Emergence of collective dynamics from a purely stochastic orogin

Yann Brenier CNRS-Centre de Mathématiques Laurent SCHWARTZ Ecole Polytechnique FR 91128 Palaiseau. Transport phenomena in collective dynamics, FIM, ETH, ZÜRICH, 1-4 Nov 2016.

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 1 / 18

イロト イポト イラト イラト

We will discuss the possible emergence of non-trivial systems of interacting particles out of pure noise, without local interactions.

From pure noise to non-trivial interactions

イロト イポト イラト イラト

We will discuss the possible emergence of non-trivial systems of interacting particles out of pure noise, without local interactions. Our starting point will be the stochastic model of a brownian point cloud in the Euclidean space.

A D N A D N A D N A D N B D

We will discuss the possible emergence of non-trivial systems of interacting particles out of pure noise, without local interactions. Our starting point will be the stochastic model of a brownian point cloud in the Euclidean space. The emerging models will be

From pure noise to non-trivial interactions

We will discuss the possible emergence of non-trivial systems of interacting particles out of pure noise, without local interactions. Our starting point will be the stochastic model of a brownian point cloud in the Euclidean space.

- The emerging models will be
- i) some simple rank-based dynamics in one space dimension,

We will discuss the possible emergence of non-trivial systems of interacting particles out of pure noise, without local interactions. Our starting point will be the stochastic model of a brownian point cloud in the Euclidean space.

- The emerging models will be
- i) some simple rank-based dynamics in one space dimension,
- ii) some models of inviscid chemotaxis generalizing the inviscid Burgers equation in higher dimensions,

A D K A B K A B K A B K B B

We will discuss the possible emergence of non-trivial systems of interacting particles out of pure noise, without local interactions. Our starting point will be the stochastic model of a brownian point cloud in the Euclidean space.

- The emerging models will be
- i) some simple rank-based dynamics in one space dimension,
- ii) some models of inviscid chemotaxis generalizing the inviscid Burgers equation in higher dimensions,
- ii) the classical Newtonian model of gravitation (*).

We will discuss the possible emergence of non-trivial systems of interacting particles out of pure noise, without local interactions. Our starting point will be the stochastic model of a brownian point cloud in the Euclidean space.

- The emerging models will be
- i) some simple rank-based dynamics in one space dimension,
- ii) some models of inviscid chemotaxis generalizing the inviscid Burgers equation in higher dimensions,
- ii) the classical Newtonian model of gravitation (*).

(*) This last statement might be considered as a VERY ROUGH CARICATURE of the claim, in String Theory, that the Einstein equation is just an output of the quantization of strings.

AN EXAMPLE OF RANK-BASED DYNAMICS IN 1D

Consider *N* taxpayers labelled by $\alpha \in \{1, \dots, N\}$. $Z_n(\alpha) \ge 0$ is the taxable income of year *n*. $\sigma_n(\alpha) \in \{1, \dots, N\}$ is the rank of $Z_n(\alpha)$ in $\{Z_n(1), \dots, Z_n(N)\}$.

From pure noise to non-trivial interactions

イロト イポト イラト イラト

AN EXAMPLE OF RANK-BASED DYNAMICS IN 1D

Consider *N* taxpayers labelled by $\alpha \in \{1, \dots, N\}$. $Z_n(\alpha) \ge 0$ is the taxable income of year *n*. $\sigma_n(\alpha) \in \{1, \dots, N\}$ is the rank of $Z_n(\alpha)$ in $\{Z_n(1), \dots, Z_n(N)\}$.

Model: $Z_{n+1}(\alpha) = Z_n(\alpha) \exp(r\tau) \exp(-\mathcal{G}(\sigma_n)\tau)$ with a uniform growth rate *r* for all incomes and a tax rate \mathcal{G} that depends only on the rank.

From pure noise to non-trivial interactions

イロト イポト イラト イラト 一日

AN EXAMPLE OF RANK-BASED DYNAMICS IN 1D

Consider *N* taxpayers labelled by $\alpha \in \{1, \dots, N\}$. $Z_n(\alpha) \ge 0$ is the taxable income of year *n*. $\sigma_n(\alpha) \in \{1, \dots, N\}$ is the rank of $Z_n(\alpha)$ in $\{Z_n(1), \dots, Z_n(N)\}$.

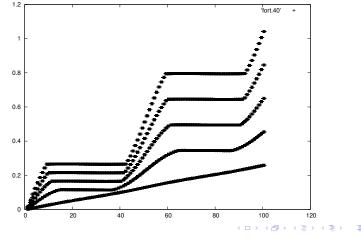
Model: $Z_{n+1}(\alpha) = Z_n(\alpha) \exp(r\tau) \exp(-\mathcal{G}(\sigma_n)\tau)$ with a uniform growth rate *r* for all incomes and a tax rate \mathcal{G} that depends only on the rank.

This can be related to hyperbolic scalar conservation laws, the formation of shock waves corresponding to the emergence of classes.

Example: formation of 2 classes

Evolution of the income distribution, starting from a linear profile, with formation of two classes (i.e. two "shocks" in terms of conservation laws).

(Data: $N = 100, \tau = 0, 01, F(u) = u + \frac{\sin(4\pi u)}{4}, u \in [0, 1], t \in [0, 1], \tau = 0, 01.$)



Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 4 / 18

RANK BASED DYNAMICS IN 1D: (old) RESULTS

For the slightly more general model (with pseudo-noise in option)

$$X_{n+1}(\alpha) = X_n(\alpha) + \tau F(w) + (-1)^{(N-1)w} \sqrt{2\eta\tau} R(w), \quad w = \frac{\sigma_n(\alpha) - 1}{N - 1}$$

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 5 / 18

RANK BASED DYNAMICS IN 1D: (old) RESULTS

For the slightly more general model (with pseudo-noise in option)

$$X_{n+1}(\alpha) = X_n(\alpha) + \tau F(w) + (-1)^{(N-1)w} \sqrt{2\eta\tau} R(w), \quad w = \frac{\sigma_n(\alpha) - 1}{N - 1}$$

1) Asymptotic behavior $\tau \ll 1$, $N \gg 1$, for $u_n(x) = \frac{1}{N} \sum_{\alpha=1}^{N} 1_{\{x > X_n(\alpha)\}}$

 $\partial_t u + \partial_x(f(u)) = \eta \ \partial_{xx}(r(u)), \ F(u) = f'(u), \ R(u) = r'(u) \ge 0$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 5 / 18

イロト イポト イヨト イヨト 二日

RANK BASED DYNAMICS IN 1D: (old) RESULTS

For the slightly more general model (with pseudo-noise in option)

$$X_{n+1}(\alpha) = X_n(\alpha) + \tau F(w) + (-1)^{(N-1)w} \sqrt{2\eta\tau} R(w), \quad w = \frac{\sigma_n(\alpha) - 1}{N - 1}$$

1) Asymptotic behavior $\tau \ll 1$, $N \gg 1$, for $u_n(x) = \frac{1}{N} \sum_{\alpha=1}^{N} 1_{\{x > X_n(\alpha)\}}$

$$\partial_t u + \partial_x(f(u)) = \eta \ \partial_{xx}(r(u)), \ F(u) = f'(u), \ R(u) = r'(u) \ge 0$$

2) A unique "class" emerges whenever $\forall u \in]0, 1[, f(u) > f(0) = f(1)$.

Y.B. CRAS 1981-82, SINUM 1984, thèse d'état 1986, J. Comp. Appl. Math. 1990.

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

CORE OF THE TALK: STOCHASTIC ORIGIN OF RANK-BASED DYNAMICS AND NEWTONIAN GRAVITATION

We consider *N* particles in \mathbb{R}^d subject to independent Brownian motions and issued from a cubic lattice $\{A(\alpha) \in \mathbb{R}^d, \alpha = 1, \dots, N\}$

$$Y_t(\alpha) = A(\alpha) + \sqrt{\epsilon}B_t(\alpha), \quad \alpha = 1, \cdots, N$$

We call "point cloud at time *t*" the collection of positions $\{Y_t(\alpha)\}\$ reached by these particles, disregarding their label $\alpha \in \{1, \dots, N\}$.

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

イロト イポト イラト イラト

CORE OF THE TALK: STOCHASTIC ORIGIN OF RANK-BASED DYNAMICS AND NEWTONIAN GRAVITATION

We consider *N* particles in \mathbb{R}^d subject to independent Brownian motions and issued from a cubic lattice $\{A(\alpha) \in \mathbb{R}^d, \alpha = 1, \dots, N\}$

$$Y_t(\alpha) = A(\alpha) + \sqrt{\epsilon}B_t(\alpha), \quad \alpha = 1, \cdots, N$$

We call "point cloud at time *t*" the collection of positions $\{Y_t(\alpha)\}$ reached by these particles, disregarding their label $\alpha \in \{1, \dots, N\}$. In other words, the cloud lives in $(\mathbb{R}^d)^N / S_N$, where S_N is the symmetric group (of all permutations of the *N* first integers).

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 6 / 18

WHERE IS THE BROWNIAN CLOUD AT TIME T?

At a fixed time T > 0, the probability for the moving cloud

$$Y_t(\alpha) = A(\alpha) + \sqrt{\epsilon}B_t(\alpha), \quad \alpha = 1, \cdots, N$$

to be observed at $X_T = (X_T(\alpha), \ \alpha = 1, \cdots, N) \in \mathbb{R}^{dN}$ has density

$$\frac{1}{Z} \sum_{\sigma \in \mathcal{S}_N} \prod_{\alpha=1}^N \exp(-\frac{|X_T(\alpha) - \mathcal{A}(\sigma(\alpha))|^2}{2\epsilon T})$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 7 / 18

イロト イポト イラト イラト

WHERE IS THE BROWNIAN CLOUD AT TIME T?

At a fixed time T > 0, the probability for the moving cloud

$$Y_t(\alpha) = A(\alpha) + \sqrt{\epsilon}B_t(\alpha), \quad \alpha = 1, \cdots, N$$

to be observed at $X_T = (X_T(\alpha), \ \alpha = 1, \dots, N) \in \mathbb{R}^{dN}$ has density

$$\frac{1}{Z}\sum_{\sigma\in\mathcal{S}_N}\prod_{\alpha=1}^N\exp(-\frac{|X_T(\alpha)-A(\sigma(\alpha))|^2}{2\epsilon T})=\frac{1}{Z}\sum_{\sigma\in\mathcal{S}_N}\exp(-\frac{||X_T-A_\sigma||^2}{2\epsilon T})$$

From pure noise to non-trivial interactions

< ロ > < 同 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ >

WHERE IS THE BROWNIAN CLOUD AT TIME T?

At a fixed time T > 0, the probability for the moving cloud

$$Y_t(\alpha) = A(\alpha) + \sqrt{\epsilon}B_t(\alpha), \quad \alpha = 1, \cdots, N$$

to be observed at $X_T = (X_T(\alpha), \ \alpha = 1, \cdots, N) \in \mathbb{R}^{dN}$ has density

$$\frac{1}{Z} \sum_{\sigma \in \mathcal{S}_N} \prod_{\alpha=1}^N \exp(-\frac{|X_T(\alpha) - A(\sigma(\alpha))|^2}{2\epsilon T}) = \frac{1}{Z} \sum_{\sigma \in \mathcal{S}_N} \exp(-\frac{||X_T - A_\sigma||^2}{2\epsilon T})$$

 $Z = N! \sqrt{2\pi\epsilon T}^{n\alpha}, \quad |\cdot|$ and $||\cdot|| =$ euclidean norms in \mathbb{R}^a and \mathbb{R}^{na} .

Here, we crucially used that the particles are indistinguishable!!!

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

イロト イポト イラト イラト

VANISHING NOISE AND APPARENT MOTION

$$-\lim_{\epsilon \to 0} \epsilon \log \frac{1}{Z} \sum_{\sigma \in \mathcal{S}_N} \exp(-\frac{||X_T - A_\sigma||^2}{2\epsilon T}) = \frac{1}{2T} \inf_{\sigma \in \mathcal{S}_N} ||X_T - A_\sigma||^2$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 8 / 18

イロト イポト イヨト イヨト

VANISHING NOISE AND APPARENT MOTION

$$-\lim_{\epsilon \to 0} \epsilon \log \frac{1}{Z} \sum_{\sigma \in \mathcal{S}_N} \exp(-\frac{||X_T - A_\sigma||^2}{2\epsilon T}) = \frac{1}{2T} \inf_{\sigma \in \mathcal{S}_N} ||X_T - A_\sigma||^2$$

As a simple consequence of the "large deviation principle", we note that, as $\epsilon \rightarrow 0$, the observer at time T feels that the particles have travelled along straight lines by "optimal transport"

$$X_t = (1 - \frac{t}{T})A_{\sigma_{opt}} + \frac{t}{T}X_T, \ \sigma_{opt} = \operatorname{Argsup}_{\sigma \in \mathcal{S}_N} ((X_T, A_\sigma)), \ t \in [0, T]$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 8 / 18

イロト イポト イラト イラト

LAW AND DISORDER!

From the apparent motion of the cloud up to time T

$$X_t = (1 - \frac{t}{T})A_{\sigma_{opt}} + \frac{t}{T}X_T, \quad \sigma_{opt} = \operatorname{Arginf}_{\sigma \in S_N} ||X_T - A_{\sigma}||^2$$

we easily deduce
$$\sigma_{opt} = \operatorname{Arginf}_{\sigma \in S_N} ||X_t - A_{\sigma}||^2, \quad \forall t \in]0, T]$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 9 / 18

イロト イポト イヨト イヨト

LAW AND DISORDER!

From the apparent motion of the cloud up to time T

$$X_t = (1 - \frac{t}{T})A_{\sigma_{opt}} + \frac{t}{T}X_T$$
, $\sigma_{opt} = \operatorname{Arginf}_{\sigma \in S_N} ||X_T - A_{\sigma}||^2$

we easily deduce
$$\sigma_{opt} = \operatorname{Arginf}_{\sigma \in S_N} ||X_t - A_{\sigma}||^2, \quad \forall t \in]0, T]$$

This leads to the apparent "law"

$$\frac{dX_t}{dt} = \frac{X_t - A_{\sigma_{opt}}}{t} , \quad \sigma_{opt} = \operatorname{Arginf}_{\sigma \in \mathcal{S}_N} ||X_t - A_{\sigma}||^2, \quad t \in]0, T]$$

just resulting of the observation of a purely random motion!

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

ZELDOVICH MODEL AND INVISCID CHEMOTAXIS

$$t = e^{\theta}$$
 leads to $\frac{dX_{\theta}}{d\theta} = X_{\theta} - A_{\sigma_{opt}}$, $\sigma_{opt} = \operatorname{Arginf}_{\sigma \in S_N} ||X_{\theta} - A_{\sigma}||^2$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 10 / 18

ZELDOVICH MODEL AND INVISCID CHEMOTAXIS

$$t = e^{\theta}$$
 leads to $\left| \frac{dX_{\theta}}{d\theta} = X_{\theta} - A_{\sigma_{opt}}, \sigma_{opt} = \operatorname{Arginf}_{\sigma \in S_N} ||X_{\theta} - A_{\sigma}||^2 \right|$

Using optimal transport tools, we find, as formal continuous limit,

$$\partial_{\theta}\rho - \nabla \cdot (\rho \nabla_{x} \varphi) = \mathbf{0}, \ \det(I + D_{x}^{2} \varphi) = \rho; \ \rho \geq \mathbf{0}, \ \varphi \in \mathbb{R}, \ (\theta, x) \in \mathbb{R}^{1+d}$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 10 / 18

(I) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1)) < ((1))

ZELDOVICH MODEL AND INVISCID CHEMOTAXIS

$$t = e^{\theta}$$
 leads to $\left| \frac{dX_{\theta}}{d\theta} = X_{\theta} - A_{\sigma_{opt}}, \sigma_{opt} = \operatorname{Arginf}_{\sigma \in S_N} ||X_{\theta} - A_{\sigma}||^2 \right|$

Using optimal transport tools, we find, as formal continuous limit,

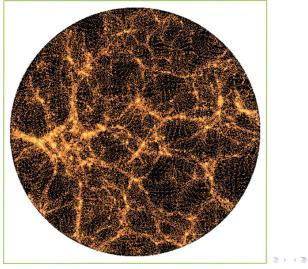
$$\partial_{\theta}\rho - \nabla \cdot (\rho \nabla_{x} \varphi) = 0, \ \det(I + D_{x}^{2} \varphi) = \rho; \ \rho \geq 0, \ \varphi \in \mathbb{R}, \ (\theta, x) \in \mathbb{R}^{1+d}$$

This is a multidimensional generalization of the rank based dynamics discussed at the beginning of this talk. It is equivalent to the Zeldovich model (1970) in Cosmology. It can also be seen as a fully nonlinear version of the (inviscid) chemotaxis model: $\partial_{\theta}\rho - \nabla \cdot (\rho \nabla_{x} \varphi) = 0$, $\Delta \varphi = \rho - \overline{\rho}$, $\overline{\rho} = \int \rho(t, x) dx = 1$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Monge-Ampère gravitation: a simulation of the Zeldovich model



Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 11 / 18

Last part: EN ROUTE TO NEWTON'S GRAVITY

We first observe that the probability density we found for the Brownian point cloud to be found at $X \in \mathbb{R}^{Nd}$ at time t > 0

$$\frac{1}{\textit{N}!\sqrt{2\pi\epsilon t}^{\textit{Nd}}}\sum_{\sigma\in\mathcal{S}_{\textit{N}}} \exp(-\frac{||\textit{X}-\textit{A}_{\sigma}||^{2}}{2\epsilon t}), \quad \textit{X}\in\mathbb{R}^{\textit{Nd}}$$

is just the solution $\rho(t, X)$ of the heat equation in \mathbb{R}^{Nd}/S_N

$$\frac{\partial \rho}{\partial t}(t,X) = \frac{\epsilon}{2} \bigtriangleup \rho(t,X), \quad \rho(t=0,X) = \frac{1}{N!} \sum_{\sigma \in \mathcal{S}_N} \delta(X - A_{\sigma}), \quad X \in \mathbb{R}^{Nd}$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

イロト イポト イラト イラト

Zürich, 4 Nov 2016

12/18

"SURFING THE HEAT WAVE"

$$\frac{\partial \rho}{\partial t}(t,X) = \frac{\epsilon}{2} \bigtriangleup \rho(t,X), \quad \rho(t=0,X) = \frac{1}{N!} \sum_{\sigma \in \mathcal{S}_N} \delta(X - A_{\sigma}), \quad X \in \mathbb{R}^{Nd}$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 13 / 18

"SURFING THE HEAT WAVE"

$$\frac{\partial \rho}{\partial t}(t,X) = \frac{\epsilon}{2} \bigtriangleup \rho(t,X), \quad \rho(t=0,X) = \frac{1}{N!} \sum_{\sigma \in \mathcal{S}_N} \delta(X - A_{\sigma}), \quad X \in \mathbb{R}^{Nd}$$

For arbitrarily chosen position $X_{t_0} \in \mathbb{R}^{Nd}$ at $t_0 > 0$, let us "surf" the "heat wave" by solving the ODE

$$\frac{dX_t}{dt} = v(t, X_t), \quad v(t, X) = -\frac{\epsilon}{2} \nabla_X \log \rho(t, X), \quad t \ge t_0$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 13 / 18

4 D K 4 B K 4 B K 4 B K

"SURFING THE HEAT WAVE"

$$\frac{\partial \rho}{\partial t}(t,X) = \frac{\epsilon}{2} \bigtriangleup \rho(t,X), \quad \rho(t=0,X) = \frac{1}{N!} \sum_{\sigma \in \mathcal{S}_N} \delta(X - A_{\sigma}), \quad X \in \mathbb{R}^{Nd}$$

For arbitrarily chosen position $X_{t_0} \in \mathbb{R}^{Nd}$ at $t_0 > 0$, let us "surf" the "heat wave" by solving the ODE

$$\frac{dX_t}{dt} = v(t, X_t), \quad v(t, X) = -\frac{\epsilon}{2} \nabla_X \log \rho(t, X), \quad t \ge t_0$$

This is an adaptation of de Broglie's "onde pilote" concept. As a matter of fact, a similar calculation also works for the free Schrödinger equation: $(i\partial_t + \Delta)\psi = 0, \quad \psi(0, X) = \sum_{\sigma} \exp(-||X - A_{\sigma}||^2/a^2), \quad v = \nabla \mathcal{I}m \log \psi$

Yann Brenier (CNRS)

A D N A D N A D N A D N B D

SURFING THE "HEAT WAVE" SYSTEM ... WITH ADDITIONAL NOISE!

Using $t = e^{2\theta}$, the "heat wave" ODE explicitly reads

$$\frac{dX_{\theta}}{d\theta} = v_{\epsilon}(\theta, X_{\theta}), \quad v_{\epsilon}(\theta, X) = X - \frac{\sum_{\sigma \in \mathcal{S}_{N}} A_{\sigma} \exp(\frac{-||X - A_{\sigma}||^{2}}{2\epsilon \exp(2\theta)})}{\sum_{\sigma \in \mathcal{S}_{N}} \exp(\frac{-||X - A_{\sigma}||^{2}}{2\epsilon \exp(2\theta)})}$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

14/18

SURFING THE "HEAT WAVE" SYSTEM ... WITH ADDITIONAL NOISE!

Using $t = e^{2\theta}$, the "heat wave" ODE explicitly reads

$$\frac{dX_{\theta}}{d\theta} = v_{\epsilon}(\theta, X_{\theta}) , \quad v_{\epsilon}(\theta, X) = X - \frac{\sum_{\sigma \in \mathcal{S}_{N}} A_{\sigma} \exp(\frac{-||X - A_{\sigma}||^{2}}{2\epsilon \exp(2\theta)})}{\sum_{\sigma \in \mathcal{S}_{N}} \exp(\frac{-||X - A_{\sigma}||^{2}}{2\epsilon \exp(2\theta)})}$$

To get Newton's gravitation, our key idea is now to consider large deviations of this ODE subject to additional noise:

$$\frac{dX_{\theta}}{d\theta} = v_{\epsilon}(\theta, X_{\theta}) + \sqrt{\eta} \frac{dB_{\theta}}{d\theta}$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016

14/18

THROUGH LARGE DEVIATION AND LEAST ACTION PRINCIPLES

we end up, as $\epsilon, \eta \rightarrow 0$, with the following dynamical system

$$\frac{d^2 X_{\theta}(\alpha)}{d\theta^2} = X_{\theta}(\alpha) - A(\sigma_{opt}(\alpha)) , \quad X_{\theta}(\alpha) \in \mathbb{R}^d, \ \alpha = 1, \cdots, N$$

$$\sigma_{opt} = \operatorname{Arginf}_{\sigma \in \mathcal{S}_N} \sum_{\alpha=1}^N |X_{\theta}(\alpha) - A(\sigma(\alpha))|^2$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 15 / 18

THROUGH LARGE DEVIATION AND LEAST ACTION PRINCIPLES

we end up, as $\epsilon, \eta \rightarrow 0$, with the following dynamical system

$$\frac{d^2 X_{\theta}(\alpha)}{d\theta^2} = X_{\theta}(\alpha) - A(\sigma_{opt}(\alpha)) , \quad X_{\theta}(\alpha) \in \mathbb{R}^d, \ \alpha = 1, \cdots, N$$

$$\sigma_{opt} = \operatorname{Arginf}_{\sigma \in \mathcal{S}_N} \sum_{\alpha=1}^N |X_{\theta}(\alpha) - A(\sigma(\alpha))|^2$$

involving, at each time *t*, a discrete optimal transport problem which leads, in the limit $N \rightarrow \infty$, to a Monge-Ampère equation.

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

イロト 不得 トイヨト イヨト 二日

Zürich, 4 Nov 2016

15/18

$$\partial_{\theta} f(\theta, x, \xi) + \nabla_{x} \cdot (\xi f(\theta, x, \xi)) - \nabla_{\xi} \cdot (\nabla_{x} \varphi(\theta, x) f(\theta, x, \xi)) = 0$$

$$\det(\mathbb{I}+D_x^2\varphi(\theta,x))=\int_{\mathbb{R}^d}f(\theta,x,d\xi),\quad (\theta,x,\xi)\in\mathbb{R}^{1+d+d}$$

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 16 / 18

э

$$\partial_{\theta} f(\theta, x, \xi) + \nabla_{x} \cdot (\xi f(\theta, x, \xi)) - \nabla_{\xi} \cdot (\nabla_{x} \varphi(\theta, x) f(\theta, x, \xi)) = 0$$

$$\det(\mathbb{I}+D_x^2\varphi(\theta,x))=\int_{\mathbb{R}^d}f(\theta,x,d\xi),\quad (\theta,x,\xi)\in\mathbb{R}^{1+d+d}$$

(with possible large scale computations thanks to recent efficient Monge-Ampère solvers by Quentin Mérigot and Bruno Lévy.)

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 16 / 18

< ロ > < 同 > < 回 > < 回 >

$$\partial_{\theta} f(\theta, x, \xi) + \nabla_{x} \cdot (\xi f(\theta, x, \xi)) - \nabla_{\xi} \cdot (\nabla_{x} \varphi(\theta, x) f(\theta, x, \xi)) = 0$$

$$\det(\mathbb{I}+D_x^2\varphi(\theta,x))=\int_{\mathbb{R}^d}f(\theta,x,d\xi),\quad (\theta,x,\xi)\in\mathbb{R}^{1+d+d}$$

(with possible large scale computations thanks to recent efficient Monge-Ampère solvers by Quentin Mérigot and Bruno Lévy.)

For weak fields φ , we asymptotically recover the Poisson equation $\Delta \varphi = \int f d\xi - 1$ which describes Newtonian gravitation.

From pure noise to non-trivial interactions

イロト イポト イラト イラト

Zürich, 4 Nov 2016

16/18

$$\partial_{\theta} f(\theta, x, \xi) + \nabla_{x} \cdot (\xi f(\theta, x, \xi)) - \nabla_{\xi} \cdot (\nabla_{x} \varphi(\theta, x) f(\theta, x, \xi)) = 0$$

$$\det(\mathbb{I}+D_x^2\varphi(\theta,x))=\int_{\mathbb{R}^d}f(\theta,x,d\xi),\quad (\theta,x,\xi)\in\mathbb{R}^{1+d+d}$$

(with possible large scale computations thanks to recent efficient Monge-Ampère solvers by Quentin Mérigot and Bruno Lévy.)

For weak fields φ , we asymptotically recover the Poisson equation $\Delta \varphi = \int f d\xi - 1$ which describes Newtonian gravitation.

SPECIAL THANKS TO ANDREA, ANIL, EITAN, GIANLUCA, SIDDHARTHA and TRISTAN!!!!

reference: Y. B., "A double LD principle for MA gravitation", arXiv 2015

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 16 / 18

A D N A B N A B N A B N

LARGE DEVIATIONS OF THE "HEAT WAVE" ODE

We first pass to the limit $\eta \to 0$, while $\epsilon > 0$ is kept fixed. The large deviation theory tells us that the probability to join point X_{θ_0} at $\theta = \theta_0$ and point X_{θ_1} at later time $\theta = \theta_1$ behaves as

$$\exp(-\frac{\mathcal{A}}{\eta}), \ \eta \to 0, \ \mathcal{A} = \frac{1}{2} \int_{\theta_0}^{\theta_1} ||\frac{dX_{\theta}}{d\theta} - v_{\epsilon}(\theta, X_{\theta})||^2 d\theta$$

where we call A the Freidlin-Vencel action.

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

イロト イポト イラト イラト

Zürich, 4 Nov 2016

17/18

□-LIMIT OF THE VENCEL-FREIDLIN ACTION

We now pass to the Γ -limit $\epsilon \downarrow 0$ (*) in the Vencel-Freidlin action

$$\mathcal{A} = rac{1}{2}\int_{ heta_0}^{ heta_1} ||rac{dX_ heta}{d heta} - oldsymbol{v}_\epsilon(heta,X_ heta)||^2 d heta,$$

$$m{v}_\epsilon(heta,X) = -
abla_X \Phi_\epsilon(heta,X), \quad \Phi_\epsilon(heta,X) = \epsilon m{e}^{2 heta} \log \sum_{\sigma \in \mathcal{S}_N} \exp(rac{-||X-m{A}_\sigma||^2}{2\epsilon m{e}^{2 heta}})$$

noticing that

$$\lim_{\epsilon \downarrow 0} \Phi_{\epsilon}(\theta, X) = -\frac{1}{2} \inf_{\sigma \in \mathcal{S}_{N}} \sum_{\alpha=1}^{N} |X_{\theta}(\alpha) - A(\sigma(\alpha))|^{2}$$

(*) thanks to L. Ambrosio, private communication.

Yann Brenier (CNRS)

From pure noise to non-trivial interactions

Zürich, 4 Nov 2016 18 / 18