#### Roots of random polynomials under differential flows

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> ICERM, August 2025 Random Polynomials and their Applications



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#### Basic question

- 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

#### PART 1

# POLYNOMIALS WITH ALL REAL ROOTS: HEAT FLOW



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#### Heat flow: definition

Solve heat equation on real line:

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

with polynomial initial condition:

$$u(x,0)=p(x).$$

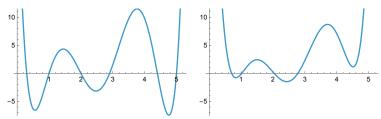
• Can solve as terminating power series in t:

$$u(x,t) = e^{\frac{t}{2}\frac{d^2}{dx^2}}p(x) := \sum_{k=0}^{\infty} \frac{1}{k!} \left(\frac{t}{2}\right)^k \left(\frac{d^2}{dx^2}\right)^k p(x)$$

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#### Heat flow: definition

- Solution is polynomial in x (same degree as p) for each t
- Roots at time t may be complex, even if roots of p are real
- Extend to complex plane to find roots



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#### Heat flow: definition

- Extend initial condition, solution holomorphically in space variable
- Makes sense with t replaced by **arbitrary complex number**  $\tau$
- For high-degree limit, scale  $\tau$  with N
- Define heat flow operator as terminating power series:

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

# 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

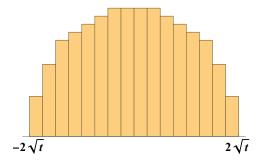
$$\exp\left\{-\frac{t}{2N}\frac{d^2}{dz^2}\right\}p(z)$$

for all t > 0.

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## 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



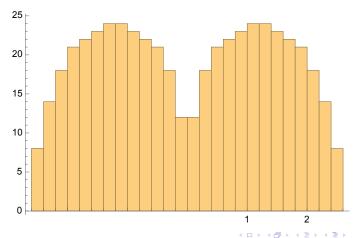
ullet Zeros have asymptotically **semicircular shape** on  $[-2\sqrt{t},2\sqrt{t}]$ 

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# Backward heat operator: second example

- Take  $p(z) = (z-1)^{N/2}(z+1)^{N/2}$
- ullet 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



## Connection to random matrix theory

- GUE: Gaussian unitary ensemble
- Take N × 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
- ullet Eigenvalues asymptotically have **semicircular distribution** on [-2,2]

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# Connection to random matrix theory

- Take sequence of real-rooted polynomials  $p^N$  of degree N
- ullet Assume root distribution converges to prob. measure  $\mu$
- Make **Hermitian matrix**  $X^N$  (e.g., diagonal) with eigenvalues equal to roots of  $p^N$
- Take  $Y^N$  to be GUE matrix

#### Claim

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

• So: backward heat flow is like adding a GUE

#### Free convolution with semicircular distribution

#### Theorem (Voit-Woerner 2022, Kabluchko 2025)

If polynomials  $p^N$  has real roots and the distribution of roots converges as  $N \to \infty$  to  $\mu$ , then the distribution of roots of  $\mathrm{e}^{-\frac{t}{2N}\frac{d^2}{dz^2}}p^N$  converges to  $\mu \boxplus \mathrm{sc}_t$ .

- $\mu \boxplus \operatorname{sc}_t$  is **free convolution**  $\boxplus$  of  $\mu$  with semicircular measure of variance t
- Free convolution with sct was studied by Biane

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#### A PDE perspective

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

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

- Holomorphic on upper half-plane
- ullet Can recover  $\mu$  from  $\mathcal{C}_{\mu}$  by Stieltjes inversion formula

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

#### A PDE perspective

#### Theorem (Voiculescu)

Cauchy transform C(z,t) of  $\mu \boxplus \operatorname{sc}_t$  satisfies the "inviscid complex Burger's equation"

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

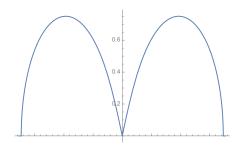
- Can solve PDE using the method of characteristics
- Gives semi-explicit way to compute  $\mu \boxplus \operatorname{sc}_t$



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#### Roots at $\pm 1$

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



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

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# POLYNOMIALS WITH COMPLEX ROOTS: HEAT FLOW



# Cauchy transform for measures in plane

- ullet 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
- ullet Recover density of measure  $\mu$  as

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

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### General conjecture

#### Conjecture (Hall-Ho, 2025)

Let  $\mu_t$  be limiting empirical measure of zeros of

$$\exp\left\{-rac{t}{2N}rac{d^2}{dz^2}
ight\}p^N(z),\quad t\in\mathbb{R}.$$

Then Cauchy transform C(z, t) satisfies PDE

$$\frac{\partial C}{\partial t} = -C \frac{\partial C}{\partial z} - \bar{C} \frac{\partial \bar{C}}{\partial z} \quad (t \text{ small}). \tag{1}$$

- $\partial/\partial z$  means the Cauchy–Riemann operator
- Second term on RHS vanishes in region where C is holomorphic
- Essentially same PDE as in the real-rooted case!

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## Heuristic argument for conjecture

Define Cauchy transform of zeros of polynomial

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

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

#### Theorem

The function  $C^N$  satisfies the PDE

$$\frac{\partial C^{N}}{\partial t} = -C^{N} \frac{\partial C^{N}}{\partial z} - \bar{C}^{N} \frac{\partial \bar{C}^{N}}{\partial z} - \frac{1}{2N} \left( \frac{\partial^{2} C^{N}}{\partial z^{2}} + \frac{\partial^{2} \bar{C}^{N}}{\partial z \partial \bar{z}} \right),$$

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

## Connection to "arbitrary plus elliptic" RM model

- Let X and Y be independent GUEs and t with -1 < t < 1
- Take

$$Z_t = \frac{1}{\sqrt{2}} \left( \sqrt{1+t} \ X + i \sqrt{1-t} \ Y \right)$$

- ullet Eigenvalues uniform on ellipse with semi-axes  $1\pm t$
- t = 0 gives circular law
- **Model**:  $X_0 + Z_t$  where  $X_0$  is indep. of  $Z_t$

#### Theorem (Hall–Ho)

Cauchy transform C(z, t) of limiting e.v. distribution of  $X_0 + Z_t$  satisfies PDE in conjecture.

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#### Example: Circular to elliptic

- Theorem provides natural examples for conjecture
- Start from char. poly.  $p^N$  of model with parameter  $t_0$
- Conjecture says: roots of  $e^{-\frac{t}{2N}\frac{d^2}{dz^2}}p^N$  should resemble e.v. of model with parameter  $t+t_0$
- Running heat flow should be "same" as changing value of t



#### Example: Characteristic polynomial of Ginibre matrix

- **Example**: Start from  $Z_0$ : model with  $X_0 = 0$  and  $t_0 = 0$
- $Z_0$  is Ginibre matrix, eigenvalues uniform on disk
- ullet Heat-evolved char. poly. of  $Z_0$  should resemble char. poly. of  $Z_t$
- Roots of heat-evolved char. poly. of  $Z_0$  should be uniform on ellipse

## Example: Characteristic polynomial of Ginibre matrix

### Rigorous results for random polynomials

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

$$p^{N}(z) = \sum_{j=0}^{N} \xi_{j} c_{j}^{N} z^{j}$$

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

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### Example: Weyl polynomials

Take

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

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

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### Rigorous results for random polynomials

#### Theorem (Hall-Ho-Jalowy-Kabluchko, 2023a)

The heat-evolved Kabluchko–Zaporozhets polynomials satisfy the Hall–Ho conjecture.

That is, the Cauchy transform of the limiting root distribution satisfies the claimed PDE, for sufficiently small t.

#### Example: Weyl case

- For -1 < t < 1, limiting root distribution of heat-evolved Weyl polynomial is **uniform on ellipse** with semi-axes 1 + t and 1 t
- For  $t \geq 1$ , limiting root dist. is **semicircular on**  $\mathbb R$  with variance t
- Case t = 1 is "random orthogonal polynomial" with Gaussian weight, matches result of Pritsker–Xie [2015]

## Evolution of zeros of Weyl polynomials, $0 \le t \le 1$



#### Transport behavior

- **Next question**: How do zeros move with *t*?
- Zeros should evolve approximately 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, 2023a)

This behavior holds "at the bulk level" for heat-evolved KZ polynomials. That is, for sufficiently small t, the measure  $\mu_t$  is the push-forward of  $\mu_0$  by map obtained by evolving along straight lines.

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## Straight-line motion

- Motion of sample of zeros of Weyl polynomial under heat flow
- Plotted against predicted straight-line motion



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# 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,  $0 \le t < 1$
- Number of deriv. proportional to N
- Roots remain real!
- Assume root dist. of  $P^N$  converges to  $\mu_0$
- Try to find limiting root dist.  $\mu_t$  of  $\lfloor Nt \rfloor$ -th derivative

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## Connection to random matrix theory

- Assume (at first) that t = 1 1/k with  $k \in \mathbb{N}$
- Then  $\mu_t = \mu_0^{\boxplus k} := \mu_0 \boxplus \cdots \boxplus \mu_0$ , rescaled by a factor of 1-t
- $\mu_0^{\boxplus k}$  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" introduced by Bercovici–Voiculescu  $(k\gg 1)$  and Nica–Speicher  $(k\geq 1)$
- Equivalently: take corner of size  $\lfloor (1-t)N \rfloor$  of  $N \times N$  matrix with e.v. distribution  $\mu$

## Connection to random matrix theory

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

If polynomials  $P^N$  have limiting root distribution  $\mu_0$  then  $\lfloor Nt \rfloor$ -th derivative of  $P^N$  has limiting root distribution equal to

$$\mu_0^{\boxplus k}$$
,  $k = \frac{1}{1-t}$ ,

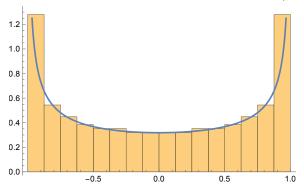
rescaled by a factor of 1 - t, for  $0 \le t < 1$ .

• Results motivated by work of Steinerberger, 2019

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#### Example: Roots at $\pm 1$

- Take  $P^N(z) = (z-1)^{N/2}(z+1)^{N/2}$ ; i.e.  $\mu_0 = \frac{1}{2}(\delta_1 + \delta_{-1})$
- Take t = 1/2—i.e., take N/2 derivatives—so k = 2
- Then  $\mu_0^{\boxplus k} = \mu_0 \boxplus \mu_0$  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
- ullet Let C(z,t) be Cauchy transform of  $(1-t)\mu_t$
- ullet Use PDE for Cauchy transform of  $\mu^{\boxplus k}$  by Shlyakhtenko–Tao

#### 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  $\frac{\partial \mathcal{C}}{\partial t} = -\mathcal{C} \frac{\partial \mathcal{C}}{\partial z}$  for backward heat flow

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# POLYNOMIALS WITH COMPLEX ROOTS: REPEATED DIFFERENTIATION



### Repeated differentiation of random polynomials

- First observation: derivative of polynomial with independent (not necessarily i.i.d.) coefficients still has independent coefficients
- Feng and Yao showed that repeated differentiation of Kabluchko-Zaporozhets polynomial gives another KZ polynomial, with computable change in the deterministic coefficients

### Transport behavior for random polynomials

- Next question: How do the roots evolve with t?
- Answer must recognize that differentiation kills roots!

#### 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.

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## Rigorous result at bulk level

- We verify idea at the level of the bulk distribution
- Let  $\mu_t$  be the limiting root distribution of  $P_t^N$ .

#### Theorem (Hall-Ho-Jalowy-Kabluchko, 2023b)

- Restrict  $\mu_0$  to the outer annulus with mass 1-t. I.e., remove inner disk with mass t.
- 2 After normalization,  $\mu_t$  is the push-forward of  $\mu_0$  restricted to this annulus by the map

$$T_t(z) = z \left( 1 - \frac{t}{\alpha_0(|z|)} \right)$$

where  $\alpha_0(|z|) = \mu_0(B(0,|z|))$ .

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#### Example for Weyl case

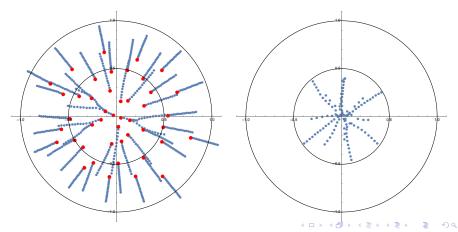
- Example: Repeated differentiation of Weyl polynomial
- $T_t(z) = z \left( 1 \frac{t}{|z|^2} \right)$
- N = 60, t = 1/4. Showing roots of all derivatives up to the 15th derivative



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# Example for Weyl case

- Red dots: roots of 15th derivative
- Blue dots: roots of all previous derivatives
- Left: roots in annulus survive to time t
- Right: roots in disk die before time t



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#### Further results

- PDE for Cauchy transform
- Random matrix interpretation (Campbell–O'Rourke–Renfrew) in terms of fractional convolution of *R*-diagonal operators
- Both similar to the case of real roots

#### Conclusion

#### THANK YOU FOR YOUR ATTENTION

