


Mesoscopic simulations of anisotropic chemically-powered nanomotors

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Stuttgart - Institute for Computational Physics - 24 June 2019



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<http://pdebuyl.be/>

Acknowledgments



Nanomotor and enzyme modeling

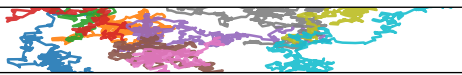
- ▶ Raymond Kapral (University of Toronto)

Funding

- ▶ Fonds Wetenschappelijk Onderzoek – Vlaanderen

About the slides

- ▶ The slides are downloadable <http://pdebuy1.be/>
- ▶ You can click on the references to go to the bibliography.
- ▶ There, you can click on the doi to go to the article.



Introduction: what are nanomotors and why are they interesting?

RMPCDMD

Mesoscopic simulations of L particles

Fast Correlation Algorithm

Conclusions & perspectives



What are nanomotors?

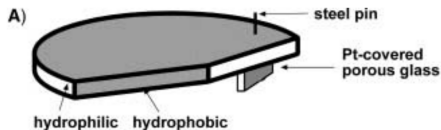
- ▶ 9mm disks Ismagilov *et al* (2002)
- ▶ Bimetallic nanorods Paxton *et al* (2004)
- ▶ Janus particles Howse *et al* (2007)
- ▶ Janus particles Ke *et al* (2010)
- ▶ Valadares *et al* (2010)
- ▶ 30 η m size motor Lee *et al* (2014)
- ▶ Sub- η m motor Pavlick *et al* (2013)

Introduction



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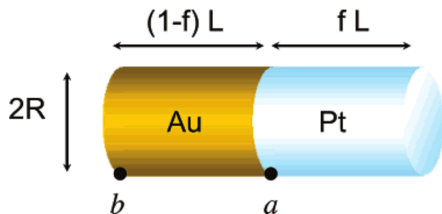


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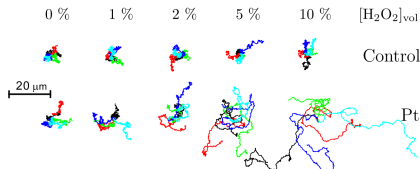


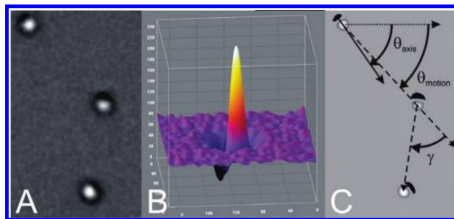
FIG. 1 (color online). Trajectories over 25 sec for $\times 5$ particles of the control (blank) and platinum-coated particles in water and varying solutions of hydrogen peroxide.

Introduction



What are nanomotors?

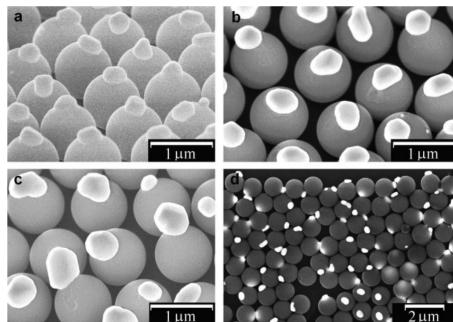
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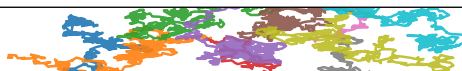


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Circle swimmers



Theory

- ▶ van Teeffelen and Löwen (2008)

Experiment

- ▶ Ebbens *et al* (2010)
- ▶ Kümmel *et al* (2013)
- ▶ ten Hagen *et al* (2014)

Simulations

- ▶ de Buyl (2018)

Circle swimmers



Theory

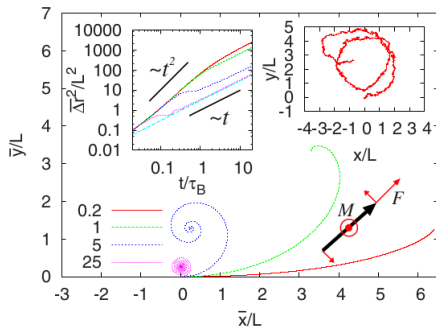
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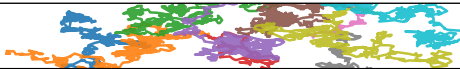
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Circle swimmers



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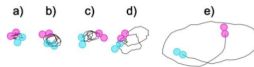
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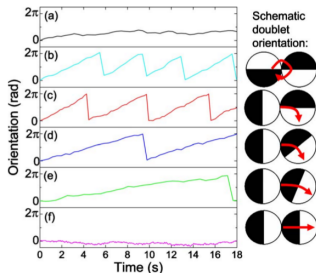
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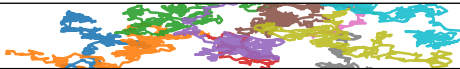
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20 μm



Circle swimmers



Theory

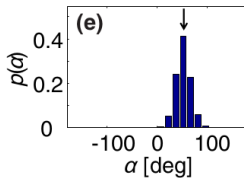
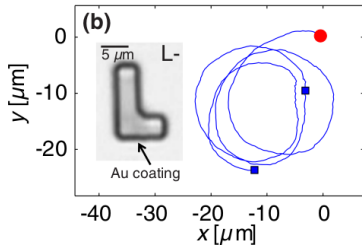
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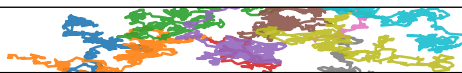
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Circle swimmers



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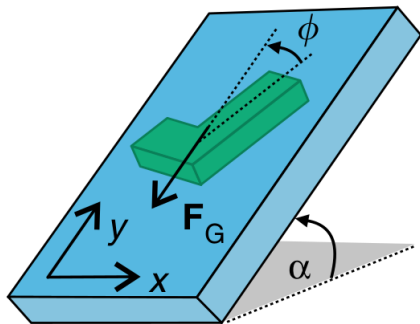
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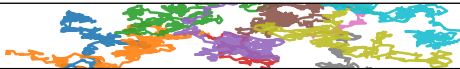
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Circle swimmers



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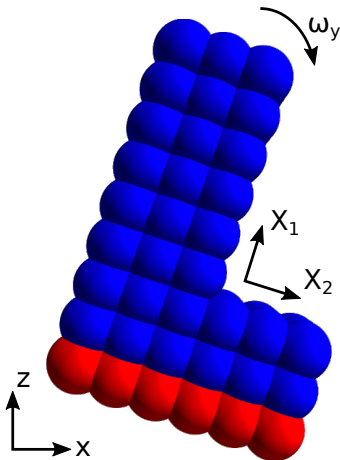
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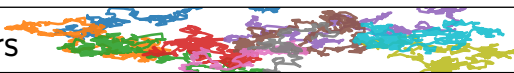
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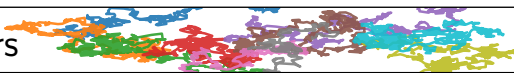
Perspectives for nanomotors



Applications

- ▶ Biotechnology
- ▶ Chemical processes
- ▶ New phases of matter

Perspectives for nanomotors



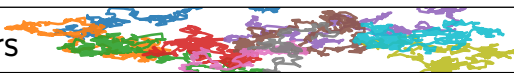
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Statistical Physics

- ▶ “Ideal” nonequilibrium device

Perspectives for nanomotors



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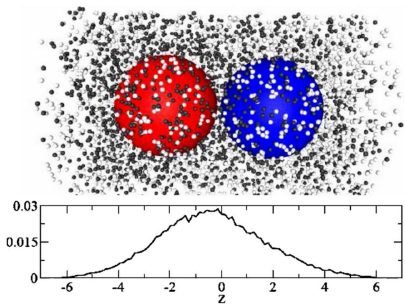
Reviews

- ▶ Wang (2013): general review (book)
- ▶ Kapral (2013): phoretic propulsion and applications of nanomotors
- ▶ Ebbens (2016): the special role of *chemical* nanomotors



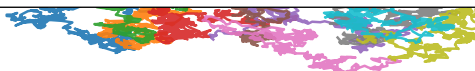
Methods

- ▶ Molecular Dynamics
- ▶ The solvent is coarse-grained using “Multiparticle Collision Dynamics” .
 - ▶ Thermal fluctuations
 - ▶ Hydrodynamics
 - ▶ Conservation of energy and momentum
- ▶ Chemical kinetics



From Rückner and Kapral (2007)

How do nanomotors move?



Phoretic theory

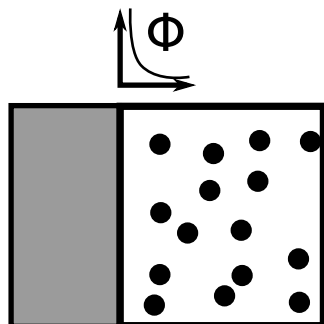
- ▶ Stokes equation in the boundary layer returns the slip velocity

$$v^s(\vec{r}) = -\frac{k_B T}{\eta} \Lambda \nabla c(\vec{r})$$

$$\Lambda = \int_0^\infty r [e^{-\Phi(r)/k_B T} - 1] dr$$

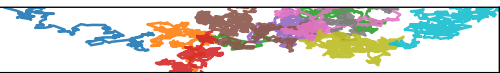
- ▶ Potential

$$V(r) = \epsilon \left(\left(\frac{\sigma}{r} \right)^{12} - \left(\frac{\sigma}{r} \right)^6 + \frac{1}{4} \right)$$

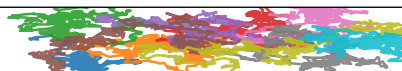


References

- ▶ Anderson (1989); Brady (2011); Kapral (2013)



RMPCDMD



Core features

- ▶ MPCD fluid particles with optional Andersen thermostat.
- ▶ Walls with reflective or bounce-back collisions.
- ▶ Molecular dynamics for spheres, dimers, and bead assemblies.
- ▶ Chemistry for the fluid.

Development

- ▶ Open-source: BSD 3-clause
- ▶ Fortran 2008, OpenMP
- ▶ <https://github.com/pdebuy1-lab/RMPCDMD>
- ▶ <http://lab.pdebuy1.be/rmpcdmd/>

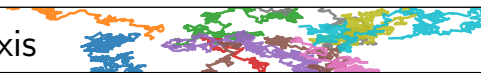


Trajectory data

- ▶ HDF5 trajectory files: <http://nongnu.org/h5md/>
- ▶ Contains named data. Sample:

```
particles
  \-- <group1>
    \-- box
    \-- (position)
      | \-- step: Integer[variable]
      | \-- time: Float[variable]
      | \-- value: <type>[variable] [N] [D]
    \-- (image)
      | \-- step: Integer[variable]
      | \-- time: Float[variable]
      | \-- value: <type>[variable] [N] [D]
    \-- (species: Enumeration[N])
    \-- ...
```

RMPCDMD usage: chemotaxis



Experiments

- ▶ Hong *et al* (2007)
- ▶ Baraban *et al* (2013)

Simulations

- ▶ Chen *et al* (2016)
- ▶ Deprez and de Buyl (2017)

RMPCDMD usage: chemotaxis

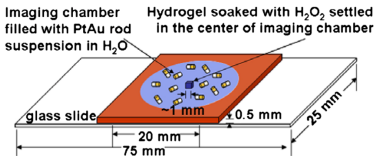
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- ▶ *Hong et al (2007)*
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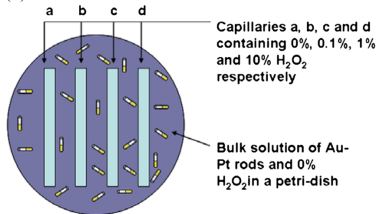
Simulations

- ▶ *Chen et al (2016)*
- ▶ *Deprez and de Buyl (2017)*

(a)



(b)



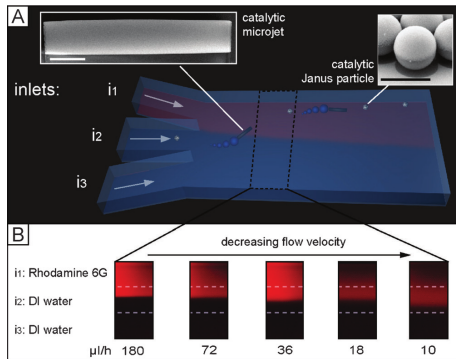
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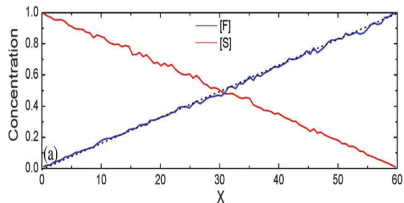
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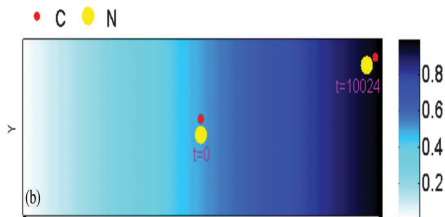
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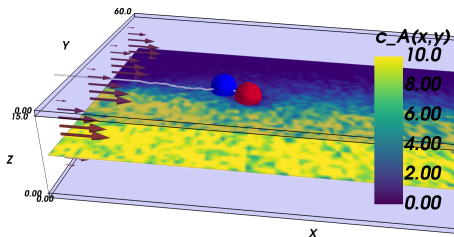
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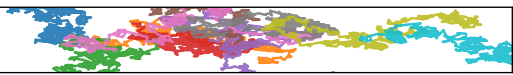
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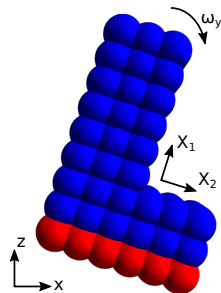
Mesoscopic simulations of L particles



Stochastic model

$$\begin{pmatrix} \dot{X}_1 \\ \dot{X}_2 \\ \dot{X}_3 \equiv \theta \end{pmatrix} = \sqrt{2D^L}\zeta + \beta D^L F ,$$

- ▶ D^L is the diffusion matrix
- ▶ ζ is a vector white noise
- ▶ F is an external force

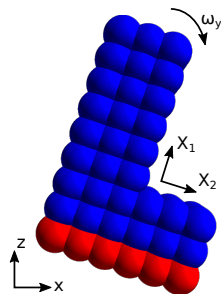




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Hydrodynamics [Happel and Brenner (1983)]

1. Flow-induced self-propulsion
2. Hydrodynamic friction on all coupled degrees of freedom
3. (Also a direct torque)



Definition

- ▶ As in Kraft *et al* (2013):

$$C_{ij}(\tau) = \langle (X_i(\tau) - X_i(0)) (X_j(\tau) - X_j(0)) \rangle$$



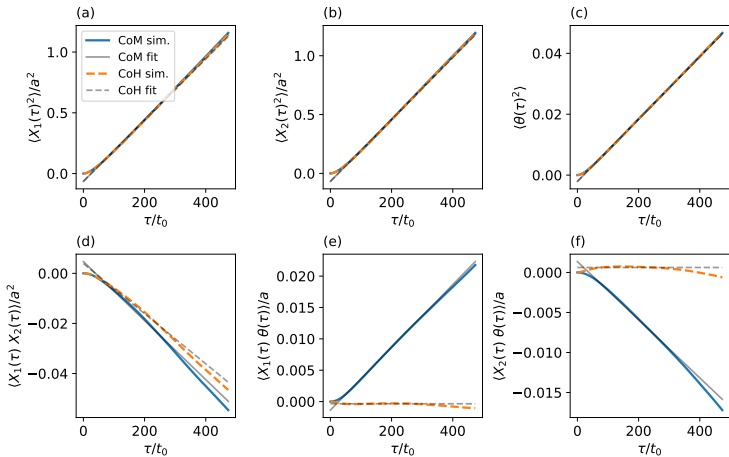
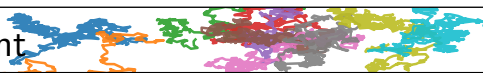
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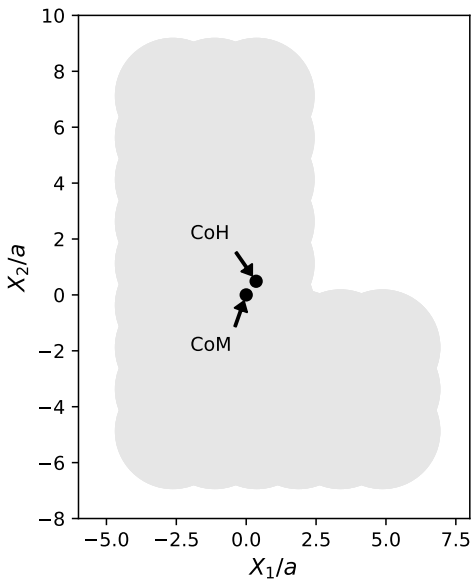
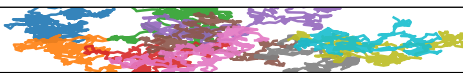
$$C_{ij}(\tau) = \langle (X_i(\tau) - X_i(0)) (X_j(\tau) - X_j(0)) \rangle$$

- ▶ The diagonal entries are the mean-square displacement.

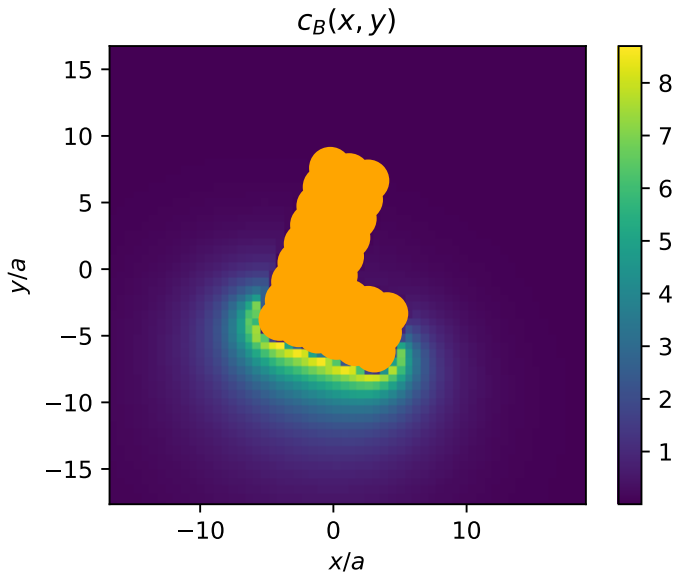
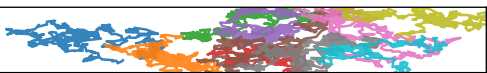
Equilibrium cross-displacement



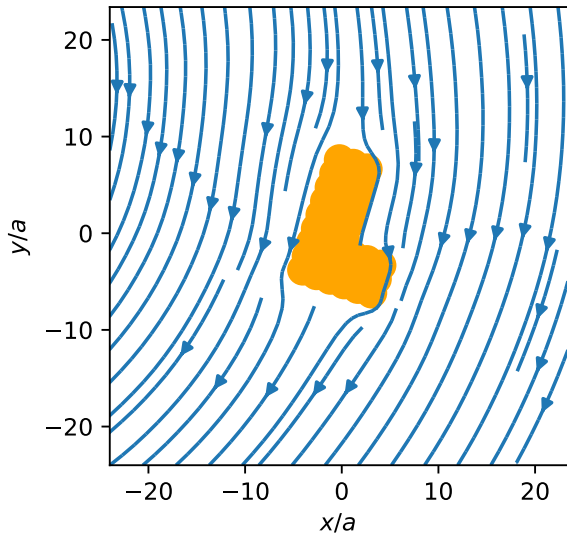
Center of hydrodynamics



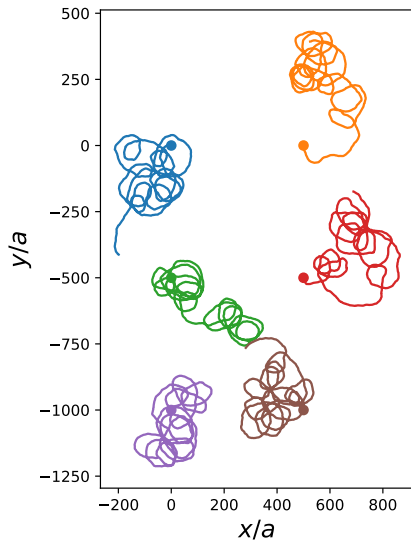
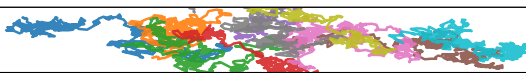
Anisotropic nanomotors

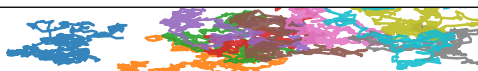


Anisotropic nanomotors



Anisotropic nanomotors





Average velocity



$$\begin{pmatrix} \dot{X}_1 \\ \dot{X}_2 \\ \dot{X}_3 \equiv \dot{\theta} \end{pmatrix} = \beta D^{L@CoH} F$$

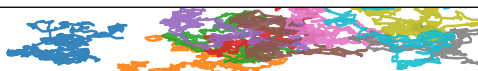
where F is the vector force in X_1 , X_2 and θ

- ▶ Radius from equilibrium $D^{L@CoH}$

$$R = \frac{\sqrt{\dot{X}_1^2 + \dot{X}_2^2}}{\dot{X}_3} \approx 33$$

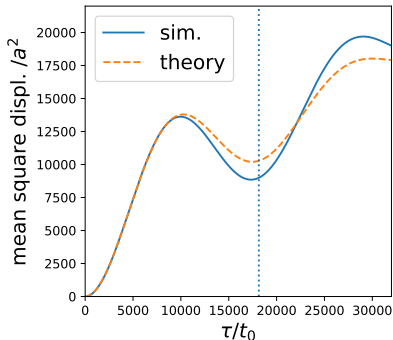
- ▶ Radius from simulations

$$R \approx 56$$



Mean-square displacement

- ▶ Numerical data from the simulations
- ▶ Theory from Brownian model Ebbens *et al* (2010) with simulated value for velocity and angular velocity.





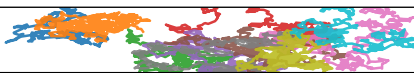
Fast Correlation Algorithm

Fast Correlation Algorithm (FCA)



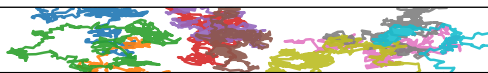
How to compute efficiently correlation functions?

- ▶ Compute correlations with the convolution theorem.
- ▶ Same value as direct computation (up to rounding errors).
- ▶ Benefit: Fast Fourier Transforms require $O(N \log N)$ [vs $O(N^2)$ for direct comput.]
- ▶ Allen & Tildesley already use the FCA. Python implementation in nmoldyn.
- ▶ No standalone FCA code for easy reuse.



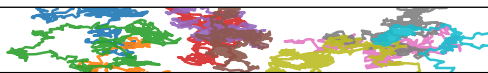
A solution

- ▶ Python package for the Fast Correlation Algorithm:
tidynamics
- ▶ Published in the Journal of Open Source Software (JOSS)
[doi:10.21105/joss.00877](https://doi.org/10.21105/joss.00877)
- ▶ Define the correlation functions as in the fields of stochastic and molecular dynamics.
- ▶ Handles data in NumPy arrays.



Installation

- ▶ `pip install --user tidynamics`
- ▶ Requires NumPy

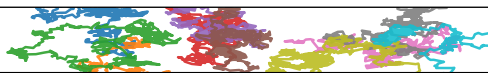


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- ▶ Requires NumPy

Usage

- ▶ `tidynamics.acf(velocity)`
- ▶ `tidynamics.msd(position)`



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Documentation

- ▶ <http://lab.pdebuy1.be/tidynamics/>



Conclusions & perspectives



Computational modeling of anisotropic colloids

- ▶ Study of shapes not amenable to theoretical “solutions”
- ▶ Computational screening of shapes
- ▶ Control of trajectories



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Perspectives

- ▶ Accuracy (hydrodynamics - chemical patterning)
- ▶ Collective dynamics of anisotropic nanomotors
- ▶ Inclusion of external fields (chemical gradients or gravity)



Computational modeling of anisotropic colloids

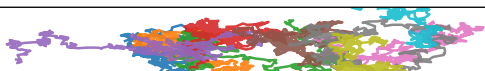
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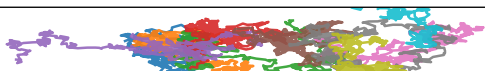
Thank you

References I



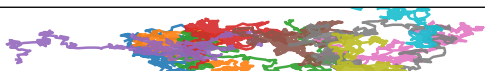
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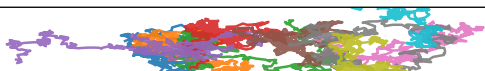
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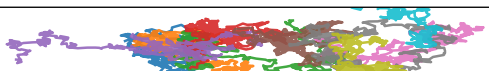
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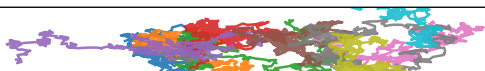
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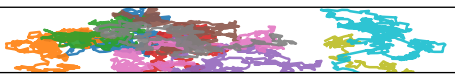


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Introduction: what are nanomotors and why are they interesting?

RMPCDMD

Mesoscopic simulations of L particles

Fast Correlation Algorithm

Conclusions & perspectives