

# SCALING LIMITS OF STOCHASTIC PARTICLE SYSTEMS

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Équipe PARADYSE

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# SHORT CURRICULUM

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## ... BEFORE THE PHD

- ▷ 2009 – 2013 : Student at **ENS Paris**
- ▷ 2011 – 2012 : "Probabilité et modèles aléatoires" **Master's degree at Paris VI** univ.
- ▷ 2013 – 2016 : **PhD at CMAP**, Polytechnique with Thierry Bodineau

## ... AND AFTER

- ▷ 2016 – 2018 : **Post-doc at IMPA**, Rio de Janeiro with Claudio Landim
- ▷ 2018 – 2020 : **Post-doc at Roma Tre**, Rome with Alessandro Giuliani
- ▷ 2020 – today : **ISFP at INRIA Lille**, in the PARADYSE project-team

# PARADYSE PROJECT TEAM

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## PARADYSE : PARTicles And DYNamical SystEMs

### THREE MAIN RESEARCH AXIS :

- I) **Time asymptotics**: Stationary states, solitons, and (in)stability issues (*PDEs*)
- II) Understanding **macroscopic** systems in terms of **microscopic** dynamics (*PDEs, Probability and Mathematical Physics*)
- III) **Numerical methods**: analysis and simulations (*Numerics for PDEs and Probability*)

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# COMPLEX PHYSICAL SYSTEMS

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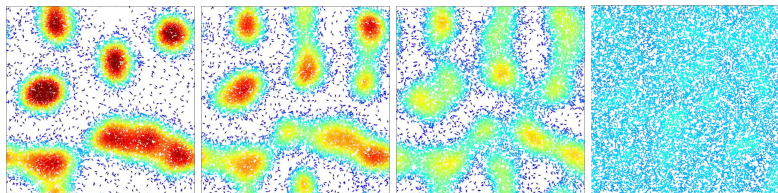
- ▷ Many complex systems are composed of a **large number of microscopic or mesoscopic** components

# LINKING DESCRIPTION LEVELS

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**PROBLEM** : These microscopic components and their evolution is typically **not visible nor tractable** at our scale, but the macroscopic evolution of the system stems from its microscopic evolution.

- ▷ **Microscopic** level : e.g. particles suffer elastic collisions  
*Problem* : too many ( $\sim 10^{23}$ ) degrees of freedom
- ▷ **Macroscopic** level : diffusion (heat equation).



**OBJECTIVE** : Model such **complex systems** to give a mathematical justification to their **macroscopic behavior**.

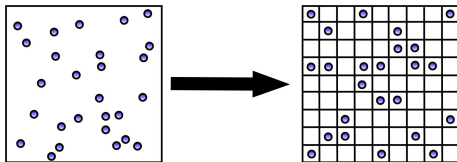
# LATTICE GASES

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**QUESTION** : how can one link **microscopic** and **macroscopic** scales ?

Need to **model** and **simplify** the physical system :

- ▷ Space and time **discretisation**. *Example* : exclusion processes, where each site of the lattice is either **occupied by a particle**, or **empty**.



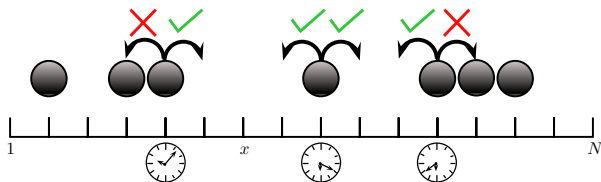
- ▷ **Deterministic** dynamics modeled by **stochastic** dynamics: particles jump at random times in random directions.

This type of models is **called stochastic lattice gases**

# SYMMETRIC SIMPLE EXCLUSION PROCESS (SSEP)

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**CONFIGURATION:** each site  $x$  of the lattice  $\{1, \dots, N\}$  is either **empty** ( $\eta_x = 0$ ) or **occupied** ( $\eta_x = 1$ ).



**DYNAMICS:** each particle jumps at random times, either to the **left or to the right** w.p.  $1/2$ .

- ▷ If the target site is already occupied, the **jump is cancelled** (exclusion rule).

# HYDRODYNAMIC LIMIT

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We see the lattice as a discretization of the segment  $[0, 1]$ , and define, for  $u = x/N \in [0, 1]$ , the scaling limit  $\rho(t, u)$  of  $\eta_x(t)$ ,

$$\rho(t, u) = \lim_{N \rightarrow \infty} \frac{1}{2\sqrt{N}} \sum_{|y-x| \leq \sqrt{N}} \eta_y(t).$$

The **hydrodynamic limit** for the SSEP is given by the **heat equation**

$$\partial_t \rho = \partial_u^2 \rho$$

with initial condition

$$\rho(0, \cdot) = \rho_0$$

set by the initial microscopic configuration  $\eta(0)$ .

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## SOME COMMENTS

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- ▷ The terminology **hydrodynamic limit** stands for this procedure, of associating a *microscopic dynamics* with a *PDE* describing its macroscopic behavior.
- ▷ **Hydrodynamic limits** are the rough equivalent, for particle systems, of the **law of large numbers**, since it states that

$$\underbrace{\rho(t, u)}_{\text{deterministic mean}} = \lim_{N \rightarrow \infty} \frac{1}{2\sqrt{N}} \underbrace{\sum_{|y-x| \leq \sqrt{N}} \eta_y(t)}_{\text{average of random quantities}} .$$

- ▷ It can give access to physical phenomena such as **phase transitions** and **phase diagrams**, starting from a microscopic dynamics.



# EXAMPLES OF APPLICATION

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Exclusion processes like the SSEP can serve as **toy models** for various physical phenomena, e.g.:

- ▷ Heat transfer in **non-equilibrium systems** with boundary interactions.



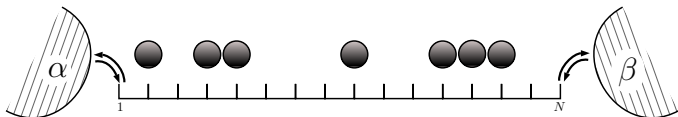
- ▷ Liquid-solid phase transition with **Kinetically constrained** models.



# NON-EQUILIBRIUM MODELS

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To maintain a system out of equilibrium, we put it in contact **thermostats/particle reservoirs**. They are modeled for the SSEP by creation annihilation dynamics at the boundaries.

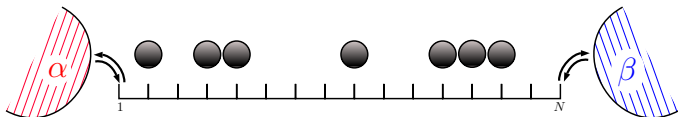


- ▷ At random time, site  $x = 1$  is replaced by a *Bernoulli*( $\alpha$ ), and site  $x = N$  by *Bernoulli*( $\beta$ ).
- ▷ The hydrodynamic behavior in the **bulk**  $u \in (0, 1)$  is still given by the heat equation  $\partial_t \rho = \partial_u^2 \rho$ .
- ▷ The **effect of the boundary dynamics** on the hydrodynamic limit depends on the **mean frequency** of the boundary updates.

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## SUBCRITICAL PHASE

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*Simulation by Hugo Dorfsman*

- ▷ "Subcritical" frequency: **Neumann** boundary conditions

$$\partial_u \rho(t, 0) = \partial_u \rho(t, 1) = 0.$$

## CRITICAL PHASE

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*Simulation by Hugo Dorfsman*

- ▷ "Critical" frequency: **Robin** boundary conditions

$$\partial_u \rho(t, 0) = \rho(t, 0) - \alpha, \quad \partial_u \rho(t, 1) = \beta - \rho(t, 1).$$

# SUPERCritical PHASE

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*Simulation by Hugo Dorfsman*

- ▷ "Supercritical" frequency: **Dirichlet** boundary conditions

$$\rho(t, 0) = \alpha, \quad \rho(t, 1) = \beta.$$

## A FEW RELATED WORKS

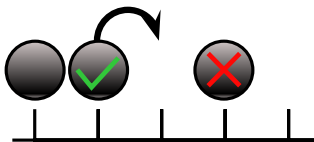
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- ▷ *Hydrodynamic limit of boundary driven exclusion processes with nonreversible boundary dynamics*, E', J. Stat. Phys., 172, pp 1327–1357 (2018).
- ▷ *Hydrodynamics for SSEP with non-reversible slow boundary dynamics*, E', Gonçalves, and Nahum, J. Stat. Phys., 181, pp 1433–1469 (2020) and ALEA v.17, pp 791-823 (2020).
- ▷ *Steady state large deviations for one-dimensional, symmetric exclusion processes in weak contact with reservoirs*, Bouley, E', and Landim, Arxiv Preprint 2107.06606 (2021).

# KINETICALLY CONSTRAINED LATTICE GASES

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**QUESTION:** what happens when a kinetic constraint is added to the system ? example : **facilitated exclusion process** (FEP):



- ▷ A particle cannot jump to an occupied site (*exclusion rule*)
- ▷ A particle cannot jump without occupied neighbor (*kinetic constraint*)

Because of the kinetic constraint, two typical particle behavior:

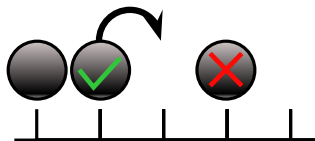
- ▷ At **low density** , they quickly freezes
- ▷ At **high density** ( $\rho > 1/2$ ), they roughly behave like in the SSEP
- ▷ The **critical density** is when every other site is occupied, i.e.  $1/2$



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# HYDRODYNAMIC LIMIT FOR THE FEP

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The two microscopic phases translate as macroscopic phases at the hydrodynamic limit:

- ▷ in the **subcritical** phase ( $\rho < 1/2$ ), the system is **frozen**
- ▷ in the **supercritical** phase ( $\rho > 1/2$ ), the system is **diffusive**

The hydrodynamic limit is a **Stefan problem**, where the diffusive phase invades the frozen phase through critical interfaces:

$$\partial_t \rho = \partial_u^2 \left\{ \frac{2\rho - 1}{\rho} \mathbf{1}_{\{\rho \geq 1/2\}} \right\}$$

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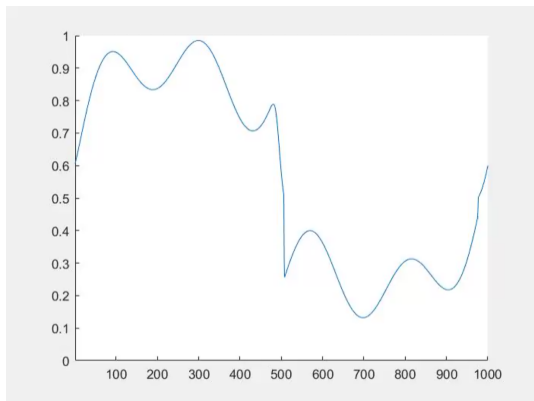
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## A FEW RELATED WORKS

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- ▷ *Hydrodynamic limit for a facilitated exclusion process*, Blondel, E', Sasada and Simon, Annales de l'IHP - Prob. et Stat., v.56, Iss.1, pp 667–714, (2020).
- ▷ *Stefan problem for a non-ergodic facilitated exclusion process*, Blondel, E' and Simon, Prob. and Math. Phys., v.2, Iss.1, pp 127-178 (2021).
- ▷ *Mapping hydrodynamics for the facilitated exclusion and zero-range processes*, E', Simon and Zhao, Arxiv Preprint 2202.04469 (2022).

## TAKE-AWAY MESSAGE

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- ▷ Stochastic lattice gases provide useful **mathematically tractable models** for a wide variety of physical behavior.
- ▷ Scaling limits, and hydrodynamic limits in particular, can be used to understand the **macroscopic behavior** of lattice gases.
- ▷ In some cases, this allows to get access, from the microscopic dynamics, to **phase diagrams** and other physically relevant information.