Transport properties of an active Brownian agent in complex environments

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## Self-propelled agents



Bacteria using flagella to swim


Paramecium uses cilia

self-propelled Janus particle

- Swimming mechanism by shape deformations or induced gradients in the fluid
- intrinsically far from equilibrium
- recent experimental progress to build artificial self-propelled particles
- plethora of collective phenomena (flocking, swarms, phase separation, trapping,...)
- mostly simulational studies
- lacking: complete characterization of single particle motion


## Motivation- Transport of Stiff Rods


cellular crowding
O. Medalia et al (2002) Science


Fibroblast
Rodionov et al., PNAS 96, 1999

tobacco mosaic virus R.G. Milne

silver rods
Y. Roichman, Tel Aviv

## Experimental model systems

reconstituted F -actin, entangled with a network of ...


Miklós Kellermayer
University of Budapest (Hungary)
... F-actin


Rudolf Merkel FZ Jülich (Germany)

## Toy Model for F-Actin solutions



- filaments are stiff and thin
$\rightarrow$ approximate by needles
- single filament dynamics
$\rightarrow$ fix surrounding filaments in 3-dim. space needle Lorentz model

- restrict motion to a plane
$\rightarrow$ surrounding filaments
appear as hard disks


## Tube Model

- F-actin: very thin filaments
$L \approx 10 \ldots 100 \mu \mathrm{~m}, R \approx 0.005 \mu \mathrm{~m}$
$\rightarrow$ reduce rod to a thin needle and disks to points ( $R=0$ )
- isolate entanglement effects (no excluded volume) dynamic crowding
- at high filament densities: Tube model mesh size $\xi:=n^{-1 / 2}$
tube diameter $d \sim 1 / n L=\xi^{2} / L$
tilt angle $\varepsilon=d / L$
reduced density $n^{*}=n L^{2}$
rotational diffusion constant


$$
D_{\mathrm{rot}} \sim \frac{\varepsilon^{2}}{2 \tau_{d}} \sim \frac{1}{n^{2} L^{4} \tau_{0}}
$$

Doi \& Edwards (1978)

## Persistence of the Orientation

Brownian rod in 2D

- sliding motion of the rod
- orientation changes only gradually
- experiment Yael Roichman (TAU) S3_pillar



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## Brownian dynamics simulation

## Brownian dynamics in 3D

- infinitely thin needles of number density $n$, length $L$ dimensionless density $n^{*}=n L^{3}$
- free motion: rotational diffusion $D_{\text {rot }}^{0}$, anisotropic translational diffusion $D_{\|}^{0}, D_{\perp}^{0}$
- unit vector of orientation $\mathbf{u},|\mathbf{u}|=1$, position of the needle $\mathbf{r}$ Stochastic dynamics (Itō)

$$
\begin{aligned}
& \mathrm{d} \mathbf{u}=-2 D_{\mathrm{rot}}^{0} \mathbf{u} \mathrm{~d} t-\sqrt{2 D_{\mathrm{rot}}^{0}} \mathbf{u} \times \boldsymbol{\xi} \mathrm{d} t \\
& \mathrm{~d} \mathbf{r}=\left[\sqrt{2 D_{\|}^{0}} \mathbf{u u}+\sqrt{2 D_{\perp}^{0}}(\mathbb{I}-\mathbf{u} \mathbf{u})\right] \boldsymbol{\eta} \mathrm{d} t
\end{aligned}
$$

- independent white noise $\boldsymbol{\xi}, \boldsymbol{\eta}:\left\langle\xi_{i}(t) \xi_{j}\left(t^{\prime}\right)\right\rangle=\left\langle\eta_{i}(t) \eta_{j}\left(t^{\prime}\right)\right\rangle=\delta_{i j} \delta\left(t-t^{\prime}\right)$
- implementation by orthogonal integrator, pseudo-scheme: interrupted free propagation using pseudo-velocities, pseudo-angular velocities drawn from Maxwell distributions
- elastic collisions with other needles symmetry-adapted neighbor list


## Diffusion coefficients

## Brownian dynamics simulations

- needle liquids
- needle Lorentz system tracer needle explores frozen array of needles needle in a haystack
- data to highly entangled regime
- Doi-Edwards scaling $D_{\text {rot }} \sim n^{-2}$
- Needle Lorentz and Liquids behave similarly
- Prediction for $D_{\perp} \sim n^{-2}$ by entering new tubes

> Tube is collectively build by many surrounding needles


Leitmann, Höfling, Franosch, PRL (2016)

## Ramifications of the Tube

## Phantom needle

- Tube confines needle
$\rightarrow$ motion essentially along the tube, orientational relaxation by tube renewal Phantom needle performs anisotropic diffusion with effective transport coefficients $D_{\mathrm{rot}}, D_{\perp}, D_{\|}$ forgotten!(?) prediction of Doi \& Edwards (1978)
- conditional probability density $\mathbb{P}\left(\mathbf{r}, \mathbf{u}, t \mid \mathbf{u}_{0}\right)$ (Green function)

Perrin equation (Markov process)

$$
\partial_{t} \mathbb{P}=D_{\text {rot }} \Delta_{\mathbf{u}} \mathbb{P}+\quad \partial_{\mathbf{r}} \cdot\left[D_{\|}\left(\partial_{\mathbf{r}} \mathbb{P}\right)-\Delta D(\mathbb{I}-\mathbf{u u}) \cdot\left(\partial_{\mathbf{r}} \mathbb{P}\right)\right]
$$

## orientational diffusion

 anisotropic translational diffusion $\Delta D=D_{\|}-D_{\perp}$- marginalize for ISF

$$
F(k, t)=\langle\exp (-i \mathbf{k} \cdot \Delta \mathbf{r}(t))\rangle=\int_{S^{2}} \mathrm{~d} \mathbf{u} \int_{S^{2}} \frac{\mathrm{~d} \mathbf{u}_{0}}{4 \pi} \int_{\mathbb{R}^{3}} \mathrm{~d}^{3} r \exp (-i \mathbf{k} \cdot \mathbf{r}) \mathbb{P}\left(\mathbf{r}, \mathbf{u}, t \mid \mathbf{u}_{0}\right)
$$

Solve or simulate phantom needle

## Spatio-temporal transport



- Phantom needle describes spatio-temporal dynamics for dynamically crowded systems $n^{*}=n L^{3} \gtrsim 100$
- First data in highly entangled regime, first test of Doi-Edwards prediction
- Characteristic tail $t^{-1 / 2}$ sliding motion in the tube

Leitmann, Höfling, Franosch, PRL (2016)

## Mini-Résumé

## Dynamically crowded needles

- Minimal model for solutions of F-actin
- First simulations of needles deep in the semidilute regime $n L^{3} \gg 1$ symmetry adapted neighbor list
- Tube concept reduces many-body problem to single particle motion $\rightarrow$ non-perturbative approach
- Needle liquids and needle Lorentz systems behave asymptotically identically justifies 2D toy model
- Strong suppression of orienatational diffusion $D_{\text {rot }} \sim n^{-2}$
- Full spatio-temporal information encoded in phantom needle
- algebraic decay is fingerprint of sliding motion
- full analytic solution of the phantom needle beyond Doi \& Edwards simplified harmonic oscillator analysis
- Form factor can be included easily in simulation


## Model set-up

## Active Brownian Particle



- Active propulsion with constant velocity $v$ along the long axis $\mathbf{u},|\mathbf{u}|=1$
- Rotational diffusion $D_{\text {rot }}$
- Anisotropic translational diffusion $D_{\|}, D_{\perp}$
- ignores microscopic origin of propulsion, effective description
- simplistic model encoding persistent random walk
persistence length $\ell=v / D_{\text {rot }}$, persistence time $\tau=1 / D_{\text {rot }}$


## Stochastic equations (3D)

## Active Brownian particle

$$
\begin{gathered}
\mathrm{d} \mathbf{u}=-2 D_{\operatorname{rot}} \mathbf{u d} t-\sqrt{2 D_{\operatorname{rot}}} \mathbf{u} \times \boldsymbol{\xi} \mathrm{d} t \\
\mathrm{~d} \mathbf{r}={ }_{\hat{v}}^{v} \mathbf{u} d t+\left[\sqrt{2 D_{\|}} \mathbf{u u}+\sqrt{2 D_{\perp}}(\mathbb{I}-\mathbf{u u})\right] \boldsymbol{\eta} \mathrm{d} t \\
\text { orientation } \\
\left\langle\xi_{i}(t) \xi_{j}\left(t^{\prime}\right)\right\rangle=\left\langle\eta_{i}(t) \eta_{j}\left(t^{\prime}\right)\right\rangle=\delta_{i j} \delta\left(t-t^{\prime}\right)
\end{gathered}
$$

independent Gaussian white noise

- multiplicative noise (Itō)
- translational anisotropy $\Delta D=D_{\|}-D_{\perp}$ mean diffusion coefficient $\bar{D}=\left(D_{\|}+2 D_{\perp}\right) / 3$
- For long rods $D_{\|}=2 D_{\perp}, D_{\text {rot }}=12 D_{\perp} / L^{2}$, length of the needle $L$
- Dimensionless parameters

$$
\text { reduced number density } n^{*}=n L^{3}
$$

$$
\text { anisotropy } \Delta D / \bar{D}
$$

$$
\text { Péclet number } \mathrm{Pe}=v L / \bar{D}
$$

## Active Brownian particle in 3D

## Separation ansatz

- choose coordinates $\mathbf{k}$ in $z$-direction, parametrize $\mathbf{u}=(\sin \vartheta \cos \varphi, \sin \vartheta \sin \varphi, \cos \vartheta)$, write $\eta=\cos \vartheta$
- separation ansatz yields superposition of eigenfunctions

$$
\tilde{\mathbb{P}}\left(\mathbf{k}, \mathbf{u}, t \mid \mathbf{u}_{0}\right)=\frac{1}{2 \pi} e^{-D_{\perp} k^{2} t} \sum_{\ell=0}^{\infty} \sum_{m=-\ell}^{\ell} e^{i m\left(\varphi-\varphi_{0}\right)} \operatorname{Ps}_{\ell}^{m}(c, R, \eta) \operatorname{Ps}_{\ell}^{m}\left(c, R, \eta_{0}\right)^{*} \exp \left(-A_{\ell}^{m} D_{\mathrm{rot}} t\right)
$$

- generalized spheroidal wave functions $\operatorname{Ps}_{\ell}^{m}(R, c, \eta)$

- deformation of (associated) Legendre polynomials $\mathrm{P}_{\ell}^{m}(\eta)$
- Intermediate scattering function

$$
F(k, t)=\frac{1}{2 \pi} e^{-D_{\perp} k^{2} t} \sum_{\ell=0}^{\infty} \exp \left(-A_{\ell}^{0} D_{\mathrm{rot}} t\right)\left|\int_{-1}^{1} \mathrm{~d} \eta \mathrm{Ps}_{\ell}^{0}(c, R, \eta)\right|^{2}
$$

## Low-order moments

## Mean-square displacement (3D)



- Expansion of ISF for isotropic system

$$
\begin{gathered}
F(k, t)=\langle\exp (-i \mathbf{k} \cdot \Delta \mathbf{r}(t))\rangle=\left\langle\frac{\sin (k|\Delta \mathbf{r}(t)|)}{k|\Delta \mathbf{r}(t)|}\right\rangle \\
\left.\left.F(k, t)=1-\left.\frac{k^{2}}{3!}\langle | \Delta \mathbf{r}(t)\right|^{2}\right\rangle+\left.\frac{k^{4}}{5!}\langle | \Delta \mathbf{r}(t)\right|^{4}\right\rangle+\mathcal{O}\left(k^{6}\right)
\end{gathered}
$$

- MSD initially translational diffusion dominates persistent swimming effective diffusion

$$
\left.\left.\langle | \Delta \mathbf{r}(t)\right|^{2}\right\rangle=6 \bar{D} t+\frac{v^{2}}{2 D_{\text {rot }}^{2}}\left(e^{-2 D_{\text {rot }} t}+2 D_{\text {rot }} t-1\right)
$$

## Low-order moments

## Non-Gaussian parameter (3D)



- Non-Gaussian parameter

$$
\alpha_{2}(t)=\frac{\left.\left.3\langle | \Delta \mathbf{r}(t)\right|^{4}\right\rangle}{\left.\left.5\langle | \Delta \mathbf{r}(t)\right|^{2}\right\rangle^{2}}-1
$$

- initially non-gaussian by translational anisotropy characteristic minimum due to persistent swimming eventually again Gaussian


## Intermediate scattering function






- characteristic oscillations emerge at intermediate wavenumbers
fingerprint of persistent swimming

$$
F(k, t)=\left\langle\frac{\sin (k|\Delta \mathbf{r}(t)|)}{k|\Delta \mathbf{r}(t)|}\right\rangle
$$

- large wavenumbers anisotropic translational diffusion
- small wavenumbers effective diffusion

$$
D_{\mathrm{eff}}=\bar{D}+v^{2} / 6 D_{\mathrm{rot}}
$$

## How can oscillations emerge?

(a)

(b)


- Intermediate scattering function sum of relaxing exponentials?

$$
F(k, t)=\frac{1}{2 \pi} e^{-D_{\perp} k^{2} t} \sum_{\ell=0}^{\infty} \exp \left(-A_{\ell}^{0} D_{\mathrm{rot}} t\right)\left|\int_{-1}^{1} \mathrm{~d} \eta \operatorname{Ps}_{\ell}^{0}(c, R, \eta)\right|^{2}
$$

- Eigenvalue problem is non-Hermitian, eigenvalues become complex branching in the eigenvalues $\rightarrow$ no perturbation theory fingerprint of active motion

Christina Kurzthaler et al, Sci. Rep. (2016)

## Crowded suspension of active needles



Does the tube model apply to active needles? How do the dynamics change?


## Crowded is faster



- mean-square displacement $\left\langle[\Delta \mathbf{r}(t)]^{2}\right\rangle$ displays three regimes short-time diffusion - directed motion - effective diffusion
- free needle $D_{\text {eff }}^{0}=\bar{D}^{0}+v^{2} \tau_{\text {rot }}^{0} / 3$
- Entanglement speeds up the effective diffusion $D_{\text {eff }} / D_{\text {eff }}^{0} \sim\left(n^{*}\right)^{2}$


## Orientational dynamics



- Orientation correlation function $\langle\mathbf{u}(t) \cdot \mathbf{u}(0)\rangle$ approaches perfect exponential
- relaxation time $\tau_{\text {rot }}$ increases by orders of magnitude


## Relaxation time



- tube picture:
disengagement time $\tau_{0} \hat{=}$ time to move length $L$ interpolation formula $\tau_{0}^{-1}=D_{\|}^{0} / L^{2}+v / L$ rotation angle $\varepsilon \sim d / L \sim\left(n^{*}\right)^{-1}$

$$
\tau_{\text {rot }} \sim \frac{1}{\varepsilon^{2} \tau_{0}^{-1}} \sim \frac{\left(n^{*}\right)^{2}}{D_{\|}^{0} / \bar{D}^{0}+\mathrm{Pe}} \tau_{\text {rot }}^{0}
$$

reduces to Doi-Edwards for $\mathrm{Pe}=0$ additional decrease by activity

- master plot for effective diffusion

$$
\frac{D_{\mathrm{eff}}}{D_{\mathrm{eff}}^{0}} \sim \frac{\tau_{\mathrm{rot}}}{\tau_{\mathrm{rot}}^{0}} \sim \frac{\left(n^{*}\right)^{2}}{\mathrm{Pe}}
$$

## Corroborating the tube picture



- perpendicular displacement in comoving frame $\Delta \mathbf{r}_{\perp}(t)$
- plateau emerges for highly entangled systems $\rightarrow$ defines tube diameter $d$
- scaling $d / L \sim\left(n^{*}\right)^{-1}$


## Spatio-temporal transport

(a)




- intermediate scattering function

$$
F(k, t)=\langle\exp [-i \mathbf{k} \cdot \Delta \mathbf{r}(t)]\rangle=\left\langle\frac{\sin (k|\Delta \mathbf{r}(t)|)}{k|\Delta \mathbf{r}(t)|}\right\rangle
$$

- agreement over 5 orders of magnitude $\rightarrow$ exact theory for high entanglement
- swimming motion approximately described by $|\Delta \mathbf{r}(t)|=v t \rightarrow F(k, t)=\sin (k v t) / k v t$

$$
\text { S. Mandal, C. Kurzthaler, T. Franosch, and H. Löwen, PRL 125, } 138002 \text { (2020) }
$$

## Mini-Résumé on Needles

## Active Brownian particles in 3D

- intermediate scattering function can be solved analytically
- non-trivial oscillations as fingerprint of active propulsion


## Active needles in suspension

- crowding rectifies the motion of active needles $\rightarrow$ crowded is faster
- Doi-Edwards tube model can be extended to active needles
- exact description on mesoscopic scales by renormalized orientational diffusion $D_{\text {rot }}$
- origin is a separation of time and length at mesoscopic scales


## Lorentz Model

- classical gas of non-interacting, structureless particles
- randomly distributed, fixed obstacles: overlapping hard spheres Swiss Cheese model

- ballistic motion, elastic scattering

- relevant for transport in disordered media
- single control parameter: reduced obstacle density $n^{*}=n \sigma^{d}$



## Mean-Square Displacement (3D)



- ballistic motion, specular scattering
- critical density $n_{c}$ subdiffusive transport $\delta r^{2}(t) \sim t^{2 / z}$
- localization transition percolation of void space localization length
$\ell^{2}=\delta r^{2}(t \rightarrow \infty)$
$\ell \sim\left(n_{c}^{*}-n^{*}\right)^{\nu++\beta / 2}$ geometric exponents of percolation $\nu, \beta$
- scaling theory of critical phenomena

$$
\delta r^{2}(t)=t^{2 / z} \delta \hat{r}_{ \pm}^{2}(\hat{t}), \quad \hat{t} \propto t \ell^{-z}
$$

- corrections to scaling are relevant
F. Höfling, T. Franosch, E. Frey, PRL 96, 165901 (2006)


## Infinite cluster

## Infinite cluster only



- Voronoi tesselation identifies infinite cluster only conducting side
- subdiffusive at critical point $\delta r_{\infty}^{2} \sim t^{2 / d_{w}}$ walk dimension $d_{w} \approx 4.81$
- scaling behavior anticipated

- diffusion coefficient vanish $D(n) \sim \varepsilon^{\mu}$, $\varepsilon=\left(n-n_{c}\right) / n_{c} D_{\infty}(n) \sim \varepsilon^{\mu_{\infty}}$ extrapolate to same point
M. Spanner et al, J.Phys.:Condens. Matt. (2011)


## Mean-square displacement for Brownian tracers (2D)



- Brownian tracers
- critical density $n_{c}$ subdiffusive transport $\delta r^{2}(t) \sim t^{2 / z}$ critical exponent $z=3.036$ (lattice value)
- localization transition percolation of void space
- scaling theory of critical phenomena
T. Bauer et al, EPJ-ST (2010)


## Time-dependent diffusion (2D)



- time-dependent diffusion coefficient

$$
D(t):=\frac{1}{2 d} \frac{\mathrm{~d}}{\mathrm{~d} t} \delta r^{2}(t)
$$

- diffusion constant

$$
D=\lim _{t \rightarrow \infty} D(t)
$$

slowing down of diffusion

- critical density $n_{c}$ subdiffusive transport $D(t) \sim t^{2 / z-1}$ critical exponent $z=3.036$ (lattice value)
- localization transition $D(t) \rightarrow 0$
T. Bauer et al, EPJ-ST (2010)


## Long-time tails (2D)



- velocity-autocorrelation function

$$
z(t):=\frac{1}{2 d} \frac{\mathrm{~d}^{2}}{\mathrm{~d} t^{2}} \delta r^{2}(t)
$$

- persistent anticorrelations for $n^{*}<n_{c}^{*}$

$$
Z(t) \simeq-A t^{-2}
$$

repeated scattering with the same obstacle

- rectification shows universality approximately $\propto n^{*} \rightarrow$ can be calculate to first order in $n^{*}$


## Brownian tracers in the 2D Lorentz model



- theory describes nicely the data at low densities
- Long-time tails persists at all densities

Formal scattering theory
borrowed from quantum many-body problems
Lorentz model analogous to Anderson model:
Localization transition $\Leftrightarrow$ Metal-Insulator transition
Long-time tails $\Leftrightarrow$ weak localization
Multiple collision expansion to first order in density Velocity autocorrelation function (VACF)

- explicit expression for $Z(\omega)$
- diffusion coefficient

$$
D=Z(\omega=0)=D_{0}\left(1-\pi n^{*}\right)+\mathcal{O}\left(n^{* 2}\right)
$$

- algebraic long-time tail

$$
Z(t) \simeq \frac{-\pi n^{*} \sigma^{2}}{2 t^{2}} \quad \text { for } t \rightarrow \infty
$$

Franosch et al Chem. Phys. (2010)

## ABP in disordered environement



- Soft spheres: Weeks-Chandler-Anderson potential
- diameter of ABP: $2 R_{s}$
- definition of Péclet number $\mathrm{Pe}=2 R_{s} v / D$ persistent length $L=v \tau_{\text {rot }}$
time scale $\tau_{\text {rot }}=1 / D_{\text {rot }}, \tau_{\text {diff }}=\left(2 R_{s}\right)^{2} / D$ here $\tau_{\text {rot }} / \tau_{\text {diff }}=1 / 3$

$$
\frac{L}{2 R_{s}}=\operatorname{Pe} \frac{\tau_{\text {rot }}}{\tau_{\text {diff }}}=100 \times \frac{1}{3}
$$

- packing fraction $\eta=\pi R_{0}^{2} / A$

$$
\text { area fraction } \quad \phi_{0}=1-\exp (-\eta)
$$

- sliding along the boundary
M. Zeitz, K. Wolff, and H. Stark, Eur. Phys. J. E (2017) 40: 23


## ABP in disordered environement

## Mean-square displacement



- crossover from persistent to diffusive motion $L / 2 R_{s}=33.33$ for $\eta=0$
- suppression of persistent motion already at small obstacle density since $L \gg 2 R_{S}$
- confining space are explored more rapidly by sliding
- subdiffusive transport $\propto t^{2 / z}$ at critical packing fraction
- localized at high packing fraction


## ABP in disordered environement

## Critical density



- subdiffusion for all Péclet numbers at critical packing fraction
- critical exponent $z=z_{\text {lat }} \doteq 3.036$ is universal in 2D M. Spanner et al PRL 116, 060601 (2016)
- prefactor of asymptotic behavior depends strongly on Péclet number


## Circle swimmers

## Escherichia coli



- Chirality of flagellar motion
- Hydrodynamic coupling close to boundaries $\rightarrow$ circular motion
- angular drift velocity $\omega$


$$
\begin{aligned}
\frac{\mathrm{d}}{\mathrm{~d} t} \vartheta(t) & =\omega+\zeta(t) \\
\left\langle\zeta(t) \zeta\left(t^{\prime}\right)\right\rangle & =2 D_{\text {rot }} \delta\left(t-t^{\prime}\right)
\end{aligned}
$$

## Disordered environment



## Skipping orbits

- independently distributed obstacles
exclusion radius $\sigma$
dimensionless scatterer density $n^{*}=n \sigma^{2}$
$\rightarrow$ Lorentz model
- idealize to pure circular motion
$\rightarrow$ deterministic orbits
dimensionless trajectory curvature $B=\sigma / R$
- skipping orbits along edges of scatterer clusters
- model originally designed for electron transport in a magnetic field $\rightarrow$ 2DEG, obstacle by nanofabrication
long-range transport
by edge percolation


## Phases



- low scatterer density: skipping orbit around isolated clusters only $\rightarrow$ insulating phase
- intermediate density: skipping orbits percolate through entire system $\rightarrow$ diffusive phase
- high scatterer density: void space consists only of finite pockets $\rightarrow$ localized phase

Purely geometric transition

## Phase diagram



- Transition line to localized phase independent of curvature
$\rightarrow$ conventional percolation of void space

$$
n_{c}^{*}=0.359081 \ldots
$$

critical exponents correspond to conventional percolative transport on lattices

- Delocalization transition

$$
n_{m}(R)=n_{c}^{*} \sigma^{2} /(\sigma+R)^{2}
$$

$\rightarrow$ percolation of disks+halo
exact result!, 2 significant digits

Kuzmany \& Spohn, PRE (1998)

## Mean-square displacements


anamalous transport at $n_{m}^{*}=n_{m}^{*}(R)$

- mean-square displacement (MSD)

$$
\delta r^{2}(t)=\left\langle[\mathbf{R}(t)-\mathbf{R}(0)]^{2}\right\rangle
$$

- subdiffusive close to $n_{m}^{*}=n_{m}^{*}(R)$

$$
\delta r^{2}(t \rightarrow \infty) \sim t^{2 / z}
$$

critical exponent $z=2 / \gamma$ measured value $z=3.44 \pm 0.03$

- different from random walkers on percolating lattices $z \neq z_{\text {lat }}=3.036 \pm 0.001$


## New dynamic universality class

## Circle swimmer in disordered environment

## A more realistic scattering rule



- ideal circle swimmer $D_{\text {rot }}=0$
- circle radius $R=v / \omega$
- obstacle diameter $\sigma$, dimensionless obstacle density $n^{*}=N \sigma^{2} / L^{2}$
- swimmer slides along the edge
- random exit angle $\Delta \in[-\pi / 2, \pi / 2]$ orientation $\vartheta$ remains fixed
O. Chepizhko and T. Franosch, Soft Matter 15, 452 (2019)


## Circle swimmer in disordered environment

## Sample trajectories

a)


d)

e)

f)


## Circle swimmer in disordered environment

## Phase diagram

- phase diagram pure geometric!
- percolation to localization at

$$
n_{c}^{*}=0.359081 \ldots
$$

- meandering transition at

$$
n_{m}^{*}(\sigma, R)=n_{c}^{*} \frac{\sigma^{2}}{(\sigma+R)^{2}}=0.35908 \ldots \frac{\sigma^{2}}{(\sigma+R)^{2}}
$$

O. Chepizhko and T. Franosch, Soft Matter 15, 452 (2019)

## Circle swimmer in disordered environment

## Mean-square displacements



- critical dynamics

$$
\delta r^{2}(t) \propto t^{2 / z} \quad \text { for } t \rightarrow \infty
$$

at the meandering transition $n_{m}^{*}$

- dynamics drastically slower than lattice or magnetotransport

$$
z=5.17 \pm 0.48
$$

- various scaling relations hold $D \propto\left(n^{*}-n_{m}^{*}\right)^{\mu}$
- attributed ot weak links in percolating networks $\rightarrow$ new universality class
O. Chepizhko and T. Franosch, Soft Matter 15, 452 (2019)


## Circle swimmer in disordered environment

## Adding orientational noise



- angular diffusion

$$
\begin{aligned}
\frac{\mathrm{d}}{\mathrm{~d} t} \vartheta(t) & =\omega+\zeta(t) \\
\left\langle\zeta(t) \zeta\left(t^{\prime}\right)\right\rangle & =2 D_{\text {rot }} \delta\left(t-t^{\prime}\right)
\end{aligned}
$$

- Localization transition is unaffected geometric blocking $\checkmark$
- smearing of meandering transition
- enhancement of diffusion by meandering along boundaries for small obstacle density $n^{*}$ most efficient for small radii $R \ll \sigma$
- strong suppression for large $n^{*}$
O. Chepizhko and T. Franosch, New J. Phys. 22, 073022 (2019)


## Conclusion on random environments

## Passive particles ballistic/Brownian particles

- Lorentz model as paradigm for disorder randomly distributed overlapping obstacles
- localization transition at critical obstacle density
- percolative transport: critical phenomenon
$\rightarrow$ universal exponents


## Active Brownian particles and circle swimmers

- ABP displays same universal localization transition
- Meandering transition for ideal circle swimmer/magneto-transport new universality class for percolative transport
- small or moderate density of obstacles promotes diffusion $\rightarrow$ crowded is faster

