



Physical inference from bio-images with deep learning



Keywords: deep learning, physical inference, biological microscopy images

Place: Collège de Frégiptos BIOLOGY Center for Interdisciplinary Research in Biology 11, place Marcelin Berthelot, 75005 Paris

Team: Multiscale Physics of Morphogenesis **Supervision:** Hervé Turlier, team leader www.virtual-embryo.com herve.turlier@college-de-france.fr Phone: +33.1.44.27.14.10

<u>Duration:</u> 4 to 6 months, starting Jan-Apr 2020 <u>Benefits:</u> ~500€/month, subsidized lunch and public transport (50%)

The goal of the research project is to develop new inference methods that use deep neural networks to extract physical information from time-lapse microscopy images of biological processes. The computational method will aim at inferring from images either the physical parameters of a predefined physical model, or to infer the best model to describe the observed dynamics. Here, we will build on recent *physics-informed* neural networks, that have proven their performance to solve complex inverse problems^{1,2}, but have not yet been applied to biological images. We will focus on two concrete biological processes, in collaboration with two biology teams at Collège de France:

1) Turing-like advection-reaction-diffusion dynamics, with application to the plumage patterning

in bird embryos. Here we will focus on the discovery of optimal parameters with a predefined model that can fit observed biological patterns³.



2) The **coarsening dynamics of nuclear bodies**, with application to the dynamics of PML nuclear bodies, which are membrane-less organelles that coarsen in a liquid-like fashion upon arsenic treatment⁴. Here we will focus on automatic model discovery to describe this biological phenomena involved in cancer.



The trainee will have access to a powerful **Nvidia DGX Station** to design and train deep learning models on GPU and to a laptop (Macbook Pro) during the internship period.

The research can be pursued with a PhD thesis in the team. The candidate will have to apply for funding through the physics doctoral school competition.

Candidates should be trained either in **computer science**, **physics** or **applied mathematics** and should demonstrate **excellent programming skills** (Python and/or C++) as well as a real desire to work in a highly interdisciplinary environment. Prior experience in machine learning and/or image analysis will be very valuable.

^{1.} Tipireddy, R. et al., 2019. A comparative study of physics-informed neural network models for learning unknown dynamics and constitutive relations. arXiv, 1904.04058.

^{2.} Lu, L. et al., 2019. DeepXDE: A deep learning library for solving differential equations. arXiv, 1907.04502.

^{3.} Bailleul, R. et al., 2019. Symmetry breaking in the embryonic skin triggers directional and sequential plumage patterning C. S. Hill, ed. PLoS Biology, 17(10), pp.e3000448–27.

^{4.} Lallemand-Breitenbach, V. (2010). PML nuclear bodies. Cold Spring Harbor perspectives in biology, 2(5), a000661.