# Eigenvalues for sums of self-adjoint and skew-self-adjoint random matrices

Brian C. Hall

University of Notre Dame

**RMTA 2020** 



# DEPARTMENT OF MATHEMATICS

- Joint work with Ching Wei Ho (Indiana University)
- Builds on work of Ho and Zhong [arXiv:1908.08150]
- We use PDE method developed by Driver-Hall-Kemp [arXiv:1903.11015]
- Some of these results were previously obtained by Jarosz and Nowak by a different method [J. Phys. A 2006 and arXiv:math-ph/0402057]

#### Part 1: The random matrix problem

# Sum of Hermitian random matrix imaginary multiple of GUE

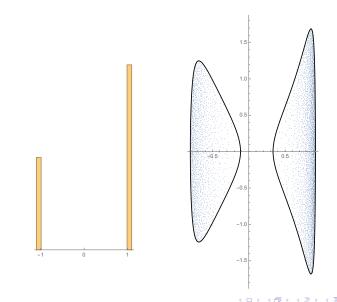
- Take S to be GUE (Gaussian-distributed Hermitian random matrix)
- Take  $X_0$  Hermitian and independent of S
- Can take  $X_0$  to be diagonal with fixed eigenvalue distribution

Consider

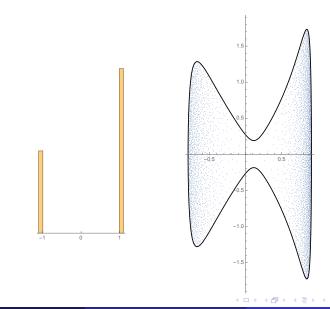
$$Z:=X_0+i\sqrt{t}S,\quad t>0.$$

• Study eigenvalue distribution of Z in  ${\mathbb C}$ 

#### Example: Bernoulli case, t = 1



#### Bernoulli case, t = 1.05



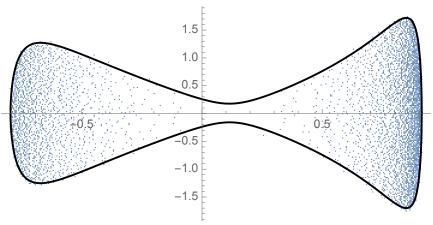
Brian C. Hall (University of Notre Dame)

Eigenvalues for sums

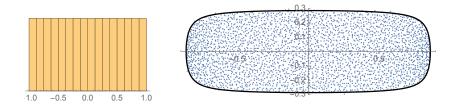
RMTA 2020 6 / 46

#### Bernoulli with t = 1.05, stretched

• Density of eigenvalues is *constant in the vertical direction* inside the domain



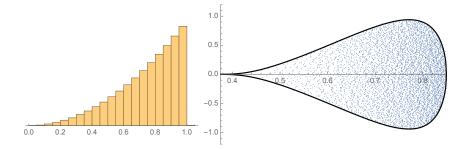
#### Uniform case, t = 0.1



3

・ロト ・ 日 ト ・ 田 ト ・

## Quadratic case, t = 1/4



## Part 2: Girko's method and the Brown measure

- Girko [1984] worked on general circular law: entries are i.i.d. but not Gaussian
- Matrix is not Hermitian (or normal); method of moments is not applicable
- No explicit formulas as in Gaussian case
- How to compute eigenvalues in this case?

• For matrix A, define

$$S(\lambda) = \frac{1}{N} \operatorname{Trace}[\log((A - \lambda)^*(A - \lambda))]$$

• Then

$$S(\lambda) = rac{2}{N} \sum_{j=1}^{N} \log |\lambda - \lambda_j|$$

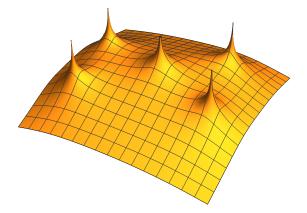
• This function is harmonic except at  $\lambda = \lambda_j$  and

$$rac{1}{4\pi}\Delta S = rac{1}{N}\sum_{j=1}^N \delta_{\lambda_j}$$

Brian C. Hall (University of Notre Dame)

## The function $S(\lambda)$

• Plot of  $-S(\lambda)$  with 5 eigenvalues



## Operator algebra formalism

• For random matrix  $X^N$ , define \*-moments as

$$\mathbb{E}\left\{\frac{1}{N}\operatorname{Trace}[\operatorname{word} \text{ in } X^{N} \text{ and } (X^{N})^{*}]\right\}$$

- Take large-N limit of these \*-moments
- Seek operator algebra  $(A, \tau)$  with trace  $\tau : A \to \mathbb{C}$  AND operator  $a \in A$  such that

$$\lim_{N \to \infty} \mathbb{E} \left\{ \frac{1}{N} \operatorname{Trace}[\text{word in } X^N \text{ and } (X^N)^*] \right\}$$
$$= \tau[\text{word in } a \text{ and } a^*]$$

- a not an operator-valued random variable—just one fixed operator in A
- Limits of this sort constructed using methods of free probability

- Given  $a \in (\mathcal{A}, \tau)$ , want something like "empirical eigenvalue distribution"
- Don't assume a is normal, so can't use spectral theorem
- Imitate Girko's formula!
- Define

$$\mathcal{S}(\lambda) = \tau[\log((\mathbf{a} - \lambda)^*(\mathbf{a} - \lambda))]$$

then take Laplacian

• To be sure S is well defined, introduce regularization  $\varepsilon > 0$ :

$$S(\lambda, \varepsilon) = \tau[\log((a - \lambda)^*(a - \lambda) + \varepsilon)]$$

Then

$$s(\lambda) := \lim_{\varepsilon \to 0} S(\lambda, \varepsilon)$$

exists as a subharmonic function

• Then **Brown measure** Brown(a) defined as

$$\operatorname{Brown}(a) = \frac{1}{4\pi} \Delta s$$

• Then Brown(a) is probability measure supported on spectrum of a

Brian C. Hall (University of Notre Dame)

э

Image: A math a math

- Large-N limit of  $\sqrt{t}S$ : "semicircular Brownian motion"  $\sigma_t$
- Large-N limit of  $X_0$ : s.a. element  $x_0$  that is "freely independent" of  $\sigma_t$
- Let  $\mu =$  "law of  $x_0$ " = large-N limit of eigenvalue distribution of  $X_0$

#### Problem

Compute Brown measure of  $x_0 + i\sigma_t$  (in terms of the law  $\mu$  of  $x_0$ ).

• We **believe** that  $\operatorname{Brown}(x_0 + i\sigma_t)$  is large-*N* limit of eigenvalue distribution of  $X_0 + i\sqrt{t}S$ 

- Biane: computed the distribution of  $x_0 + \sigma_t$  (without the "*i*")
- If x<sub>0</sub> = y<sub>0</sub> + σ̃<sub>t</sub> for another semicircular Brownian motion σ̃<sub>t</sub>, results of Ho and Zhong apply
- Jarosz and Nowak have general algorithm for computing Brown measures for x + iy;
- Their results agree with ours in case of  $x_0 + i\sigma_t$ , but we get additional information

## The PDE method

• Apply definition of Brown measure to  $x_0 + i\sigma_t$ 

Define

$$S(t, \lambda, \varepsilon) = \tau [\log((x_0 + i\sigma_t - \lambda)^* (x_0 + i\sigma_t - \lambda) + \varepsilon)]$$

#### Theorem

The function S satisfies the PDE

$$\frac{\partial S}{\partial t} = \varepsilon \left(\frac{\partial S}{\partial \varepsilon}\right)^2 + \frac{1}{4} \left( \left(\frac{\partial S}{\partial a}\right)^2 - \left(\frac{\partial S}{\partial b}\right)^2 \right), \quad \lambda = a + ib$$

with initial condition

$$S(0, \lambda, \varepsilon) = \tau [\log(x_0^* x_0 + \varepsilon)].$$

- **4 ∃ ≻** 4

- $\varepsilon$  is a *variable* in the PDE
- Want to solve PDE, then evaluate at  $\varepsilon = 0$
- Take  $\Delta$  with respect to  $\lambda$  of  $S(t, \lambda, 0)$

• Define "Hamiltonian" function *H* from PDE, replacing derivatives on RHS with "momenta" (and overall sign change):

$$H(a, b, \varepsilon, p_a, p_b, p_\varepsilon) = -\varepsilon p_\varepsilon^2 - \frac{1}{4}(p_a^2 - p_b^2)$$

• Then introduce auxiliary system of ODE's (Hamilton's equations):

$$\frac{du}{dt} = \frac{\partial H}{\partial p_u}; \quad \frac{dp_u}{dt} = -\frac{\partial H}{\partial u}; \quad u \in \{a, b, \varepsilon\}.$$

These ODE's can be solved explicitly

#### • Hamilton–Jacobi formula:

$$S(t, \lambda(t), \varepsilon(t)) = S(0, \lambda_0, \varepsilon_0) + tH_0$$

where

$$H_0 = H(a_0, b_0, \varepsilon_0, p_{a,0}, p_{b,0}, p_{\varepsilon,0})$$

• Initial momenta are

$$p_{u,0}=\frac{\partial}{\partial u}S(0,\lambda_0,\varepsilon_0).$$

• Get S along solutions to ODE's—in terms of  $\lambda_0$  and  $\varepsilon_0$ 

#### Part 4: Where the Brown measure is zero

- H-J method tells us  $S(t, \lambda(t), \varepsilon(t))$
- To get  $S(t, \lambda, 0)$ , choose  $(\lambda_0, \varepsilon_0)$  so that  $\lambda(t) = \lambda$  and  $\varepsilon(t) = 0$
- Simple strategy: to get  $\varepsilon(t) \approx 0$ , try  $\varepsilon_0 \approx 0$

• **Problem**: If  $\varepsilon_0 \approx 0$ , solution may cease to exist before time t• Define

 $\mathcal{T}(\lambda_0)=$  existence time of solution with  $\lambda(0)=\lambda_0,\, \epsilon(0)\approx 0$ 

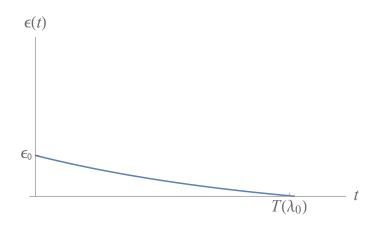
Explicitly,

$$T(a_0 + ib_0) = \left(\int_{\mathbb{R}} \frac{1}{(a_0 - x)^2 + b_0^2} d\mu(x)\right)^{-1},$$

where  $\mu$  is the distribution of  $x_0$ 

#### Small- $\epsilon_0$ existence time

• Taking  $\varepsilon_0 \approx 0$  only allowed if  $T(\lambda_0) > t$ 



- If  $T(\lambda_0) > t$ , taking  $\varepsilon_0 \approx 0$  works
- Find that  $\lambda(t)$  is a holomorphic function of  $\lambda_0$
- Find that  $S(t, \lambda, 0)$  is harmonic
- Conclude that Brown measure is zero

• "Good Set" in  $\lambda_0$ -plane

$$\{\lambda_0 \in \mathbb{C} \mid T(\lambda_0) > t\}$$

[This set also appears in work of Biane and Ho-Zhong]

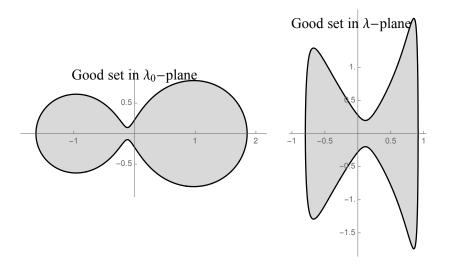
• "Good Set" in  $\lambda$ -plane

$$\left\{ \left. \lambda(t) 
ight| \, \lambda_{\mathsf{0}} \in \mathsf{Good} \, \, \mathsf{Set} 
ight\}$$
 ,

#### Theorem

The Brown measure of  $x_0 + i\sigma_t$  is zero in Good Set in  $\lambda$ -plane.

#### Good Sets in Bernoulli case



• With  $\lambda_0$  in Good Set and  $\varepsilon_0 = 0$ , get

$$\lambda(t) = J_t(\lambda_0)$$

where

$$J_t(\lambda_0) = \lambda_0 - t \int \frac{1}{\lambda_0 - x} d\mu(x)$$

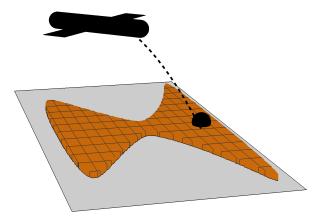
and  $\mu = \text{Law}(x_0)$ 

•  $J_t$  is a conformal map of Good Set in  $\lambda_0$ -plane to Good Set in  $\lambda$ -plane

#### Part 5: Where the Brown measure is not zero

## Air assault!

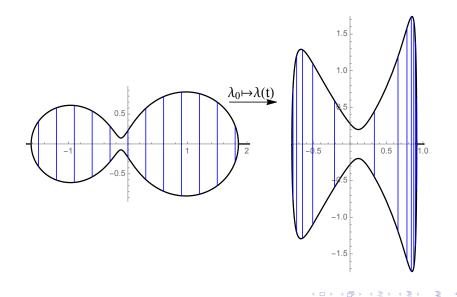
- Part 4 was "ground assault": Run along with  $\varepsilon(t) pprox 0$
- Where the Brown measure is not zero, need "air assault"!
- Find  $\lambda_0$  and  $\varepsilon_0 > 0$  so ODE's will "land" with  $\varepsilon(t) = 0$ ,  $\lambda(t) = \lambda$



- For each  $\lambda_0$  in Bad Set in  $\lambda_0$ -plane,  $\exists \ \varepsilon_0 > 0$  making  $\varepsilon(t) = 0$
- Compute  $\lambda(t)$  with this  $\varepsilon_0$
- Surjectivity: each point in Bad Set in  $\lambda$ -plane gets hit this way
- Decoupling:

$$b(t) = 2b_0$$
$$a(t) = f_t(a_0)$$

## Decoupling visualized



- Get  $S(t, \lambda, 0)$  as a function of  $\lambda_0$
- $\lambda_0$  and  $\lambda$  are related by map on previous slide
- Then take Laplacian in  $\lambda$

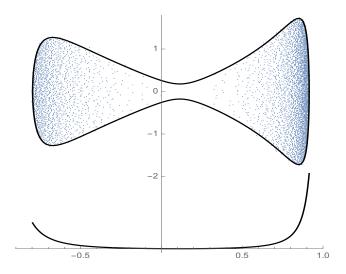
#### Theorem (H–Ho 2020)

In the Bad Set in  $\lambda$ -plane, Brown measure has a strictly positive density that **depends only on**  $a = \operatorname{Re} \lambda$ . Specifically, the density is given by

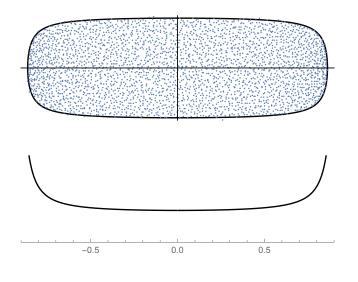
$$rac{1}{2\pi t}\left(rac{ extsf{da}_0^t( extsf{a})}{ extsf{da}}-rac{1}{2}
ight)$$
 ,

where  $a_0^t$  is the real part of the  $\lambda_0$  that maps to  $\lambda = a + ib$ .

#### Bernoulli case, t = 1.05



- ( A 🖓



æ

・ロト ・ 日 ・ ・ ヨ ・ ・ ヨ ・

## Part 6: Connection to the law of $x_0 + \sigma_t$

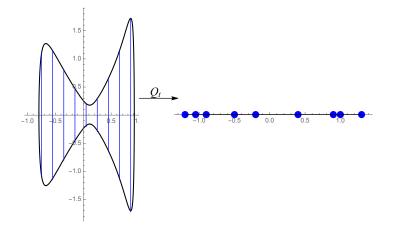
Image: Image:

- Biane [1997] computed law of  $x_0 + \sigma_t$  using subordination method
- Connection between  $x_0 + \sigma_t$  and  $x_0 + i\sigma_t$  suggested by work of Janik, Nowak, Papp, Wambach, and Zahed [1997]
- We obtain a *direct relationship* between Brown measure of  $x_0 + i\sigma_t$ and law of  $x_0 + \sigma_t$

## Defining the map

• Define a map  $Q_t$  from Bad Set in  $\lambda$ -plane to  $\mathbb{R}$  by:

$$Q_t(a+ib) = 2a_0^t(a) - a$$



#### Theorem

The push-forward of the Brown measure of  $x_0 + i\sigma_t$  under  $Q_t$  is the law of  $x_0 + \sigma_t$ , as computed by Biane.

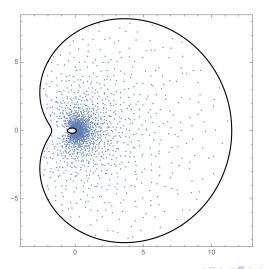
- Compute eigenvalues of  $X_0 + i\sqrt{t}S$  in  $\mathbb C$
- Map to real line by  $Q_t$
- Distribution of points in  $\mathbb R$  will be just like eigenvalues of  $X_0 + \sqrt{t}S$
- A mysterious connection between  $X_0 + i\sqrt{t}S$  and  $X_0 + \sqrt{t}S$



・ロト ・ 日 ト ・ ヨ ト ・ ヨ ト

#### Results of Driver-H-Kemp

• Studied Brownian motion in  $GL(N; \mathbb{C})$  as  $N \to \infty$  by similar method



#### THANK YOU FOR YOUR ATTENTION!

Image: A math a math