

# Microscopic Theory for the Diffusion of an Active Particle in a Crowded Environment

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In collaboration with

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J. Phys.: Condens. Matter **30**, 443001 (2018)



P. Rizkallah , AS, O. Bénichou, P. Illien,

Phys. Rev. Lett. **128**, 038001 (2022)

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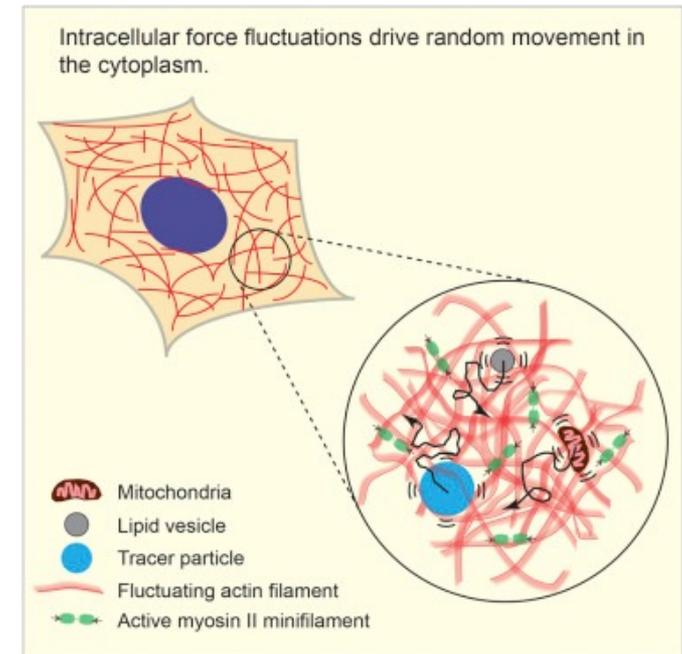
# Motivations

To understand the interactions between **active particles** and **complex environments**

Transport of biological objects takes place under **crowded conditions**

**Motor** proteins inside a cell

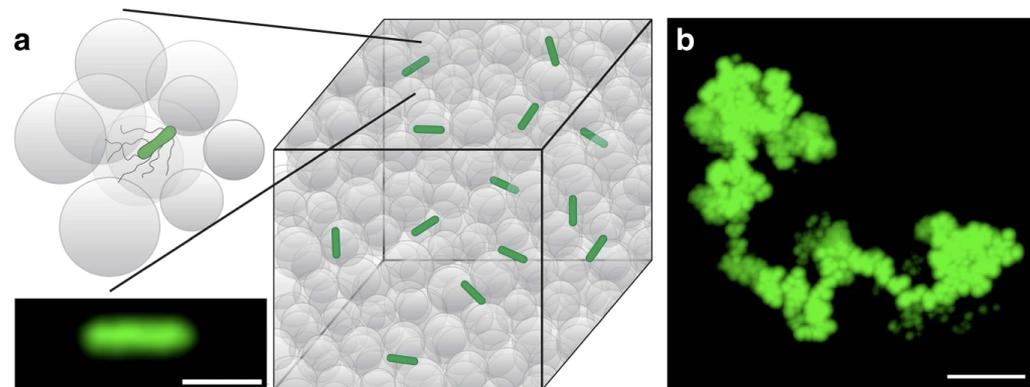
L. Conway, D. Wood, E. Tüzel, and J. L. Ross,  
Proc. Natl. Acad. Sci. U.S.A. 109, 20814 (2012)



**Bacteria** in porous materials

N. A. Licata, B. Mohari, C. Fuqua, and S. Setayeshgar,  
Biophys. J. 110, 247 (2016)

T. Bhattacharjee and S. S. Datta,  
Nat. Commun. 10, 2075 (2019)



E. coli dispersed in jammed packings of hydrogel particles

# Diffusion in crowded environment

## Some results in **frozen disordered** environments

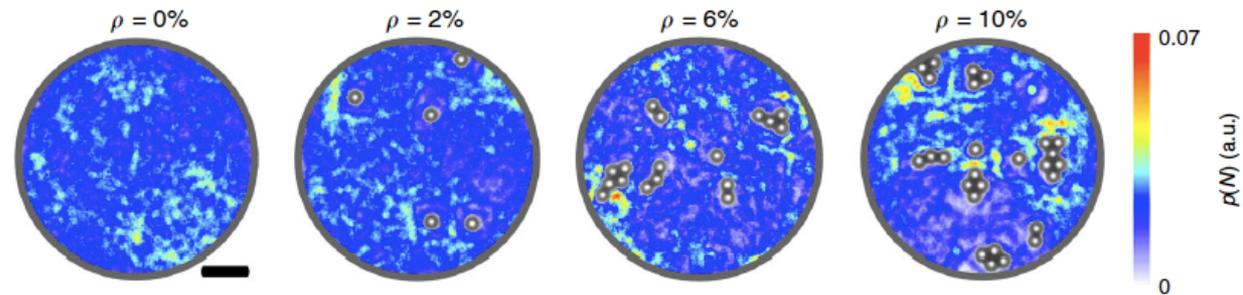
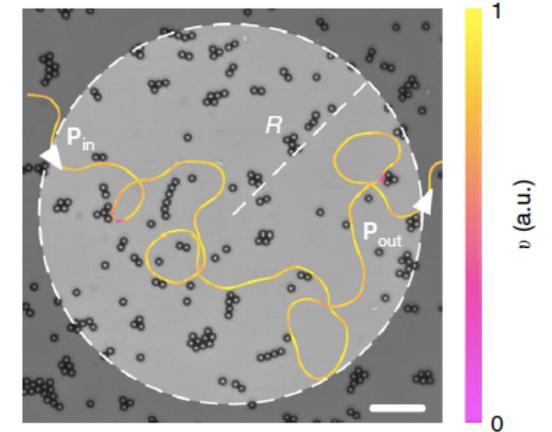
S. Makarchuk, V. C. Braz, N. A. Araújo, L. Ciric, and G. Volpe,  
Nat. Commun. 10, 4110 (2019)

O. Sipos, K. Nagy, R. Di Leonardo, and P. Galajda,  
Phys. Rev. Lett. 114, 258104 (2015)

J. Tailleur and M. E. Cates,  
Europhys. Lett. 86, 60002 (2009)

O. Chepizhko and F. Peruani,  
Phys. Rev. Lett. 111, 160604 (2013)

A. Kaiser, H. H. Wensink, and H. Löwen,  
Phys. Rev. Lett. 108, 268307 (2012)



Propagation and localisation of E. coli cells near surfaces with micro-obstacles

## Few (numerical) results in environments of **mobile obstacles**

M. J. Saxton, Biophys. J. 52, 989 (1987)

N. Dorsaz, et al. Phys. Rev. Lett. 105, 120601 (2010)

J. D. Schmit, E. Kamber, and J. Kondev,  
Phys. Rev. Lett. 102, 218302 (2009)

# Theory by Nakazato and Kitahara

Case of a **passive tracer**: theory by Nakazato and Kitahara for a **lattice gas**

**Diffusion coefficient** as a function of the density of crowders

$$D = \frac{1}{2d\tau} (1 - \rho) \left[ 1 - \frac{2\rho \frac{\tau^*}{\tau} \gamma}{2d \left[ 1 + \frac{\tau^*}{\tau} (1 - \rho) \right] - \left[ 1 + \frac{\tau^*}{\tau} (1 - 3\rho) \gamma \right]} \right]$$

$\rho$  particle density

**Many-body** nature of the problem

Approximate expression, **exact in the low and high density** regimes

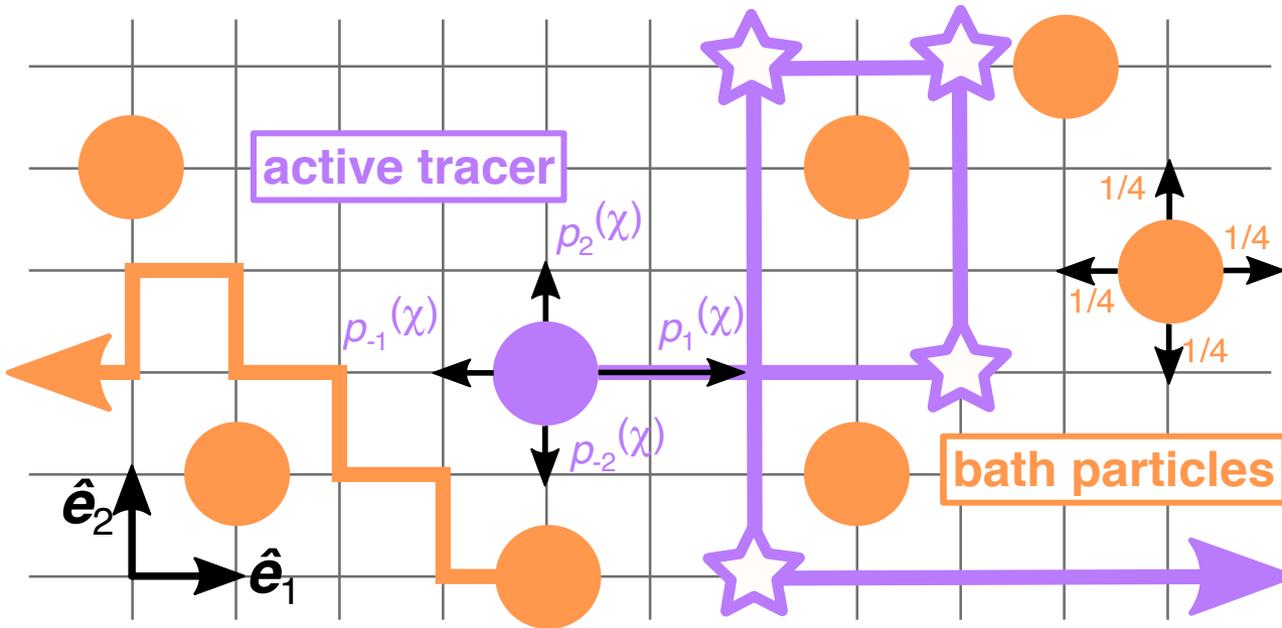
Good quantitative estimates for arbitrary density,  
if the environment is **mobile enough**

K. Nakazato and K. Kitahara,  
Prog. Theor. Phys. 64, 2261 (1980)

R. A. Tahir-Kheli and R. J. Elliott,  
Phys. Rev. B 27, 844 (1983)

H. van Beijeren and R. Kutner,  
Phys. Rev. Lett. 55, 238 (1985)

# The model: active particle on a lattice gas



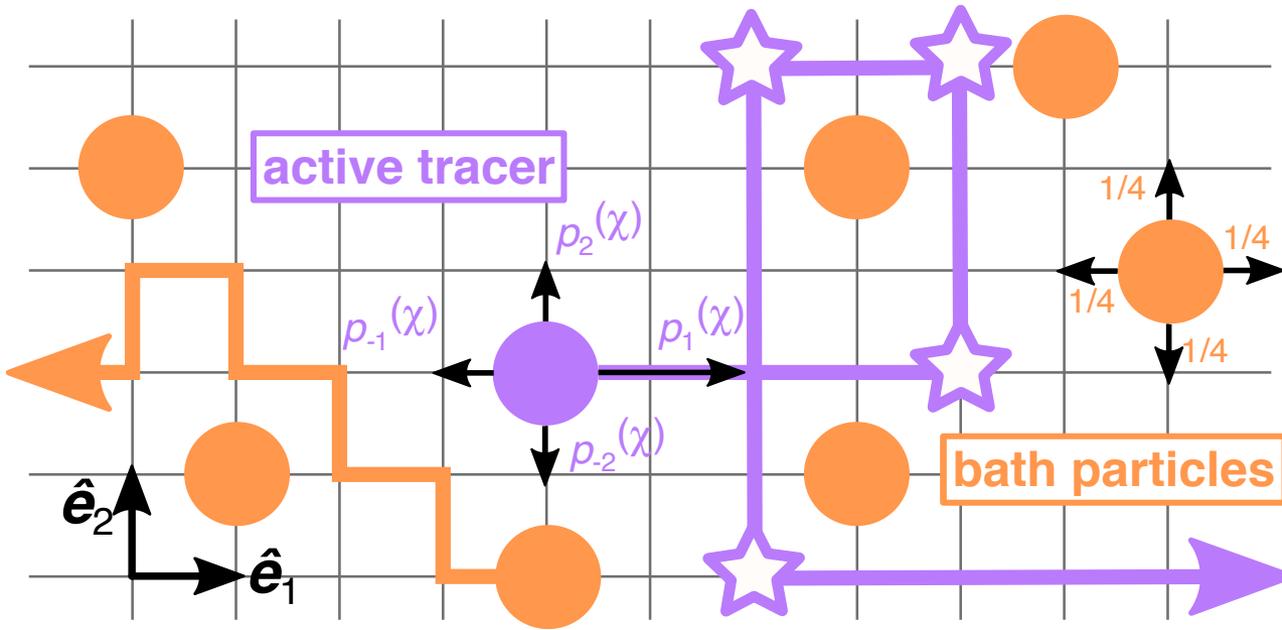
Jump probability

$$p_\mu^{(\chi)} \propto e^{\frac{F_A \mathbf{e}_\chi \cdot \mathbf{e}_\mu}{2}}$$

Active particle driven by a force  $F_A$ , asymmetric exclusion process, average waiting time  $\mathcal{T}$

Persistence time  $\tau_\alpha = 2d\tau^* / \alpha$  in the state  $\chi$

# The model: active particle on a lattice gas



Jump probability

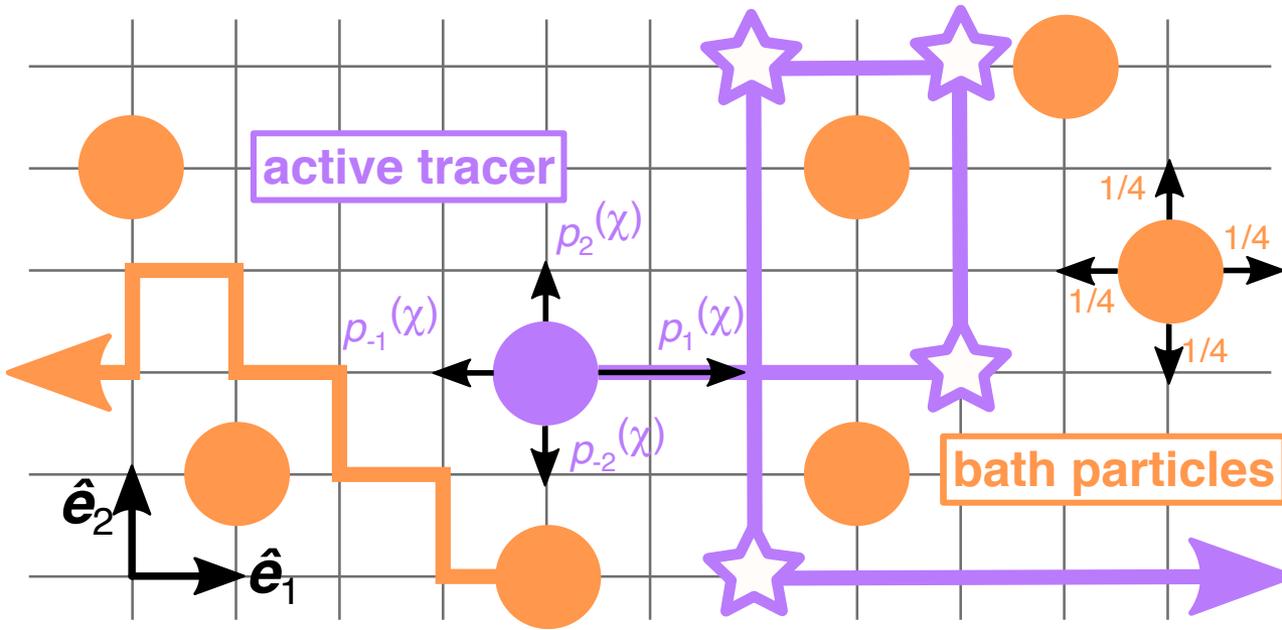
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$N$  **hard-core** particles in  $d$  dimensions, **symmetric** exclusion process, average waiting time  $\mathcal{T}^*$

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The dynamics of the tracer is a **lattice representation** of a **run-and-tumble** dynamics

# Master Equation

The dynamics of the model is described by a **Master Equation**

$$2d\tau^* \partial_t P_\chi(\mathbf{R}, \eta; t) = \mathcal{L}_\chi P_\chi - \alpha P_\chi + \frac{\alpha}{2d-1} \sum_{\chi' \neq \chi} P_{\chi'}$$

$P_\chi(\mathbf{R}, \eta; t)$  **joint probability** to find the tracer in state  $\chi$ , at site  $\mathbf{R}$ , with the lattice in configuration  $\eta = \{\eta_{\mathbf{r}}\}$  the system at time  $t$

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$\mathcal{L}_\chi$  **evolution operator** in state  $\chi$

$$\mathcal{L}_\chi P_\chi = \sum_{\nu=1}^d \sum_{\mathbf{r} \neq \mathbf{R} - \mathbf{e}_\nu, \mathbf{R}} [P_\chi(\mathbf{R}, \eta^{\mathbf{r}, \nu}; t) - P_\chi(\mathbf{R}, \eta; t)] \quad \text{evolution of bath particles}$$

$$+ \frac{2d\tau^*}{\tau} \sum_{\mu} p_{\mu}^{(\chi)} [(1 - \eta_{\mathbf{R}}) P_\chi(\mathbf{R} - \mathbf{e}_\mu, \eta; t) - (1 - \eta_{\mathbf{R} + \mathbf{e}_\mu}) P_\chi(\mathbf{R}, \eta; t)]$$

evolution of the tracer

# Diffusion coefficient

Expression for the **diffusion coefficient**  $D \equiv \lim_{t \rightarrow \infty} \frac{1}{2} \frac{d}{dt} \langle X_t^2 \rangle$

$$D = \frac{1}{4d\tau} \sum_{\chi} \sum_{\epsilon=\pm 1} \left\{ p_{\epsilon}^{(\chi)} \left[ 1 - k_{\epsilon}^{(\chi)} \right] - 2\epsilon p_{\epsilon}^{(\chi)} \tilde{g}_{\epsilon}^{(\chi)} \right\} + \frac{2d-1}{2d} \frac{\tau^*}{\tau^2 \alpha} \sum_{\chi} \left\{ \sum_{\epsilon=\pm 1} \epsilon p_{\epsilon}^{(\chi)} \left[ 1 - k_{\epsilon}^{(\chi)} \right] \right\}^2$$

$k_{\mathbf{r}}^{(\chi)} = \langle \eta_{\mathbf{X}_{t+\mathbf{r}}} \rangle_{\chi}$  **density profiles** in the frame of reference of the tracer

$\tilde{g}_{\mathbf{r}}^{(\chi)} = \langle \eta_{\mathbf{X}_{t+\mathbf{r}}} (X_t - \langle X_t \rangle_{\chi}) \rangle_{\chi}$  **tracer-bath cross-correlations** functions

$\langle \cdot \rangle_{\chi} = 2d \sum_{\mathbf{R}, \eta} \cdot P_{\chi}(\mathbf{R}, \eta; t)$  average conditioned on state  $\chi$

# Decoupling approximation

Equations for the **density profile**  $k_{\mathbf{r}}^{(\chi)}$  and  
for the **tracer-bath cross-correlation**  $\tilde{g}_{\mathbf{r}}^{(\chi)}$  are not closed and  
involve **higher-order correlation** functions

Closure scheme, **mean-field-like** approximation

$$\langle \eta_{\mathbf{r}} \eta_{\mathbf{r}'} \rangle_{\chi} \simeq k_{\mathbf{r}}^{(\chi)} k_{\mathbf{r}'}^{(\chi)}$$

$$\langle \delta X_t \eta_{\mathbf{r}} \eta_{\mathbf{r}'} \rangle_{\chi} \simeq k_{\mathbf{r}}^{(\chi)} \tilde{g}_{\mathbf{r}'}^{(\chi)}$$

# Coupled dynamical equations

We obtain the following equations for  $h_r^{(x)} \equiv k_r^{(x)} - \rho$  (defined in such a way that  $\lim_{|r| \rightarrow \infty} h_r = 0$ ) and  $\tilde{g}_r^{(x)}$  (we adopt the convention  $h_0^{(x)} = \tilde{g}_0^{(x)} = 0$ )

Density profile  
evolution equation

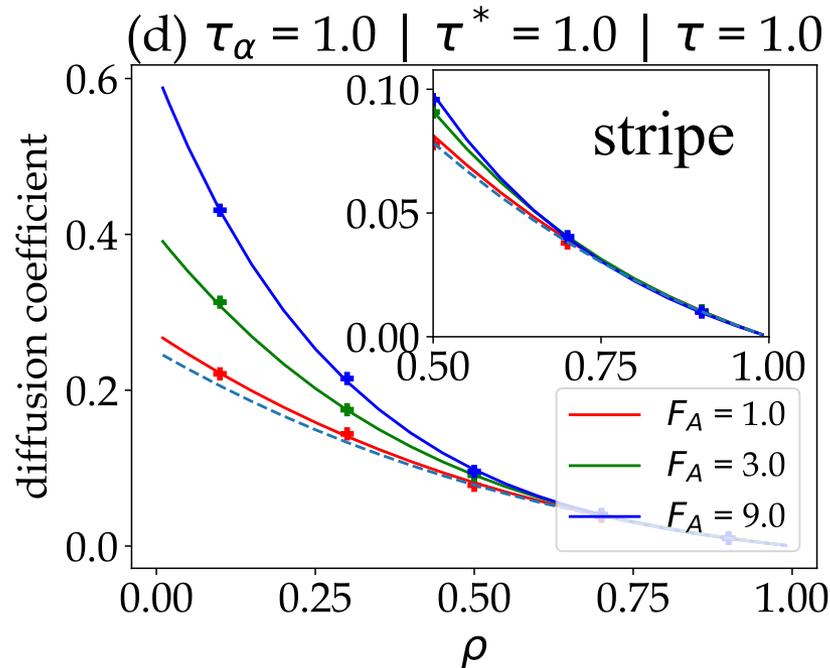
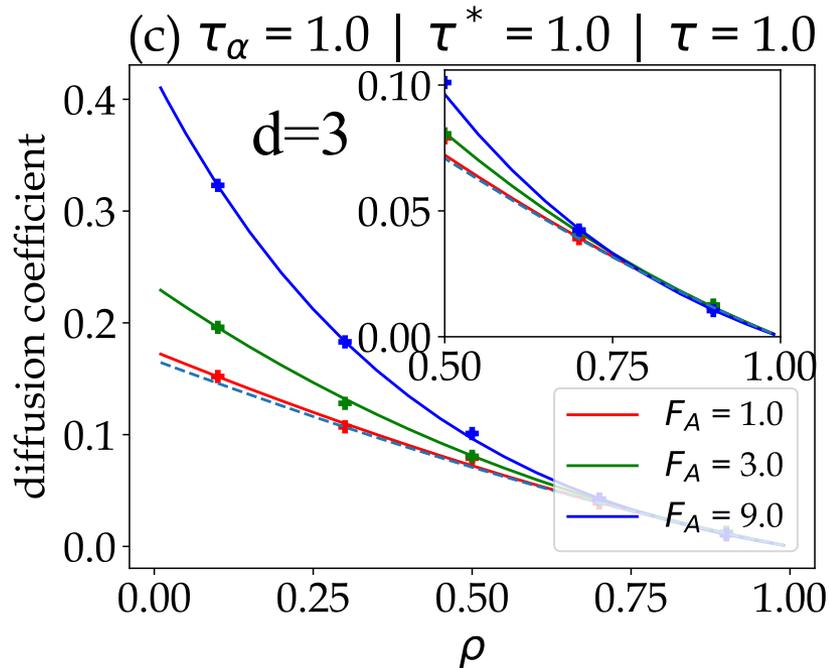
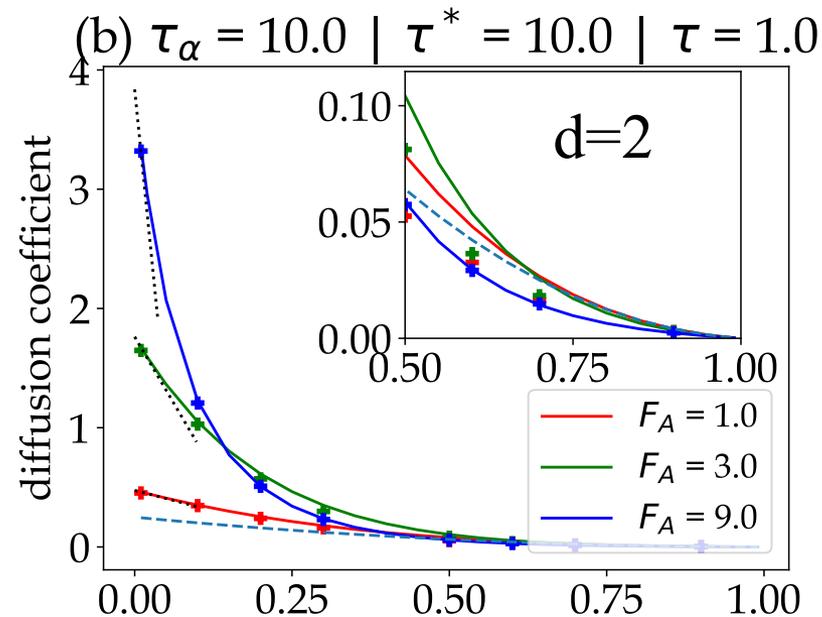
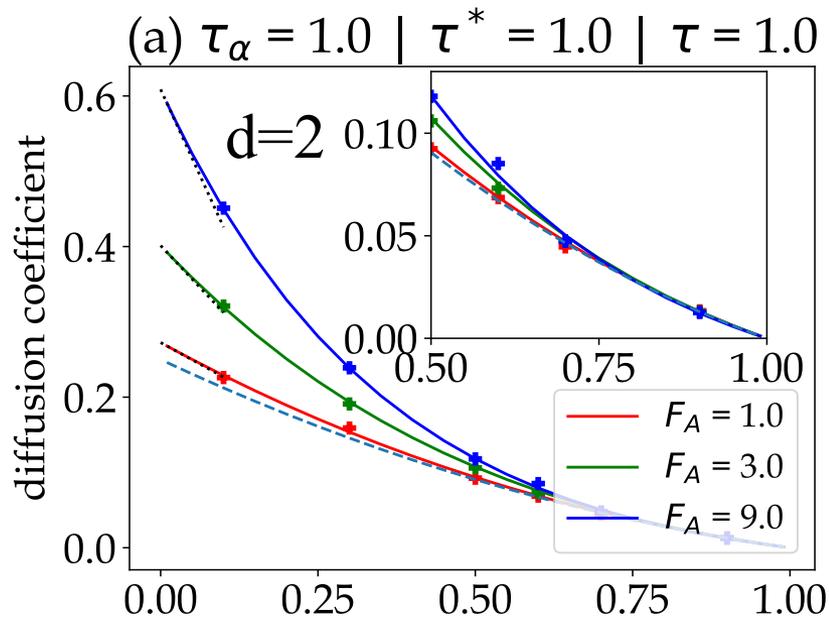
$$2d\tau^* \partial_t h_r^{(x)} = (\tilde{L}^{(x)} + \sum_{\nu} A_{\nu}^{(x)} \delta_{r, e_{\nu}}) h_r^{(x)} + \sum_{\nu} \delta_{r, e_{\nu}} \rho (A_{\nu} - A_{-\nu}) - \alpha h_r^{(x)} + \frac{\alpha}{2d-1} \sum_{r' \neq r} h_{r'}^{(x)}, \quad (3)$$

Tracer-bath cross  
correlation function

$$2d\tau^* \partial_t \tilde{g}_r^{(x)} = \left( \tilde{L}^{(x)} + \sum_{\nu} A_{\nu}^{(x)} \delta_{r, e_{\nu}} \right) \tilde{g}_r^{(x)} + \mathcal{G}^{(x)} h_r^{(x)} - \alpha \tilde{g}_r^{(x)} + \frac{\alpha}{2d-1} \sum_{r' \neq r} \tilde{g}_{r'}^{(x)} + \sum_{\nu} \delta_{r, e_{\nu}} [(A_{-\nu}^{(x)} - 1) \rho (\mathbf{e}_{\nu} \cdot \mathbf{e}_1)] - \frac{2d\tau^*}{\tau} (p_{\nu}^{(x)} \tilde{g}_{\mathbf{e}_{\nu}}^{(x)} (h_{\mathbf{e}_{\nu}}^{(x)} + \rho) - \rho p_{-\nu}^{(x)} \tilde{g}_{-\mathbf{e}_{\nu}}^{(x)}), \quad (4)$$

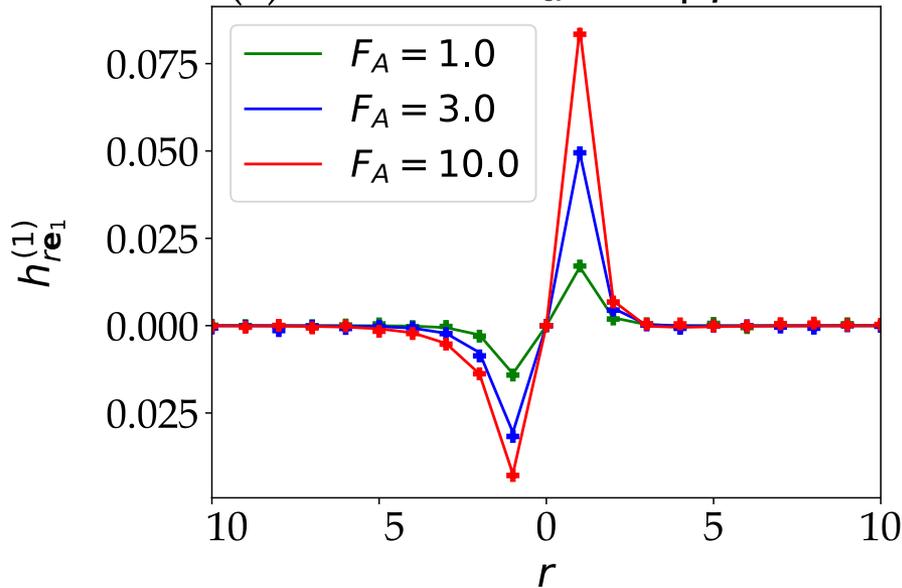
where we define  $A_{\mu}^{(x)} \equiv 1 + (2d\tau^*/\tau) p_{\mu}^{(x)} [1 - k_{\mathbf{e}_{\mu}}^{(x)}]$ , the operator  $\tilde{L}^{(x)}$  acting on a test function  $f_r$  as  $\tilde{L}^{(x)} f_r \equiv \sum_{\mu} A_{\mu}^{(x)} (f_{r+e_{\mu}} - f_r)$ .

# Diffusion coefficient: comparison with MC simulations



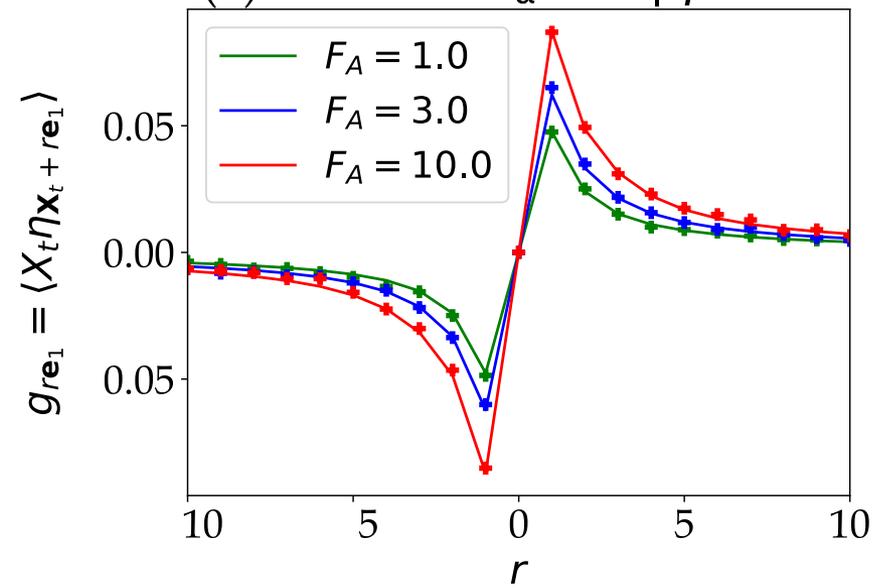
# Density profiles

(a)  $\tau = \tau^* = \tau_\alpha = 1 \mid \rho = 0.2$



density profile

(b)  $\tau = \tau^* = \tau_\alpha = 1 \mid \rho = 0.2$

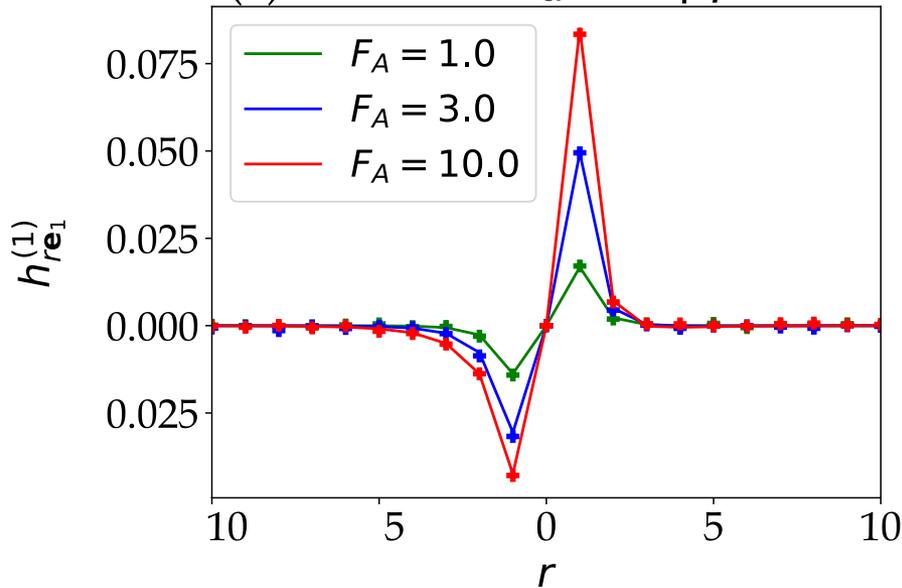


tracer-bath correlation function

➔ **Interplay** between the displacement of the active particle and the **response** of the environment

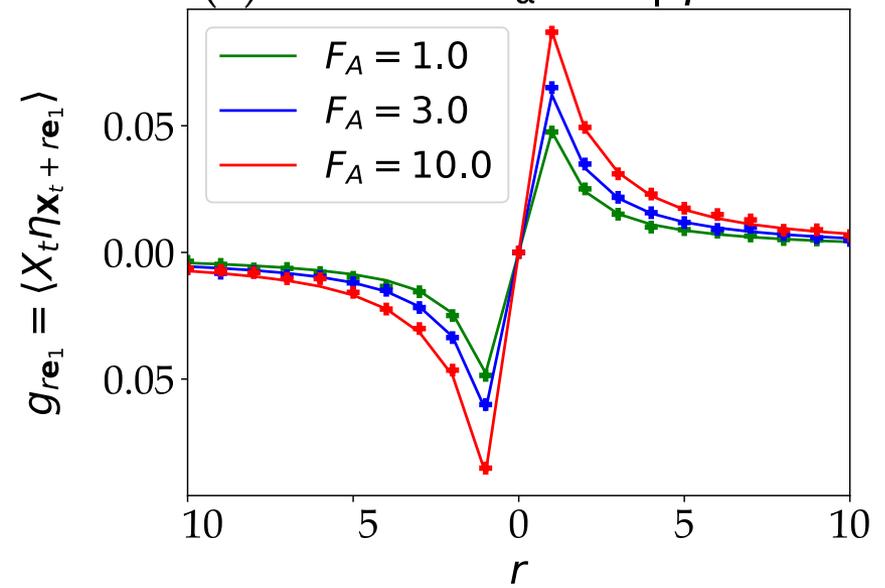
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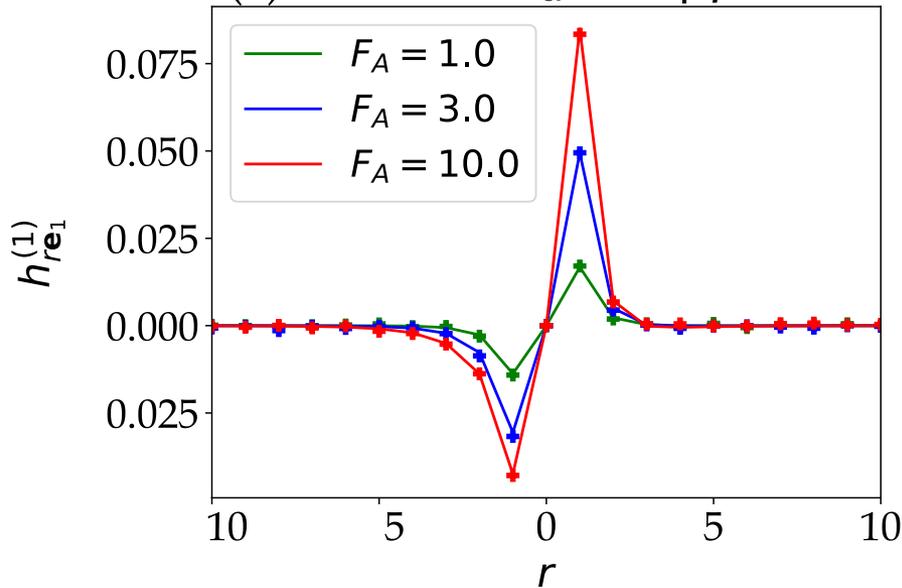
tracer-bath correlation function

➔ **Interplay** between the displacement of the active particle and the **response** of the environment

➔ **Accumulation** of bath particles in front of the tracer and **depletion** behind it

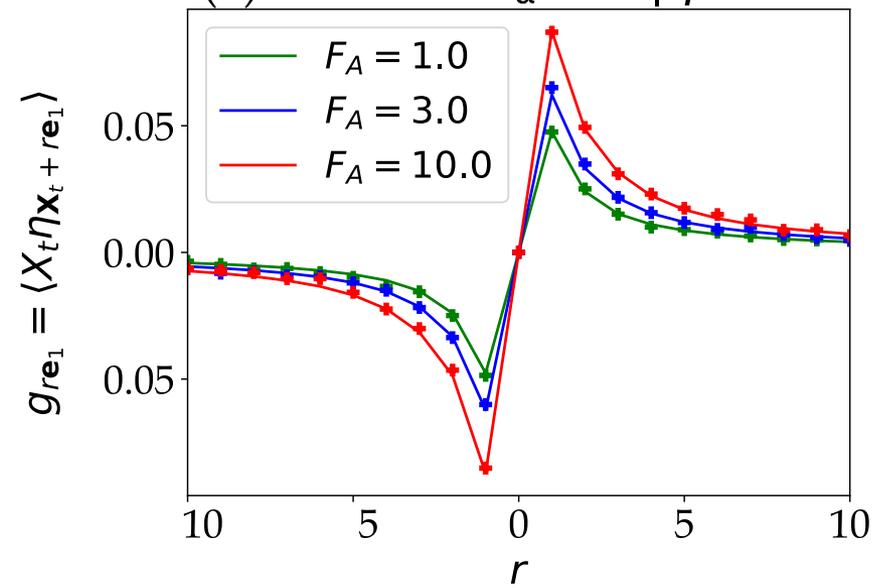
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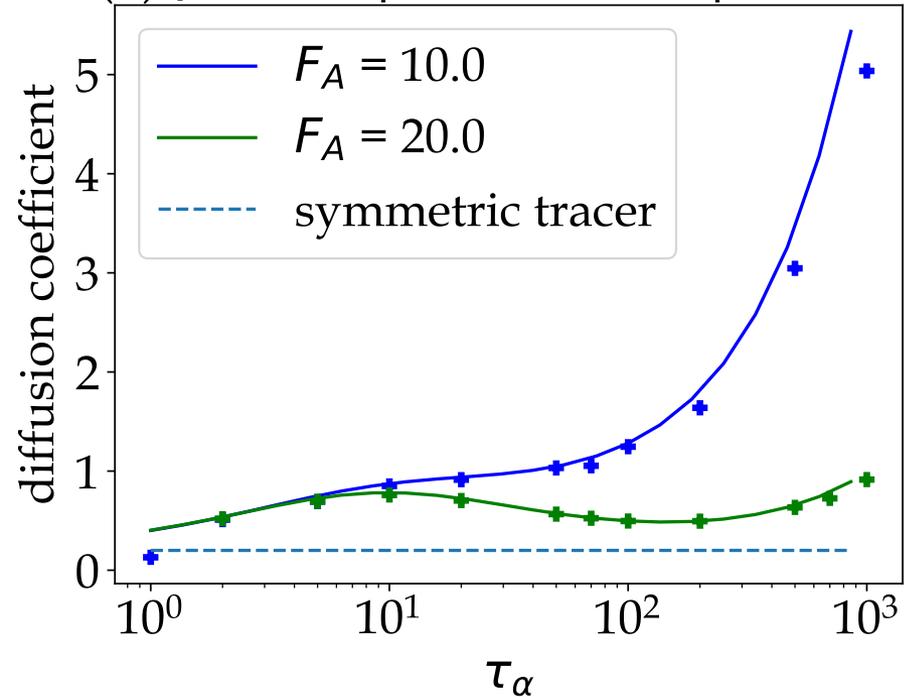
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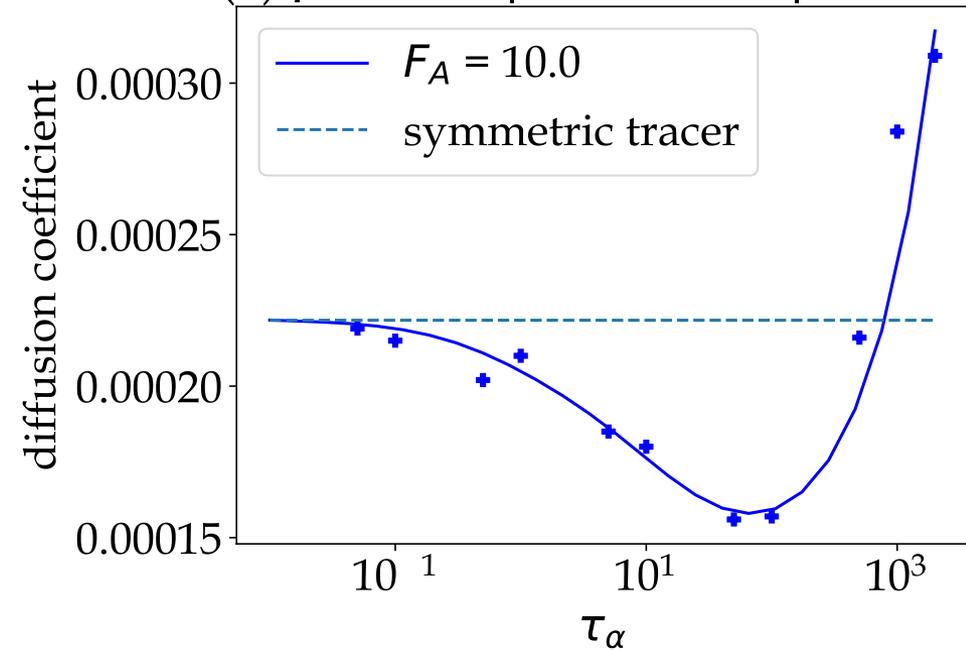
➔ **Local anisotropy** of the environment induced by the active particle

# Non-monotonic behaviour of the diffusion coefficient

(a)  $\rho = 0.1$  |  $\tau^* = 100.0$  |  $\tau = 1.0$



(a)  $\rho = 0.99$  |  $\tau^* = 10.0$  |  $\tau = 1.0$



Asymptotic limits:

$\tau_\alpha \rightarrow 0$  passive (symmetric) tracer (NK theory)

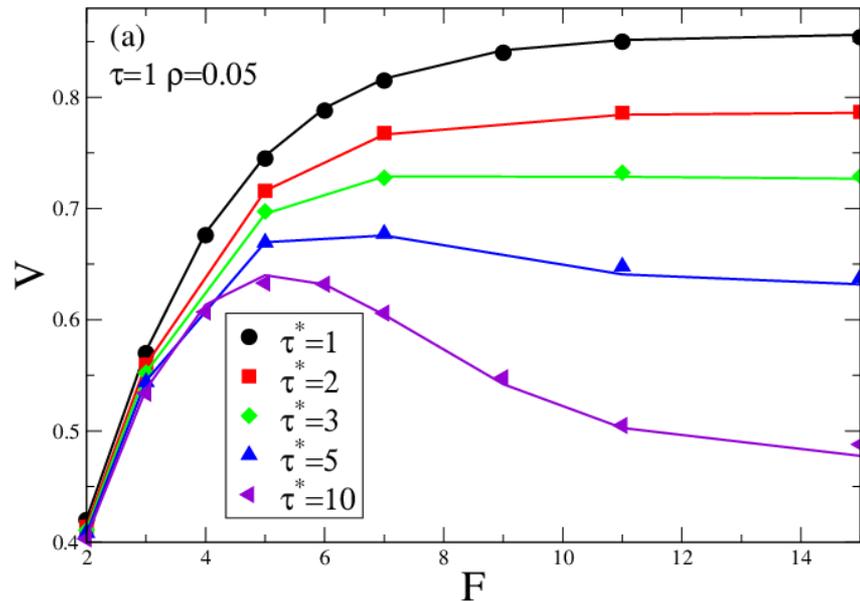
$\tau_\alpha \rightarrow \infty$  diffusion coefficient diverges  
(except in the specific limit of fixed obstacles)

**Non-monotonic** behaviour between these two limits

# Driven passive particle

Apply an **external force** on the **passive** tracer

**Negative differential mobility** can be observed



Bénichou, AS, et al. Phys. Rev. Lett. (2014)  
Phys. Rev. E (2016)

Baiesi et al. Phys. Rev. E 92, 042121 (2015)

The **differential mobility**  $\mu(F) = \left. \frac{\delta V}{\delta F} \right|_F$  measures how the

velocity increases with changing  $F \rightarrow F + dF$

➔ **“Getting more from pushing less”**

Zia et al. Am. J. Phys. (2002)

# Driven active particle

Apply an **external force** on the **active** particle

$$p_{\mu}^{(\chi)} = \frac{\exp \left[ (F_A \mathbf{e}_{\chi} + F_E \mathbf{e}_1) \cdot \mathbf{e}_{\mu} / 2 \right]}{Z}$$

Tracer **velocity**

$$\frac{d \langle X_t \rangle}{dt} = \frac{1}{2d\tau} \sum_{\chi} \left\{ p_1^{(\chi)} \left[ 1 - k_{\mathbf{e}_1}^{(\chi)} \right] - p_{-1}^{(\chi)} \left[ 1 - k_{\mathbf{e}_{-1}}^{(\chi)} \right] \right\}$$

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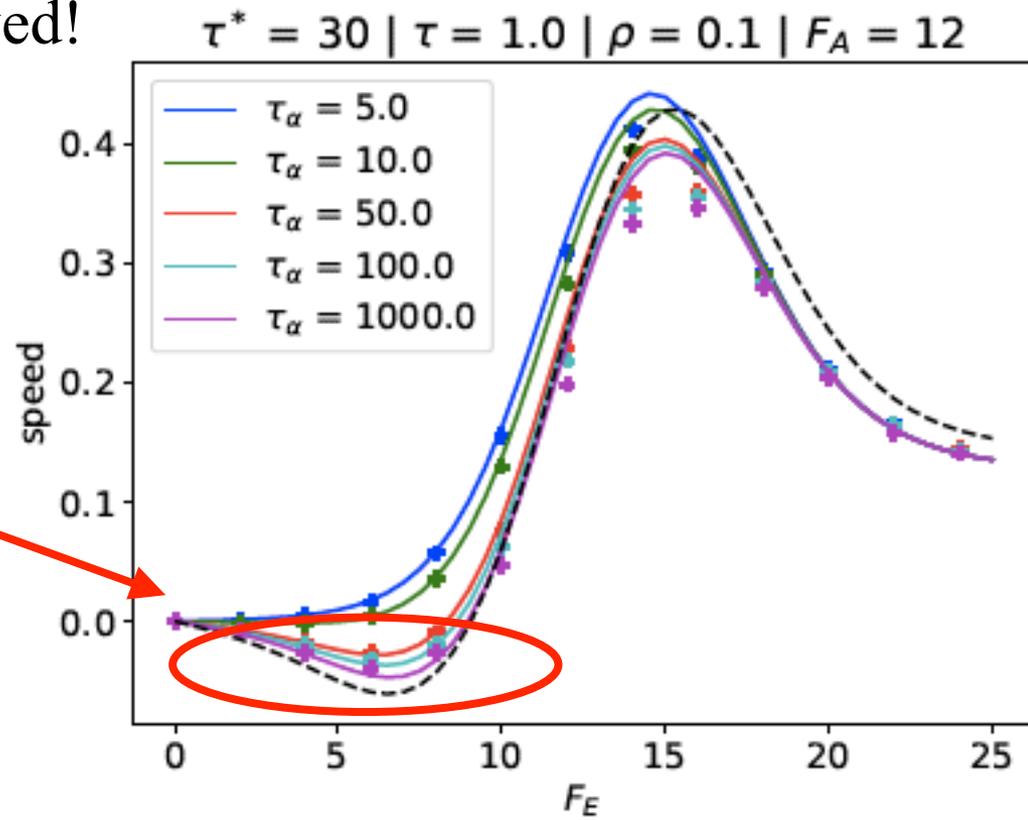
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Tracer **velocity**

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**Negative mobility** can be observed!

**Absolute negative mobility!**



# Conclusions

Interest in **lattice gas models** for active particles

**Analytical treatment** in the interacting case is possible  
(with some approximations)

**Coupling** between active tracer and environment,  
**response** of the medium

**Nonlinear** striking effects are observed: **non-monotonic** behaviours,  
**optimal** parameters to maximise/minimise diffusion (or mobility),  
**absolute negative** mobility

# Simple argument for ANM

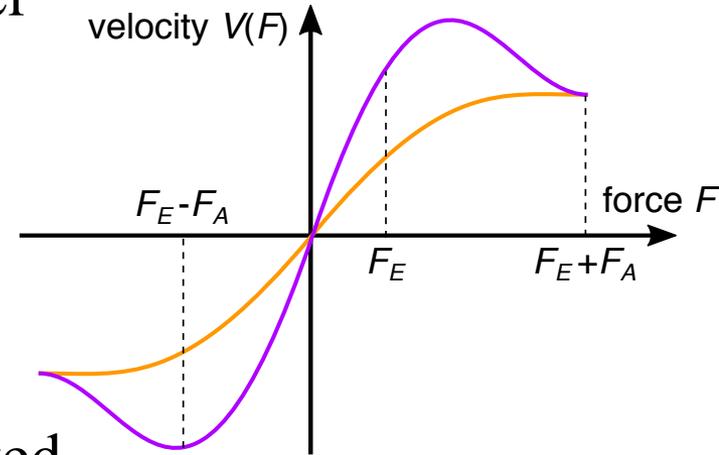
Consider the simple situation where the tracer is submitted to an **active** force  $F_A$  that may only point in directions  $\pm 1$

In the limit where the **persistence time** is greater than other timescales, the average velocity of the tracer can therefore be estimated as the average of the velocities conditioned on

$$V \simeq \frac{1}{2} [V_0(F_E + F_A) + V_0(F_E - F_A)],$$

where  $V_0(F)$  is the stationary velocity of a passive particle submitted to an external force  $F$

When the tracer displays **negative differential mobility**, one may observe the situation where  $|V_0(F_E - F_A)| > |V_0(F_E + F_A)|$ , therefore resulting in a situation where average velocity  $V$  is **negative** although  $F_E > 0$ .



# Simple arguments for the non-monotony of $D$

Assume **low density** and **large active force**

The obstacles are **independent** and the probability for the tracer to find an obstacle at a given site is  $\rho$

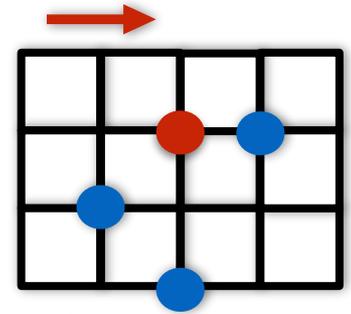
For a **large force**  $F \rightarrow \infty$ , neglect the probability that the tracer moves in the direction opposite to the force

Approximate the characteristic time between two jumps as:

**internal jump time**  $\tau$  + the **mean trapping time**;

the escape from a trap is caused by three independent events:

- the **obstacle** moves in a transverse direction with characteristic time  $\tau^*$ ;
- the **active force** changes direction with characteristic time  $\tau_\alpha$ ;
- the **tracer** moves in a direction transverse to the active force with characteristic time



Mean trapping time 
$$\frac{1}{\tau_p} = \frac{(2d-2)}{2d\tau^*} + \frac{1}{\tau_\alpha} + \frac{(1-p_1^{(1)} - p_{-1}^{(1)})}{\tau} \tau / (1 - p_x^{(x)} - p_{-x}^{(x)})$$

Diffusion coefficient 
$$D = \frac{1}{2d(\tau + \rho\tau_p)} \left[ 1 + \frac{(2d-1)\tau_\alpha}{d(\tau + \rho\tau_p)} \left( p_1^{(1)} - p_{-1}^{(1)} \right)^2 \right]$$