

# Guessing with Little Data

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## OEIS A172671

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- ▶ Nature of the generating function?

## Nature of the Sequence

**Answer 1:** Denote by  $c_i$  ( $1 \leq i \leq 21$ ) the number of rows of type  $i$ :

$$a_n = \sum_{\substack{0 \leq c_1, \dots, c_{21} \leq n \\ + \text{lin. constraints}}} \binom{3n}{c_1, c_2, \dots, c_{21}}$$

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How to construct this recurrence / ODE?

# Guessing

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**Ansatz:**  $c_0 a_n + c_1 a_{n+1} + \cdots + c_r a_{n+r} = 0$

leads to a linear system  $M \cdot x = 0$  with

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- ▶ To trust the result, we need  $N - r + 1 \geq (r + 1)(d + 1)$ .
- ▶ For sequence A172671 we know only 33 terms, i.e. we can try  $(r, d) = (1, 15), (2, 9), (3, 6), (4, 5), (6, 3), (7, 2), (10, 1), (16, 0)$ .

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→ Employ a lattice reduction algorithm (LLL, BKZ, ...).

## Lattice Basis

Let  $v_1, \dots, v_\ell \in \mathbb{Z}^m$ . They generate a lattice

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- ▶ Clearing denominators is not enough.
- ▶ We need a basis of the  $\mathbb{Z}$ -module  $\ker_{\mathbb{Z}} M$ .

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A lattice reduction algorithm computes a basis  $w_1, \dots, w_\ell$  of  $\mathcal{L}$  that consists of short vectors.

**Caveat:** Before we had computed a  $\mathbb{Q}$ -vector space basis of  $\ker M$ .

- ▶ Clearing denominators is not enough.
- ▶ We need a basis of the  $\mathbb{Z}$ -module  $\ker_{\mathbb{Z}} M$ .
- ▶ It can be computed, e.g. using the Hermite normal form.

# Algorithm

**Input:**  $a_0, \dots, a_N \in \mathbb{Q}$ , and  $r, d \in \mathbb{N}$

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## The Generic Case

**Theorem** [Bombieri–Vaaler, 1983] Let  $M \in \mathbb{Z}^{k \times m}$  with  $k < m$ , and let  $g$  be the gcd of all  $k \times k$  minors of  $M$ . Then  $\ker_{\mathbb{Z}} M$  contains a nonzero element  $x \in \mathbb{Z}^m$  with

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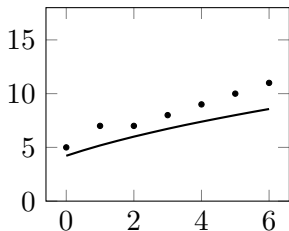
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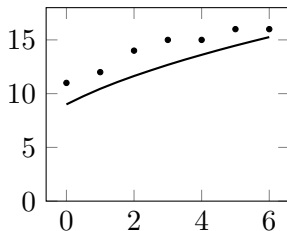
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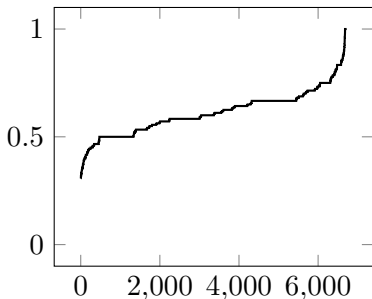
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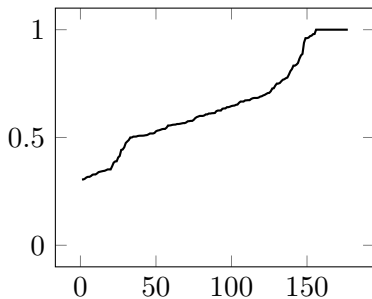
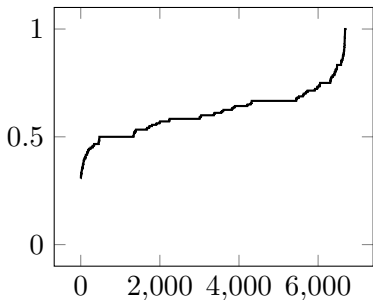
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# Result for A172671

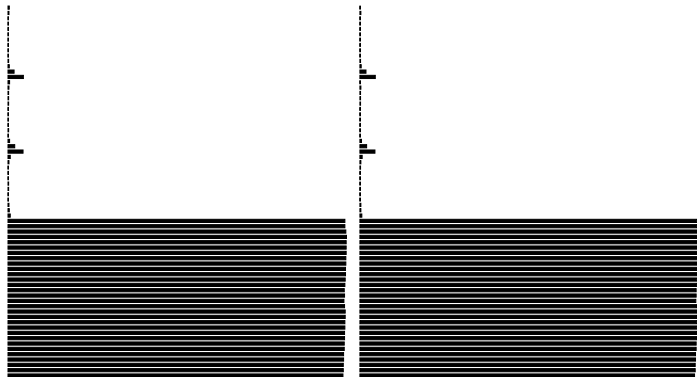
Trustworthy?

$$\begin{aligned} & 416745(n+2)(3n+4)(3n+5)(3n+7)(3n+8)(3n+10)(3n+11)(3n+13)(3n+14) \\ & \quad \times (3784n^4 + 62436n^3 + 384549n^2 + 1047914n + 1066254)a_n \\ & \quad + 9(3n+7)(3n+8)(3n+10)(3n+11)(3n+13)(3n+14) \\ & \quad \quad \times (29681696n^7 + 712360704n^6 + 7253307424n^5 \\ & \quad \quad \quad + 40621828312n^4 + 135172900470n^3 + 267337368752n^2 \\ & \quad \quad \quad \quad + 291083104767n + 134667010044)a_{n+1} \\ & \quad \quad \quad - 9(n+3)(3n+10)(3n+11)(3n+13)(3n+14) \\ & \quad \quad \quad \times (10844944n^8 + 309080904n^7 + 3833838118n^6 \\ & \quad \quad \quad \quad + 27035659722n^5 + 118560795930n^4 + 331121212914n^3 \\ & \quad \quad \quad \quad + 575194973415n^2 + 568260550317n + 244478848756)a_{n+2} \\ & \quad \quad \quad \quad - (n+3)(n+4)^3(3n+13)(3n+14) \\ & \quad \quad \quad \quad \times (3799136n^7 + 98777536n^6 + 1092573240n^5 \\ & \quad \quad \quad \quad + 6662600832n^4 + 24184813590n^3 + 52244190090n^2 \\ & \quad \quad \quad \quad \quad + 62174897623n + 31442101253)a_{n+3} \\ & \quad \quad \quad \quad \quad \quad + (n+3)(n+4)^3(n+5)^5 \\ & \quad \quad \quad \quad \quad \quad \quad \times (3784n^4 + 47300n^3 + 219945n^2 \\ & \quad \quad \quad \quad \quad \quad \quad \quad + 450988n + 344237)a_{n+4} \end{aligned}$$

90  
202410  
747558000  
3536978063850  
19292117692187340  
115428185943399529200  
737005538936597762145600  
4937928427617947420104982250  
34335031273255183438800013252500  
245885257930209910994050195049583660  
1803606070619313418263028665207782889600  
13495472374334172242190334756526625738793200  
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6194061046984488807137976612543476252072240088843168000  
48930886220271330542271419741692768122929164062703692950250  
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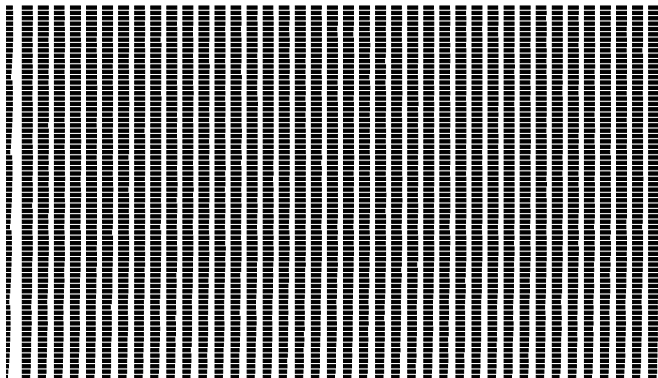
## Result for A172671

First two vectors of  $\ker_{\mathbb{Z}} M$ :



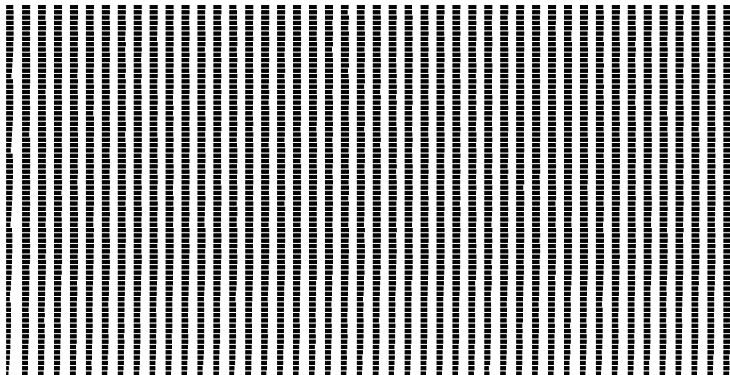
## Result for A172671

LLL-basis of  $\ker_{\mathbb{Z}} M$ , using  $N = 33$ :



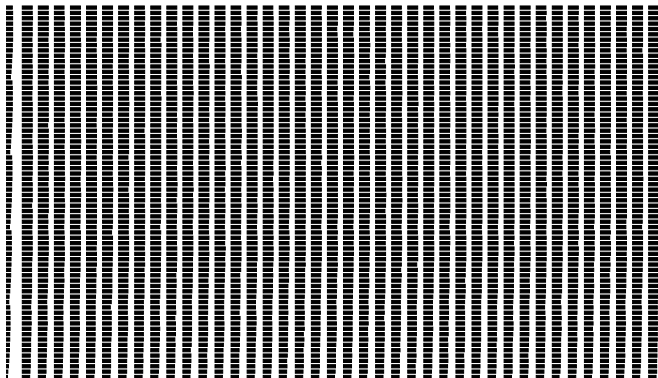
## Result for A172671

LLL-basis of  $\ker_{\mathbb{Z}} M$ , using  $N = 28$ :

The image displays a grid of 28 vertical bars, each representing a vector in the LLL-basis of the kernel of matrix M over the integers. The bars are arranged in a single row and are separated by small gaps. Each bar is composed of a sequence of small black squares, with the total height of each bar varying slightly, indicating the magnitude of the components in the basis vectors.

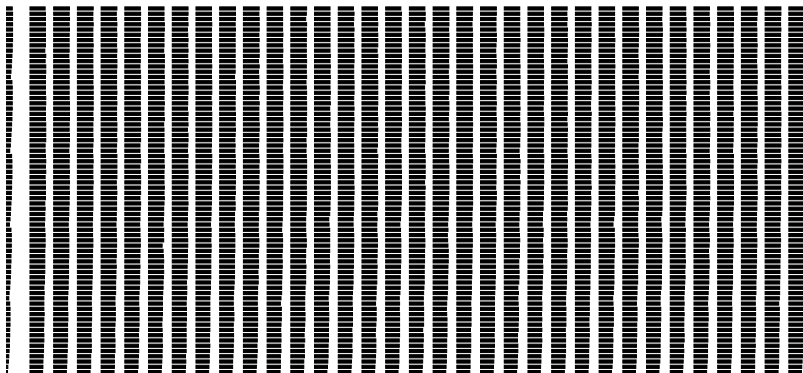
## Result for A172671

LLL-basis of  $\ker_{\mathbb{Z}} M$ , using  $N = 33$ :



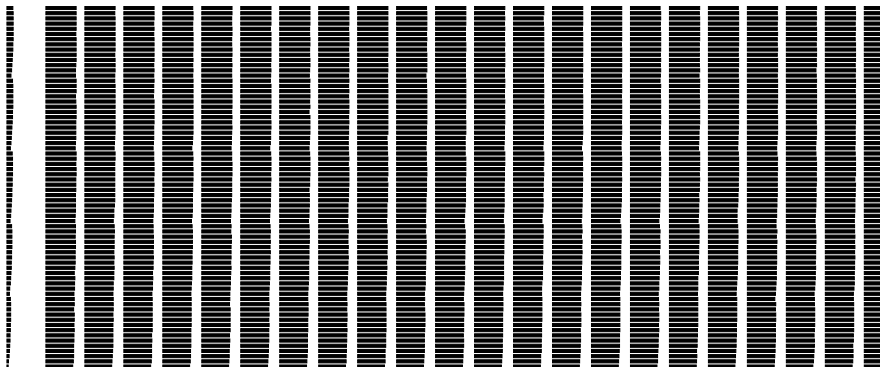
## Result for A172671

LLL-basis of  $\ker_{\mathbb{Z}} M$ , using  $N = 40$ :



## Result for A172671

LLL-basis of  $\ker_{\mathbb{Z}} M$ , using  $N = 50$ :



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- ▶ We were not able to find a recurrence for the notorious Av(1324) sequence. . .

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Hence, the recurrence can be recovered from the single sequence term  $D_8 = 265729$ .