

Introduction

Using computational fluid dynamics (CFD) to simulate blood flow in patient-specific geometries is a growing field that is generating massive results. Previously, Markl et al. and others have provided evidence that areas of low wall shear stress (WSS) are more likely to develop atherosclerosis. By exploring whether regions downstream of the coarctation with low WSS flow profiles can be predicted by looking at flow near the coarctation, we could better focus simulations with decreased domain sizes, increased resolutions, perform studies with larger sample sizes, and extend the work to predicting outcomes in other parts of the vasculature.

Objective

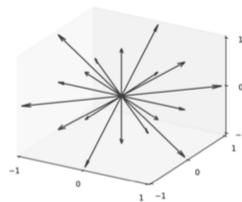
- To uncover new relationships between flow properties, aortic coarctation, and wall shear stress throughout the aorta.
- Prototype different methods of analyzing data produced by massively parallel CFD simulations.

Lattice Boltzmann Method

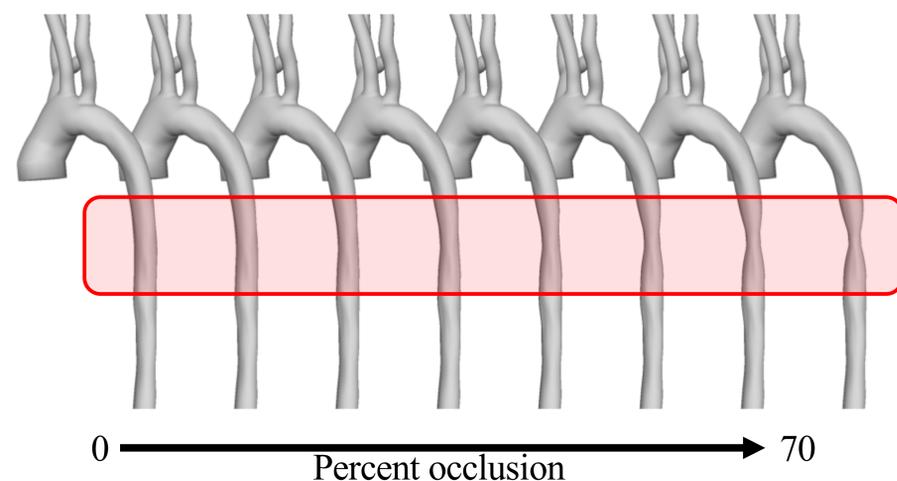
HARVEY solves the Navier-Stokes equations using the lattice Boltzmann method, which represents fluid as a probability distribution function f of particles. Fluid velocity and pressure are computed from the summed behavior of particles.

- HARVEY is parallelized using MPI and OpenMP.

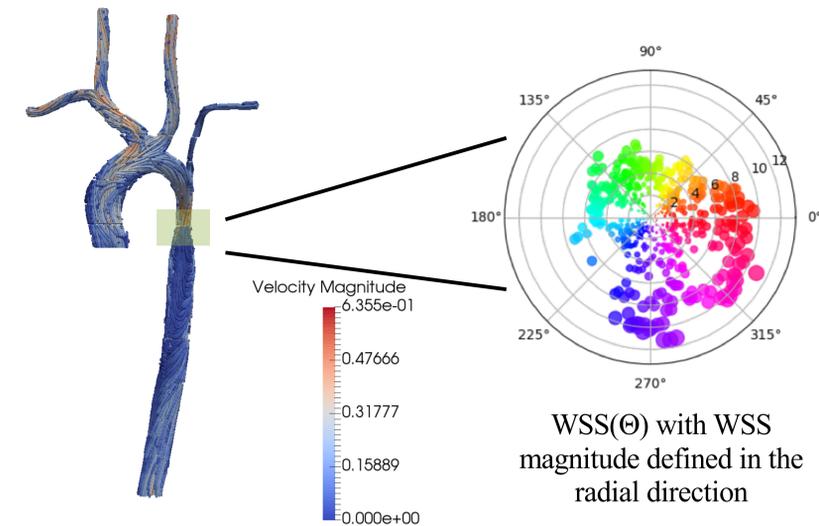
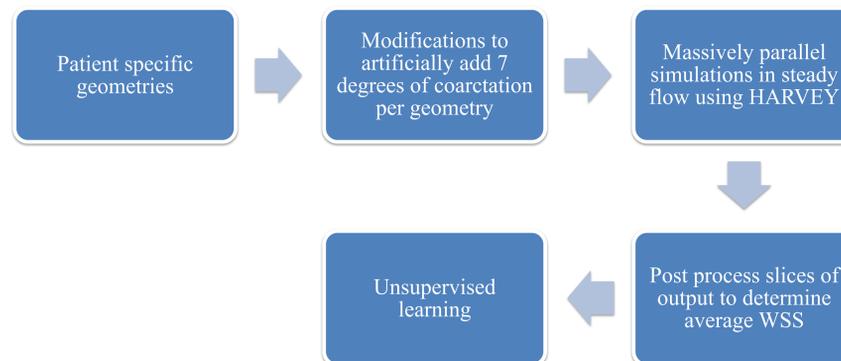
$$f_i(\mathbf{x} + \mathbf{c}_i \delta t, t + \delta t) - f_i(\mathbf{x}, t) = -\Omega(f_i(\mathbf{x}, t) - f_i^{eq}(\mathbf{x}, t))$$



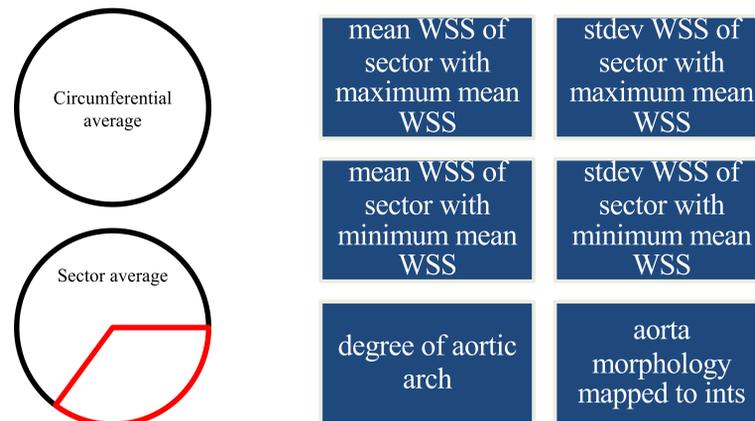
Aortic Coarctation



Overview

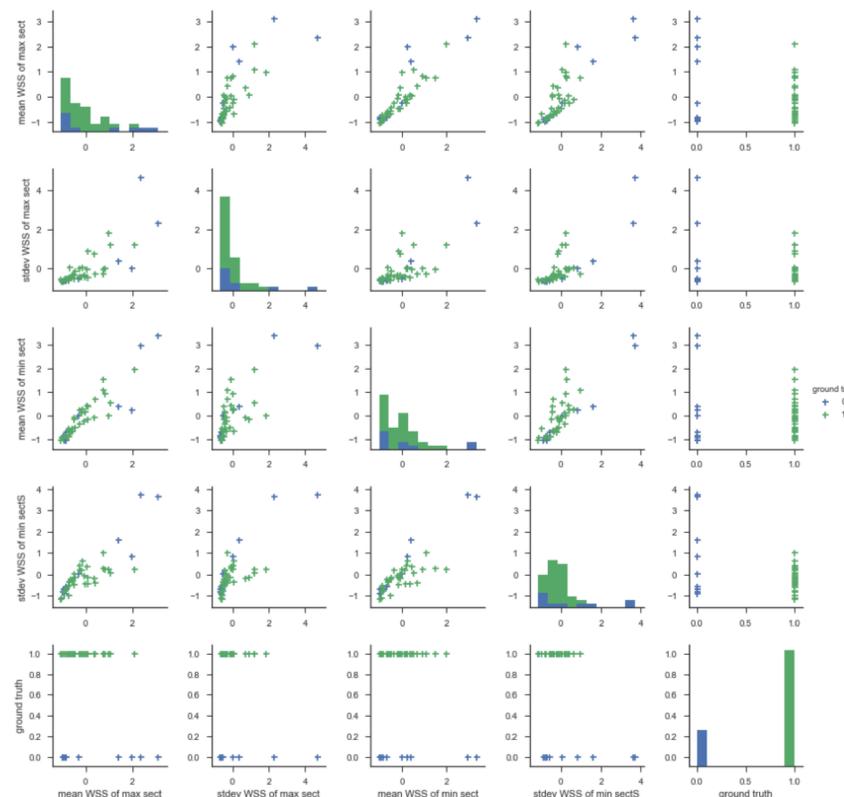


Features



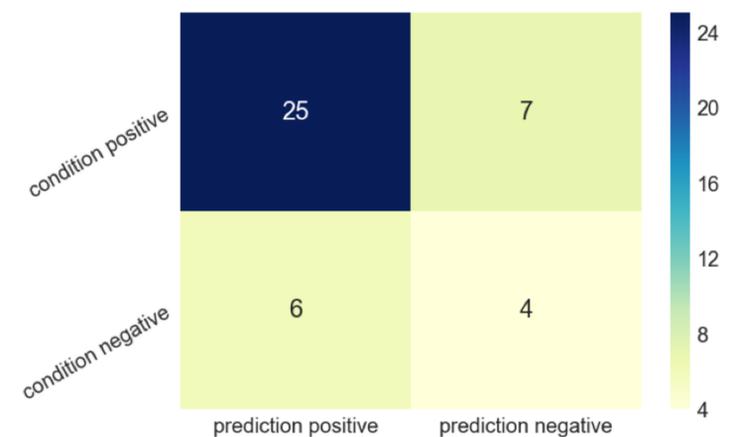
Results

Unsupervised learning with Kmeans



Ground truth defined based on whether all sectors have low wall shear stress (below a threshold)

Results Continued



Precision: 80.6%
Recall: 78.1%

Future Work

- New simulations with more realistic flow parameters:
- Pulsatile flow
 - Patient specific flow profiles
 - Realistic boundary conditions
- Temporal and frequency analysis

References

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Acknowledgements

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