# Laplacian Growth and Random Matrices 

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## Acknowledgments

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Area law: $t_{0}=r^{2}-\sum_{k} k\left|u_{k}\right|^{2}$

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- Complex curve $f(z, \zeta)=0, \Gamma: \zeta=\bar{z}$ - Schottky double


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- Continuum limit $=$ Laplacian Growth variational formulation

Resolving finite-time singularities of Hele-Shaw flows (Saffman, Taylor, Sakai, Kadanoff, Bensimon, Howison, King, Tanveer, Crowdy, ...)

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## How to make a boundary cusp

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Actually, ... interior branch point $w^{\prime}(z) \rightarrow \infty$ meets exterior double point $S_{1}(z)=S_{2}(z)$


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- Both: Tanveer, Crowdy
- Often dynamics remains under-determined

Resolving singular hydrodynamics: stochastic model

The plan
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Problem: find the equivalent of Rankine-Hugoniot and Lax-Oleinik conditions for Laplacian Growth dynamics in a weak sense, from stochastic (RMT) formulation.

Normal matrix model and biorthogonal polynomials

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Projected on orthogonal functions $\psi_{n}(z)=P_{n}(z) e^{N V(z)}$, operator identity

$$
\left\langle\psi_{n}\right| \bar{z}\left|\psi_{m}\right\rangle=\left\langle\psi_{n}\right| N^{-1} \partial_{z}\left|\psi_{m}\right\rangle
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## Normal matrix model and biorthogonal polynomials

Proper measures - biorthogonal polynomials

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\int P_{n}(z) \overline{P_{m}(z)} e^{-N\left[|z|^{2}-V(z)-\overline{V(z)}\right]} \mathrm{d}^{2} z \sim \delta_{n m}
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Projected on orthogonal functions $\psi_{n}(z)=P_{n}(z) e^{N V(z)}$, operator identity

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\left\langle\psi_{n}\right| \bar{z}\left|\psi_{m}\right\rangle=\left\langle\psi_{n}\right| N^{-1} \partial_{z}\left|\psi_{m}\right\rangle
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Equivalent to spectral theory of Putinar and Gustafsson.

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- Distribution of zeros of polynomials (branch cut of Schwarz function): $z \in\left[-a_{n}, a_{n}\right], a_{n}=\sqrt{2\left|t_{2}\right| r_{n} r_{n+1}}$


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- Large $N$ limit - becomes continuous growth law

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Boundary singularities from orthogonal wavefunctions

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\Re \oint y(z, N) \mathrm{d} z=0 .
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## Cusps and horns, shocks and Stokes

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