

Murmurations of arithmetic L -functions

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Simons Collaboration in Arithmetic Geometry, Number Theory, and Computation

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Joint work with Yang-Hui He, Kyu-Hwan Lee, Thomas Oliver, and Alexey Pozdnyakov, with thanks to Eran Assaf, Jonathan Bober, Andrew Booker, Edgar Costa, Alex Cowan, Min Lee, David Lowry-Duda, Kimball Martin, Peter Sarnak, Will Sawin, and Nina Zubrilina.

Elliptic curves and their L -functions

Let E/\mathbb{Q} be an elliptic curve, say $E: y^2 = x^3 + Ax + B$ with $A, B \in \mathbb{Z}$.

For primes $p \nmid \Delta(E) := -16(4A^3 + 27B^2)$ this equation defines an elliptic curve E/\mathbb{F}_p .

For all such primes p we have the **trace of Frobenius** $a_p(E) := p + 1 - \#E(\mathbb{F}_p) \in \mathbb{Z}$.

One can also define $a_p(E)$ for $p|\Delta(E)$, and then construct the **L -function**

$$L(E, s) := \prod_p (1 - a_p p^{-s} + \chi(p) p^{1-2s})^{-1} = \sum_{n \geq 1} a_n n^{-s}$$

where $\chi(p) = \begin{cases} 0 & p|N(E) \\ 1 & \text{otherwise} \end{cases}$ and the **conductor** $N(E)$ divides $\Delta(E)$.

But in fact the a_p for $p \nmid \Delta(E)$ determine $L(E, s)$ (via strong multiplicity one), as well as the conductor and **root number** $w(E) = \pm 1$ which appear in the **functional equation**

$$\Lambda(E, s) = w(E) N(E)^{1-s} \Lambda(E, 2-s),$$

where $\Lambda(s) := \Gamma_{\mathbb{C}}(s) L(E, s)$. The L -function $L(E, s)$ determines the **isogeny class** of E .

Arithmetic statistics of Frobenius traces of elliptic curves E/\mathbb{Q}

Three conjectures from the 1960s and 1970s (the first is now a theorem):

1. **Sato–Tate:** The sequence $x_p := a_p(E)/\sqrt{p}$ is equidistributed with respect to the pushforward of the Haar measure of $ST(E)$ ($= SU(2)$ if E does not have CM).
2. **Birch and Swinnerton-Dyer:**

$$\lim_{x \rightarrow \infty} \frac{1}{\log x} \sum_{p \leq x} \frac{a_p(E) \log p}{p} = \frac{1}{2} - r,$$

3. **Lang–Trotter:** For every nonzero $t \in \mathbb{Z}$ there is a real number $C_{E,t}$ for which

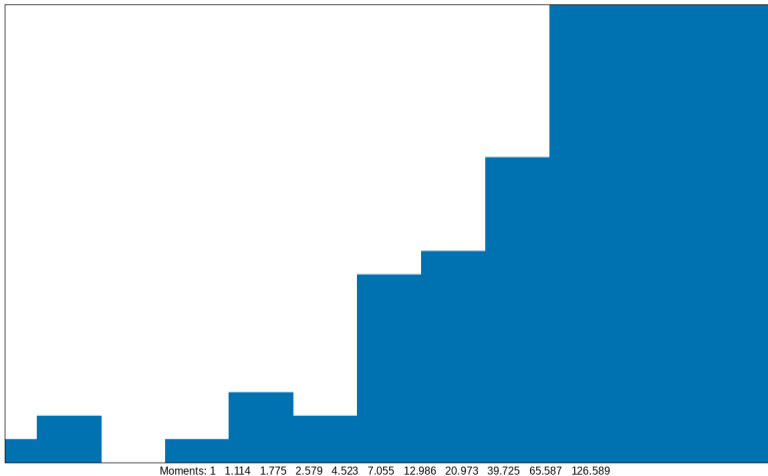
$$\#\{p \leq x : a_p(E) = t\} \sim C_{E,t} \frac{\sqrt{x}}{\log x}.$$

These conjectures depend only on $L(E, s)$ and generalize to other L -functions.

Example: Elkies-Klagsbrun curve of rank ≥ 29 .

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



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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

How rank effects trace distributions

An early form of the BSD conjecture implies that

$$\lim_{x \rightarrow \infty} \frac{1}{\log x} \sum_{p \leq x} \frac{a_p(E) \log p}{p} = \frac{1}{2} - r. \quad (1)$$

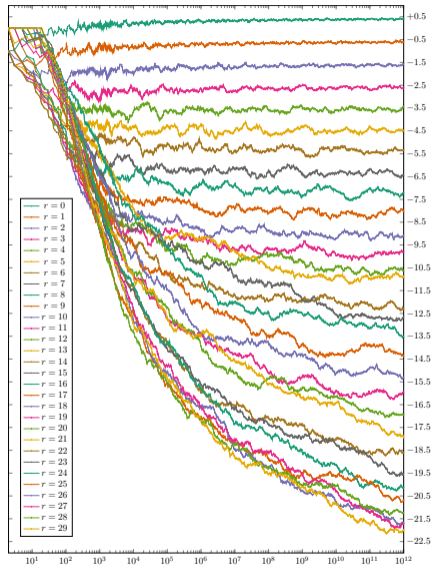
Sums of this form (Mestre-Nagao sums) are often used as a tool when searching for elliptic curves of large rank (which necessarily have large conductor N).^{1 2}

Theorem (Kim-Murty 2023)

If the limit on the LHS of (1) exists then it equals the RHS with r the analytic rank, and the L -function of E satisfies the Riemann hypothesis.

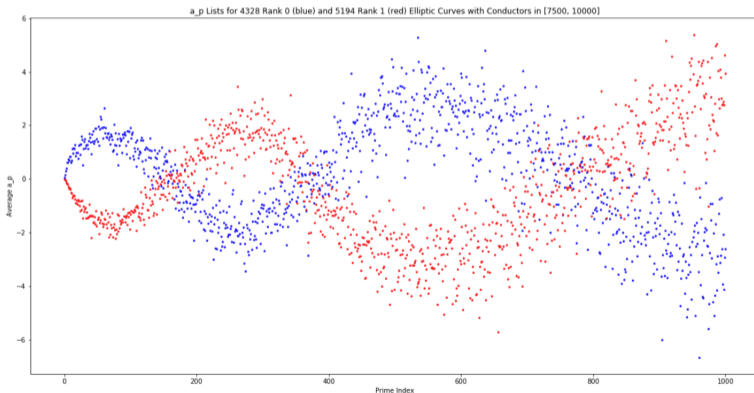
¹See [Sarnak's 2007 letter to Mazur](#).

²See [Kazalicki-Vlah](#) for some recent machine-learning work on this topic.



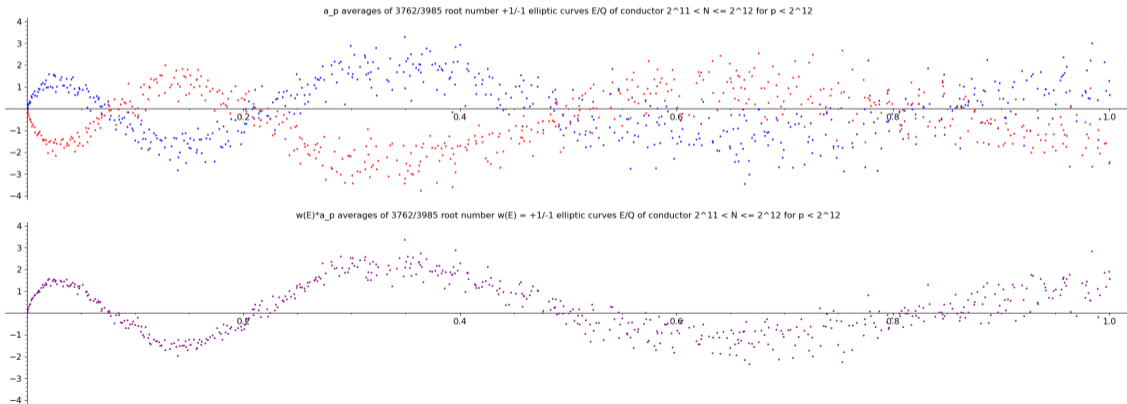
Murmurations of elliptic curves

In their 2022 preprint *Murmurations of elliptic curves* (recently [published](#)), He, Lee, Oliver, and Pozdnyakov observed a curious fluctuation in average Frobenius traces of elliptic curves in a fixed conductor interval when separated by rank.



Murmurations of elliptic curves

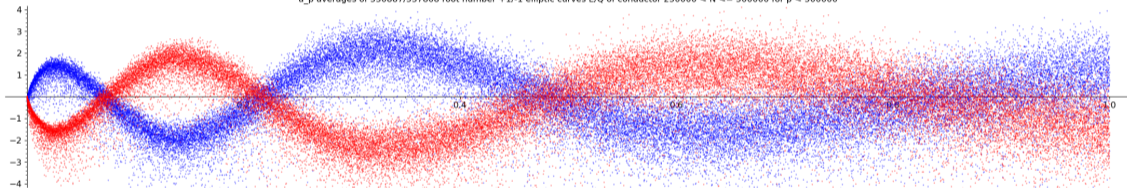
Elliptic curve L -functions of conductor $N \in (M, 2M]$ for $M = 2^{11}, 2^{12}, \dots, 2^{17}, 250000$. The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(p, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or $m_p := w(E)a_p(E)$ over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.



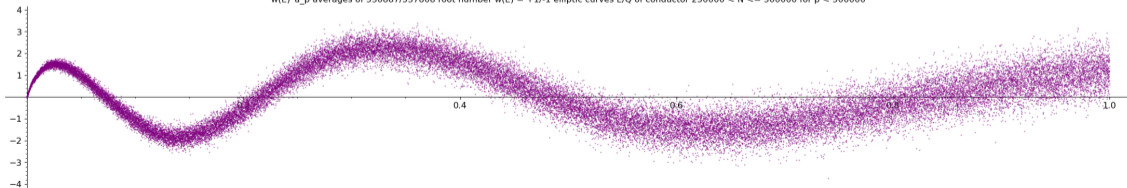
Murmurations of elliptic curves

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a_p averages of 530887/537808 root number +1/-1 elliptic curves E/Q of conductor 250000 < N <= 500000 for p < 500000



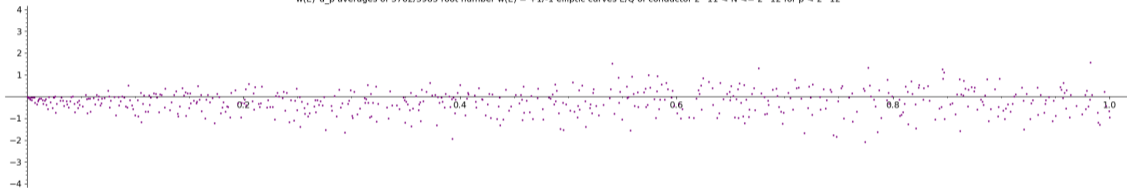
w(E)*a_p averages of 530887/537808 root number w(E) = +1/-1 elliptic curves E/Q of conductor 250000 < N <= 500000 for p < 500000



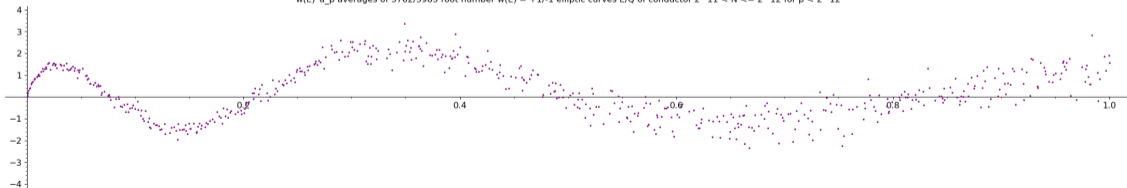
Bias cancellation

There is a negative bias in \bar{a}_p that depends on p but is independent of the root number $w(E)$ and disappears in \bar{m}_p .

$w(E) \cdot a_p$ averages of 3762/3985 root number $w(E) = +1/-1$ elliptic curves E/\mathbb{Q} of conductor $2^{11} < N \leq 2^{12}$ for $p < 2^{12}$

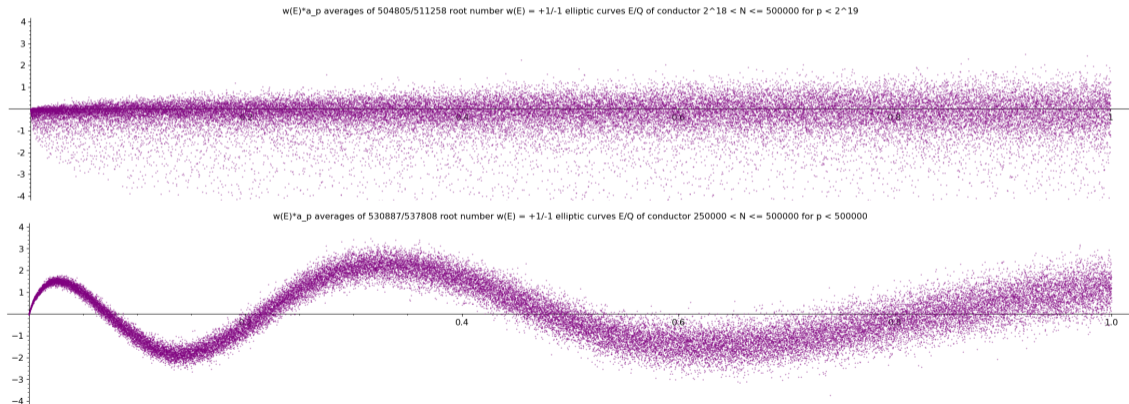


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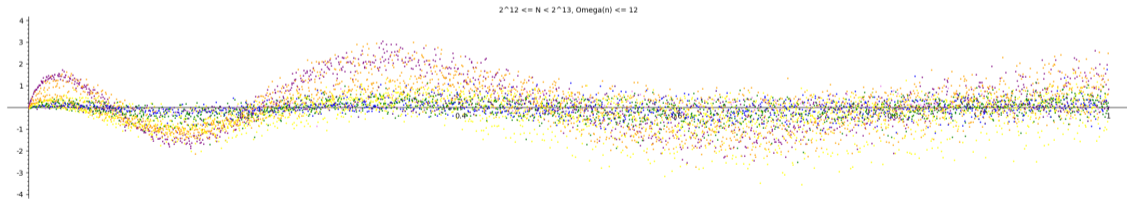
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Murmurations of elliptic curves over a_n (not just a_p)

Elliptic curve L -functions of conductor $N \in (M, 2M]$ for $M = 2^{12}, \dots, 2^{17}, 250000$.
The x -axis range is $[0, 2M]$. Dots at (n, \bar{m}_n) show the average of $m_n := w(E)a_n(E)$ over all E/\mathbb{Q} with $N_E \in (M, 2M]$.

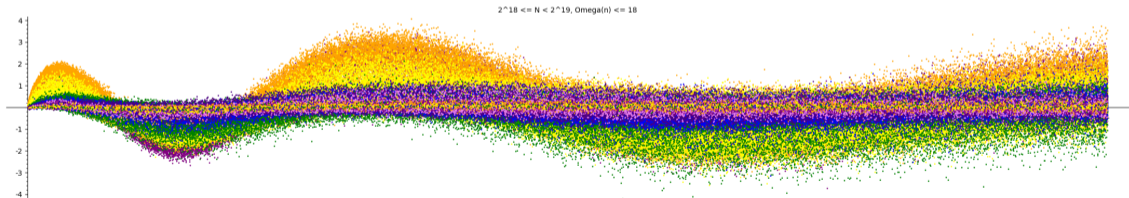
The color of the dot indicates the number of prime factors of n (with multiplicity).



Murmurations of elliptic curves over a_n (not just a_p)

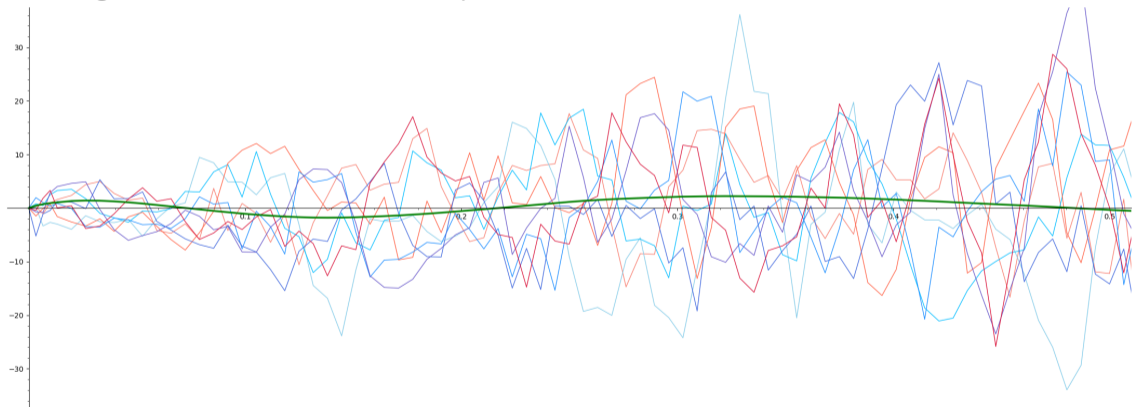
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Murmurations are an aggregate phenomenon

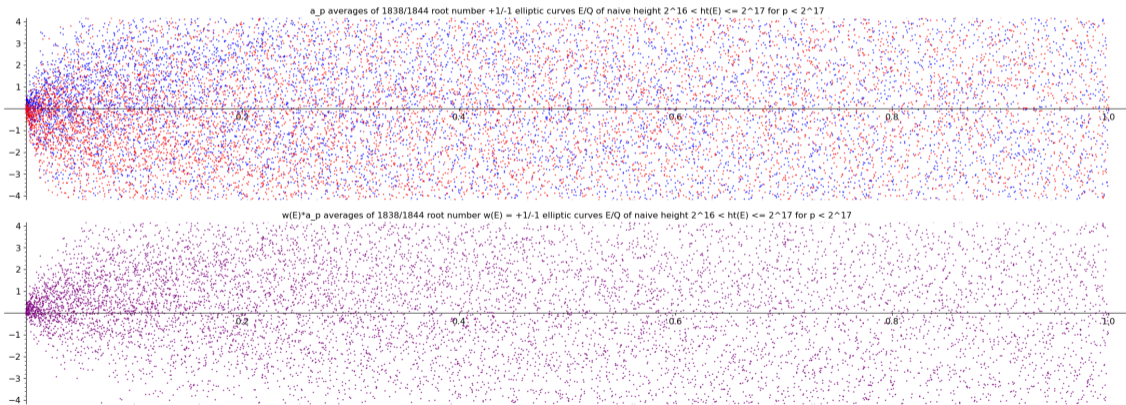
Moving average line plots of \bar{m}_p for 8 individual and all E/\mathbb{Q} with $N_E \in (M, 2M]$, using subintervals of size \sqrt{M} for $p \leq 2M$, with $M = 2^{17}$.



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

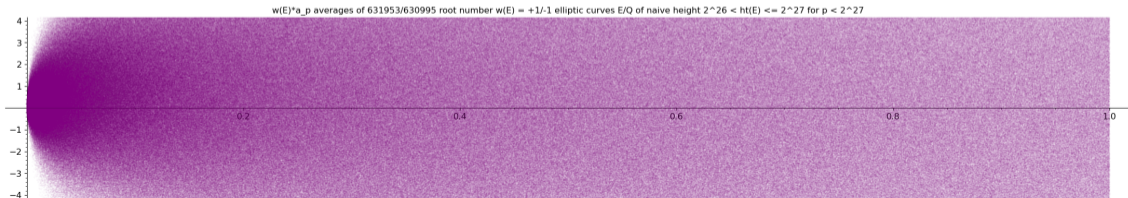
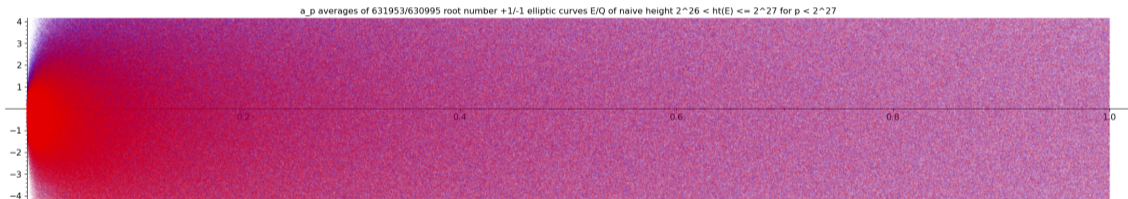
Ordering by height

Elliptic curves with $\text{ht}(E) := \max(4|A|^3, 27B^2)$ in $(M, 2M]$ for $M = 2^{16}, \dots, 2^{26}$. The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(p, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or m_p over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.



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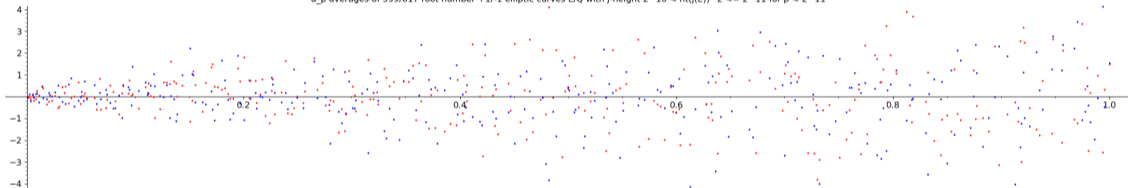


Ordering by j -invariant

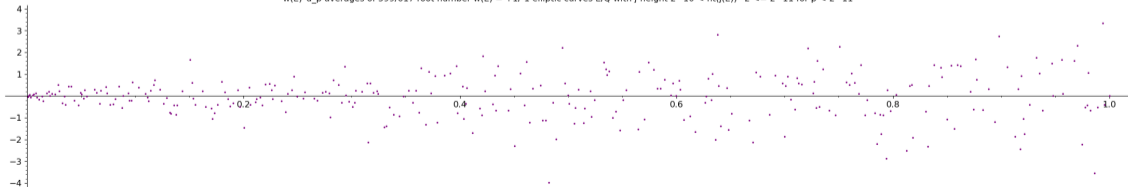
Elliptic curves with $\text{ht}(j(E))^{12/5}$ in $(M, 2M]$ for $M = 2^{11}, \dots, 2^{19}$.

The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(p, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or m_p over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.

a_p averages of 599/617 root number +1/-1 elliptic curves E/\mathbb{Q} with j -height $2^{10} < \text{ht}(j(E))^2 \leq 2^{11}$ for $p < 2^{11}$



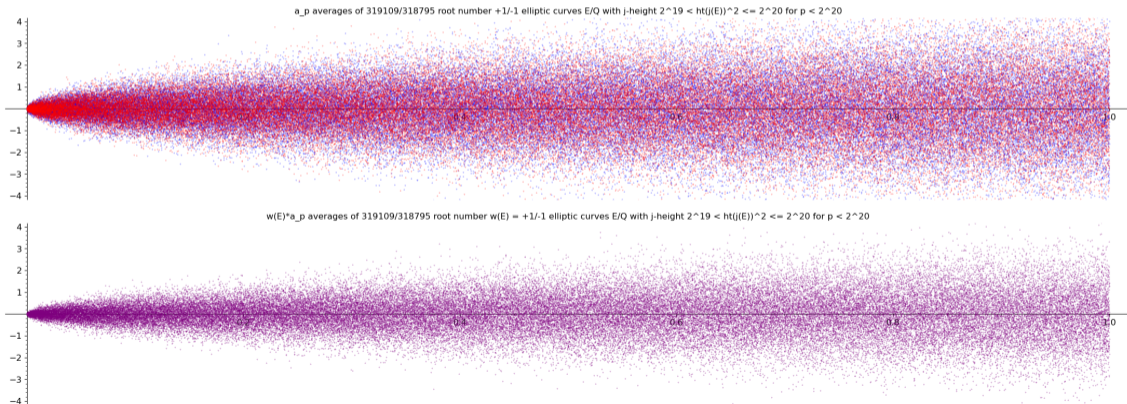
$w(E) \cdot a_p$ averages of 599/617 root number $w(E) = +1/-1$ elliptic curves E/\mathbb{Q} with j -height $2^{10} < \text{ht}(j(E))^2 \leq 2^{11}$ for $p < 2^{11}$



Ordering by j -invariant

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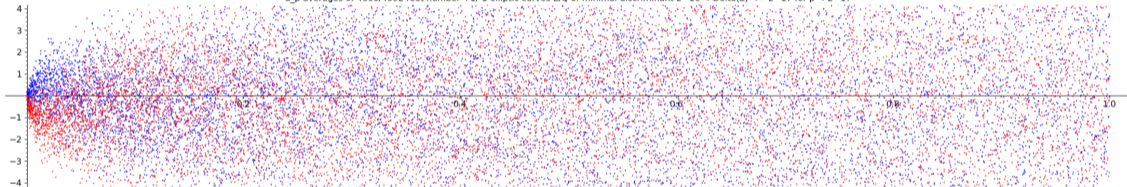
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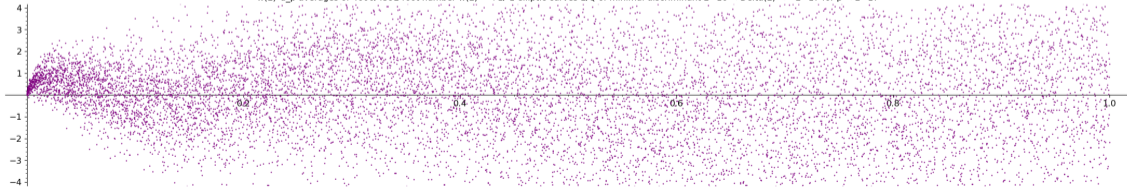
Ordering by minimal discriminant

Elliptic curves with minimal discriminant $\Delta(E)$ in $(M, 2M]$ for $M = 2^{16}, \dots, 2^{23}$. The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(p, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or m_p over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.

a_p averages of 4606/4592 root number +1/-1 elliptic curves E/\mathbb{Q} of minimal discriminant $2^{16} < \Delta(E) \leq 2^{17}$ for $p < 2^{17}$



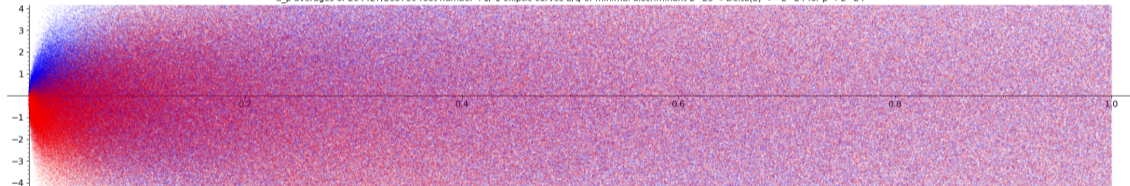
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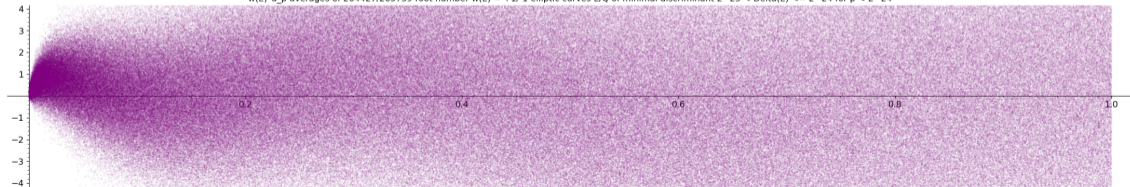
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a_p averages of 264427/265739 root number +1/-1 elliptic curves E/\mathbb{Q} of minimal discriminant $2^{23} < \Delta(E) \leq 2^{24}$ for $p < 2^{24}$



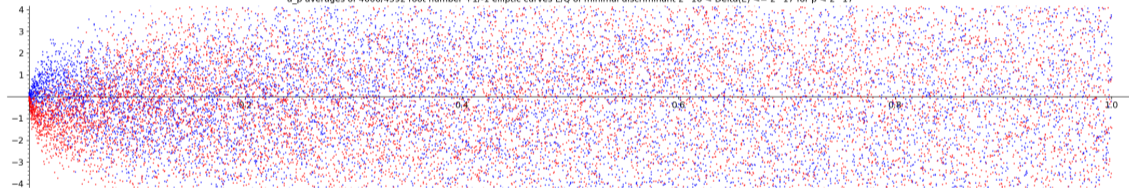
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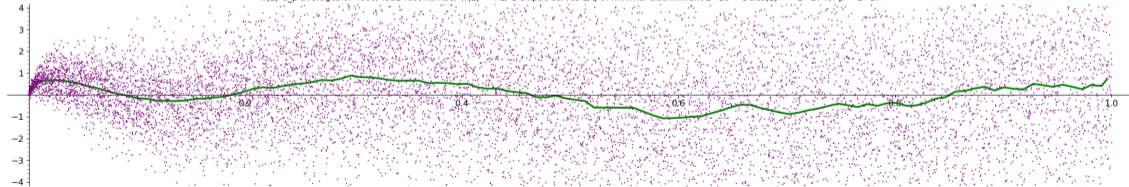
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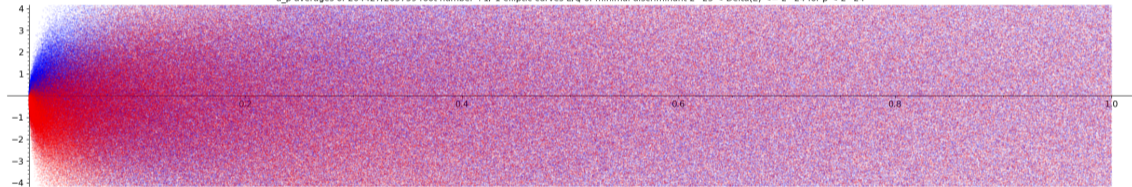
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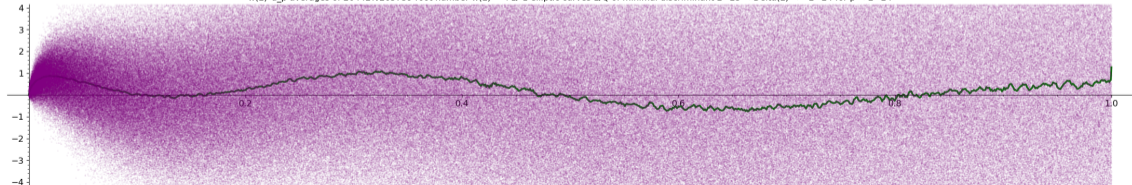
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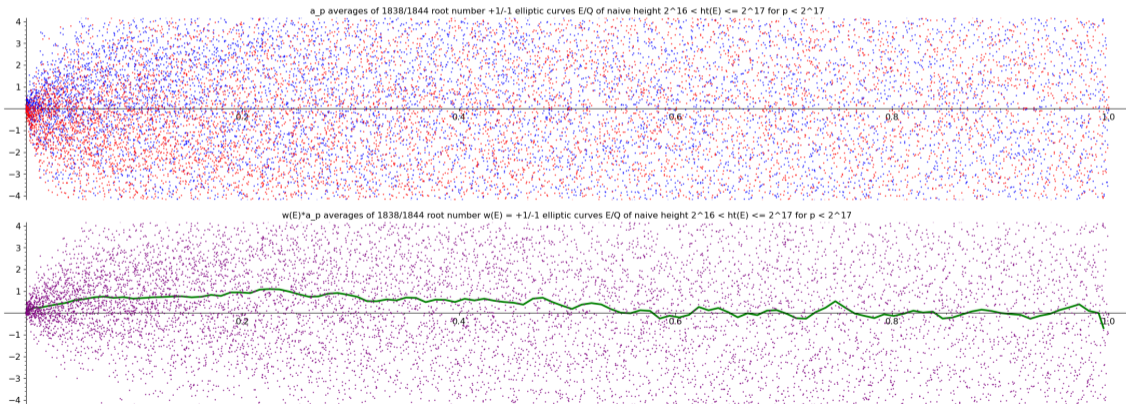


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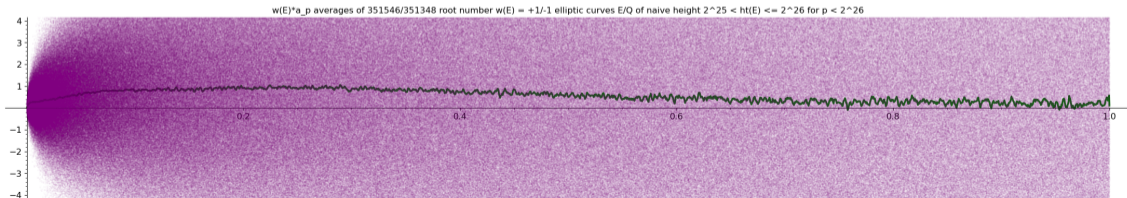
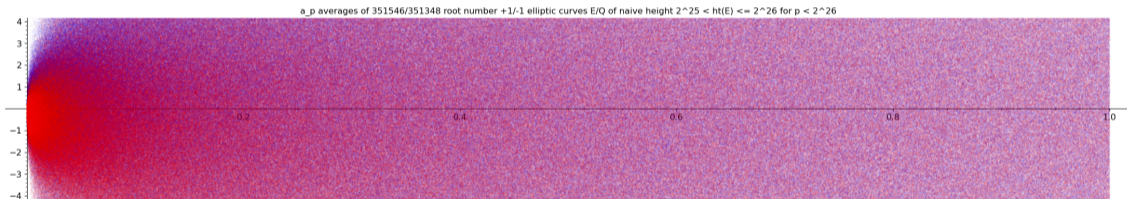
Ordering by height (redux)

Elliptic curves with $\text{ht}(E) := \max(4|A|^3, 27B^2)$ in $(M, 2M]$ for $M = 2^{16}, \dots, 2^{25}$. The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(p, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or m_p over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.



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Local averaging

Rather than averaging a_p 's for L -functions with conductor in an interval, we may instead compute local averages of a_p for each L -function in our family with p/N varying over some interval, and then average these local averages.

For example, we may divide the interval $[0, 1]$ into n intervals $(x, x + \frac{1}{n}]$, with $x = 0, \frac{1}{n}, \frac{2}{n}, \dots, \frac{n-1}{n}$. For each L -function in our family we compute a_p for all primes $p \leq N$, and then for $x = 0, \frac{1}{n}, \dots, \frac{n-1}{n}$ we compute the average $\alpha_x(E)$ of $a_p(E)$ for

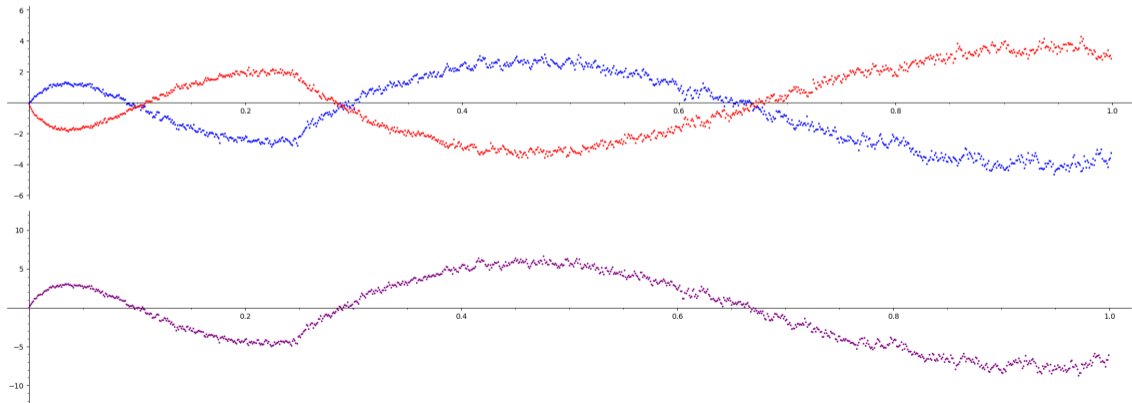
$$\frac{p}{N} \in \left(x, x + \frac{1}{n}\right],$$

yielding a vector of n real numbers. We then average these vectors over all L -functions in our family of a given root number or rank, up to an increasing bound $X \rightarrow \infty$.

With this setup, we do not need to order by conductor, but the order matters.

Local averaging: elliptic curves ordered by conductor

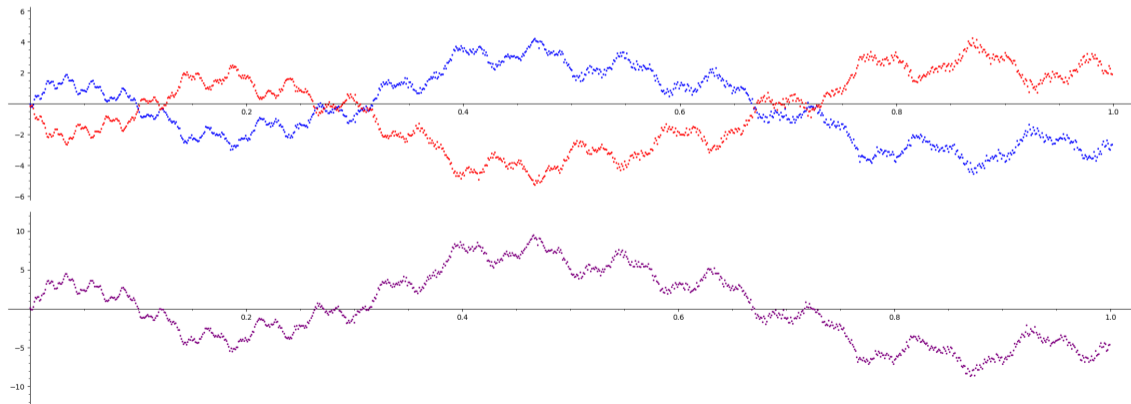
Elliptic curve L -functions of conductor $N \leq M$ for $M = 2^{12}, 2^{13}, \dots, 2^{17}, 2^{18}$. The x -axis range is $[0, 1]$. A blue/red (or purple) dot at $(x, \bar{\alpha}_x)$ shows the average $\bar{\alpha}_x$ of $\alpha_x(E)$ (or $w_p(E)\alpha_x(E)$) over even/odd rank (or all) E/\mathbb{Q} with $N_E \leq M$.



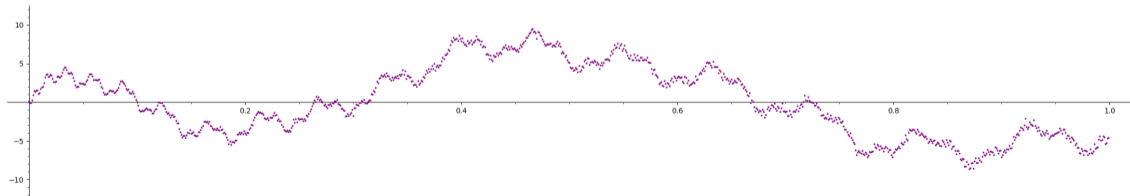
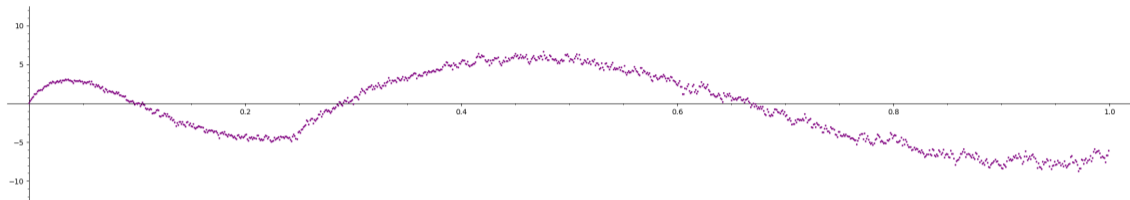
Local averaging: elliptic curves ordered by height

Elliptic curves with $\text{ht}(E) := \max(4|A|^3, 27|B|^2) \leq M$ for $M = 2^{18}, \dots, 2^{27}$.

The x -axis range is $[0, 1]$. A blue/red (or purple) dot at $(x, \bar{\alpha}_x)$ shows the average $\bar{\alpha}_x$ of $\alpha_x(E)$ (or $w_p(E)\alpha_x(E)$) over even/odd rank (or all) E/\mathbb{Q} with $\text{ht}(E) \leq M$.



Local averaging: elliptic curves ordered by conductor vs height

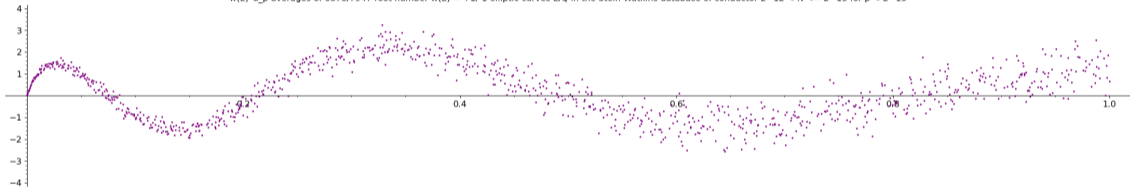


Murmurations scale

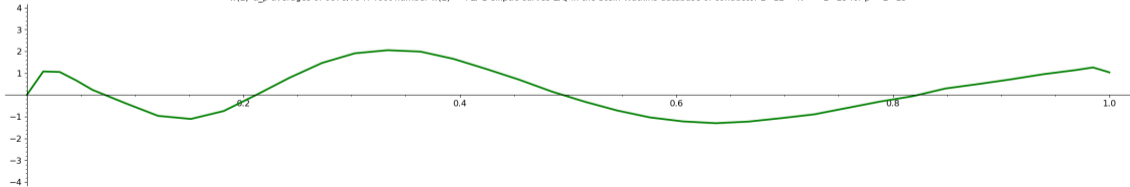
Elliptic curves in the SWDB of conductor $N \in (M, 2M]$ for $M = 2^{12}, \dots, 2^{25}$.

The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(p, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or m_p over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.

$w(E) \cdot a_p$ averages of 6878/7947 root number $w(E) = +1/-1$ elliptic curves E/\mathbb{Q} in the Stein-Watkins database of conductor $2^{12} < N \leq 2^{13}$ for $p < 2^{13}$



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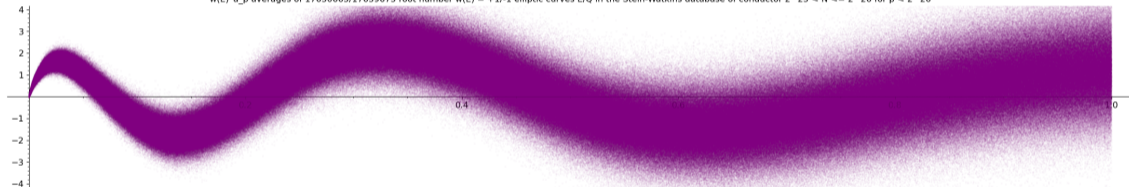


Murmurations scale

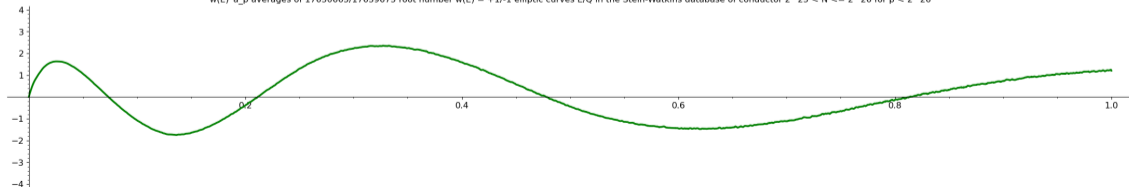
Elliptic curves in the SWDB of conductor $N \in (M, 2M]$ for $M = 2^{12}, \dots, 2^{25}$.

The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(p, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or m_p over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.

$w(E)*a_p$ averages of 17630665/17639675 root number $w(E) = +1/-1$ elliptic curves E/\mathbb{Q} in the Stein-Watkins database of conductor $2^{25} < N \leq 2^{26}$ for $p < 2^{26}$

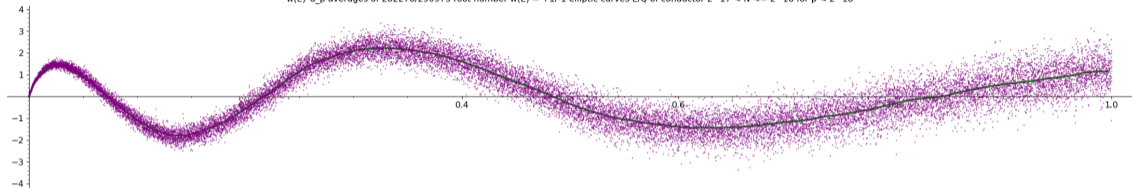


$w(E)*a_p$ averages of 17630665/17639675 root number $w(E) = +1/-1$ elliptic curves E/\mathbb{Q} in the Stein-Watkins database of conductor $2^{25} < N \leq 2^{26}$ for $p < 2^{26}$

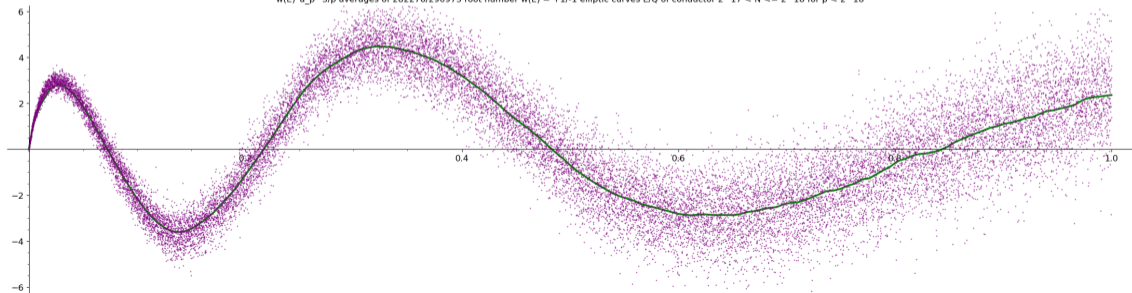


Higher moments ($w_p(E)a_p(E)$ and $w_p(E)a_p(E)^3/p$)

$w(E)a_p$ averages of 282276/290973 root number $w(E) = +1/-1$ elliptic curves E/Q of conductor $2^{17} < N \leq 2^{18}$ for $p < 2^{18}$

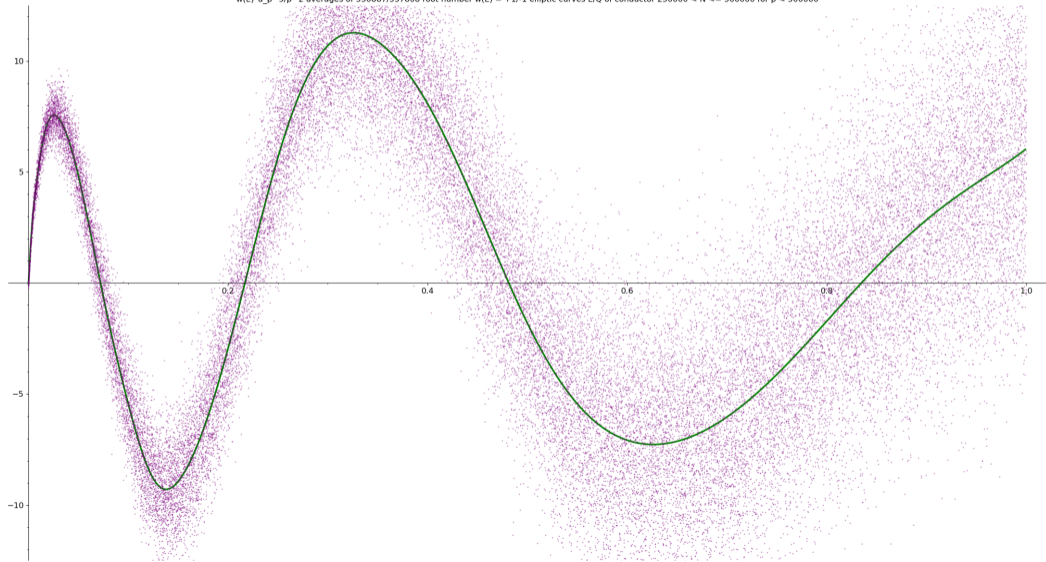


$w(E)a_p^3/p$ averages of 282276/290973 root number $w(E) = +1/-1$ elliptic curves E/Q of conductor $2^{17} < N \leq 2^{18}$ for $p < 2^{18}$



Higher moments $(w_p(E)a_p(E)^5/p^2)$

$w(E) \cdot a_p^5/p^2$ averages of 530887/537808 root number $w(E) = +1/-1$ elliptic curves E/\mathbb{Q} of conductor $250000 < N \leq 500000$ for $p < 500000$



Arithmetic L -functions

We call an L -function is **analytic** if it has the properties every good L -function should: analytic continuation, functional equation, Euler product, temperedness, central character; see [FPRS18](#); it is **analytically normalized** if its central value is at $s = 1/2$.

An analytically normalized L -function $L_{\text{an}}(s) = \sum a_n n^{-s}$ is **arithmetic** if $a_n n^{\omega/2} \in \mathcal{O}_K$ for some number field K and $\omega \in \mathbb{Z}_{\geq 0}$. The least such ω is the **motivic weight**. Its **arithmetic normalization** $L(s) := L_{\text{an}}(s + \omega/2)$ has coefficients in \mathcal{O}_K and satisfies

$$\Lambda(s) = N^{1-s} w \bar{\Lambda}(1 + \omega - s).$$

L -functions of abelian varieties have motivic weight $\omega = 1$.

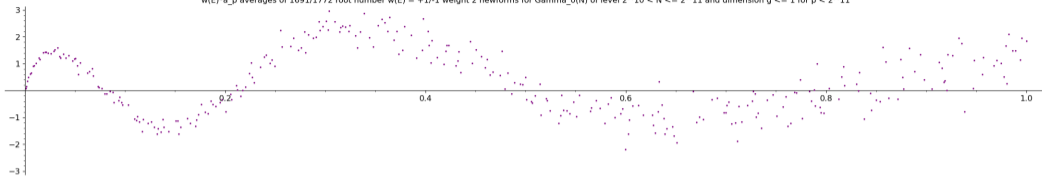
L -functions of weight- k holomorphic cuspforms have motivic weight $\omega = k - 1$.

We consider **Galois-closed** families of **self-dual** arithmetically normalized L -functions. In any such family the values of a_p and m_p are integers and $w = \pm 1$.

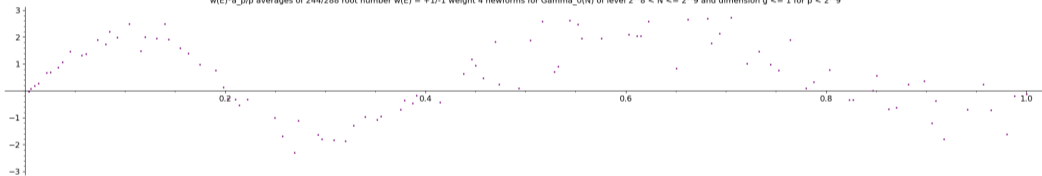
When averaging a_p 's in motivic weight $\omega > 1$ we **normalize** them via $a_p \mapsto a_p / p^{(\omega-1)/2}$. This ensures that we always have $|a_p| = O(\sqrt{p})$, as with elliptic curves.

Newforms for $\Gamma_0(N)$ of weight $k = 2, 4, 6$ with rational coefficients.

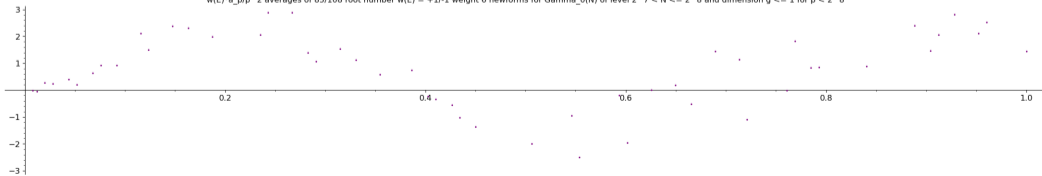
$w(E) \cdot a_p$ averages of 1691/1772 root number $w(E) = +1/-1$ weight 2 newforms for $\Gamma_0(N)$ of level $2^{10} < N \leq 2^{11}$ and dimension $g \leq 1$ for $p < 2^{11}$



$w(E) \cdot a_{p/p}$ averages of 244/288 root number $w(E) = +1/-1$ weight 4 newforms for $\Gamma_0(N)$ of level $2^8 < N \leq 2^9$ and dimension $g \leq 1$ for $p < 2^9$

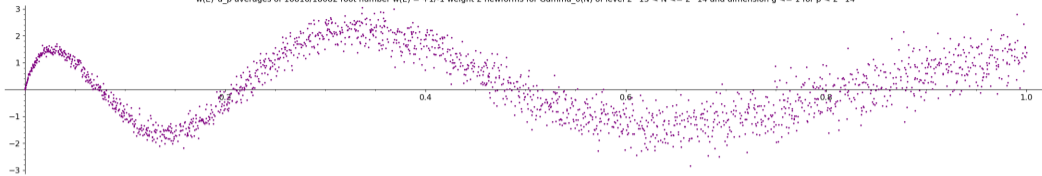


$w(E) \cdot a_{p/p^2}$ averages of 85/108 root number $w(E) = +1/-1$ weight 6 newforms for $\Gamma_0(N)$ of level $2^7 < N \leq 2^8$ and dimension $g \leq 1$ for $p < 2^8$

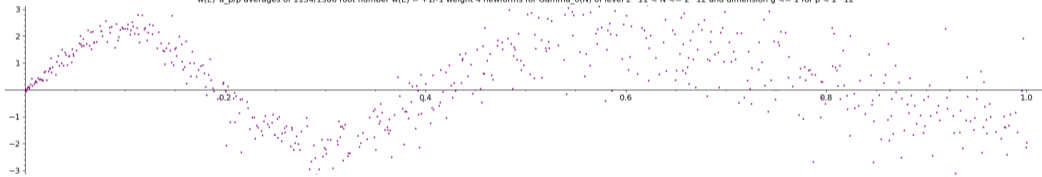


Newforms for $\Gamma_0(N)$ of weight $k = 2, 4, 6$ with rational coefficients.

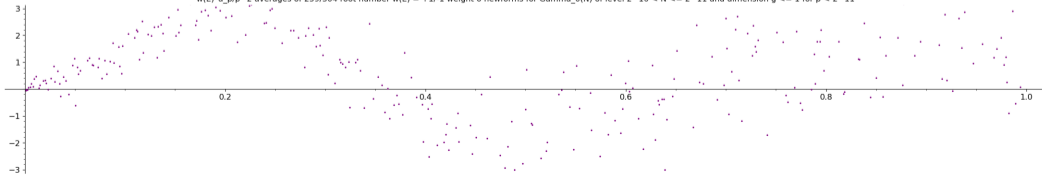
$w(E)^*a_p$ averages of 16816/18082 root number $w(E) = +1/-1$ weight 2 newforms for $\Gamma_0(N)$ of level $2^{13} < N \leq 2^{14}$ and dimension $g \leq 1$ for $p < 2^{14}$



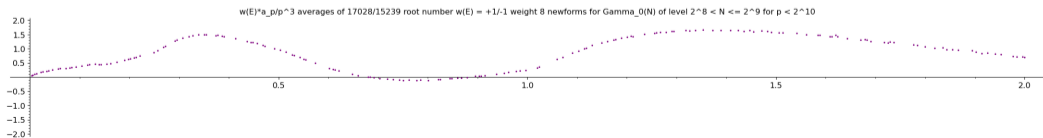
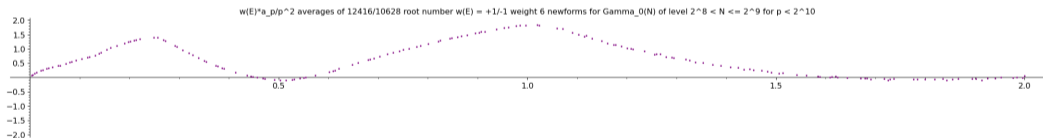
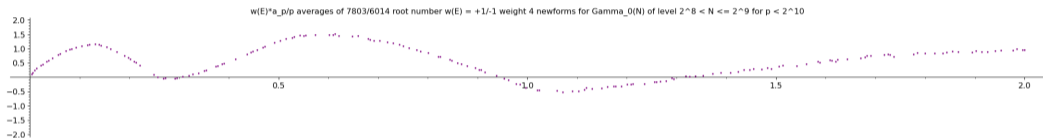
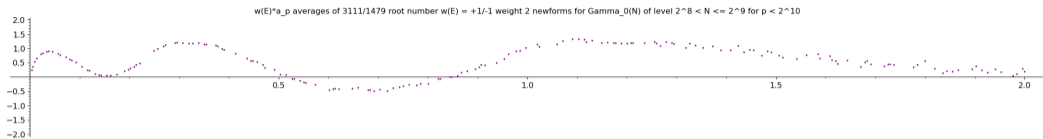
$w(E)^*a_p$ averages of 1154/1386 root number $w(E) = +1/-1$ weight 4 newforms for $\Gamma_0(N)$ of level $2^{11} < N \leq 2^{12}$ and dimension $g \leq 1$ for $p < 2^{12}$



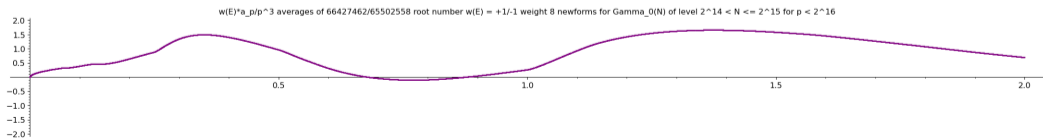
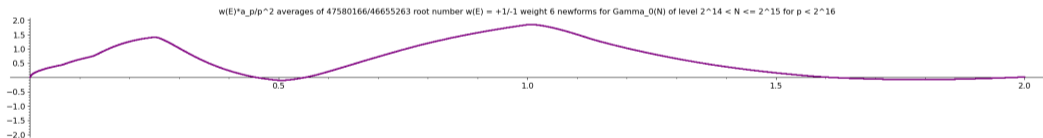
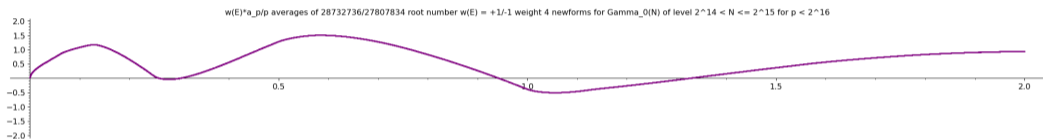
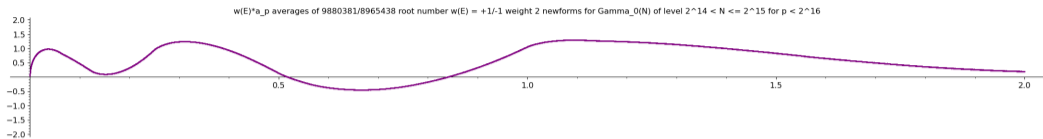
$w(E)^*a_p$ averages of 259/304 root number $w(E) = +1/-1$ weight 6 newforms for $\Gamma_0(N)$ of level $2^{10} < N \leq 2^{11}$ and dimension $g \leq 1$ for $p < 2^{11}$



Newforms for $\Gamma_0(N)$ of weight $k = 2, 4, 6, 8$.



Newforms for $\Gamma_0(N)$ of weight $k = 2, 4, 6, 8$.



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

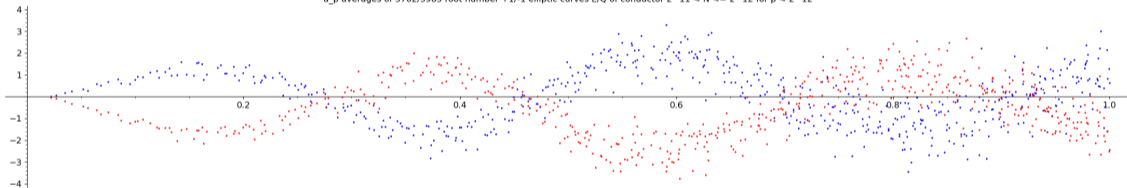
$$\frac{\sum_{N \in [X, X+Y]}^{\square\text{-free}} \sum_f w(f) a_P(f) P^{(1-k/2)}}{\sum_{N \in [X, X+Y]}^{\square\text{-free}} \sum_f 1} = M_k(y) + O_\varepsilon(X^{-\delta'+\varepsilon} + P^{-1})$$

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

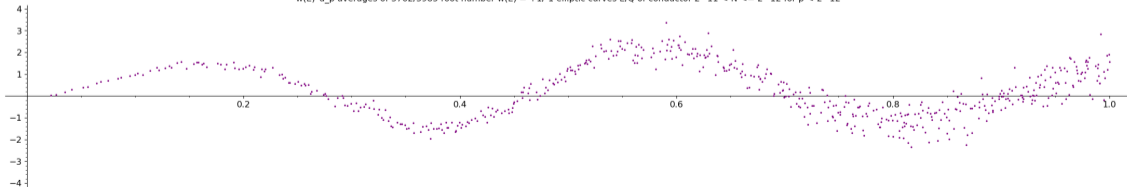
Murmurations of elliptic curves with squareroot normalization

Elliptic curve L -functions of conductor $N \in (M, 2M]$ for $M = 2^{11}, 2^{12}, \dots, 2^{17}, 250000$. The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(\sqrt{p}, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or $m_p := w(E)a_p(E)$ over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.

a_p averages of 3762/3985 root number +1/-1 elliptic curves E/\mathbb{Q} of conductor $2^{11} < N \leq 2^{12}$ for $p < 2^{12}$



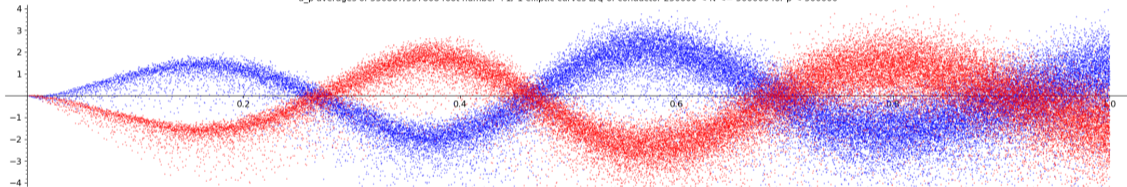
$w(E)a_p$ averages of 3762/3985 root number $w(E) = +1/-1$ elliptic curves E/\mathbb{Q} of conductor $2^{11} < N \leq 2^{12}$ for $p < 2^{12}$



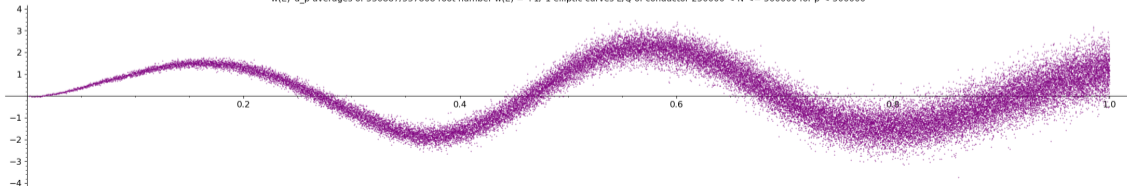
Murmurations of elliptic curves with squareroot normalization

Elliptic curve L -functions of conductor $N \in (M, 2M]$ for $M = 2^{11}, 2^{12}, \dots, 2^{17}, 250000$. The x -axis range is $[0, 2M]$. A blue/red or purple dot at $(\sqrt{p}, \bar{a}_p$ or $\bar{m}_p)$ shows the average of a_p or $m_p := w(E)a_p(E)$ over even/odd or all E/\mathbb{Q} with $N_E \in (M, 2M]$.

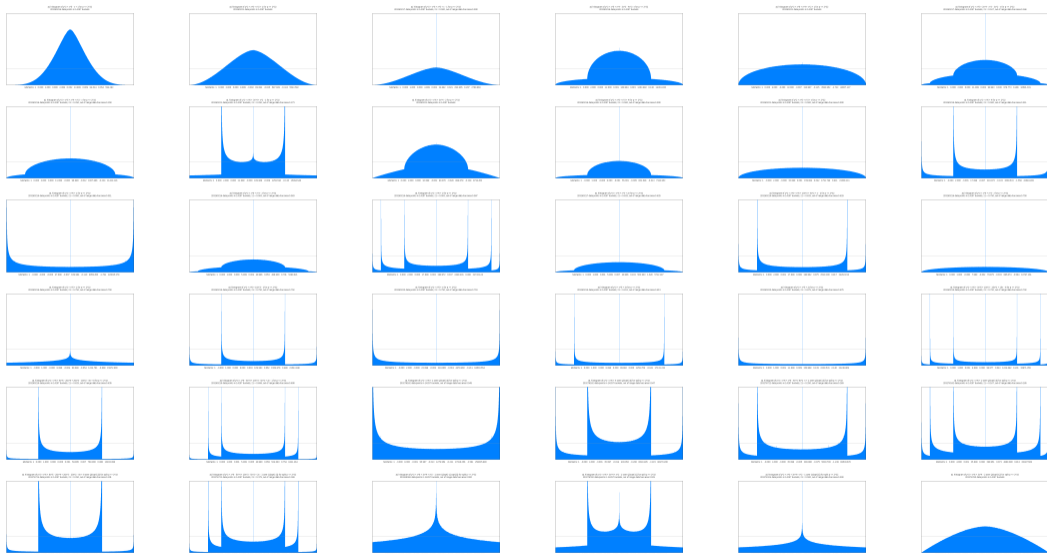
a_p averages of 530887/537808 root number +1/-1 elliptic curves E/Q of conductor 250000 < N <= 500000 for p < 500000



w(E)*a_p averages of 530887/537808 root number w(E) = +1/-1 elliptic curves E/Q of conductor 250000 < N <= 500000 for p < 500000



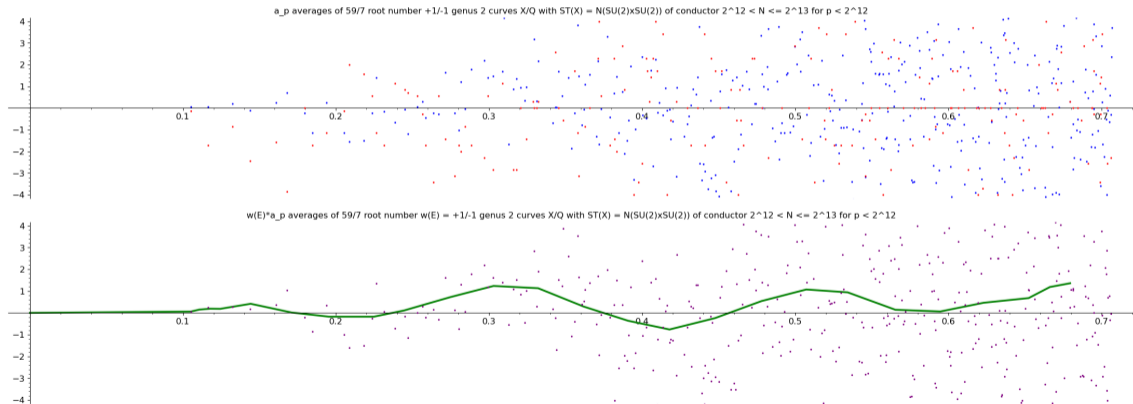
Trace distributions of genus 2 curves



L -functions of genus 2 curves over \mathbb{Q} , Sato-Tate group $N(\mathrm{SU}(2) \times \mathrm{SU}(2))$.

These are primitive L -functions arising from Hilbert or Bianchi modular forms.

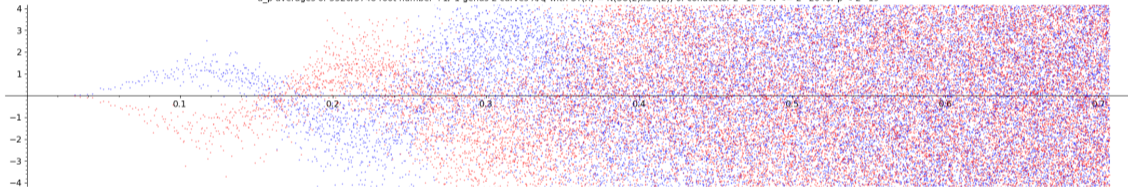
Conductor of $L(X, s)$ in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{19}$ with x -axis range $[0, M/2]$.



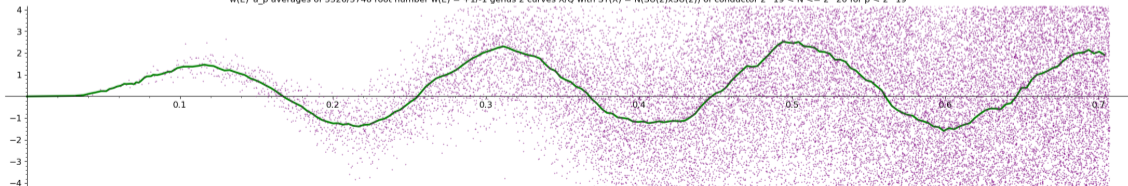
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Conductor of $L(X, s)$ in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{19}$ with x -axis range $[0, M/2]$.

a_p averages of 3326/3748 root number $+1/-1$ genus 2 curves X/\mathbb{Q} with $\mathrm{ST}(X) = N(\mathrm{SU}(2) \times \mathrm{SU}(2))$ of conductor $2^{19} < N \leq 2^{20}$ for $p < 2^{19}$



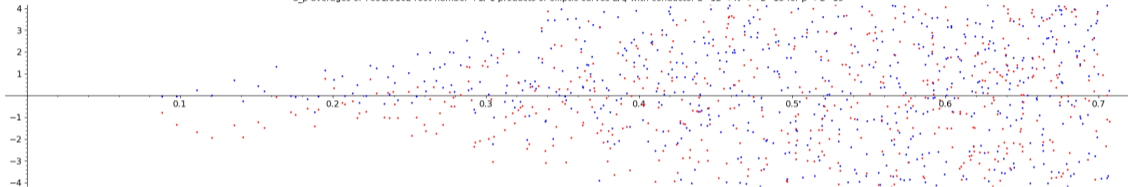
$w(E) \cdot a_p$ averages of 3326/3748 root number $w(E) = +1/-1$ genus 2 curves X/\mathbb{Q} with $\mathrm{ST}(X) = N(\mathrm{SU}(2) \times \mathrm{SU}(2))$ of conductor $2^{19} < N \leq 2^{20}$ for $p < 2^{19}$



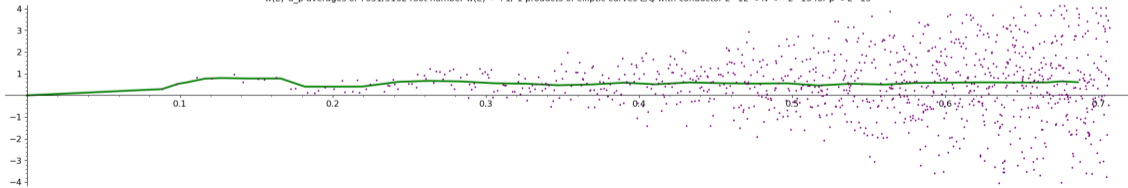
L-functions of products of E/\mathbb{Q} , Sato-Tate group $SU(2) \times SU(2)$.

Conductor of $L(X, s)$ in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{17}$ with x-axis range $[0, M/2]$.

a_p averages of 7651/5162 root number +1/-1 products of elliptic curves E/\mathbb{Q} with conductor $2^{12} < N \leq 2^{13}$ for $p < 2^{13}$



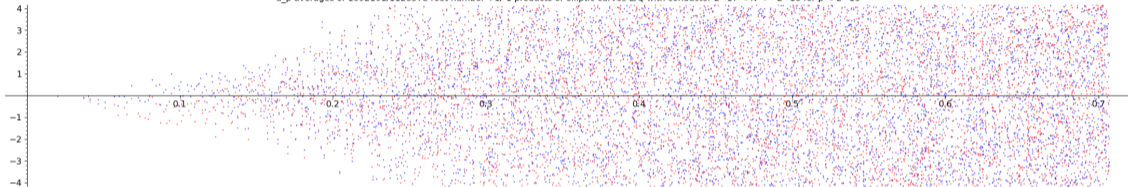
$w(E) \cdot a_p$ averages of 7651/5162 root number $w(E) = +1/-1$ products of elliptic curves E/\mathbb{Q} with conductor $2^{12} < N \leq 2^{13}$ for $p < 2^{13}$



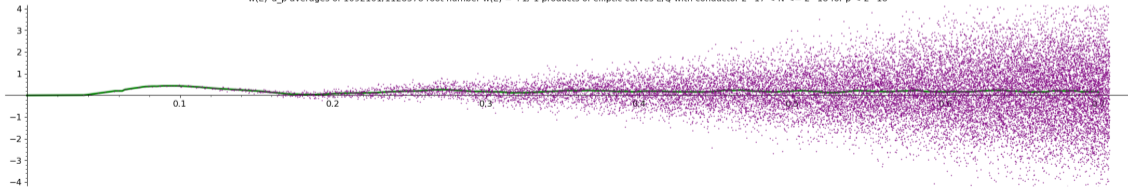
L -functions of products of E/\mathbb{Q} , Sato-Tate group $SU(2) \times SU(2)$.

Conductor of $L(X, s)$ in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{17}$ with x -axis range $[0, M/2]$.

a_p averages of 1092101/1128578 root number $+1/-1$ products of elliptic curves E/\mathbb{Q} with conductor $2^{17} < N \leq 2^{18}$ for $p < 2^{18}$

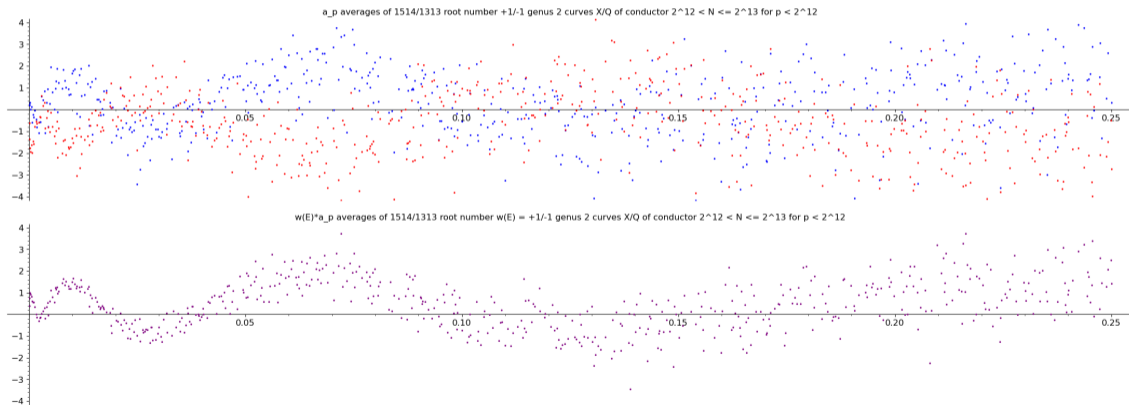


$w(E) \cdot a_p$ averages of 1092101/1128578 root number $w(E) = +1/-1$ products of elliptic curves E/\mathbb{Q} with conductor $2^{17} < N \leq 2^{18}$ for $p < 2^{18}$



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

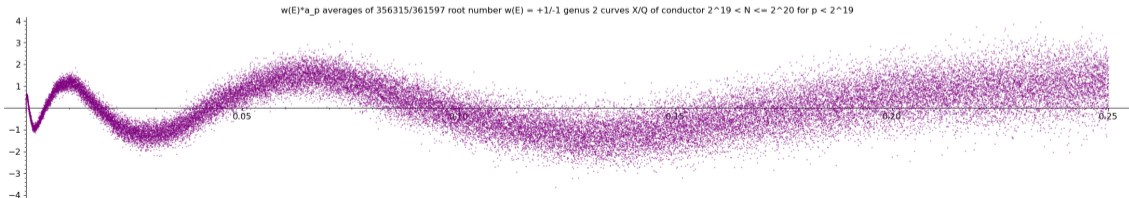
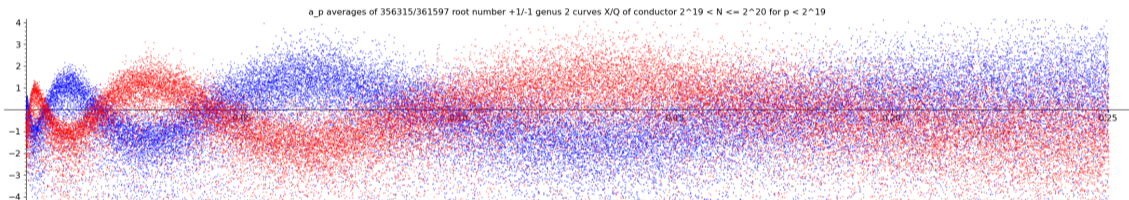
Recently constructed database of more than 6 million genus 2 curves X/\mathbb{Q} of conductor at most 2^{20} includes about 1.7 million isogeny classes with Sato-Tate group $\mathrm{USp}(4)$. Conductor of $L(X, s)$ in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{19}$ with x -axis range $[0, M/2]$.



Coming soon to the [LMFDB](#).

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

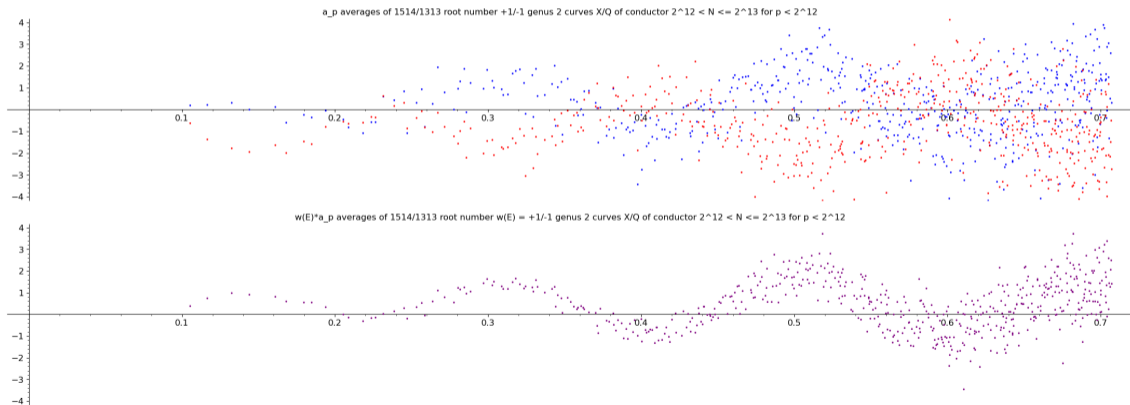
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Coming soon to the [LMFDB](#).

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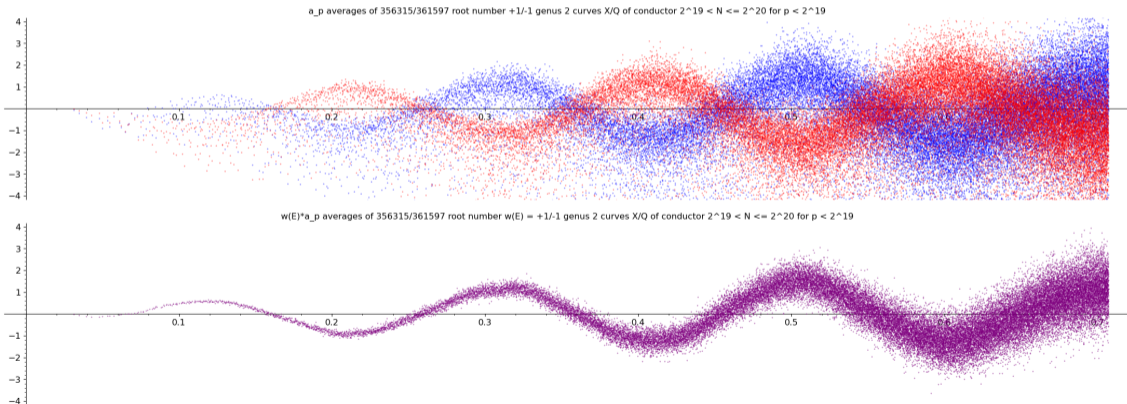
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Coming soon to the [LMFDB](#).

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

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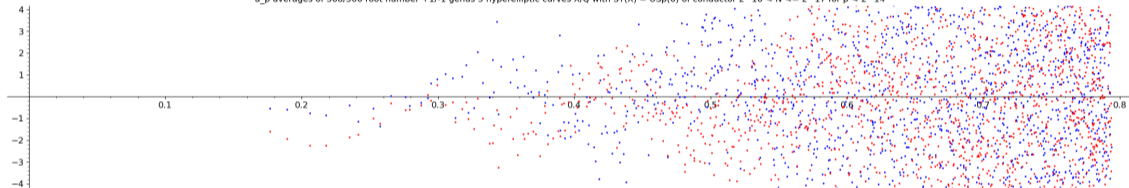
Coming soon to the [LMFDB](#).

L -functions of genus 3 curves over \mathbb{Q} with Sato-Tate group $\mathrm{USp}(6)$.

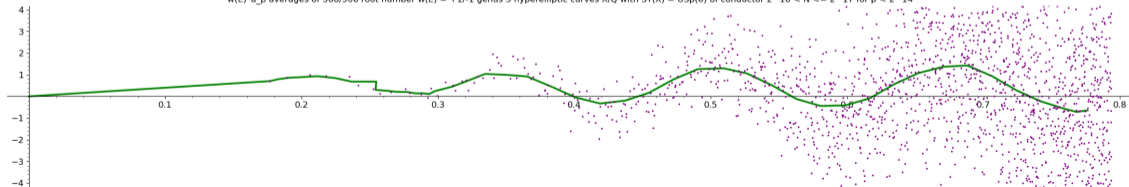
Recently constructed database of genus 3 curves X/\mathbb{Q} of conductor at most 10^7 includes 59,214 isogeny classes of hyperelliptic curves with ST group $\mathrm{USp}(6)$.

Conductor of $L(X, s)$ in $(M, 2M]$ for $M = 2^{16}, \dots, 2^{22}$ with x -axis range $[0, M/2]$.

a_p averages of 368/506 root number $+1/-1$ genus 3 hyperelliptic curves X/\mathbb{Q} with $\mathrm{ST}(X) = \mathrm{USp}(6)$ of conductor $2^{16} < N \leq 2^{17}$ for $p < 2^{14}$



$w(E)a_p$ averages of 368/506 root number $w(E) = +1/-1$ genus 3 hyperelliptic curves X/\mathbb{Q} with $\mathrm{ST}(X) = \mathrm{USp}(6)$ of conductor $2^{16} < N \leq 2^{17}$ for $p < 2^{14}$



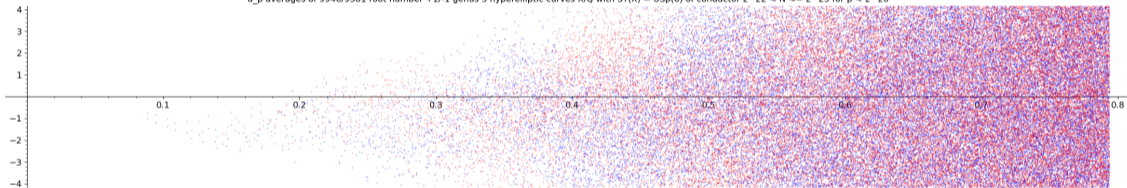
Coming soon to the [LMFDB](#).

L-functions of genus 3 curves over \mathbb{Q} with Sato-Tate group $\mathrm{USp}(6)$.

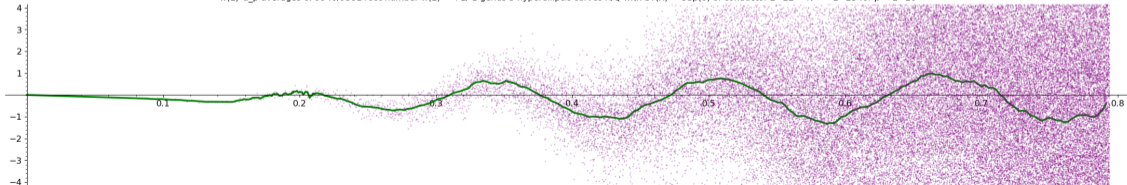
Recently constructed database of genus 3 curves X/\mathbb{Q} of conductor at most 10^7 includes 59,214 isogeny classes of hyperelliptic curves with ST group $\mathrm{USp}(6)$.

Conductor of $L(X, s)$ in $(M, 2M]$ for $M = 2^{16}, \dots, 2^{22}$ with x-axis range $[0, M/2]$.

a_p averages of 9946/9381 root number +1/-1 genus 3 hyperelliptic curves X/Q with ST(X) = USp(6) of conductor $2^{22} < N \leq 2^{23}$ for $p < 2^{20}$



w(E)*a_p averages of 9946/9381 root number w(E) = +1/-1 genus 3 hyperelliptic curves X/Q with ST(X) = USp(6) of conductor $2^{22} < N \leq 2^{23}$ for $p < 2^{20}$



Coming soon to the [LMFDB](#).

Computing murmurations of elliptic curves

When computing $a_p(E)$ for many E/\mathbb{Q} we construct a lookup table $T[j] = a_p(E)$ for $E: y^2 = x^3 + Ax + B$ with $j(E) = j \neq 0, 1728$ and $B = \square$.

Average costs per curve, ignoring $O(\log \log p)$ factors:

- Naive: $O(p)$
- Mestre BSGS: $O(p^{1/4} \log p)$
- Schoof: $O(\log^5 p)$, Schoof–Elkies–Atkin: $O(\log^4 p)$
- CM torsor (isogenies): $O(\log^3 p)$ (GRH), $O(\log^2 p)$ (heuristic).
- CM torsor (GCDs): $O(\log p)$ per curve (heuristic).

We are extending the Stein–Watkins database using Elkies' lattice reduction method to include (conjecturally) all E/\mathbb{Q} with $|\Delta(E)| \leq 10^{17}$ and $|N(E)| \leq 10^9$ (versus 10^{12} and 10^8 with no claim of completeness).

Computing murmurations of modular forms

The sum of $w(f)a_p(f)$ over $f \in S_k^{\text{new}}(N)$ is equal to the trace of $T_n \circ W$ acting on $S_k^{\text{new}}(N)$, where the [Fricke involution](#) W is defined by $W(f) := f \mid \begin{pmatrix} 0 & -1 \\ N & 0 \end{pmatrix}$.

By massaging a [theorem of Popa](#), one obtains

$$\text{tr}(T_n \circ W, S_k(N)) = -\frac{1}{2} \sum_{\substack{t^2 N < 4n \\ D := t^2 N^2 - 4nN}} g_k(t^2 N, n) h^*(D, N) - \frac{1}{2} s_k(N, n) + \sum_{k=2} \delta \sigma_N(n) - \sum_{\substack{N=1 \\ n=\square}} \delta \frac{k-1}{12} n^{k/2-1}.$$

We compute $h^*(D, N)$ as the product of a multiplicative function and a class number

The class numbers for $|D| \leq 2^{40}$ have been [computed by Jacobson and Mosunov](#) and can be [downloaded](#) from the LMFDB, and can be crammed into a 1.125TB lookup table. Using a memory mapped file on fast SSD it takes 40s to load.

It then takes less than a minute to compute $\text{tr}(T_p \circ W, S_k^{\text{new}}(N))$ for $2^{18} \leq N < 2^{19}$ and $p \leq 2^{19}$ for any reasonably small k (on 256 cores).

Computing murmurations of genus 2 and genus 3 curves

The average polynomial time algorithms described in [Harvey-S 2016] and [Costa-Harvey-S 2022] can readily compute the desired trace sums.

The main challenge is finding curves (and abelian varieties) of small conductor.

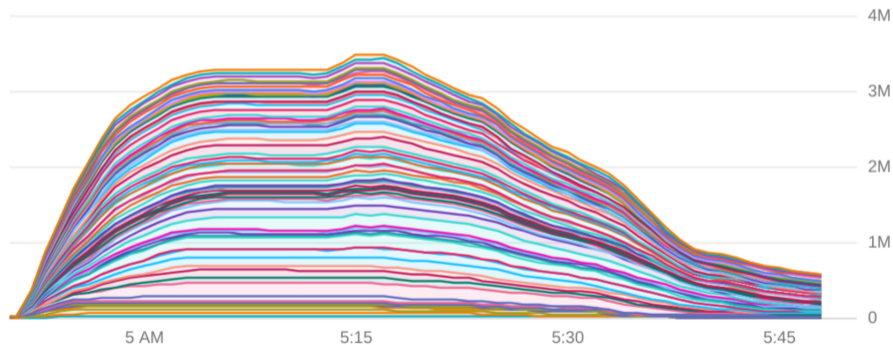
The algorithms described in [BSSVY 2016] and [S 2018] enumerate curves by discriminant, but curves with very large discriminants can have very small conductors.

This is already an issue in genus 1 with the Stein-Watkins database: it misses about 1/4 of the isogeny classes of conductor up to $5 \cdot 10^5$, despite ranging up to 10^8 , but the situation is much worse in higher genus.

Curves may have bad reduction at primes of good reduction for the Jacobian (this happens a lot!). The genus 2 murmurations here use a new dataset of more than six million curves with conductor below 10^6 (99% of these are not in the LMFDB yet!).

Searching for genus 2 curves

Over the past several years we have conducted several searches for genus 2 curves of small conductor. Below is CPU histogram from a computation from the largest of these computations, run on Google's Cloud Platform.



We used a total of 4,034,560 Intel/AMD vCPUs in 73 data centers across the globe.

Expanding the LMFDB

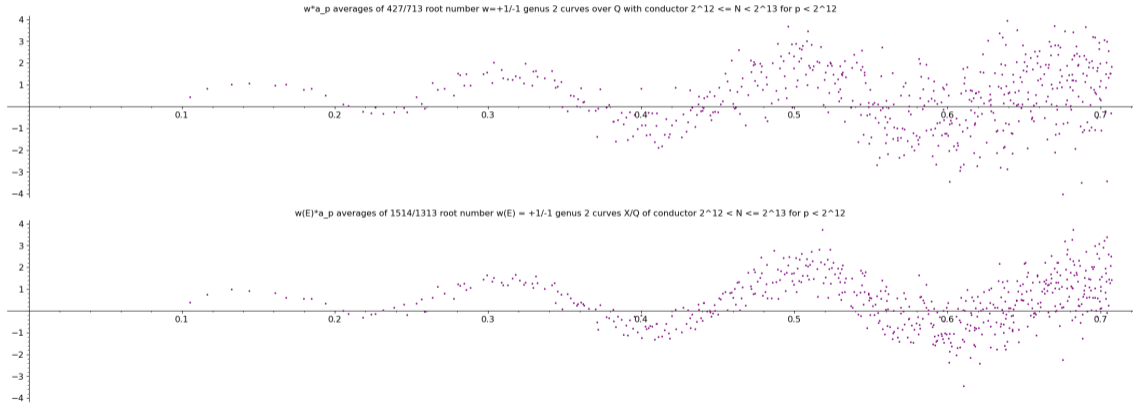
We found curves of conductor 657, 760, 775, 903, and 924 not previously known to occur, and many new genus-2 L -functions of small conductor:

conductor bound	1000	10000	100000	1000000
curves in LMFDB	159	3069	20265	66158
curves found	942	29514	493899	6075571
L-functions in LMFDB	109	2807	19775	65534
L-functions found	201	9534	194612	2559187

Standard divisibility test for $p < 2^{10}$	≈ 2700 clock cycles
Montgomery divisibility test for $p < 2^{10}$	≈ 960 clock cycles
AVX-512FMA divisibility test for $p < 2^{10}$	≈ 120 clock cycles
AVX-512FMA prime power testing (using mod- p tests)	≈ 20 clock cycles

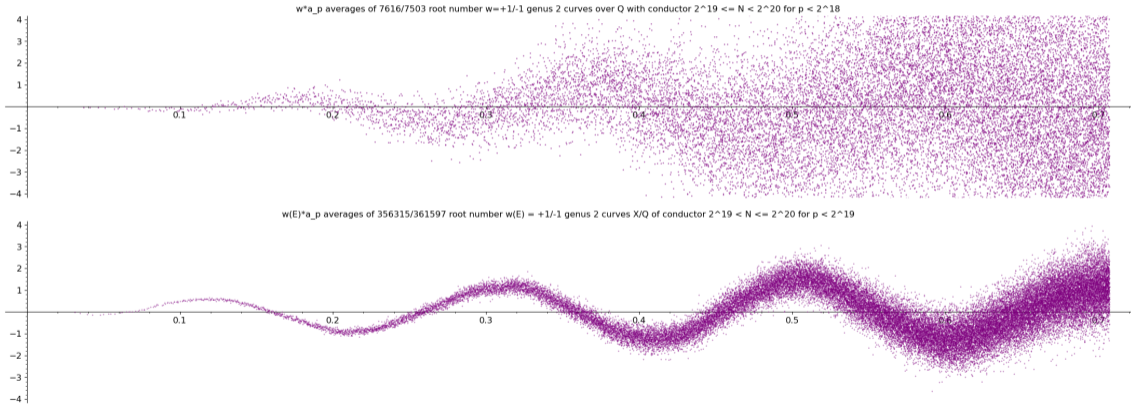
L-functions of genus 2 curves over \mathbb{Q} with Sato-Tate group $USp(4)$.

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

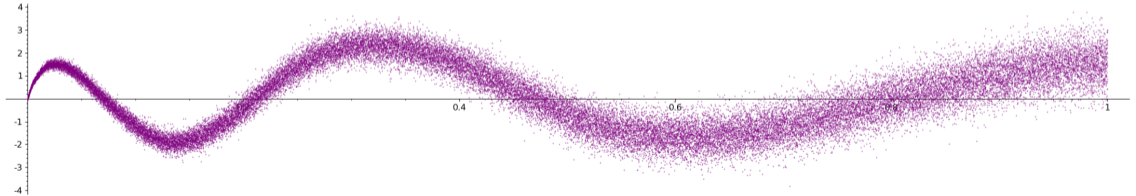


L -functions of genus 2 curves over \mathbb{Q} with Sato-Tate group $USp(4)$.

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



Thank you!



Animations available at <https://math.mit.edu/~drew/murmurations.html>.