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# Extinction of Fleming-Viot-type particle systems with strong drift

#### Mariusz Bieniek

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### Coauthors

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- Soumik Pal (University of Washignton)

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### Outline of the talk

### Fleming-Viot type process

- Description of the F-V particle system
- Some earlier results

### **2** Two-particle F-V driven by Bessel process on $(0,\infty)$

- Main result
- Sketch of the proof

### **3** *N*-particle **F-V** driven by a diffusion with strong drift

- Main result
- Sketch of the proof

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Description of the F-V particle system

### **Definition of Fleming-Viot process**

- Consider a diffusion X in  $\mathbb{R}^d$  and an open set  $D \subset \mathbb{R}^d$ .
- Fix  $N \in \mathbb{N}$  and define  $\mathbf{X}_t = (X_t^1, \dots, X_t^N)$ ,  $t \ge 0$ , driven by X as follows:
- $\mathbf{X}_0 = (x^1, \dots, x^N) \in D^N$
- $X_t^1, \ldots, X_t^N$  move as N independent copies of X until time  $\tau_1$ , where

$$\tau_1 = \inf\left\{t > 0 : \exists_{1 \le j \le N} X_t^j \in \partial D\right\}.$$

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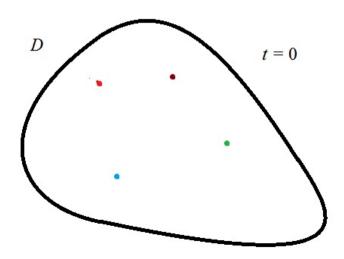
$$\tau_1 = \inf\left\{t > 0 : \exists_{1 \le j \le N} X_t^j \in \partial D\right\}.$$

 At τ<sub>1</sub> the particle X<sup>j</sup> which hit the boundary, jumps onto one of the remaining particles, uniformly chosen at random. F-V type process ○●○○○○○○○ Two Bessel particles

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Description of the F-V particle system

# An example: $D \subset \mathbb{R}^2$ , N = 4



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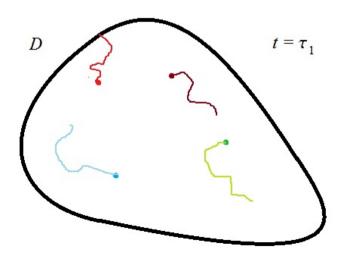
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Description of the F-V particle system

# An example: $D \subset \mathbb{R}^2$ , N = 4





• Then after time  $au_1$  all particles move as N independent copies of X until the time

$$\tau_2 = \inf\left\{t > \tau_1 : \exists_{1 \le j \le N} X_t^j \in \partial D\right\}.$$

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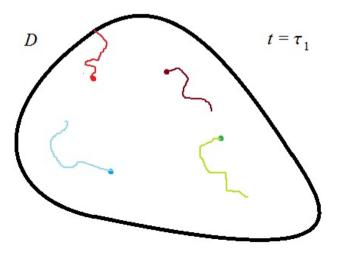
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Description of the F-V particle system

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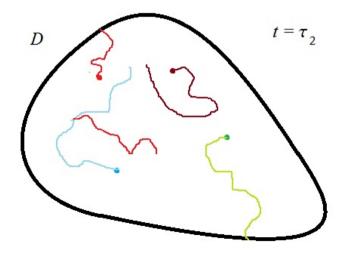
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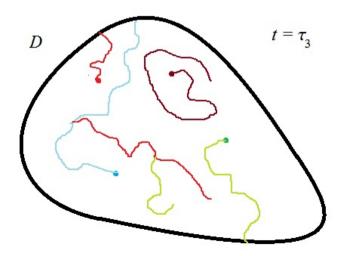
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Some earlier results

### Extinction or non-extinction of F-V process

• Let  $\tau_k$  denote the time of the *k*-th jump of the process  $X_t$ 

$$\tau_{k+1} = \inf \left\{ t > \tau_k : \exists_{1 \le j \le N} X_t^j \in \partial D \right\}.$$

• Define 
$$\tau_{\infty} = \lim_{k \to \infty} \tau_k$$
 — 'the time of extinction of  $\mathbf{X}_t$ '

#### Problem

Is the process  $X_t$  well defined for all t > 0? Is it true that almost surely  $\tau_{\infty} = \infty$ ?

In other words, is it possible that all N particles hit  $\partial D$  at the same finite time?

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Solution - first attempt

#### Theorem (Burdzy, March, Hołyst (2000))

If X is a Brownian motion then for any  $D \subset \mathbb{R}^d$  open

$$\lim_{k\to\infty}\tau_k=\infty,\quad a.s.$$

#### Proof

Incorrect. If it was correct, it would apply to a very wide class of Markov processes.

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# Partial solution — Lipschitz domains

Let  $\mathbf{X} = (X^1, \dots, X^N)$  be Fleming-Viot particle system driven by a Brownian motion in  $\mathbb{R}^d$ .

#### Theorem (B, Burdzy, Finch (2012))

There exists the constant c(N, d) such that if  $D \subset \mathbb{R}^d$  is a bounded Lipschitz domain with the Lipschitz constant L(D) < c(N, d), then the *N*-particle process  $\mathbf{X} = (X^1, \ldots, X^N)$  in *D* is well defined.

#### Example

The square in the plane has too sharp angles!!!

Some earlier results

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### Two examples of B, Burdzy and Finch

#### Example 1 - Theorem

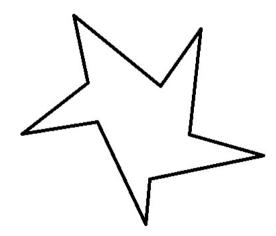
If *D* is arbitrary polyhedral domain in  $\mathbb{R}^d$ , then the two-particle F-V process  $\mathbf{X}_t = (X_t^1, X_t^2)$  driven by Brownian motion, is well defined for all *t* (i.e.  $\tau_{\infty} = \infty$ ).

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Some earlier results

# Example of polyhedral domain in $\mathbb{R}^2$



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Some earlier results

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#### Example 2

If  $D = (0,\infty)$  then for two particle F-V process driven by a diffusion

$$dX_t = dW_t - \frac{5}{2X_t} dt, \quad X_0 = 1,$$

we have  $\tau_{\infty} < \infty$ .

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### Outline of the talk

### Fleming-Viot type process

### **2** Two-particle F-V driven by Bessel process on $(0,\infty)$

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Main result

Two Bessel particles

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### F-V driven by Bessel processes

#### Theorem

Let **X** be a Fleming-Viot process with N particles on  $(0, \infty)$  driven by Bessel process of dimension  $\nu \in \mathbb{R}$ .

```
(i) If N=2 then 	au_{\infty}<\infty, a.s., if and only if 
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Sketch of the proof

# Sketch of the proof of (i)

For ν ∈ ℝ and x > 0 let X ~ Bes<sup>ν</sup>(x) denote ν-dimensional Bessel process on (0,∞) killed at 0, i.e. the solution to SDE

$$dX_t = dW_t + \frac{\nu - 1}{2X_t} dt,$$

#### where W is the standard Brownian motion.

- Let  $T_0$  denote the hitting time of 0.
- Scaling of Bessel processes: If  $X \sim \text{Bes}^{\nu}(x)$  is a Bessel process on  $[0, T_0)$ , then for all c > 0,

 $cX_{c^{-2}t} \sim \operatorname{Bes}^{\nu}(cx)$  on  $[0, c^2T_0]$ 

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### Alternative construction of FV

Let Y<sub>t</sub> = (Y<sub>t</sub><sup>1</sup>, Y<sub>t</sub><sup>2</sup>), where Y<sup>1</sup> and Y<sup>2</sup> are independent copies of X ~ Bes<sup>ν</sup>(1)
Let Y<sub>t</sub><sup>i</sup> = (Y<sub>t</sub><sup>i,1</sup>, Y<sub>t</sub><sup>i,2</sup>), i = 1, 2, ..., be a sequence of independent copies of Y.
For i = 1, 2, ... we set

$$\sigma_{i} = \inf \left\{ t > 0 : Y_{t}^{i,1} \land Y_{t}^{i,2} = 0 \right\}, \qquad \alpha_{i} = Y_{\sigma_{i}}^{i,1} \lor Y_{\sigma_{i}}^{i,2}.$$

• By scaling of Bessel processes

$$au_n = \sum_{j=1}^n \xi_{j-1}^2 \sigma_j, \quad \text{with} \quad \xi_j = \prod_{i=1}^j \alpha_i$$

• To check when  $\tau_n \rightarrow \infty$  we use the following result

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#### Theorem (e.g. Diaconis, Freedman)

Let  $\{(A_n, B_n), n \ge 1\}$  be a sequence of independent and identically distributed random variables such that  $A_n, B_n \in \mathbb{R}$  and

$$\mathbb{E}\left(\log^+|A_1|\right) < \infty, \quad \mathbb{E}\left(\log^+|B_1|\right) < \infty.$$

Then the infinite random series

$$\sum_{n=1}^{\infty} \left( \prod_{j=1}^{n-1} A_j \right) B_n$$

converges a.s. to a finite limit if and only if  $\mathbb{E} \log |A_1| < 0$ .

#### Theorem (e.g. Diaconis, Freedman)

Let  $\{(A_n, B_n), n \ge 1\}$  be a sequence of independent and identically distributed random variables such that  $A_n, B_n \in \mathbb{R}$  and

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- For  $\nu < 2$  we apply the above Theorem with  $A_n = \alpha_n^2$  and  $B_n = \sigma_n$ .
- After some calculations we conclude that  $\mathbb{E}\log^+|B_1|=\mathbb{E}\log^+\sigma_1<\infty$  and

$$\mathbb{E}(\log |A_1|) = \mathbb{E}\log(\alpha_1^2) = \frac{1}{2}\mathbb{E}\log\frac{2|X|}{\sqrt{2-\nu}}$$

where X is a random variable with *t*-distribution with  $(2 - \nu)$ -degrees of freedom • Therefore

$$\mathbb{E}(\log A_1) = \frac{1}{4} \left( \psi(1) - \psi\left(\frac{2-\nu}{2}\right) \right),$$

where  $\psi$  is the digamma function

• Therefore  $\mathbb{E}(\log A_1) < 0$  iff  $\frac{2-\nu}{2} > 1$  iff  $\nu < 0$ .

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drift

*N* particles with strong drift

### Outline of the talk

Fleming-Viot type process

#### **2** Two-particle F-V driven by Bessel process on $(0,\infty)$

**3** *N*-particle **F**-**V** driven by a diffusion with strong drift

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*N* particles with strong drift ●○○○○○○

Main result

### *N* particles with "strong" drift

#### • Intuitively it may seem that $\tau_{\infty} = \infty$ for sufficiently large N.

• Our next result shows that this claim is false: once the drift of the diffusion is slightly stronger than the drift of any Bessel process, then  $\tau_{\infty} < \infty$  for the Fleming-Viot process driven by this diffusion and *every* N.

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• Consider the following SDE for a diffusion on (0,2],

$$X_{t} = x_{0} + W_{t} - \int_{0}^{t} \frac{1}{\beta X_{t}^{\beta-1}} \, ds - L_{t}, \quad t \leq T_{0}, \tag{1}$$

where  $x_0 \in (0, 2]$ ,  $\beta > 2$ , W is Brownian motion,  $T_0$  is the first hitting time of 0 by X, and  $L_t$  is the local time of X at 2

• We consider a Fleming-Viot process on D = (0, 2] driven by this diffusion. The role of the boundary is played only by the point 0, since X is reflected at 2.

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F-V type process	Two Bessel particles	<i>N</i> particles with strong drift ○○●○○○○
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Fix any  $\beta > 2$ . For every  $N \ge 2$ , the *N*-particle Fleming-Viot process on (0, 2] driven by diffusion X has the property that  $\tau_{\infty} < \infty$ , a.s. Moreover,

 $\mathbb{P}^{\mathsf{x}}( au_{\infty}>t)\leq c_{1}\mathrm{e}^{-c_{2}t}, \qquad t\geq 0, \; \mathsf{x}\in(0,2]^{N},$ 

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F-V type process

Two Bessel particles

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#### Sketch of the proof

# Freidlin-Wentzell inequality

• Consider a diffusion  $X_t, t \in [s, u]$ , satisfying SDE

$$dX_t = dW_t + b(X_t) dt, \quad X_s = a.$$

• Let  $y_t$  be the solution to the ordinary differential equation

$$\frac{d}{dt}y_t = b(y_t), \quad y_s = a.$$

• If *b* is a Lipschitz function on [s, u] then for every  $\delta > 0$ 

$$\mathbb{P}\left(\sup_{s\leq t\leq u}|X_t-y_t|>\delta\right)\leq c_0\exp\left(-\frac{\delta^2}{2(u-s)}e^{-2L(u-s)}\right)$$

where L is a Lipschitz constant of b and  $c_0$  is an absolute costant.

F-V type process

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In our case

$$b(x)=-rac{1}{eta x^{eta -1}},\quad x>0.$$

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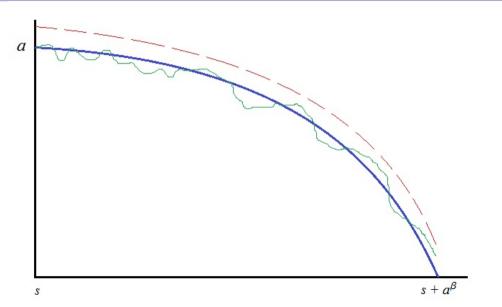
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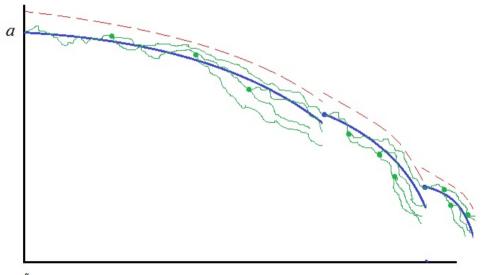
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- Every  $\varepsilon$  units of time, two particles are chosen uniformly
- The first particle jumps to the location of the second one
- Between the jumps the particles are independent Brownian motions
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