

# Data-based technologies for modelling, informing and augmenting learning about fluids and flow simulations

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## ABSTRACT

Fluid mechanics, as all other branches in science and engineering is experiencing the data-revolutions. Thus, complex phenomena, encapsulated in some input-outputs pairs, can be modelled from the observed data, by using state-of-the-art and advanced machine learning technologies. In some cases, the learning process can be empowered by including existing knowledge within the process of learning: the thermodynamics consistency (energy conservation and entropy production), by including momentum and mass conservation, by including some choices of structural variables in complex fluids, ... The use of these techniques allows enhancing, among many others:

- The description of complex fluids (with complex non-Newtonian rheology) including several conformational coordinates, with their associated evolution equation, characterizing rich nano and microstructures (suspensions, polymers, reinforce polymers, composites, ...)
- Improving turbulence modeling and simulation.
- Improving computational efficiency within a Model Order Reduction setting, while ensuring accuracy and stability, for addressing large-scale simulations.
- Performing multi-scale simulation with the associated scales bridges.
- Creating parametric surrogates.
- Creating adaptive discretization techniques, empowering usual discretization techniques.
- Addressing fluid-solid interaction.
- Conciliating physics-based and data-driven models within a hybrid paradigm: digital twins, while assimilating data by using advanced technologies (e.g. neural-Kalman, ...)
- Augmenting models by discovering internal (non-observed) variables and the models governing them that impact the observed dynamics.
- Taking profit of the accurate real-time responses for using that models in immersive virtual, augmented or hybrid reality.
- Novel data-driven techniques for flow control