

Random matrices, operators and analytic functions

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joint with B. Virág (Toronto)

Eugene Wigner, 1950s:

- *energy levels of heavy nuclei*



- *the spectrum of a complicated **self-adjoint operator***

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In this talk:

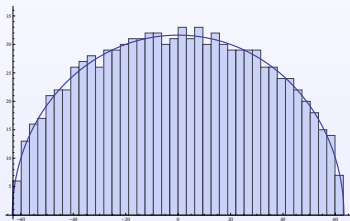
random matrices \rightsquigarrow (random) operators

Basic question of RMT:

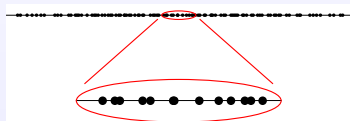
What can we say about the spectrum of a large random matrix?

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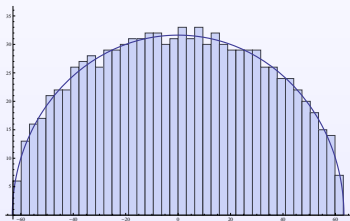
global



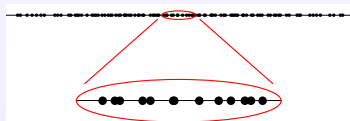
local

Basic question of RMT:

What can we say about the spectrum of a large random matrix?



global



local

How about other observables related to the matrix?

A classical example: Gaussian Unitary Ensemble

$M = \frac{A+A^*}{\sqrt{2}}$, A is $n \times n$ with iid standard complex normal entries

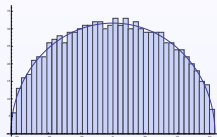
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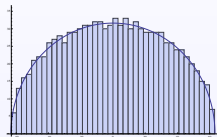
Global picture: Wigner semicircle law



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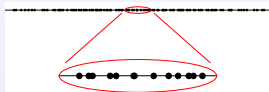
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Local picture: point process limit in the bulk and near the edge

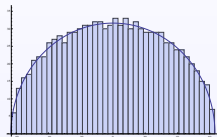


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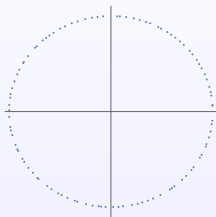


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The limit processes are characterized by their joint intensity functions.
Roughly: how likely that we see random points near certain values.

Another classical example: Circular Unitary Ensemble

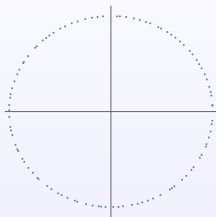
Eigenvalues of a uniform $n \times n$ unitary matrix:



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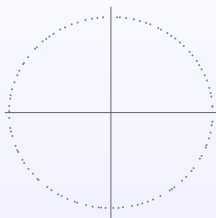


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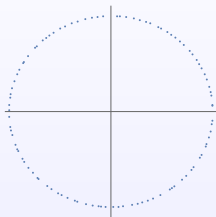
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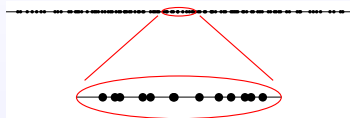
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Limit is the same as the bulk limit of GUE

Point process limit



Finite n : spectrum of a random Hermitian/unitary matrix
zeros of the characteristic polynomial

Point process limit



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Limit point process: spectrum of ??, zeros of ??

Quick detour to number theory

Riemann **zeta** function: $\zeta(s) = \sum_{n=1}^{\infty} \frac{1}{n^s}$, for $\operatorname{Re} s > 1$.

(Analytic continuation to $\mathbb{C} \setminus \{1\}$)

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Is there a natural operator for the bulk limit of GUE?

Back to random matrices

Joint eigenvalue density for GUE and CUE:

$$\frac{1}{Z_n} \prod_{i < j \leq n} |\lambda_j - \lambda_i|^2 \prod_{i=1}^n e^{-\frac{1}{2}\lambda_i^2}, \quad \frac{1}{Z'_n} \prod_{j < k \leq n} |e^{-i\theta_j} - e^{i\theta_k}|^2.$$

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Many of the classical random matrix ensembles have joint eigenvalue densities of the form

$$\frac{1}{Z_{n,f,\beta}} \prod_{i < j \leq n} |\lambda_j - \lambda_i|^\beta \prod_{i=1}^n f(\lambda_i)$$

with $\beta = 1, 2$ or 4 and f a specific reference density.

β -ensemble: finite point process with joint density

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$f(\cdot)$: reference density, $\beta > 0$

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Examples:

- ▶ Hermite or Gaussian: normal density
- ▶ circular: uniform on the unit circle
- ▶ Laguerre or Wishart: gamma density
- ▶ Jacobi or MANOVA: beta density

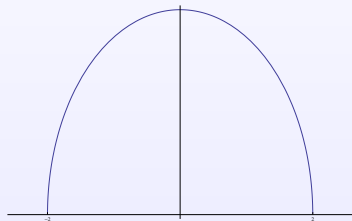
$\beta = 1, 2, 4$: classical random matrix models

Scaling limits - global picture

Circular β -ensemble \rightsquigarrow uniform law

Hermite β -ensemble \rightsquigarrow semicircle law

Laguerre β -ensemble \rightsquigarrow Marchenko-Pastur law



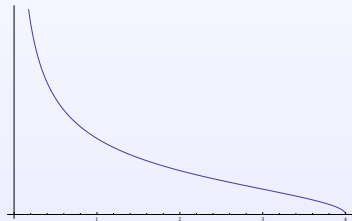
soft edge



bulk



s. e.



hard edge



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Point process limits

Soft edge: Rider-Ramírez-Virág (Hermite, Laguerre)

Airy_β process

Hard edge: Rider-Ramírez (Laguerre)

$\text{Bessel}_{\beta,a}$ processes

Bulk: Killip-Stoiciu, V.-Virág (circular, Hermite)

$C\beta E$ and Sine_β processes (later shown to be the same)

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Instead of joint intensities, the limit processes are described via their **counting functions** using coupled systems of stochastic differential equations.

$$\lambda \rightarrow \text{sign}(\lambda) \cdot (\# \text{ of points in } [0, \lambda])$$

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Universality: [Erdős-Yau-Bourgade](#), [Krishnapur-Rider-Virág](#), [Rider-Waters](#)

Random operators

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Dumitriu-Edelman '02:

tridiagonal representation for Gaussian and Laguerre β -ensembles

Edelman-Sutton '06:

random tridiagonal matrices \rightsquigarrow random differential operators

Conj.: Limit processes \sim spectra of random differential operators

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Soft edge: Ramírez-Rider-Virág '06 (Gaussian, Laguerre)

$$\mathcal{A}_\beta = -\frac{d^2}{dx^2} + x + \frac{2}{\sqrt{\beta}} dB$$

Hard edge: Ramírez-Rider '08 (Laguerre)

$$\mathcal{B}_{\beta,a} = -e^{(a+1)x + \frac{2}{\sqrt{\beta}} B(x)} \frac{d}{dx} \left\{ e^{-ax - \frac{2}{\sqrt{\beta}} B(x)} \frac{d}{dx} \right\}$$

B : standard Brownian motion, dB : white noise

domain: $[0, \infty) \rightarrow \mathbb{R}$, L^2 and boundary conditions

The Sine_β operator - operator in the bulk

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Thm (V-Virág '16):

There is a self-adjoint differential operator (Dirac-operator)

$$\tau : f \rightarrow 2R_t^{-1} \begin{bmatrix} 0 & -1 \\ 1 & 0 \end{bmatrix} f'(t), \quad f : [0, 1] \rightarrow \mathbb{R}^2.$$

with spectrum given by the Sine_β process.

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Also: Several finite classical random matrix models, β -generalizations and scaling limits can be represented in this form.

Dirac operators

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R_t : positive definite matrix valued function

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Ingredients: a path $x_t + iy_t : [0, T) \rightarrow \mathbb{H}$ in the hyperbolic plane, two boundary points in \mathbb{H} .

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Domain: differentiability, L^2 and boundary conditions

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Two boundary points \rightsquigarrow boundary conditions for τ

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Conjugation with X^{-1} : self-adjoint integral operator on L^2 .

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- ▶ finite circular β -ensemble and circular Jacobi ensembles (random walk in \mathbb{H})

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The function R_t and the corresponding path $x_t + iy_t$ are constant on each $[\frac{k}{n}, \frac{k+1}{n})$.

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Thm (Killip-Nenciu '04) If V is a uniformly chosen $n \times n$ unitary matrix then the Verblunsky coefficients (the parameters in the Szegő recursion) are independent with nice distributions.

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($x + iy$ is a random walk)

Construction of the hyperbolic RW: $b_0 = i, \dots, b_{n-1} \in \mathbb{H}, b_n \in \partial\mathbb{H}$

Given b_k we choose b_{k+1} uniformly on a hyperbolic circle with random radius ξ_k . In the Poincaré disk with center b_k we have $\xi_k^2 \sim \text{Beta}(1, \frac{\beta}{2}(n - k - 1))$. The last step is chosen uniformly on $\partial\mathbb{H}$ as viewed from b_{n-1} .

Operator level bulk limit

Operator level bulk limit

finite model



differential operator built from RW

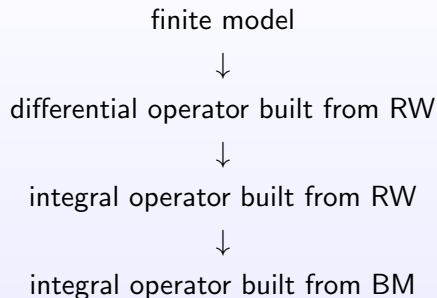


integral operator built from RW



integral operator built from BM

Operator level bulk limit



The previous methods required the derivation of a one-parameter family of SDE system.

Here we need to understand the limit of the integral kernel (convergence of a RW to a BM)

Operator level bulk limit

Thm (V-Virág, '17):

One can couple the finite n circular β -ensembles to Sine_β so that the corresponding operators are within $\log^3 n \cdot n^{-1/2}$ in H-S norm.

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Coupling bound for $\beta = 2$: Maples, Najnudel, Nikeghbali '13

TV bounds on the counting functions ($\beta = 2$): Meckes, Meckes '16

Limits of characteristic polynomials

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Thm(Chhaibi, Najnudel, Nikeghbali '17): Label the points of Sine_2 as $\dots < \lambda_{-1} < \lambda_0 < 0 < \lambda_1 < \dots$. Then

$$\xi(z) := \left(1 - \frac{z}{\lambda_0}\right) \prod_{k=1}^{\infty} \left(1 - \frac{z}{\lambda_{-k}}\right) \left(1 - \frac{z}{\lambda_k}\right)$$

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Moreover, there is a coupling of the finite circular unitary ensembles to Sine_2 so that a.s.

$$\frac{p_n(e^{i\frac{z}{n}})}{p_n(1)} \rightarrow e^{i\frac{z}{2}} \cdot \xi(z)$$

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general β ?

$\beta = \infty$ case

The finite ensemble is just n equally spaced points on the circle, rotated with a uniform angle. The scaling limit is $2\pi\mathbb{Z} + U[0, 2\pi]$.



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The limiting function is $\sin(z/2)$ with a random shift. After normalization:

$$\cos(z/2) + q \sin(z/2), \quad q \sim \text{Cauchy}$$

Aizenmann-Warzel '15: On the ubiquity of the Cauchy distribution in spectral problems

Entire function from the random operator

$$\tau : f \rightarrow 2R_t^{-1} \begin{bmatrix} 0 & -1 \\ 1 & 0 \end{bmatrix} f'(t), \quad f : [0, 1) \rightarrow \mathbb{R}^2.$$

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$\sum_k \frac{1}{\lambda_k^2} < \infty$ holds a.s. $\rightsquigarrow \det_2(I - z\tau^{-1})$ is well defined

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Thm(V., Virág): The scaling limit of the normalized characteristic polynomials for circular β -ensembles is given by

$$e^{i\frac{z}{2}} \cdot \det_2(I - z\tau^{-1}) e^{-z \cdot {}^{\text{p.v.}} \operatorname{Tr} \tau^{-1}}$$

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Using the scale invariance of the hyperbolic BM we can find an SPDE so that its stationary solution is $E = A - iB$:

$$dE_t = -i\frac{\beta}{8}zE_t(z)ds - \frac{\beta}{4}z\partial_z E_t(z)ds + \frac{\bar{E}_t(\bar{z}) - E_t(z)}{2i}dW, \quad E_0(z) = 1$$

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The SDE system for $\partial_z^n E_t(0)$, $n = 1, 2, \dots$ can be solved explicitly.

Moments of products of ratios

Borodin-Strahov '06: Limit of $E \left[\prod_{j=1}^k \frac{\tilde{p}_n(z_j)}{\tilde{p}_n(w_j)} \right]$ for various classical random matrix models.

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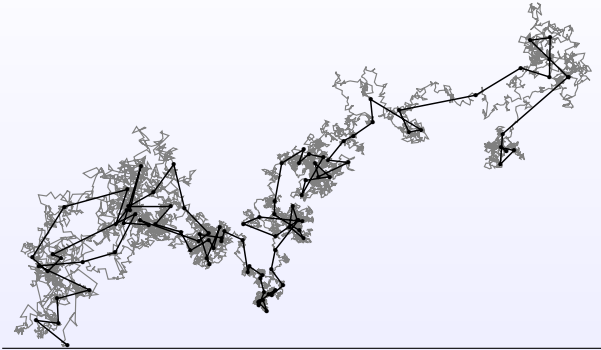
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Outline: In the $\text{Im } w_j < 0$ case $E \left[\prod_{j=1}^k \frac{A(z_j) + qB(z_j)}{A(w_j) + qB(w_j)} \right]$ can be expressed using $A - iB$. The expectation can now be evaluated using the SPDE representation for $A - iB$.



THANK YOU!