

# Random curves and surfaces

Nina Holden

Courant Institute, New York University

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# Agenda

- 1 Uniformly random objects: Curves, functions, surfaces
- 2 Conformal welding of random surfaces

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# How can you sample a curve uniformly at random?

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First question: What is a curve?

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## Curve

In [mathematics](#), a **curve** (also called a **curved line** in older texts) is an object similar to a [line](#), but that does not have to be [straight](#).

Intuitively, a curve may be thought of as the trace left by a [moving point](#). This is the definition that appeared more than 2000 years ago in [Euclid's \*Elements\*](#): "The [curved] line<sup>[a]</sup> is [...] the first species of quantity, which has only one dimension, namely length, without any width nor depth, and is nothing else than the flow or run of the point which [...] will leave from its imaginary moving some vestige in length, exempt of any width."<sup>[a]</sup>

This definition of a curve has been formalized in modern mathematics as: *A curve is the image of an interval to a topological space by a continuous function.* In some contexts, the function that defines the curve is called a [parametrization](#).

Our set of curves:

$$\Omega := \{f : [0, 1] \rightarrow \mathbb{R} : f \text{ is continuous}\}$$

# How can you sample a curve uniformly at random?

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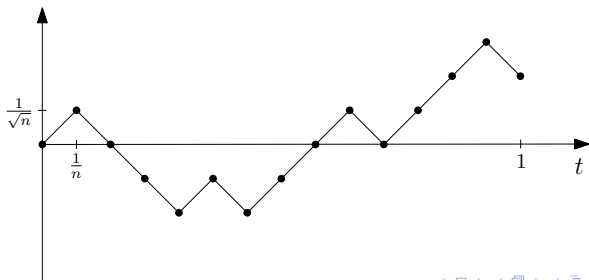
Uniformly at random: all possible outcomes have the same probability

Problem:  $\Omega$  is infinite.

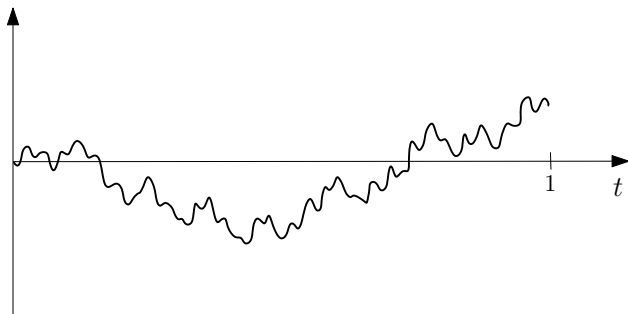
Solution: We **discretize** the space of curves  $\Omega$ .

$$\Omega_n = \{f \in \Omega : f \text{ linear with slope } \pm\sqrt{n} \text{ on } [\frac{k}{n}, \frac{k+1}{n}]; f(0) = 0\}.$$

Pick a function uniformly at random from  $\Omega_n$ ; send  $n \rightarrow \infty$ .

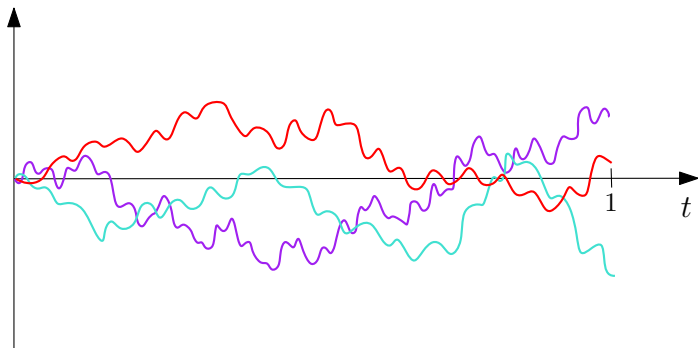


# Brownian motion



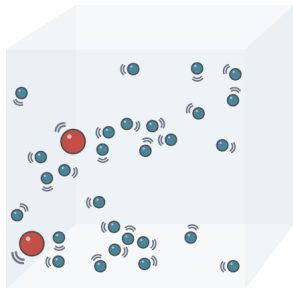


# Brownian motion

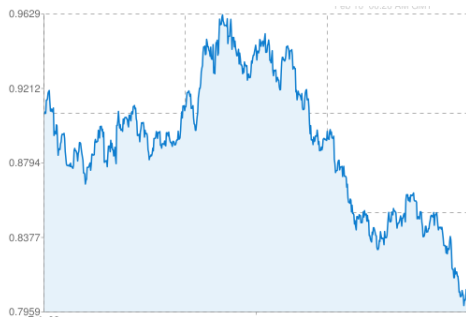


3 independent samples of Brownian motion

# Brownian motion in applications



Pollen grains (red) in water



USD/EUR 2 year exchange rate

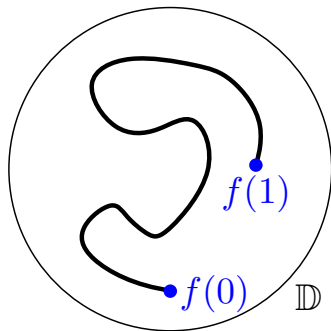
Broad range of applications in physics, chemistry, biology, economics, finance, etc.

Universality: scaling limit of large class of discrete models

# How to sample uniform self-avoiding curve in unit disk?

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$$\Omega = \{f : [0, 1] \rightarrow \overline{\mathbb{D}} : f \text{ continuous and injective}\}.$$

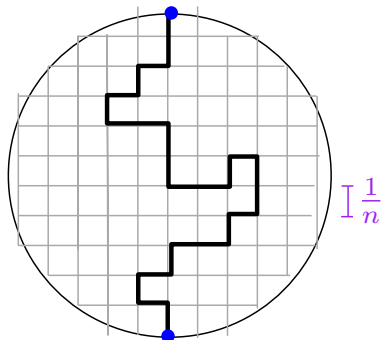


# How to sample uniform self-avoiding curve in unit disk?

$\Omega = \{f : [0, 1] \rightarrow \overline{\mathbb{D}} : f \text{ continuous and injective}\}.$

$\Omega_n = \{f \in \Omega : f \text{ on } \frac{1}{n}\mathbb{Z}^2 \text{ connecting } \pm i; \text{ speed } n^{1/3}\}.$

Sample a curve uniformly at random from  $\Omega_n$ .

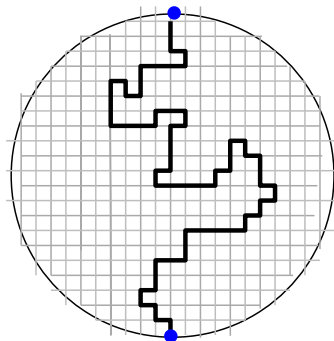


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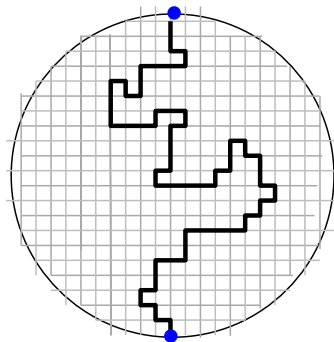
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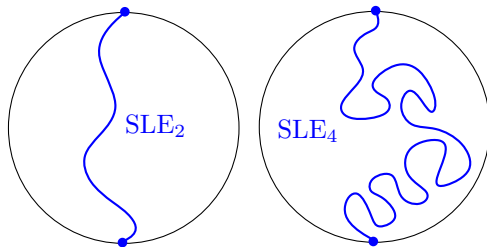
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Sample a curve uniformly at random from  $\Omega_n$ .

Conjecture: As  $n \rightarrow \infty$ , we get **Schramm-Loewner evolution (SLE)**



# Schramm-Loewner evolution (SLE)



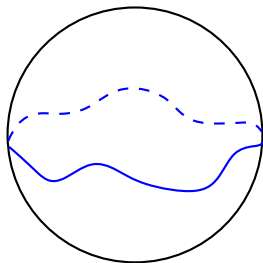
Schramm-Loewner evolution

- Random fractal curve introduced in Schramm'99.<sup>1</sup>
- Scaling limit of statistical physics models
  - Examples: Ising model, percolation, uniform spanning tree, etc.
- Uniquely characterized by conf. inv. and domain Markov property.
- Parameter  $\kappa > 0$ .

<sup>1</sup>The year here and later refers to the time of the initial arXiv preprint



# Schramm-Loewner evolution (SLE)



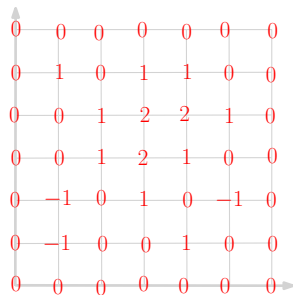
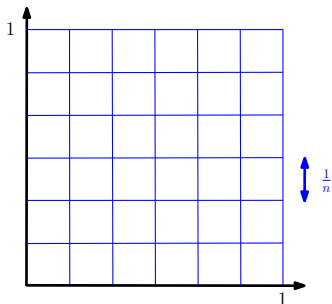
SLE loop

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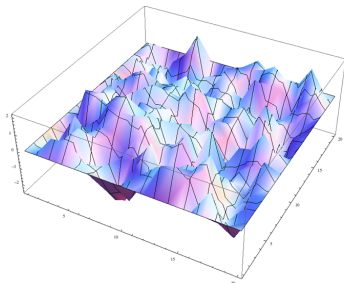
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# How to sample a function on $[0, 1]^2$ uniformly at random?

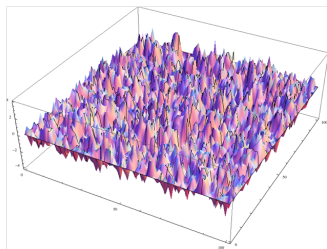


$$h_n(i) - h_n(j) \in \{-1, 0, 1\} \text{ if } i \sim j$$

# How to sample a function on $[0, 1]^2$ uniformly at random?



$n = 20$



$n = 100$

- $|h_n(z)|$  of order  $\sqrt{\log n}$  for  $z$  in the bulk.
  - Glazman-Manolescu'18 proves this for the triangular lattice.
- Conjecture:  $h_n \Rightarrow h$ , where  $h$  is the Gaussian free field (GFF).

# Gaussian free field (GFF)

- The GFF  $h$  is a **random distribution (generalized function)**. With probability one,
  - $h(z)$  is **not** well-defined for any fixed  $z \in S := (0, 1)^2$ ,
  - $\int_S hf$  is well-defined for  $f$  a smooth test function,
  - $h$  is in the Sobolev space  $H^{-\epsilon}(S)$  for any  $\epsilon > 0$ .
- $\int_S hf$  is normally distributed with mean 0 and

$$\text{Cov} \left( \int_S hf, \int_S hg \right) = \int_{S \times S} f(x) G(x, y) g(y) dx dy,$$

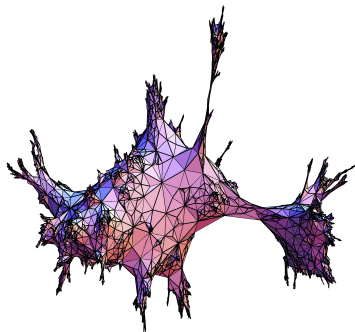
where  $G : S \times S \rightarrow [0, \infty]$  is the Green's function.

- Universality: Scaling limit of fluctuations in a number of statistical physics models, e.g. domino tilings and random matrices.
- Generalization of Brownian motion to higher-dimensional time.
- Appears in constructions in conformal field theory.

# How can you sample a surface uniformly at random?

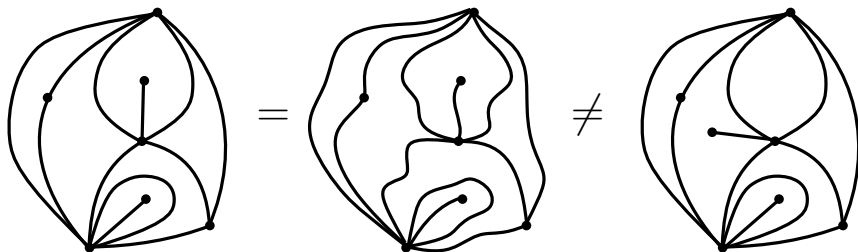
# How can you sample a surface uniformly at random?

A uniform planar map

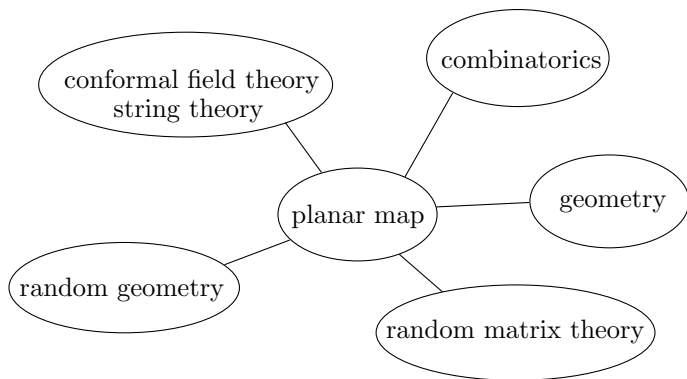


# Random planar maps

- A **planar map** is a graph drawn on the sphere, viewed modulo continuous deformations.
- For  $n \in \mathbb{N}$  sample  $M_n$  **uniformly** at random from the collection of planar maps with  $n$  edges.



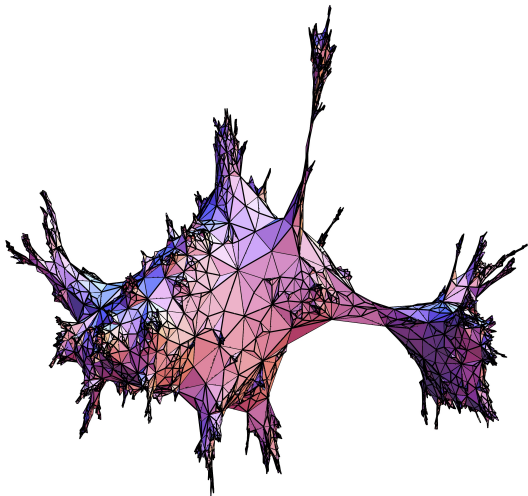
# Planar maps





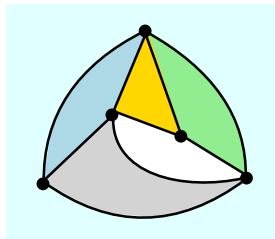
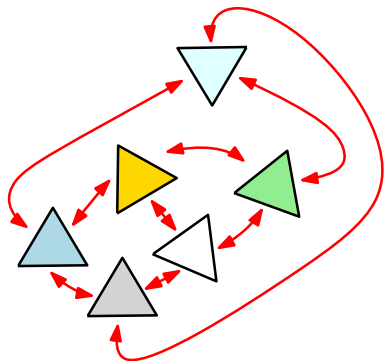
# Scaling limits of uniform planar maps

$M_n$  uniform planar map with  $n$  edges. Does  $M_n$  converge as  $n \rightarrow \infty$ ?



# Conformal embedding of random planar maps

Uniformization theorem: For any simply connected Riemann surface  $M$  there is a conformal map  $\phi$  from  $M$  to either  $\mathbb{D}$ ,  $\mathbb{C}$  or  $\mathbb{S}^2$ .



A triangulation viewed as a Riemannian manifold

# Conformal embedding of random planar maps

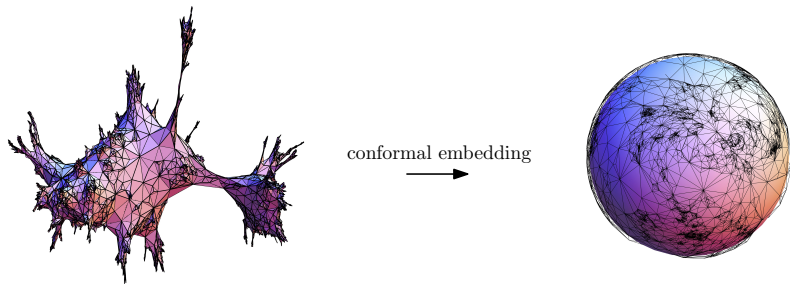
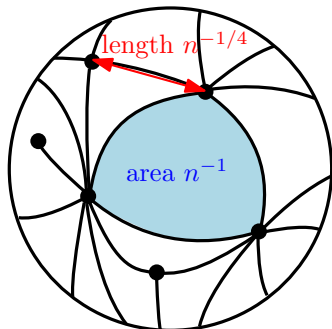


Figure by Nicolas Curien.

# Conformal embedding of random planar maps

- Area measure  $\mu_n$  on  $\mathbb{S}^2$ : each face has area  $n^{-1}$
- Distance function (metric)  $D_n$  on  $\mathbb{S}^2$ : adjacent vertices distance  $n^{-1/4}$

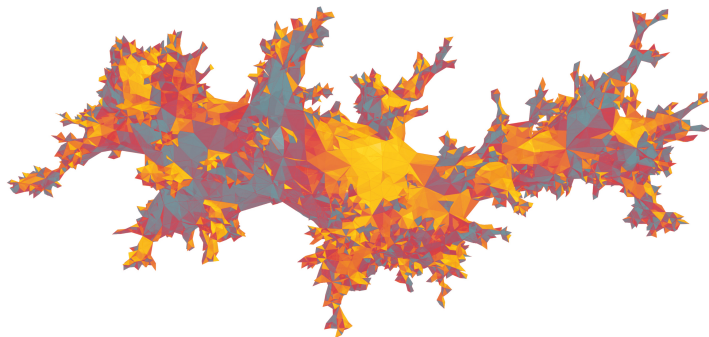


Liouville quantum  
gravity (LQG) surface  
 $(\mu, D)$

conformally embedded planar map  
with the **Cardy-Smirnov embedding**

See H.-Sun'19, which builds on earlier works (Le Gall'11, Miermont'11, Garban-Pete-Schramm'08-'13, Duplantier-Miller-Sheffield'14, Mil.-Sheff.'16, Gwynne-Mil.'17) and works with Albenque, Bernardi, Garban, Gwynne, Lawler, Li, Sepulveda.

# Liouville quantum gravity surface



2D Riemannian manifold  $e^{\gamma h}(dx^2 + dy^2)$ ,  
with  $\gamma \in (0, 2)$  and  $h$  a 2D Gaussian free field

LQG surfaces introduced by Polyakov'81 in context of string theory

# Liouville quantum gravity (LQG)

- Let  $\gamma \in (0, 2)$  and let  $h$  be the Gaussian free field in  $(0, 1)^2$ .
- LQG surface:  $e^{\gamma h}(dx^2 + dy^2)$

Area measure:  $\mu = "e^{\gamma h} d^2 z"$ ,

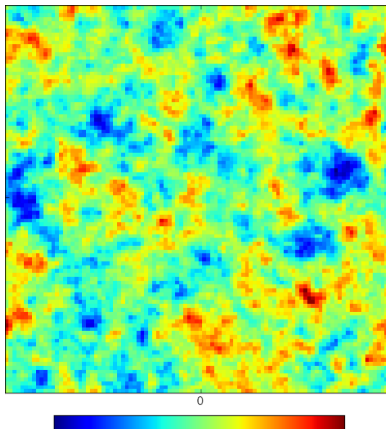
Boundary measure:  $\nu = "e^{\gamma h/2} dz"$ ,

Distance:  $D = "e^{\gamma h/d_\gamma} |dz|"$ ,  $d_\gamma = \text{dimension} > 2$ .

- The definition of an LQG surface does not make literal sense since  $h$  is a distribution and not a function.
- $\mu, \nu, D$  defined rigorously via regularized version  $h_\epsilon$  of  $h$ , e.g.

$$\mu(U) = \lim_{\epsilon \rightarrow 0} \epsilon^{\gamma^2/2} \int_U e^{\gamma h_\epsilon(z)} d^2 z, \quad U \subset (0, 1)^2.$$

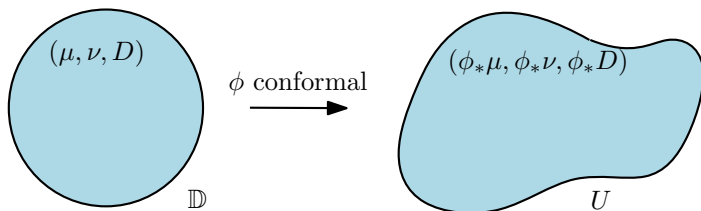
- References:
  - $\mu, \nu$ : Hoegh-Krohn'71, Kahane'85, Duplantier-Sheffield'08, Rhodes-Vargas'13, Berestycki'15, etc.
  - $D$ : Ding-Dubedat-Dunlap-Falconet'19, Gwynne-Miller'19



Random area measure  $\mu = "e^{\gamma h} d^2 z"$  (figure by M. Park)

# Liouville quantum gravity (LQG) surface

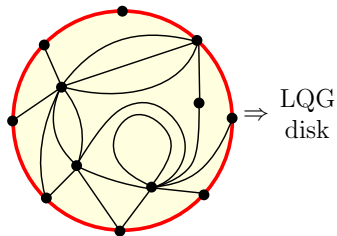
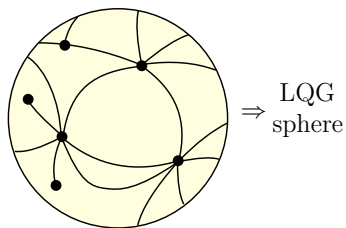
The tuple  $(\mu, \nu, D)$  describes the geometry of the  $\gamma$ -**LQG surface**  $(\mathbb{D}, h)$ .



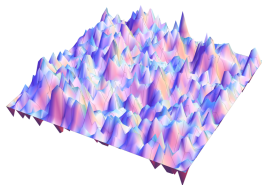
Two different embeddings of the same  $\gamma$ -LQG surface



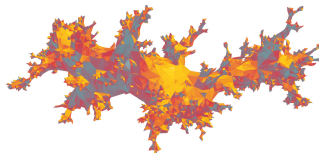
# Random planar maps converging to variants of LQG



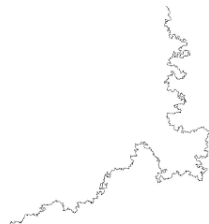
# GFF, LQG and SLE: Three random planar objects



Gaussian Free Field  
(generalized function)



Liouville quantum gravity  
(2D Riemannian manifold)



Schramm-Loewner evolution  
(non-crossing curve)

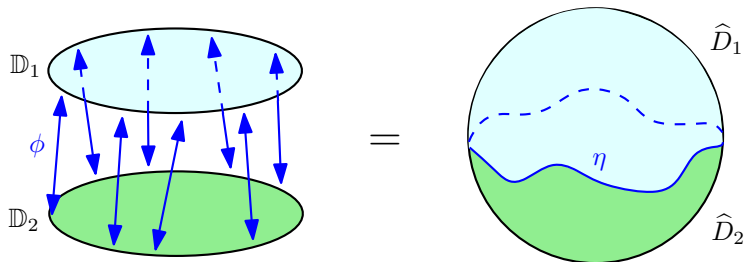
All three objects  
have intriguing **conformal symmetries** and  
describe the scaling limit of many discrete models (universality).

# Agenda

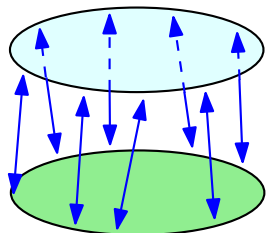
- 1 Uniformly random objects: Curves, functions, surfaces
- 2 Conformal welding of random surfaces

# The conformal welding problem

- $\mathbb{D}_1, \mathbb{D}_2$  copies of the unit disk;  $\phi : \partial\mathbb{D}_1 \rightarrow \partial\mathbb{D}_2$  a homeomorphism.
- Conformal welding: a conformal structure on the sphere  $\mathbb{S}^2$  obtained by identifying  $\partial\mathbb{D}_1$  and  $\partial\mathbb{D}_2$  according to  $\phi$ .
  - More precisely, we are interested in a curve  $\eta$  and conformal maps  $\psi_j : \mathbb{D}_j \rightarrow \widehat{D}_j$ ,  $j = 1, 2$ , such that  $\phi = \psi_2^{-1} \circ \psi_1|_{\partial\mathbb{D}_1}$ .
- Does there exist a conformal welding? If so, is it unique?
- Existence and uniqueness may fail, but sufficient regularity of  $\phi$  or  $\eta$  guarantees the existence of a unique solution.

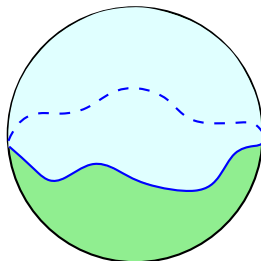


# Disk + disk = sphere + SLE loop



Two  $\gamma$ -LQG disks

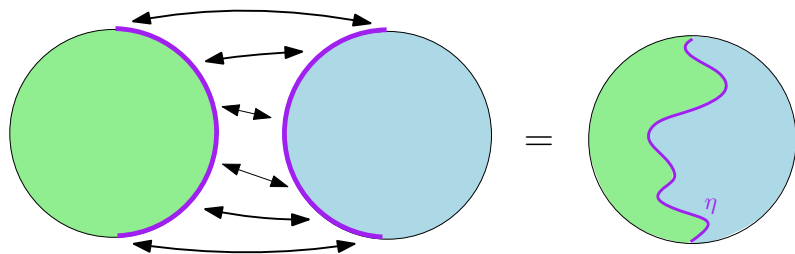
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$\gamma$ -LQG sphere and  $\text{SLE}_{\gamma^2}$  loop

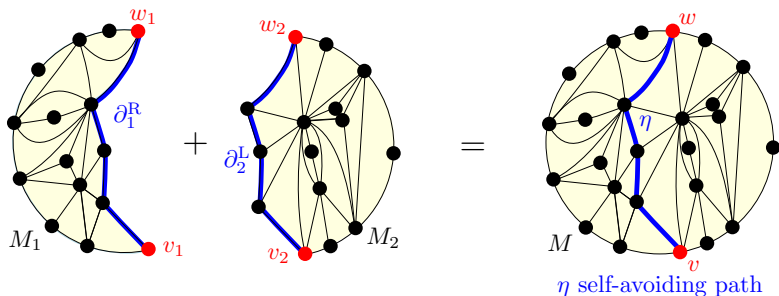
- Green & blue disks **independent** cond. on matching bdy lengths
- Welding homeomorphism given by LQG boundary length
- SLE loop and sphere in right figure **independent**
- Ang-H.-Sun'21, building on several earlier works (see next slide)

# Disk + disk = disk + chordal SLE



- Green & blue disks **independent** cond. on matching bdy lengths
- Welding homeomorphism given by LQG boundary length
- SLE and disk in right figure **independent**
- Ang-H.-Sun'20, building on Sheffield'10 & Duplantier-Miller-Sheff.'14

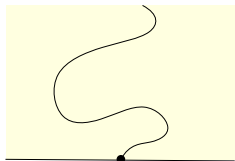
# Discrete motivation for conformal welding



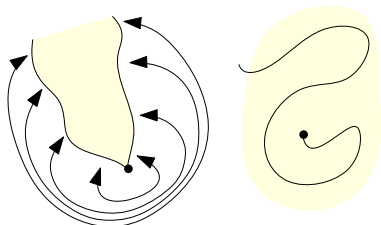
Bijection:  $((M_1, v_1, w_2), (M_2, v_2, w_2)), \#\partial_1^R = \#\partial_2^L$  and  $(M, v, w, \eta)$

Continuum result inspired by planar maps, but proof is purely continuum.

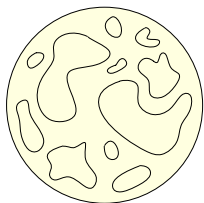
# More examples



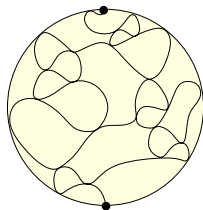
simple chordal SLE



whole-plane SLE from 0 to  $\infty$



conformal loop ensemble

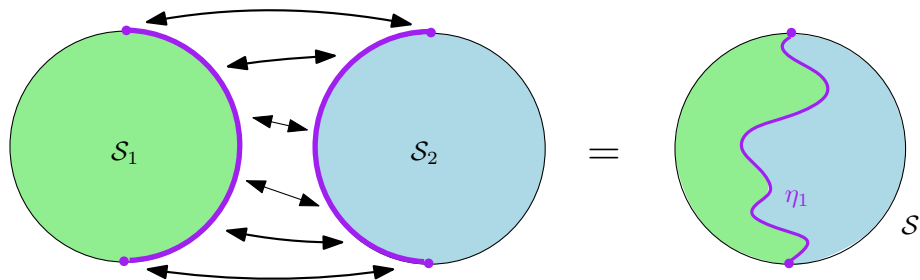


non-simple chordal SLE

Sheffield'10, Duplantier-Miller-Sheffield'14, Miller-Sheffield-Werner'20

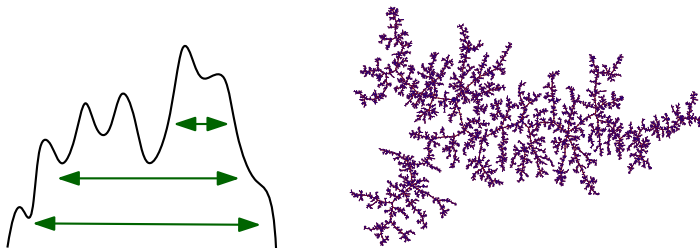


# General principles



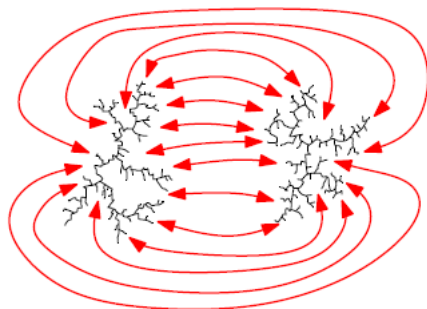
- Cutting a  $\gamma$ -LQG surface  $\mathcal{S}$  by the “right” independent  $\text{SLE}_\kappa$ -type curve(s)  $\eta_1, \eta_2, \dots$  gives **independent** surfaces  $\mathcal{S}_1, \mathcal{S}_2, \dots$  in the complementary components.
- $\mathcal{S}_1, \mathcal{S}_2, \dots$ , plus info about how the surfaces are glued together, determine  $\mathcal{S}$  and  $\eta_1, \eta_2, \dots$ .
- Discrete analogues on planar maps, although proof continuum.

# Mating of trees



Brownian excursion and continuum random tree

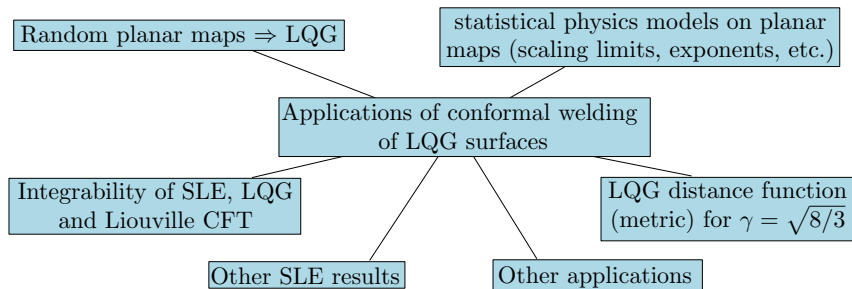
Right figure by Kortchemski



Duplantier-Miller-Sheffield'14:  
Mating/welding two continuum random trees gives  
a  $\gamma$ -LQG sphere with a space-filling  $SLE_{16/\gamma^2}$

Allows to study LQG and SLE with Brownian motion

# Applications of conformal welding of LQG surfaces

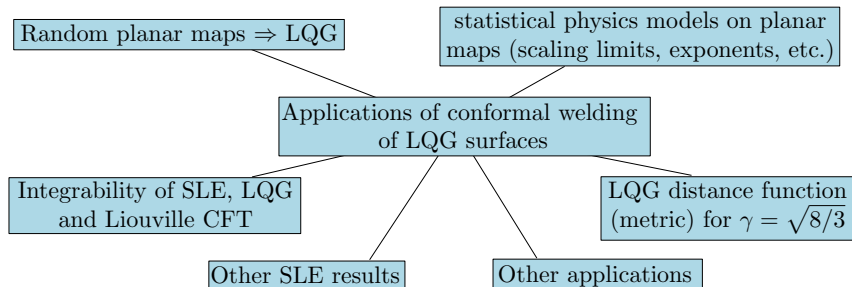


Why is conformal welding so powerful in the study of LQG and SLE?

- exploit interplay between LQG and SLE
- study complicated surfaces by decomposing into smaller indep. pieces

See works of Ang, Borga, Duplantier, Gwynne, H., Kavvasias, Lehmkuehler, Miller, Pfeffer, Schoug, Sheffield, Sun, Werner, Yu, etc.

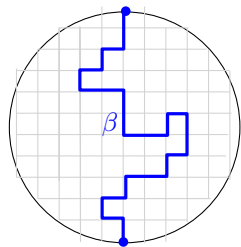
# Applications of conformal welding of LQG surfaces



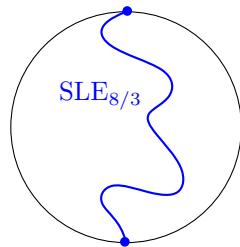
Two examples:

- 1 Self-avoiding loop on random planar map  $\Rightarrow$   $SLE_{8/3}$  loop
- 2 Random permutations and density of the Baxter permuton

# Conjecture: Self-avoiding walk $\Rightarrow$ SLE<sub>8/3</sub>

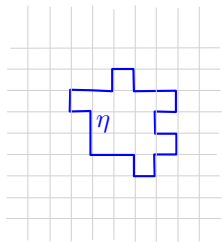


conjecture  
 $\Rightarrow$

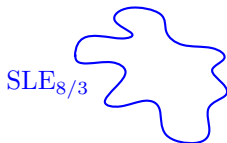


self-avoiding walk  
weight =  $\mu^{-\text{length}(\beta)}$   
 $\mu$  = connective constant

# Conjecture: Self-avoiding loop $\Rightarrow$ SLE<sub>8/3</sub> loop



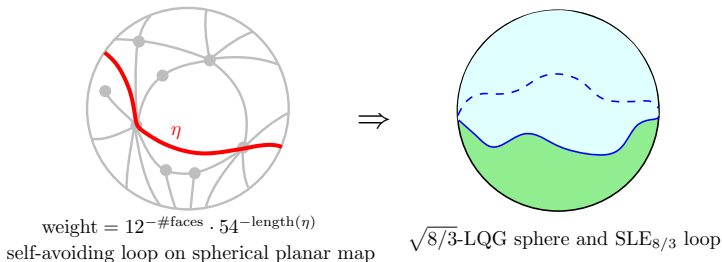
conjecture  
 $\Rightarrow$



self-avoiding loop  
weight =  $\mu^{-\text{length}(\eta)}$   
 $\mu$  = connective constant

# Self-avoiding loop on planar map $\Rightarrow$ $\text{SLE}_{8/3}$ loop

Ang-H.-Sun'21:



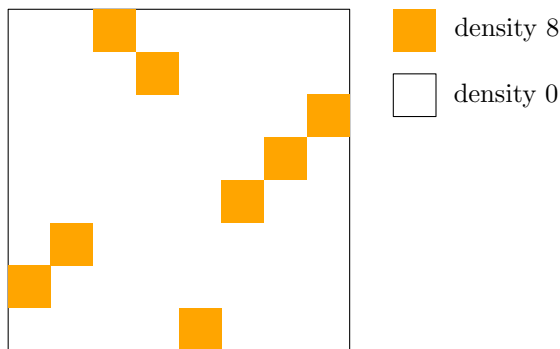
Proof builds on

- Conformal welding “disk + disk = sphere + SLE loop”
- Discrete counterpart of welding on planar maps (bijection)
- Technical inputs: Brown'65, Gwynne-Miller'16

Analogous results chordal  $\text{SLE}_{8/3}$ : Gwynne-Miller'16 & Ang-H.-Sun'20



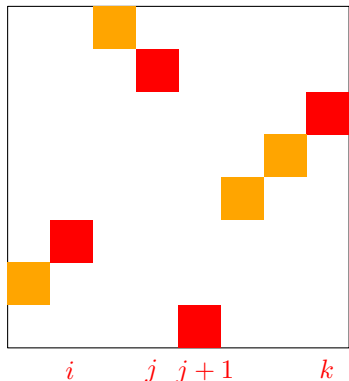
# Permutons



Permuton of permutation  $\sigma = 23871456$

- Permuton: probability measure on  $[0, 1]^2$  with uniform marginals.
- Permutons describe the scaling limit of many random permutations:  $(\sigma_n)_{n \in \mathbb{N}}$  conv. to a permuton if associated permutons converge.

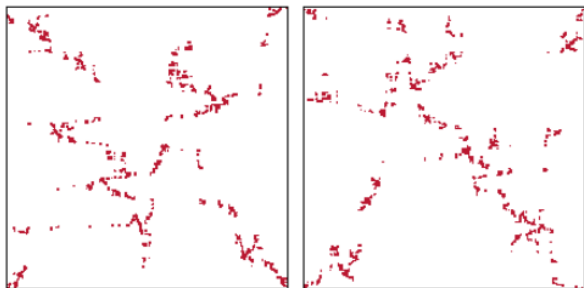
# The Baxter permuton



Not a Baxter permutation

- Baxter permutations: no  $i < j < k$  such that  $\sigma(j+1) < \sigma(i) < \sigma(k) < \sigma(j)$  or  $\sigma(j) < \sigma(k) < \sigma(i) < \sigma(j+1)$ .
- Introduced in Baxter'64.
- Connections with a number of other combinatorial objects.
- Borga-Maazoun'20: Uniform Baxter permutation  $\Rightarrow$  Baxter permuton

# The Baxter permuton



Two large uniform Baxter permutations

- Baxter permutations: no  $i < j < k$  such that  $\sigma(j+1) < \sigma(i) < \sigma(k) < \sigma(j)$  or  $\sigma(j) < \sigma(k) < \sigma(i) < \sigma(j+1)$ .
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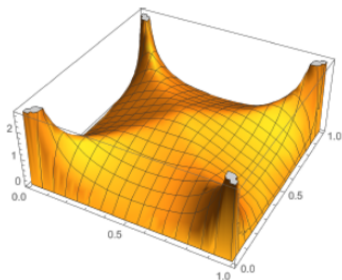
Figure due to Borga

# Density of the Baxter permuton

Borga-H.-Sun-Yu'22: Density of  $\mathbb{E}[\mu_B]$ , with  $\mu_B$  the Baxter permuton, is

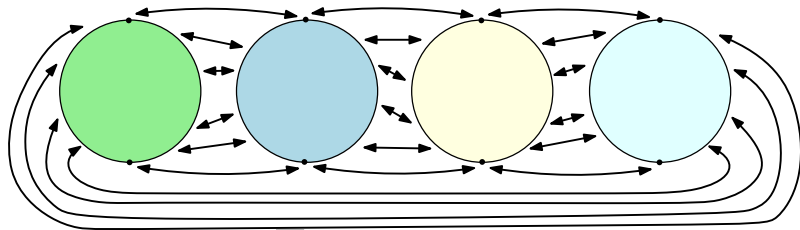
$$\rho_B(x, y) = c \int_{\max\{0, x+y-1\}}^{\min\{x, y\}} \int_{\mathbb{R}_+^4} \rho(y-z, l_1, l_2) \rho(z, l_2, l_3) \rho(x-z, l_3, l_4) \\ \rho(1+z-x-y, l_4, l_1) \, dl_1 dl_2 dl_3 dl_4 \, dz,$$

where 
$$\rho(t, x, r) := \frac{1}{t^2} \left( \left( \frac{3rx}{2t} - 1 \right) e^{-\frac{r^2+x^2-rx}{2t}} + e^{-\frac{(x+r)^2}{2t}} \right).$$

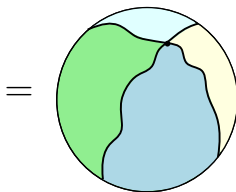


# Density of the Baxter permuton: proof

- SDE defining Baxter permuton also arises in LQG conformal welding.
- Baxter density corresponds to computable LQG observable.



Four  $\sqrt{4/3}$ -LQG disks with  $4/\sqrt{3}$ -singularities



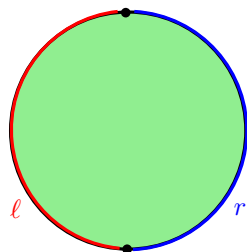
$\sqrt{4/3}$ -LQG sphere with  $SLE_{4/3}$ -type curves

# Density of the Baxter permuton: proof

- SDE defining Baxter permuton also arises in LQG conformal welding.
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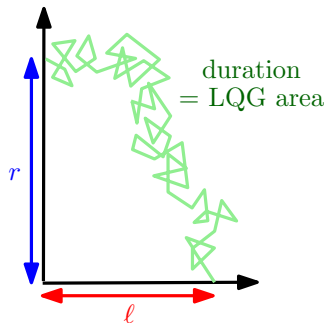
For  $I_1, I_2 \subset [0, 1]$  and with  $A_1, A_2, A_3, A_4$  denoting the LQG disk areas,

$$\mathbb{E}[\mu_B(I_1 \times I_2)] = \mathbb{P}(A_2 + A_3 \in I_1, A_1 + A_2 \in I_2).$$



$\sqrt{4/3}$ -LQG disks  
with  $4/\sqrt{3}$ -singularities

“mating of trees”-  
encoding of LQG



Thanks for the attention