

Machine learning for particle-laden viscoelastic flow modelling

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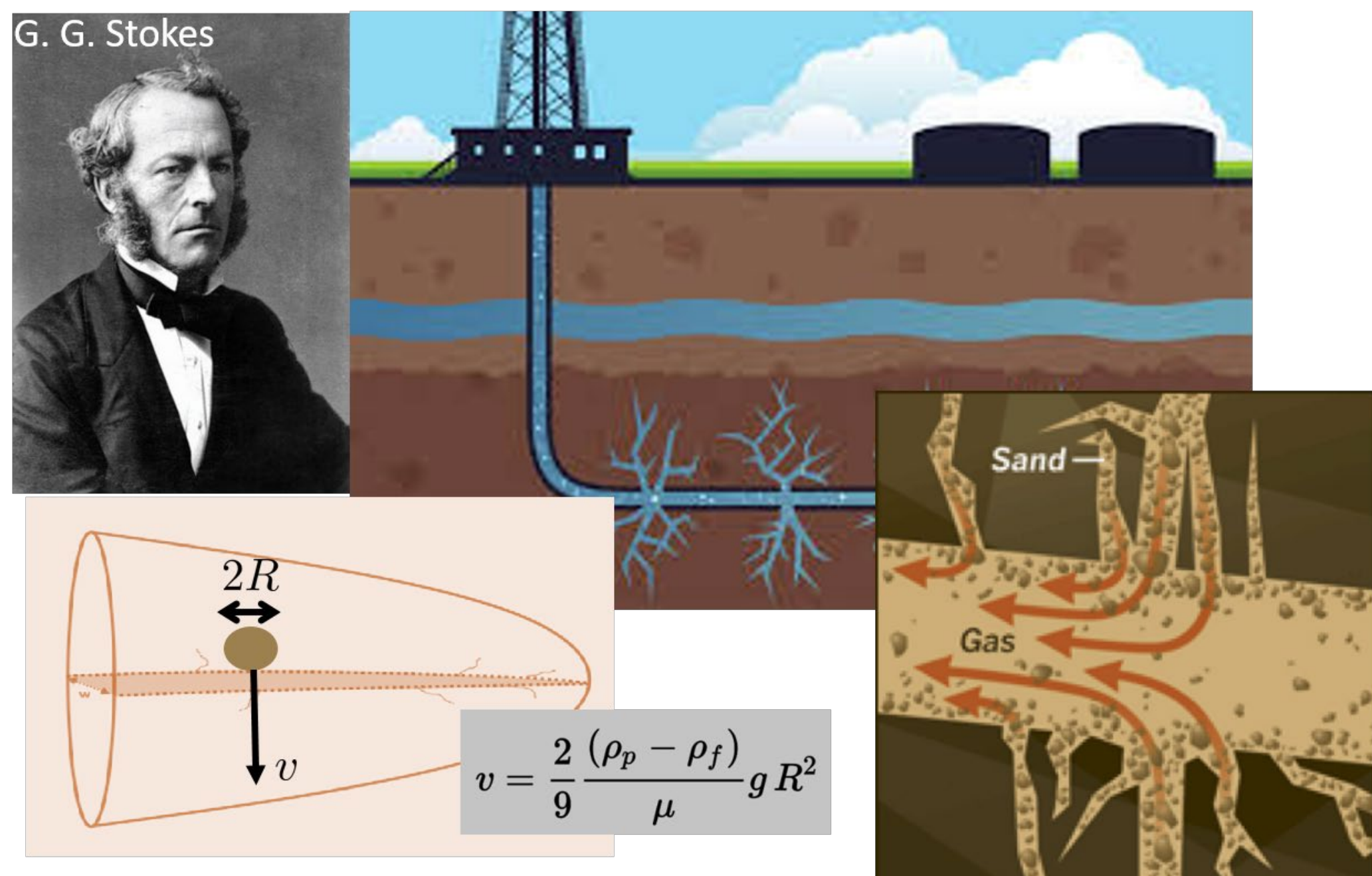
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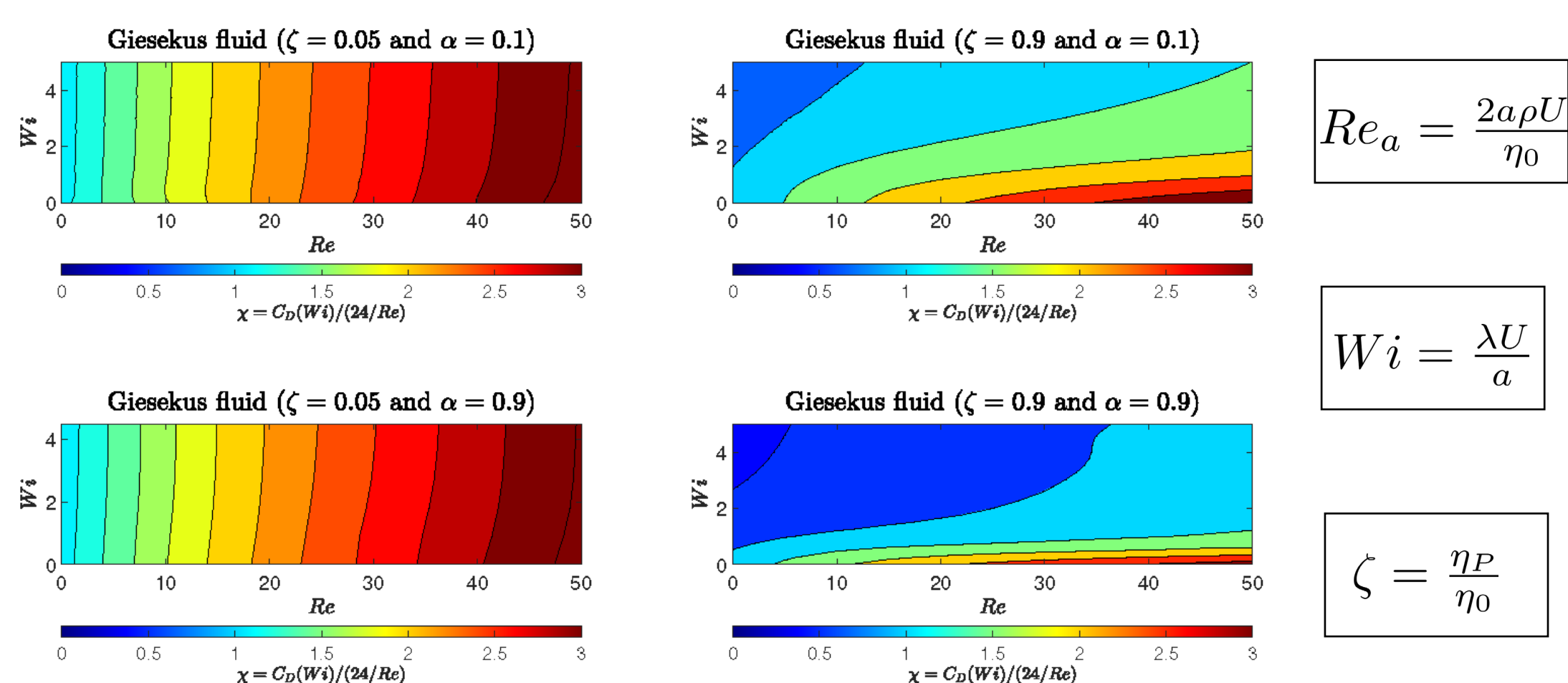
Methodology



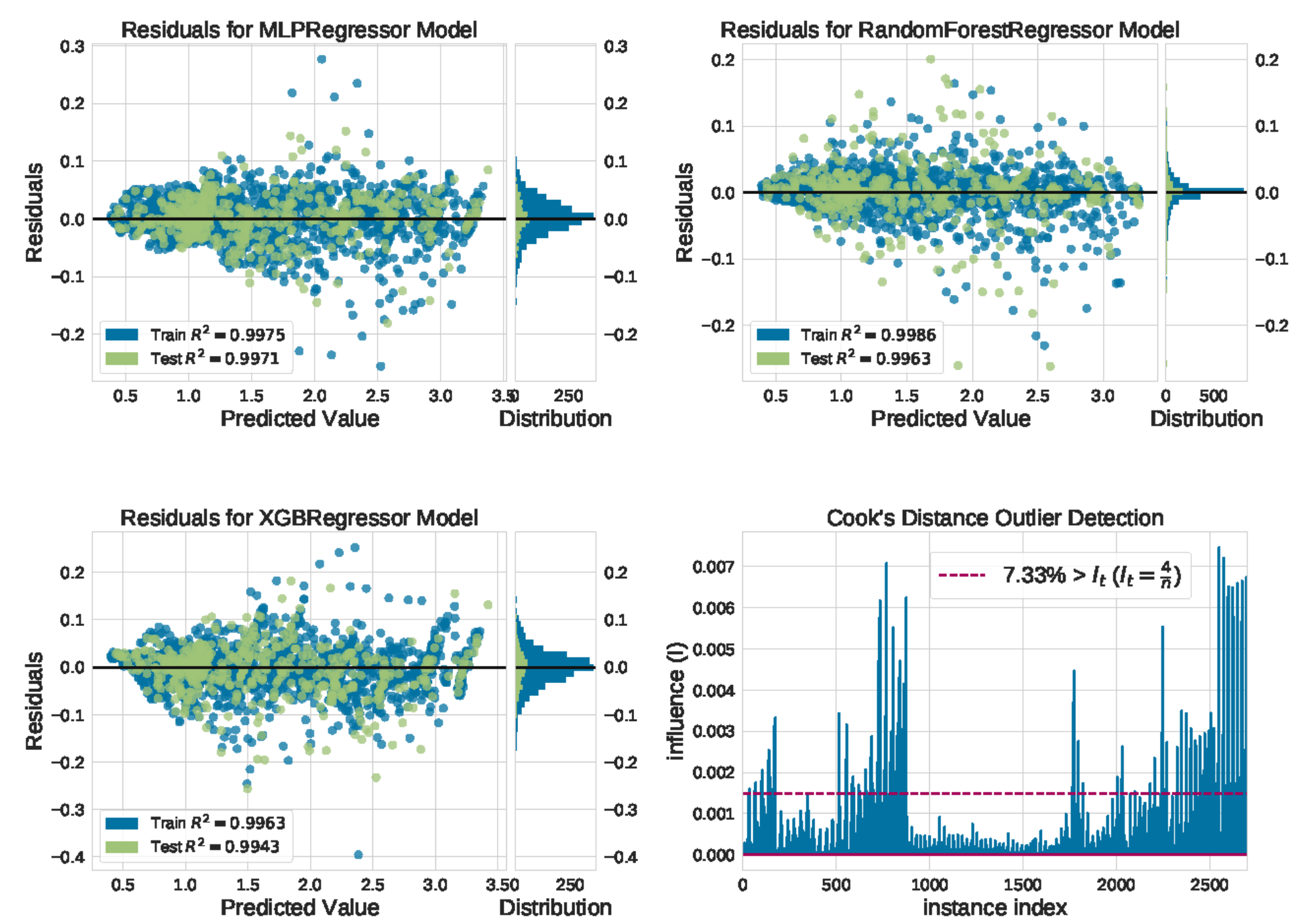
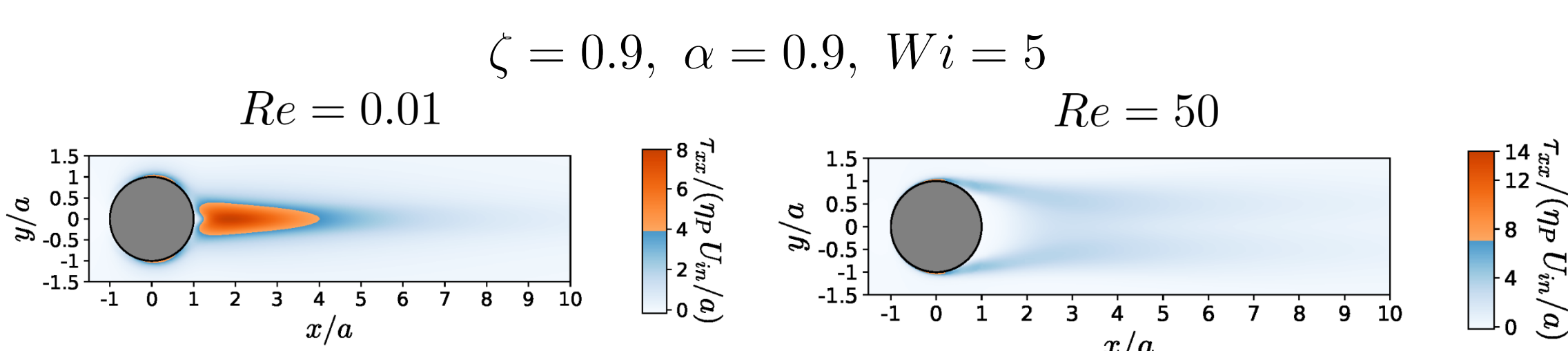
- ✓ **Objectives:** explore the possibility of using Machine Learning (ML) techniques to evaluate the drag coefficient of small non-Brownian particles translating and settling in non-linear viscoelastic fluids. The long-term objective is the development of a 3D numerical code for particle-laden viscoelastic flows (PLVF), which will contribute to understanding many advanced manufacturing and industrial operations, specifically the hydraulic fracturing process.
- ✓ **Tasks:** (a) Perform 3D direct numerical simulations (DNS) of PLVF; (b) Develop a general expression for the drag coefficient of rigid particles moving through viscoelastic fluids, using ML techniques; and (c) Implement a CFD-DEM numerical code for fast predictive PLVF.

Results and Discussion

Drag coefficient of a sphere¹



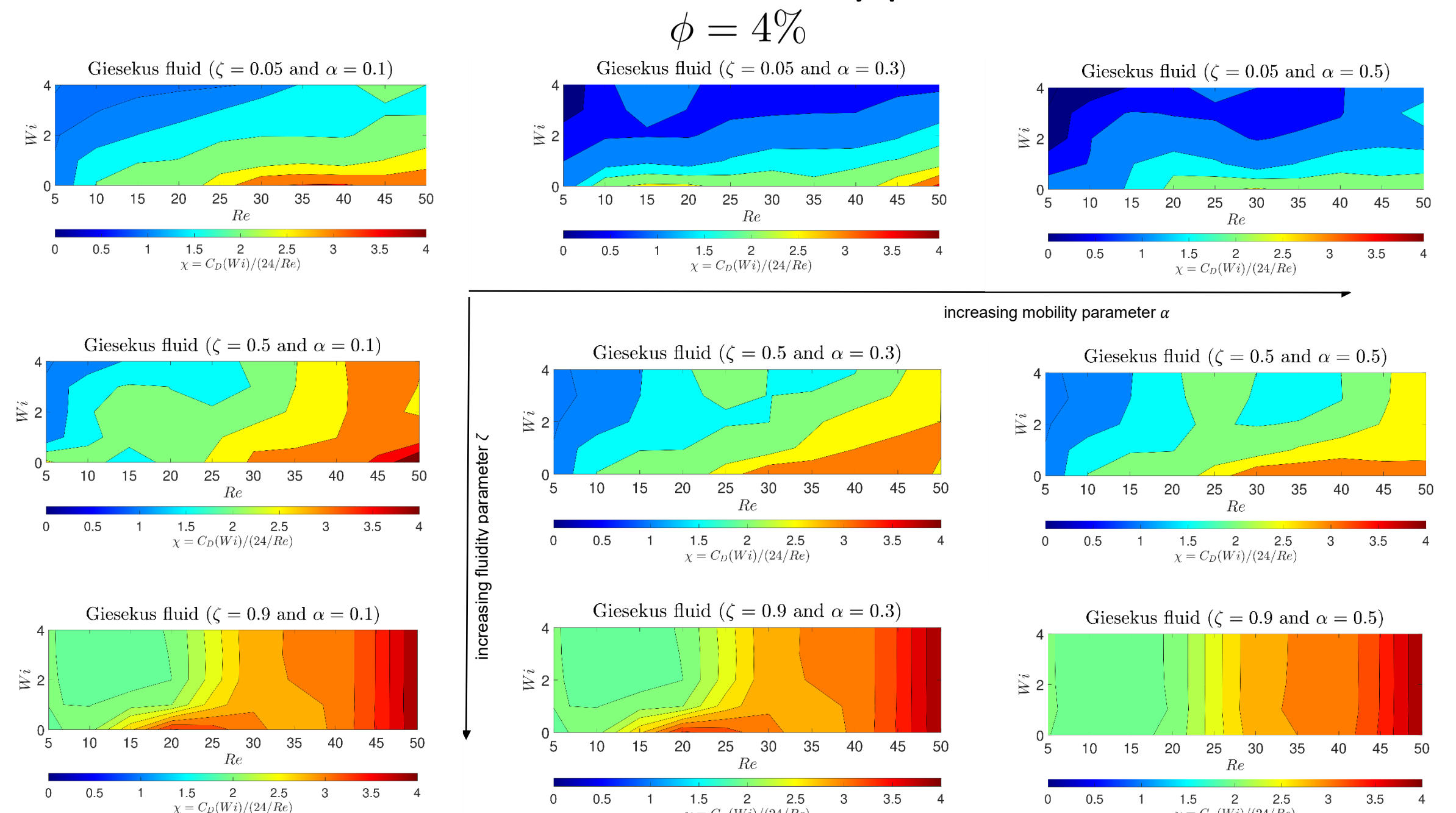
The evolution of the drag correction $\chi = C_D(Wi, \zeta, \alpha)/(24/Re)$ have a different behavior with the increase of Re at higher ζ , due to flow separation.



The ML models applied to predict the drag force on a sphere suspended in Giesekus fluids showed good performance results.

Drag coefficient of random arrays of spheres²

The evolution of the drag correction $\chi = C_D(Wi, \zeta, \alpha, \phi)/(24/Re)$ is obtained for volume fraction of dispersed solids $0 \leq \phi \leq 0.2$, Reynolds number $Re \leq 50$, Weissenberg number $0 \leq Wi \leq 4$, retardation ratio $0 \leq \zeta \leq 1$ and mobility parameter $0 < \alpha \leq 0.5$.



Conclusions

- ✓ Meta-models to predict the drag coefficient of rigid particles moving through shear-thinning viscoelastic fluids were developed, using ML techniques.

Acknowledgments

This work is funded by National Funds through FCT (Portuguese Foundation for Science and Technology) under the projects UID-B/05256/2020, UID-P/05256/2020, APROVA (MIT-EXPL/TDI/0038/2019) - Aprendizagem Profunda na modelação de escoamentos com fluidos de matriz Viscoelástica Aditivados com partículas (POCI-01-0145-FEDER-016665) under MIT Portugal program.

References

1. S.A. Faroughi, A.I. Roriz, G.H. McKinley, C. Fernandes, *Machine Learning models to predict the drag coefficient of a sphere translating in shear-thinning viscoelastic fluids*, in preparation.
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September 20, 2021

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