

Murmurations of Arithmetic L -functions

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Simons Collaboration in Arithmetic Geometry, Number Theory, and Computation

Arithmetic statistics of Frobenius traces of elliptic curves over \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 the Sato-Tate group of E (typically $SU(2)$).
2. **Birch and Swinnerton-Dyer:**

$$\lim_{x \rightarrow \infty} \frac{\log x}{2\sqrt{x}} \sum_{p \leq x} \frac{a_p(E)}{\sqrt{p}} = \frac{1}{2} - r_{\text{an}}(E).$$

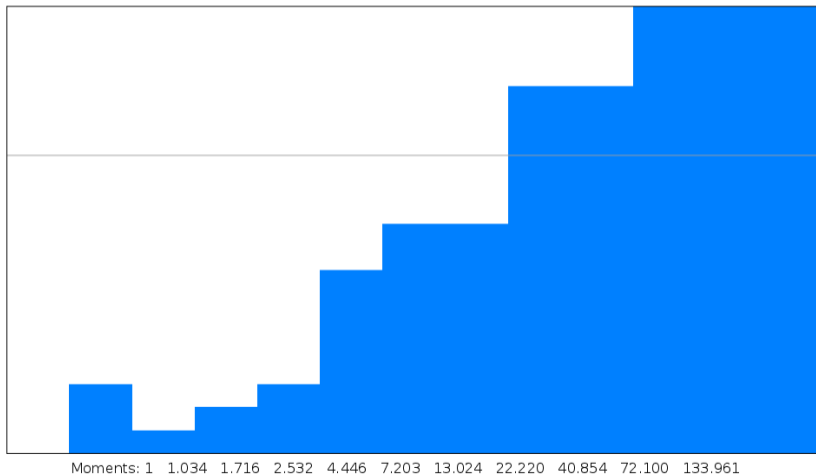
3. **Lang–Trotter:** For every nonzero $t \in \mathbb{Z}$ there is a real number $C_{E,t}$ for which

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

These depend only on $L_E(s) = \sum a_n n^{-s}$ and generalize to other L -functions.

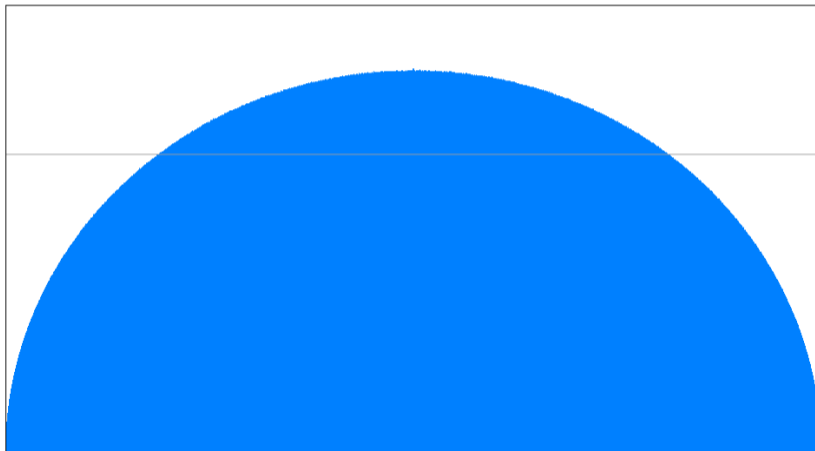
Example: Elkies' curve of rank ≥ 28 ($= 28$ under GRH).

a1 histogram of $y^2 + xy + y = x^3 - x^2 - 20067762415575526585033208209338542750930230312178956502x + 34481611795030556467032985690390720374855944359319180361266008296291939448732243429$ for $p \leq 2^{10}$
172 data points in 13 buckets, $z_1 = 0.023$, out of range data has area 0.250



Example: Elkies' curve of rank ≥ 28 ($= 28$ under GRH).

a1 histogram of $y^2 + xy + y = x^3 - x^2 - 20067762415575526585033208209338542750930230312178956502x + 34481611795030556467032985690390720374855944359319180361266008296291939448732243429$ for $p \leq 2^{40}$
41203088796 data points in 202985 buckets



Moments: 1 0.000 1.000 0.000 2.000 0.000 5.000 0.001 14.000 0.003 42.000

How rank effects trace distributions

One formulation of the BSD conjecture implies that

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

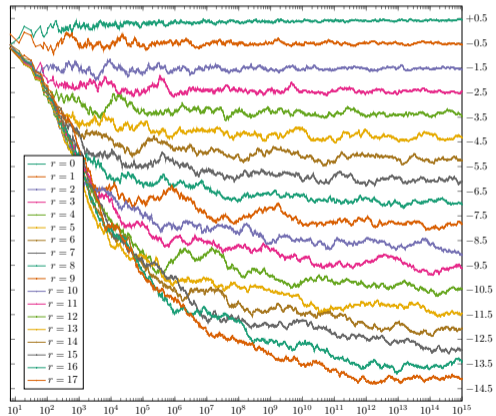
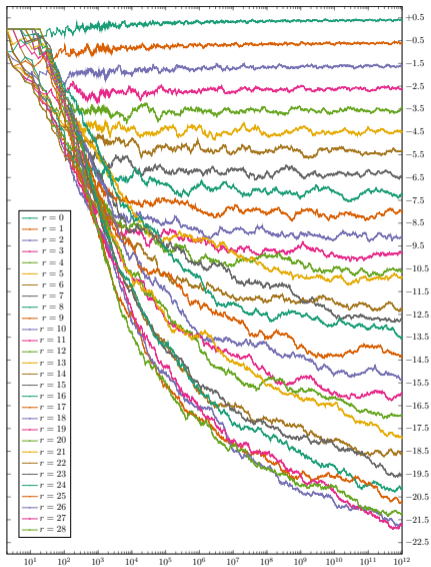
and sums of this form (Mestre-Nagao sums) are often used as a tool when searching for elliptic curves of large rank (which necessarily have large conductor N).^{1 2}

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.

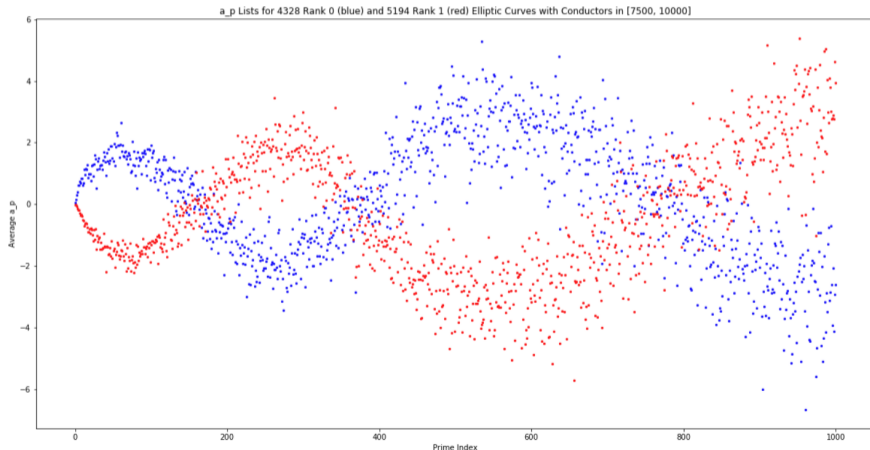
¹See [Sarnak's 2007 letter to Mazur](#).

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



Murmurations of elliptic curves

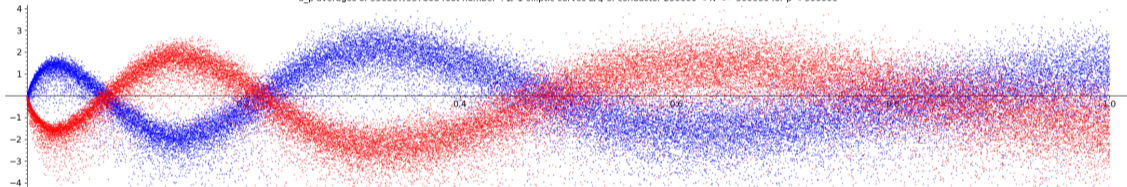
In their 2022 preprint *Murmurations of elliptic curves*, Yang-Hui He, Kyu-Hwan Lee, Thomas Oliver, and Alexey Pozdnyakov observed a curious fluctuation in average Frobenius traces of elliptic curves in a given conductor interval depending on the rank.



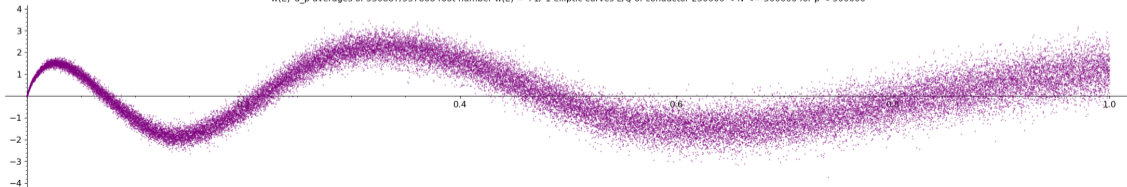
Murmurations of elliptic curves

Elliptic curve L -functions of conductor $N \in (M, 2M]$ for $M = 2^{12}, 2^{13}, \dots, 2^{17}, 250000$. The x -axis range is $[0, 2M]$. A blue/red (or purple) dot at (p, \bar{a}_p) shows the average \bar{a}_p of $a_p(E)$ (or $w_p(E)a_p(E)$) over even/odd rank (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

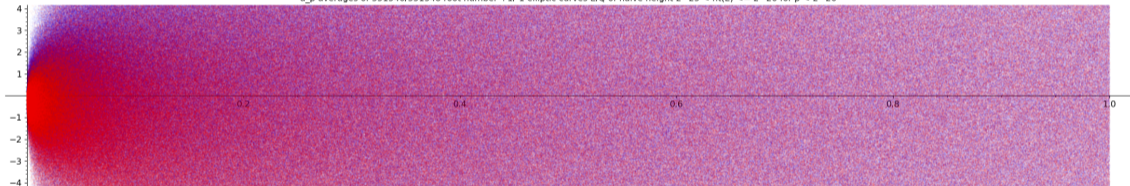


Ordering by naive height

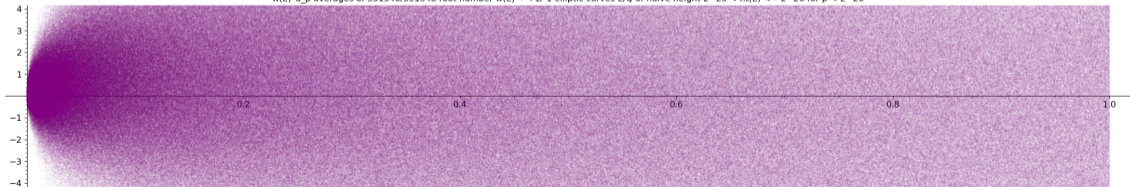
Elliptic curves with $\text{ht}(E) := \max(4|A|^3, 27|B|^2)$ in $(M, 2M]$ for $M = 2^{16}, \dots, 2^{25}$.

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

a_p averages of 351546/351348 root number +1/-1 elliptic curves E/\mathbb{Q} of naive height $2^{25} < \text{ht}(E) \leq 2^{26}$ for $p < 2^{26}$



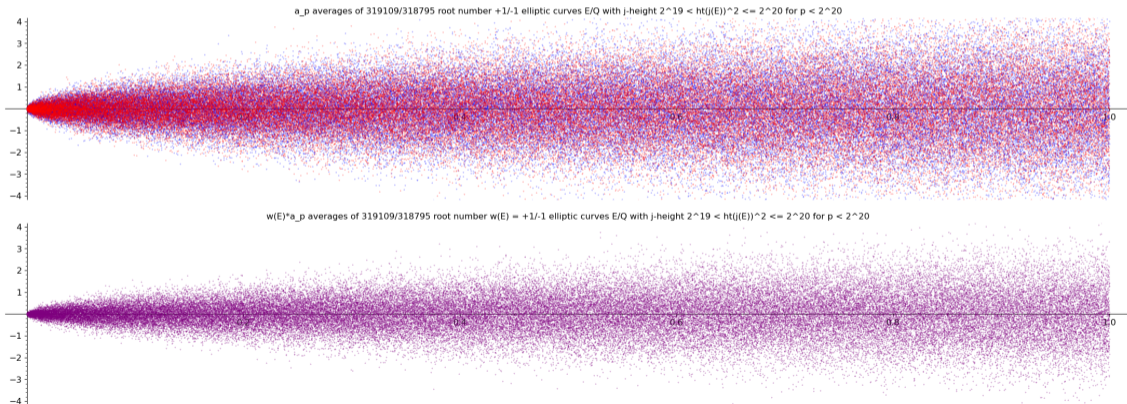
$w(E)a_p$ averages of 351546/351348 root number $w(E) = +1/-1$ elliptic curves E/\mathbb{Q} of naive height $2^{25} < \text{ht}(E) \leq 2^{26}$ for $p < 2^{26}$



Ordering by j -invariant

Elliptic curves with $\text{ht}(j(E))^2$ in $(M, 2M]$ for $M = 2^{10}, \dots, 2^{19}$.

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

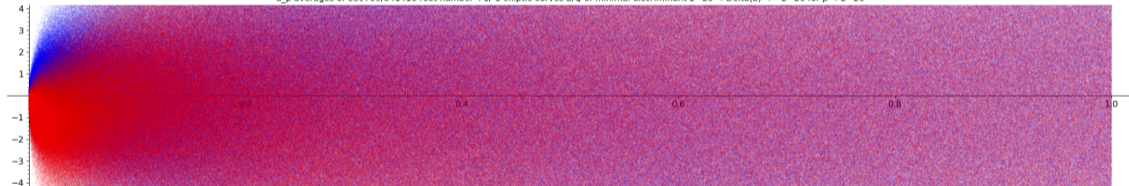


Ordering by minimal discriminant

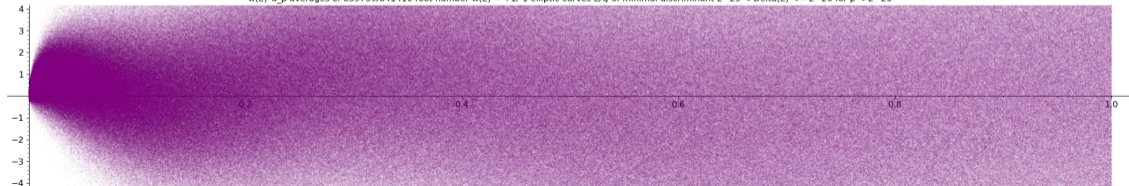
Elliptic curves with minimal discriminant $\Delta(E)$ in $(M, 2M]$ for $M = 2^{16}, \dots, 2^{25}$.

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

a_p averages of 839739/841410 root number +1/-1 elliptic curves E/Q of minimal discriminant $2^{25} < \Delta(E) \leq 2^{26}$ for $p < 2^{26}$



w(E)*a_p averages of 839739/841410 root number w(E) = +1/-1 elliptic curves E/Q of minimal discriminant $2^{25} < \Delta(E) \leq 2^{26}$ for $p < 2^{26}$

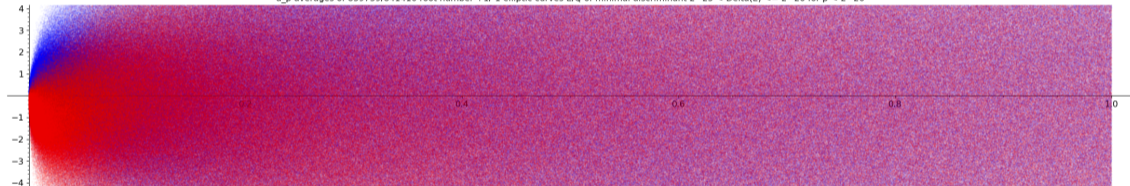


Ordering by minimal discriminant

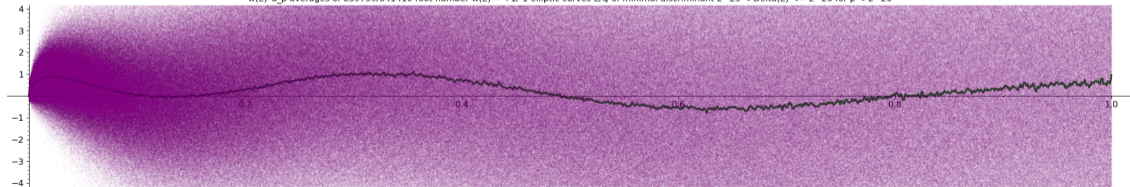
Elliptic curves with minimal discriminant $\Delta(E)$ in $(M, 2M]$ for $M = 2^{16}, \dots, 2^{25}$.

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a_p averages of 839739/841410 root number +1/-1 elliptic curves E/Q of minimal discriminant $2^{25} < \Delta(E) \leq 2^{26}$ for $p < 2^{26}$



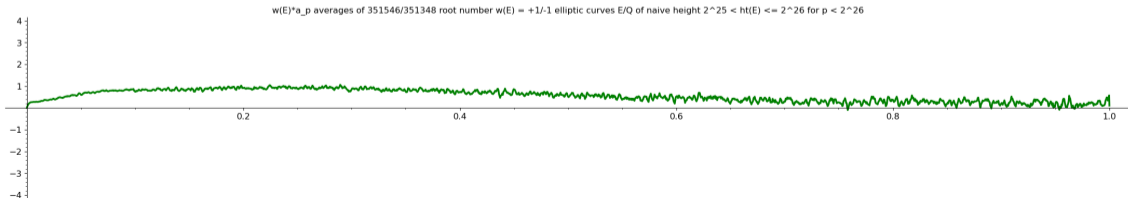
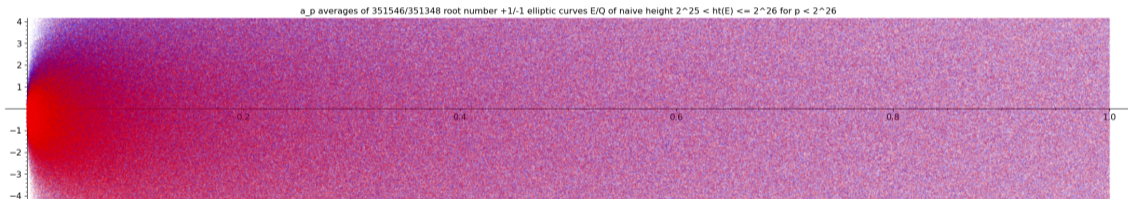
w(E)*a_p averages of 839739/841410 root number w(E) = +1/-1 elliptic curves E/Q of minimal discriminant $2^{25} < \Delta(E) \leq 2^{26}$ for $p < 2^{26}$



Ordering by naive height (redux)

Elliptic curves with $\text{ht}(E) := \max(4|A|^3, 27|B|^2)$ 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) shows the average \bar{a}_p of $a_p(E)$ (or $w_p(E)a_p(E)$) over even/odd rank (or all) E/\mathbb{Q} with $\text{ht}(E) \in (M, 2M]$.

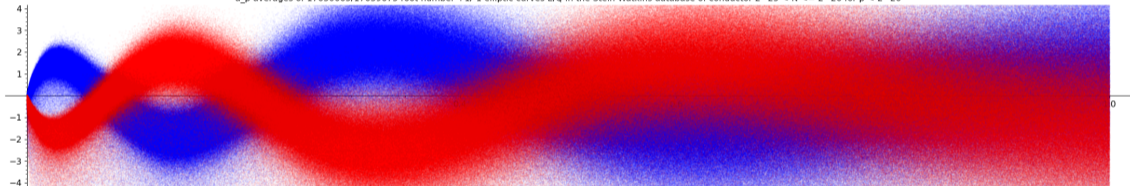


Ordering by conductor in the Stein-Watkins database (SWDB)

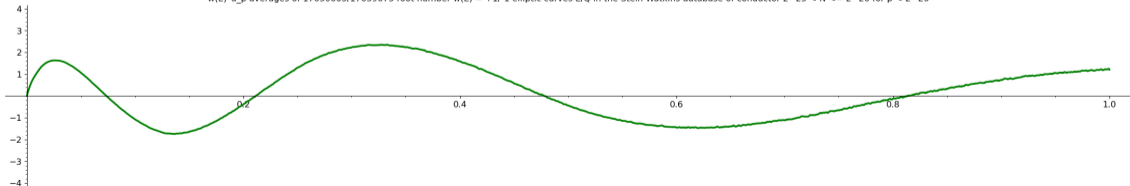
Elliptic curves in the SWDB of conductor $N \in (M, 2M]$ for $M = 2^{12}, \dots, 2^{25}$.

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

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



Arithmetic L -functions

An L -function is said to be **analytic** if it satisfies the properties that every good L -function should (analytic continuation, functional equation, Euler product, temperedness, central character); see [Farmer–Pitale–Ryan–Schmidt 2018](#) for details.

We say that an analytic L -function $L(s) = \sum a_n n^{-s}$ is **arithmetic** if there is an integer w for which $a_n n^{w/2} \in \mathcal{O}_K$ for some number field K . The least such w is the **motivic weight**.

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

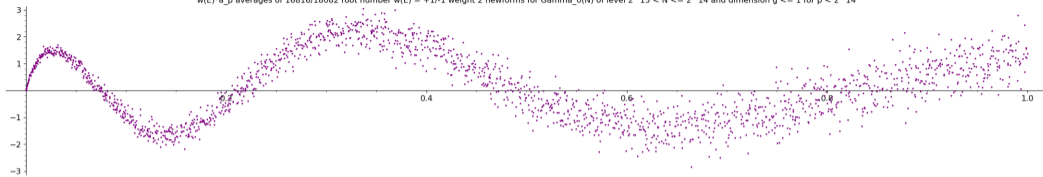
L -functions of weight- k modular forms have motivic weight $w = k - 1$.

In what follows we consider families of arithmetic L -functions that are Galois closed, meaning that if we average Dirichlet coefficients a_p over L -functions of a given conductor we get integers. We also assume that analytic rank is Galois-invariant.

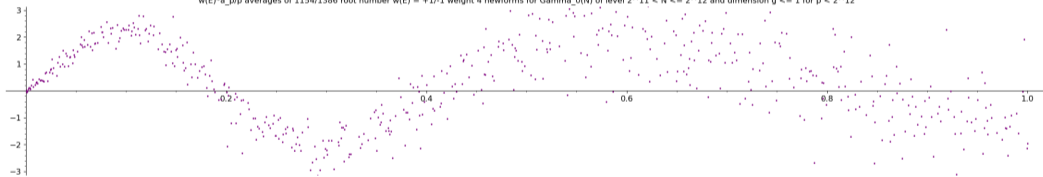
When averaging a_p 's in motivic weight $w > 1$ we normalize via: $a_p \mapsto a_p/p^{(w-1)/2}$.

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

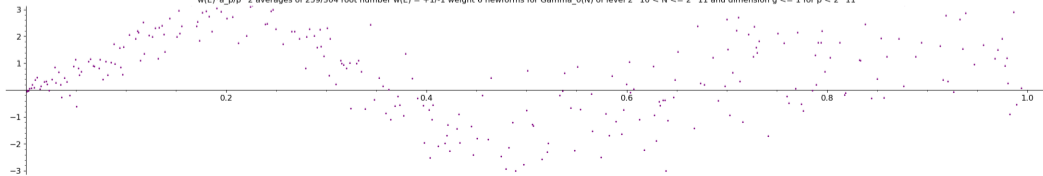
$w(E)^*a_p$ averages of 16816/18082 root number $w(E) = +1/-1$ weight 2 newforms for $\Gamma_0(N)$ of level $2^{13} < N \leq 2^{14}$ and dimension $g \leq 1$ for $p < 2^{14}$



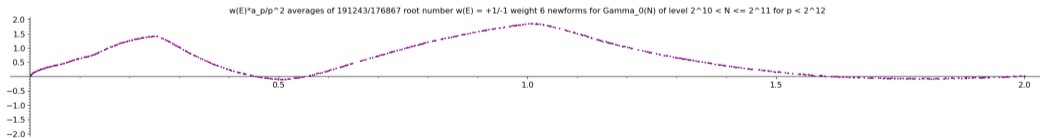
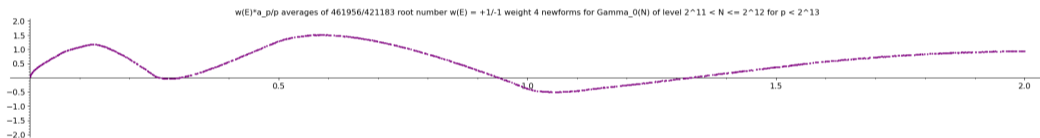
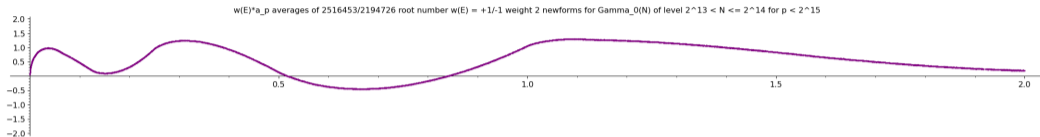
$w(E)^*a_p$ averages of 1154/1386 root number $w(E) = +1/-1$ weight 4 newforms for $\Gamma_0(N)$ of level $2^{11} < N \leq 2^{12}$ and dimension $g \leq 1$ for $p < 2^{12}$



$w(E)^*a_p$ 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 $p < 2^{11}$

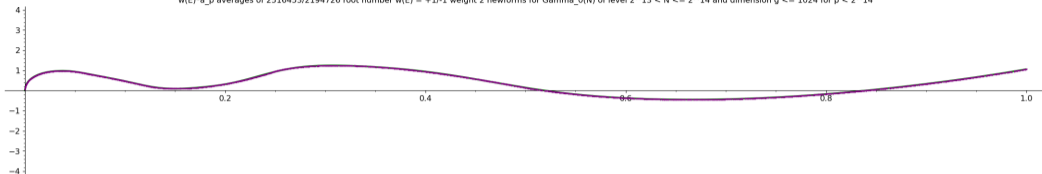


Newforms for $\Gamma_0(N)$ of weight $k = 2, 4, 6$.

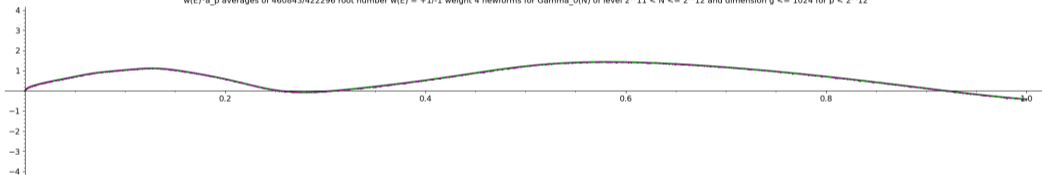


Newforms for $\Gamma_0(N)$ of weight $k = 2, 4, 6$ and varying dimension.

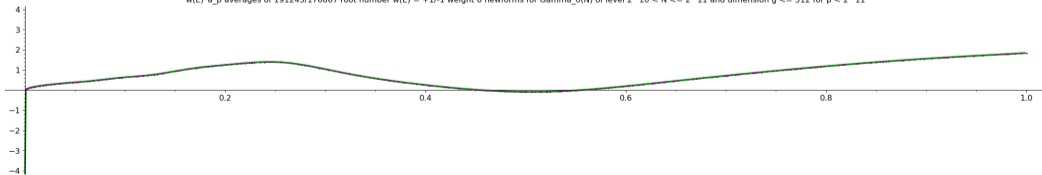
$w(E)^*a_p$ averages of 2516453/2194726 root number $w(E) = +1/-1$ weight 2 newforms for $\Gamma_0(N)$ of level $2^{13} < N \leq 2^{14}$ and dimension $g \leq 1024$ for $p < 2^{14}$



$w(E)^*a_p$ averages of 460843/422296 root number $w(E) = +1/-1$ weight 4 newforms for $\Gamma_0(N)$ of level $2^{11} < N \leq 2^{12}$ and dimension $g \leq 1024$ for $p < 2^{12}$

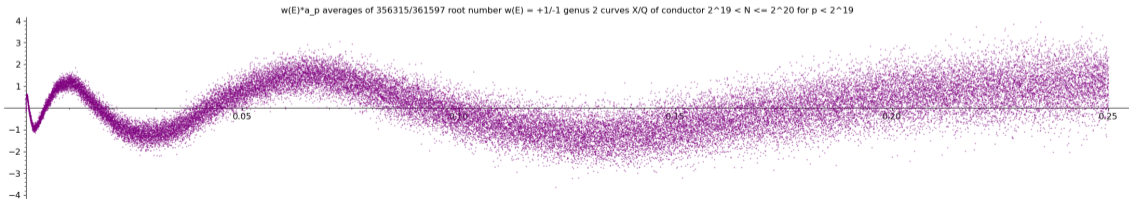
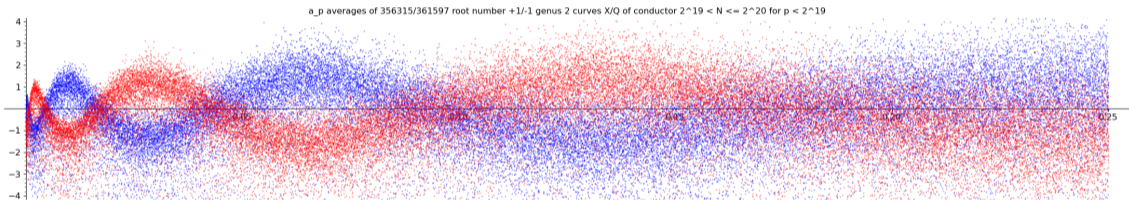


$w(E)^*a_p$ averages of 191243/176867 root number $w(E) = +1/-1$ weight 6 newforms for $\Gamma_0(N)$ of level $2^{10} < N \leq 2^{11}$ and dimension $g \leq 512$ for $p < 2^{11}$



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

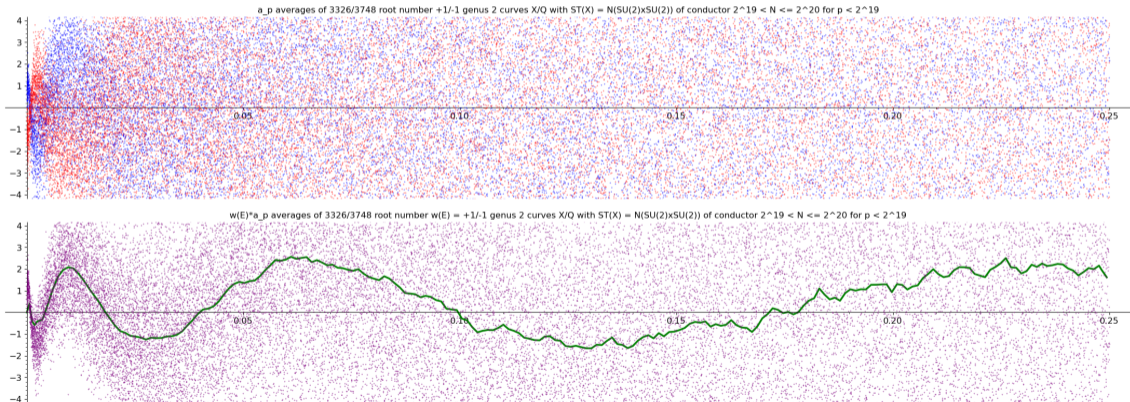
Recently constructed database of more than 5 million genus 2 curves X/\mathbb{Q} of conductor at most 2^{20} includes 1,440,894 isogeny classes with ST group $\mathrm{USp}(4)$. Conductor in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{19}$ with x -axis range $[0, M]$.



Coming soon to the [LMFDB](#).

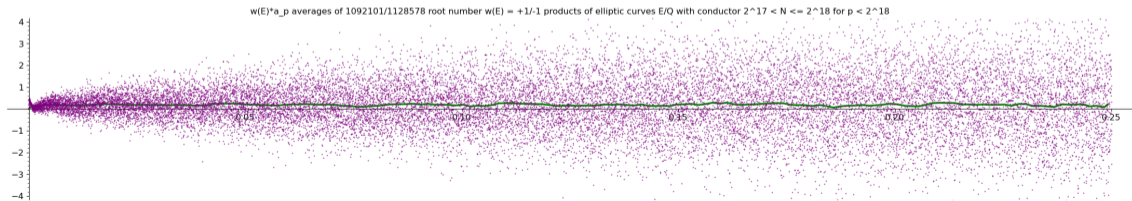
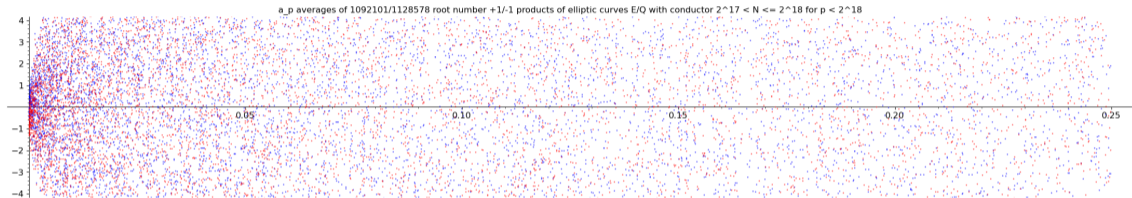
L -functions of genus 2 curves over \mathbb{Q} , Sato-Tate group $N(\mathrm{SU}(2) \times \mathrm{SU}(2))$.

These are primitive L -functions arising from Hilbert or Bianchi modular forms. Conductor in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{19}$ with x -axis range $[0, M]$.



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

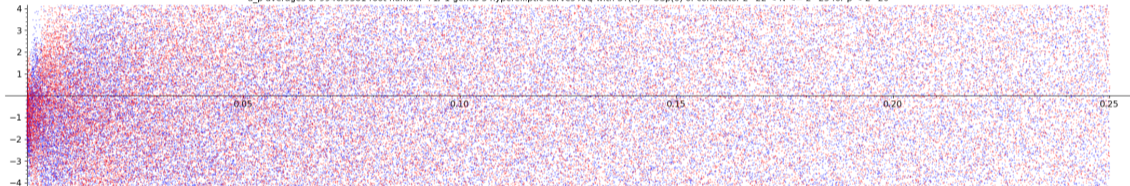
Conductor in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{17}$ with x -axis range $[0, M]$.



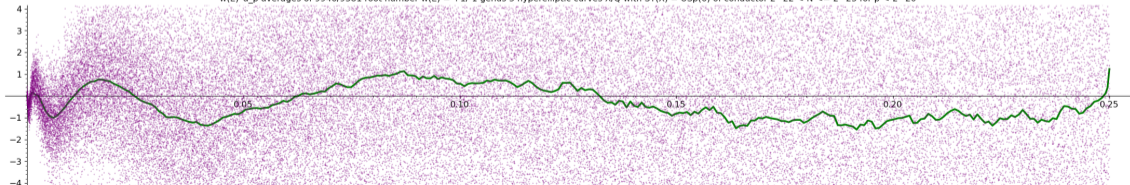
L-functions of genus 3 curves over \mathbb{Q} with Sato-Tate group $\mathrm{USp}(6)$.

Recently constructed database of genus 3 curves X/\mathbb{Q} of conductor at most 2^{20} includes 59,214 isogeny classes of hyperelliptic curves with ST group $\mathrm{USp}(6)$. Conductor in $(M, 2M]$ for $M = 2^{12}, \dots, 2^{19}$ with x-axis range $[0, M]$.

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 $p < 2^{20}$



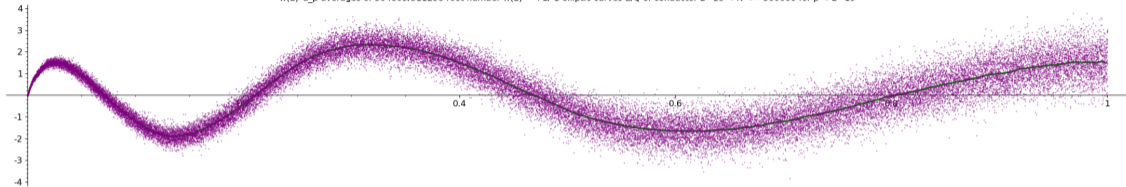
$w(E) \cdot a_p$ averages of 9946/9381 root number $w(E) = +1/-1$ genus 3 hyperelliptic curves X/Q with ST(X) = USp(6) of conductor $2^{22} < N \leq 2^{23}$ for $p < 2^{20}$



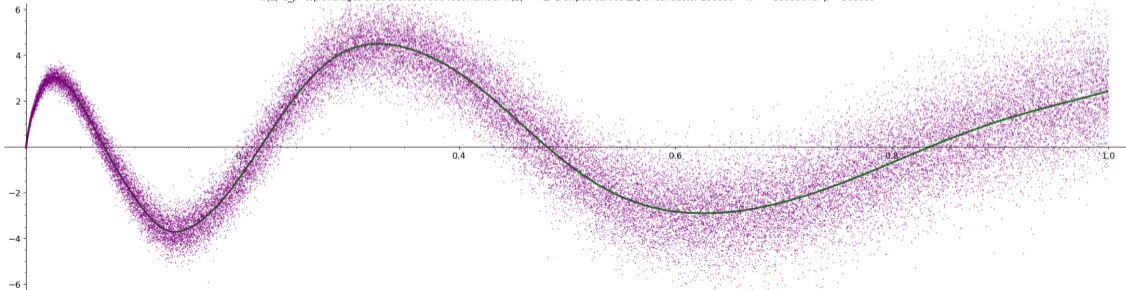
Coming soon to the [LMFDB](#).

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

$w(E)a_p$ averages of 504805/511258 root number $w(E) = +1/-1$ elliptic curves E/Q of conductor $2^{18} < N \leq 500000$ for $p < 2^{19}$

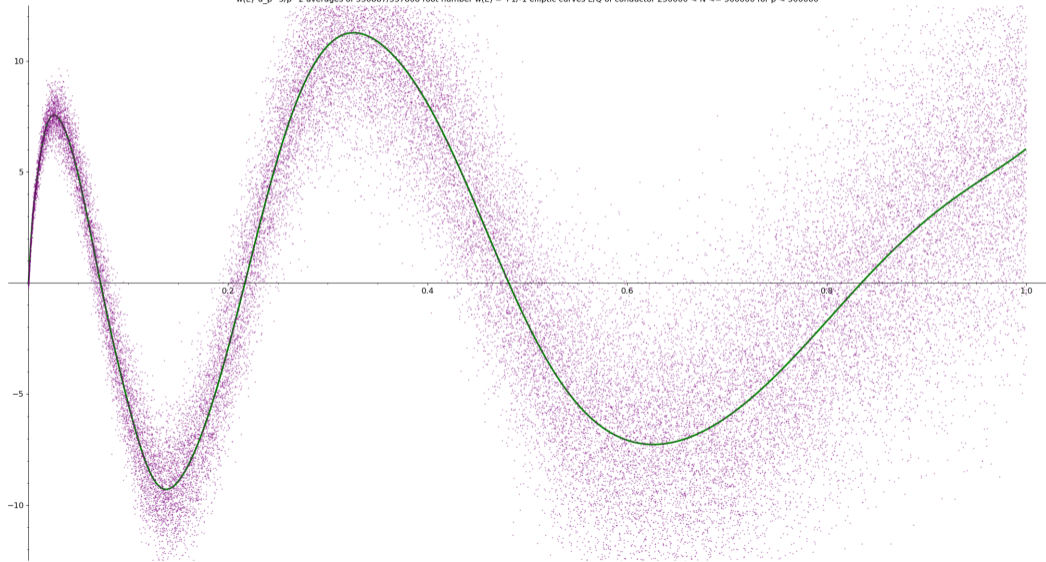


$w(E)a_p^3/p$ averages of 530887/537808 root number $w(E) = +1/-1$ elliptic curves E/Q of conductor $250000 < N \leq 500000$ for $p < 500000$



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 $p < 500000$



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

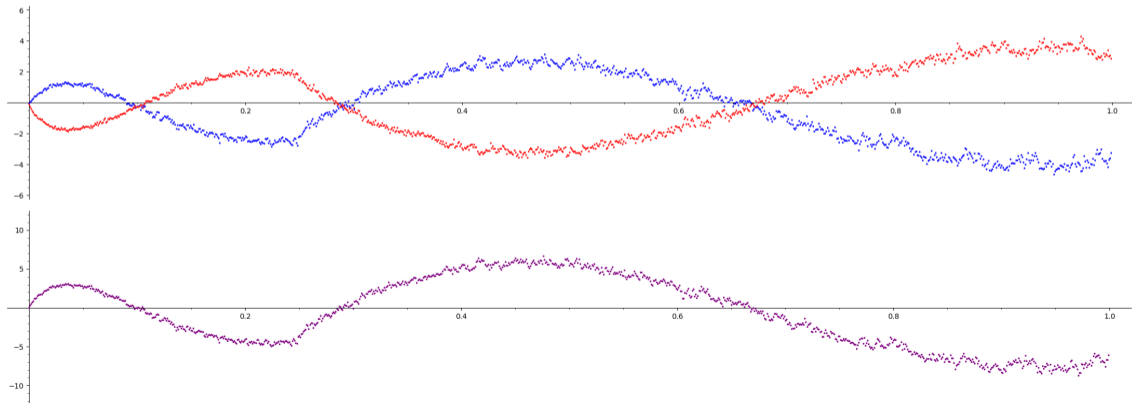
$$\frac{p}{N} \in \left(x, x + \frac{1}{n}\right],$$

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

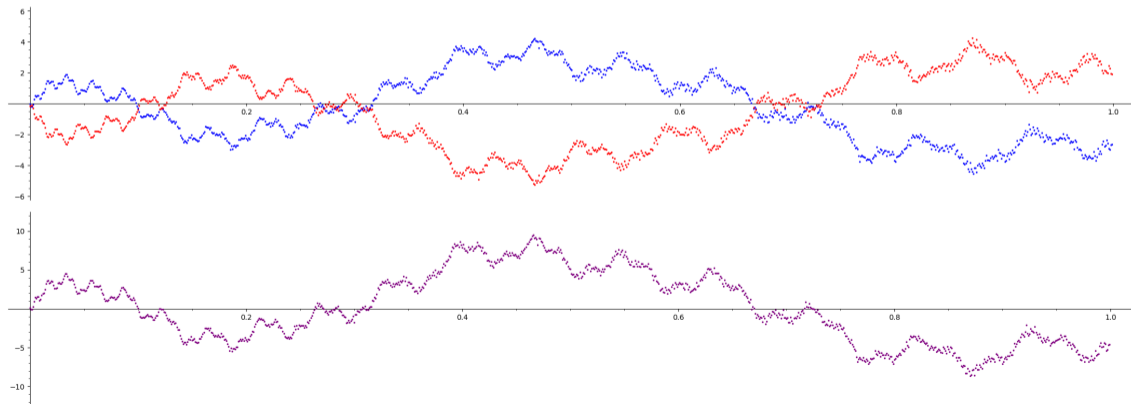
Elliptic curve L -functions of conductor $N \leq M$ for $M = 2^{12}, 2^{13}, \dots, 2^{17}, 2^{18}$. The x -axis range is $[0, 1]$. A blue/red (or purple) dot at $(x, \bar{\alpha}_x)$ shows the average $\bar{\alpha}_x$ of $\alpha_x(E)$ (or $w_p(E)\alpha_x(E)$) over even/odd rank (or all) E/\mathbb{Q}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



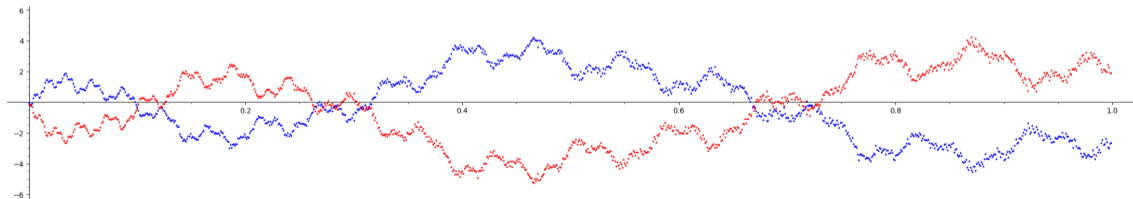
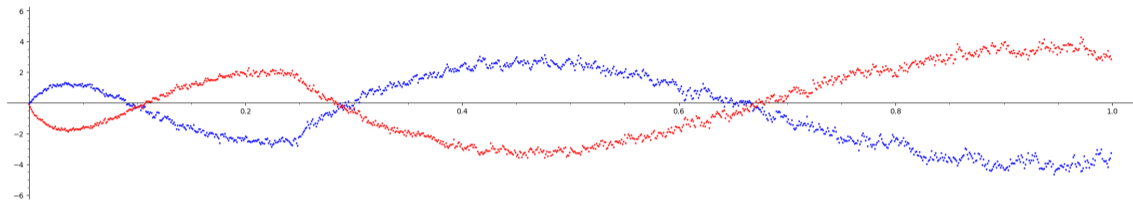
Local averaging: elliptic curves ordered by naive height

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

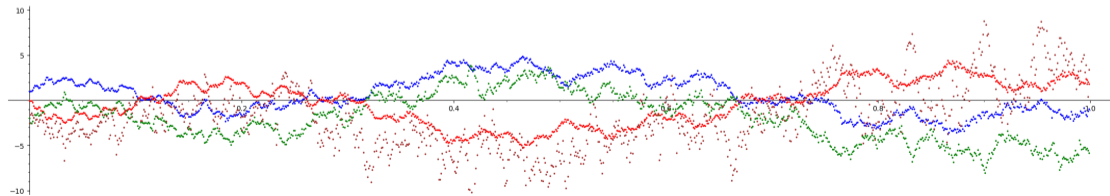
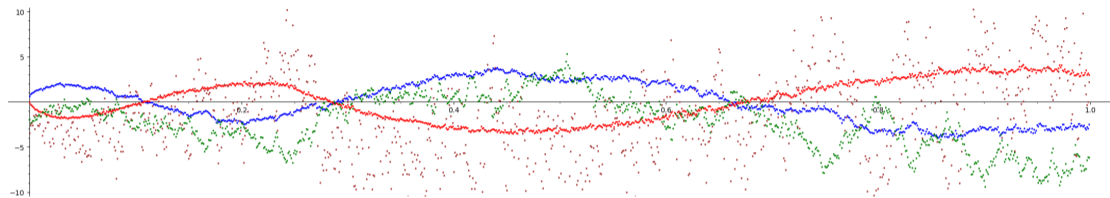
The x -axis range is $[0, 1]$. A blue/red (or purple) dot at $(x, \bar{\alpha}_x)$ shows the average $\bar{\alpha}_x$ of $\alpha_x(E)$ (or $w_p(E)\alpha_x(E)$) over even/odd rank (or all) E/\mathbb{Q} with $\text{ht}(E) \leq M$.



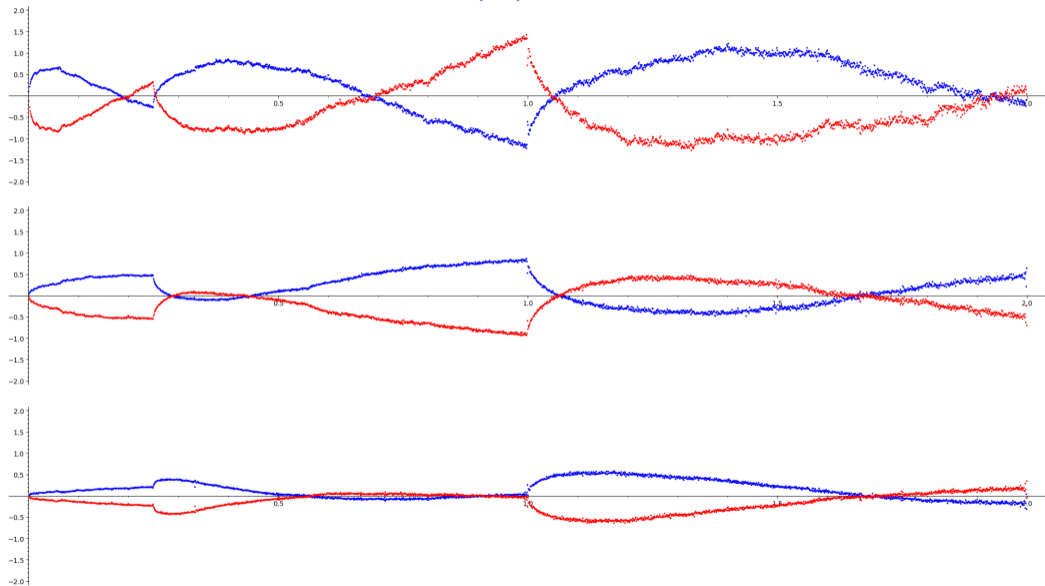
Local averaging: elliptic curves ordered by conductor vs height



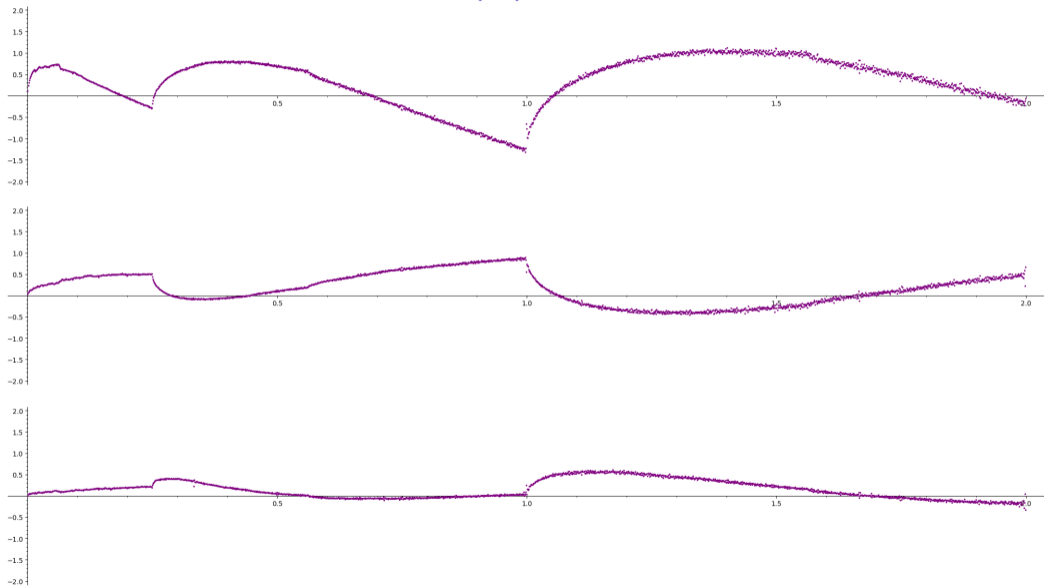
Local averaging: elliptic curves ordered by conductor vs height (rank)



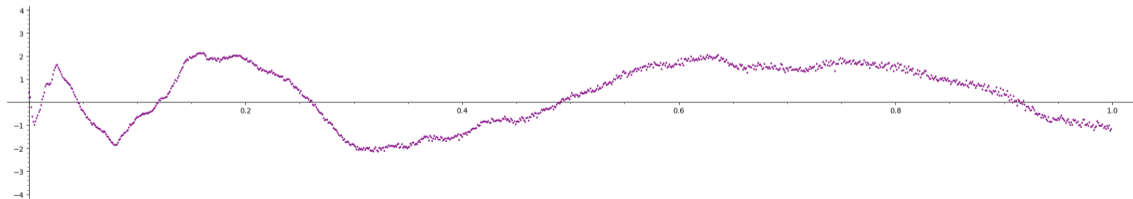
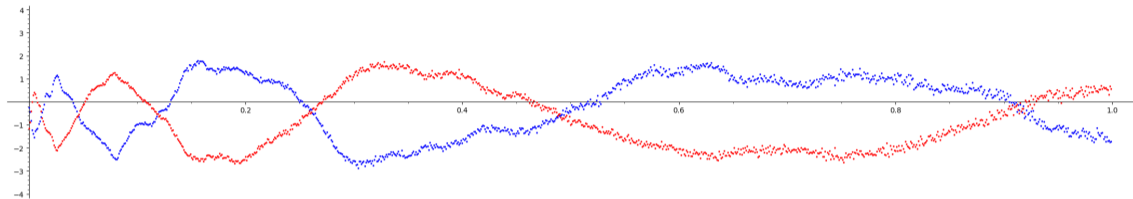
Local averaging: newforms for $\Gamma_0(N)$ of weight $k = 2, 4, 6$



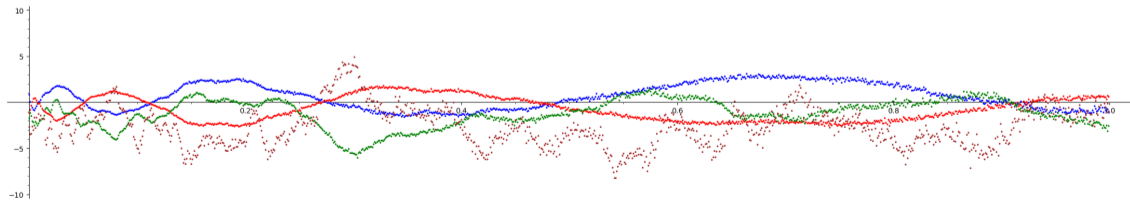
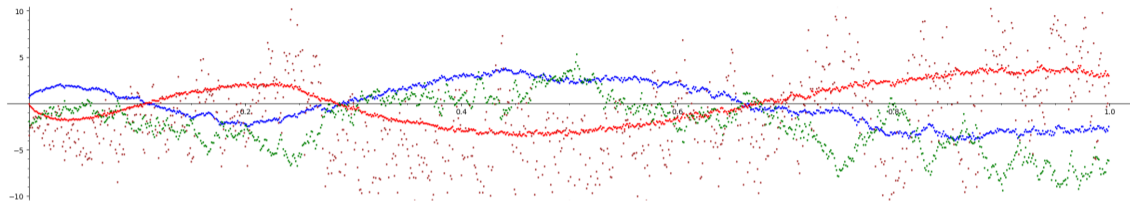
Local averaging: newforms for $\Gamma_0(N)$ of weight $k = 2, 4, 6$



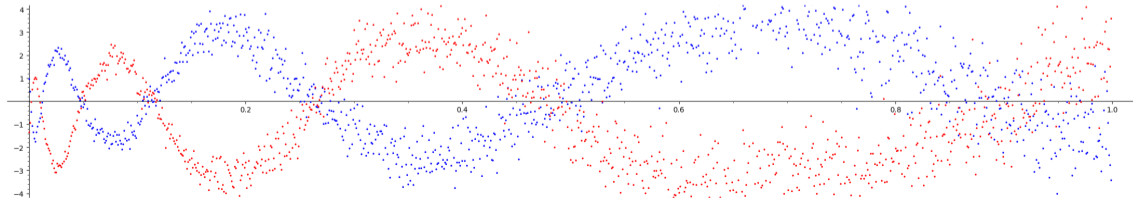
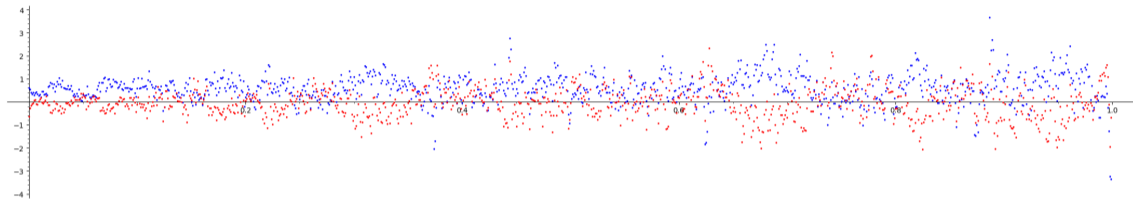
Local averaging: genus 2 $USp(4)$ L -functions



Local averaging: $SU(2)$ and $USp(4)$ L -functions (rank)

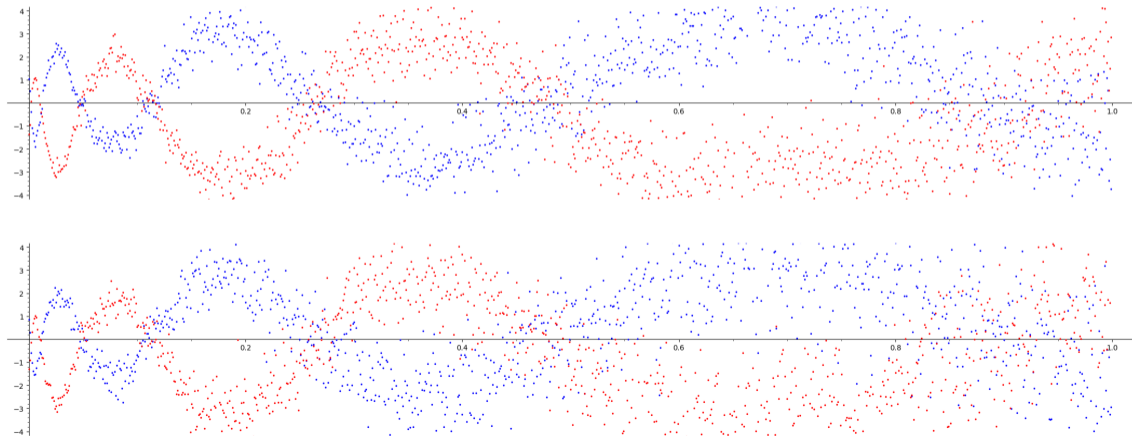


Local averaging: genus 2 $SU(2) \times SU(2)$ and $N(SU(2) \times SU(2))$ L -functions



Local averaging: genus 2 $N(\mathrm{SU}(2) \times \mathrm{SU}(2))$ L -functions

Abelian surfaces with Sato-Tate group $N(\mathrm{SU}(2) \times \mathrm{SU}(2))$ have L -functions that correspond to a Hilbert or Bianchi modular form.



Local averaging: twists of 11a1

Local averaging also allows us to consider thinner families of L -functions.

For example, consider the L -functions of quadratic twists of a fixed elliptic curve E/\mathbb{Q} . The conductor grows like X^2 and the naive height grows like X^6 .

