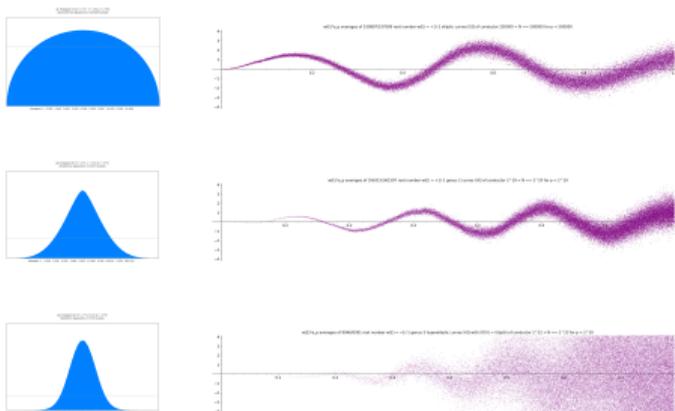


The power of pictures

Andrew V. Sutherland, MIT



Sato

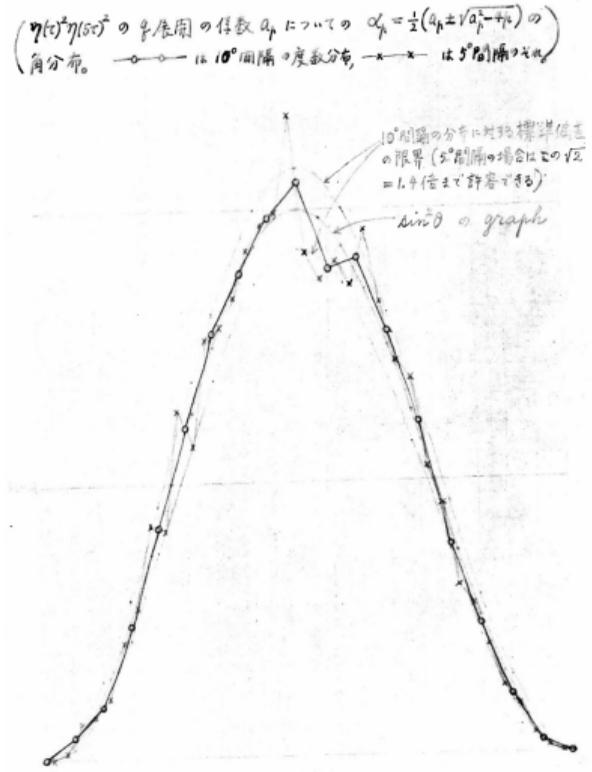
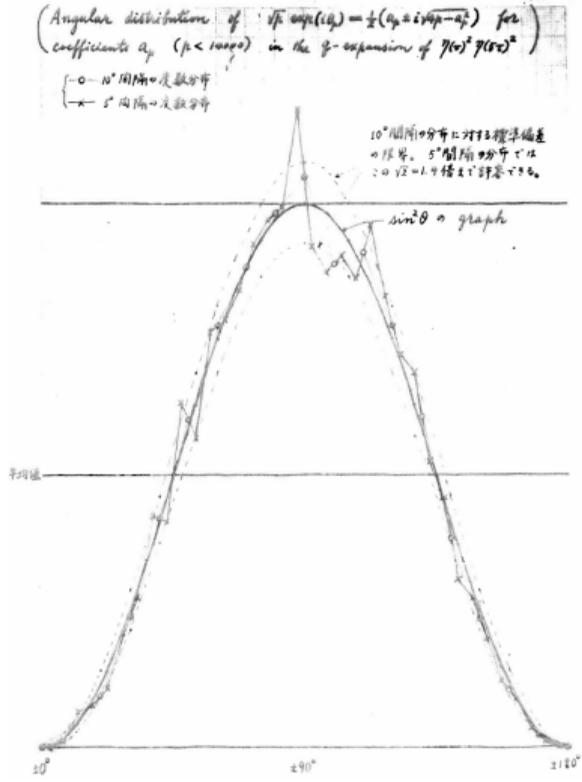
In 1962 Mikio Sato returned to the University of Tokyo after visiting IAS with an interest in the following question about the sequence of Frobenius eigenangles ϑ_p associated to an elliptic curve E/\mathbb{Q} at primes p of good reduction.

How is ϑ_p distributed on $[0, \pi]$ as p varies over primes?

The university had recently installed a HIPAC 103 computer, and several young researchers and students had started “playing” with it, including Kanji Namba.

... on a nice summer evening, Sato and some of his colleagues, including Namba, instead of parting at the Ikebukuro suburban train terminal were drawn to a roof beer garden on a department store. Then Sato, explaining the beauty of arithmetic of elliptic curves and modular forms, said to Namba something like “why not use the new computer for something more worthwhile than examining the Goldbach conjecture; for example, for collecting data for this question”.

The $\sin^2 \vartheta$ -law (May 15, 1963 letter from Sato to Namba)



The $\sin^2 \vartheta$ -law

In the letter Sato wrote to Namba in May, 1963 (as translated by Namba in a March 2007 letter to Ralf Schmidt)

... according to the figure and table, it is estimated that the angular distribution of α_p is proportional to $\sin^2 \vartheta$. It could be said that the above hypothesis is very plausible.

Here $\alpha_p = \sqrt{p}e^{i\vartheta_p}$ and $\bar{\alpha}_p = \sqrt{p}e^{-i\vartheta_p}$ are p -Weil numbers with $a_p = \alpha_p + \bar{\alpha}_p$.
Sato continued

This fact is, I think, probably, if we spend sufficiently long time and deep conversation, even under our present knowledge, it would be possible to explain theoretically, but now, I would like to postpone such heavy brain work, and instead, collect experimental muscular obtainable data.

The Sato-Tate distribution

Fix an elliptic curve E/\mathbb{Q} . For each good prime p the trace of Frobenius

$$a_p := p + 1 - \#E_p(\mathbb{F}_p)$$

satisfies $|a_p| \leq 2\sqrt{p}$. Let $x_p := -a_p/\sqrt{p} \in [-2, 2]$. If E does not have CM then $(x_2, x_3, x_5, x_7, x_{11}, \dots)$ should be equidistributed with respect to the measure

$$\frac{2}{\pi} \sqrt{4 - x^2} dx$$

If we construct a histogram of x_p -values for $p \leq B$ and rescale by $\frac{\pi}{2}$, as B tends to infinity our histogram should converge to a semicircle of radius 2.

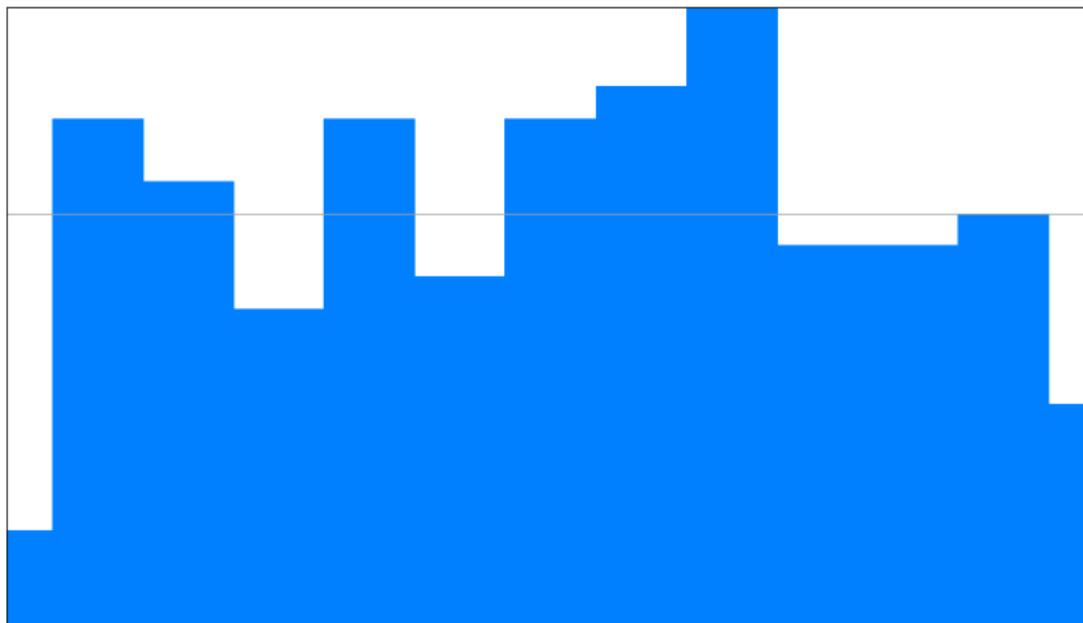


Mikio Sato



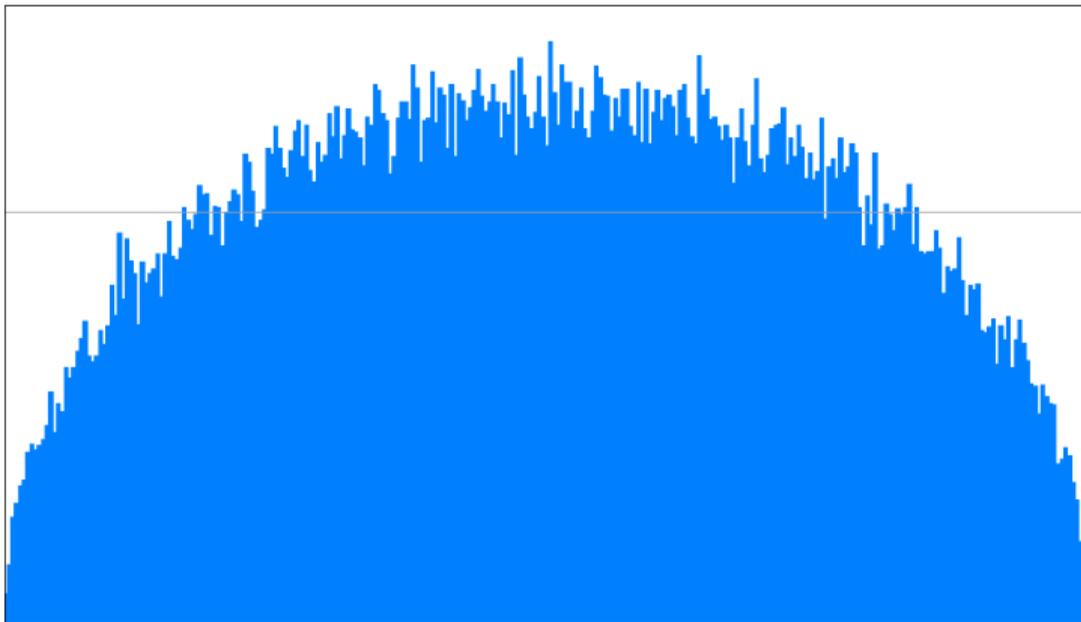
John Tate

a1 histogram of $y^2 = x^3 + x + 1$ for $p \leq 2^{10}$
170 data points in 13 buckets, $z_1 = 0.029$, out of range data has area 0.018



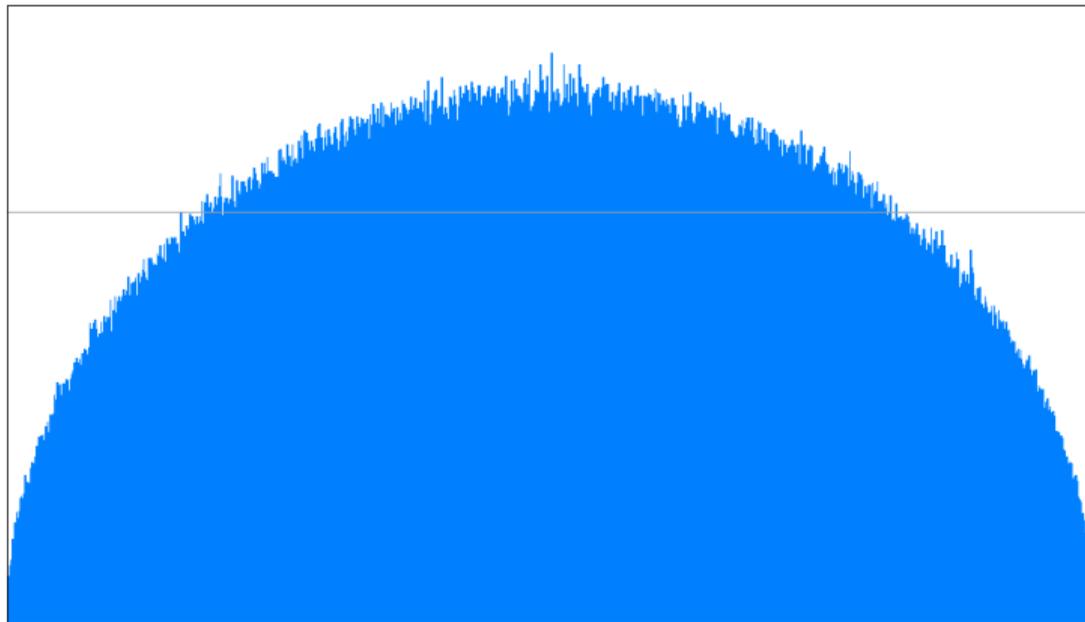
Moments: 1 0.051 1.039 0.081 2.060 0.294 4.971 1.134 13.278 4.308 37.954

a1 histogram of $y^2 = x^3 + x + 1$ for $p \leq 2^{20}$
82023 data points in 286 buckets



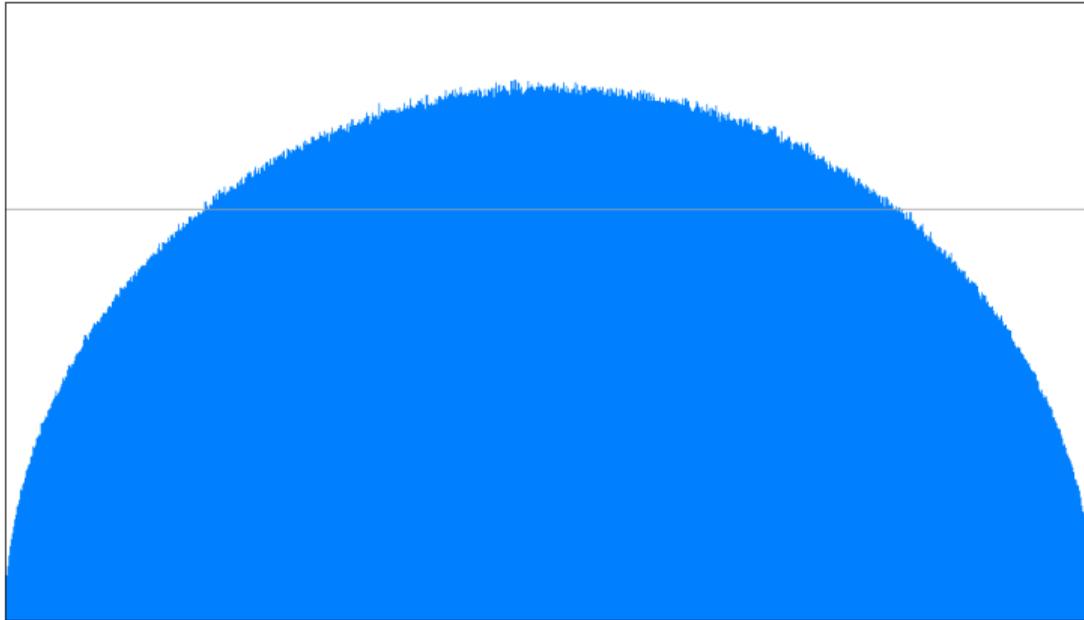
Moments: 1 0.002 0.999 0.003 1.992 0.004 4.969 0.005 13.885 -0.006 41.567

a1 histogram of $y^2 = x^3 + x + 1$ for $p \leq 2^{25}$
2063687 data points in 1436 buckets



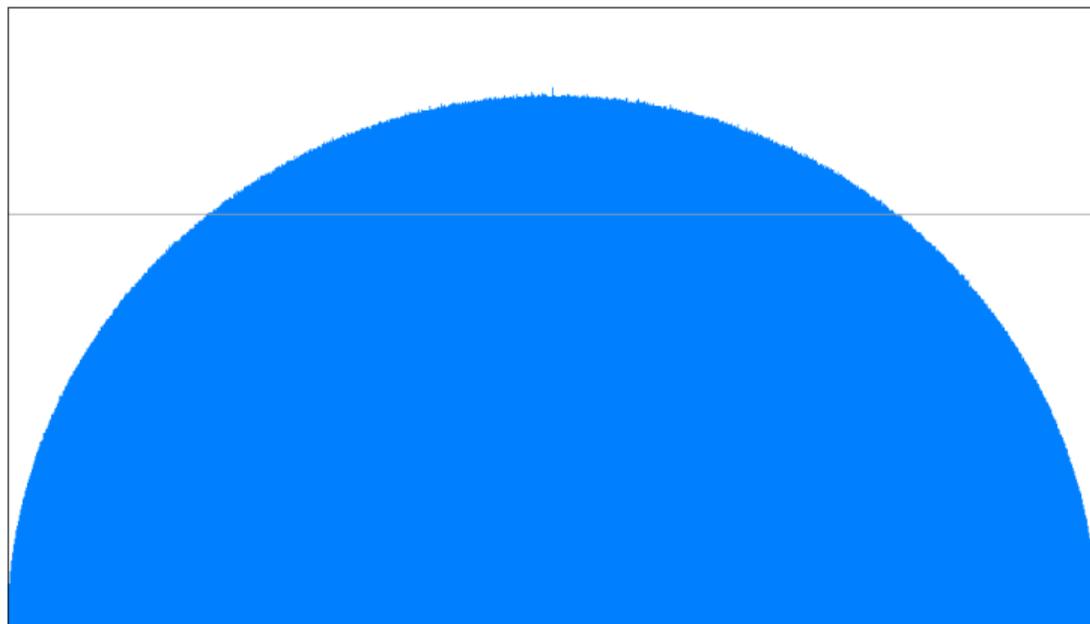
Moments: 1 0.000 0.999 0.001 1.997 0.003 4.991 0.003 13.972 -0.005 41.914

a1 histogram of $y^2 = x^3 + x + 1$ for $p \leq 2^{30}$
54400026 data points in 7375 buckets

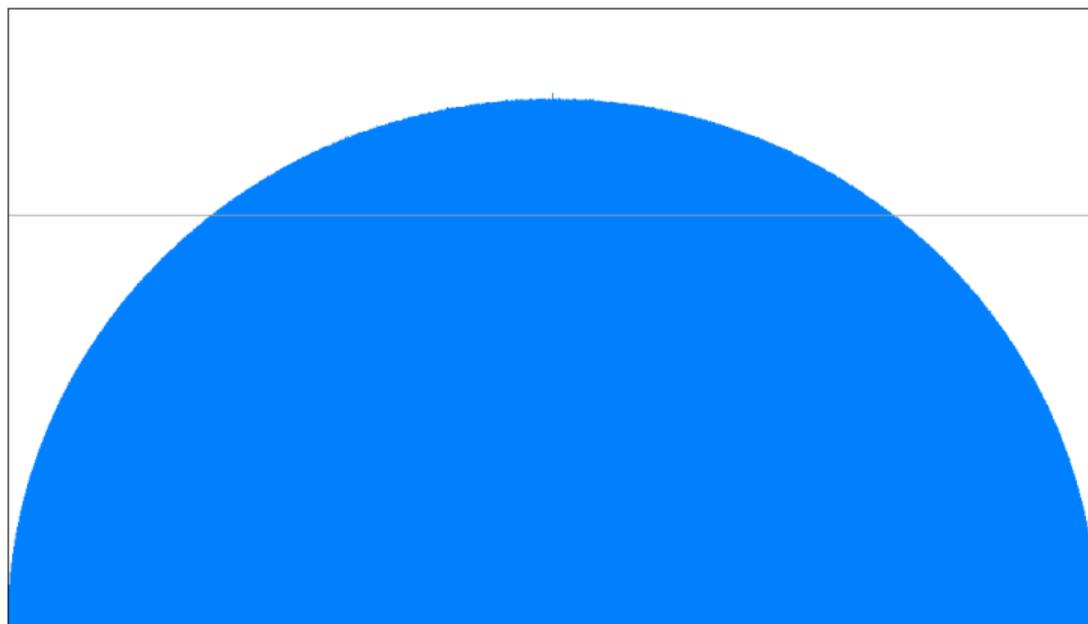


Moments: 1 0.000 1.000 0.000 2.000 -0.000 4.999 -0.000 13.998 -0.001 41.992

a1. histogram of $y^2 = x^3 + x + 1$ for $p \leq 2^{35}$
1480206277 data points in 38473 buckets

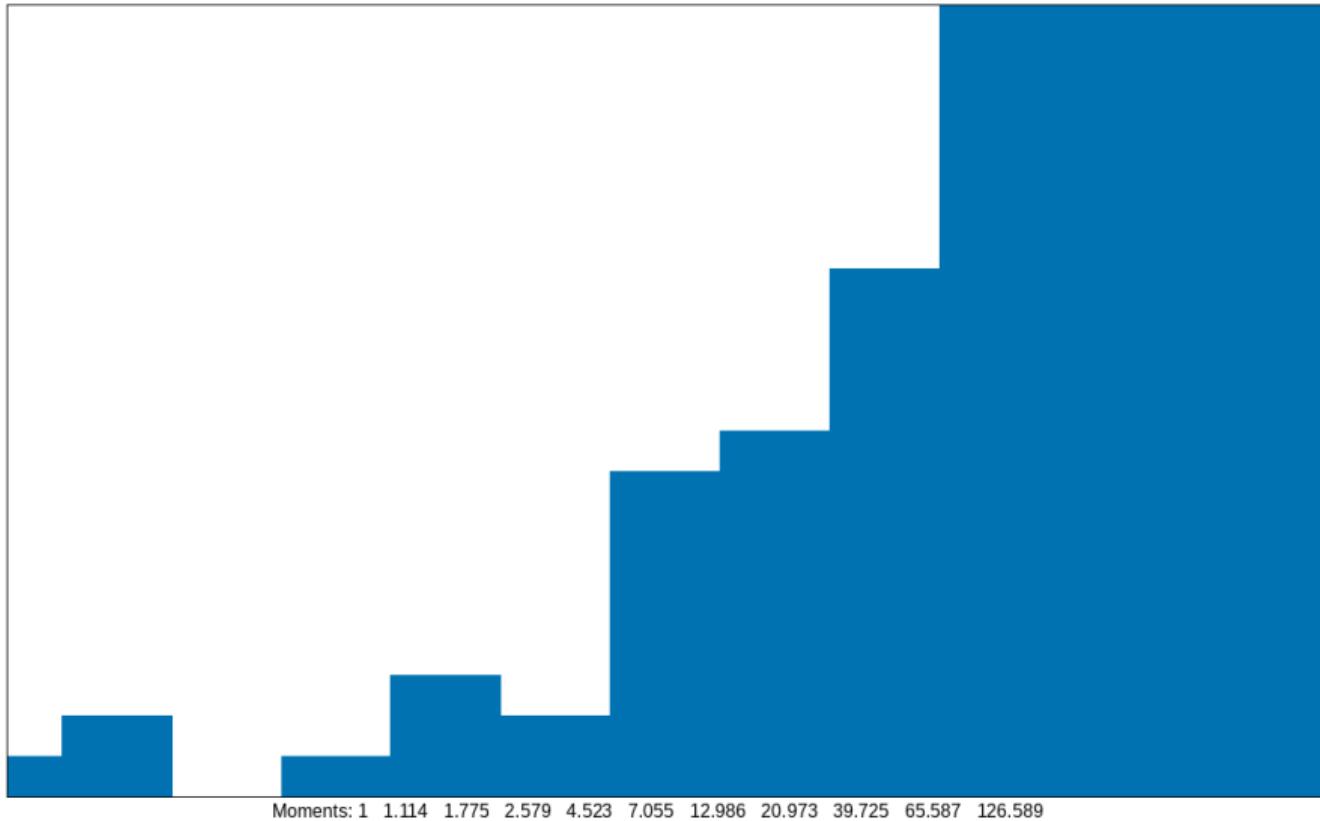


a1. histogram of $y^2 = x^3 + x + 1$ for $p \leq 2^{40}$
41203088794 data points in 202985 buckets



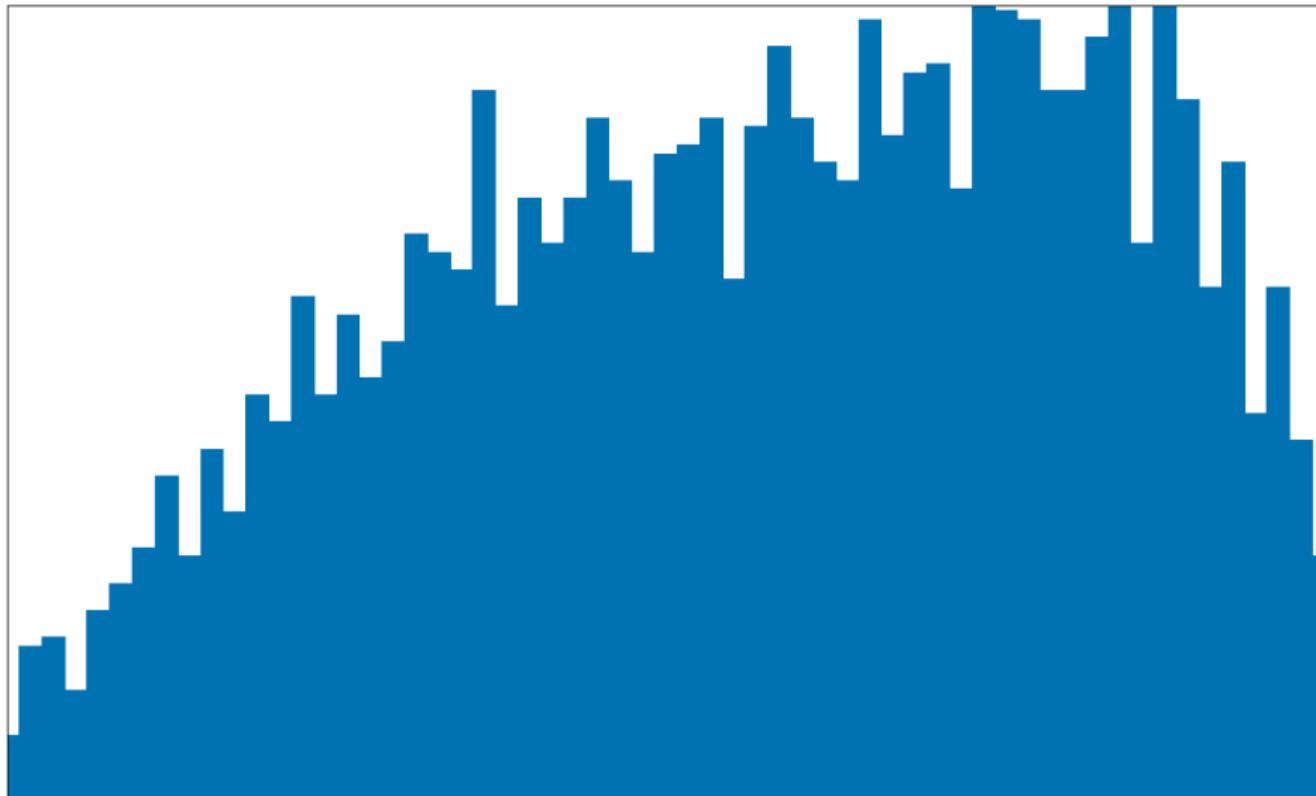
a1 histogram of $y^2 + xy = x^3 - 27006183241630922218434652145297453784768054621836357954737385x$
+ 55258058551342376475736699591118191821521067032535079608372404779149413277716173425636721497 for primes $p < 2^{10}$

159 data points in 13 buckets, $z_1 = 0.025$, out of range data has area 0.252



a1 histogram of $y^2 + xy = x^3 - 27006183241630922218434652145297453784768054621836357954737385x$
+ 55258058551342376475736699591118191821521067032535079608372404779149413277716173425636721497 for primes $p < 2^{15}$

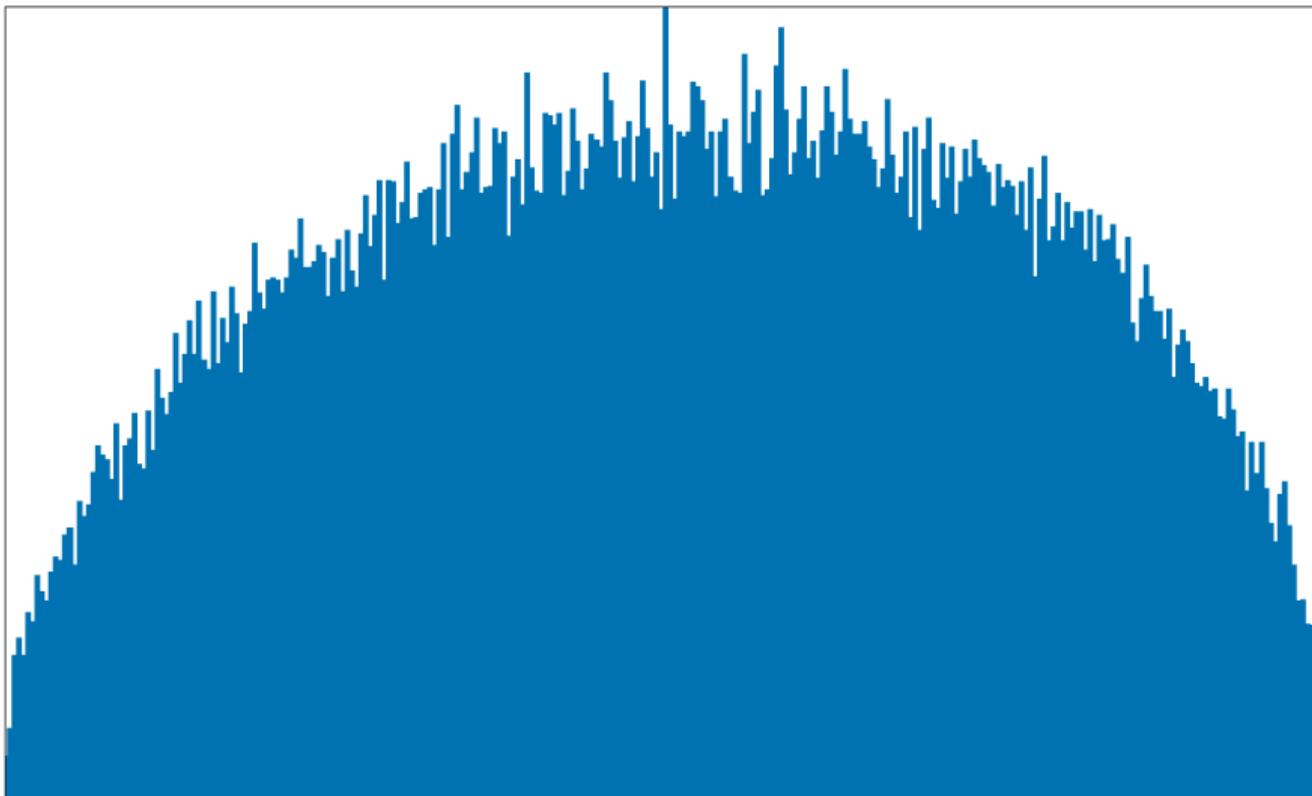
3498 data points in 59 buckets, out of range data has area 0.003



Moments: 1 0.285 1.054 0.604 2.154 1.541 5.465 4.355 15.506 13.144 47.133

a1 histogram of $y^2 + xy = x^3 - 27006183241630922218434652145297453784768054621836357954737385x$
+ 55258058551342376475736699591118191821521067032535079608372404779149413277716173425636721497 for primes $p < 2^{20}$

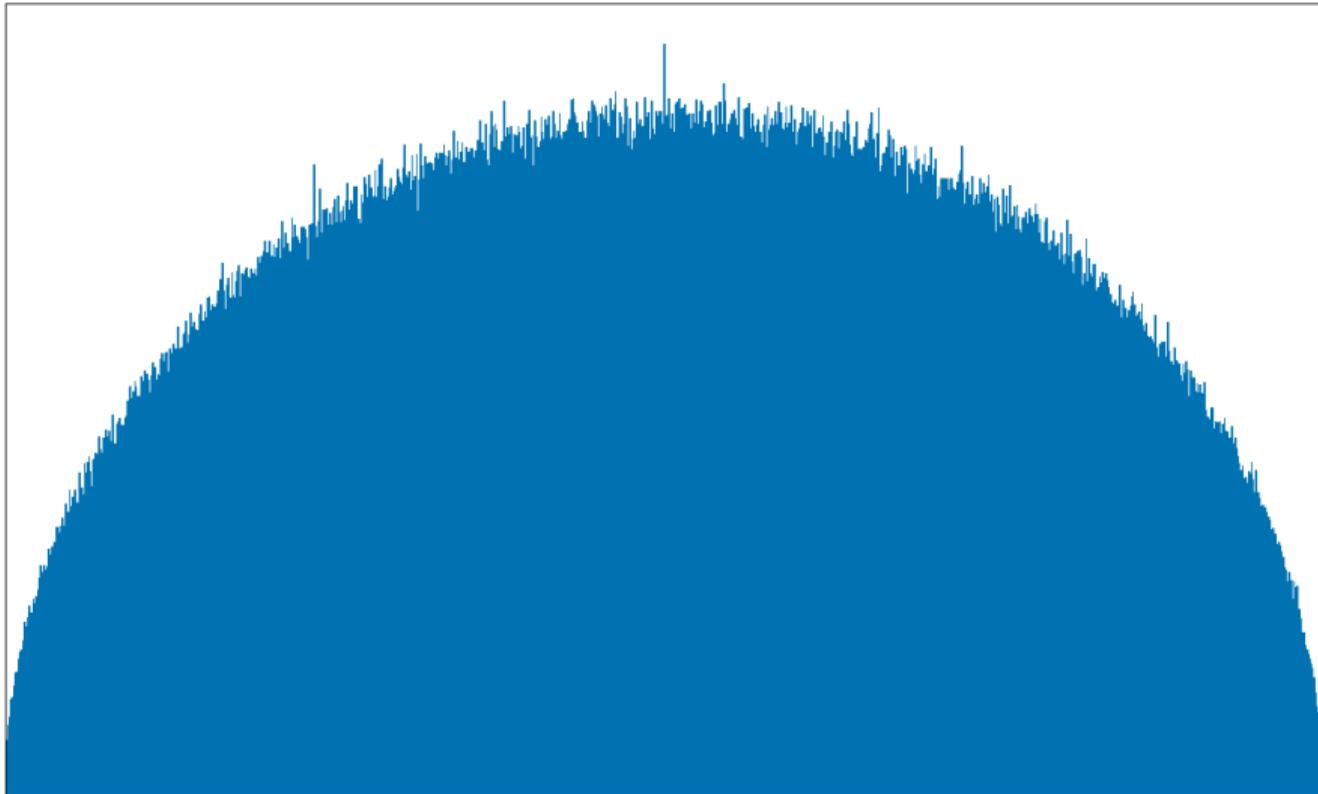
82011 data points in 286 buckets



Moments: 1 0.057 1.010 0.119 2.032 0.305 5.106 0.874 14.367 2.675 43.313

a1 histogram of $y^2 + xy = x^3 - 27006183241630922218434652145297453784768054621836357954737385x$
+ 55258058551342376475736699591118191821521067032535079608372404779149413277716173425636721497 for primes $p < 2^{25}$

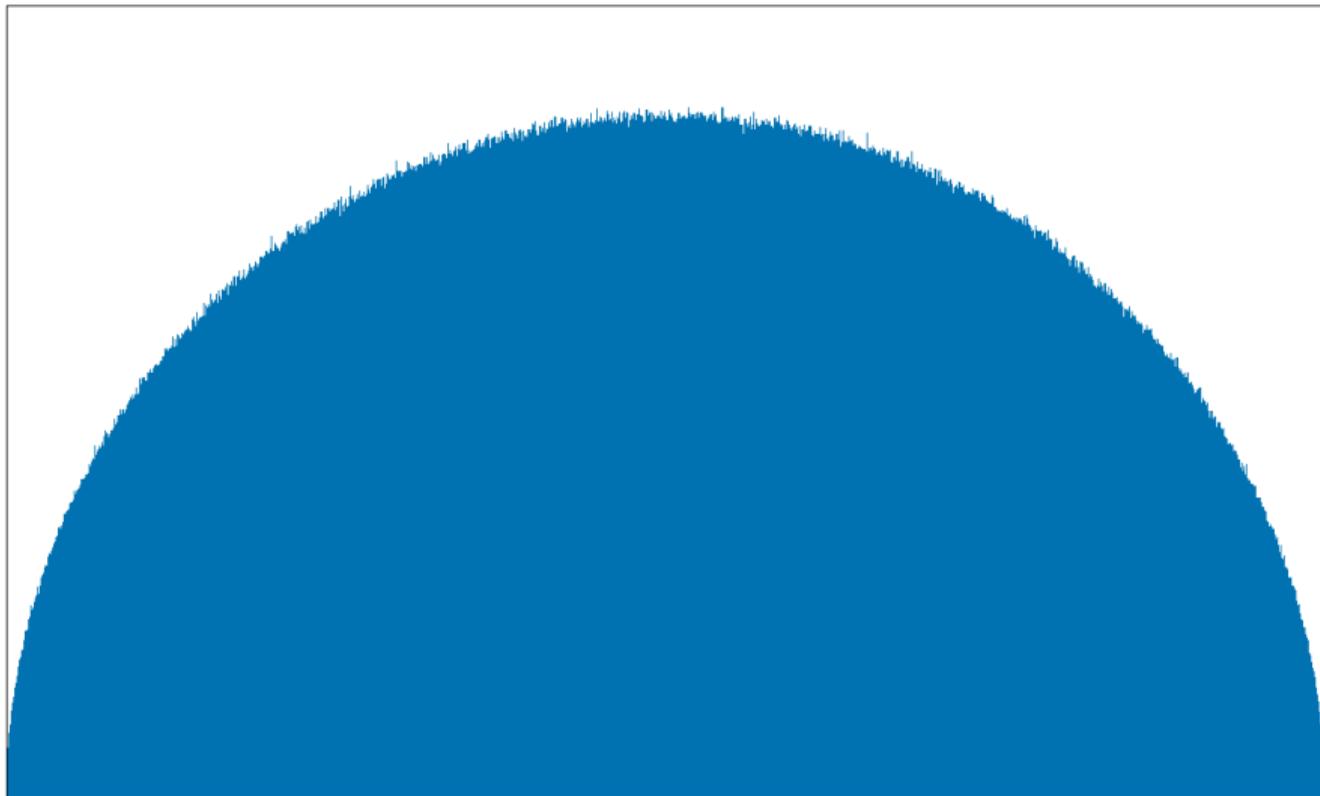
2063675 data points in 1436 buckets



Moments: 1 0.010 1.000 0.020 2.001 0.050 5.006 0.143 14.024 0.431 42.097

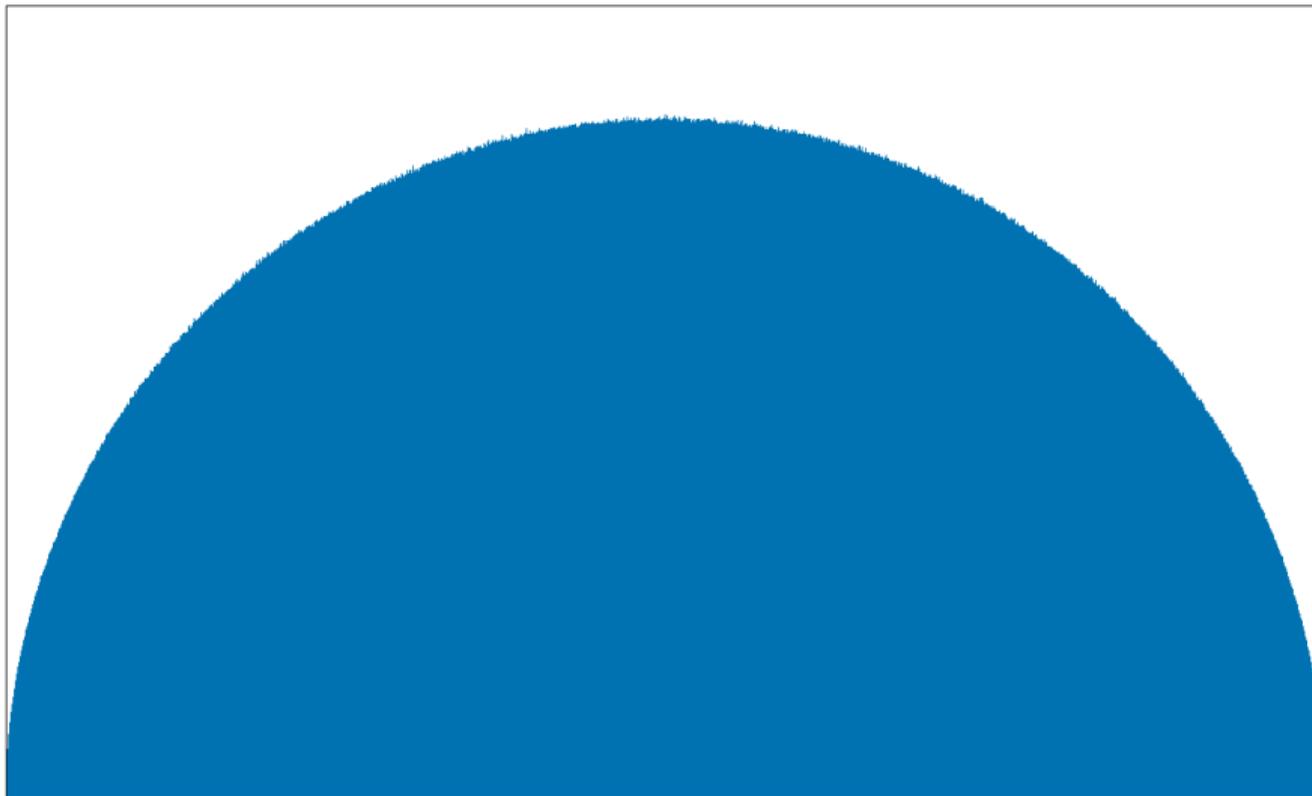
a1 histogram of $y^2 + xy = x^3 - 27006183241630922218434652145297453784768054621836357954737385x$
+ 55258058551342376475736699591118191821521067032535079608372404779149413277716173425636721497 for primes $p < 2^{30}$

54400014 data points in 7375 buckets



a1 histogram of $y^2 + xy = x^3 - 27006183241630922218434652145297453784768054621836357954737385x$
+ 55258058551342376475736699591118191821521067032535079608372404779149413277716173425636721497 for primes $p < 2^{35}$

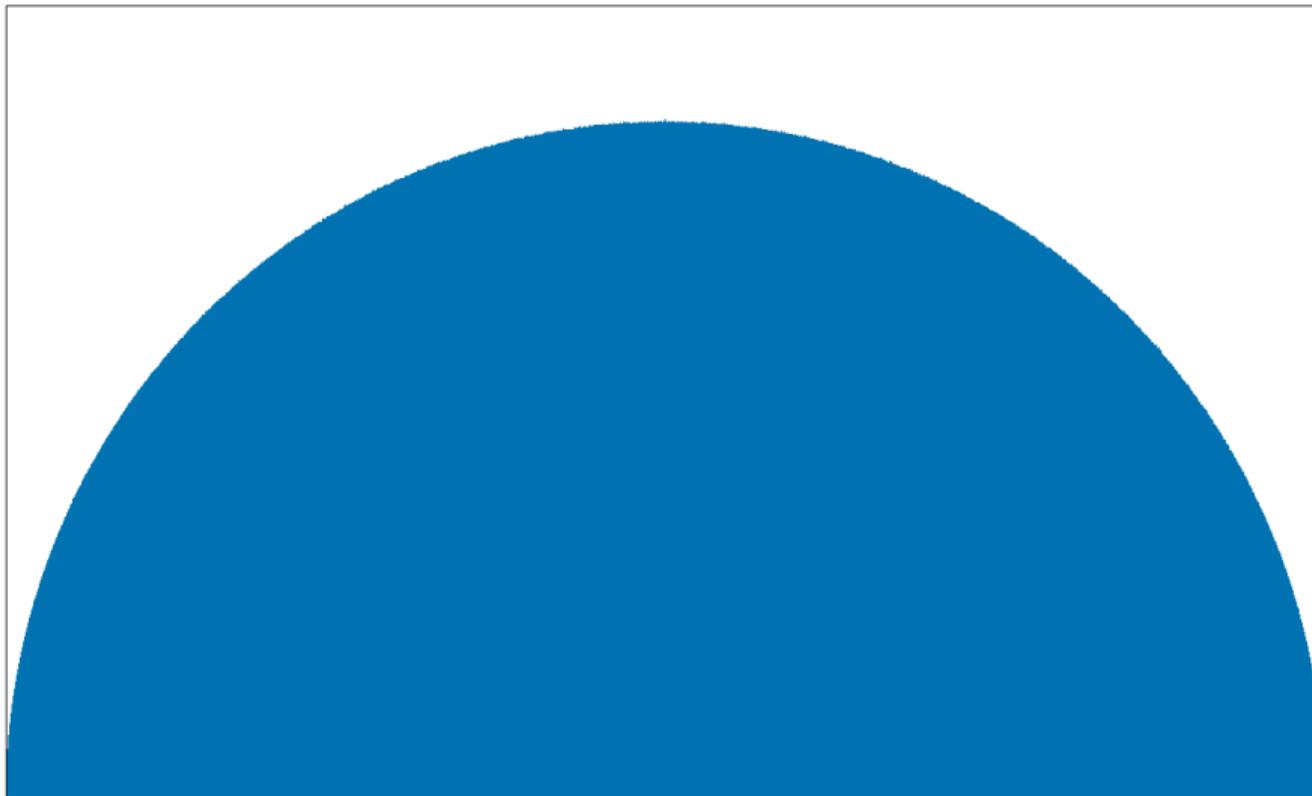
1480206265 data points in 38473 buckets



Moments: 1 0.000 1.000 0.001 2.000 0.002 5.000 0.005 14.000 0.014 42.001

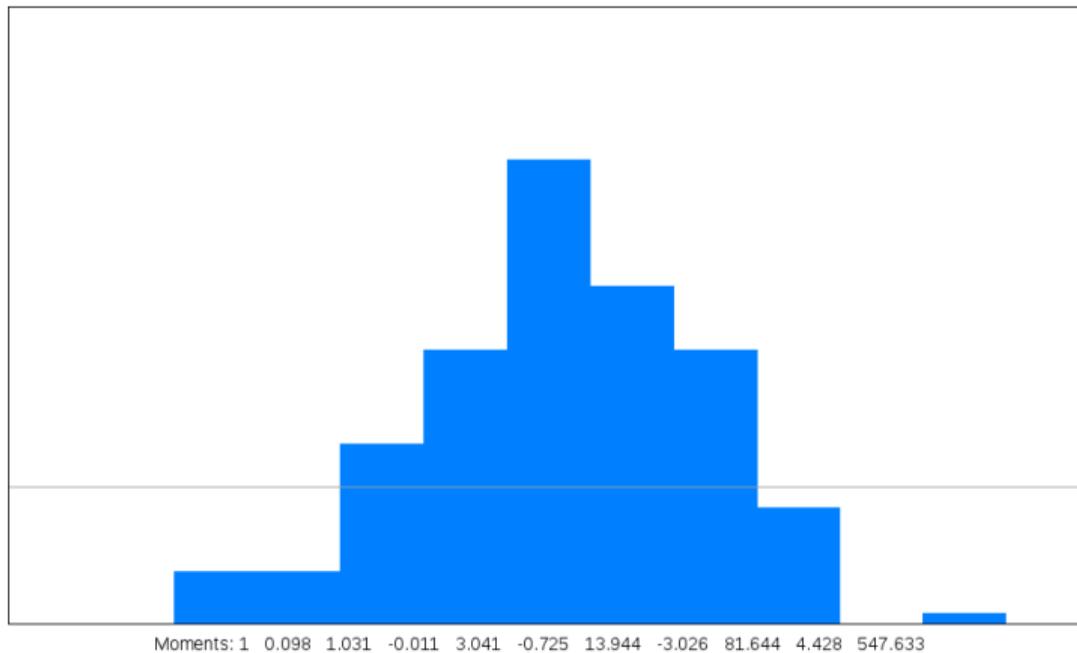
a1 histogram of $y^2 + xy = x^3 - 27006183241630922218434652145297453784768054621836357954737385x$
+ 55258058551342376475736699591118191821521067032535079608372404779149413277716173425636721497 for primes $p < 2^{40}$

41203088782 data points in 202985 buckets

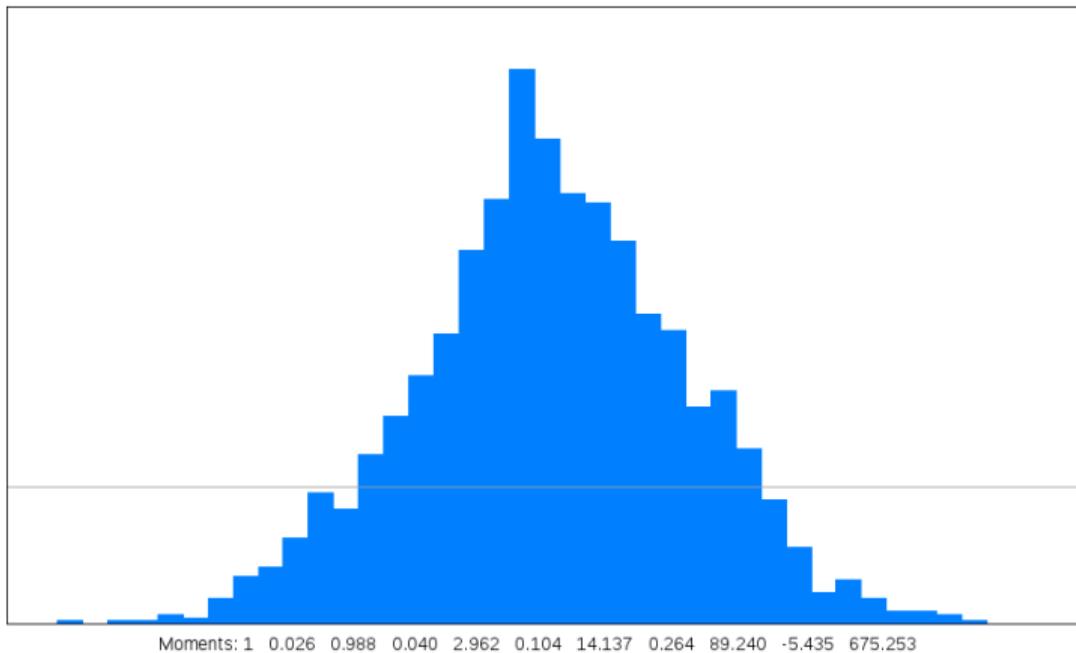


Moments: 1 0.000 1.000 0.000 2.000 0.000 5.000 0.001 14.000 0.002 42.001

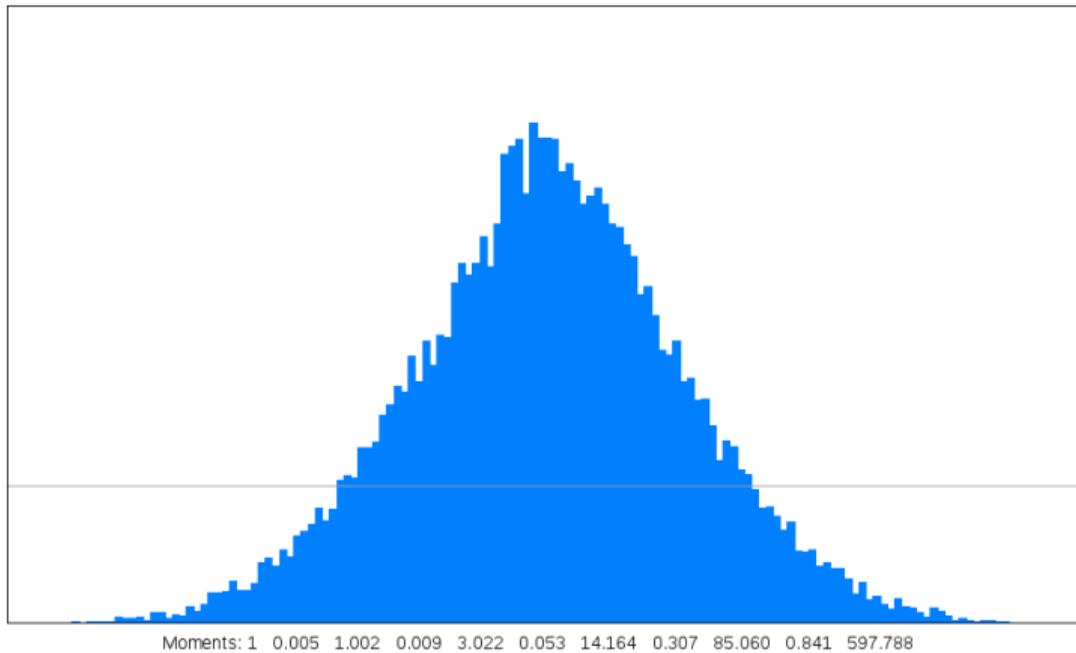
a1 histogram of $y^2 = x^5 - x + 1$ for $p \leq 2^{10}$
167 data points in 13 buckets, $z_1 = 0.030$



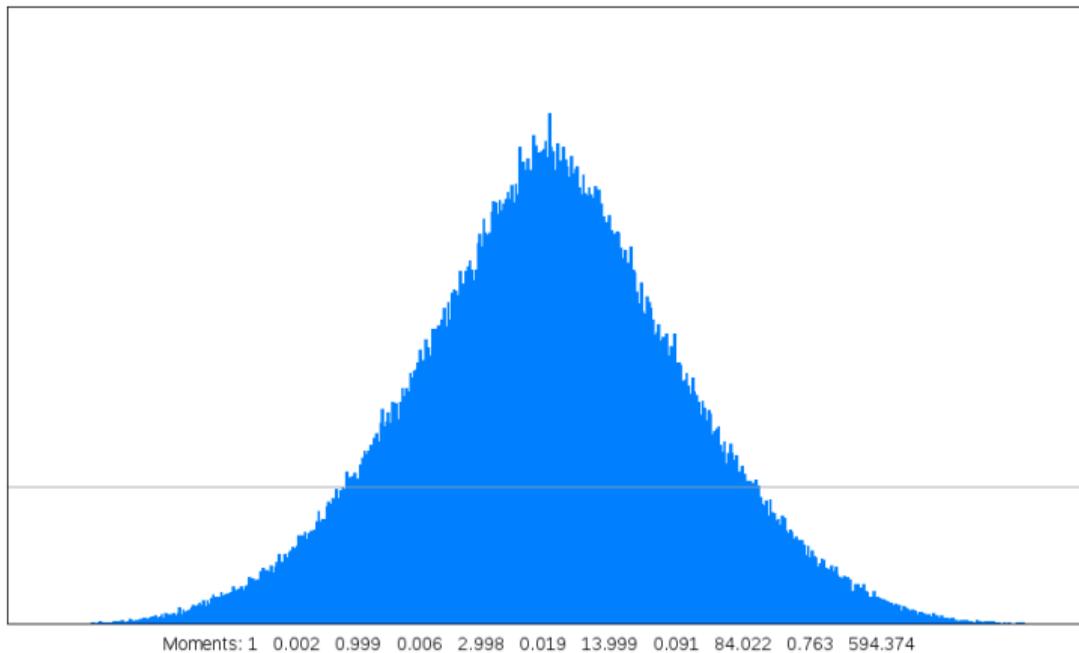
a1 histogram of $y^2 = x^5 - x + 1$ for $p \leq 2^{14}$
1895 data points in 43 buckets



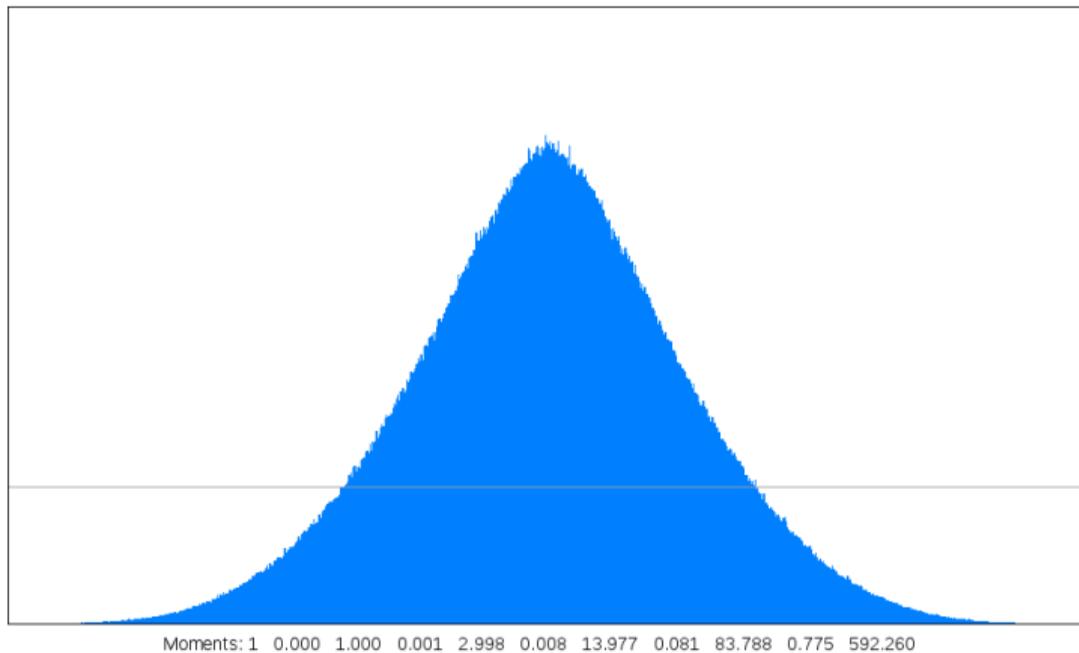
a1. histogram of $y^2 = x^5 - x + 1$ for $p \leq 2^{18}$
22995 data points in 151 buckets



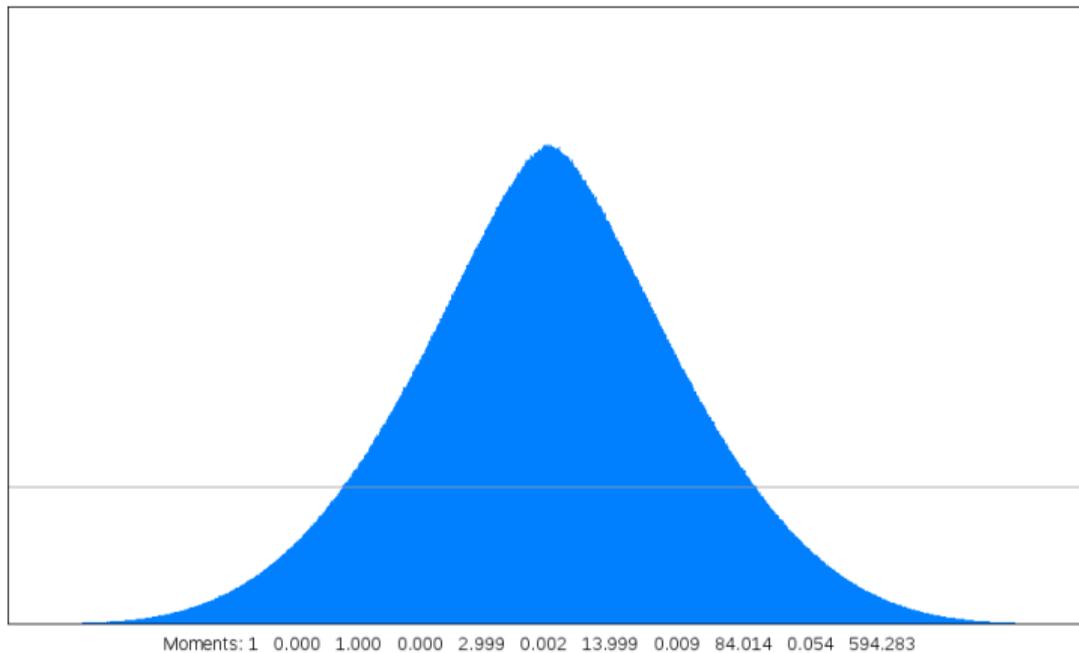
a1 histogram of $y^2 = x^5 \cdot x + 1$ for $p \leq 2^{22}$
295942 data points in 544 buckets



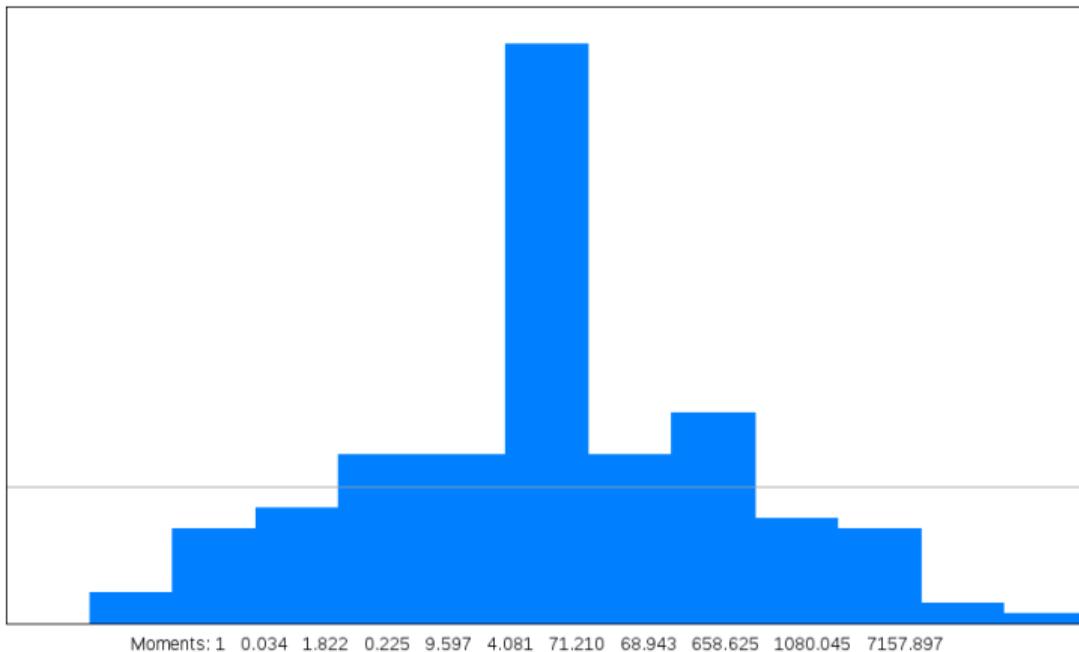
a1 histogram of $y^2 = x^5 \cdot x + 1$ for $p \leq 2^{26}$
3957804 data points in 1989 buckets



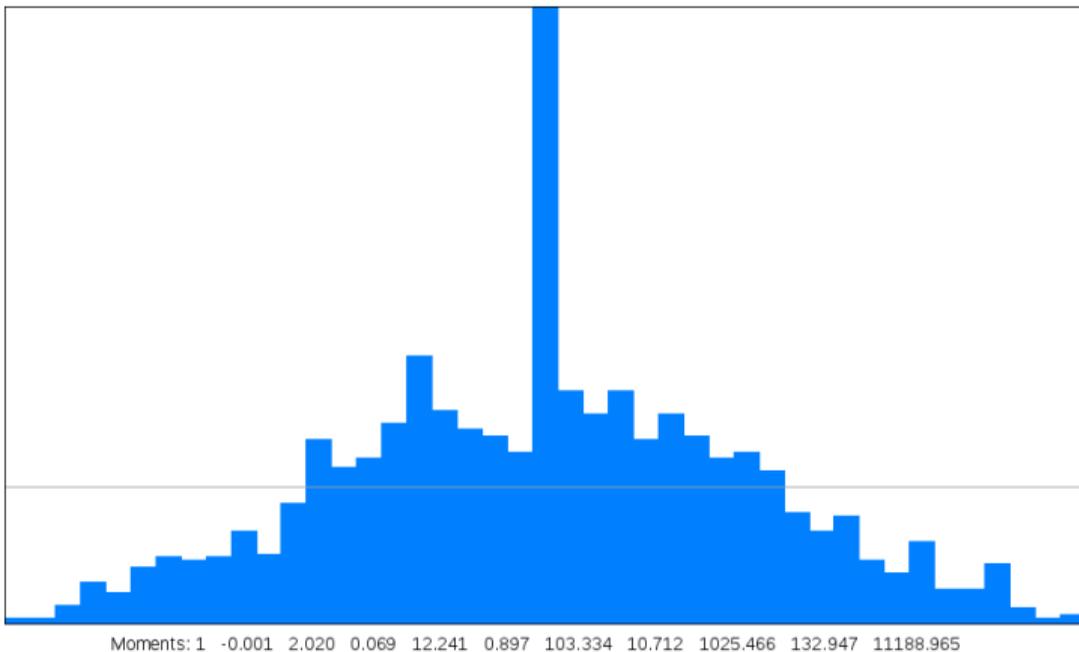
a1 histogram of $y^2 = x^5 \cdot x + 1$ for $p \leq 2^{32}$
203280216 data points in 14257 buckets



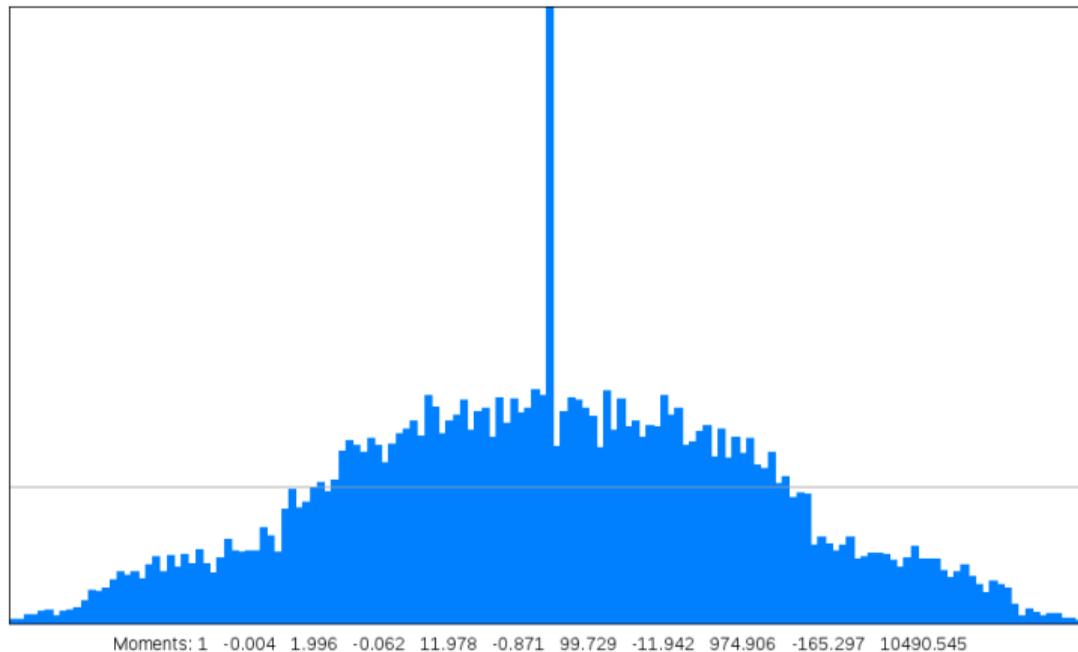
a1 histogram of $y^2 = x^5 + 2x^4 - x^3 - 3x^2 - x$ for $p \leq 2^{10}$
168 data points in 13 buckets, $z_1 = 0.196$



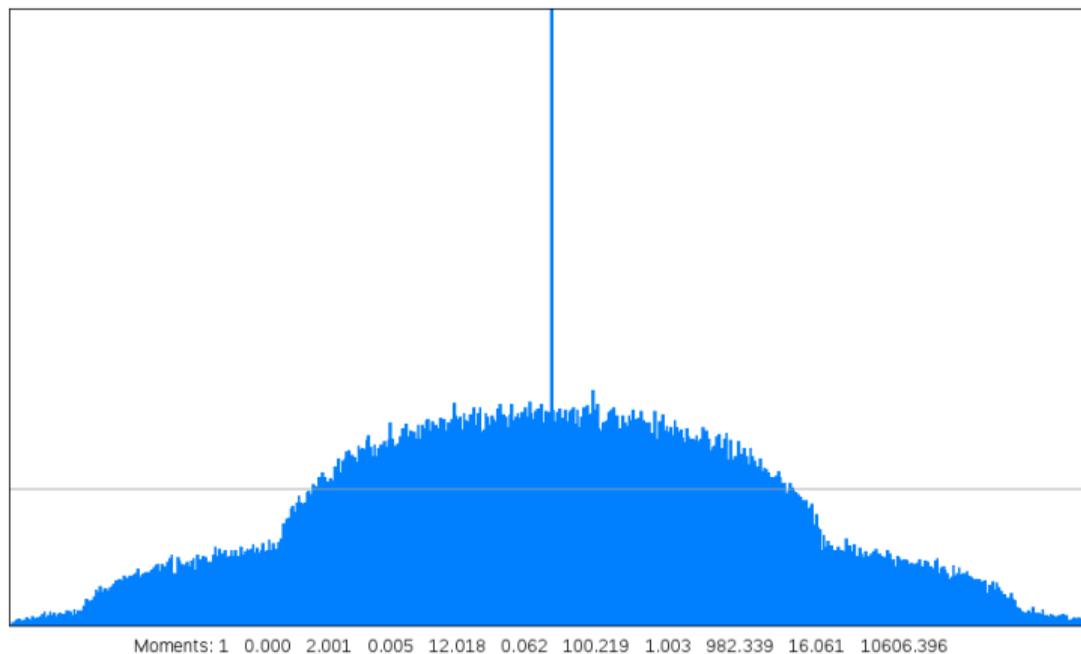
a1 histogram of $y^2 = x^5 + 2x^4 - x^3 - 3x^2 - x$ for $p \leq 2^{14}$
1896 data points in 43 buckets, $z_1 = 0.169$, out of range data has area 0.102



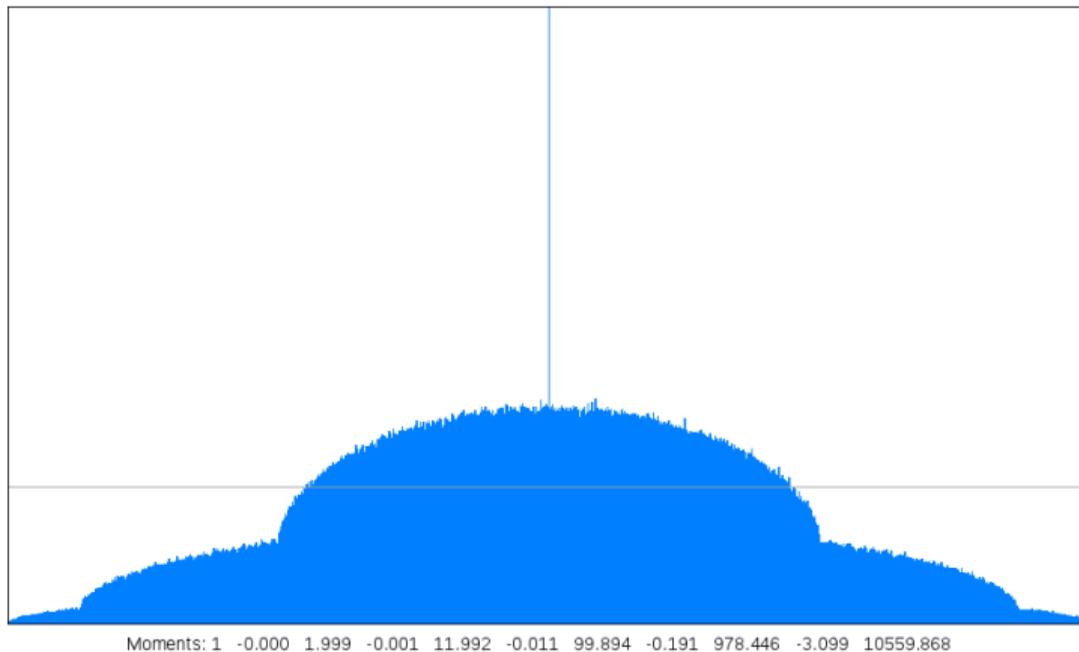
a1 histogram of $y^2 = x^5 + 2x^4 - x^3 - 3x^2 - x$ for $p \leq 2^{18}$
22996 data points in 151 buckets, $z_1 = 0.167$, out of range data has area 0.148



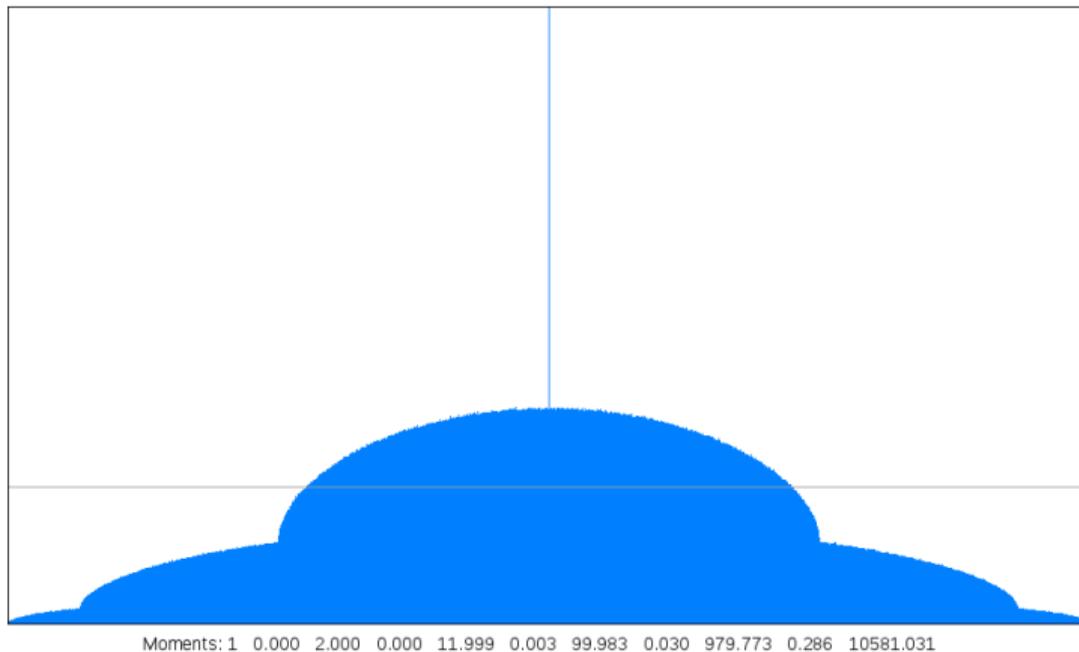
a1 histogram of $y^2 = x^5 + 2x^4 - x^3 - 3x^2 - x$ for $p \leq 2^{22}$
295943 data points in 544 buckets, $z_1 = 0.167$, out of range data has area 0.161



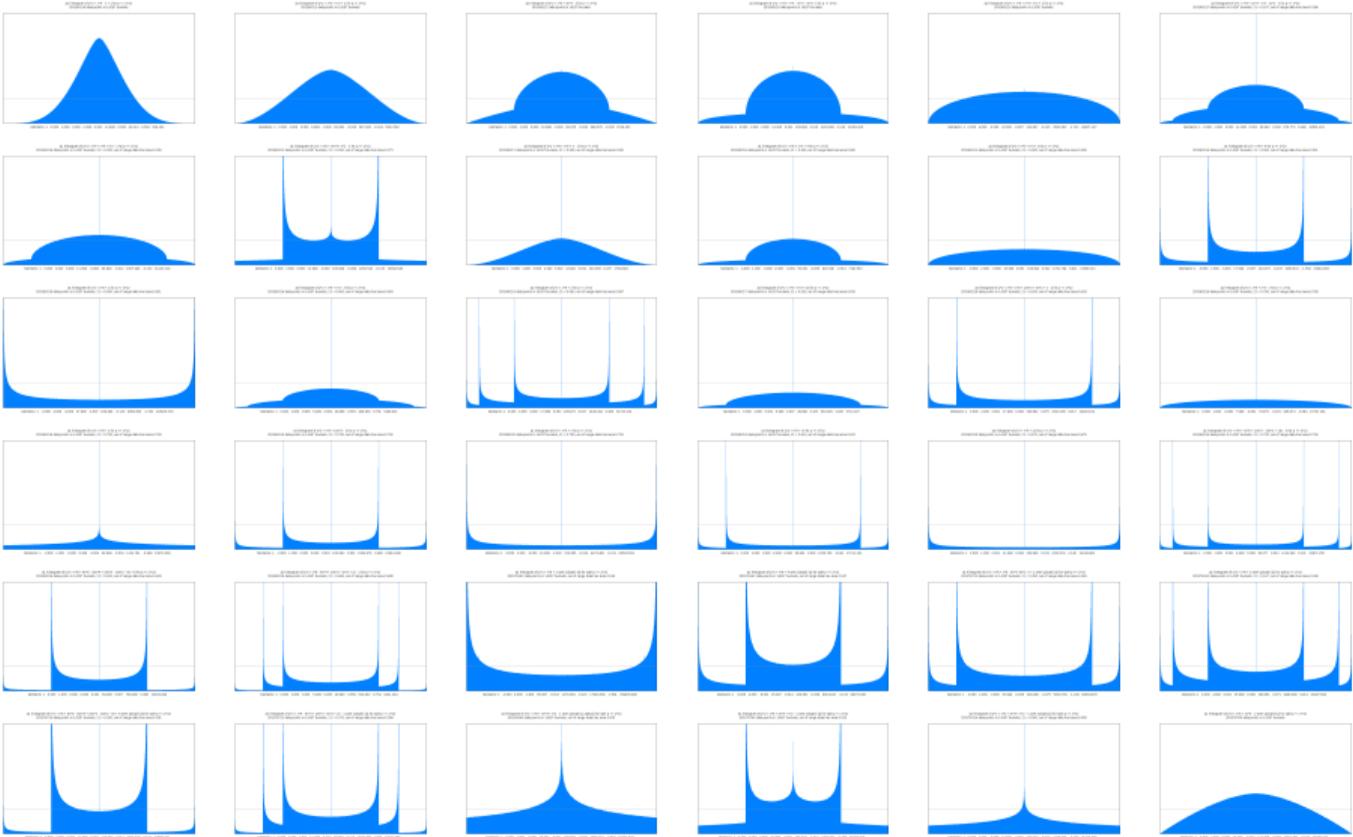
a1. histogram of $y^2 = x^5 + 2x^4 - x^3 - 3x^2 - x$ for $p \leq 2^{26}$
3957805 data points in 1989 buckets, $z_1 = 0.167$, out of range data has area 0.165



a1. histogram of $y^2 = x^5 + 2x^4 - x^3 - 3x^2 - x$ for $p \leq 2^{32}$
203280217 data points in 14257 buckets, $z_1 = 0.167$, out of range data has area 0.166

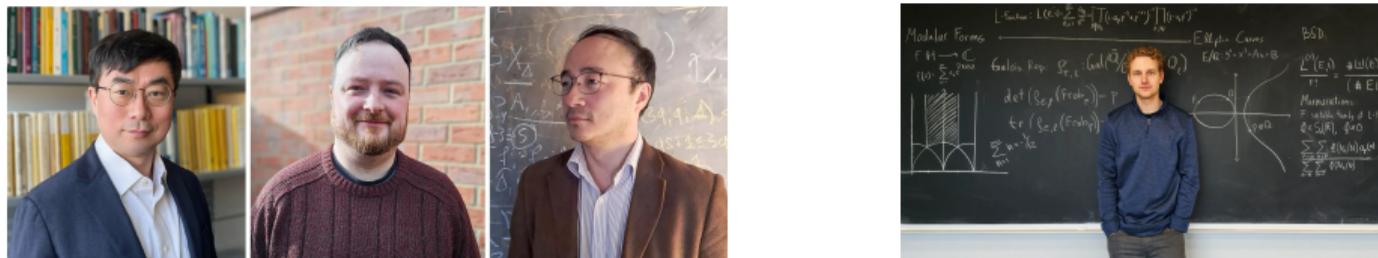


Sato-Tate trace distributions of genus 2 curves



Murmurations of elliptic curves

In 2022, He, Lee, Oliver, and Pozdnyakov ran a series of machine learning experiments in an attempt to predict ranks of elliptic curves over \mathbb{Q} using Frobenius traces.

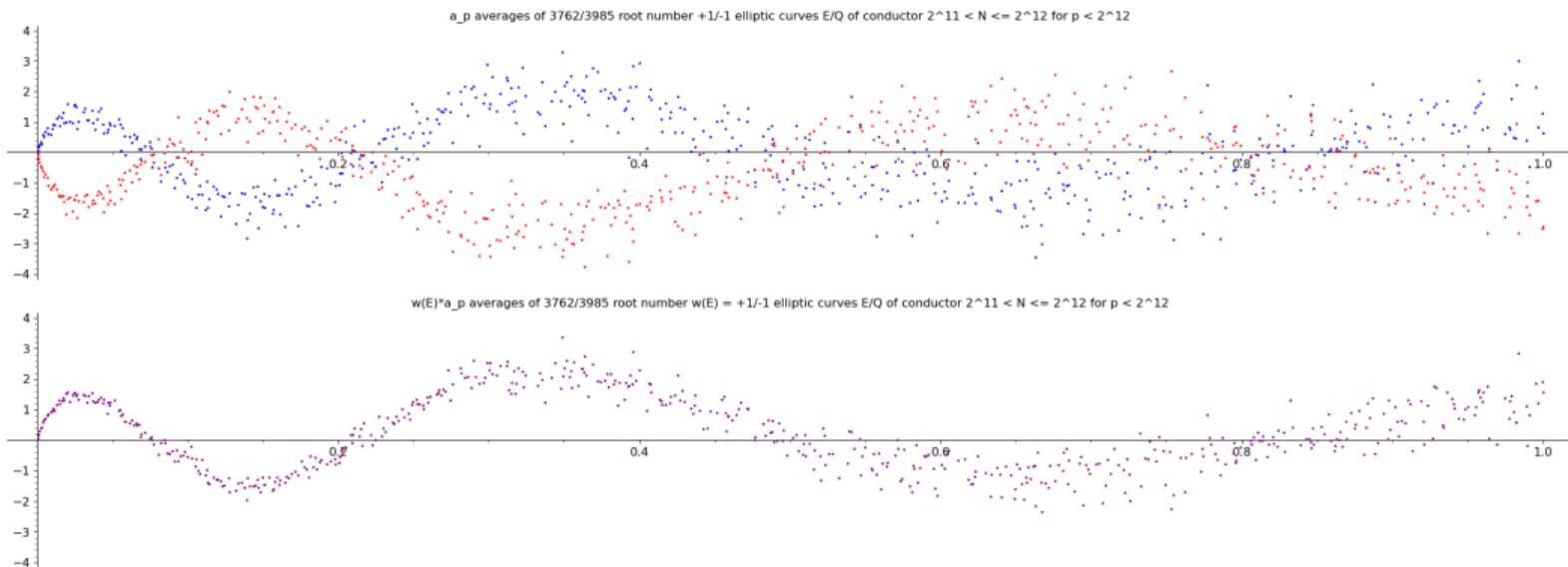


Their efforts to predict ranks worked for curves of small conductor, but not in general. However, they noticed a previously unobserved oscillation in average Frobenius traces in families of elliptic curves ordered by conductor when separated by rank.

You can read more about their discovery in this 2024 [Quanta article](#).

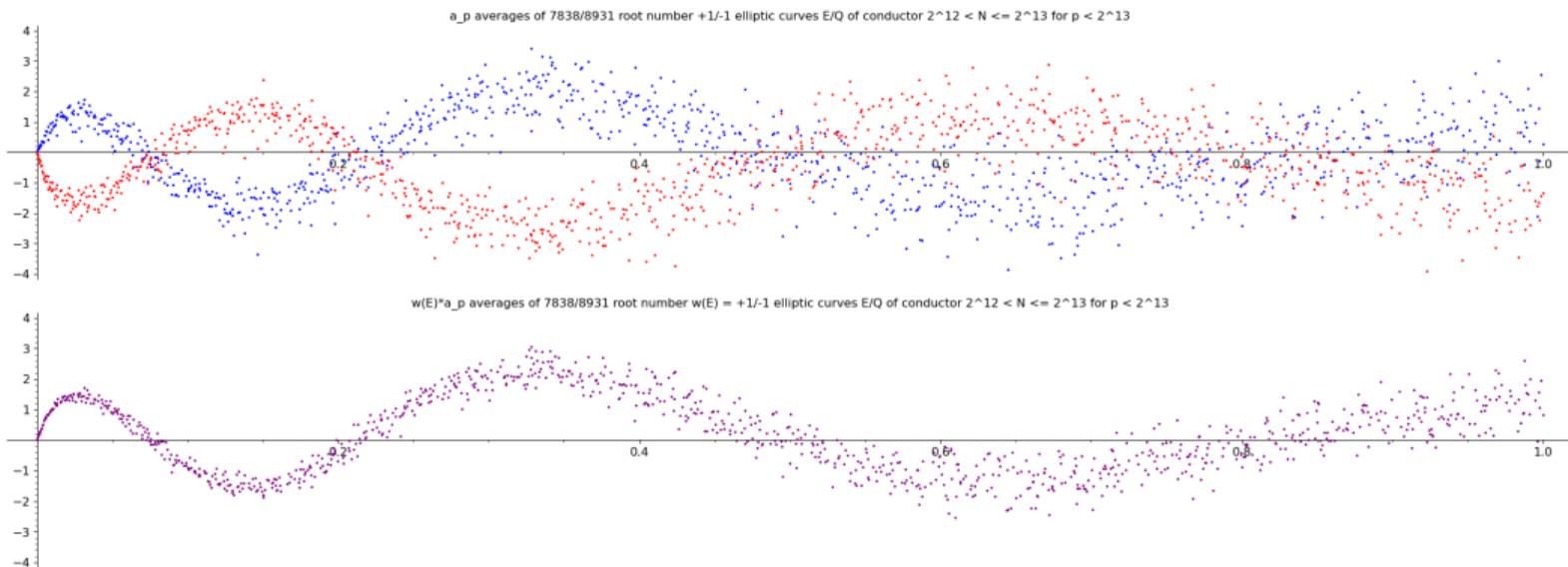
Murmurations of elliptic curves

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Blue/red/purple dots at $(p, \bar{a}_p$ or $\bar{m}_p)$ are averages of a_p or $m_p := (-1)^r a_p(E)$ over even/odd/all E/\mathbb{Q} .



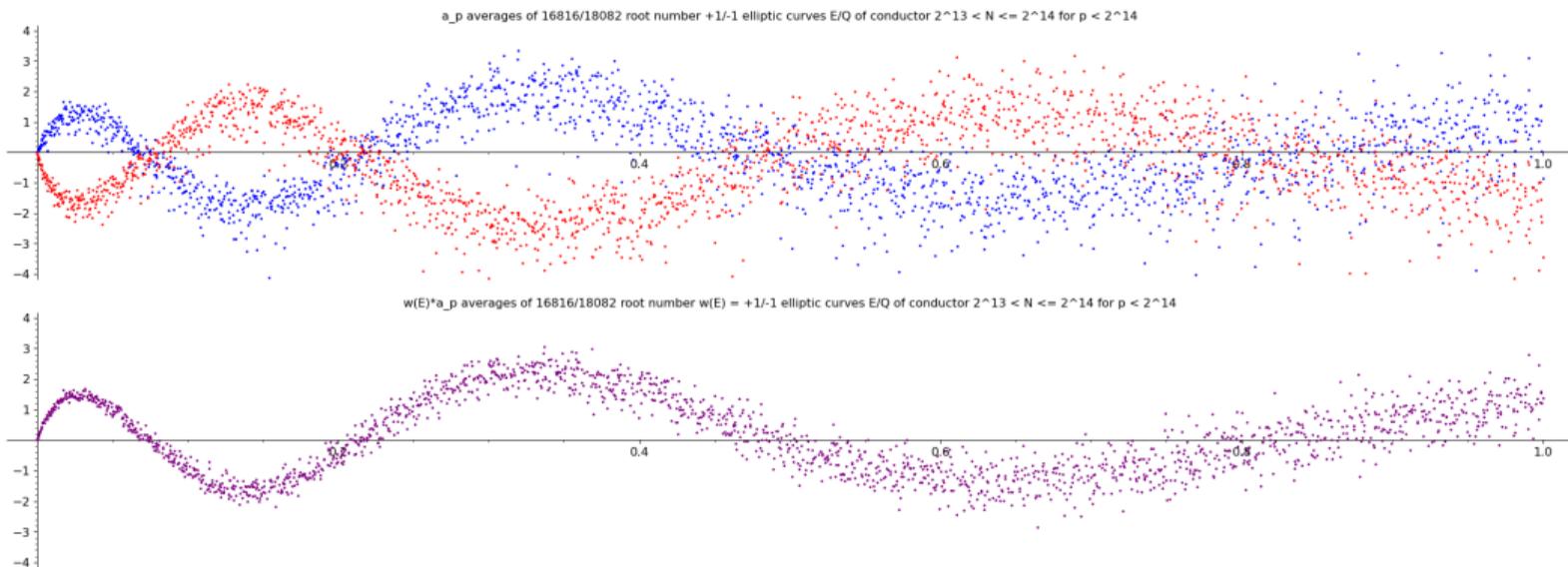
Murmurations of elliptic curves

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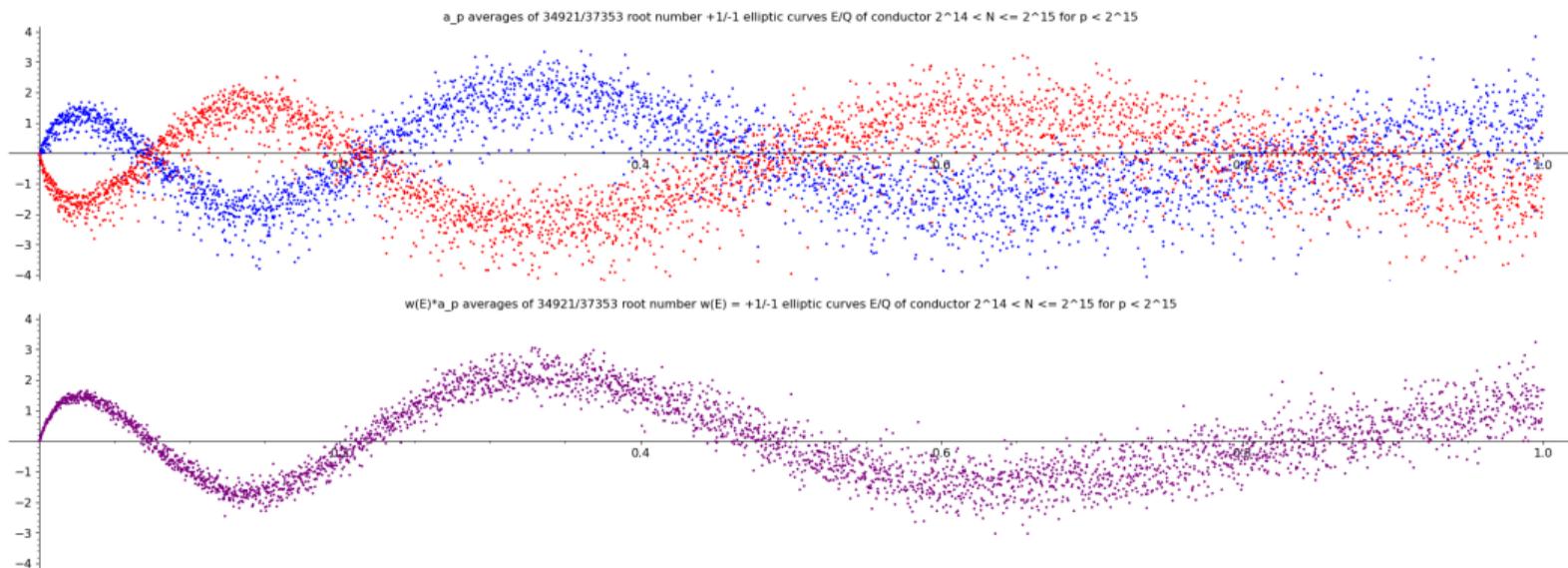
Murmurations of elliptic curves

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Blue/red/purple dots at $(p, \bar{a}_p$ or $\bar{m}_p)$ are averages of a_p or $m_p := (-1)^r a_p(E)$ over even/odd/all E/\mathbb{Q} .



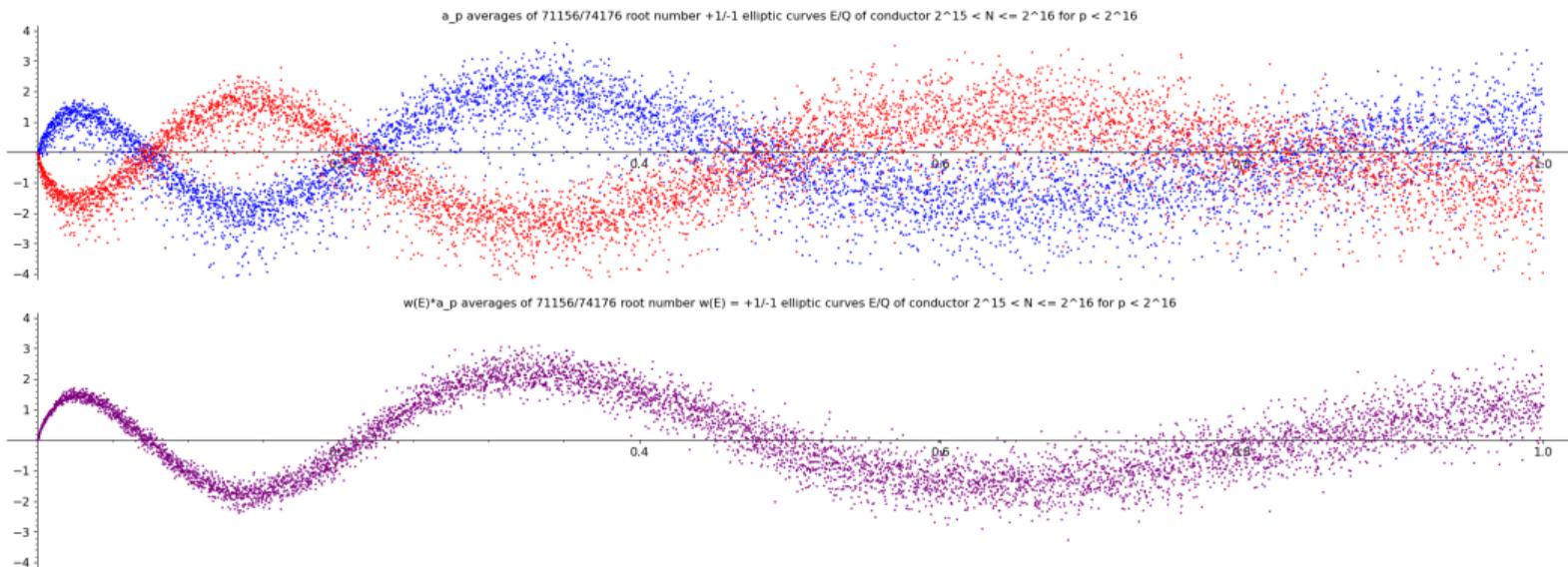
Murmurations of elliptic curves

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Blue/red/purple dots at $(p, \bar{a}_p$ or $\bar{m}_p)$ are averages of a_p or $m_p := (-1)^r a_p(E)$ over even/odd/all E/\mathbb{Q} .



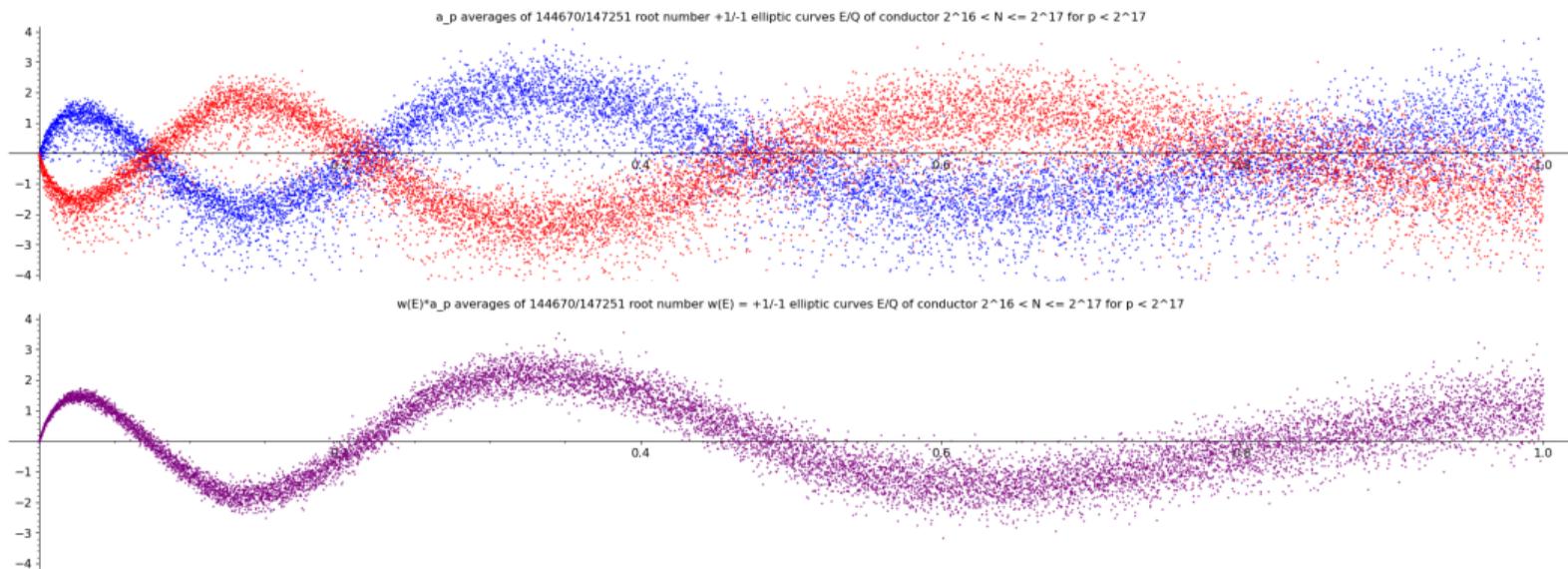
Murmurations of elliptic curves

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Blue/red/purple dots at $(p, \bar{a}_p$ or $\bar{m}_p)$ are averages of a_p or $m_p := (-1)^r a_p(E)$ over even/odd/all E/\mathbb{Q} .



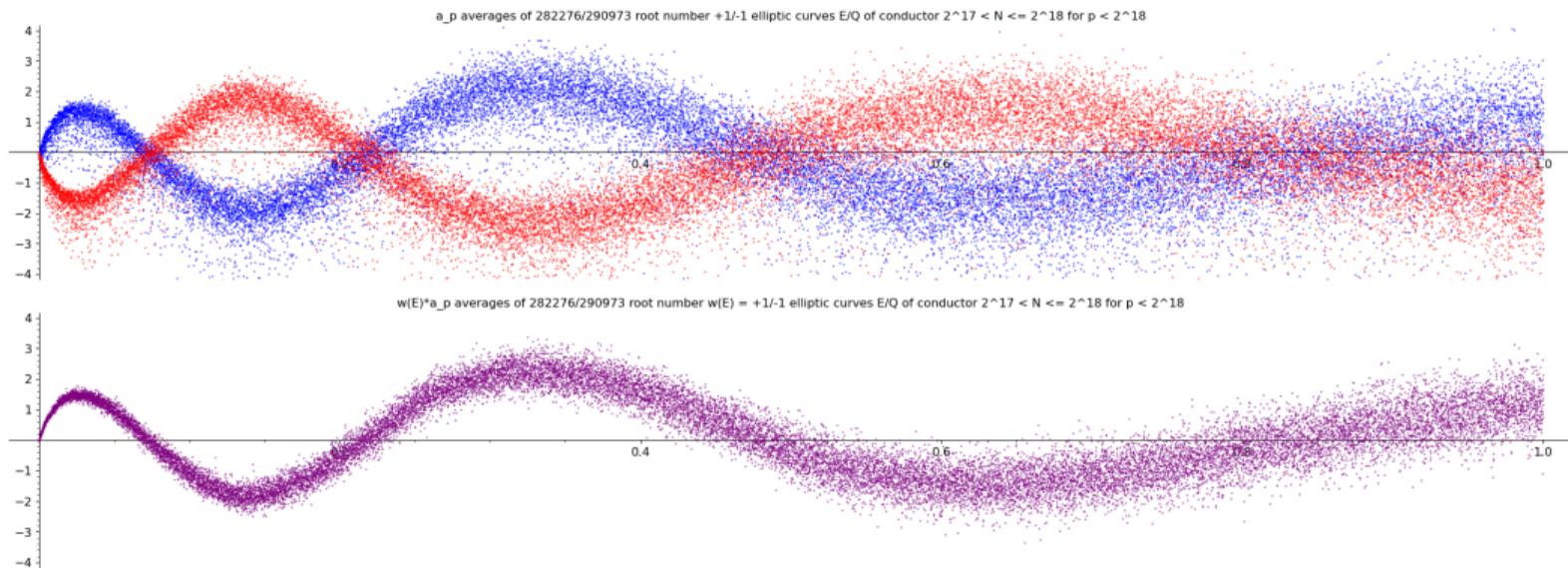
Murmurations of elliptic curves

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Blue/red/purple dots at $(p, \bar{a}_p$ or $\bar{m}_p)$ are averages of a_p or $m_p := (-1)^r a_p(E)$ over even/odd/all E/\mathbb{Q} .



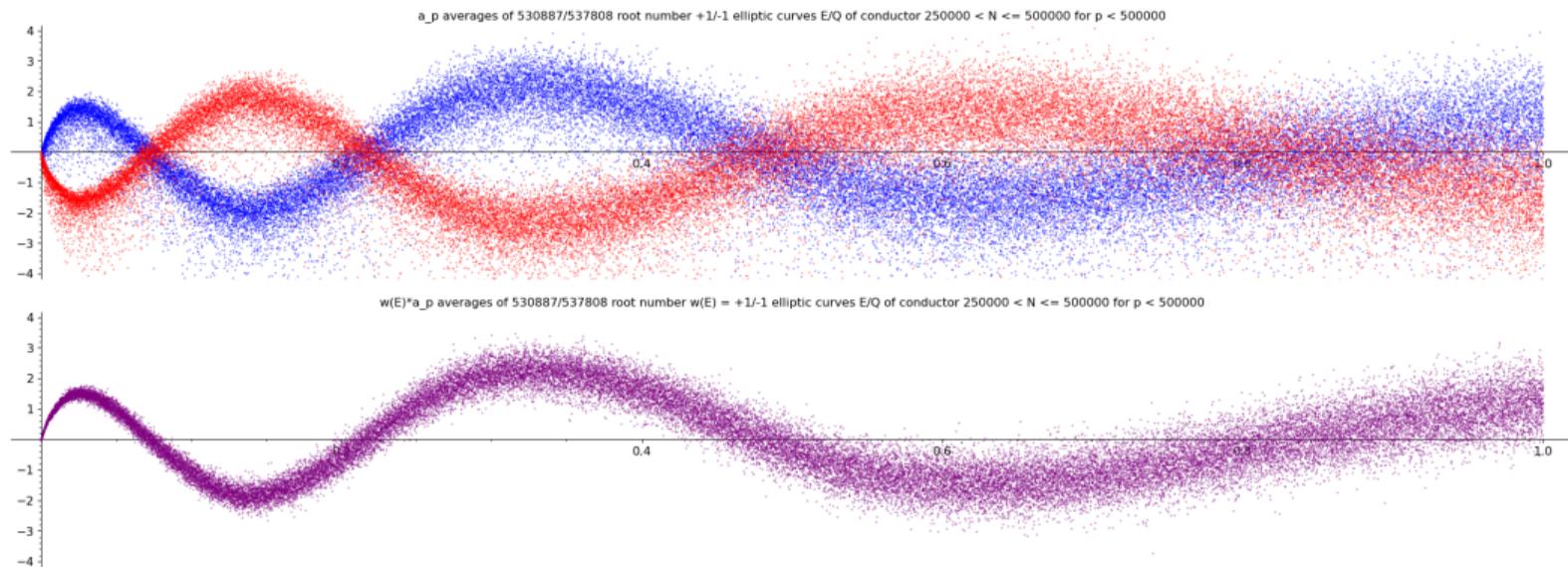
Murmurations of elliptic curves

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Blue/red/purple dots at $(p, \bar{a}_p$ or $\bar{m}_p)$ are averages of a_p or $m_p := (-1)^r a_p(E)$ over even/odd/all E/\mathbb{Q} .



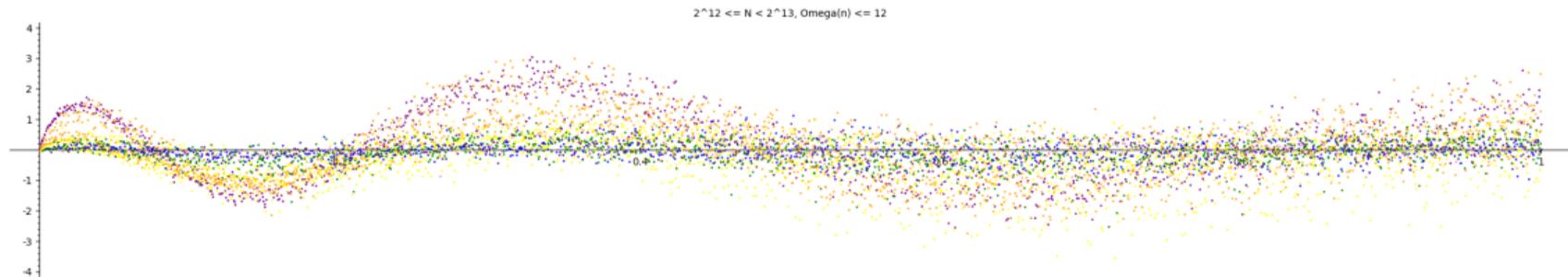
Murmurations of elliptic curves

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Blue/red/purple dots at $(p, \bar{a}_p$ or $\bar{m}_p)$ are averages of a_p or $m_p := (-1)^r a_p(E)$ over even/odd/all E/\mathbb{Q} .



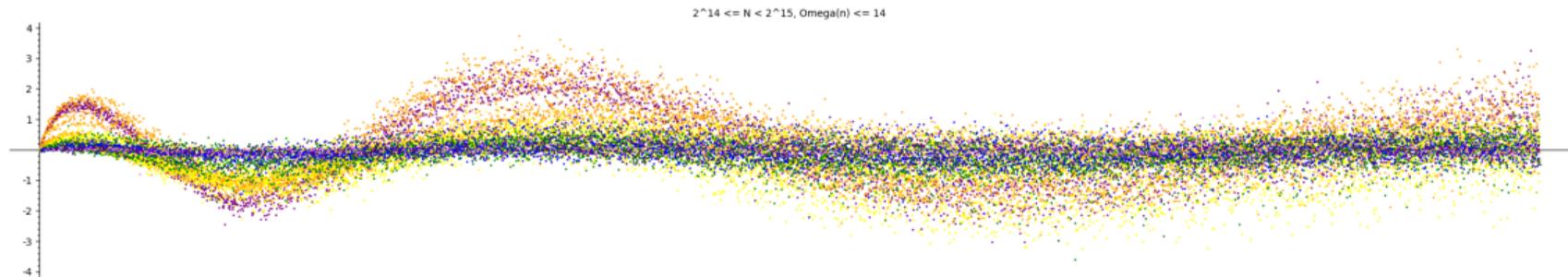
Murmurations of elliptic curves over a_n (not just a_p)

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Dots at (n, \bar{m}_n) show the average of $m_n := w(E)a_n(E)$ over all E/\mathbb{Q} with $N_E \in (M, 2M]$. The color of each dot indicates the number of prime factors of n (with multiplicity).



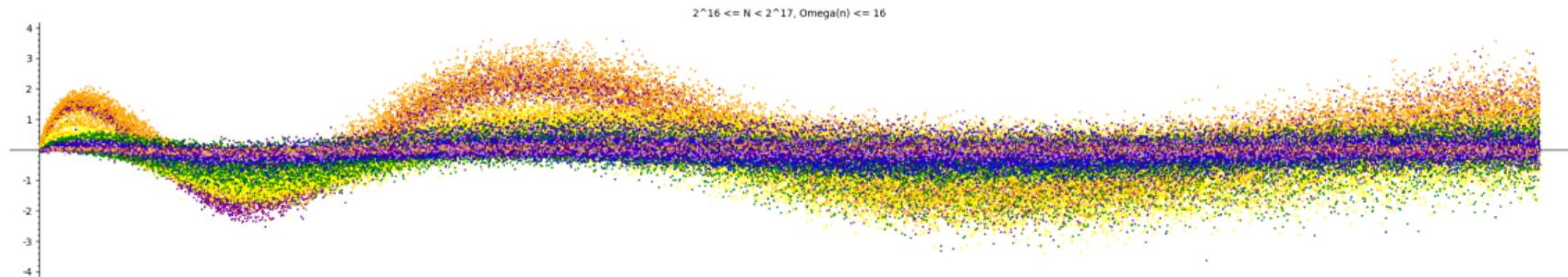
Murmurations of elliptic curves over a_n (not just a_p)

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Dots at (n, \bar{m}_n) show the average of $m_n := w(E)a_n(E)$ over all E/\mathbb{Q} with $N_E \in (M, 2M]$. The color of each dot indicates the number of prime factors of n (with multiplicity).



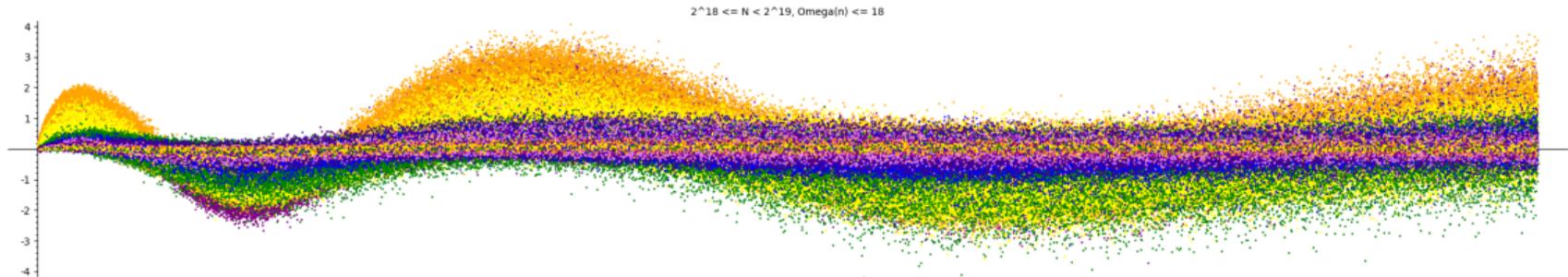
Murmurations of elliptic curves over a_n (not just a_p)

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Dots at (n, \bar{m}_n) show the average of $m_n := w(E)a_n(E)$ over all E/\mathbb{Q} with $N_E \in (M, 2M]$. The color of each dot indicates the number of prime factors of n (with multiplicity).



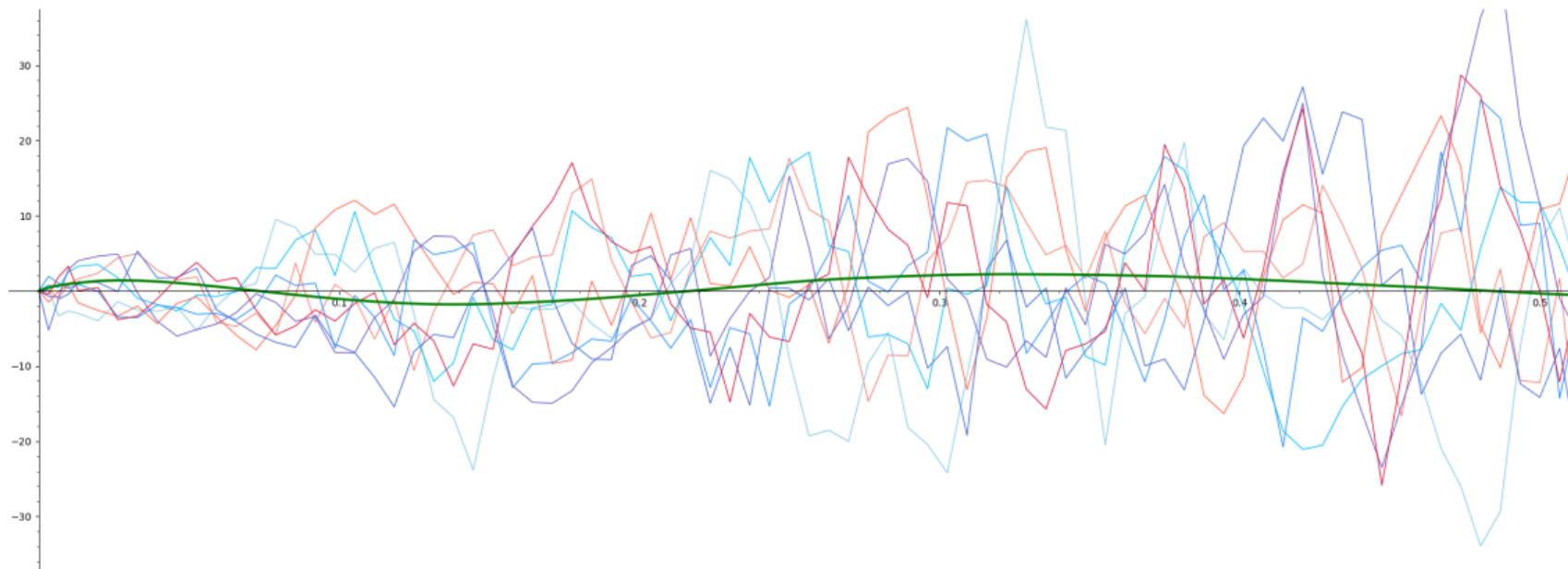
Murmurations of elliptic curves over a_n (not just a_p)

Elliptic curves of conductor $N \in (2^n, 2^{n+1}]$ for $11 \leq n \leq 18$. Dots at (n, \bar{m}_n) show the average of $m_n := w(E)a_n(E)$ over all E/\mathbb{Q} with $N_E \in (M, 2M]$. The color of each dot indicates the number of prime factors of n (with multiplicity).



Murmurations are an aggregate phenomenon

Moving average line plots of \bar{m}_p for 8 individual and all E/\mathbb{Q} with $N_E \in (M, 2M]$, using subintervals of size \sqrt{M} for $p \leq 2M$, with $M = 2^{17}$.



147455.b2, 163839.a1, 180222.be2, 196606.b1, 212990.11, 229374.a1, 245758.a1, 262143.d1

Zubrilina's theorem

Definition. Let $U_n \in \mathbb{Z}[x]$ denote the Chebyshev polynomial defined by $U_n(\cos \vartheta) \sin \vartheta = \sin((n+1)\vartheta)$. The **murmuration density function** is

$$M_k(y) := D_k \left(Ay - (-1)^{k/2} B \sum_{1 \leq r \leq 2y} c(r) \sqrt{4y^2 - r^2} U_{k-2}\left(\frac{r}{2y}\right) - \pi y^2 \delta_{k=2} \right),$$

$$A := \prod_p \left(1 + \frac{p}{(p+1)^2(p-1)} \right), \quad B := \prod_p \frac{p^4 - 2p^2 - p + 1}{(p^2 - 1)^2}, \quad c(r) := \prod_{p|r} \left(1 + \frac{p^2}{p^4 - 2p^2 - p + 1} \right), \quad D_k := \frac{12}{(k-1)\pi \prod_p \left(1 - \frac{1}{p^2+p} \right)}.$$

Theorem (Zubrilina 2023)

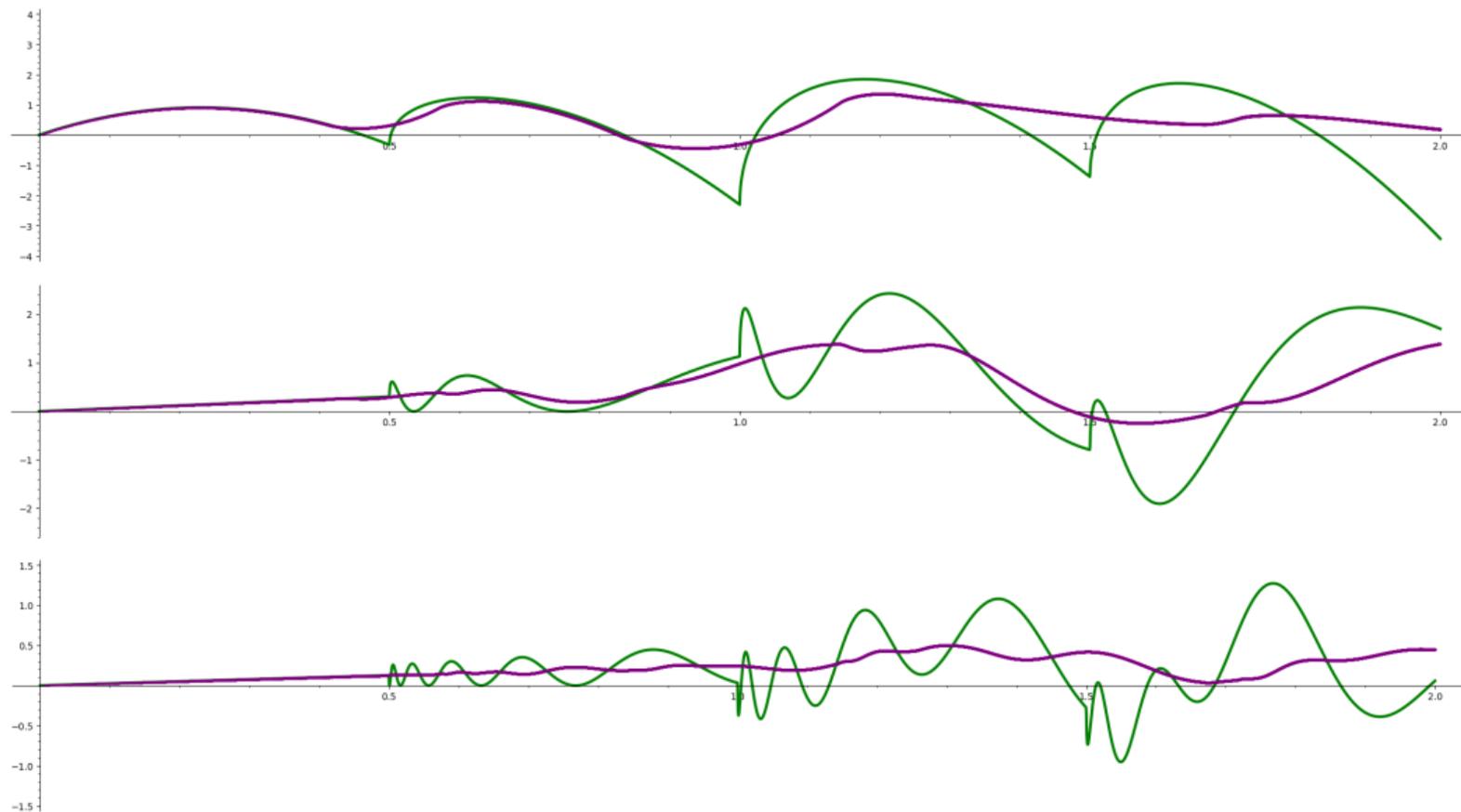
Let $\sum a_n(f)q^n$ denote a weight- k newform for $\Gamma_0(N)$ with root number $w(f)$. Let $X, Y, P \rightarrow \infty$ with P prime, $Y \sim X^{1-\delta}$, $P \ll X^{1+\delta_1}$, $\delta, \delta_1 > 0$ and $2\delta_1 < \delta < 1$, and put $y := \sqrt{P/X}$. Then for every $\varepsilon > 0$ we have

$$\frac{\sum_{N \in [X, X+Y]}^{\square\text{-free}} \sum_f w(f) a_P(f) P^{(1-k/2)}}{\sum_{N \in [X, X+Y]}^{\square\text{-free}} \sum_f 1} = M_k(y) + O_\varepsilon(X^{-\delta'+\varepsilon} + P^{-1})$$

where $\delta' := \max(\delta/2 - \delta_1, (\delta + 1)/9 - \delta_1)$; for $\delta_1 < 2/9$ we can choose δ so $\delta' > 0$.

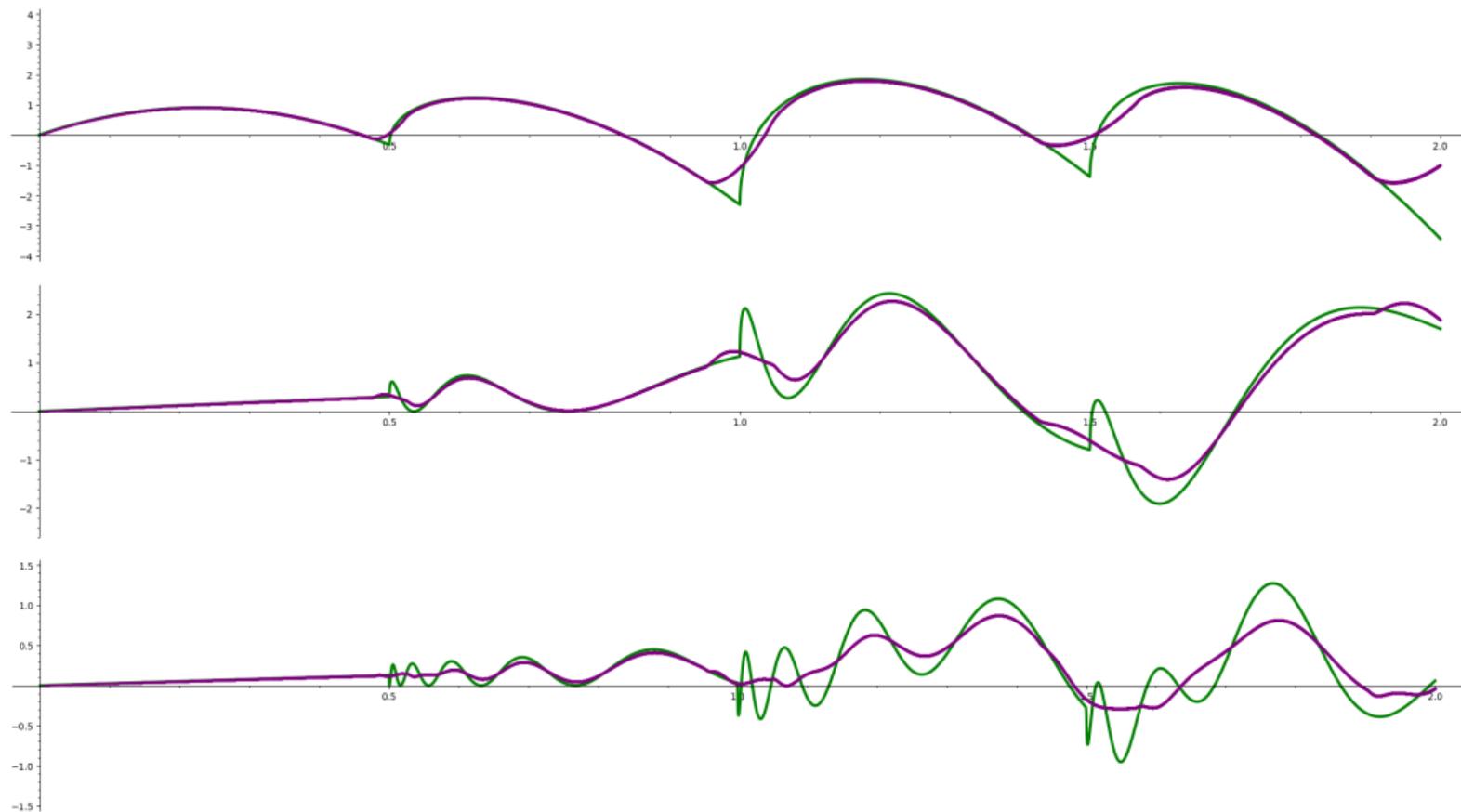
Zubrilina's theorem for $k = 2, 14, 32$

(click here for other k)



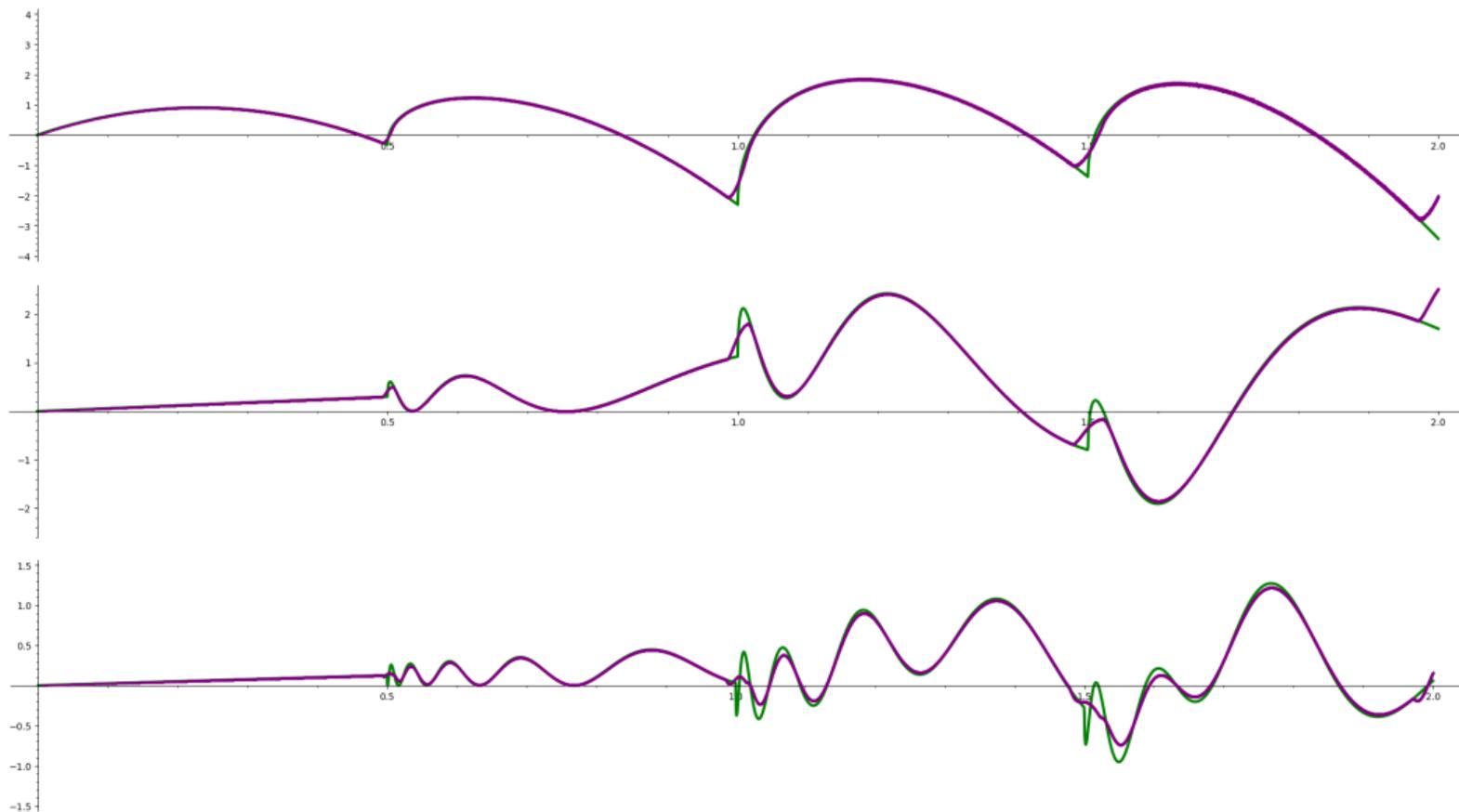
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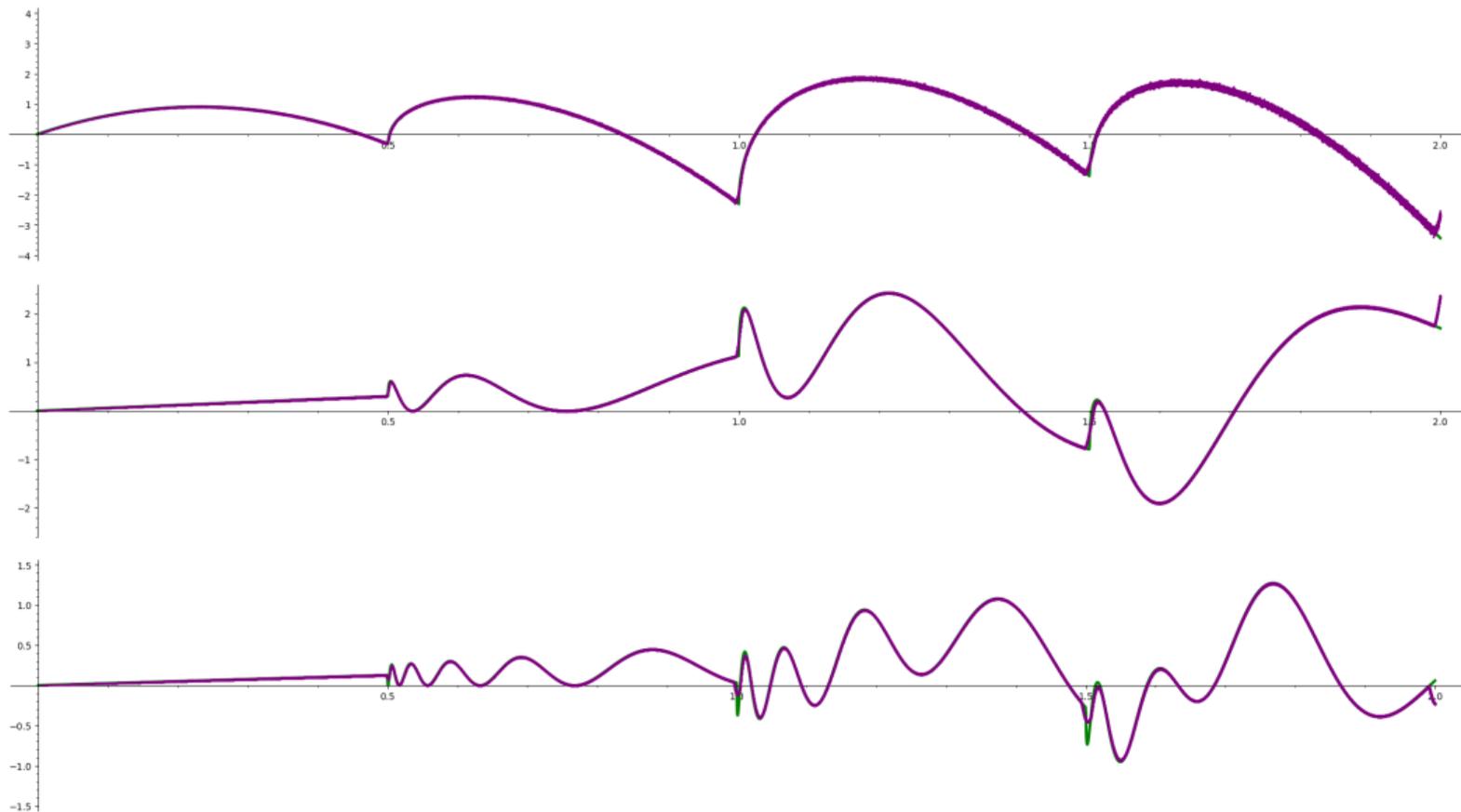
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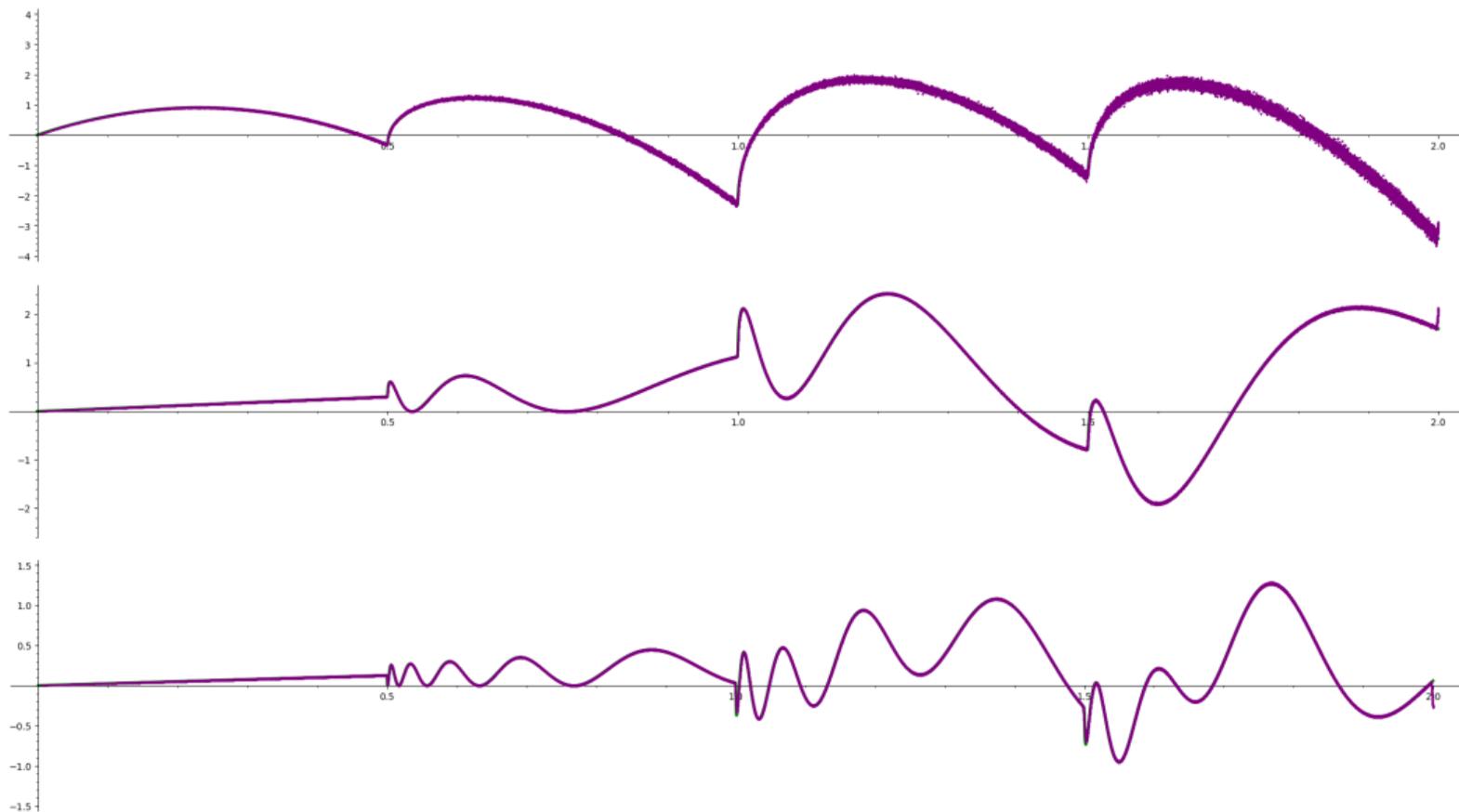
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Zubrilina's theorem for $k = 2, 14, 32$

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A murmuration theorem for elliptic curves

Let $\mathcal{E}(X) := \{y^2 = x^3 + ax + b : a, b \in \mathbb{Z}, p^4 | a \Rightarrow p^6 \nmid b, \max(4|a|^3, 27b^2) \leq X\}$
be the set of isomorphism classes of elliptic curves over \mathbb{Q} of naive height at most X .

Theorem (S–Sawin 2025)

For any smooth $W: \mathbb{R}_{>0} \rightarrow \mathbb{R}$ with compact support, the limit

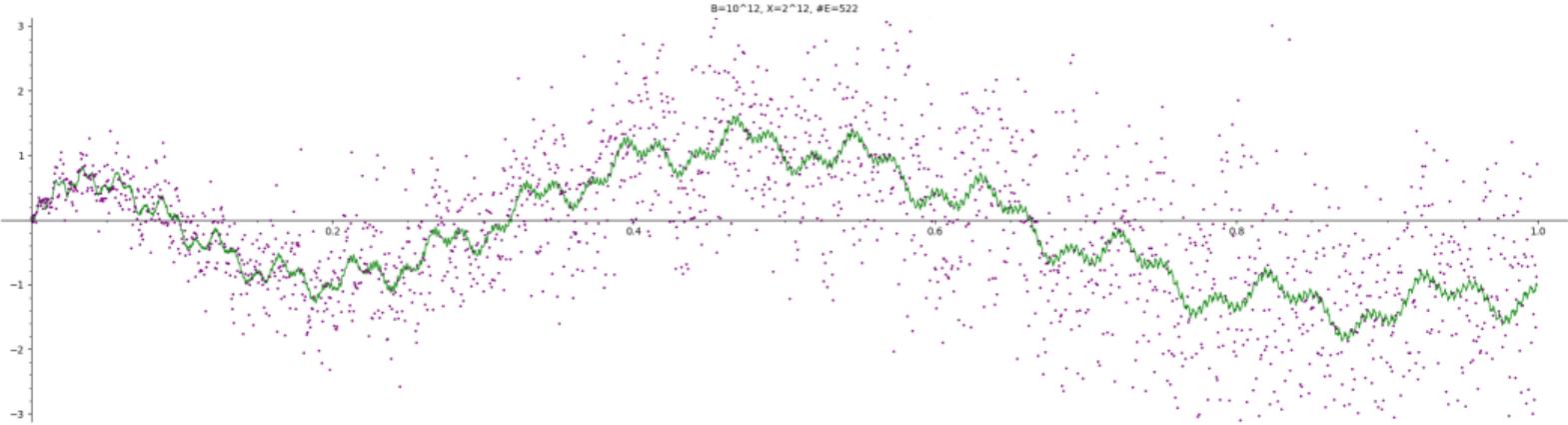
$$\lim_{X \rightarrow \infty} \frac{1}{\#\mathcal{E}(X)} \sum_{E \in \mathcal{E}(X)} \frac{\varepsilon(E)}{N_E} \sum_{n \geq 1} W(n/N_E) a_n(E)$$

exists and is equal to

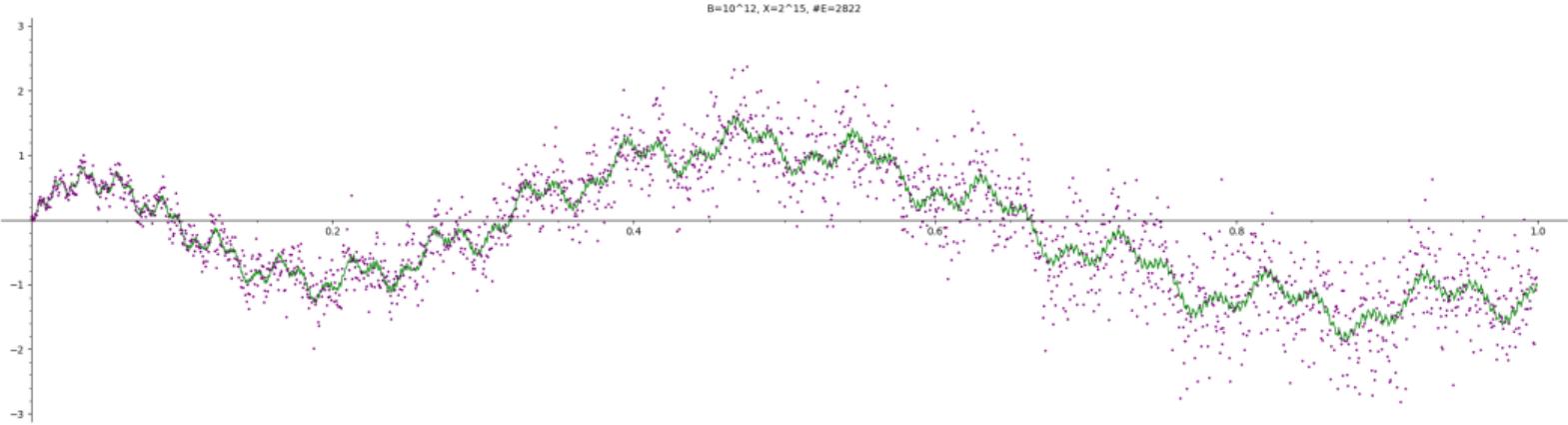
$$\int_0^\infty 2\pi W(u) \sum_{n=1}^\infty \frac{\prod_{p|n} \ell_{p^{\nu_p(n)}}}{\sqrt{n}} \sqrt{u} J_1(4\pi\sqrt{un}) du,$$

with $\ell_{2^\nu} = \frac{t_2(\nu+2)}{1023}$, $\ell_{3^\nu} = \dots$, $\ell_{p^\nu} = \frac{p^9 - p^8}{p^{10} - 1} t_p(\nu + 2)$, where $t_p(k) = \text{tr}(T_p)$ on $S_k(1)$.

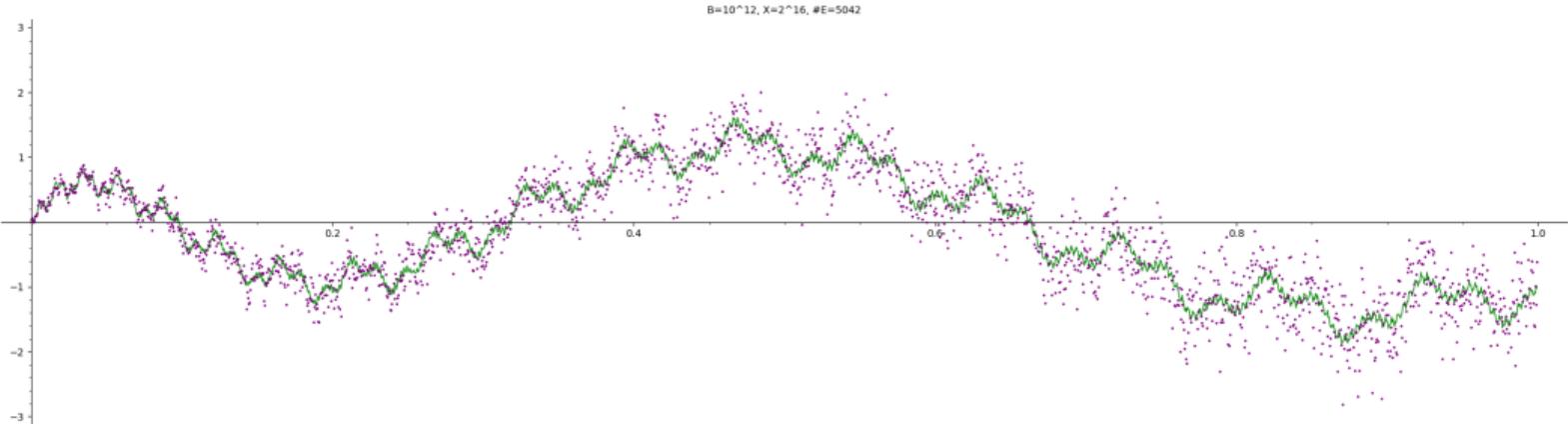
A murmuration theorem for elliptic curves



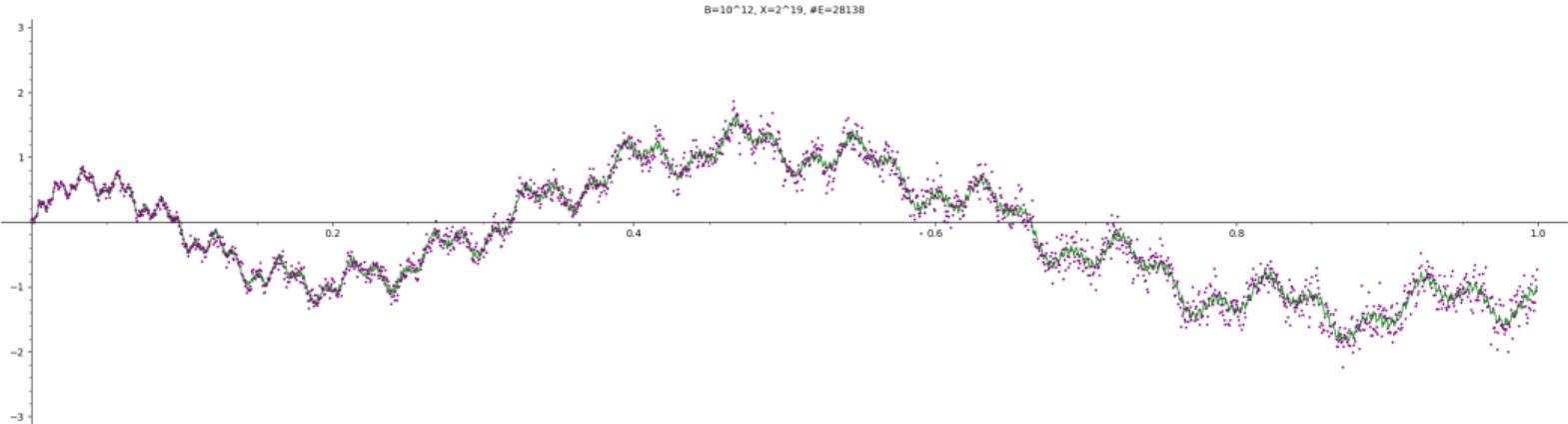
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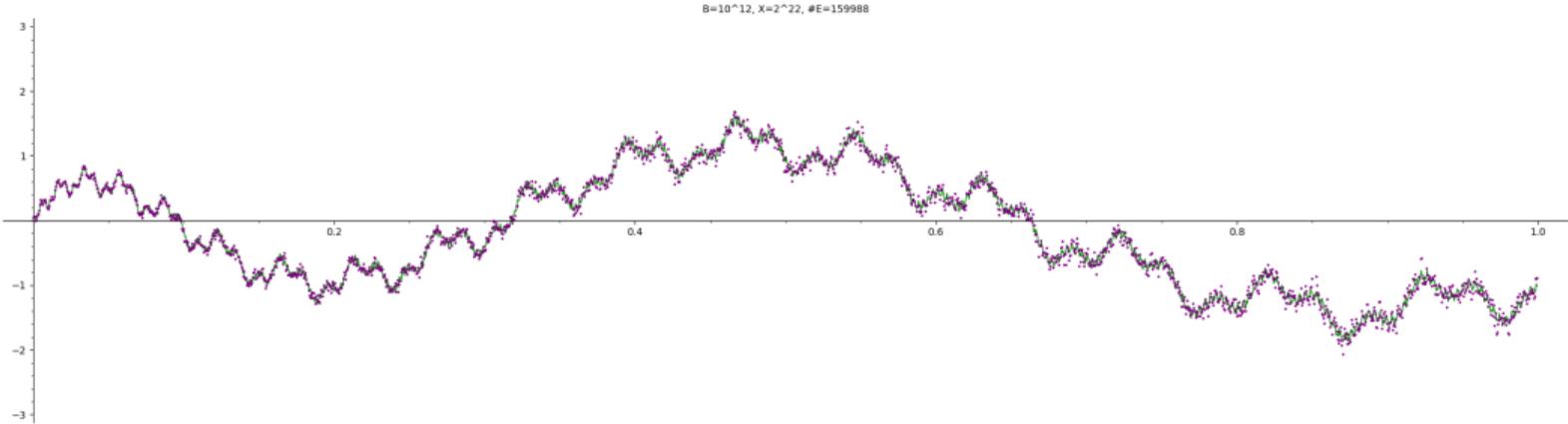
A murmuration theorem for elliptic curves



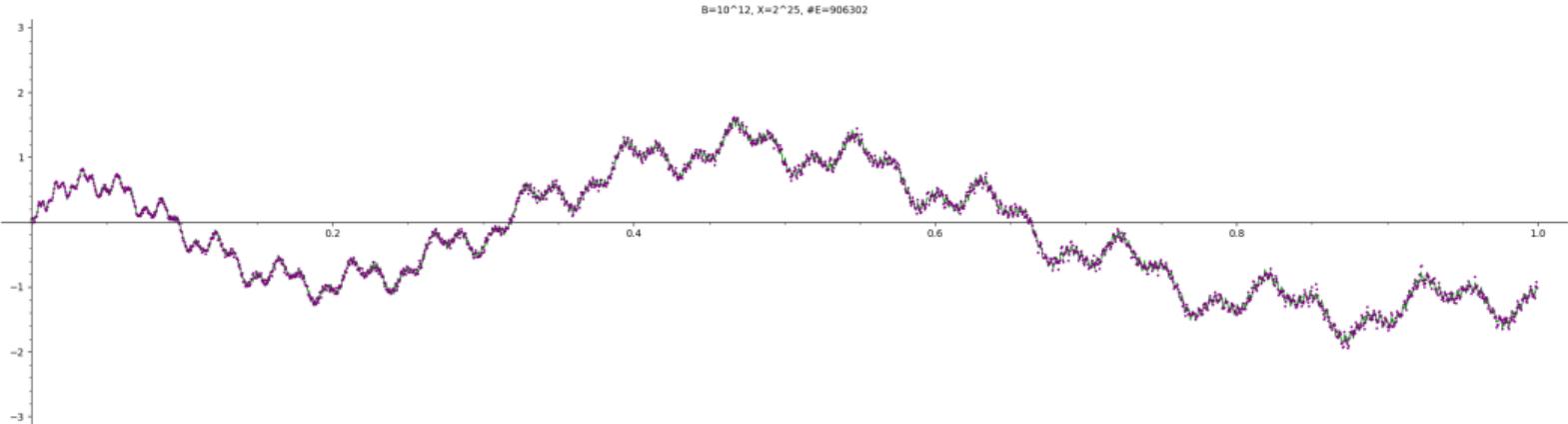
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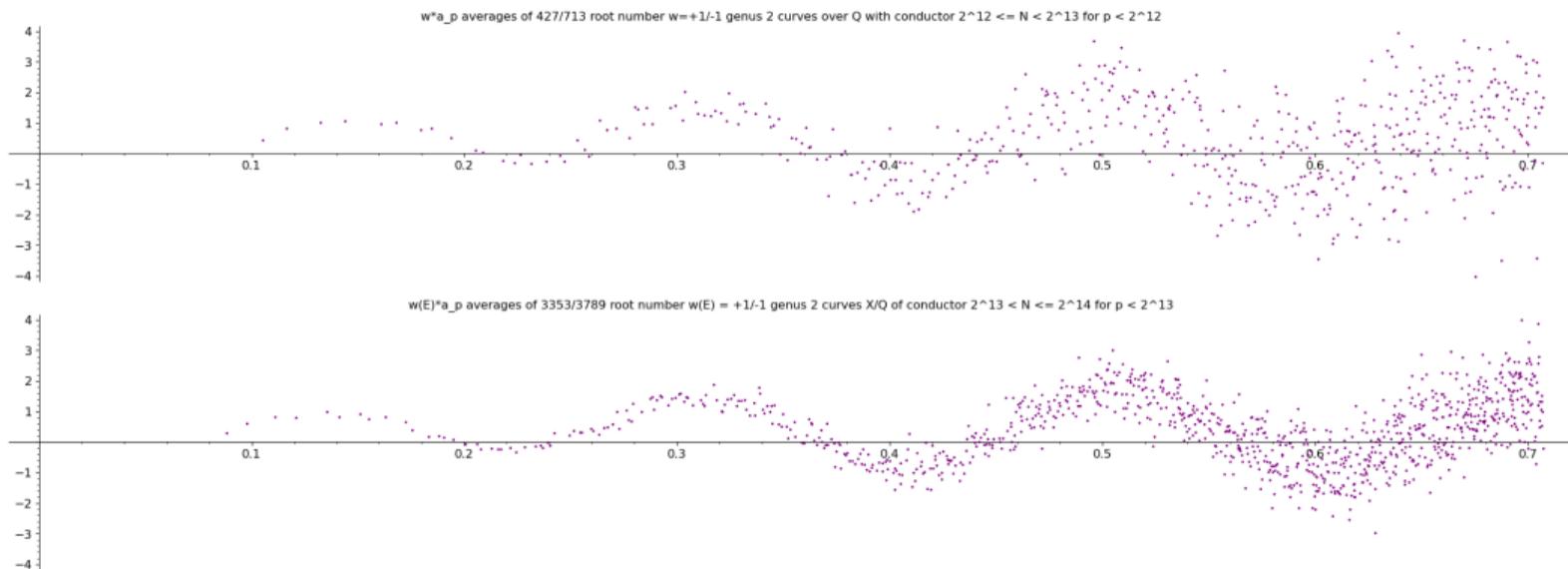


A murmuration theorem for elliptic curves



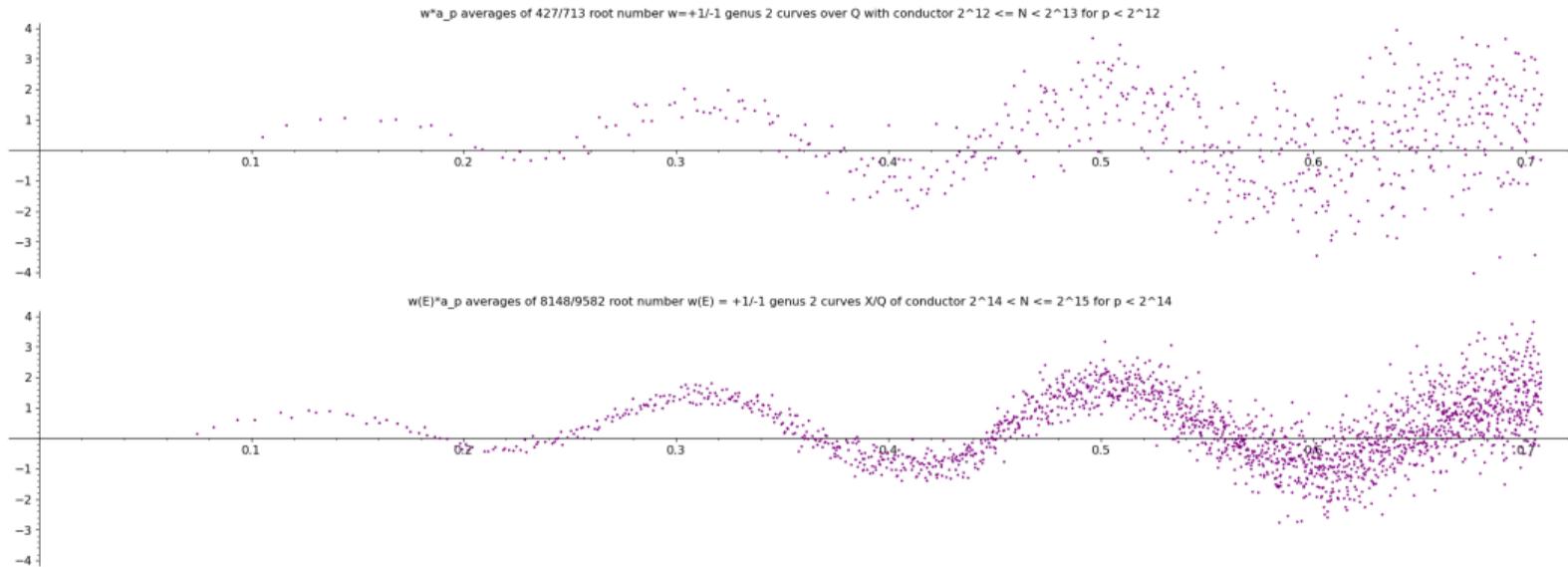
L -functions of genus 2 curves over \mathbb{Q} with Sato-Tate group $USp(4)$.

Before and after genus 2 murmuration plots (top LMFDB, bottom new dataset).



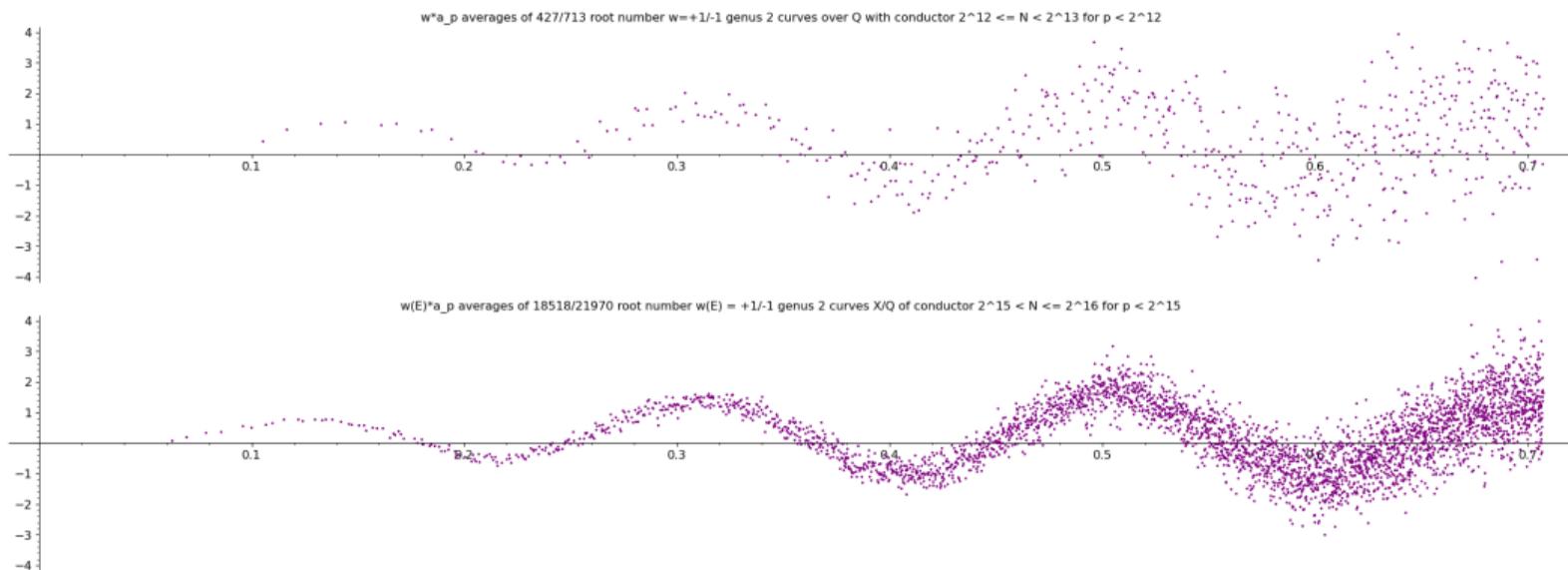
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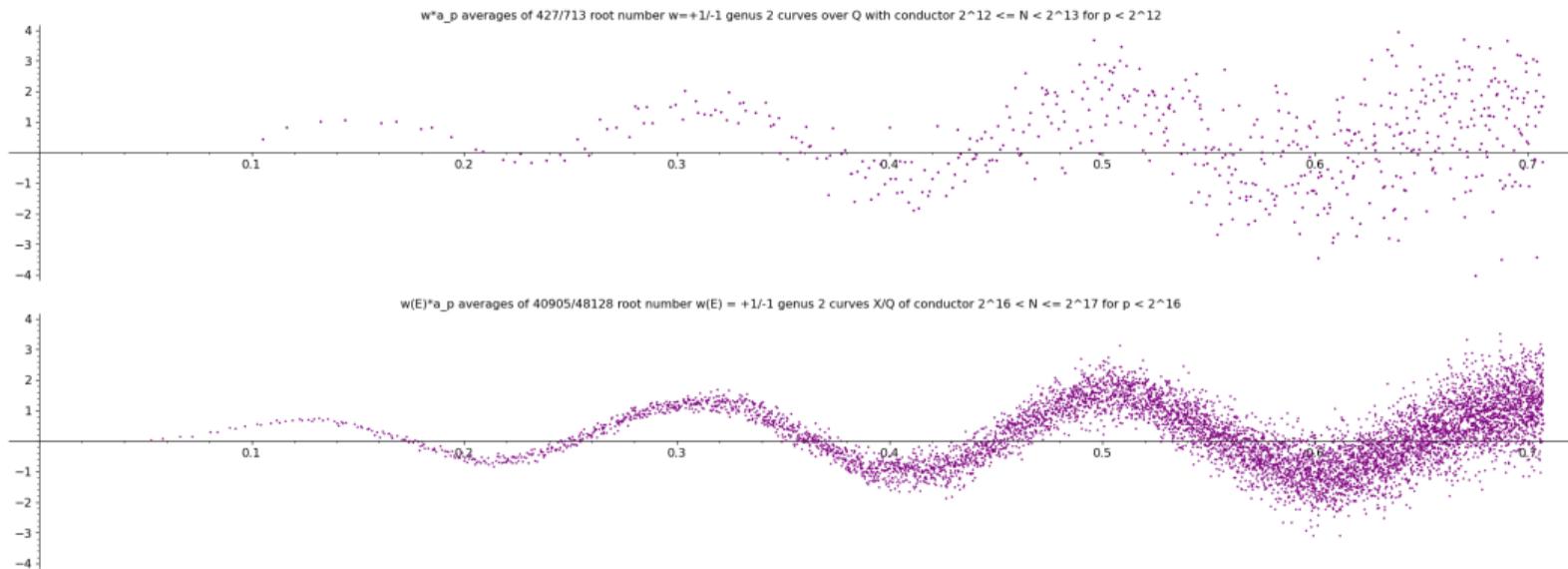
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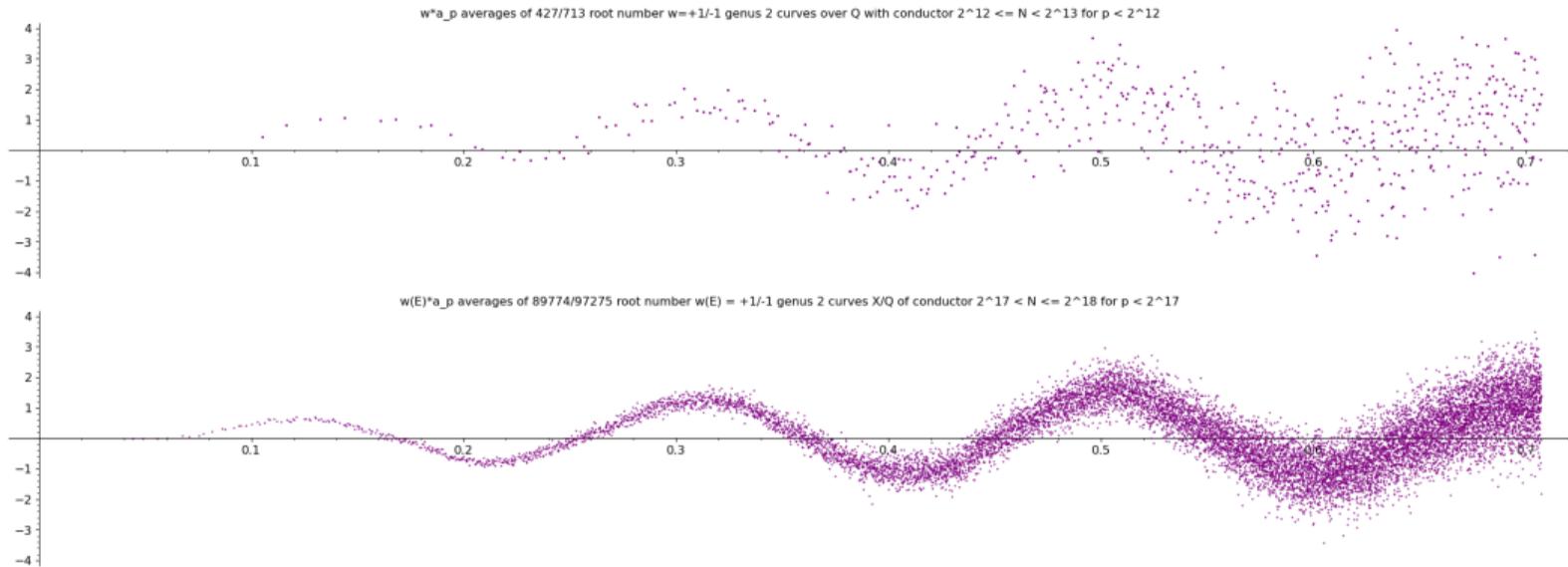
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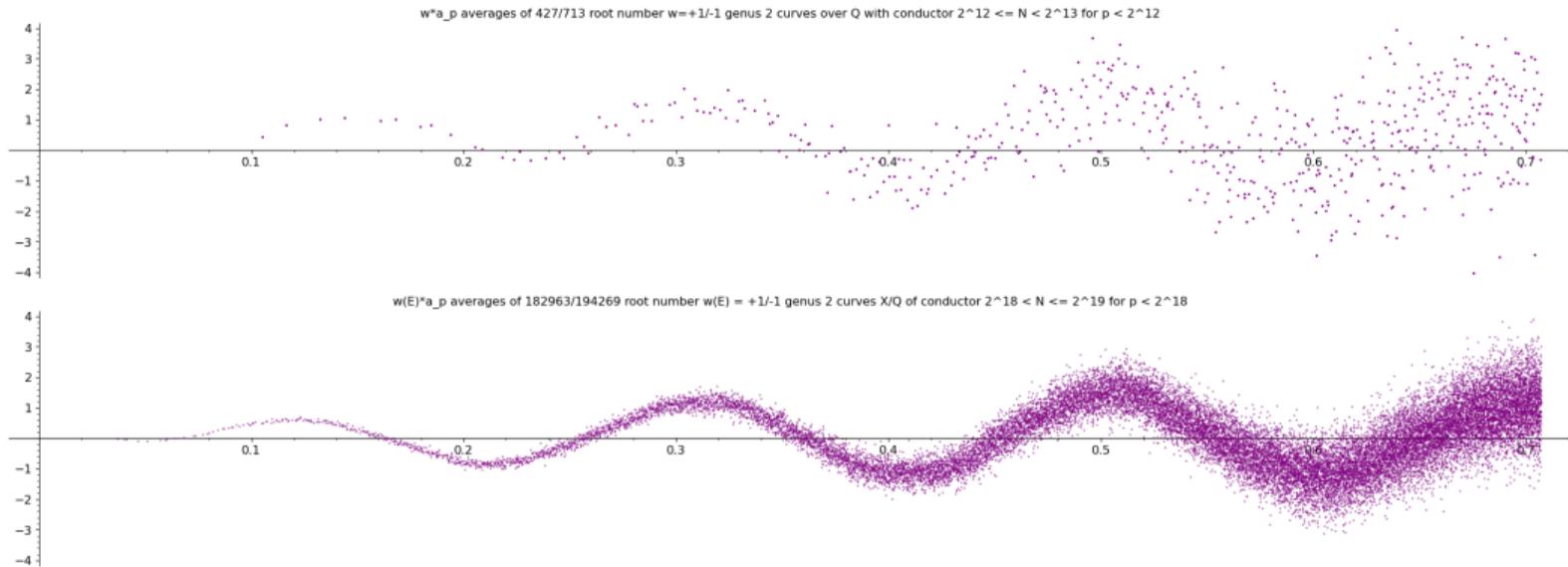
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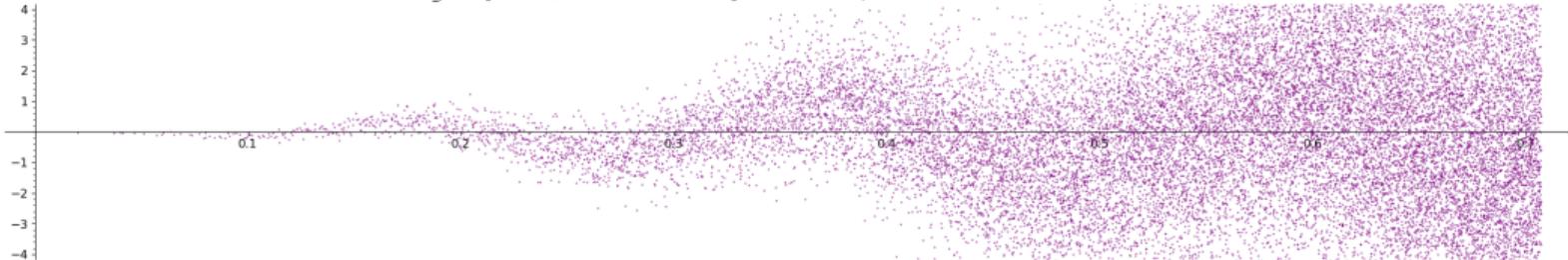
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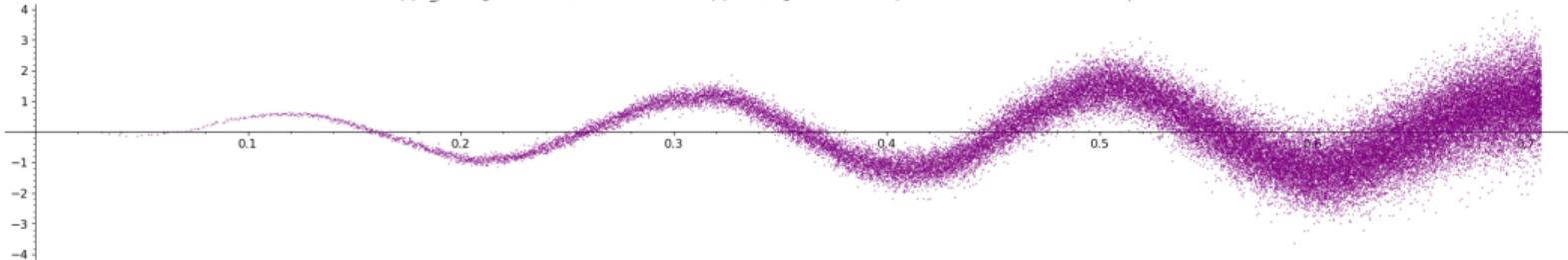
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w^*a_p averages of 7616/7503 root number $w=+1/-1$ genus 2 curves over \mathbb{Q} with conductor $2^{19} \leq N < 2^{20}$ for $p < 2^{18}$



$w(E)^*a_p$ averages of 356315/361597 root number $w(E) = +1/-1$ genus 2 curves X/\mathbb{Q} of conductor $2^{19} < N \leq 2^{20}$ for $p < 2^{19}$



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