k+1)D.$$



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$$z^i \partial_z^j \partial_y^k \cdot F = rac{Q}{P^{j+k+1}}, \quad \deg Q \le i + (j+k+1)D.$$
  
Taking  $i \le N_z, j+k \le N_\partial,$   
 $\dim(\mathsf{lhs}) = (N_z+1) inom{N_\partial+2}{2}, \quad \dim(\mathsf{rhs}) = inom{(N_\partial+1)D + N_z + 2}{2}.$ 



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• Find 
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Bounds by counting dimensions

$$z^i \partial_z^j \partial_y^k \cdot F = rac{Q}{P^{j+k+1}}, \qquad \deg Q \leq i + (j+k+1)D.$$

Taking  $i \leq N_z$ ,  $j + k \leq N_\partial$ ,  $N_z = 4D^2$ ,  $N_\partial = 4D$ ,

$$\dim(\mathsf{lhs}) = (N_z + 1) \binom{N_\partial + 2}{2} > \dim(\mathsf{rhs}) = \binom{(N_\partial + 1)D + N_z + 2}{2}$$

# IV Combinatorial Walks

# Gessel's Walks in the 1/4 plane

$$G(x, y, t) := \sum_{n \ge 0} \sum_{i,j} f_{i,j;n} x^i y^j t^n$$



- 79 inequivalent step sets;
- long history of special cases;
- Gessel's was left;
- conjectured **not** soln of LDE.

#### Bostan-Kauers 2010

G is algebraic!

Computer-driven discovery and proof

# Computation





- Compute G up to  $t^{1000}$ ;
- conjecture LDE with 1.5 billion coeffs!;
- check for sanity (bit size, more coeffs, Fuchsian, p-curvature);
- Oho!
- conjecture polynomials (deg  $\leq$  (45, 45, 25), 25 digit coeffs);
- Proof by (big) resultants.

Minimal polynomial  $\approx$  30 Gb (but unnecessary).

# V Automatic Proofs of Identities

# Examples of Identities

 $\sum_{j=0}^{n}$ 

$$\sum_{k=0}^{n} {\binom{n}{k}}^{2} {\binom{n+k}{k}}^{2} = \sum_{k=0}^{n} {\binom{n}{k}} {\binom{n+k}{k}} \sum_{j=0}^{k} {\binom{k}{j}}^{3} \quad [Strehl92]$$

$$\int_{0}^{+\infty} x J_{1}(ax) I_{1}(ax) Y_{0}(x) K_{0}(x) \, dx = -\frac{\ln(1-a^{4})}{2\pi a^{2}} \quad [GlMo94]$$

$$\frac{1}{2\pi i} \oint \frac{(1+2xy+4y^{2}) \exp\left(\frac{4x^{2}y^{2}}{1+4y^{2}}\right)}{y^{n+1}(1+4y^{2})^{\frac{3}{2}}} \, dy = \frac{H_{n}(x)}{\lfloor n/2 \rfloor!} \quad [Doetsch30]$$

$$\sum_{k=0}^{n} \frac{q^{k^{2}}}{(q;q)_{k}(q;q)_{n-k}} = \sum_{k=-n}^{n} \frac{(-1)^{k}q^{(5k^{2}-k)/2}}{(q;q)_{n-k}(q;q)_{n+k}} \quad [And rews74]$$

$$\sum_{i=0}^{n-j} \frac{q^{(i+j)^{2}+j^{2}}}{(q;q)_{n-i-j}(q;q)_{i}(q;q)_{j}} = \sum_{k=-n}^{n} \frac{(-1)^{k}q^{7/2k^{2}+1/2k}}{(q;q)_{n-k}(q;q)_{n-k}} \quad [Paule85].$$

# More Identities

$$\sum_{k=0}^{n} \binom{n}{k} i(k+i)^{k-1} (n-k+j)^{n-k} = (n+i+j)^{n} \quad [Abel1826]$$

$$\sum_{k=0}^{n} (-1)^{m-k} k! \binom{n-k}{m-k} \binom{n+1}{k+1} = \binom{n}{m}, \quad [Frobenius1910]$$

$$\sum_{k=0}^{m} \binom{m}{k} B_{n+k} = (-1)^{m+n} \sum_{k=0}^{n} \binom{n}{k} B_{m+k}, \quad [Gessel03]$$

$$\sum_{k=0}^{\infty} x^{k-1} \zeta(n,\alpha+\beta x) \, dx = \beta^{-k} B(k,n-k) \zeta(n-k,\alpha),$$

$$\int_{0}^{\infty} x^{\alpha-1} \operatorname{Li}_{n}(-xy) \, dx = \frac{\pi (-\alpha)^{n} y^{-\alpha}}{\sin(\alpha \pi)},$$

$$\int_{0}^{\infty} x^{s-1} \exp(xy) \Gamma(a,xy) \, dx = \frac{\pi y^{-s}}{\sin((a+s)\pi)} \frac{\Gamma(s)}{\Gamma(1-a)}$$

# Computer Algebra Algorithms

#### Aim

- Prove these identities automatically (fast?);
- Compute the rhs given the lhs;
- Explain why these identities exist.

### Examples:

- 1st slide: Zeilberger's algorithm and variants;
- 2nd slide (1st 3): Majewicz, Kauers, Chen & Sun;
- last 3: recent generalization of previous ones (with Chyzak & Kauers).

#### Ideas

Confinement in finite dimension + Creative telescoping.

# Framework: Ore polynomials

$$(fg)' = f'g + fg', \quad \Delta_n(f_ng_n) = f_{n+1}\Delta_n(g_n) + \Delta_n(f_n)g_n,$$
  
q-analogues of these and many more

are captured by  $\mathbb{A}\langle \partial \rangle$  ( A integral domain) with commutation

 $\partial a = \sigma(a)\partial + \delta(a),$ 

 $\sigma$  ring morphism,  $\delta \sigma$ -derivation  $(\delta(ab) = \sigma(a)\delta(b) + \delta(a)b)$ .

Main property

$$P, Q \in \mathbb{A}\langle \partial 
angle$$
, then deg  $PQ = \deg P + \deg Q$ .

Consequences:

- In one variable:
  - Euclidean division;
  - Euclidean algorithm (gcrd, lclm).
- In several variables (allow for mixed diff-diff):
  - Gröbner bases.

Gröbner bases as a data-structure to encode special functions

# Example: Contiguity of Hypergeometric Series

$$F(a,b;c;z) = \sum_{n=0}^{\infty} \underbrace{\frac{(a)_n(b)_n}{(c)_n n!}}_{u_{a,n}} z^n, \qquad (x)_n := x(x+1)\cdots(x+n-1).$$

$$\frac{u_{a,n+1}}{u_{a,n}} = \frac{(a+n)(b+n)}{(c+n)(n+1)} \to z(1-z)F'' + (c-(a+b+1)z)F' - abF = 0,$$
$$\frac{u_{a+1,n}}{u_{a,n}} = \frac{n}{a} + 1 \to S_aF := F(a+1,b;c;z) = \frac{z}{a}F' + F.$$

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Bruno Salvy Computational Variations on Linear Differential Equations

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$$\frac{u_{a,n+1}}{u_{a,n}} = \frac{(a+n)(b+n)}{(c+n)(n+1)} \xrightarrow{u_{a,n}} z(1-z)F'' + (c-(a+b+1)z)F' - abF = 0,$$

$$\frac{u_{a+1,n}}{u_{a,n}} = \frac{n}{a} + 1 \xrightarrow{\int} S_a F = F(a+1,b;c;z) = \frac{z}{a}F' + F.$$
Gauss 1812: contiguity relation.  

$$\dim = 2 \Rightarrow S_a^2 F, S_a F, F \text{ linearly dependent:}$$
(Coordinates in  $\mathbb{Q}(a, b, c, z).$ )

$$(a+1)(z-1)S_a^2F + ((b-a-1)z+2-c+2a)S_aF + (c-a-1)F = 0.$$

# **Closure** Properties



### Proposition

$$\begin{split} \dim \operatorname{ann}(f+g) &\leq \max(\dim \operatorname{ann} f, \dim \operatorname{ann} g),\\ \dim \operatorname{ann}(fg) &\leq \dim \operatorname{ann} f + \dim \operatorname{ann} g,\\ \dim \operatorname{ann} \partial f &\leq \dim \operatorname{ann} f. \end{split}$$

 $\label{eq:algorithms} \mbox{Algorithms by linear algebra} simple definitions \rightarrow data-structures for more complicated functions$ 

# Example: Mehler's Identity for Hermite Polynomials

$$\sum_{n=0}^{\infty} H_n(x) H_n(y) \frac{u^n}{n!} = \frac{\exp\left(\frac{4u(xy - u(x^2 + y^2))}{1 - 4u^2}\right)}{\sqrt{1 - 4u^2}}$$

- Definition of Hermite polynomials (D-finite over Q(x)): recurrence of order 2;
- Product by linear algebra: H<sub>n+k</sub>(x)H<sub>n+k</sub>(y)/(n + k)!, k ∈ ℕ generated over Q(x, n) by

$$\frac{H_n(x)H_n(y)}{n!}, \frac{H_{n+1}(x)H_n(y)}{n!}, \frac{H_n(x)H_{n+1}(y)}{n!}, \frac{H_{n+1}(x)H_{n+1}(y)}{n!}$$

 $\rightarrow$  recurrence of order at most 4;

**③** Translate into differential equation.



# Creative Telescoping (Zeilberger 90)

Creative telescoping="differentiation" under integral+"integration" by parts

Ex.: 
$$\int_0^1 \frac{\cos zt}{\sqrt{1-t^2}} dt = \frac{\pi}{2} J_0(z), \quad (\underbrace{zJ_0''+J_0'+zJ_0}_{A(z,\partial_z)\cdot J_0} = 0, \ J_0(0) = 1).$$

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# Creative Telescoping (Zeilberger 90)

Creative telescoping="differentiation" under integral+"integration" by parts Ex.:  $\int_{2}^{1} \frac{\cos zt}{\sqrt{1-t^2}} dt = \frac{\pi}{2} J_0(z), \quad (\underline{zJ_0''+J_0'+zJ_0}=0, \ J_0(0)=1).$  $I(z) = \int_0^1 \frac{\cos zt}{\sqrt{1-t^2}} \, dt, \quad I'(z) = \int_0^1 -t \frac{\sin zt}{\sqrt{1-t^2}} \, dt,$  $I''(z) = \int_0^1 -t^2 \frac{\cos zt}{\sqrt{1-t^2}} dt = -I(z) + \int_0^1 \sqrt{1-t^2} \cos zt \, dt,$  $I''(z) + I(z) = \left[\sqrt{1-t^2}\frac{\sin zt}{z}\right]_0^1 + \int_0^1 \frac{t}{\sqrt{1-t^2}}\frac{\sin zt}{z}\,dt = -\frac{I'(z)}{z}.$ ann  $\frac{\cos zt}{\sqrt{1-t^2}} \ni \underline{A(z,\partial_z)} - \partial_t \underbrace{\frac{t^2-1}{t}}_{t} \partial_z$ anything 24 / 31

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# Creative Telescoping (Zeilberger 90)

Creative telescoping= "differentiation" under integral+ "integration" by parts Ex.:  $\int_{0}^{1} \frac{\cos zt}{\sqrt{1-t^{2}}} dt = \frac{\pi}{2} J_{0}(z), \quad (\underbrace{zJ_{0}'' + J_{0}' + zJ_{0}}_{A(z,\partial_{z}) \cdot J_{0}} = 0, \ J_{0}(0) = 1).$   $\operatorname{ann} \frac{\cos zt}{\sqrt{1-t^{2}}} \ni \underbrace{A(z,\partial_{z})}_{\operatorname{no} t,\partial_{t}} - \partial_{t} \underbrace{\frac{t^{2} - 1}{t}}_{\operatorname{certificate}} \partial_{z}$ 

### Creative Telescoping

Input: generators of (a subideal of) ann f; Output: A, B such that  $A - \partial_t B \in \text{ann } f$ , A free of  $t, \partial_t$ . Algorithm: sometimes. (Why would they exist?)

Telescoping of  $\mathcal{I}$  wrt t:

 $T_t(\mathcal{I}) := (\mathcal{I} + \partial_t \mathbb{Q}(z, t) \langle \partial_z, \partial_t \rangle) \cap \mathbb{Q}(z) \langle \partial_z \rangle.$ 

# Creative Telescoping (Zeilberger 90)

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$$\int_0^1 \frac{\cos zt}{\sqrt{1-t^2}} dt = \frac{\pi}{2} J_0(z), \quad (\underbrace{zJ_0''+J_0'+zJ_0}_{A(z,\partial_z)\cdot J_0} = 0, \ J_0(0) = 1).$$

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### Telescoping of $\mathcal{I}$ wrt t:

$$T_t(\mathcal{I}) := (\mathcal{I} + \partial_t \mathbb{Q}(z, t) \langle \partial_z, \partial_t \rangle) \cap \mathbb{Q}(z) \langle \partial_z \rangle.$$

Note: holonomy is a sufficient condition for

 $0 \neq (\mathcal{I} + \partial_t \mathbb{Q}(z) \langle \partial_z, \partial_t \rangle) \cap \mathbb{Q}(z) \langle \partial_z \rangle.$ 

# Example: Discovering Pascal's Triangle Automatically

Bruno Salvy

$$(S_n S_k - S_k - 1) \cdot {\binom{n}{k}} = 0 = (\underbrace{S_n - 2}_{\text{no } k, S_k} + (S_k - 1) \underbrace{(\underbrace{S_n - 1}_{\text{certificate}}) \cdot {\binom{n}{k}}.$$
  
Sum over  $k \Rightarrow (\underbrace{S_n - 2}_{k}) \sum_k {\binom{n}{k}} = 0.$ 

Computational Variations on Linear Differential Equations

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$$(S_nS_k-S_k-1)\cdot \binom{n}{k}=0=(S_n-2+(S_k-1)(S_n-1))\cdot \binom{n}{k}.$$

Reduce all monomials of degree  $\leq s = 2$ :

$$1 \to 1, \quad S_n \to \frac{n+1}{n+1-k} 1, \quad S_k \to \frac{n-k}{k+1} 1$$

$$S_n^2 \to \frac{(n+2)(n+1)}{(n+2-k)(n+1-k)} 1, \quad S_k^2 \to \frac{(n-k-1)(n-k)}{(k+2)(k+1)} 1,$$

$$S_n S_k \to \frac{n+1}{k+1} 1.$$

Common denominator:  $D_2 = (k+1)(k+2)(n+1-k)(n+2-k)$ .

$$D_2, D_2S_n, D_2S_k, D_2S_n^2, D_2S_k^2, D_2S_nS_k$$
 confined in  
 $\operatorname{Vect}_{\mathbb{Q}(n)}(1, k1, k^{2}1, k^{3}1, k^{4}1).$ 

certificate

### Example: Discovering Pascal's Triangle Automatically

$$(S_nS_k-S_k-1)\cdot \binom{n}{k}=0=(S_n-2+(S_k-1)\underbrace{(S_n-1)}_{\text{certificate}})\cdot \binom{n}{k}.$$

Reduce all monomials of degree  $\leq s = 2$ :

$$1 \to 1, \quad S_n \to \frac{n+1}{n+1-k} 1, \quad S_k \to \frac{n-k}{k+1} 1$$

$$S_n^2 \to \frac{(n+2)(n+1)}{(n+2-k)(n+1-k)} 1, \quad S_k^2 \to \frac{(n-k-1)(n-k)}{(k+2)(k+1)} 1,$$

$$S_n S_k \to \frac{n+1}{k+1} 1.$$

Common denominator:  $D_2 = (k+1)(k+2)(n+1-k)(n+2-k)$ .

$$D_2, D_2S_n, D_2S_k, D_2S_n^2, D_2S_k^2, D_2S_nS_k$$
 confined in  
 $\operatorname{Vect}_{\mathbb{Q}(n)}(1, k1, k^{2}1, k^{3}1, k^{4}1).$ 

This has to happen for some degree: deg  $D_s = O(s)$ .

# Polynomial Growth

### Definition (Polynomial Growth p)

There exists a sequence of polynomials  $P_s$ , s.t. for all  $(a_1, \ldots, a_k)$  with  $a_1 + \cdots + a_k \leq s$ ,  $P_s \partial_1^{a_1} \cdots \partial_k^{a_k}$  reduces to a combination of elements below the stairs with polynomial coefficients of degree  $O(s^p)$ .

### Theorem (ChyzakKauersSalvy2009)

dim  $T_t(\mathcal{I}) \leq \max(\dim \mathcal{I} + p - 1, 0).$ 

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dim  $T_t(\mathcal{I}) \leq \max(\dim \mathcal{I} + p - 1, 0).$ 

Proof. Same as above. Set  $q := \dim \mathcal{I} + p$ .

- In degree s, dim  $O(s^q)$  below stairs.
- Number of monomials in  $\partial_t, \partial_{i_1}, \ldots, \partial_{i_q}$ :  $O(s^{q+1})$ ;
- $\Rightarrow$  any q variables linearly dependent  $\Rightarrow$  dim  $\leq q 1$ .

This proof gives an algorithm. Also, bounds available.

# Examples (all with p = 1)

• Proper hypergeometric [Wilf & Zeilberger 1992]:

$$Q(n,k)\xi^{k}\frac{\prod_{i=1}^{u}(a_{i}n+b_{i}k+c_{i})!}{\prod_{i=1}^{v}(u_{i}n+v_{i}k+w_{i})!}$$



*Q* polynomial,  $\xi \in \mathbb{C}$ ,  $a_i, b_i, u_i, v_i$  integers.

- Differential D-finite (definite integration);
- Stirling: ok for  $n \ge 3$ , e.g., Frobenius:

$$\sum_{k=0}^{n} (-1)^{m-k} k! \binom{n-k}{m-k} \begin{Bmatrix} n+1 \\ k+1 \end{Bmatrix} = \begin{Bmatrix} n \\ m \end{Bmatrix}.$$

• Abel type: dim = 2  $\rightarrow$  ok for  $n \ge$  4, e.g., Abel:

$$\sum_{k=0}^{n} \binom{n}{k} i(k+i)^{k-1}(n-k+j)^{n-k} = (n+i+j)^{n}.$$

# **VI** Conclusion

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  - $\bullet~$  Confinement in vector spaces +~ creative telescoping  $\rightarrow~$  identities.
- Also:
  - q-analogues;
  - Fast algorithms: Zeilberger 1990 (hypergeom); Chyzak 2000 (D-finite) Us 2009 (non-D-finite).
  - $\bullet \ \ \mathsf{Bounds} \to \mathsf{identities};$
  - Fast algorithms for special classes;
  - Efficient numerical evaluation.



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