Stochastically forced long-range interacting systems

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Statistical Mechanics of self-gravitating particles Fondation des Treilles, 25 October 2012

joint work with F. Bouchet, S. Gupta, T. Dauxois and S. Ruffo

CN, S. Gupta, S. Ruffo, T. Dauxois and F. Bouchet, Letter to JSTAT, L01002 (2012)
 CN, S. Gupta, S. Ruffo, T. Dauxois and F. Bouchet, arXiv:1210.0492, submitted to JSTAT

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d: spatial dimensions of the systems

$$r \gg r_{typ}$$
  $v(r) \sim \frac{1}{r^{lpha}}$   $lpha \leq d$ 

• Gravitational system, one-component plasma

$$H = \sum_{i=1}^{N} \frac{p_i^2}{2m} + \frac{1}{2N} \sum_{i,j=1}^{N} v(q_i - q_j)$$

2D, Quasi-2D turbulence and geophysical flows

• ex.: 2-d Euler:

...

 $\partial_t \omega + \mathbf{v} \cdot \nabla \omega = \mathbf{0} \qquad \text{with} \qquad \omega = \nabla \wedge \mathbf{v} \ , \ \omega = \bigtriangleup \psi$ 

$$\mathcal{E} = -\int d\mathbf{r} d\mathbf{r}' \, \omega(\mathbf{r}) \, G(\mathbf{r},\mathbf{r}') \omega(\mathbf{r}') \,, \qquad G \sim \log |\mathbf{r}-\mathbf{r}'|$$

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• Quasi-2D models: Shallow-water equation, Quasi-geostrophic equation, ...

## Short-range systems



Non-equilibrium stationary states sustained by flux of conserved quantities, broken detailed balance, ... no analogous to Boltzmann-Gibbs theory

#### Long-range systems

forcing can act coherently on all the degrees of freedom:

- imposed electric fields on a plasma ?
- gravitational fields created by other galaxies ?

## Fluid models

- 2D and Quasi-2D turbulence models
- Large scale structures in constrast with 3D turubulence





# (Weak?) FLUX OF ENERGY from SMALL to LARGE SCALES OUT OF EQUILIBRIUM PHENOMENA!

# Stochastically forced long-range systems

Stochastically forced quasi-Geostrophic equations

$$\partial_t q + \mathbf{v} \cdot \nabla q = -lpha q + F(\mathbf{r}, t)$$
  
 $\langle F(\mathbf{r}, t)F(\mathbf{r}', t') \rangle = C(\mathbf{r} - \mathbf{r}')\delta(t - t')$ 

q: quasi-geostrophic potential vorticity





Jupiter atmosphere

Jupiter Zonal wind (Voyager and Cassini, from Porco et al 2003)

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## IN THIS TALK: stochastically forced Long-range PARTICLE systems

Work in progress (with F. Bouchet & T. Tangarife)

similar theoretical tecniques for stochastically forced 2d fluids

$$\partial_t \omega + \mathbf{v} \cdot \nabla \omega = -\alpha \omega + F(\mathbf{r}, t)$$

## Similarity between 2d Euler and Vlasov equation

- non-linear transport equations
- infinite number of conserved quantities (Casimirs)
- Hamiltonian structure

- Isolated long-range particle systems
- Stochastically forced particle systems: the model
- 6 Kinetic theory
- Omparison between kinetic theory and numerical simulations

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Ø Bistability

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## HMF model and its equilibrium behavior



Computational cost of Molecular Dynamics  $\sim N$ 

Antoni and Ruffo, PRE 52, 2361-2374 (1995) 0 0 0

Isolated long-range systems: relaxation to equilibrium

$$H=\sum_{i=1}^{N}rac{p_i^2}{2m}+rac{1}{2N}\sum_{i,j=1}^{N}v(q_i-q_j)$$
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#### Relaxation to equilibrium

#### • Quasi-stationary states

• Non-ergodicity • lifetime  $\sim N$  (diverging with the system size!)

Y. Yamaguchi, J. Barré, F. Bouchet, T. Dauxois, and S. Ruffo, Physica A (2004)

## Isolated long-range systems: kinetic theory

small parameter: 1/N f(q, p, t): density in (q, p) at time t

Vlasov equation  $(t << au_c \sim N^{\delta}, \ \delta > 0)$ 

$$\frac{\partial f}{\partial t} + p \frac{\partial f}{\partial q} - \frac{\partial f}{\partial p} \frac{\partial \Phi}{\partial q} =$$

$$\Phi(q) = \int dq' \, v(q-q') f(q')$$

Mean field approximation
 exact for N → ∞

• Quasi-Stationary States: stable equilibria

Infinite number of QSS

#### -enard-Balescu equation ... $(t \sim au_c)$

 $\frac{\partial f}{\partial t} + p \frac{\partial f}{\partial q} - \frac{\partial f}{\partial p} \frac{\partial \Phi}{\partial q} = \frac{1}{N} C[f]$ 

Lowest order description of finite-N effects

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weak correlations cause slow evolution

analogous to Boltzmann equation

slow relaxation through Quasi-Stationary-States

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Lenard-Balescu equation ...  $(t \sim \tau_c)$ 

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 Simulations:  $v(q) = -\cos q$ 

## STOCHASTIC EQUATIONS OF MOTION

$$\dot{q}_{i} = \frac{\partial H}{\partial p_{i}} \qquad \dot{p}_{i} = -\frac{\partial H}{\partial q_{i}} - \alpha p_{i} + \sqrt{\alpha} F(q_{i}, t)$$
• F Gaussian stochastic process with  $\langle F(q, t) \rangle = 0$ 

 $\langle dF(q,t)dF(q',t')\rangle = B(|q-q'|)\delta(t-t')dt$ 

 $\alpha$ : forcing and dissipation parameter

#### Coherent stochastic forces

• Coherent stochastic term: NOT  $F_i(q_i, t)$ 

external stochastic field

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## Definition of the model

## "Fourier expansion" of F(q,t)

 $g_k = rac{1}{L}\int \mathrm{d}q \; B(q) e^{-ikq} > 0, \qquad \qquad F(q,t) = \sum_k g_k \; e^{ikq} W_k(t)$ 

 $W_k$ : independent Weiner processes

 $g_k$ : forcing at the spatial scale 1/k

Kinetic energy in a steady state: KINETIC TEMPERATURE

$$T=2\langle K_{ss}
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Detailed balance  $\leftrightarrow g_k = g \;\;\; orall k$ Can be far from detailed balance also for  $lpha \ll 1$ 

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## Timescales & fluctuations: N and $\alpha$

# • $N \gg 1$ : number of degrees of freedoms

- Plasma, self-gravitating systems
- $\alpha \ll 1$ : weak forcing limit
  - Technical reason: small parameter

#### Timescales

- Collective timescale:  $au_c \sim N$
- Stochasticity:  $\tau_s = 1/\alpha$

#### \_imits

- Continuous limit:  $N \, lpha \gg 1$ 
  - Negligible finite size effects: similar to 2D fluid models!
- N α ∼ 1 or ≪ 1: simple generalization

## Fluctuations of intensive observables

- Finite-size effects:  $\sim 1/\sqrt{N}$
- Stochasticity:  $\sqrt{\alpha}$



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# Perturbation theory in the SMALL PARAMETER: $\alpha \gg 1/N$

FOKKER-PLANCK for the N-particles distribution function  $f_N$ 

$$\frac{\partial f_N}{\partial t} + \text{Liouville terms} = -\sum_{i=1}^N \frac{\partial (\alpha p_i f_N)}{\partial p_i} - \frac{\alpha}{2} \sum_{i,j=1}^N C(q_i - q_j) \frac{\partial^2 f_N}{\partial p_i \partial p_j} \\ \langle F(q,t)F(q',t') \rangle = C(|q - q'|)\delta(t - t')$$

Exact: too much information for a macroscopic description

#### Distribution functions

....

- $f_s = \int f_N d[s+1]...d[N]$
- $f_1 = f$ : density in  $\mu$ -space
- f<sub>2</sub>: 2-particles correlations

BBGKY hierarchy  $\partial_t f_s = L[f_s, f_{s+1}]$ 

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## How to close the BBGKY hierarchy?

# Kinetic theory: a qualitative idea



#### Hypothesis

*f* stationary stable solution of Vlasov equation at every time • -- > Time-scale separation  $\sim f$  evolves slowly w.r.t. *g* homogeneous system: f(p, q, t) = f(p, t)• -- > explicit form of the kinetic equation

# Kinetic theory: a qualitative idea



KIN. EQ. Lenard-Balescu "Our" kin. eq.

## Hypothesis

f stationary stable solution of Vlasov equation at every time

• --> Time-scale separation  $\sim f$  evolves slowly w.r.t. g

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• --> explicit form of the kinetic equation

connected components of correlations

$$f_2(1,2) = f(1)f(2) + \alpha g(1,2)$$
  

$$f_3(1,2,3) = f(1)f(2)f(3) + f(1)g(2,3) + \dots + \dots + h(1,2,3)$$

it is SELF-CONSISTENT to suppose:

f ~ O(1)
αg ~ O(α)
h ~≪ αg
...

Lowest order possible scheme if we want to describe the effect of the forcing

Discard three-particle and higher order correlations while taking into account two-particle correlations

• Analogous to derivation of Boltzmann eq. or Lenard-Balescu eq.

## I equation BBGKY

$$\frac{1}{\alpha}\frac{\partial f}{\partial t} + \frac{1}{\alpha}\text{Vlasov} - \frac{\partial}{\partial p_1}[p_1f] - T\frac{\partial^2 f}{\partial p_1^2} = \frac{\partial}{\partial p_1}\int d[2]v'(q_1 - q_2)g(1, 2, t)$$

## II equation BBGKY

$$rac{\partial \mathbf{g}}{\partial t} + L_f^{(1)}\mathbf{g} + L_f^{(2)}\mathbf{g} = C(|q_1 - q_2|) rac{\partial}{\partial p_1} rac{\partial}{\partial p_2} f(1,t) f(2,t)$$

 $L_fg$ : linearized Vlasov operator around f acting on h

#### Time-scale separation

If f is a STATIONARY AND STABLE solution of the Vlasov equation

- f evolves on a timescale of order 1/lpha
- g evolves on a timescale of order 1

Bogoliugov "hypothesis"

We solve II supposing f fixed in time and we insert the STATIONARY solution in the r.h.s. of I

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## I equation BBGKY

$$\frac{1}{\alpha}\frac{\partial f}{\partial t} - \frac{\partial}{\partial p_1}[p_1f] - T\frac{\partial^2 f}{\partial p_1^2} = \lim_{t \to \infty} \frac{\partial}{\partial p_1} \int d[2] v'(q_1 - q_2)g(1, 2, t)$$

We have reduced the problem to find the stationary solution of II equation BBGKY

$$\frac{\partial g}{\partial t} + L_f^{(1)}g + L_f^{(2)}g = C(|q_1 - q_2|)\frac{\partial f(1)}{\partial p_1}\frac{f(2)}{\partial p_2}$$

 $L_f g$ : linearized Vlasov operator around f acting on g

Very similar problem to solve the linear Vlasov equation

$$\frac{\partial h}{\partial t} + L_f h = 0$$

Easily doable when f(q, p, t) = f(p, t)

Remark: why we think that this is generalizable to fluids

$$\partial \omega + \mathbf{v} \cdot \nabla \omega = -\alpha \omega + \sqrt{\alpha} F$$

 $L_f - - - >$  linear Euler operator

| Analogy with finite size effects in Hamiltonian systems |   |                   |
|---|---|-------------------|
| CORRELATIONS  | finite-N  | stochastic forces |
| METHOD  | <ul> <li>Minimal project: discard 3-particles correlations</li> <li>Solve the II eq. of BBGKY</li> <li>Plug the result in the I eq. of BBGKY</li> </ul> |                   |
| KIN. EQ.  | Lenard-Balescu  | "Our" kin. eq.    |

## Hypothesis

Discarding 3-particle and higher order correlations

f stationary stable solution of Vlasov equation at every time

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homogeneous system: f(p, q, t) = f(p, t)

• --> explicit form of the kinetic equation

KINETIC EQUATION: Non linear Fokker-Planck equation

$$\frac{1}{\alpha}\frac{\partial f(p_1,t)}{\partial t} - \frac{\partial}{\partial p_1}[p_1f(p_1,t)] - \frac{\partial}{\partial p_1}\left[D[f](p_1)\frac{\partial f(p_1)}{\partial p_1}\right] = 0$$

 $\alpha$ : time-rescaling

Diffusion coefficient  $D[f](p_1)$ 

$$D[f](\rho) = T + 2\pi \sum_{k=1} v_k g_k \int^* d\rho_1 \left[ \frac{1}{|\epsilon(k, k\rho)|^2} + \frac{1}{|\epsilon(k, k\rho_1)|^2} \right] \frac{1}{\rho_1 - \rho} \left. \frac{\partial f}{\partial \rho} \right|_{\rho_1}$$
$$T = \frac{1}{2} \sum_k g_k^2$$
$$\epsilon(k, \omega) = 1 - 2\pi i N k \varphi(k) \int_{-\infty}^{\infty} d\rho \frac{f'(\rho)}{-i\omega + ik\rho}$$

 $\int^* dp$ : Chauchy integral

 $v_k$ : Fourier components of the potential v(q)

# Comparing the results: kinetic energy and $\langle p^4 \rangle$



**Figure:** (a) Kinetic energy density  $\langle \kappa \rangle$  and (b)  $\langle \rho^4 \rangle$  as a function of  $\alpha t$ , for the values  $B_0 = 1.5$  and  $g_1 = 0.75$ . The data for different N and  $\alpha$  values are obtained from numerical simulations of the stochastically forced HMF model, and involve averaging over 50 histories for  $N = 10^4$  and  $10^3$  histories for  $N = 10^3$ . The data collapse implies that  $\alpha$  is the timescale of relaxation to the stationary state. The inset shows the data without time rescaling by  $\alpha$ .



# NON-EQUILIBRIUM STATIONARY VELOCITY DISTRIBUTION $\alpha$ -independent shape



• forced modes: k = 1, 2

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## Close to detailed balance

## Far from detailed balance

#### Even further from detailed balance



# Bistability









• lifetime  $\sim e^{\lambda/lpha}$ 

• Bistable behavior described by a Poisson process

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## Bistability: analogy with the 2D stochastically forced Euler equation







Bouchet and Simonnet, PRL, 094504 (2009)

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## Conclusions and perspectives

Stochastically perturbed particles interacting with a long-range potential

• Kinetic theory in the weak forcing limit

Prediction of NON-EQUILIBRIUM homogeneous states

Numerical observation of bistability

Ongoing works in kinetic theory

• 2d-turbulence: stochastic Euler equation

$$\partial_t \omega + \mathbf{v} \cdot \nabla \omega = -\alpha \omega + \sqrt{2\alpha} F(q, t)$$

• with F. Bouchet and T. Tangarife

#### (Long term) perspectives

- kinetic theory for geophysical models?
  - 2D stochastic Navier-Stokes, Shallow-water, Quasi-geostrophic equations ...
- Theoretical understanding of the bistability

# Thank you!