Some models at the interface of probability theory and combinatorics: particle systems and maps.

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PhD defense. Under the supervision of J.F. Marckert.



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université

Invariant measures of discrete interacting particles systems: algebraic aspects. with J.F. Marckert.

Example: TASEP



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Particle systems of our interests



Our setting: model depends on 4 parameters:

- Graph G = (V, E) belonging to \mathbb{Z}^d , $\mathbb{Z}/n\mathbb{Z}$.
- Set of $\kappa \in \mathbb{N} \cup \{\infty\}$ colors

$$E_{\kappa}=\{0,1,\ldots,\kappa-1\}.$$

- Dependence neighborhood $L \ge 2$.
- Jump rate matrix

$$\mathsf{T} = [\mathsf{T}_{[\boldsymbol{u}|\boldsymbol{w}]}]_{\{\boldsymbol{u},\boldsymbol{w}\in \mathsf{E}_{\kappa}^{L}\}}.$$

Notation:

$$\eta_t(\mathbf{v}) \rightarrow \text{ color of vertex } \mathbf{v} \text{ at time } \mathbf{t}.$$

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Definition

Given T, a distribution μ is said to be *invariant* if $\eta_t \sim \mu$ for any $t \ge 0$, when $\eta_0 \sim \mu$.



Some references:

- Well definition of PS given T:
 - $\kappa < \infty$, always well defined. [Liggett '85].
 - **2** $\kappa = \infty$, not always. Some techniques:
 - Graphic method [Harris 72'].
 - Functional analysis [Liggett '73].
 - Stochastic domination [Andjel '82].
- Existence of invariant measures for specific PS . [Andjel '82].
- Computation of invariant measures for specific PS. [Derrida et al '93, Blythe & Evans '07...].
- Uniqueness / ergodicity? Convergence to the invariant measure for specific PS? Rate of convergence? [Benjamini et al '05, Labbé & Lacoin '16...].

Our main question:

Given a (class of) measure, is it possible to characterize the ⊤'s for which this measure is invariant?

• A classical sufficient condition for invariance of product measures

Detailed balance equations

The **product measure** $\rho^{\mathbb{Z}}$ is invariant by T on \mathbb{Z} if

$$\rho_{a}\rho_{b}\mathsf{T}_{[a,b|u,v]} = \rho_{u}\rho_{v}\mathsf{T}_{[u,v|a,b]} \qquad \forall a, b, u, v \in E_{\kappa}$$



• The product measure case is partially known. [Fajfrová et al '16].

Our main question:

Is it possible to characterize the T for which the distribution of a Markov chain is invariant ?"

Markov Distribution

A process X has a Markov distribution (ρ, M) , with Markov Kernel (MK) M of memory m = 1 and initial distribution ρ , if for any $\mathbf{x} \in E_{\kappa}^{n+1}$

$$\mathbb{P}(X\llbracket 0, n \rrbracket = \mathbf{x}) = \rho_{\mathbf{x}_0} \prod_{j=0}^{n-1} M_{\mathbf{x}_j, \mathbf{x}_{j+1}}.$$

$$\mathbb{P}(X[[0,2]] = x) = \rho_{x_0} M_{x_0,x_1} M_{x_1,x_2}$$

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Gibbs Distribution

A vector $(X_k, k \in \mathbb{Z}/n\mathbb{Z})$ is said to have a Gibbs distribution G(M) characterized by a MK M, if for any $\mathbf{x} \in E_{\kappa}^n$,

$$\mathbb{P}(X\llbracket 0, n-1\rrbracket = \mathbf{x}) = \frac{\prod_{j=0}^{n-1} M_{x_j, x_{j+1} \mod n}}{\operatorname{Trace}(M^n)}.$$

$$\mathbb{P}(X\llbracket 0,2\rrbracket = x) = \rho_{x_0}M_{x_0,x_1}M_{x_1,x_2}$$

$$\mathbb{P}(X\llbracket 0,2\rrbracket = \mathbf{x}) \propto$$



Invariance schemes







Main Theorem (F. & Marckert '17)

Let κ be finite, L = 2 and m = 1. If M > 0 (strictly positive entries) then the following statements are equivalent:

- **(** ρ , *M***)** is invariant by T on \mathbb{Z} .
- **2** G(M) is invariant by T on $\mathbb{Z}/7\mathbb{Z}$.
- G(M) is invariant by T on $\mathbb{Z}/n\mathbb{Z}$, for all $n \geq 3$.

Suppose $\mu_t = (\rho, M)$. We define

 $\mathsf{Line}_n^{M,\mathsf{T}}(\mathbf{x}) := \frac{\partial}{\partial t} \mu_t(x_1 x_2 \dots x_{n-1} x_n)$

Mass creation rate of x

– Mass destruction rate of x

Definition

=

A (ρ, M) MD under its invariant distribution is said to be **invariant by** T on the line when $\operatorname{Line}_{n}^{M,T} \equiv 0$, for all $n \in \mathbb{N}$.

Suppose
$$\mu_{t} = (\rho, M)$$
. We define

$$\operatorname{Line}_{n}^{M,\mathsf{T}}(\mathbf{x}) := \frac{\partial}{\partial t} \mu_{t}(x_{1}x_{2}\dots x_{n-1}x_{n})$$

$$= \sum_{\substack{x_{-1},x_{0}, \\ x_{n+1},x_{n+2} \in E_{\kappa}}} \sum_{j=0}^{n} \sum_{(u,v) \in E_{\kappa}^{2}} \left(\mathsf{T}_{[u,v|x_{j},x_{j+1}]} \left(\rho_{x_{-1}} \prod_{\substack{-1 \leq k \leq n+1 \\ k \notin \{j=1,j,j+1\}}} M_{x_{k},x_{k+1}} \right) M_{x_{j-1},u} M_{u,v} M_{v,x_{j+2}} - \mathsf{T}_{[x_{j},x_{j+1}|u,v]} \left(\rho_{x_{-1}} \prod_{k=-1}^{n+1} M_{x_{k},x_{k+1}} \right) \right)$$

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Definition

A (ρ, M) MD under its invariant distribution is said to be **invariant by** T on the line when $\text{Line}_n^{M,T} \equiv 0$, for all $n \in \mathbb{N}$.

Suppose $\mu_t = (\rho, M)$. We define for M > 0

$$\begin{aligned} \mathsf{NLine}_{n}^{M,\mathsf{T}}(\mathbf{x}) &:= \frac{\mathsf{Line}_{n}^{M,\mathsf{T}}(\mathbf{x})}{\prod_{i=1}^{n-1} M_{x_{i},x_{i+1}}} \\ &= \sum_{\substack{x_{-1},x_{0}, \\ x_{n+1},x_{n+2} \in \mathcal{E}_{\kappa}}} \sum_{j=0}^{n} \left(\rho_{x_{-1}} M_{x_{-1},x_{0}} M_{x_{0},x_{1}} \quad \times \quad Z_{x_{j-1},x_{j},x_{j+1},x_{j+2}} \quad \times \quad M_{x_{n},x_{n+1}} M_{x_{n+1},x_{n+2}} \right) \end{aligned}$$

Definition

A (ρ, M) MD under its invariant distribution is said to be **invariant by** T on the line when $\operatorname{Line}_{n}^{M,T} \equiv 0$, for all $n \in \mathbb{N}$.

Important message:

• Line: If M > 0, then (ρ, M) is invariant by T on $\mathbb{Z} \iff$

$$\mathsf{NLine}_{n}^{M,\mathsf{T}}(x) = Z_{x_{1},x_{2},x_{3}}^{L} + \sum_{j=2}^{n-2} Z_{x_{j-1},x_{j},x_{j+1},x_{j+2}} + Z_{x_{n-2},x_{n-1},x_{n}}^{R} = 0 \quad \text{ for all } n \in \mathbb{N}$$

• Cycle of length *n*: If M > 0, then G(M) is invariant by T on $\mathbb{Z}/7\mathbb{Z} \iff$

NCycle_n^{M,T}(x) =
$$\sum_{j=0}^{n-1} Z_{x_{j-1}, x_j, x_{j+1}, x_{j+2}} = 0$$

where $\overline{i} := i \mod n$

1) \implies 2) in main theorem: M > 0

1)(ρ , M) is invariant by T on $\mathbb{Z} \implies 2$)G(M) is invariant by T on $\mathbb{Z}/7\mathbb{Z}$ \uparrow NLine $_{n}^{M,T} \equiv 0 \quad \forall n \in \mathbb{N} \implies \mathsf{NCycle}_{7}^{M,T} \equiv 0$

Consider
$$\mathbf{x} \in E_{\kappa}^{7}$$
 and $\mathbf{w} = \underbrace{\mathbf{x} \dots \mathbf{x}}_{\ell \text{ times}}$

$$\mathsf{NLine}_{7\ell}^{M,T}(\boldsymbol{w}) = \underbrace{\mathsf{Bound. terms}}_{O(1)} + \dots = 0$$

$$\boldsymbol{\swarrow}_{(1)} = \underbrace{\mathsf{Round}_{(1)}}_{O(1)} + \dots = 0$$

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$$\mathsf{NLine}_{7\ell}^{M,T}(\boldsymbol{w}) = \underbrace{\mathsf{Bound. terms}}_{\mathcal{O}(1)} + \mathsf{NCycle}_{7}^{M,T}(\boldsymbol{x}) + \ldots = 0$$

$$\underbrace{\times 1}_{\times 2} \underbrace{\times 3}_{\times 3} \underbrace{\times 4}_{\times 5} \underbrace{\times 5}_{\times 6} \underbrace{\times 6}_{\times 7} \underbrace{\times 2}_{\times 2} \underbrace{\times 3}_{\times 4} \underbrace{\times 5}_{\times 6} \underbrace{\times 6}_{\times 7} \xrightarrow{}$$

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Theorem- Strongest form (F. & Marckert '17)

Let E_{κ} be finite, $L \ge 2$, $m \in \mathbb{N}$. If M > 0 (strictly positive entries) then the following statements are equivalent:

- (ρ, M) is invariant by T on \mathbb{Z} .
- **3** G(M) is invariant by T on $\mathbb{Z}/h\mathbb{Z}$.
- G(M) is invariant by T on $\mathbb{Z}/n\mathbb{Z}$, for all $n \ge m + L$.

with h := 4m + 2L - 1

The system of equations in 2) is finite, of degree h in M and linear in T.





Corollary (F. & Marckert '17)

The contact process does not have a non-trivial MD of any memory $m \ge 0$ as invariant distribution.

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Particle systems and maps

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Algorithm

We give an algorithm to compute the set of M > 0 invariant by a given T. Case finite number of colors ($\kappa < \infty$), memory 1 (m = 1) and range 2 (L = 2).

• Find the set of all ν satisfying (linear algebra)

$$\sum_{u,v \in E_{\kappa}} \left(\nu_{c,u,v} \mathsf{T}_{[u,v|a,b]} + \nu_{a,u,v} \mathsf{T}_{[u,v|b,c]} + \nu_{b,u,v} \mathsf{T}_{[u,v|c,a]} \right)$$
$$= \nu_{a,b,c} \left(\mathsf{T}_{[a,b]}^{\text{out}} + \mathsf{T}_{[b,c]}^{\text{out}} + \mathsf{T}_{[c,a]}^{\text{out}} \right).$$

• Property: For each ν there exists at most one M satisfying

$$\nu_{x,y,z} = \frac{M_{x,y}M_{y,z}M_{z,x}}{\text{Trace }M^3}$$

When M exists, compute it (algebra).

• Test if *M* satisfies $NCycle_7^{M,T} \equiv 0$ (linear algebra/Gröbner).

Corollary

There exists a jump rate matrix T which possesses some hidden Markov chain as invariant distribution.

Idea:



$$\mathsf{T}_{[0,0,0|0,1,0]} = 270, \quad \mathsf{T}_{[0,1,0|0,0,0]} = 294.$$

Detailed balance equations (DBE)

The product measure $\rho^{\mathbb{Z}}$ is invariant by T on \mathbb{Z} if

$$\rho_{a}\rho_{b}\mathsf{T}_{[a,b|u,v]} = \rho_{u}\rho_{v}\mathsf{T}_{[u,v|a,b]} \qquad \forall a, b, u, v \in E_{\kappa}$$

Theorem (F. & Marckert '17)

Let $\kappa < \infty$ and L = 2. If ρ is a measure with support E_{κ} then the following are equivalent:

- The product measure $\rho^{\mathbb{Z}}$ is invariant by T on \mathbb{Z} .
- **2** The product measure $\rho^{\mathbb{Z}/3\mathbb{Z}}$ is invariant by T on $\mathbb{Z}/3\mathbb{Z}$.

$$Z_{\sigma,b,c,\overline{\sigma}} = \sum_{u,v\in E_{\kappa}} \left(\frac{\rho_{u}\rho_{v}\rho_{\overline{\sigma}}}{\rho_{b}\rho_{c}\rho_{\overline{\sigma}}} \mathsf{T}_{[u,v|b,c]} - \mathsf{T}_{[b,c|u,v]} \right)$$
$$= \sum_{u,v\in E_{\kappa}} \frac{1}{\rho_{a}\rho_{b}} \left(\rho_{u}\rho_{v}\mathsf{T}_{[u,v|b,c]} - \rho_{b}\rho_{c}\mathsf{T}_{[b,c|u,v]} \right)$$

2) $\iff Z_{a,b} + Z_{b,c} + Z_{c,a} = 0, \forall a, b, c \in E_{\kappa} \text{ and } (DBE) \implies Z \equiv 0.$

Survival and coexistence for spatial population models with forest fire epidemics. with A. Linker. and D. Remenik.

Motivation from math-biology: Find models of population dynamics achieving biodiversity.

References:

- Predators [Mimura & Kan-on '86, Hofbauer & Sigmund '89, Schreiber '97.]
- Random fluctuations in the environment. [Mao, Marion & Renshaw '02, Zhu and Yin '09.]
- Random diseases. [Holt & Pickering '85, Saenz & Hethcote '06.]
- Crowding effect.[Sevenster '96, Hartley & Shorrocks '02, Gavina et al '18.]

<u>**Our contribution:**</u> Design + study of a stochastic model of population dynamics with long-time coexistence.

Gypsy moth infestation model.

- One year life's cycle. Discrete time.
- When population density is too high, it gets attacked by epidemics. Forest fires.

Durrett & Remenik '09. Our work: Multi-type model



Ohio Department of Agriculture

- **Space:** Graph $G_N = (V_N, E_N)$ on N vertices.
- Configurations: $\eta_k = {\eta_k(v)}_{v \in V_N}$ global state of the system at time k.

 $\eta_k(\mathbf{v}) \rightarrow \text{type of (the particle at) } \mathbf{v} \text{ at time } \mathbf{k}.$

• Initial configuration: η_0 .

Evolution: Two consecutive steps (per unit of time).

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• **Growth:** A site x of type *i* gives birth to **Poisson**($\beta(i)$) individuals, spreads them randomly on a neighborhood $\mathcal{N}_N(x)$ and then dies. The type of x = the type of a unif. choice over the individuals x received.



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- **Epidemic:** Each site x of type *i* is infected with probability $\alpha_N(i)$. In this case, the infection wipes out the entire connected component of x with the same type as x.





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$$\rho_k(i) = \frac{1}{N} \sum_{x \in V_N} \mathbb{1}_{\{\eta_k(x)=i\}}$$





=(1/10, 1/10)

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Theorem (Durrett & Remenik '09)

Hypothesis:

- Number of species: one.
- Space: G_N uniform random 3-regular graphs with N vertices.
- Offspring: $\beta \in (0,\infty)$ and $\mathcal{N}_N(x) = G_N$, for all $x \in V$.
- Infection: $\alpha_N \log(N) \rightarrow \infty$ and $\alpha_N \rightarrow 0$. (macroscopic killings).
- Initial density: $\rho_0^N \xrightarrow{(d)} p$.

Then,





 $h(p) = \begin{cases} 1 - e^{-\beta p} & \text{if } 0 \le p \le a_0, \\ \frac{e^{-3\beta p}}{(1 - e^{-\beta p})^2} & \text{if } a_0$

a0 explicit.

Figure: Bifurcation diagram one species $\alpha = 0$.

Theorem (F., Linker & Remenik '18)

Hypothesis:

- Number of species: two.
- Space: G_N uniform random 3-regular graphs with N vertices.
- Offspring: $\beta(i) \in (0,\infty)$ and $\mathcal{N}_N(x) = G_N$, for all $x \in V$.
- Infection: α_N(i) log(N) → ∞ and α_N(i) → α(i) ∈ [0, 1]. (microscopic killings too).
- Initial density: $\vec{\rho}_0^N \xrightarrow{(d)} \vec{p}$.

Then,





$$h_{\alpha}(p) = \frac{\left(1 - \sqrt{1 - 4(1 - \alpha)(1 - e^{-\beta p})e^{-\beta p}}\right)^3}{8(1 - \alpha)^2(1 - e^{-\beta p})^2}$$

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Then,

 $(\vec{\rho}_k^N)_{k\in\mathbb{N}} \xrightarrow{(d)} (\vec{h}_{\vec{\alpha}}^{\circ k}(\vec{p}))_{k\in\mathbb{N}}$ on compact time intervals.



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Theorem (F, Linker & Remenik '18)

There are explicit regions of the parameter space where the dynamical system shows: **domination** (red and blue) or **coexistence** (purple).



Theorem (F, Linker & Remenik '18)

In these regions, the stochastic system behaves as the dynamical system:

- When there is **domination**, the weaker type dies out in time O(log(N)).
- When there is coexistence, both types survive for at least $e^{\sqrt{\log(N)}}$.

Tree-decorated planar maps: combinatorial results.

with A. Sepúlveda.



Figure: Uniform random tree of size 20 containing the origin on \mathbb{Z}^2 .

Tree-decorated planar maps: combinatorial results.

with A. Sepúlveda.

Figure: Dynamic on trees of size 10000.

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Particle systems and maps

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(b) Unif. tree-decorated quad. 90k faces and tree of size 500.

(a) tree-decorated quad. 10 faces, tree of size 6.

Map

- A face= A connected component of the complement of the edges.
- The **root-edge**= distinguished half edge.
- The **root-face**= face to the left of the root-edge.
- Degree of a face= number of adjacent edges to it.





Figure: Same graph, different embeddings on the sphere.

Particle systems and maps

Spanning tree-decorated maps

A (f, a) tree-decorated map is a pair $(\mathfrak{m}, \mathfrak{t})$ where:

- \mathfrak{m} is a rooted map with f faces.
- t is a submap of \mathfrak{m} ($\mathfrak{t} \subset_M \mathfrak{m}$).
- t is a tree with *a* edges.
- t contains the root-edge of m.



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It interpolates: In the case of quadrangulations

- $\underline{a = 1 \rightarrow}$ quadrangulations with f faces. [Tutte '60, Bender & Canfield '94, Cori-Vauquelin-Schaeffer '98, Schaeffer '97, Bettinelli '15]
- $\underline{a = f + 1}$ spanning-tree decorated quadrangulations with f faces. [Mullin '67, Walsh & Lehman '72, Cori et al '86; Bernardi '06]

Theorem (F. & Sepúlveda '19)

The number of (f, a) tree-decorated quadrangulations is

$$3^{f-a} \frac{(2f+a-1)!}{(f+2a)!(f-a+1)!} \frac{2a}{a+1} {3a \choose a,a,a}$$

We also count

- (f, a) tree-decorated triangulations.
- Maps (triangulations and quadrangulations) with a simple boundary decorated in a subtree.
- Forest-decorated maps.
- "Tree-decorated general maps".

A **planar tree** is a rooted map with one face.

Number of planar trees with a edges

$$\mathcal{C}_{a} = \frac{1}{a+1} \binom{2a}{a}.$$



Quadrangulations with a simple boundary

Number of rooted-quadrangulations with:

- f internal faces.
- **simple boundary** of size 2*p* (root-face of degre 2*p*).

$$\frac{3^{f-p}2p}{(f+2p)(f+2p-1)}\binom{2f+p-1}{f-p+1}\binom{3p}{p}.$$

Analytic [Bouttier & Guitter '09] and bijective [Bernardi & Fusy '17].



Bijection

Theorem (F. & Sepúlveda '19)

The set of (f, a) tree-decorated maps is in bijection with (the set of maps with a simple boundary of size 2a and f interior faces) \times (the set of trees with a edges).

The bijection makes a correspondence between:

Tree-decorated map]		[Map with a boundary, Tree]
aces of degree <i>q</i>	\longleftrightarrow	Internal faces of degree q
nternal vertices of degree d	\longleftrightarrow	Internal vertices of degree d
nternal edges	\longleftrightarrow	Internal edges
Corner of the tree	\longleftrightarrow	Boundary vertices.

- We can restrict the bijection to q-angulations.
- It can be restricted to some subfamilies of trees:
 - Binary tree- decorated Maps.
 - SAW decorated maps (Already done by Caraceni & Curien).

Tree-decorated planar maps: local limits.

Notation: $q_f^a = \text{Unif. tree-decorated quad. with } f$ faces and a tree of size a. Consider:

- $B_r(\mathfrak{m}) = \text{ball of radius } r \text{ from the root-vertex.}$
- \mathcal{M} = set of (locally finite) maps.

We endowed \mathcal{M} with the (local) topology induced by

 $d_{\mathsf{loc}}(\mathfrak{m}_1,\mathfrak{m}_2) = (1 + \mathsf{sup}\{r \ge 0 : \mathsf{B}_r(\mathfrak{m}_1) = \mathsf{B}_r(\mathfrak{m}_2)\})^{-1}$

Proposition

The space $(\overline{\mathcal{M}}, d_{\mathsf{loc}})$ is Polish (metric, separable and complete).

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Result

Notation: $q_f^a = \text{Unif. tree-decorated quad. with } f$ faces and a tree of size a.

Theorem (F. & Sepúlveda '19+)

$$\mathfrak{q}_f^a \xrightarrow[local, f \to \infty]{(d)} \mathfrak{q}_\infty^a \xrightarrow[local, a \to \infty]{(d)} \mathfrak{q}_\infty^\infty$$

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Uniform Trees

 \mathfrak{t}_a = Unif. tree with *a* edges.



Uniform quadrangulation with a boundary

 $q_{f,p}^S =$ Unif. quadrangulations with a simple boundary of size 2p and f faces.

Theorem (Curien & Miermont '12)

$$\mathfrak{q}_{f,p}^S \xrightarrow[local(f \to \infty)]{} \mathfrak{q}_{\infty,p}^S \xrightarrow[local(p \to \infty)]{} UIHPQ^S$$



Figure: sketch of a $UIHPQ^{S}$.

Local limit results

Notation: $q_f^a = \text{Unif. tree-decorated quad. with } f$ faces and a tree of size a.

Theorem (F. & Sepúlveda '19+) $q_{f}^{a} \xrightarrow{(d)}_{local, f \to \infty} q_{\infty}^{a} \xrightarrow{(d)}_{local, a \to \infty} q_{\infty}^{\infty}$ $q_{\infty}^{\infty} \text{ is the "gluing" of } t_{\infty} \text{ and } UIHPQ^{S}.$

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Definition

Given T, a distribution μ is said to be *invariant* if $\eta_t \sim \mu$ for any $t \ge 0$, when $\eta_0 \sim \mu$.



Well definition of PS:

Can we define a Markov process with jumps according to \top ?

When well defined, there is a correspondence between G_T Markovian generator and $\{P_t\}_{t\geq 0}$ Markovian semigroup; and the following are satisfied

$$\mu_t f = \mu_0 P_t f$$
$$\frac{\partial \mu_t f}{\partial t} = \int G_T f d\mu_t$$

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$$\mu f = \mu P_t f$$
$$\frac{\partial \mu_t f}{\partial t} = \int G_T f d\mu = 0$$

Application

Full characterization of (M, T) such that M is invariant by T. Case 2 colors $(\kappa = 2)$, memory 1 (m = 1) and range 2 (L = 2).

```
Cycle7MT:=proc(a,b,c,d) option remember: local Vec:
                      Vec :=[ a, b, c, d, 0, 0, 0]:
                      return( simplify( add(Z4( [seq( Vec[modu(i +i, 7)], i=1..4) ] ), i=1..7));
         end:
  >
         for i in {0,1} do M[i,0]:=1-M[i,1]: od:
 >
        SystemEquation := { seq(Cycle7MT(op(u)), u in ensem(4,K)), seq(M[op(u)]^*q[op(u)]^-1, u in ensem(2,K)), (M[0,1]-M[1,1])^*x-1}:
        PolynomialSystem:= map(x-> numer(normal(x)), SystemEquation): # numerators only
        Variables:= seg(g[op(u)].u in ensem(2.K)).x, seg(seg(M[i,i],i=0.,K-1),i=1.,K-1) . NonZeroT :
         *************
         # arobner
        G:= Basis(PolynomialSystem,plex( Variables)):
         Affiche(G,2000);
         unassign('M'); # for further computations
                                                                                                                                                                                                                                                                    K := 2
                                                                                                                                                     "Parameters = NonZeroTransition", t_{0,1'} t_{0,2'} t_{0,3'} t_{1,0'} t_{1,2'} t_{1,3'} t_{2,0'} t_{2,1'} t_{2,3'} t_{3,0'} t_{3,1'} t_{3,2'}
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Generalization of Gaussian elimination for linear systems.

• For a set of polynomials \mathcal{P} , the Grobner basis finds a "minimal representation" of the ideal generated by this set in the ring of polynomials with coefficients in a field (here \mathcal{C}).

•"Minimal representation" = "small" generator of the ideal.

•"Small"= with respect to a certain order of monomials. Basically a way to do the sequence of divisions of polynomials (which is a generalized version of Gaussian division).

•If the result of a Grobner basis gives $\{1\}$, it means that there is no solution (in a sense 1=0 generates the ideal).

 \bullet If the result is different that the constant, then it assures the existence of solutions in the field ${\cal C}.$

Multi-dimensional case: invariance of product measures



Consider the three following sets:

 $\Gamma_0 = \{(0,0), (0,1), (1,0)\}, \ \ \Gamma_1 = \Gamma_0 \cup \{(2,0)\}, \ \ \Gamma_2 = \Gamma_1 \cup \{(1,1)\}.$

Theorem 2D

Let $\kappa < +\infty$. Consider ρ a probability distribution with full support on E_{κ} and $T = [\mathcal{T}_{u}v]_{u,v \in E_{\kappa}^{Sq}}$ a JRM indexed by 2x2 squares. The measure $\rho^{\mathbb{Z}^{2}}$ is invariant by T on \mathbb{Z}^{2} iff the two following conditions hold simultaneously: • NLine^{ρ ,T} \equiv 0 on $E_{\kappa}^{\Gamma_{0}}$, • for any $x \in E_{\kappa}^{\Gamma_{2}}$,

$$\mathsf{NLine}^{\rho,\mathsf{T}}(x) - \mathsf{NLine}^{\rho,\mathsf{T}}(x(\Gamma_1)) = 0.$$

(1)

Scaling limit conjecture

Conjecture (F. & Sepúlveda '19+)

Let $(\mathfrak{m},\mathfrak{t})$ be a Unif. tree-decorated map with f faces and boundary of size $\mathfrak{a}(f)$ with $\mathfrak{a}(f) = O(f^{\alpha})$. Depending on α as $f \to \infty$ $\begin{pmatrix} (\mathfrak{m},\mathfrak{t}), \frac{\mathsf{d}_{\mathsf{map}}}{f^{\beta}} \end{pmatrix} \xrightarrow{(d)} \begin{cases} Brownian map & \text{if } \alpha < 1/2, \beta = 1/4 (Proved) \\ Shocked map & \text{if } \alpha = 1/2, \beta = 1/4 (In \text{ progress}) \\ Tree-decorated map & \text{if } \alpha > 1/2, \\ \beta = (2\chi - \frac{1}{2}) \alpha - \chi + \frac{1}{2} \end{cases}$

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Shocked map

Shocked map properties:

- It is not degenerated (Proved).
- It should be the gluing of a Brownian disk and a CRT.
- Hausdorff dim. 4 (Proved).
- The tree has Hausdorff dim. 2 (In progress, \leq 2 proved).
- Homeomorphic to \mathbb{S}^2 . (Proved).



Figure: Unif. (90k,500) tree-decorated quadrangulation.

Brownian Disk

 $\mathfrak{q}_{f,p}$ = Unif. quadrangulations with boundary 2p and f faces. For a sequence $(p(f))_{f\in\mathbb{N}}$, define $\bar{p} = \lim p(f)f^{-1/2}$ as $f \to \infty$.

Theorem (Scaling limit (Bettinelli '15))

$$\begin{pmatrix} \mathfrak{q}_{f,p(f)}, \frac{\mathsf{d}_{\mathsf{map}}}{s(f,p(f))} \end{pmatrix} \xrightarrow{(d)}_{GH} \begin{cases} \text{Brownian map} & \text{if } s(f,p(f)) = f^{1/4} \text{ and } \bar{p} = 0 \\ \text{Brownian disk} & \text{if } s(f,p(f)) = f^{1/4} \text{ and } \bar{p} \in (0,+\infty) \\ CRT & \text{if } s(f,p(f)) = 2p(f)^{1/2} \text{ and } \bar{p} = \infty \end{cases}$$

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Properties (Bettinelli & Miermont '15)

Brownian disk properties

- The boundary is simple.
- Hausdorff dim. 4 in the interior, 2 in the boundary.
- Homeomorphic to the disk 2d.



Unif. quad. with 30k interior faces and boundary 173.

Brownian Disk

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$$\left(\mathfrak{q}_{f,p(f)}^{S}, \frac{\mathsf{d}_{\mathsf{map}}}{s(f,p(f))}\right) \xrightarrow{(d)}_{GH}$$

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