# The Density of Positive Entries of a Linear Recurrence

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# I. The Problem **II. The Theorems** III. The Example, or First Observation

## IV. The Proof

## V. The Open Problem

# I. The Problem

 $x \leftarrow 0; y \leftarrow 6; z \leftarrow 4$ while true do  $x \leftarrow 4x + 3y$  $y \leftarrow 4y - 3x$  $z \leftarrow 5z$ if y + z > 0 then Region A else **Region** B end if end while

arbitrary number of variables ranging over integers

• linear updates

### polynomial inequality

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- (Is there at least one ?)

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### Set of

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- 3. How big is it inside  $\mathbb{N}$  ?



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 $\mathcal{D}_{\circ}(S):=\liminf_{n
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What proportion of first n numbers are in S ( $n \rightarrow \infty$ )?

Examples:

- $\mathcal{D}_{\circ}($  Finite Set)=0 ,
- $\mathcal{D}_{\circ}(\operatorname{Arithmetic} \operatorname{progression} \operatorname{of} \operatorname{length} k) = 1/k$ .
- $\mathcal{D}_{\circ}(\text{Geometric progression}) = 0$ ,
- $\mathcal{D}_{\circ}(\text{Primes}) = 0$ , (Prime Number Theorem).

## Density

### $\mathcal{D}_{\circ}(\text{ co-Finite Set}) = 1$

# $n \rightarrow \infty$

 $S \subset \mathbb{N}$ 

What proportion of first n numbers are in S ( $n \rightarrow \infty$ )?

# $\operatorname{if} \mathcal{D}_{\circ}(X) = \mathcal{D}^{\circ}(X), ext{ denote by } \mathcal{D}(X)$

## Density

 $\mathcal{D}_{\circ}(S):=\liminfrac{|\{1,2,\ldots,n\}\cap S|}{}$  $\boldsymbol{n}$ 

## $\mathcal{D}_{\circ}(X) = 0 \Rightarrow X \text{ is sparse}$ $\mathcal{D}_{\circ}(X) = 1 \Rightarrow X \text{ is very dense}$





### Number of $\square$ in first n entries

 $n \in \mathbb{N}$ 

 $\boldsymbol{\mathcal{N}}$ 



Jason P Bell and Stefan Gerhold. On the positivity set of a linear recurrence sequence. Israel Journal of Mathematics, 157(1):333-345, 2007.



## Number of in first *n* entries

### $\boldsymbol{\mathcal{N}}$

### Exists due to:

### Denote it by $\mathcal{D}$ . Main character of the story

# II. The Theorems

## Theorem 1. " $\mathcal{D} = 0$ ?" is decidable. (so is " $\mathcal{D} = 1$ ?" by symmetry) **Theorem 1a.** For diagonalisable update matrices: $\mathcal{D} = 0 \Leftrightarrow \text{finitely many}$

## **Theorem 2.** D can be computed to arbitrary precision.

Theorem 3. " $\mathcal{D} \in \mathbb{Q}$ ?" is decidable, when there are at most three dominant eigenvalues.

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too rarely



To Summarise:

• We can decide if Region A is entered not

• We can say a lot about the asymptotic frequency of entering Region A/Region B





# III. The Example, or First Observation

### How frequently is Region A entered?

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# $0.732279\dots = rac{\cos^{-1}(-2/3)}{}$ $\pi$







y+z in the nth loop iteration

$$\begin{array}{ccc} 4/5 & -3/5 & 0 \\ 3/5 & 4/5 & 0 \\ 0 & 0 & 1 \end{array}^n$$

D rotation

$$r(\cos heta,\sin heta)\cdotigg( egin{array}{ccc} \cosarphi & \sinarphi \ -\sinarphi & \cosarphi \ \end{array} igg) = r(\cosarphi) = r(\cosarphi) = r(\cosarphi)$$



 $egin{aligned} & \sin heta \cos arphi + \sin heta \cos arphi) \ & \cos( heta + arphi), \sin( heta + arphi)) \end{aligned}$ 



Rotation in the first two coordinates by  $\varphi = \cos^{-1} 4/5$








$$x \leftarrow 0; y \leftarrow 6; z \leftarrow 4$$
  
while true do  
$$x \leftarrow 4x + 3y$$
$$y \leftarrow 4y - 3x$$
$$z \leftarrow 5z$$
if  $y + z > 0$  then  
Region A  
else  
Region B  
end if  
end while





#### How frequently are we on the red arc?



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Theorem (Weyl, 1910). Let  $\rho$  be an irrational real number. Then the sequence:  $\rho$ , 2 $\rho$ , 3 $\rho$ , ... is uniformly distributed mod 1.





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$$\frac{\text{h of }}{2\pi} = \frac{\cos^{-1}(-2/3)}{\pi} = 0.732278$$





Update Matrix

### Scheme

#### Rotations on the circle



# Weyl's equidistribution



# Scheme

?





Rotations on the circle



Weyl's equidistribution

?

# Scheme





Rotations on the circle



Weyl's equidistribution

Rotations on a subgroup of  $\mathbb{T}^n$ 

A stronger version of Weyl's theorem + Koiran's approximation of volumes of definable sets

# IV. The Proof















#### By Jordan decomposition





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 $\mathcal{D} := ext{density of } \{n : u_n > 0\}$ 

 $\frown$  positivity set of  $(u_n)_{n\in\mathbb{N}}$ 





# $l \in \{0, 1, \ldots, T-1\}$ Split the problem: $(u_{nT+l})_{n \in \mathbb{N}}$ ,

#### where the smaller problems (i.e. subsequences) have some good properties

# Preprocessing

- compute some large period T





# Preprocessing

- sometimes there may be multiplicative relations among  $\lambda$ : integers  $z_1, \ldots, z_d$  such that:

In the subsequences all the dependencies are gathered

To understand the good property of the subsequences, note:  $u_n = \sum_{i=1}^d P_i(n) \;\; \lambda_i^n$ 

 $\lambda_1^{z_1}\lambda_2^{z_2}\cdots\lambda_d^{z_d}=1$ 

so e.g.  $\lambda_d^{z_d}$  can be written as a product of integer powers of other roots





#### Good property: the subsequences have the same sign as



- $lpha_i\in ar{\mathbb{Q}}, \ |lpha_i|=1$
- $c_i \in \mathbb{Q}$
- $q_{i,j} \in \mathbb{Q}$

Furthermore, the group

$$ig\{(z_1,\ldots,z_k)\in\mathbb{Z}^k\ :\ lpha_1^{z_1}lpha_2^{z_2}\cdotslpha_k^{z_k}=1ig\}=ig\{$$
independent

is trivial.



 $lpha_i=e^{2\pi {f i}\, heta_i}$ 



 $(lpha_1^n, lpha_2^n, \dots, lpha_k^n), \quad n \in \mathbb{N}$ 



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#### E.g. for k=2



# Rotations

 $(lpha_1^n, lpha_2^n, \dots, lpha_k^n), \quad n \in \mathbb{N}$ 







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 $\{ heta_1,\ldots, heta_k,1\}$  $(lpha_1^n, lpha_2^n, \dots, lpha_k^n), \quad n \in \mathbb{N}$ are linearly independent over Q

> Theorem (Kronecker).  $(n\theta_1 \mod 1, \ldots, n\theta_k \mod 1), n \in \mathbb{N}$ is dense in the hypercube





The amount of time spent in X is proportional to vol(X)

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> **Theorem** (Weyl, 1912).  $(n\theta_1 \mod 1, \ldots, n\theta_k \mod 1), n \in \mathbb{N}$ is equidistributed in the hypercube









The amount of time spent in X is proportional to vol(X)

Density of  $\{n : (n\theta_1 \mod 1, \ldots, n\theta_k \mod 1) \in X\} = vol(X)$ 

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 $\sum c_i lpha_i^n + \sum c_i \prod lpha_j^{q_{i,j}} + c + R(n),$  $n\in\mathbb{N}$  $i{\in}D$  $j{\in}I$  $i \in I$ 



 $\operatorname{vol}(U) > 0 \iff U \neq \emptyset$ 



# Density of $\{n : D(n) > 0\} = \operatorname{vol}(U)$

An equivalent statement can be decided with Tarski's algo

 $\sum c_i lpha_i^n + \sum c_i \prod lpha_j^{q_{i,j}} + c + R(n), \qquad n \in \mathbb{N}$  $i{\in}D$  $j \in I$  $i \in I$ 



so we can decide if the density of the positivity set of D(n) is nonzero



# Density of $\{n : D(n) > 0\} = \operatorname{vol}(U)$

# $\operatorname{vol}(U) > 0 \iff U \neq \emptyset$

An equivalent statement can be decided with FO of reals

 $\sum_{i=1}^{n}c_ilpha_i^n+\sum_{i=1}^{n}c_i\prod_{j=1}^{n}lpha_j^{q_{i,j}}+c+R(n),\qquad n\in\mathbb{N}$  $\overline{i{\in}I}$   $i{\in}D$   $j{\in}I$ 

#### *We need*: Density of $\{n : D(n) + R(n) > 0\}$
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D(n)

# We need: Density of $\{$ When is |D(r)|

Difficult problem: Depends on diophantine properties of  $\alpha$  (Main obstruction to decidability of Skolem, Positivity, etc.)

$$\{n : D(n) + R(n) > 0\}$$
  
 $i)| < |R(n)|?$ 

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$$D(n)|<|R(n)|\}=0$$

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# Density of $\{n : | I\}$

- Density of  $\{n:$ due to Skolem-
- $\lim_{n \to \infty} |R(n)| = 0$  polynomially fast

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# Diagonalisable Matrices

When M is diagonalisable:  $\lim_{n \to \infty} |R(n)| = 0$  exponentially fast

In this case, the p-adic subspace theorem implies:

— not effective

there is some N, such that for all n > N|D(n)| > |R(n)|.

D(n)+R(n)>0 for infinitely many n if and only if D(n)>0 for infinitely many n

 $\sum_{i\in I}c_ilpha_i^n+\sum_{i\in D}c_i\prod_{j\in I}lpha_j^{q_{i,j}}+c+R(n),$ D(n)



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### Theorem 1a does not hold for nondiagonalisable matrices.

Joël Ouaknine 💿, James Worrell 💿: Ultimate Positivity is Decidable for Simple Linear Recurrence Sequences. ICALP (2) 2014: 330-341

**Theorem 1a.** For diagonalisable update matrices:  $\mathcal{D} = 0 \Leftrightarrow \text{finitely many} \blacksquare$ 







open 0 Here  $D(\bullet) > 0$ 

can be even transcendental

# Density of $\{n : D(n) > 0\} = \operatorname{vol}(U)$

# How to approximate the volume of U?



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# Approximate volume number of • number of •



How to approximate the volume of U?

1.How to make a grid such that  $\bullet \in U$  can be decided

2. How fine should the grid be for  $|approx - vol| < \epsilon$ ?

Pascal Koiran: Approximating the Volume of Definable Sets. FOCS 1995: 134-141



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there is also a Monte-Carlo type algorithm



# Theorem 2. $\mathcal{D}$ can be computed to arbitrary precision.

# Approximate volume number of • number of •







# < PSPACE</li> when number of variables (order of LRS) is fixed, < PTIME</li> > co-NP

# V. The Open Problem



## , Can be rational, algebraic, or transcendental

# If $\mathcal{D} \notin \mathbb{Q}$ we can use the approximation algorithm

If  $\mathcal{D} \in \mathbb{Q}$  then we can probably compute it directly



# , Can be rational, algebraic, or transcendental

# Can we decide whether $\mathcal{D} \in \mathbb{Q}$ ?

# Decide whether $\mathcal{D} \in \mathbb{Q}$

# When there are no multiplicative relations:



polytope

# Decide whether $\mathcal{D} \in \mathbb{Q}$

# the problem reduces to:

 $T_n(\cos heta) = \cos(n heta)$ 

- When there are at most three dominant eigenvalues,

  - Given  $\alpha \in \mathbb{Q}$ , decide whether  $\cos^{-1}(\alpha) \in \mathbb{Q}\pi$ 
    - for some n, a is a root of  $T_n(x) 1$  or  $T_n(x) + 1$



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# **IV. The Proof**



**Theorem 2.**  $\mathcal{D}$  can be computed to arbitrary precision.

# Thank You

Theorems



