

A Survey of Program Termination: Practical and Theoretical Challenges

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Termination of Linear Programs

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Instance: $\langle \mathbf{a}; \mathbf{u}; \mathbf{M} \rangle$ over \mathbb{Z} or \mathbb{Q}

Question: Does this program terminate?

Termination of Linear Programs

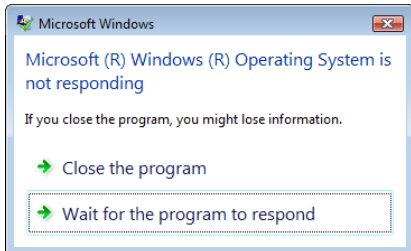
Much work on this and related problems in the literature over the last three decades:

- Manna, Pnueli, Kannan, Lipton, Sagiv, Podelski, Rybalchenko, Cook, Dershowitz, Tiwari, Braverman, Kovács, Ben-Amram, Genaim, ...
- Approaches include:
 - linear ranking functions
 - size-change termination methods
 - spectral techniques
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- Tools include:

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If \mathbf{M} has dimension 5×5 or less, Termination is decidable.

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If \mathbf{M} is diagonalisable and has dimension 9×9 or less, Termination is decidable.

Reachability/Invariance/Approximation in Markov Chains

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Markov Chain Problem

Instance: $\langle \text{stochastic matrix } \mathbf{M}; r \in (0, 1] \rangle$

Question: Does $\exists T$ s.t. $\forall n \geq T, (1, 0, \dots, 0) \cdot \mathbf{M}^n \cdot \begin{pmatrix} 0 \\ \vdots \\ 0 \\ 1 \end{pmatrix} \geq r$?

Positivity and Zeros of Linear Recurrence Sequences

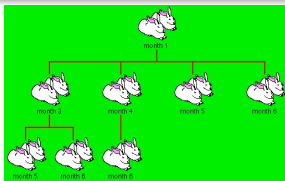
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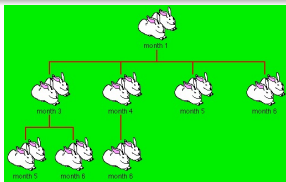
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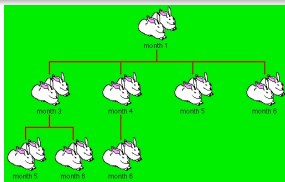


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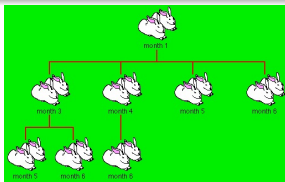


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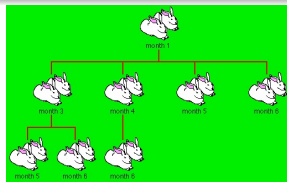


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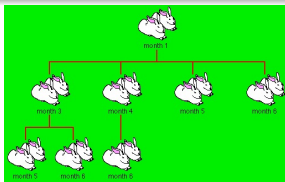


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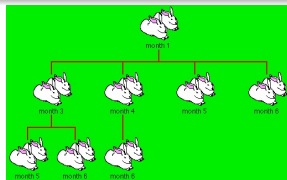
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- Fibonacci has **order 2** \iff matrix **M** has **dimension** 2×2
- Fibonacci sequence is **simple** \iff **M** is **diagonalisable**

Linear Recurrence Sequences

- Numbers $\langle u_0, u_1, u_2, \dots \rangle$ form a **linear recurrence sequence** if there exist k and constants a_1, \dots, a_k , such that

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- Let $\lambda_1, \lambda_2, \dots, \lambda_m \in \mathbb{C}$ be the characteristic roots. There exist polynomials $p_1(x), p_2(x), \dots, p_m(x) \in \mathbb{C}[x]$ such that

$$u_n = p_1(n)\lambda_1^n + p_2(n)\lambda_2^n + \dots + p_m(n)\lambda_m^n$$

In general $\lambda_1, \dots, \lambda_k$ and all coefficients of $p_1(x), \dots, p_m(x)$ are algebraic numbers

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- If the linear recurrence sequence is **simple** then the polynomials $p_1(x), \dots, p_m(x)$ are all **constant**

Decision Problems for Linear Recurrence Sequences

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Skolem Problem

Does $\exists n$ such that $u_n = 0$?

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Ultimate Positivity Problem

Does $\exists T$ such that, $\forall n \geq T, u_n \geq 0$?

Related Work and Applications

- Theoretical biology
 - Analysis of L-systems
 - Population dynamics
- Software verification
 - Termination of linear programs
- Probabilistic model checking
 - Reachability, invariance, and approximation in Markov chains
 - Stochastic logics
- Quantum computing
 - Threshold problems for quantum automata
- Economics
- Combinatorics
- Discrete linear dynamical systems
- Statistical physics
- ...

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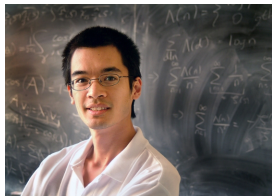
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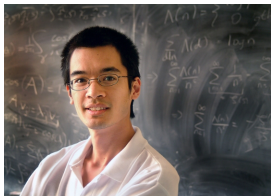
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“... a mathematical embarrassment ...”

Richard Lipton

The Skolem-Mahler-Lech Theorem

Theorem (Skolem 1934; Mahler 1935, 1956; Lech 1953)

The set of zeros of a linear recurrence sequence is semilinear:

$$\{n : u_n = 0\} = F \cup A_1 \cup \dots \cup A_\ell$$

where F is finite and each A_i is a full arithmetic progression.

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Theorem (Berstel and Mignotte 1976)

In Skolem-Mahler-Lech, the infinite part (arithmetic progressions A_1, \dots, A_ℓ) is fully constructive.

The Skolem Problem at Low Orders

Skolem Problem

Does $\exists n$ such that $u_n = 0$?

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Critical ingredient is Baker's theorem for linear forms in logarithms, which earned Baker the Fields Medal in 1970.



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Decidability for order 5 was announced in 2005 by four Finnish mathematicians in a technical report (as yet unpublished). Their proof appears to have a serious gap.

The Positivity and Ultimate Positivity Problems

- Positivity and Ultimate Positivity open since at least 1970s

"In our estimation, these will be very difficult problems."

Matti Soittola

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Decidability of Positivity \Rightarrow decidability of Skolem.

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In *Colloquium Mathematicum* 128:1 (2012), Tangsupphathawat, Punnim, and Laohakosol claimed decidability of Positivity and Ultimate Positivity for order 4 (and noted being stuck for order 5). Unfortunately, their proof contains a major error.

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Positivity is decidable for order 5 or less.

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Theorem

At order 6, for both Positivity and Ultimate Positivity, proof of decidability would entail major breakthroughs in analytic number theory (Diophantine approximation of transcendental numbers).

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For **simple** linear recurrence sequences of order 9 or less, Positivity is decidable.

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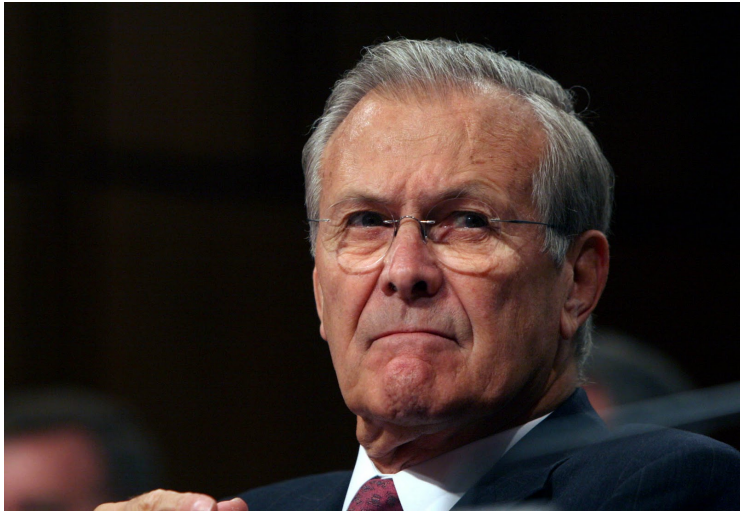
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- In the general case, complexity is in PSPACE and $\text{co}\exists\mathbb{R}$ -hard.



"There are things that we know we don't know. . ."

Donald Rumsfeld

Diophantine Approximation

How well can one approximate a real number x with rationals?

$$\left| x - \frac{p}{q} \right|$$

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Moreover, $\frac{1}{\sqrt{5}}$ is the best possible constant that will work for all real numbers x .

Diophantine Approximation

Definition

Let $x \in \mathbb{R}$. The **Lagrange constant** $L_\infty(x)$ is:

$$L_\infty(x) = \inf \left\{ c : \left| x - \frac{p}{q} \right| < \frac{c}{q^2} \text{ has infinitely many solutions} \right\} .$$

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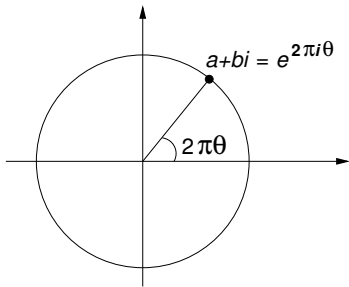
Almost nothing else is known about any specific irrational number!

Hardness

Let $\mathcal{T} = \{\theta \in (0, 1) : e^{2\pi i\theta} \in \mathbb{Q}(i)\} \setminus \{\frac{1}{4}, \frac{1}{2}, \frac{3}{4}\}$

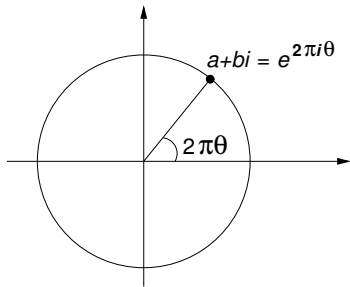
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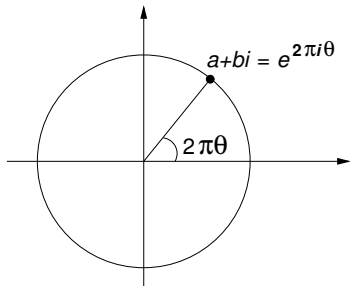
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Theorem

Suppose that Ultimate Positivity is decidable for integer linear recurrence sequences of order 6. Then for any $\theta \in \mathcal{T}$, $L_\infty(\theta)$ is computable.

Positivity of Simple LRS: Algorithm Sketch

Theorem

For simple linear recurrence sequences:

- *Ultimate Positivity is decidable for all orders.*
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- 3 Check individually whether $u_0 \geq 0, u_1 \geq 0, \dots, u_{T-1} \geq 0$.

Lower Bounds in Diophantine Approximation

Theorem (Dirichlet 1842)

There are infinitely many integers p, q such that $\left| x - \frac{p}{q} \right| < \frac{1}{q^2}$.

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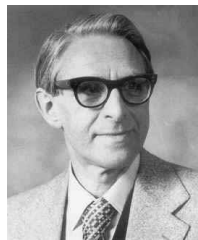
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Let $x \in \mathbb{R}$ be algebraic. Then for any $\varepsilon > 0$ there are finitely many integers p, q such that

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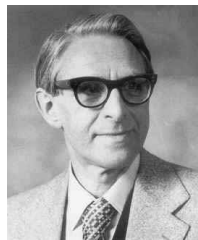
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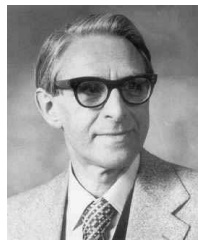
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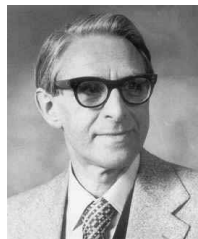
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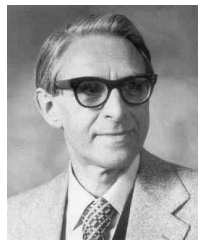
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- \Rightarrow Evertse, van der Poorten, and Schlickewei's **lower bounds on sums of S -units** (1984–1985)

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- Constructive proof requires Baker's Theorem (!)

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- **No constructive proof is known !**

Lower Bounds on Sums of S -Units and Simple Linear Recurrence Sequences

We use complex algebraic-integer extensions of such results to study expressions of the form:

$$u_n = c_1 \lambda_1^n + c_2 \lambda_2^n + \dots + c_k \lambda_k^n + r(n)$$

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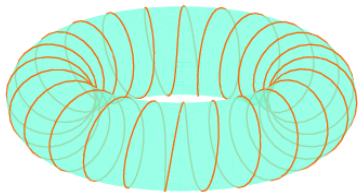
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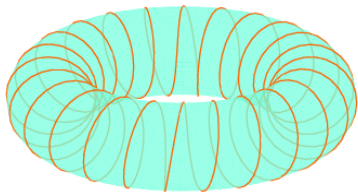


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$$u_n = c_1 \lambda_1^n + c_2 \lambda_2^n + \dots + c_k \lambda_k^n$$

$$f(z_1, z_2, \dots, z_k) = c_1 z_1 + c_2 z_2 + \dots + c_k z_k$$



Main Tools and Techniques

- Algebraic and analytic number theory, Diophantine geometry
 - p -adic techniques
 - Baker's theorem on linear forms in logarithms
 - Kronecker's theorem on simultaneous Diophantine approximation
 - Masser's results on multiplicative relationships among algebraic numbers
 - Schmidt's Subspace theorem and Schlickewei's p -adic extension
 - Sums of S -units techniques
 - Gelfond-Schneider theorem
 - Other Diophantine geometry and approximation techniques
- Real algebraic geometry

Decision and Synthesis Problems for Linear Dynamical Systems

- A fresh look at an old area
- Lots of cool problems
- Lots of interesting mathematics
- Many connections to variety of other fields