

Algorithms, Complexity, Verification:  
From Cook and Karp to Vardi;  
or, a Brief Glimpse of the Skolem Landscape

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*“Tractable Problems  $\equiv$  Polynomial Time”*



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**In contrast to popular belief, proving termination is not always impossible.**

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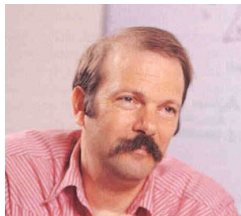
**BY BYRON COOK, ANDREAS PODELSKI,  
AND ANDREY RYBALCHENKO**

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# Proving Program Termination

*“Any verification problem worth its salt is at least PSPACE-hard!”*

Moshe Y. Vardi



# Termination of Linear Loops

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x := 1;  
y := 0;  
z := 0;  
while x  $\neq$  0 do  
  x := 2x + y;  
  y := y + 3 - z;  
  z := -4z + 6;
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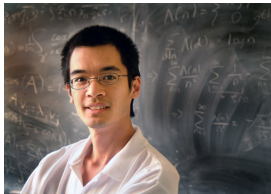
## Positivity Problem:

```
x := a;  
while  $x_1 \geq 0$  do  
  x := Mx;
```

# Skolem and Positivity: Open for About 90 Years!

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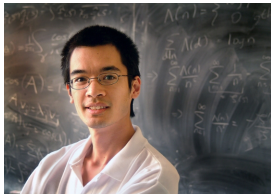
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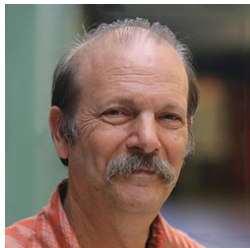


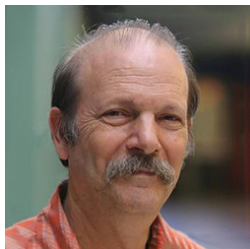
*"A mathematical embarrassment . . ."*

*"Arguably, by some distance, the most prominent problem whose decidability status is currently unknown."*

Richard Lipton

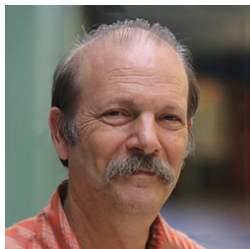
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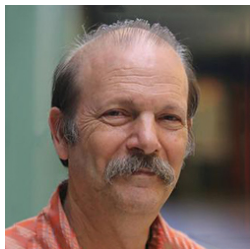
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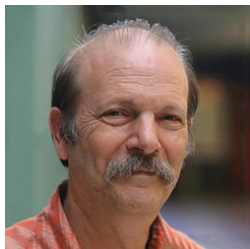
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LICS 2018 / LMCS 2022



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LICS 2018 / LMCS 2022

we are now in a position to proceed with our equivalence:

**Theorem 5.11.** *EBP is Equivalent to Positivity.*

*Proof.* We first show that Positivity reduces to EBP. Let  $(u_n)_{n \in \mathbb{N}}$  be an LRS of order  $d$ : we



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In the world of Verification:

Skolem	$\approx$	NP
Positivity	$\approx$	PSPACE

## On Skolem-hardness and saturation points in Markov decision processes

### Summary

optimization problem on MDPs	threshold problem Skolem-hard (Positivity-hard) for	exponential-time algorithm using a saturation point for
partial SSPP	weights in $\mathbb{Z}$	weights in $\mathbb{N}$ [Chen et al., 2013]
conditional SSPP	weights in $\mathbb{Z}$	weights in $\mathbb{N}$ [Baier et al., 2017]
conditional value-at-risk for the classical SSPP	weights in $\mathbb{Z}$	weights in $\mathbb{N}$
long-run probability	regular co-safety properties	constrained reachability $a \text{ U } b$ [Baier, Bertrand, Piribauer, Sankur, 2019]
model checking of frequency-LTL	$\Pr_{\mathcal{M}}^{\max}(G_{\text{inf}}^{>\vartheta}(\varphi)) = 1?$ for an LTL-formula $\varphi$	$\Pr_{\mathcal{M}}^{\max}(G_{\text{inf}}^{>\vartheta}(a \text{ U } b)) = 1?$

## A4.D — On Decidability of Time-bounded Reachability in CTMDPs

### Main Results

- The time-bounded reachability problem for CTMDPs is decidable assuming Schanuel's conjecture.
- The bounded continuous Skolem problem reduces to checking if the time-bounded reachability problem has a stationary optimal policy.

## Probabilistic Programs over finite fields

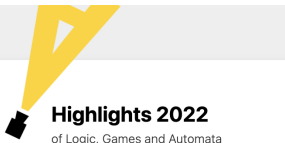
## Our contributions

$$\text{INDEP}_q \Leftrightarrow \text{EQUIV}_q$$

$$\text{NI-EQUIV}_q \Leftrightarrow \text{EQUIV}_q$$

	$\text{EQUIV}_x$	$\text{NI-MAJ}_x$	$\text{MAJ}_x$
$x = q$	$\text{coNP}^{\text{C=P}}$ -complete	PP-complete	$\text{coNP}^{\text{PP}}$ -complete
$x = q^\infty$	$2\text{-EXP}$ $\text{coNP}^{\text{C=P}}$ -hard	$\leq_{\text{EXP}}$ POSITIVITY	?





## Highlights 2022

of Logic, Games and Automata

### Wednesday 16h10–17h40: Contributed talks II

#### Skolem Problem (Amphitheatre 2A)

- ▶ Joris Nieuwveld: Progress on the Skolem Problem
- ▶ George Kenison: On the Skolem Problem for Reversible Sequences
- ▶ Arka Ghosh: Orbit-Finite Systems of Linear Equations
- ▶ James Worrell: The Pseudo-Reachability Problem for Linear Dynamical Systems
- ▶ Isa Vialard: On the Cartesian Product of Well-Orderings
- ▶ Edon Kelmendi: Computing the Density of the Positivity Set for Linear Recurrence Sequences
- ▶ Klara Nosan: The Membership Problem for Hypergeometric Sequences with Rational Parameters
- ▶ Nikhil Balaji: Identity Testing for Radical Expressions

# The Skolem Landscape





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## SKOLEM

simple

***Decidable***

*(subject to Skolem Conjecture  
& p-adic Schanuel Conjecture)*

***Independent  
correctness  
certificates***

non-simple

**?**

*(watch this space!)*

## POSITIVITY

simple

**???**

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***Diophantine  
hard!***



Want more? Come to our LICS talk, Tuesday 10am!

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## SKOLEM: Solves the Skolem Problem for simple integer LRS

### System Explanation [Show/Hide](#)

- On the first line write the coefficients of the recurrence relation, separated by spaces.
- On the second line write an equal number of space-separated initial values.
- The LRS must be simple, non-degenerate, and not the zero LRS.
- The tool will output all zeros (at both positive and negative indices), along with a completeness certificate.

### Input Format

$a_1 a_2 \dots a_k$   
 $u_0 u_1 \dots u_{k-1}$

where:

$$u_{n+k} = a_1 \cdot u_{n+k-1} + a_2 \cdot u_{n+k-2} + \dots + a_k \cdot u_n$$

### Input area

Auto-fill examples: [Show/Hide](#)

[Zero LRS](#) [Degenerate LRS](#) [Non-simple LRS](#) [Trivial](#) [Fibonacci](#) [Tribonacci](#) [Berstel sequence \[1\]](#) [Order 5 \[3\]](#) [Order 6 \[3\]](#) [Reversible order 8 \[3\]](#)

Manual input:

```
6 -25 66 -120 150 -89 18 -1
0 0 -48 -120 0 520 624 -2016
```

- Always render full LRS (otherwise restricted to 400 characters)
- I solemnly swear the LRS is non-degenerate (skips degeneracy check, it will timeout or break if the LRS is degenerate!)
- Factor subcases (merges subcases into single linear set, sometimes requires higher modulo classes)
- Use GCD reduction (reduces initial values by GCD)
- Use fast identification of mod-m (requires GCD reduction) (may result in non-minimal mod-m argument)

[Go](#) [Clear](#) [Stop](#)

### Output area

Zeros: 0, 1, 4

Zero at 0 in (0+1Z) [hide/show](#)

○ p-adic non-zero in (0+136Z<sub>136</sub>)

○ Zero at 1 in (1+136Z) [hide/show](#)

- p-adic non-zero in (1+680Z<sub>680</sub>) ((0+5Z<sub>680</sub>) of parent)
  - Non-zero mod 3 in (137+680Z) ((1+5Z) of parent)
  - Non-zero mod 3 in (273+680Z) ((2+5Z) of parent)
  - Non-zero mod 9 in (409+680Z) ((3+5Z) of parent)
  - Non-zero mod 3 in (545+680Z) ((4+5Z) of parent)
- Non-zero mod 7 in (2+136Z)

=====

```
LRS: u_{n} =
-271613116171209744858663205589463470401509550890641913636354546754097691!
1) +
-5087571794255306088464927613320696582397187501636529439512475370723924495!
2) +
-10206640015864118991519942651944720249221599840966743554793056867782008052!
3) +
-14120956624060003103644967151812606672989015750648229312685175908046543759!
4) +
19069558947732071036098426589409142237569423390915870196544610694372734670Z:
5) +
```