Oceananigans.jl: Fast and friendly geophysical fluid dynamics on GPUs

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Summary

`Oceananigans.jl` is a fast and friendly software package for the numerical simulation of incompressible, stratified, rotating fluid flows on CPUs and GPUs. Intended for wide use, it is simple enough to be used for educational purposes yet fast and flexible enough for research use. It is being developed as part of the Climate Modeling Alliance project for the simulation of small-scale ocean physics at high-resolution that affect the evolution of Earth's climate.

`Oceananigans.jl` is designed for high-resolution simulations in idealized geometries and supports direct numerical simulation, large eddy simulation, arbitrary numbers of active and passive tracers, and linear and nonlinear equations of state for seawater. Under the hood, Oceananigans.jl employs a finite volume algorithm similar to that used by the Massachusetts Institute of Technology general circulation model (Marshall, Adcroft, Hill, Perelman, & Heisey, 1997).
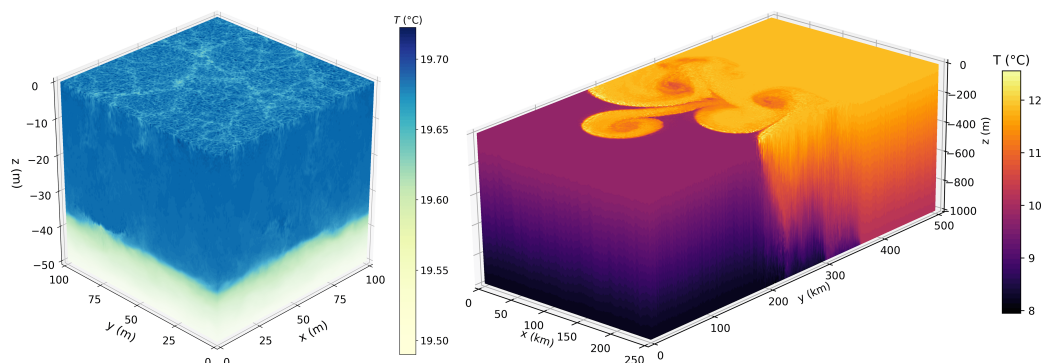
Fig. 1: (Left) Large eddy simulation of small-scale oceanic boundary layer turbulence forced by a surface cooling in a horizontally periodic domain using 256^3 grid points. The upper layer is well-mixed by turbulent convection and bounded below by a strong buoyancy interface. (Right) Simulation of instability of a horizontal density gradient in a rotating channel using $256 \times 512 \times 128$ grid points. A similar process called baroclinic instability acting on basin-scale temperature gradients fills the oceans with eddies that stir carbon and heat. Plots made with `matplotlib` (Hunter, 2007) and `cmocean` (Thyng, Greene, Hetland, Zimmerle, & DiMarco, 2016).

`Oceananigans.jl` leverages the Julia programming language (Bezanson, Edelman, Karpinski, & Shah, 2017) to implement high-level, low-cost abstractions, a friendly user interface, a high-performance model in one language and a common code base for execution on the CPU or GPU with Julia's native GPU compiler (Besard, Foket, & De Sutter, 2019). Because Julia is a high-level language, development is fast and users can flexibly specify model configurations,

set up arbitrary diagnostics and output, extend the code base, and implement new features. Configuring a model with `architecture=CPU()` or `architecture=GPU()` will execute the model on the CPU or GPU. By pinning a simulation script against a specific version of Oceananigans, the results of the simulation may be reproduced up to hardware differences.

Performance benchmarks show significant speedups when running on a GPU. Large simulations on an Nvidia Tesla V100 GPU require ~1 nanosecond per grid point per iteration. This results in GPU simulations being roughly 3x more cost-effective than CPU simulations on cloud computing platforms such as Google Cloud. A GPU with 32 GB of memory can time-step models with ~150 million grid points assuming five fields are being evolved; for example, three velocity components and tracers for temperature and salinity. These performance gains permit the long-time integration of realistic simulations, such as large eddy simulation of oceanic boundary layer turbulence over a seasonal cycle or the generation of training data for turbulence parameterizations in Earth system models.

`Oceananigans.jl` is continuously tested on CPUs and GPUs with unit tests, integration tests, analytic solutions to the incompressible Navier-Stokes equations, and verification experiments against published scientific results. Future development plans include support for distributed parallelism with CUDA-aware MPI as well as bathymetry and irregular domains.

Acknowledgements

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