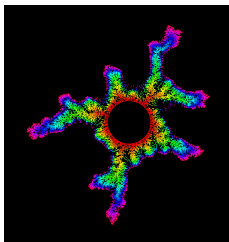


Scaling Limits of Random Growth Models

Amanda Turner
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University of Leeds, UK



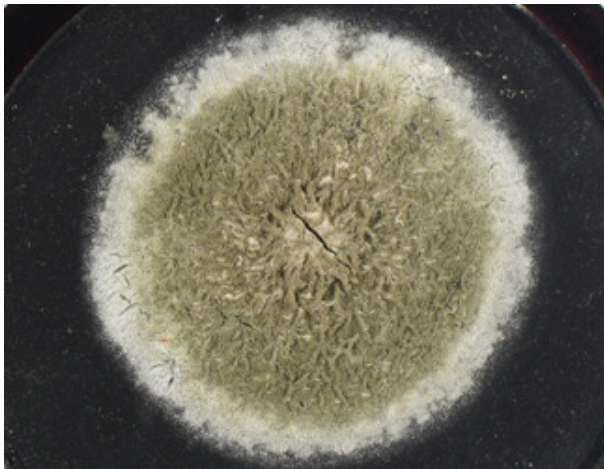
Biological growth



Photo by James Wearn



Biological growth



Gift by Sir Alexander Fleming to Edinburgh [University Library, Scotland](#)



Mineral deposition

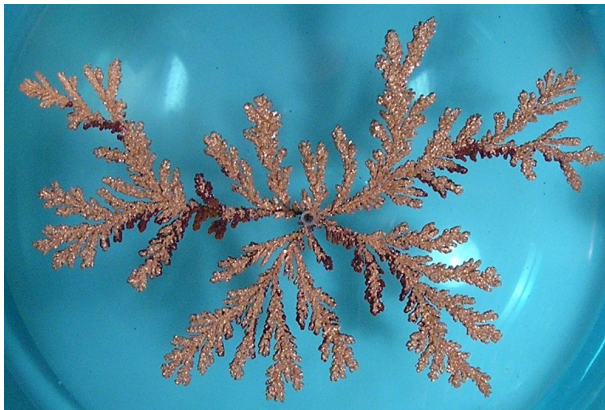


Photo by Kevin R Johnson

Mineral deposition



Photo by Alan Dickinson



Dendrite Growth in a Lithium Battery

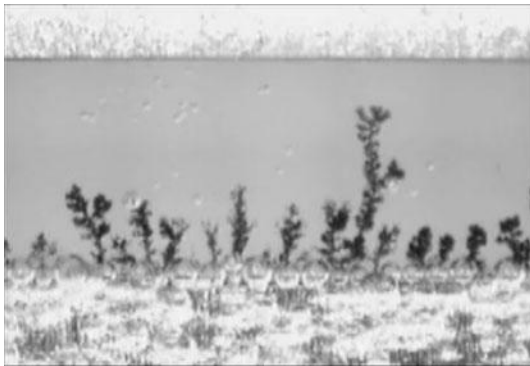


Photo by Neil Dasgupta

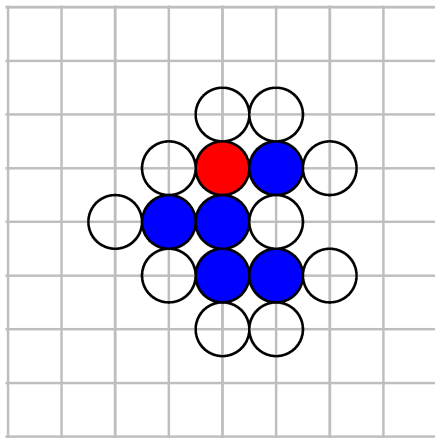
Lightning strikes



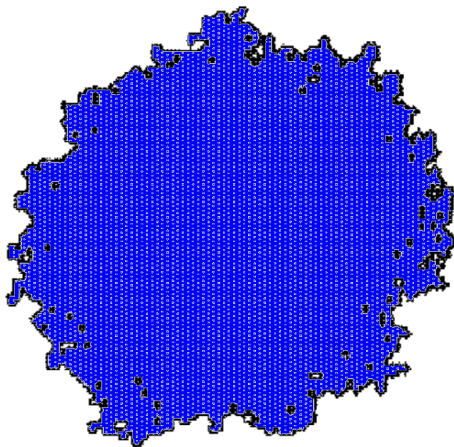
From "Lichtenberg Figures Due to a Lightning Strike" by Yves Domart, MD, and Emmanuel Garet, MD



Lattice models for random growth



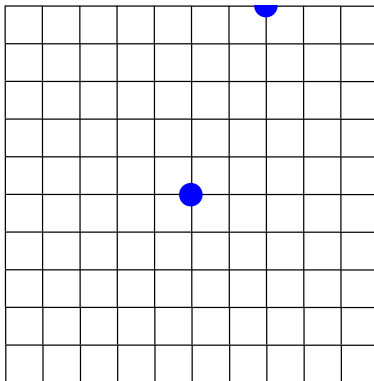
Eden cluster with 1,500 particles



Simulation by H.J. Herrmann

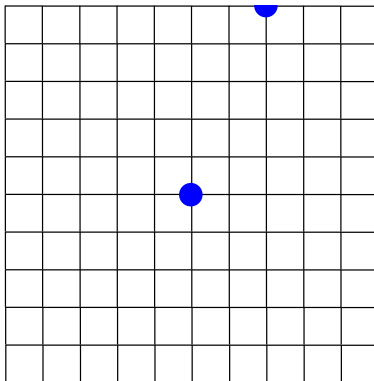


Diffusion-limited aggregation (DLA) model for mineral deposition



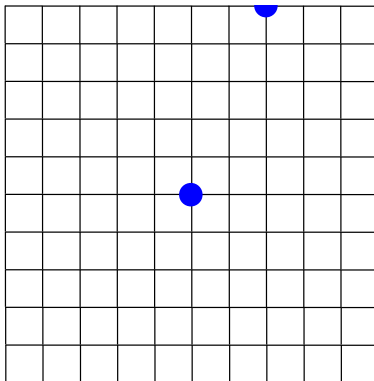
Simulation by Eviatar Procaccia

Diffusion-limited aggregation (DLA) model for mineral deposition



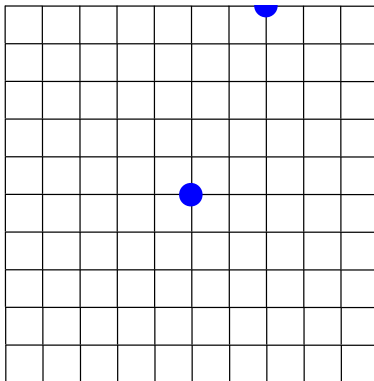
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Diffusion-limited aggregation (DLA) model for mineral deposition



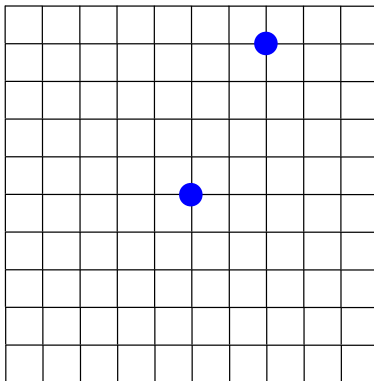
Simulation by Eviatar Procaccia

Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia

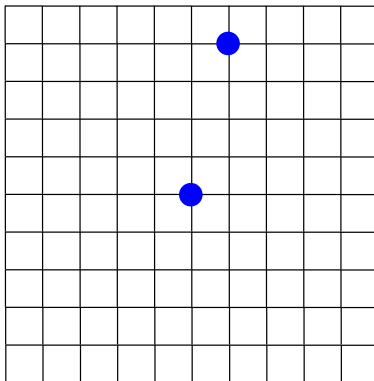
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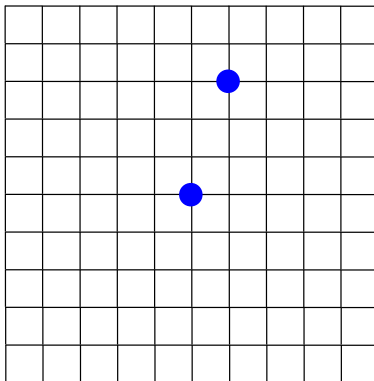
Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia



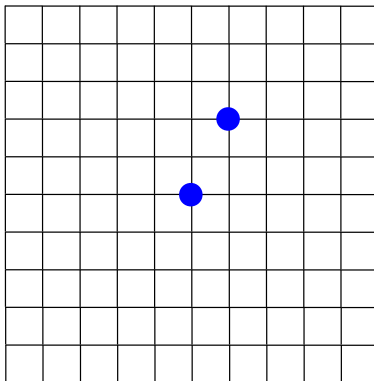
Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia



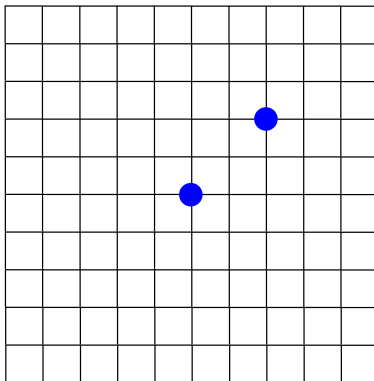
Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia



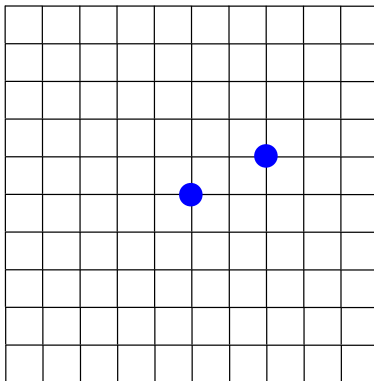
Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia



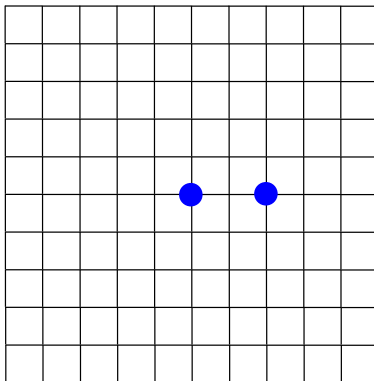
Diffusion-limited aggregation (DLA) model for mineral deposition



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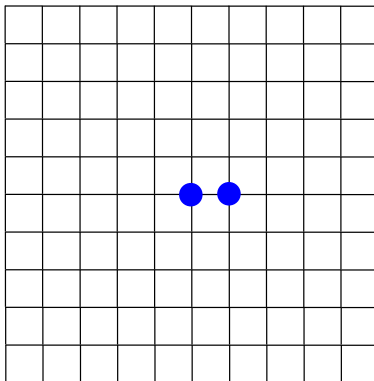
Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia



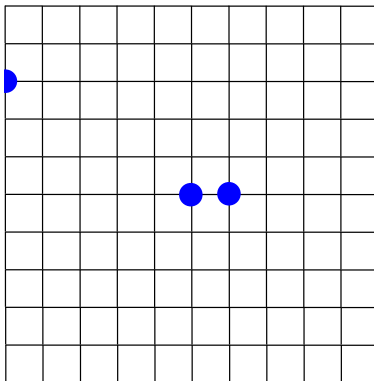
Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia

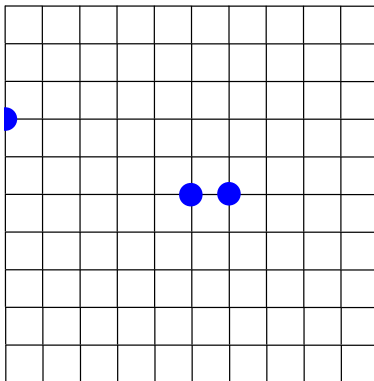


Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia

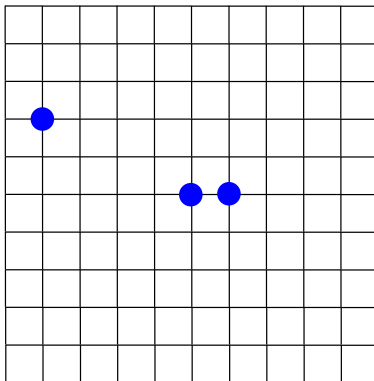
Diffusion-limited aggregation (DLA) model for mineral deposition



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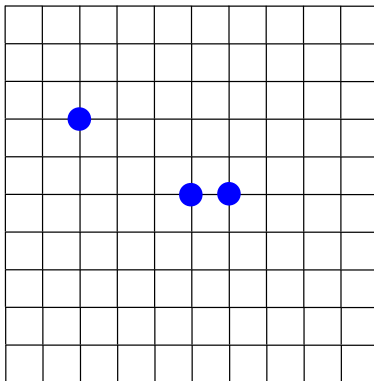


Diffusion-limited aggregation (DLA) model for mineral deposition



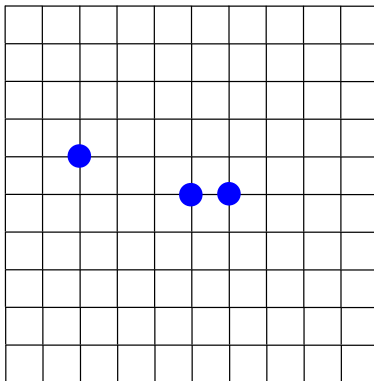
Simulation by Eviatar Procaccia

Diffusion-limited aggregation (DLA) model for mineral deposition



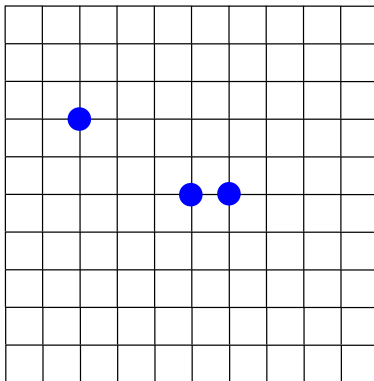
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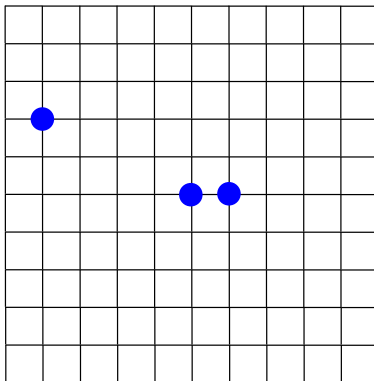
Simulation by Eviatar Procaccia

Diffusion-limited aggregation (DLA) model for mineral deposition



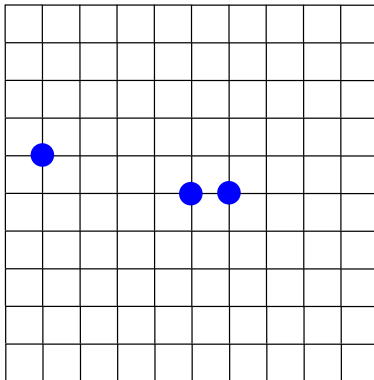
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Diffusion-limited aggregation (DLA) model for mineral deposition



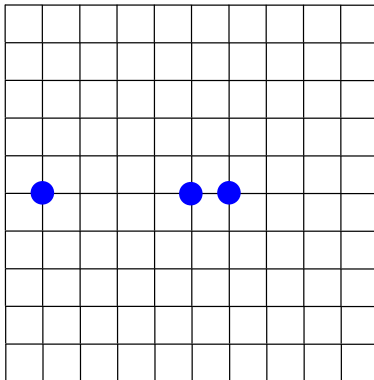
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Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia

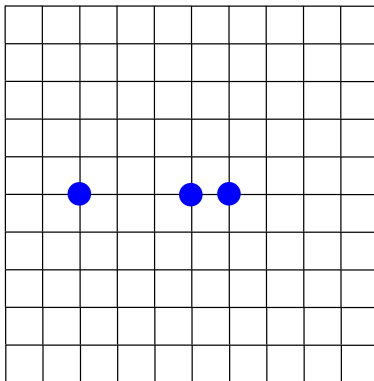
Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia

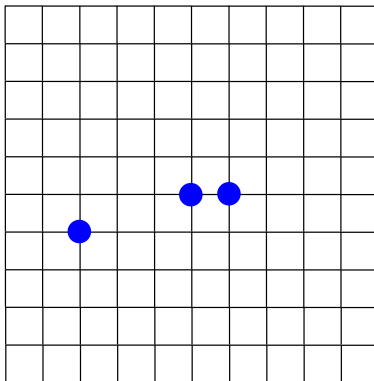


Diffusion-limited aggregation (DLA) model for mineral deposition



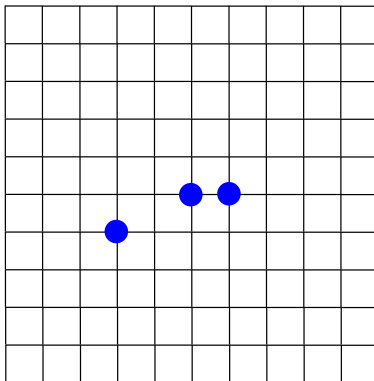
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Diffusion-limited aggregation (DLA) model for mineral deposition



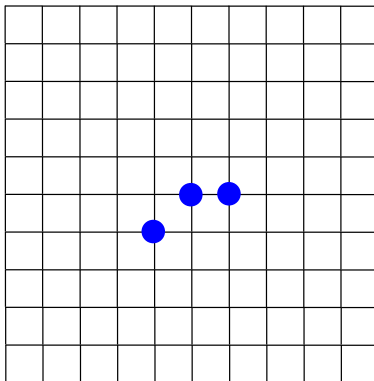
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Diffusion-limited aggregation (DLA) model for mineral deposition



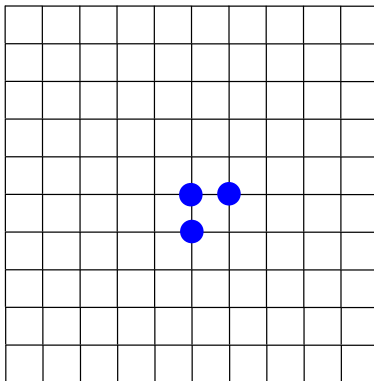
Simulation by Eviatar Procaccia

Diffusion-limited aggregation (DLA) model for mineral deposition



Simulation by Eviatar Procaccia

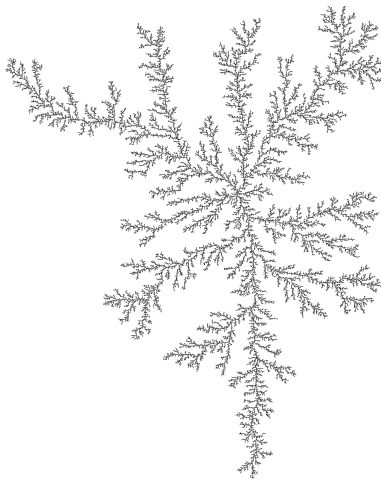
Diffusion-limited aggregation (DLA) model for mineral deposition



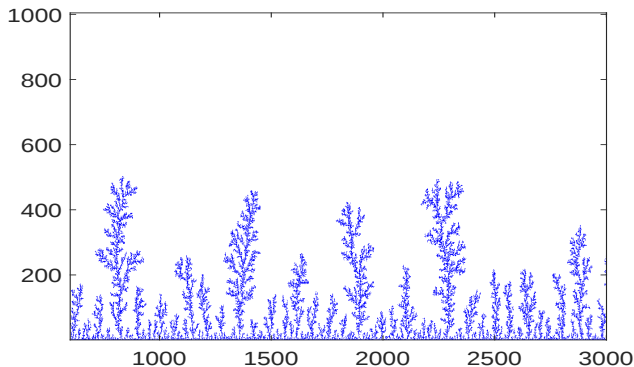
Simulation by Eviatar Procaccia



DLA cluster with 2,000 particles



Stationary DLA



Simulation by Eviatar Procaccia



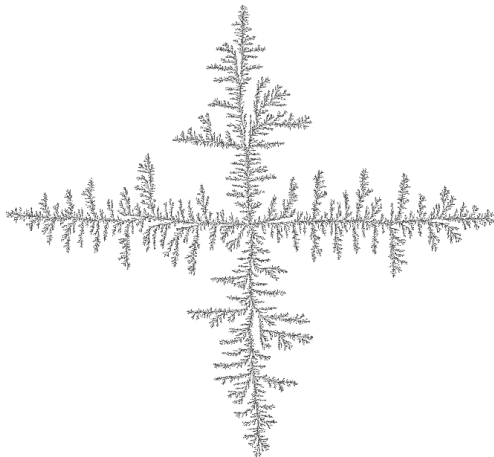
Other lattice models for random growth

- Dielectric breakdown models (DBM)
- Internal diffusion-limited aggregation (IDLA)
- First passage percolation (FPP)
- Interface models: ballistic deposition, corner growth model, etc.

What do we know about lattice models for random growth?

- **Not much!**
- DLA first formulated in 1981 by Witten and Sander.
- Original paper has almost 7,000 citations.
- Only one rigorous result in over 40 years: At time t DLA is contained in a ball of radius $t^{2/3}$ (Kesten, 1987).
- No proof (or even convincing explanation) that DLA does not converge to a ball.
- Main open problems:
 - Existence of universal limit.
 - Growth rate of the cluster.
 - Structure of the limiting set (e.g. fractal dimension).
 - Number of arms.

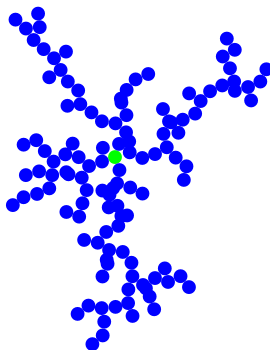
DLA cluster with 145,199,976 particles



Simulation by B.Grebenkov and D.Beliaev



Off-lattice DLA



Ball shaped particles perform BM (from infinity) until they attach to the aggregate.

Harmonic measure

- The attachment point is distributed according to harmonic measure on the cluster boundary (from infinity).
- By conformal invariance of BM, harmonic measure is conformally invariant.
- An algorithm for sampling a boundary point of a set A :
Let D_0 denote the exterior unit disk in the complex plane $\mathbb{C}$ and let $\Phi : D_0 \rightarrow A^c$ be conformal. Choose a point $y \in \partial D_0$ uniformly. Then take $\Phi(y)$.
- But how do you find Φ ?

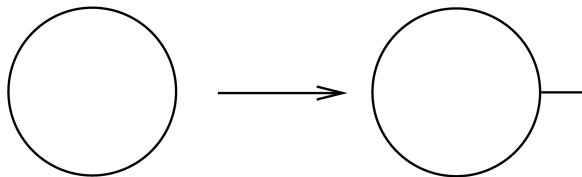
Conformal mapping representation of a slit-shaped particle

Let P denote the slit $[1, 1 + \delta]$ in the complex plane.

There exists a unique conformal mapping $F : D_0 \rightarrow D_0 \setminus P$ that fixes ∞ in the sense that

$$F(z) = e^c z + O(1) \quad \text{as } |z| \rightarrow \infty,$$

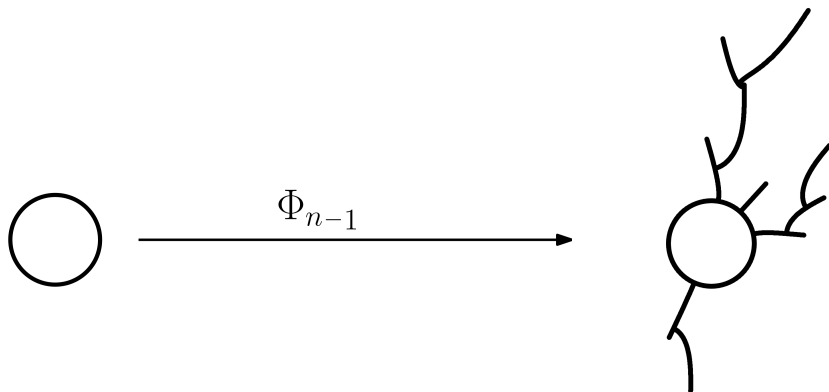
for some $c > 0$, the (log of the) capacity, which satisfies $e^c = 1 + \frac{\delta^2}{4(1+\delta)}$.



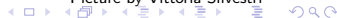
Conformal mapping representation of a cluster

- Suppose $P_1, P_2, \dots$ is a sequence of particles, where P_n has capacity c_n (or length δ_n) and attachment angle Θ_n , $n = 1, 2, \dots$. Let F_n be the particle map corresponding to P_n .
 - Set $\Phi_0(z) = z$.
 - Recursively define $\Phi_n(z) = \Phi_{n-1} \circ F_n(z)$, for $n = 1, 2, \dots$.
- This generates a sequence of conformal maps $\Phi_n : D_0 \rightarrow K_n^c$, where $K_{n-1} \subset K_n$ are growing compact sets, which we call clusters.

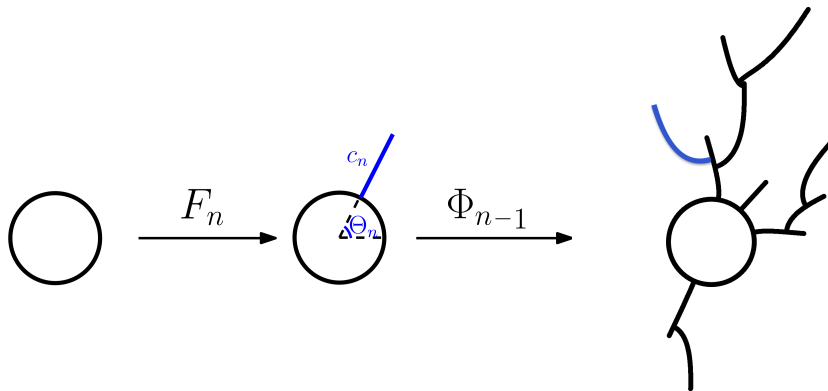
Cluster formed by iteratively composing mappings



Picture by Vittoria Silvestri



Cluster formed by iteratively composing mappings



$$\Phi_n = \Phi_{n-1} \circ F_n = F_1 \circ F_2 \circ \cdots \circ F_n$$

Parameter choices for physical models

- By varying the sequences $\{\Theta_n\}$ and $\{c_n\}$, it is possible to describe a wide class of growth models.
- For biological growth (Eden model)

$$\mathbb{P}(\Theta_n \in (a, b)) \propto \int_a^b |\Phi'_{n-1}(e^{i\theta})| d\theta$$

and

$$c_n \approx c |\Phi'_{n-1}(e^{i\Theta_n})|^{-2}$$

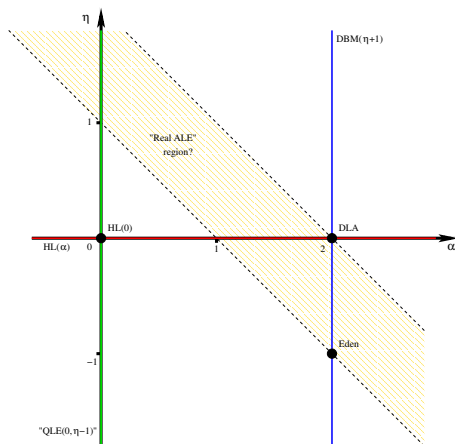
- For DLA, c_n is as above and

$$\mathbb{P}(\Theta_n \in (a, b)) = \mathbb{P}(\Phi_{n-1}^{-1}(B_\tau) \in (a, b)) \propto (b - a)$$

where B_t is Brownian motion started from ∞ and τ is the hitting time of the cluster K_{n-1} .

Aggregate Loewner Evolution, $ALE(\alpha, \eta, \sigma)$

- Θ_n distributed $\propto |\Phi'_{n-1}(e^{\sigma+i\theta})|^{-\eta} d\theta$; $c_n = c |\Phi'_{n-1}(e^{\sigma+i\Theta_n})|^{-\alpha}$.



Regularization for ALE

- Even after the arrival of a single slit particle, the map $\theta \mapsto |\Phi'_n(e^{i\theta})|$ is badly behaved and takes the values 0 and ∞ .
- For some values of η ,

$$\int_{-\pi}^{\pi} |\Phi'_{n-1}(e^{i\theta})|^{-\eta} d\theta = \infty,$$

so regularization is necessary to even define the measure.

- A solution is to let Θ_n have distribution

$$\propto |\Phi'_{n-1}(e^{\sigma+i\theta})|^{-\eta} d\theta$$

for $\sigma > 0$ and take the limit $\sigma \rightarrow 0$.

- Models are very sensitive to the rate at which $\sigma \rightarrow 0$. Can be argued that $\sigma \sim c^{1/2}$ is natural from a physical point of view.

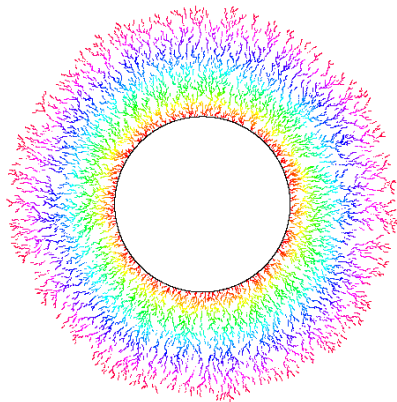
Phase transition

Open Problem:

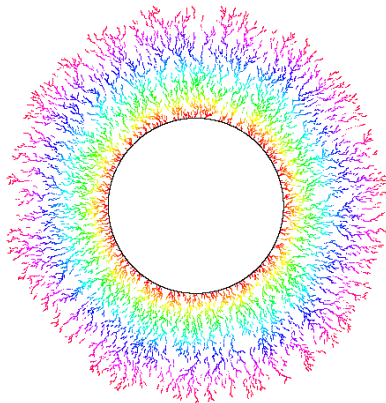
Does $\text{ALE}(\alpha, \eta, \sigma)$ exhibit a phase transition from disks to non-disks along the line $\alpha + \eta = 1$ (for 'broad' choices of the regularization parameter σ)?

- Longstanding conjectures:
 - $\text{HL}(\alpha)$ has a phase transition at $\alpha = 1$.
 - $\text{DBM}(\eta)$ has a phase transition at $\eta = 0$.

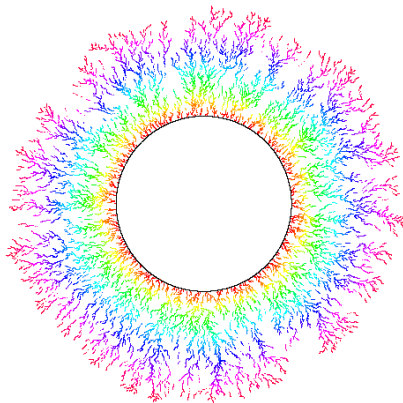
ALE(0,0) cluster with 8,000 particles for $c = 10^{-4}$



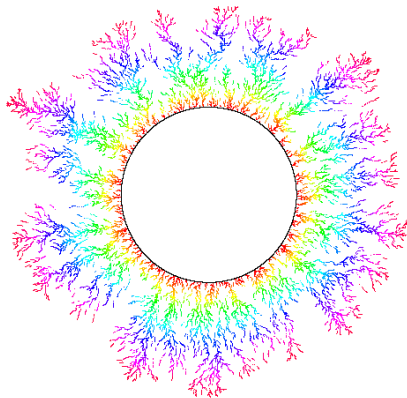
ALE(0,0.5,0.02) cluster with 8,000 particles for $c = 10^{-4}$



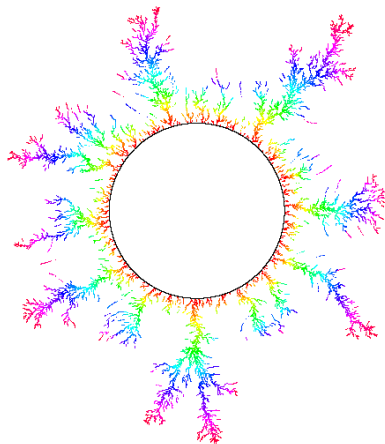
ALE(0,1,0.02) cluster with 8,000 particles for $c = 10^{-4}$



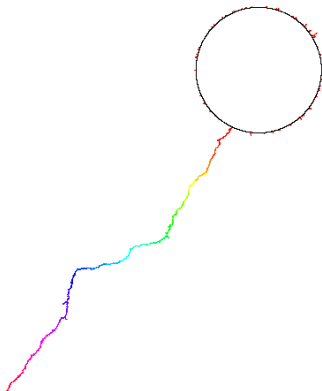
ALE(0,1.5,0.02) cluster with 8,000 particles for $c = 10^{-4}$



ALE(0,2,0.02) cluster with 8,000 particles for $c = 10^{-4}$



ALE(0,5,0.02) cluster with 8,000 particles for $c = 10^{-4}$



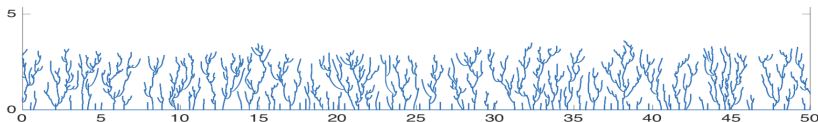
Previous results: HL(0)

Much of the previous work relates to HL(0) as particle maps are i.i.d. so the model is mathematically the most tractable.

- Norris and Turner (2012):
 - small-particle scaling limit of HL(0) is a growing disk:
 $\Phi_n(z) \approx e^{cn} z$
 - branching structure is related to the Brownian web
 - expected size of the n^{th} particle is roughly $\delta \exp cn$, so HL(0) is “unphysical”.
- Silvestri (2017): fluctuations converge to a log-correlated Fractional Gaussian Field.

HL(0)-like model variants

- Sola, Turner, Viklund (2012): Anisotropic HL(0)
- Berestycki and Silvestri (2021): Constrained HL(0)
- Berger, Turner, Procaccia (2021): Stationary HL(0)



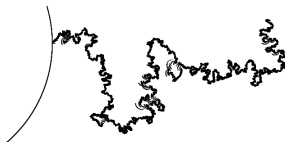
HL(α) for $\alpha \neq 0$

All results for HL(α) with $\alpha \neq 0$ require some kind of regularization.

- Rohde and Zinsmeister (2005) obtained estimates on the dimension of scaling limits for a regularized version of HL(α).
- Sola, T., Viklund (2015) showed small-particle scaling limit of regularized HL(α) is a growing disk for all α provided regularization parameter σ is large enough.
- Liddle and T. (2021) obtained disk-limits and fluctuation results for HL(α) under capacity rescaling, regularized at ∞ , when $\alpha \in (0, 2)$.

ALE family in the singular regime

- Sola, T., Viklund (2019) showed scaling limit of $\text{ALE}(\alpha, \eta, \sigma)$ is a single slit if $\alpha \geq 0$ and $\eta > 1$ when using slit particles, provided σ is very small.
- Higgs (2021) showed scaling limit of $\text{ALE}(0, \eta, \sigma)$ converges to a SLE_4 for $\eta < -2$ when using slit particles, provided σ is very small. Other SLE_κ 's with $\kappa > 4$ can be obtained by using different particle shapes.



ALE family in the disk-regime

Norris, Turner, Silvestri (2022 and 2024)

- **Scaling limit:** For all $\alpha + \eta \leq 1$, provided $\sigma \gg c^{1/2}$ as $c \rightarrow 0$ ($\sigma \gg c^{1/3}$ when $\alpha + \eta = 1$),

$$\Phi_n(z) \approx (1 + \alpha cn)^{1/\alpha} z.$$

- **Fluctuations:** Set

$\mathcal{F}_n^{(c)}(z) = c^{-1/2} ((1 + \alpha cn)^{-1/\alpha} \Phi_n(z) - z)$. Then

$\mathcal{F}_{\lfloor t/c \rfloor}^{(c)}(z) \rightarrow \mathcal{F}_t(z)$ where

$$\dot{\mathcal{F}}_t(z) = \frac{1}{1 + \alpha t} \left((1 - (\alpha + \eta)) z \mathcal{F}'_t(z) - \mathcal{F}_t(z) + \sqrt{2} \xi_t(z) \right).$$

Here $\xi_t(z)$ is complex space-time white noise on the circle, analytically continued to the exterior unit disk.

Fluctuations for $ALE(\alpha, \eta, \sigma)$ when $\alpha + \eta \leq 1$

Specifically

$$\mathcal{F}_t(z) = \sum_{m=0}^{\infty} (A_t^m + iB_t^m) z^{-m}$$

where

$$dA_t^m = -\frac{(m(1-\alpha-\eta)+1)A_t^m}{1+\alpha t}dt + \frac{\sqrt{2}}{1+\alpha t}d\beta_t^m$$

$$dB_t^m = -\frac{(m(1-\alpha-\eta)+1)B_t^m}{1+\alpha t}dt + \frac{\sqrt{2}}{1+\alpha t}d\beta_t'^m.$$

Here $\beta_t^m, \beta_t'^m$ are i.i.d. Brownian motions for $m = 0, 1, \dots$, so

$$A_t^m, B_t^m \sim \mathcal{N}\left(0, \frac{1 - e^{-2(m(1-\alpha-\eta)+1)\tau_t}}{m(1-\alpha-\eta)+1}\right).$$

Remarks

- The map $z \mapsto \mathcal{F}_t(z)$ is determined (by analytic extension) by the boundary process $\theta \mapsto \mathcal{F}_t(e^{i\theta})$.
- When $\alpha = \eta = 0$, these boundary fluctuations are the same as for internal diffusion limited aggregation (IDLA).
- As $t \rightarrow \infty$, $\mathcal{F}_t(e^{i\theta})$ converges to a Gaussian field.
 - When $\alpha + \eta = 0$, $\mathcal{F}_\infty(e^{i\theta})$ is known as the augmented Gaussian Free Field.
 - When $\alpha + \eta < 1$, $\text{Cov}(\mathcal{F}_\infty(e^{ix}), \mathcal{F}_\infty(e^{iy})) \asymp \log|x - y|$.
 - When $\alpha + \eta = 1$, $\mathcal{F}_\infty(e^{i\theta})$ is complex white noise.

References

- [1] M.B.Hastings and L.S.Levitov, *Laplacian growth as one-dimensional turbulence*, Physica D 116 (1998).
- [2] F.Johansson Viklund, A.Sola, A.Turner, *Small particle limits in a regularized Laplacian random growth model*, CMP, 334 (2015).
- [3] J.Norris, V.Silvestri, A.Turner, *Scaling limits for planar aggregation with subcritical fluctuations*, PTRF, 185 (2022).
- [4] J.Norris, V.Silvestri, A.Turner, *Stability of regularized Hastings-Levitov aggregation in the subcritical regime*, CMP, 405 (2024).
- [5] J.Norris, A.Turner, *Hastings-Levitov aggregation in the small-particle limit*, CMP, 316 (2012).
- [6] A.Sola, A.Turner, F.Viklund, *One-dimensional scaling limits in a planar Laplacian random growth model*, CMP, 371 (2019).
- [7] V.Silvestri, *Fluctuation results for Hastings-Levitov planar growth*. PTRF, 167 (2017).