

# Roots of polynomials under differential flows

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- How do the roots of a polynomial change as we change the polynomial?
- Main examples in this talk: **heat flow** and **repeated differentiation**
- Will consider both operations in two cases: **real roots** and **complex roots**
- Will find a close connection to **random matrix theory** and **partial differential equations**

# Differentiation example

## POLYNOMIALS WITH ALL REAL ROOTS: HEAT FLOW

# Heat flow on polynomials: definition

- If  $p(z)$  is a polynomial on  $\mathbb{C}$ , define **heat operator**

$$\exp \left\{ \frac{\tau}{2} \frac{d^2}{dz^2} \right\} p(z) = \sum_{n=0}^{\infty} \frac{1}{n!} \left( \frac{\tau}{2} \right)^n \frac{d^{2n} p}{dz^{2n}}, \quad z \in \mathbb{C},$$

as a terminating power series, all  $\tau \in \mathbb{C}$

- If  $\tau = t$  is real and positive and  $z = x$  is real, the function

$$u(x, t) := \exp \left\{ \frac{t}{2} \frac{d^2}{dx^2} \right\} p(x), \quad x \in \mathbb{R},$$

satisfies the standard **heat equation**

$$\frac{\partial u}{\partial t} = \frac{1}{2} \frac{\partial^2 u}{\partial x^2}$$

# Heat operator on polynomials: normalization

- If  $p(z)$  is a polynomial of degree  $N$ , convenient to **normalize** heat operator with  $N$  in denominator:

$$\exp \left\{ \frac{\tau}{2N} \frac{d^2}{dz^2} \right\} p(z)$$

- This normalization will make the evolution of zeros behave well when  $N \rightarrow \infty$

# Backward heat flow on polynomials

- Now take  $\tau = -t$  and consider **backward heat operator**

$$\exp \left\{ -\frac{t}{2N} \frac{d^2}{dz^2} \right\}, \quad t > 0,$$

on polynomials

## Theorem (Pólya–Benz 1934)

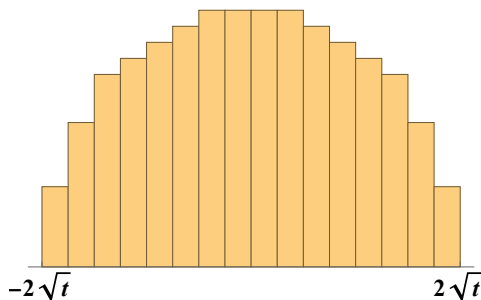
*If  $p$  has all real roots, so does*

$$\exp \left\{ -\frac{t}{2N} \frac{d^2}{dz^2} \right\} p(z)$$

*for all  $t > 0$ .*

# Backward heat operator: first example

- Apply to  $z^N$ , get scaled **Hermite polynomial**
- Histogram of zeros of  $e^{-\frac{t}{2N}} \frac{d^2}{dz^2} (z^N)$  with  $N = 200$

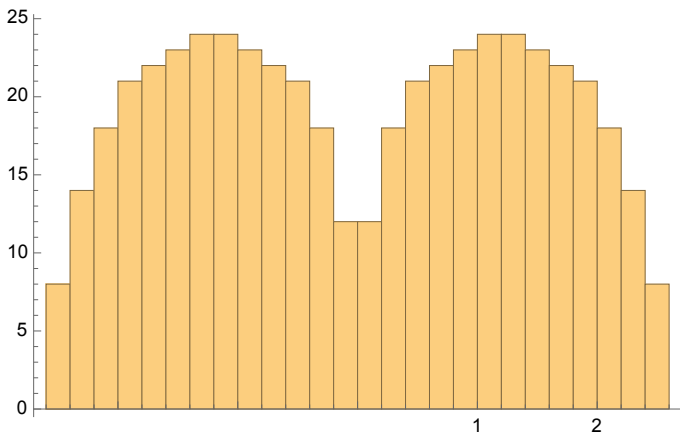


- Zeros have asymptotically **semicircular shape** on  $[-2\sqrt{t}, 2\sqrt{t}]$



# Backward heat operator: second example

- Take  $p(z) = (z - 1)^{N/2}(z + 1)^{N/2}$
- Half zeros at 1, half at  $-1$
- Histogram of zeros of  $e^{-\frac{t}{2N} \frac{d^2}{dz^2}} p$  with  $N = 500$ ,  $t = 1$



- **GUE**: Gaussian unitary ensemble
- Take  $N \times N$  Hermitian random matrix  $X$  with entries on and above diagonal independent
- Complex Gaussian with mean zero and variance  $1/N$  off diagonal
- Real Gaussian with mean zero and variance  $1/N$  on diagonal
- Eigenvalues asymptotically have **semicircular distribution** on  $[-2, 2]$

# Connection to random matrix theory

- Take sequence of real-rooted polynomials  $p^N$  of degree  $N$
- Assume root distribution converges to prob. measure  $\mu$
- Make **diagonal matrix**  $X_0^N$  with roots of  $p^N$  on diagonal
- Take  $X^N$  to be GUE matrix

## Claim

*Roots of  $e^{-\frac{t}{2N} \frac{d^2}{dz^2}} (p^N(z))$  resemble eigenvalues of  $X_0^N + \sqrt{t}X^N$ , which can be computed using **free convolution** of  $\mu$  with a semicircular distribution.*

- So: backward heat flow is like adding a GUE

- Define **Cauchy transform** of measure  $\mu$  on  $\mathbb{R}$  by

$$C_\mu(z) = \int_{\mathbb{R}} \frac{1}{z-x} d\mu(x), \quad \text{Im } z > 0.$$

- Holomorphic on upper half-plane
- Can recover  $\mu$  from  $C_\mu$  by Stieltjes inversion formula

$$d\mu(x) = -\frac{1}{2\pi} \lim_{\varepsilon \rightarrow 0^+} (\text{Im } C_\mu(x + i\varepsilon) dx)$$

## Theorem (Voiculescu/Kabluchko)

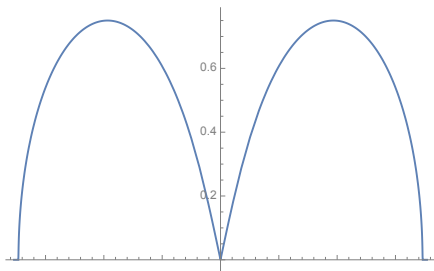
If polynomials  $p^N$  has real roots and the distribution of roots converges to  $\mu$ , then the distribution of roots of  $e^{-\frac{t}{2N} \frac{d^2}{dz^2}} p^N$  converges to a measure  $\mu_t$  whose Cauchy transform satisfies

$$\frac{\partial C}{\partial t} = -C \frac{\partial C}{\partial z}, \quad \text{Im } z > 0,$$

- Can then solve this PDE using the **method of characteristics**
- Gives semi-explicit way to compute  $\mu_t$
- $\mu_t$  is **free convolution**  $\boxplus$  of  $\mu$  with semicircular measure of variance  $t$

# Roots at $\pm 1$

- Take  $\mu$  to have mass  $1/2$  at  $1$  and mass  $1/2$  at  $-1$
- Describe polynomial  $p$  with zeros at  $\pm 1$
- Compute  $\mu \boxplus \text{sc}_t$  at, say,  $t = 1$



- This gives limiting distribution of zeros of  $e^{-\frac{1}{2N} \frac{d^2}{dz^2}} p(z)$

## POLYNOMIALS WITH ALL REAL ROOTS: REPEATED DIFFERENTIATION

# Repeated differentiation of polynomials with real roots

- Start with polynomial  $P^N$  of degree  $N$  with real roots
- Then differentiate  $\lfloor Nt \rfloor$  times,  $0 \leq t < 1$
- Number of deriv. proportional to  $N$
- Roots remain real!
- Assume root dist. of  $P^N$  converges to  $\mu$
- Try to find limiting root dist.  $\mu_t$  of  $\lfloor Nt \rfloor$ -th derivative



# Connection to random matrix theory

- Assume (at first) that  $t = 1 - 1/k$  with  $k \in \mathbb{N}$
- Then  $\mu_t = \mu^{\boxplus k} := \mu \boxplus \cdots \boxplus \mu$ , rescaled by a factor of  $1 - t$
- $\mu^{\boxplus k}$  is like adding  $k$  indep. Hermitian matrices with e.v. distribution  $\mu$
- Then extend definition to arbitrary  $t$  (i.e., fractional  $k$ )
- “Fractional free convolution” of Shlyakhtenko and Tao

Theorem (Hoskins–Kabluchko, '21; Arizmendi–Garza-Vargas–Perales, '23)

If polynomials  $P^N$  have limiting root distribution  $\mu$  then  $\lfloor Nt \rfloor$ -th derivative of  $P^N$  has limiting root distribution equal to

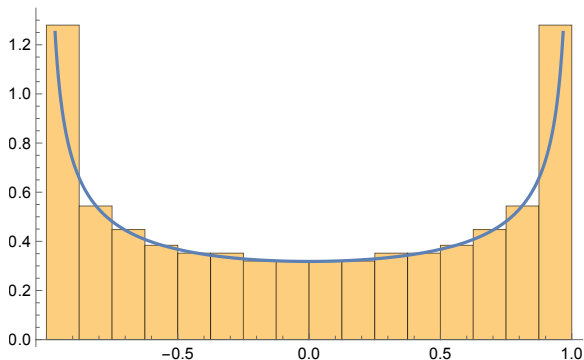
$$\mu^{\boxplus k}, \quad k = \frac{1}{1-t},$$

rescaled by a factor of  $1-t$ , for  $0 \leq t < 1$ .

- Results motivated by work of Steinerberger, 2019

## Example: Roots at $\pm 1$

- Take  $p(z) = (z - 1)^{N/2}(z + 1)^{N/2}$ ; i.e.  $\mu = \frac{1}{2}(\delta_1 + \delta_{-1})$
- Take  $t = 1/2$ —i.e., take  $N/2$  derivatives—so  $k = 2$
- Then  $\mu^{\boxplus k} = \mu \boxplus \mu$  can be computed explicitly
- After rescaling, get “arcsin” distribution  $d\mu_t(x) = \frac{1}{\pi} \frac{1}{\sqrt{1-x^2}} dx$



# PDE for the Cauchy transform

- Use **rescaled** measure  $(1 - t)\mu_t$  of mass  $1 - t$
- Let  $C(z, t)$  be Cauchy transform of  $(1 - t)\mu_t$
- Use PDE from Shlyakhtenko–Tao for Cauchy transform of  $\mu^{\boxplus k}$

## Theorem

*The Cauchy transform  $C(z, t)$  of  $(1 - t)\mu_t$  satisfies the PDE*

$$\frac{\partial C}{\partial t} = \frac{1}{C} \frac{\partial C}{\partial z}.$$

- Compare to  $\frac{\partial C}{\partial t} = -C \frac{\partial C}{\partial z}$  for backward heat flow

## POLYNOMIALS WITH COMPLEX ROOTS: HEAT FLOW

# Example: Characteristic polynomial of GUE

- Let  $p^N$  be char. poly. of GUE, zeros semicircular on  $[-2, 2]$
- Applying *backward* heat operator gives semicircular dist. on *bigger* interval (width  $4\sqrt{1+t}$ )
- What about **forward** heat operator

$$\exp \left\{ +\frac{t}{2N} \frac{d^2}{dz^2} \right\} p^N(z) ?$$

- Just change  $t$  to  $-t$  (semicircular on *smaller* interval)?

# Example: Characteristic polynomial of GUE

- Let's see!

## Example: Characteristic polynomial of GUE

- Conjecturally, zeros  $\rightarrow$  **uniform on ellipse** w/ semi-axes  $2 - t$  and  $t$
- At  $t = 1$ , zeros should become uniform on unit disk
- Heat flow changes “semicircular law” (s.c. on  $[-2, 2]$ ) to “circular law” (uniform on disk)!



# Cauchy transform for measures in plane

- Compactly supported prob. measure  $\mu$  with bounded density
- Define Cauchy transform as before:

$$C(z) = \int_{\mathbb{C}} \frac{1}{z-w} d\mu(w), \quad z \in \mathbb{C}$$

- But  $C$  will be **non-holomorphic** inside its support
- Ex:  $\mu$  uniform on unit disk:  $C(z) = \bar{z}$  in disk;  $1/z$  outside
- Recover density of measure  $\mu$  as

$$\frac{1}{\pi} \frac{\partial}{\partial \bar{z}} C(z)$$

# General conjecture

## Conjecture (Hall–Ho, 2022+)

Let  $\mu_\tau$  be limiting empirical measure of zeros of

$$\exp \left\{ -\frac{\tau}{2N} \frac{d^2}{dz^2} \right\} p^N(z).$$

Then Cauchy transform  $C(z, \tau)$  satisfies PDE

$$\frac{\partial C}{\partial \tau} = -C \frac{\partial C}{\partial z}. \quad (1)$$

- Here  $\tau$  is *complex* variable; derivatives are Cauchy–Riemann ops.

$$\frac{\partial}{\partial \tau} = \frac{1}{2} \left( \frac{\partial}{\partial \tau_1} - i \frac{\partial}{\partial \tau_2} \right); \quad \frac{\partial}{\partial z} = \frac{1}{2} \left( \frac{\partial}{\partial x} - i \frac{\partial}{\partial y} \right)$$

- **“Same” PDE** as in the real-rooted case!

# Heuristic argument for conjecture

- Define Cauchy transform of zeros of polynomial

$$C^N(z, \tau) := \frac{1}{N} \sum_{j=1}^N \frac{1}{z - z_j(\tau)}$$

where  $z_j(\tau)$  are zeros of heat-evolved polynomials

## Theorem

*The function  $C^N$  satisfies the PDE*

$$\frac{\partial C^N}{\partial \tau} = -C^N \frac{\partial C^N}{\partial z} - \frac{1}{2N} \frac{\partial^2 C^N}{\partial z^2},$$

*which **formally** converges to the PDE in the conjecture as  $N \rightarrow \infty$ .*

- But not so easy to make a rigorous argument from this!

# Example 1: Elliptic random matrix model

- Take  $X$  and  $Y$  be independent GUEs,  $\tau \in \mathbb{C}$  with  $|\tau| < 1$

- Take

$$Z = e^{i \arg(\tau)/2} \left( \sqrt{1 + |\tau|} X + i \sqrt{1 - |\tau|} Y \right)$$

- Eigenvalues uniform on ellipse with semi-axes  $\sqrt{1 \pm |\tau|}$ , rotated by  $\arg(\tau)/2$
- $\tau = 0$  gives circular law
- **Theorem:** Log potential  $S(z, \tau)$  of limiting e.v. distribution satisfies PDE in conjecture

# Example 1: Elliptic random matrix model

- Start with char. poly. of model with  $\tau = 0$  (circular law)
- Then evolve by heat flow for time  $t \in (0, 1)$
- **Conjecture says:** roots at time  $t$  should be uniform on ellipse with semi-axes  $1 + t$  and  $1 - t$
- And there are lots more similar examples from random matrix theory!

# Example 1: Elliptic random matrix model

## Example 2: Haar unitary plus elliptic

# Rigorous results for random polynomials

- **Kabluchko–Zaporozhets**: large class of random polynomials with independent coefficients

$$p^N(z) = \sum_{j=0}^N \tilde{\zeta}_j c_j^N z^j$$

- $\tilde{\zeta}_j$ : indep. and identically distributed random var.
- $c_j^N$  are deterministic constants (with nice behavior as  $N \rightarrow \infty$ )
- Limiting distribution of zeros is **rotationally invariant** on a disk
- Essentially **any** rot. invariant measure on disk occurs for some  $c_j^N$



# Example: Weyl polynomials

- Take

$$W_N(z) = \sum_{j=0}^N \zeta_j \frac{N^{j/2}}{\sqrt{j!}} z^j$$

- Limiting distribution of zeros **uniform on unit disk**
- **Circular law** for random polynomials!

## Theorem (Hall–Ho–Jalowy–Kabluchko, 2023+)

*The heat-evolved Kabluchko–Zaporozhets polynomials satisfy the Hall–Ho conjecture with probability one.*

*That is, the Cauchy transform of the limiting root distribution satisfies the claimed PDE, for sufficiently small  $\tau$ .*

# Evolution of zeros of Weyl polynomials, $0 \leq \tau \leq 1$

- Expect zeros to evolve in **straight lines** with constant velocity
- Velocity given by the value of Cauchy transform at time 0
- These are **characteristic curves** of the relevant PDE

## Theorem (Hall–Ho–Jalowy–Kabluchko, 2023+)

*This behavior holds “at the bulk level.” That is, for sufficiently small  $\tau$ , the measure  $\mu_\tau$  is the push-forward of  $\mu_0$  by map obtained by evolving along straight lines.*

# Straight-line motion

## POLYNOMIALS WITH COMPLEX ROOTS: REPEATED DIFFERENTIATION

# PDE for Cauchy transform

- Expect Cauchy transform to satisfy

$$\frac{\partial C}{\partial t} = \frac{1}{C} \frac{\partial C}{\partial z} + \frac{1}{\bar{C}} \frac{\partial \bar{C}}{\partial z}.$$

away from points where  $C = 0$

- Second term is present only because  $t$  is real
- “Essentially” same PDE as for real-rooted case
- Rigorous results for random polynomials

# Transport behavior for random polynomials

- For random polynomials, we establish **transport behavior** based on the following idea.

## Idea

Let  $\mu_0$  be the (radial) limiting root distribution of the initial polynomials and let  $m_0(z)$  be its Cauchy transform. Then under repeated differentiation, roots evolve approximately **radially with constant speed** according to

$$z(t) \approx z_0 - \frac{t}{m_0(z_0)}$$

until they reach the origin, at which point they die.



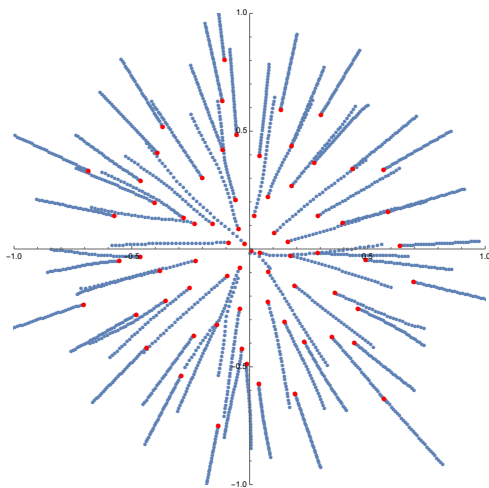
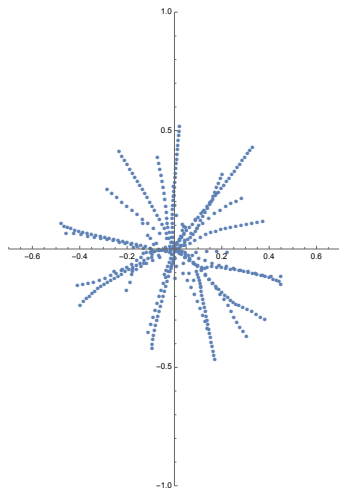
# Transport behavior for random polynomials

- We verify this idea rigorously at bulk level

## Theorem (Hall–Ho–Jalowy–Kabluchko, 2023+)

*The limiting root distribution  $\mu_t$  of  $\lfloor Nt \rfloor$ -th derivative is the push-forward of  $\mu_0$  under a transport map constructed according to the idea in the previous slide.*

# Transport behavior for random polynomials



# Comparing to predicted straight-line motion

# Examples from random matrix theory

- Look at limiting root distribution of  $P^N(z^2)$
- I.e. take square roots (with both signs) of roots of  $P^N(z)$
- Take bi-unitarily invariant (“radial”) random matrix  $Z^N$
- Match e.v.’s of  $Z^N$  to roots of  $P^N$  as  $N \rightarrow \infty$

## Theorem (Campbell–O’Rourke–Renfrew)

As  $N \rightarrow \infty$ , roots of  $\lfloor Nt \rfloor$ -th derivative of  $P^N$ , evaluated at  $z^2$ , match e.v.s of **truncation** of  $Z^N$  to size  $\lfloor N(1-t) \rfloor$

- Equivalent to **fractional free convolution**

# Examples from random matrix theory

- E.g.  $P^N$  are “exponential polynomials”;  $Z^N$  is Ginibre
- Initial roots/e.v.’s are uniform on unit disk
- At time  $t$ , both give uniform measure on disk of radius  $\sqrt{1-t}$

# Plot of roots of $P^N(z^2)$

# Plot of truncated Ginibre matrix

THANK YOU FOR YOUR ATTENTION