

# Computational efficiency of high-order finite volume methods for magnetohydrodynamics

Kyle Gerard Felker  
Princeton University

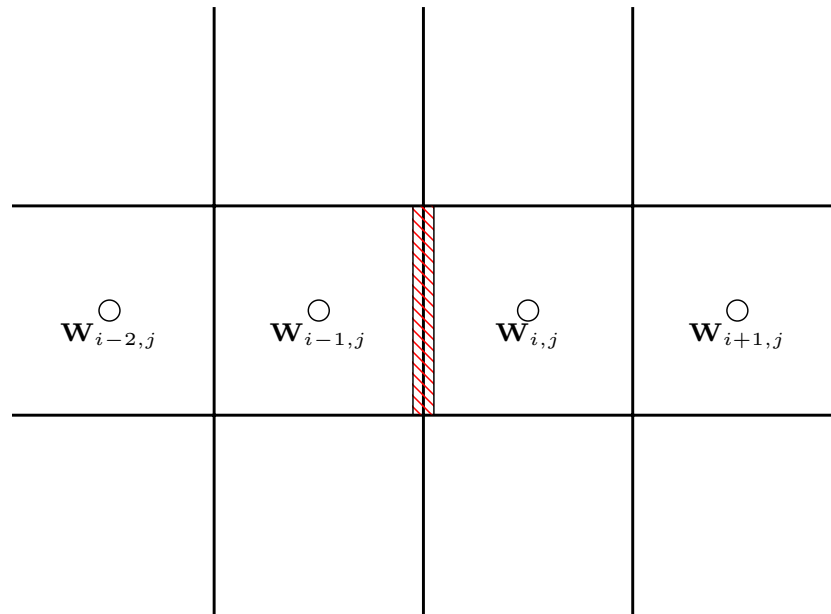
# Motivation: computational magnetohydrodynamics (MHD)

- Accretion disk dynamics
  - Need to resolve fine-scale turbulence
  - Magnetic fields are crucial
- Major concerns for numerical methods for astrophysics:
  - Conserve relevant physical quantities to machine precision
  - Highly accurate without introducing artificial oscillations
  - High efficiency
  - Satisfy divergence constraint

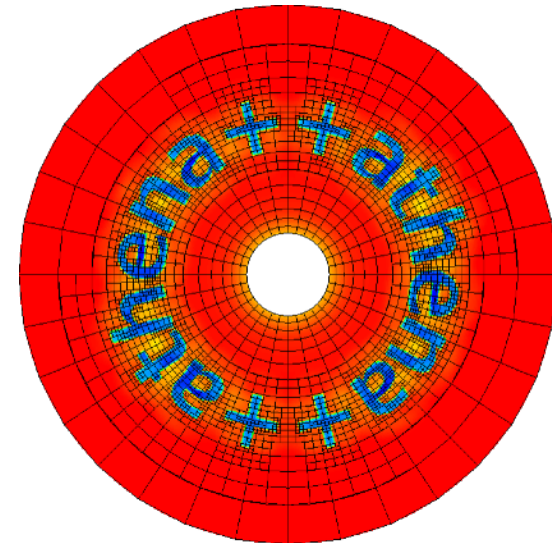
$$\nabla \cdot \mathbf{B} = 0$$



# Second-order finite volume (FV) method



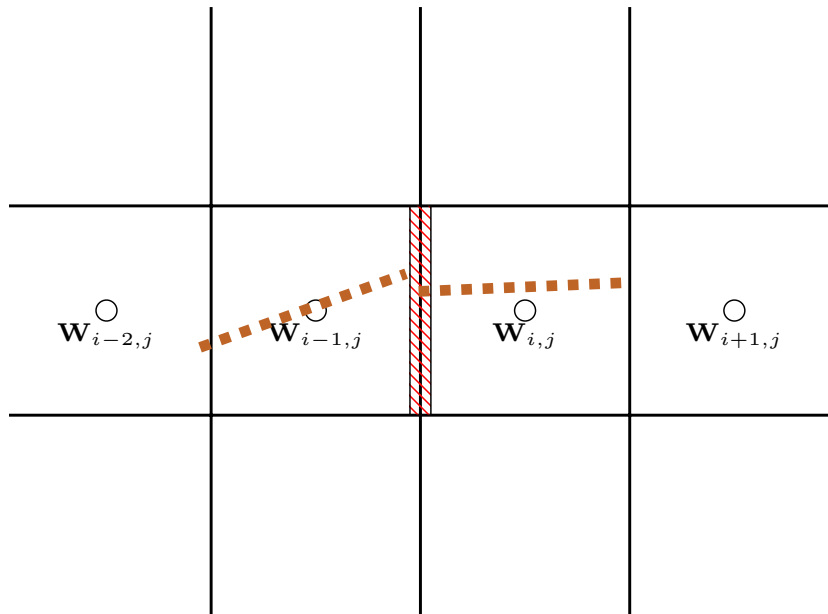
$$\mathcal{O}(\Delta x^2)$$



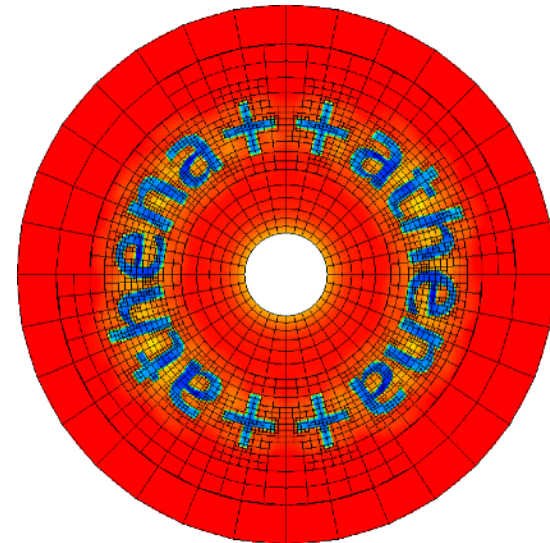
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1. Reconstruct face-averaged primitive L/R states using Piecewise Linear Method (PLM)

$$\langle \mathbf{W}^{L_1/R_1} \rangle_{i-\frac{1}{2},j} = PLM(\{ \langle \mathbf{W} \rangle_{i,j}, \langle \mathbf{W} \rangle_{i\pm 1,j}, \langle \mathbf{W} \rangle_{i-2,j} \})$$



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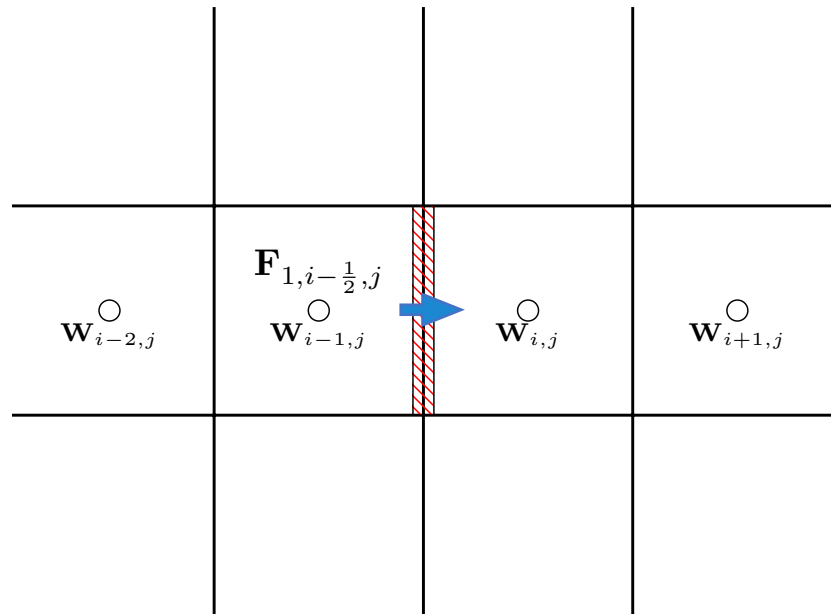
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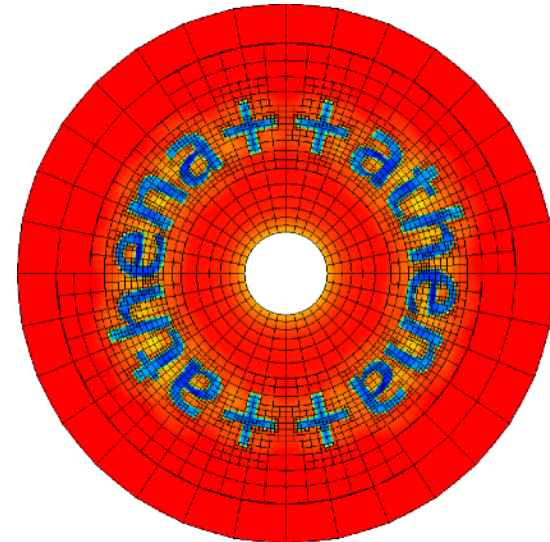
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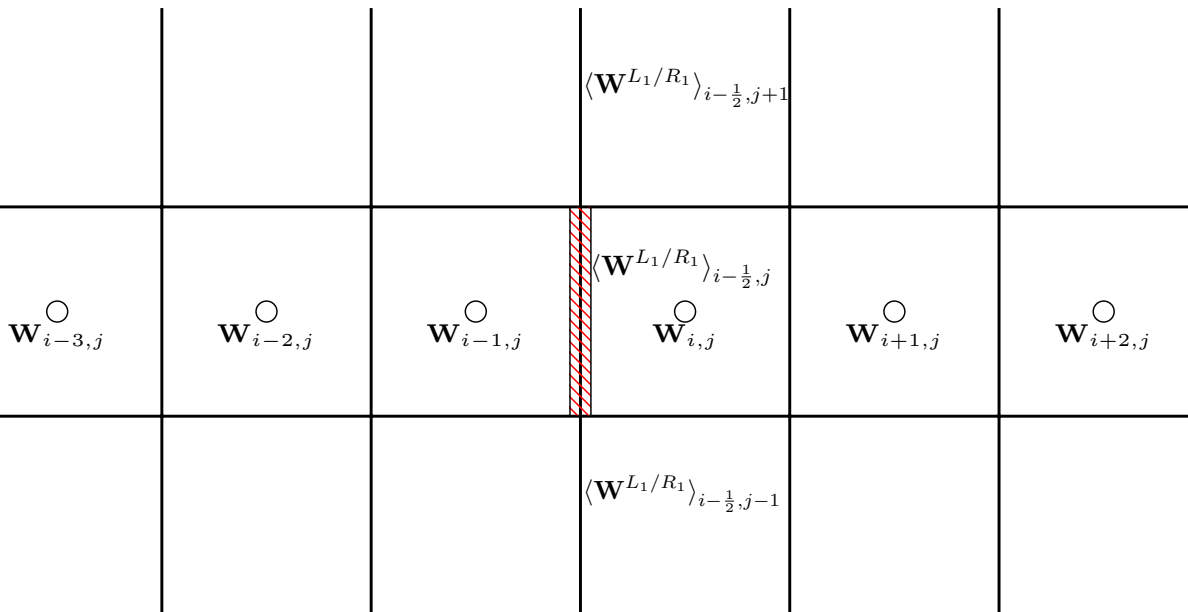


# Fourth-order finite volume method for conservation laws

(McCorquodale & Colella 2011), (Colella+ 2009), (Guzik+ 2015)

## 1. Reconstruct face-averaged primitive L/R states using Piecewise Parabolic Method (PPM)

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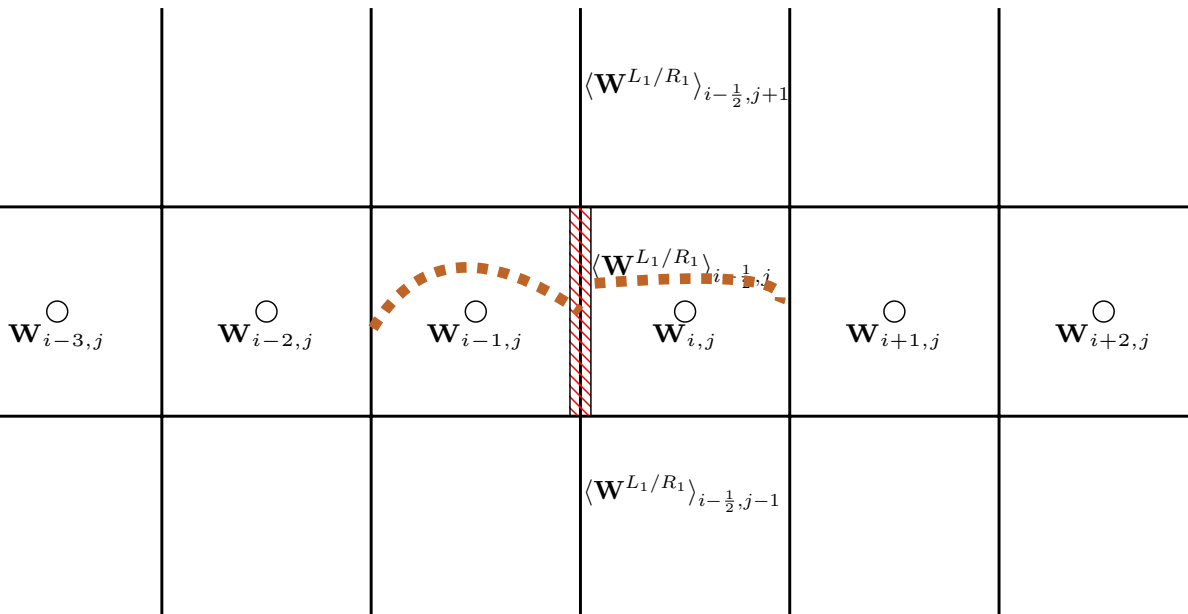
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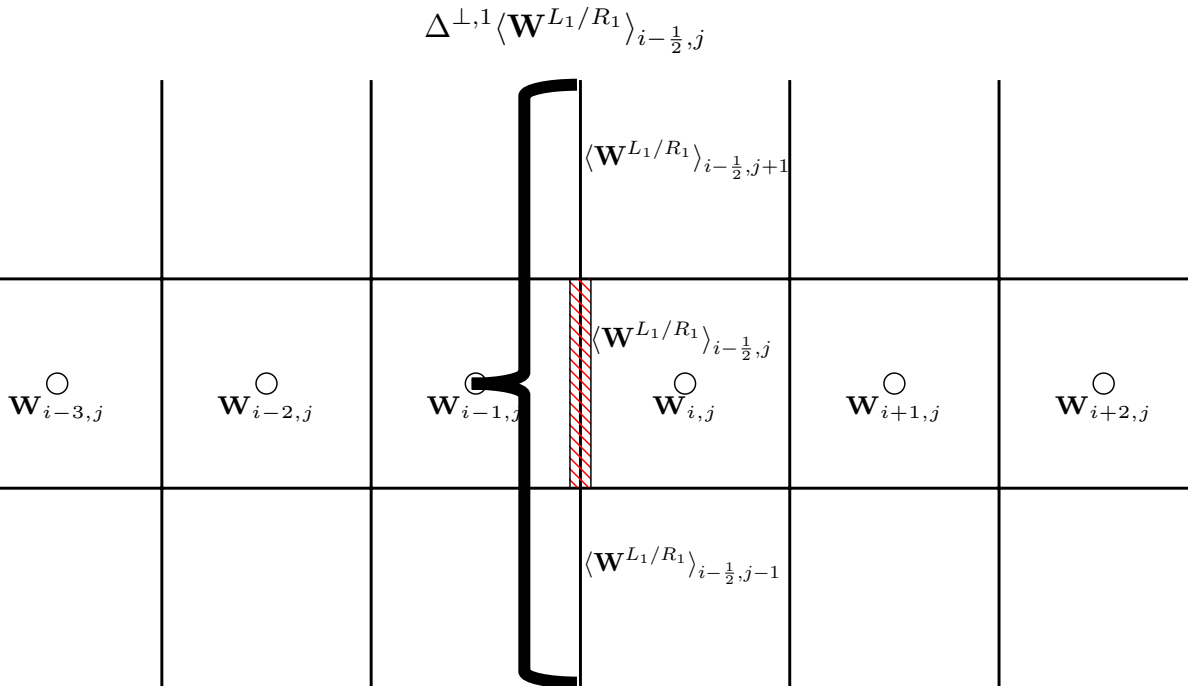
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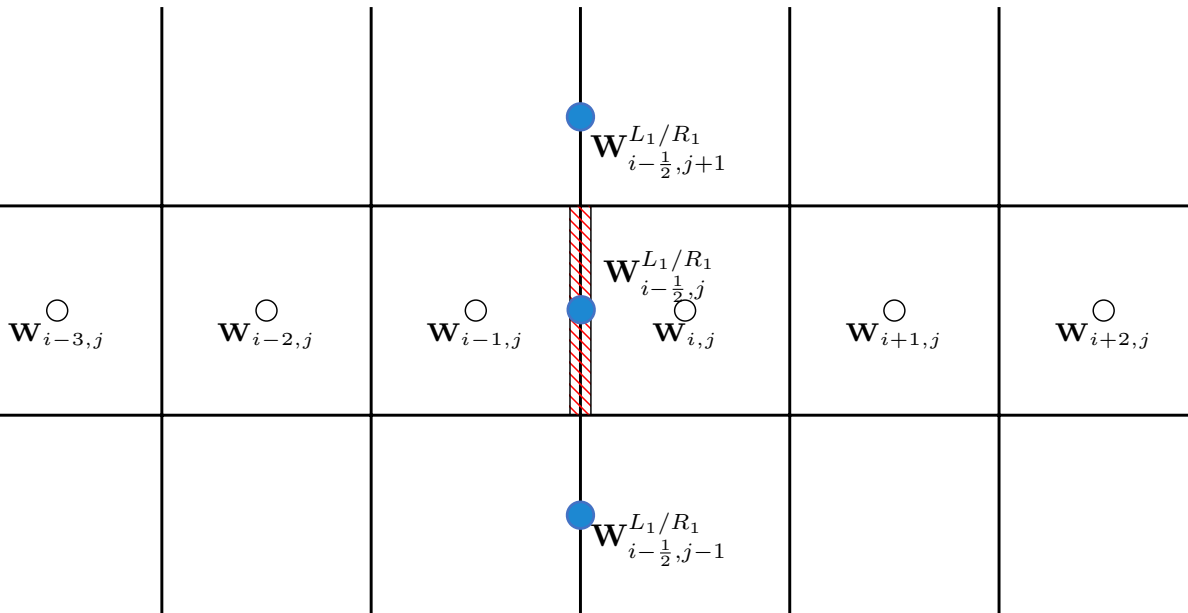


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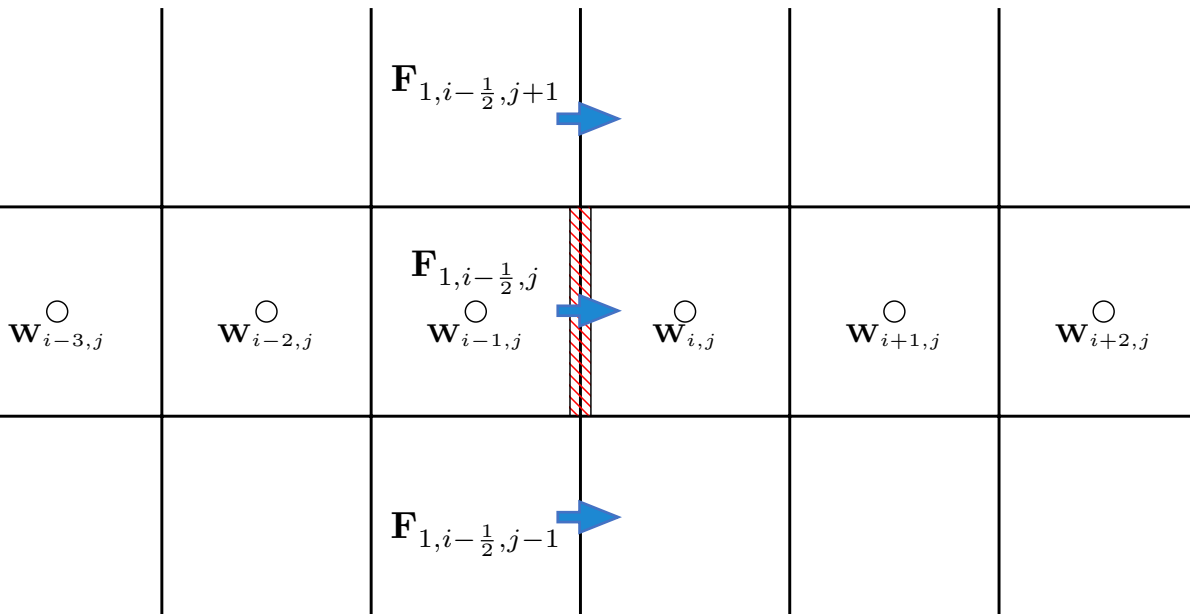
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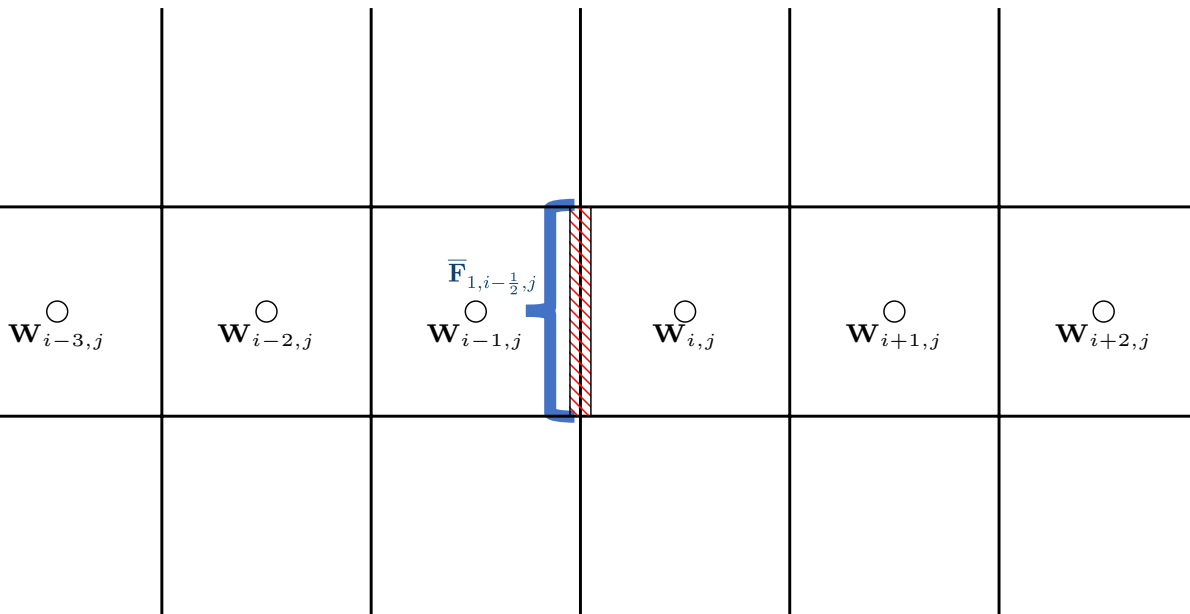
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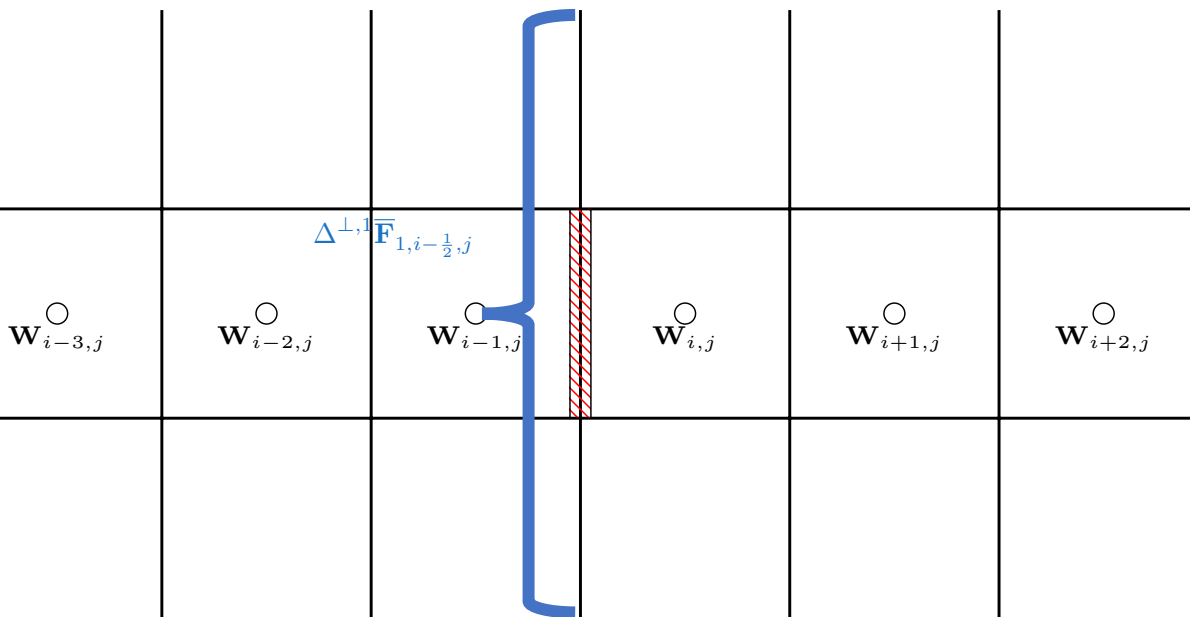
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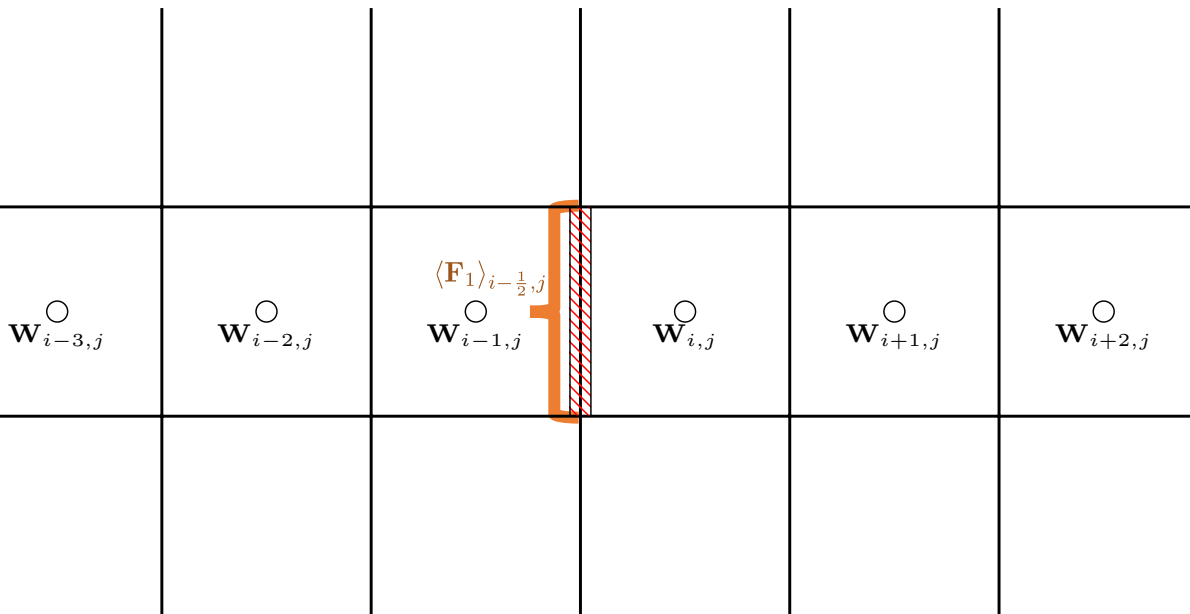
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5. Transform the face-centered fluxes to fourth-order accurate face-averaged fluxes

$$\langle \mathbf{F}_1 \rangle_{i-\frac{1}{2},j} = \mathbf{F}_{1,i-\frac{1}{2},j} - \frac{h^2}{24} \Delta^{\perp,1} \bar{\mathbf{F}}_{1,i-\frac{1}{2},j}$$

# Athena++: management and reproducibility

- Complete redesign & rewrite of Athena (C) in C++
  - ~63,000 lines of C++
  - ~7,000 lines of Python utilities
- >2,000 commits since May 2014
- 10-20 developers



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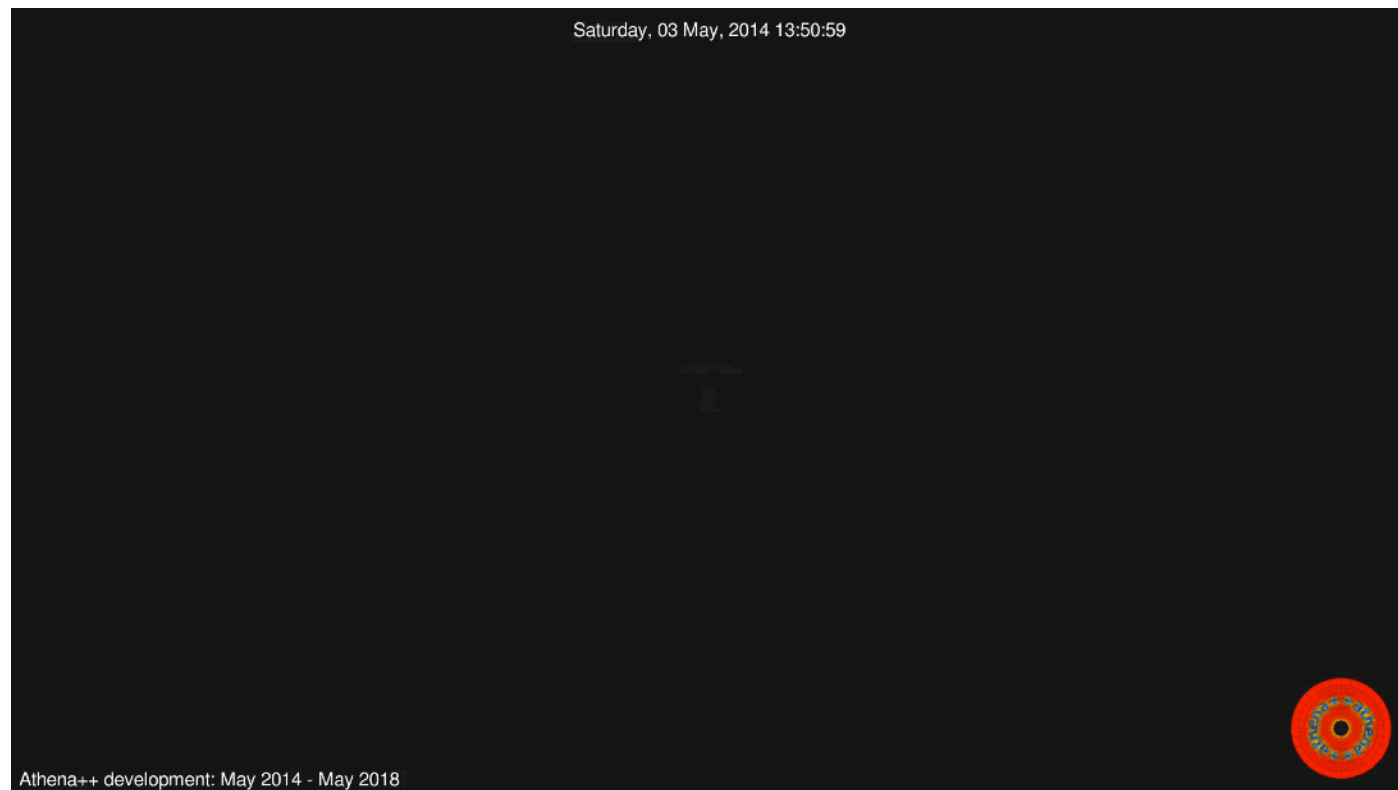
**Jenkins**

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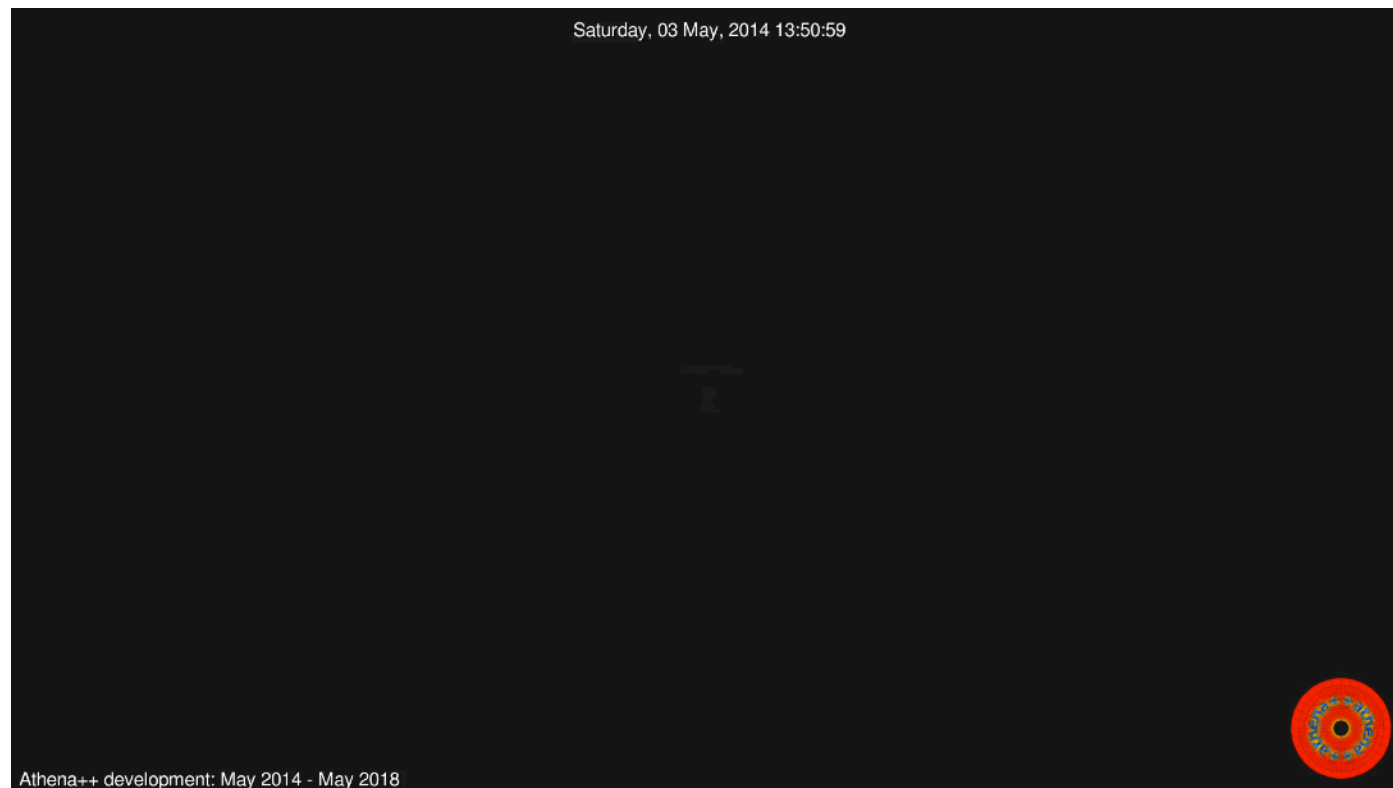
## Jenkins

<https://jenkins.io/>



## Travis CI

<https://travis-ci.com/>



v1.1.0 version released on 5/25/18

<https://github.com/PrincetonUniversity/athena-public-version>

# Athena++

- New core algorithms and physics
  - Adaptive and static mesh refinement
  - General relativity
- Greater source code modularity
- Improved performance
  - Task-based execution model
  - Highly scalable MPI+OpenMP
  - OpenMP 4.5 SIMD explicit vectorization

			MZone-cycles/sec		
			Xeon Phi KNL 7210	Broadwell E5-2680 v4	Skylake-SP Gold 6148
Hydro Sod	PLM	HLLC	1.518	2.660	4.475
		HLLE	1.625	2.773	4.808
		Roe	1.561	2.873	4.697
	PPM	HLLC	0.758	1.328	2.408
		HLLE	0.771	1.331	2.518
		Roe	0.757	1.360	2.414
MHD Brio-Wu	PLM	HLLD	0.708	1.338	2.421
		HLLE	0.806	1.404	2.322
		Roe	0.652	1.104	1.926
	PPM	HLLD	0.395	0.720	1.291
		HLLE	0.424	0.748	1.265
		Roe	0.375	0.643	1.118

**Table 1:** single-core performance for baseline 3D Newtonian solver configurations.  $64^3$  uniform Cartesian mesh, VL2+PLM, Intel compiler 18.0.

# SIMD Vectorization

- GPUs or x86?
- Motivations for high-order methods:
  - FLOPs are cheap
  - Increase data reuse
  - Exploit AVX-512

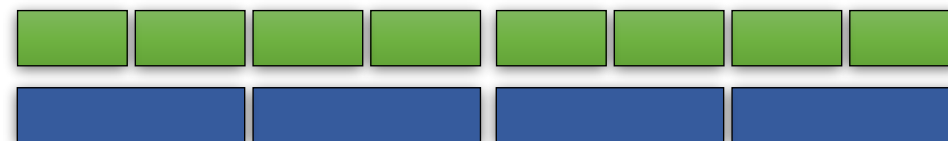


AVX-512



zmm

AVX-256



ymm

AVX-128



xmm

32-bit float  
64-bit double

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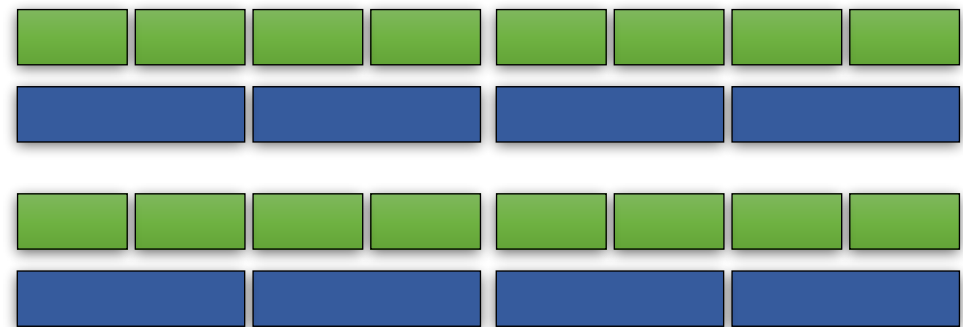


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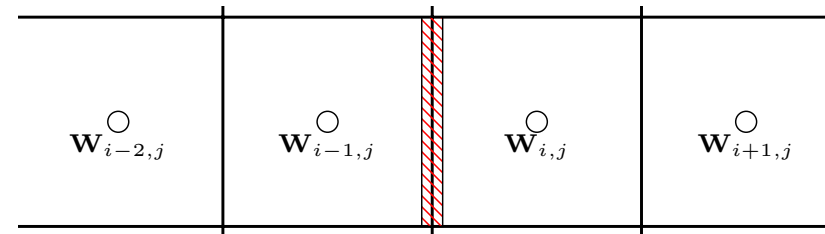
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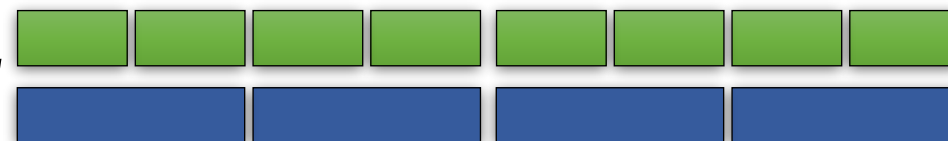


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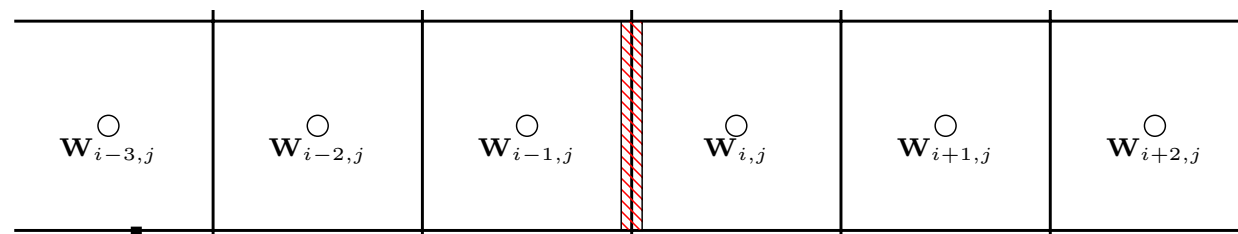


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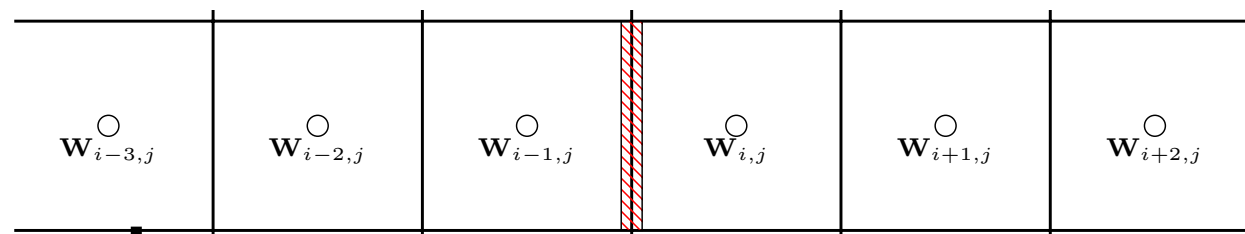
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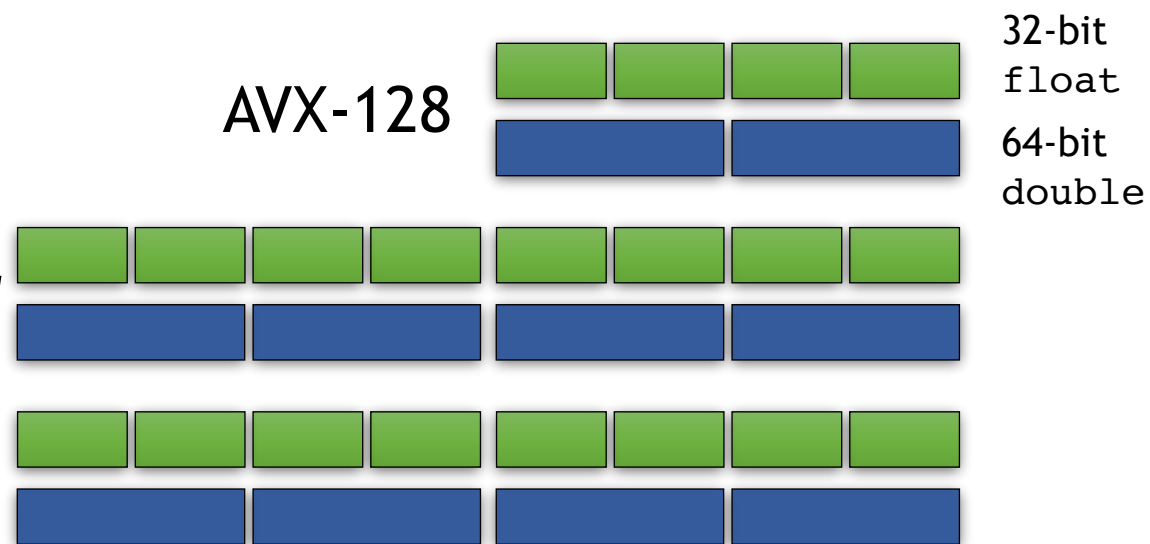
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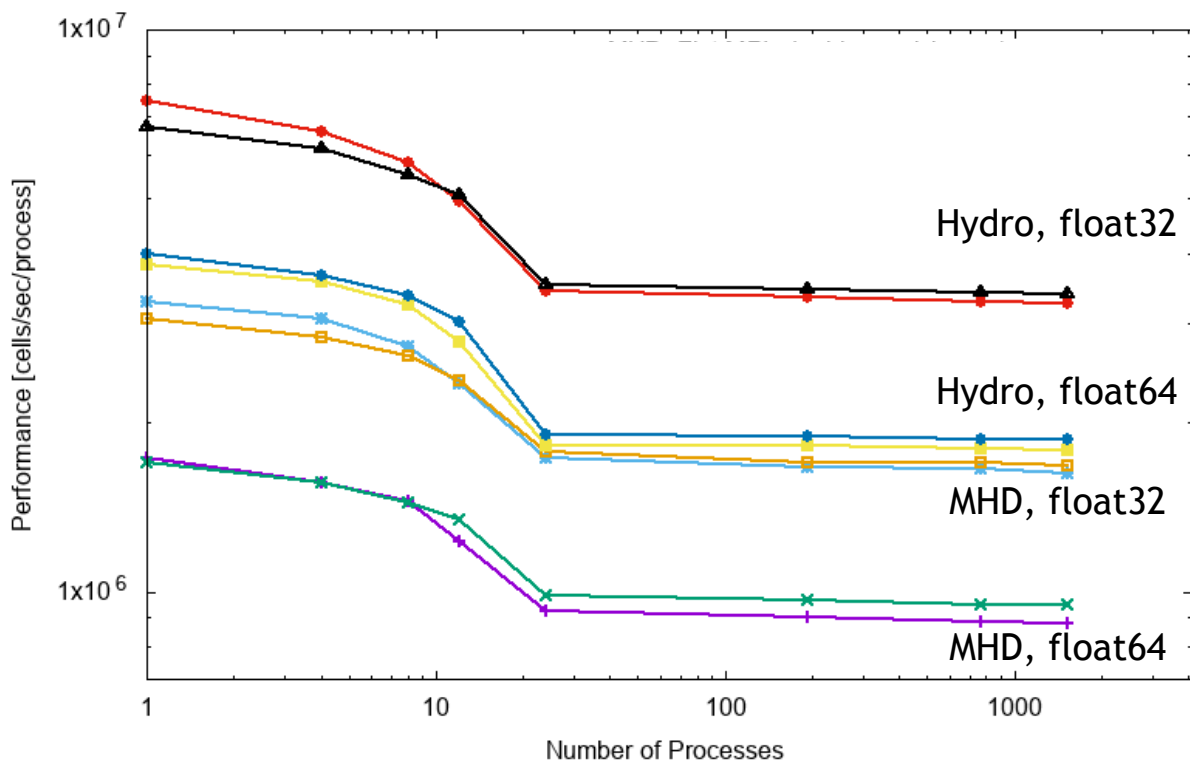
xmm

- Application is memory bandwidth bound
- Intel Turbo Boost causes frequency throttling

# Athena++ scalability

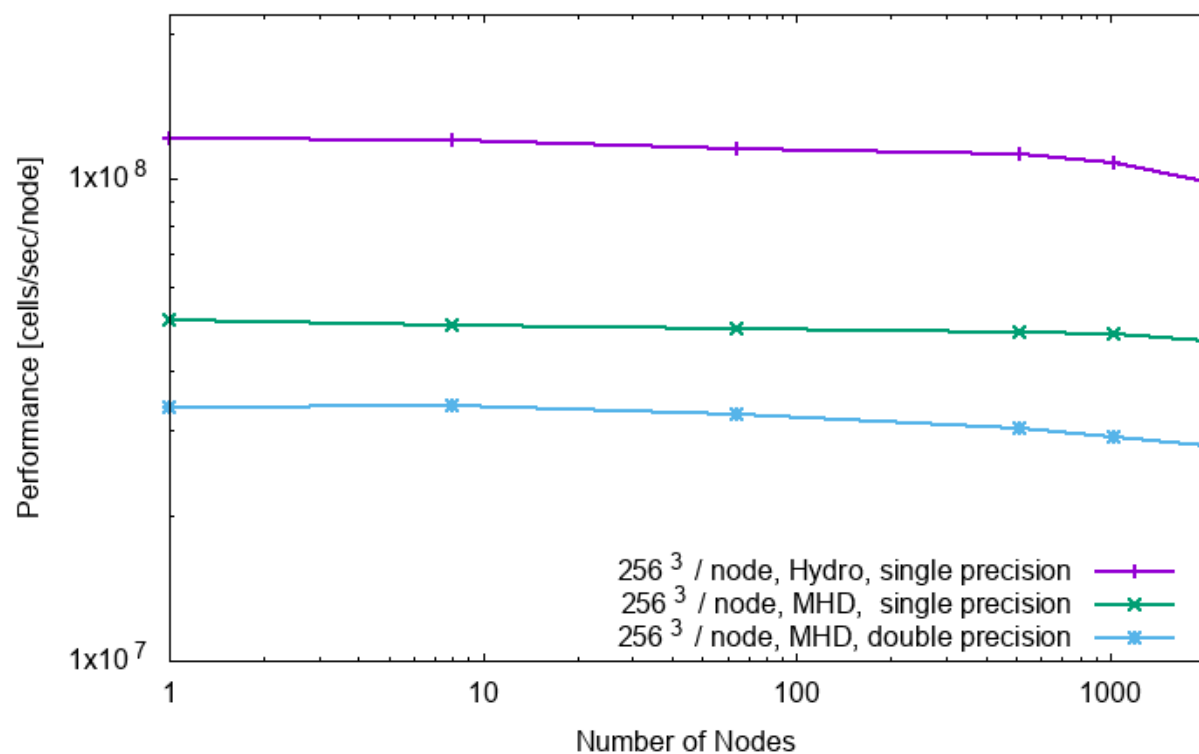
```
icc: -O3 -std=c++11 -ipo -xhost
      -inline-forceinline -qopenmp-simd
      -qopt-prefetch=4
```

`-qopt-zmm-usage=low`



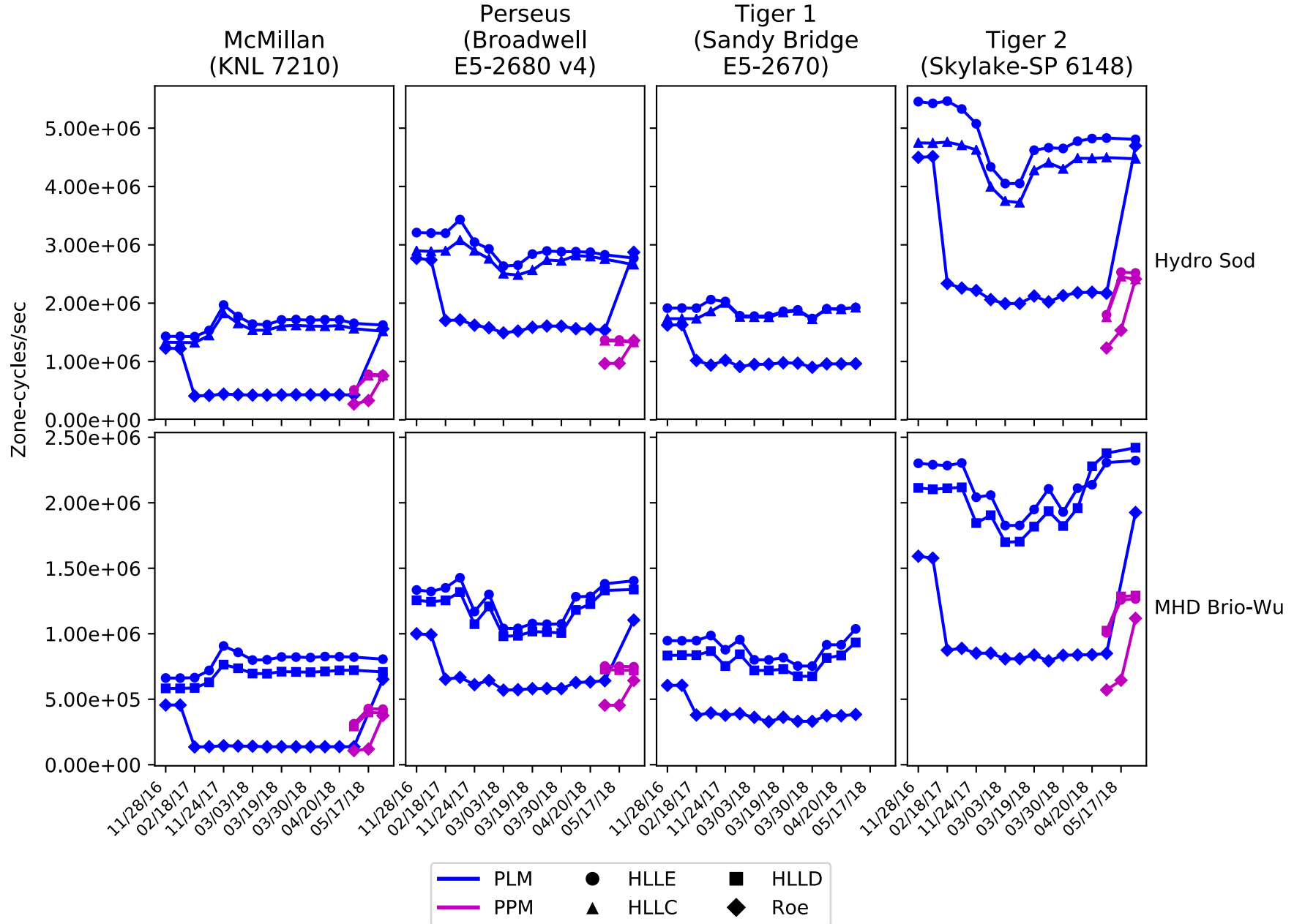
Osaka University OCTOPUS cluster (Skylake-SP 6126):  
on-node (2x 12-core) and off-node scaling

`-qopt-zmm-usage=high`



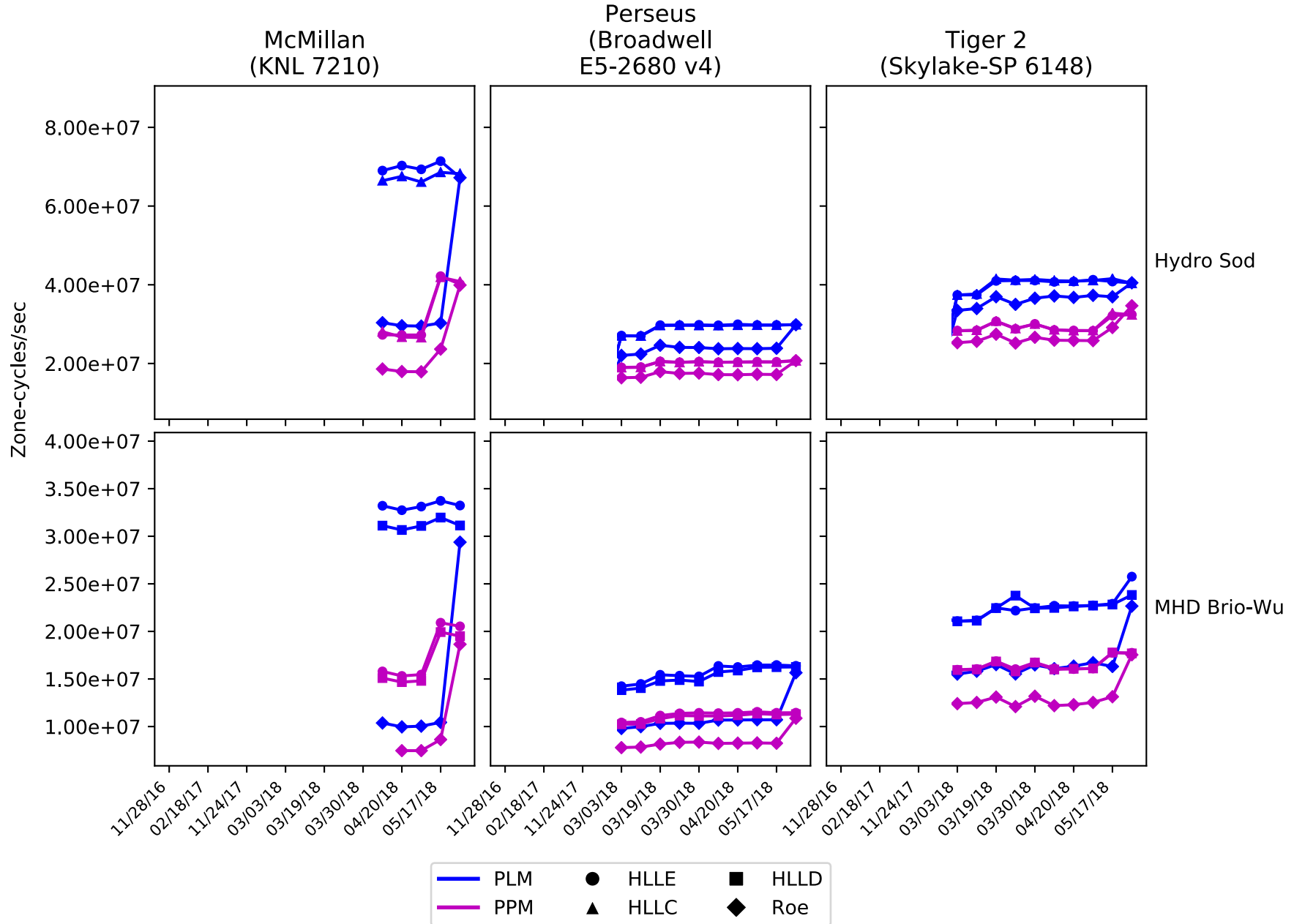
JCAHPC Oakforest supercomputer (KNL 7250):  
off-node scaling (using 64 of 68-core Xeon Phi)

# Single-core performance



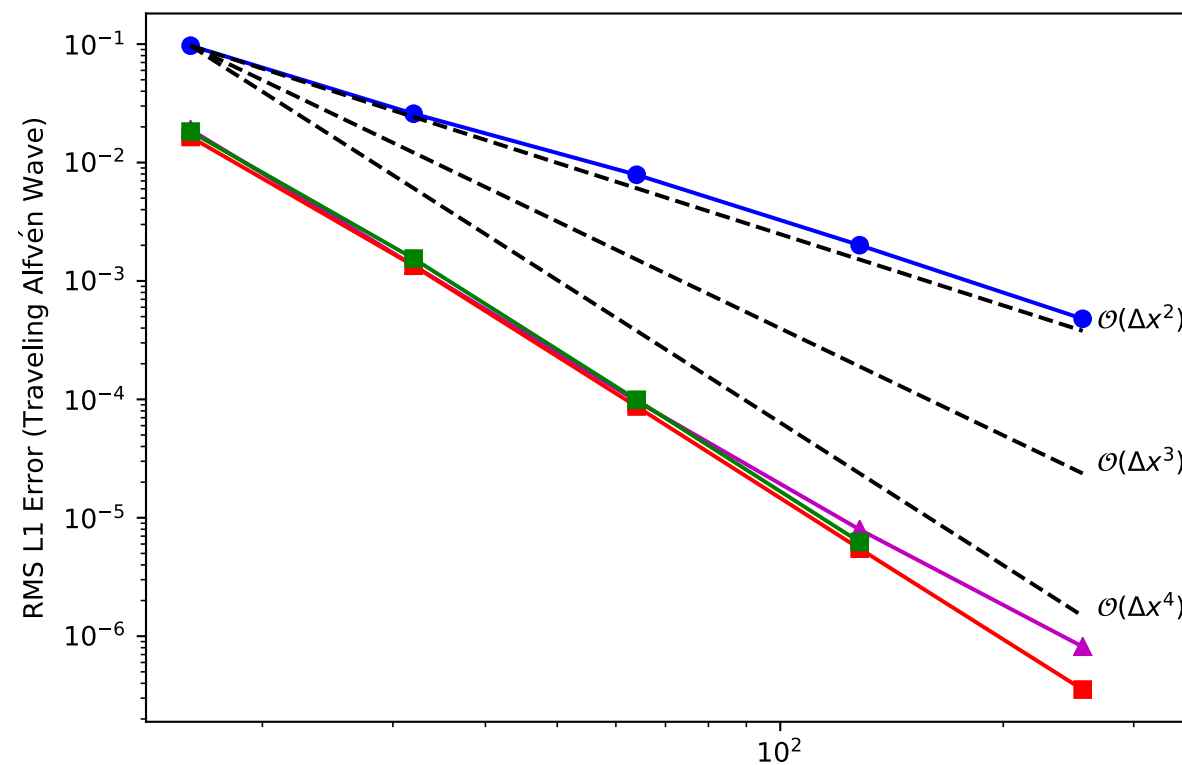
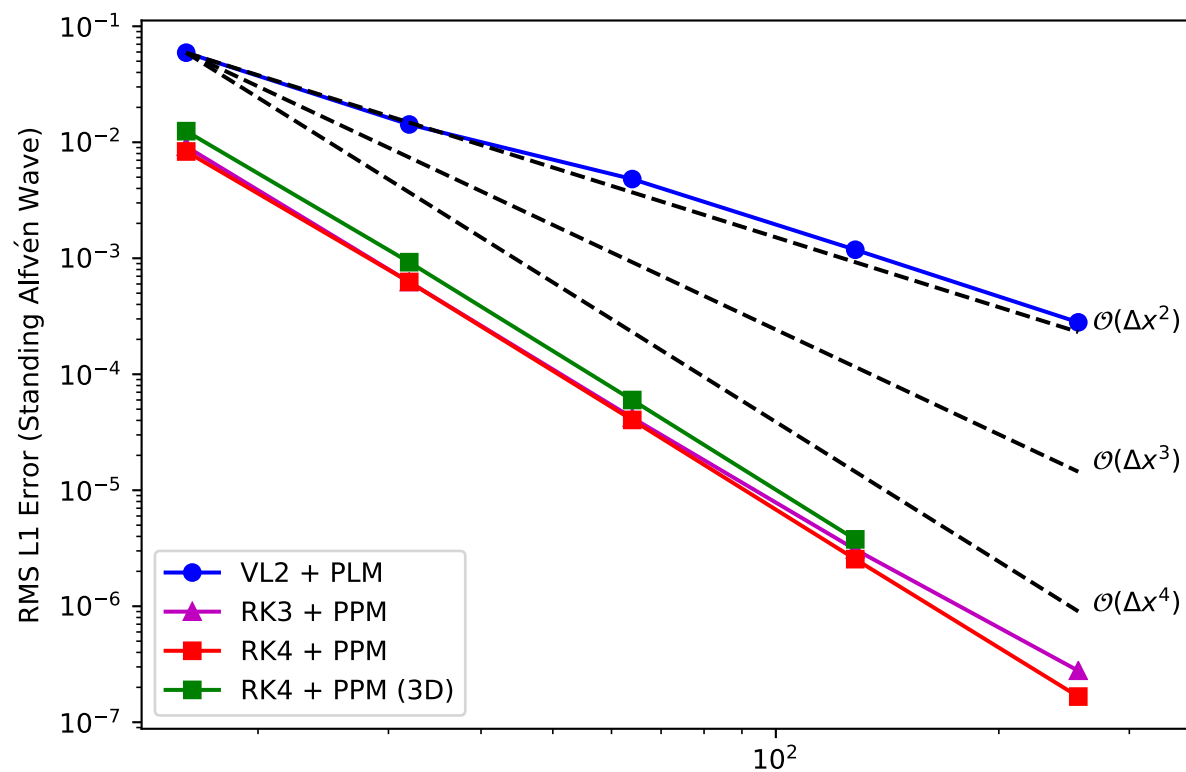


# Full node performance

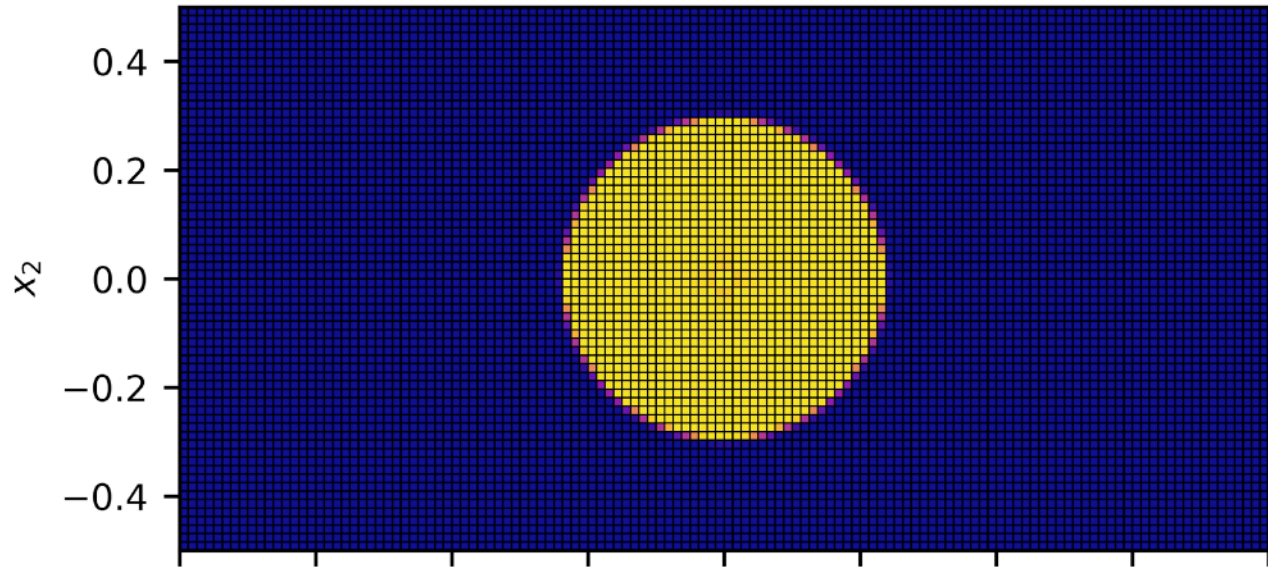


# Fourth-order results

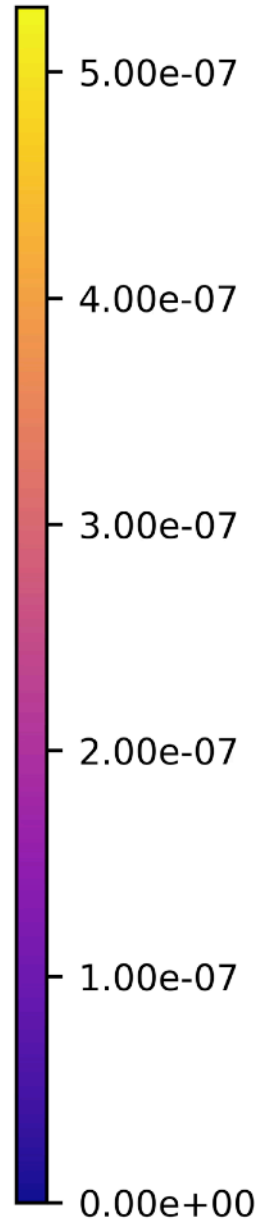
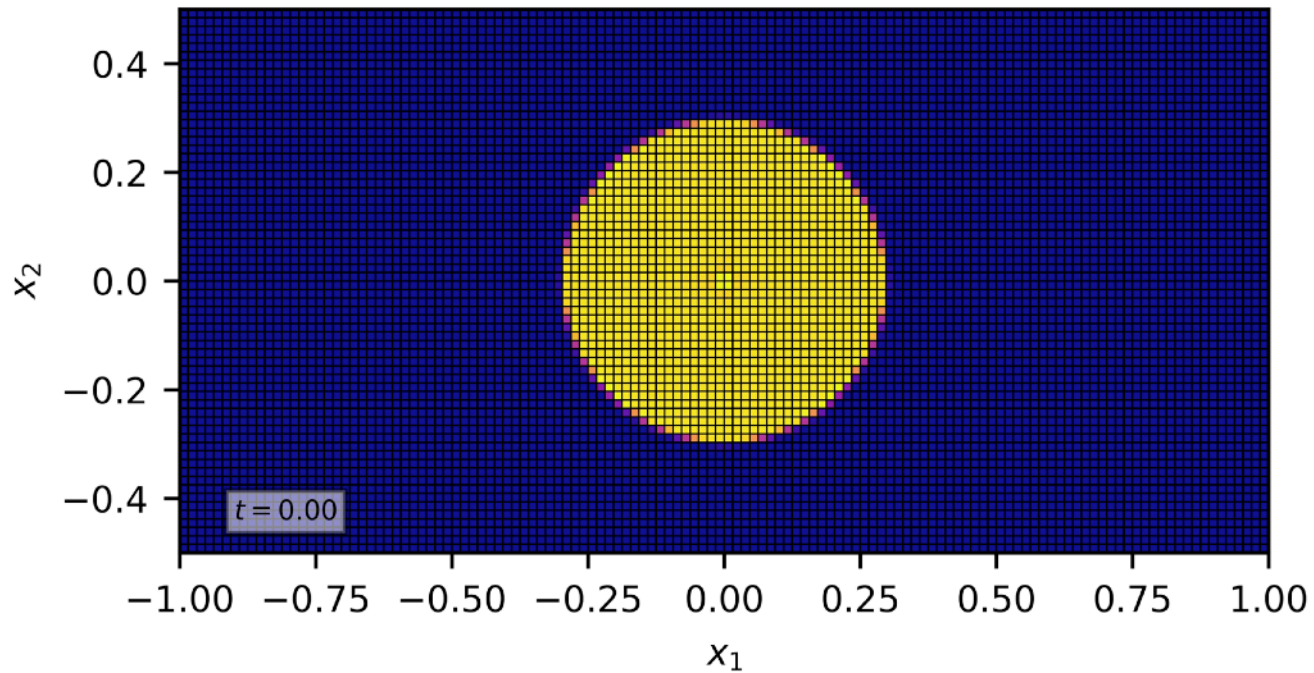
# Circularly polarized Alfvén wave



Second-order

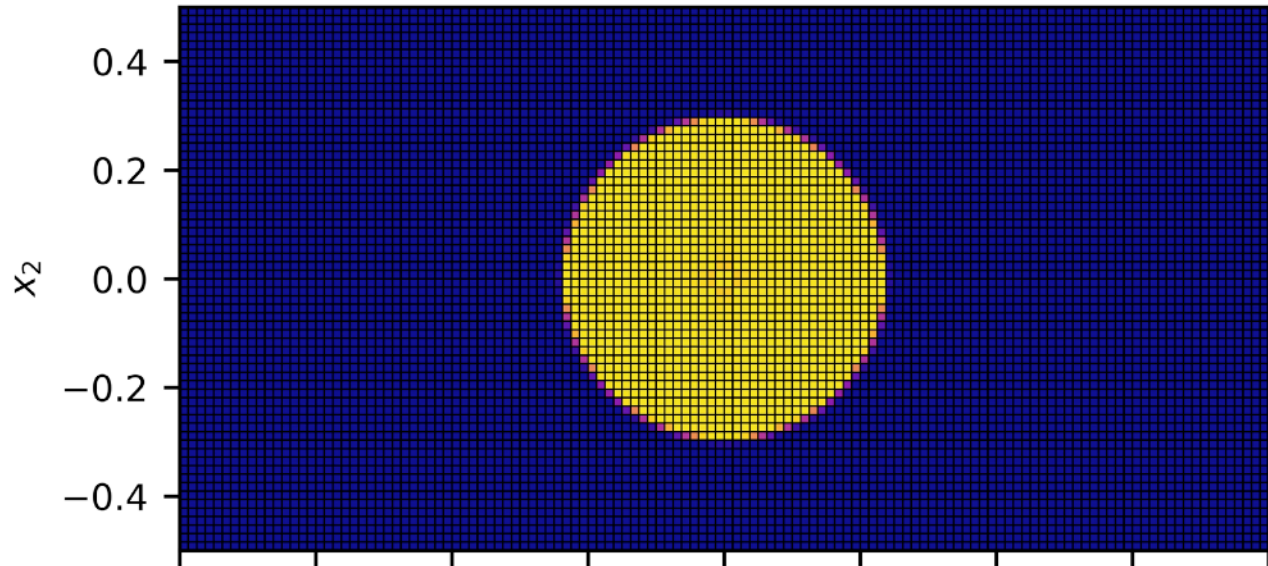


Fourth-order

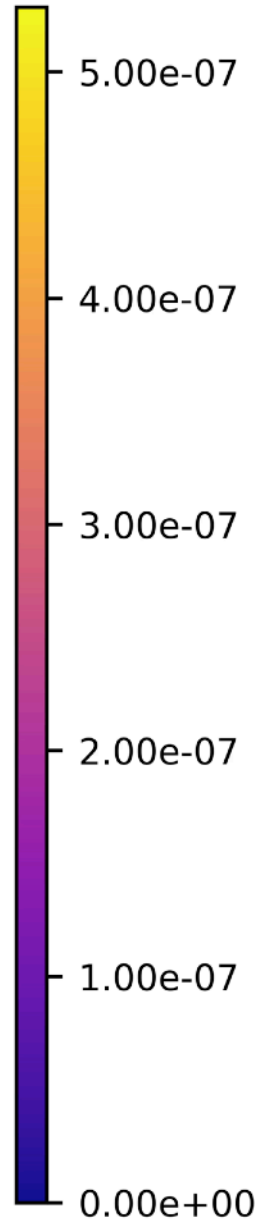
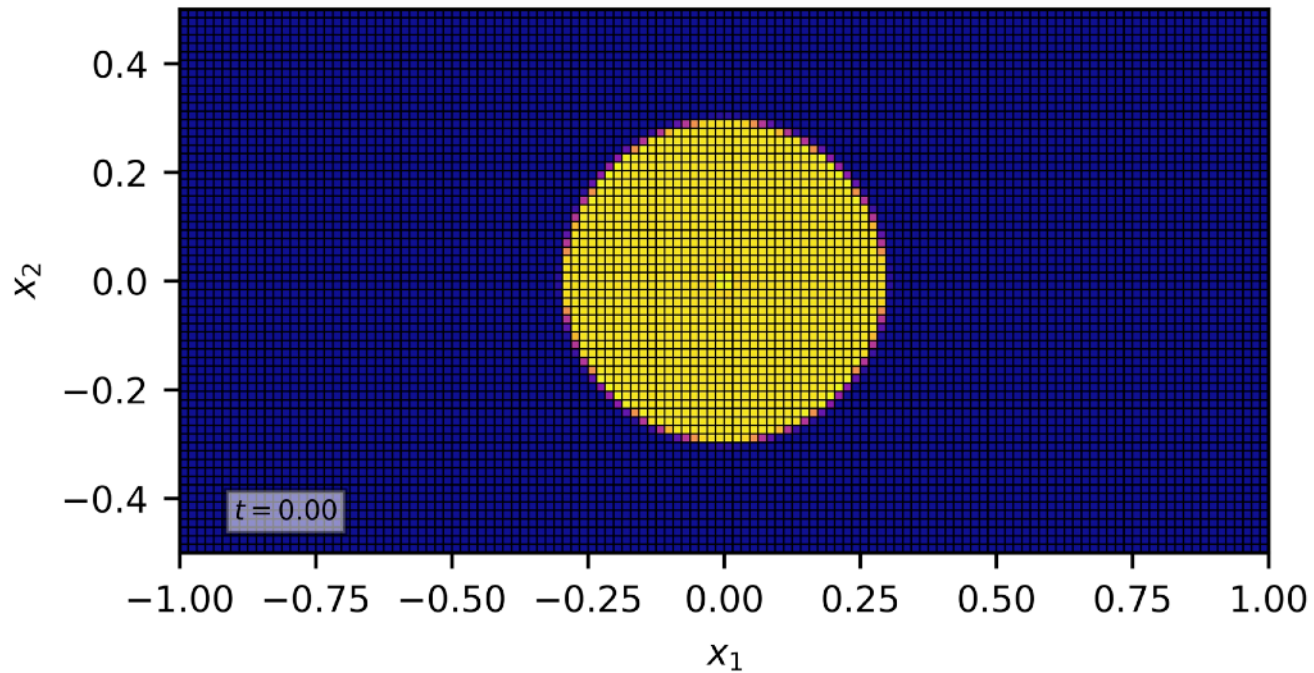


Diagonal  
advection  
of field  
loop

Second-order



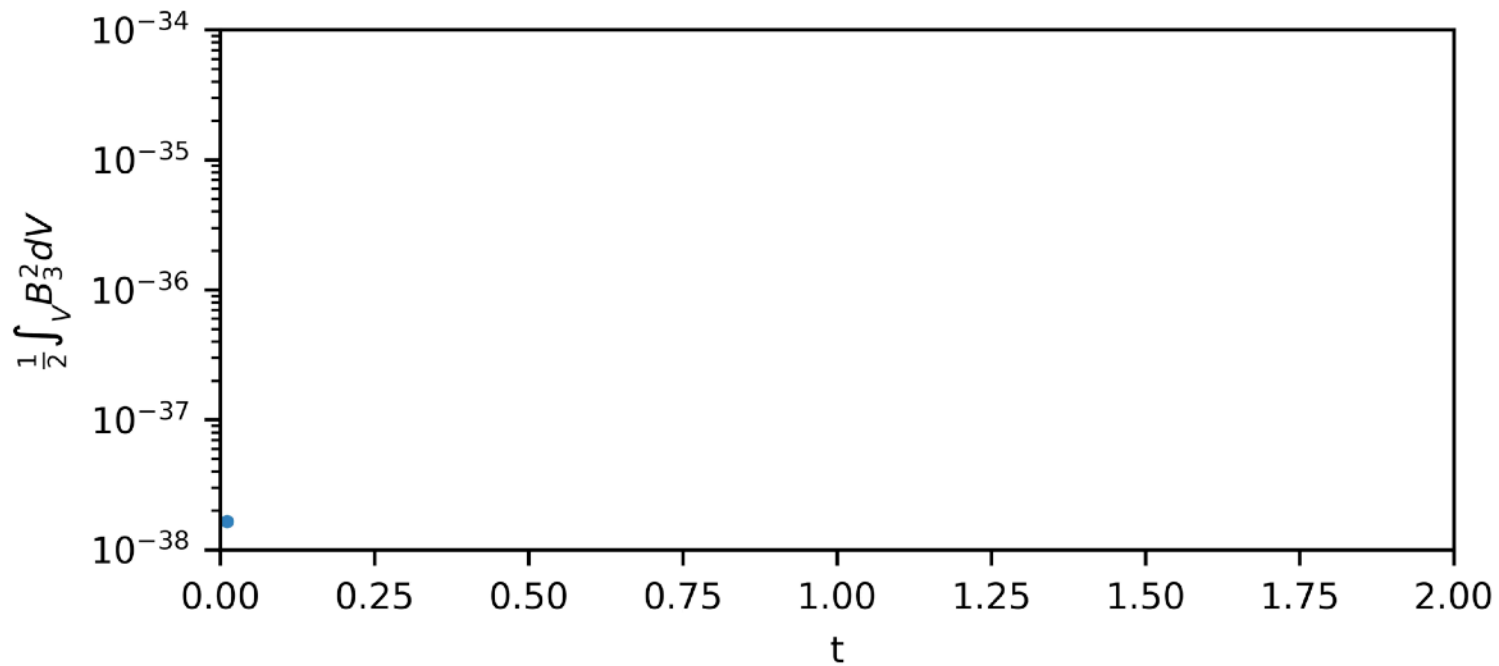
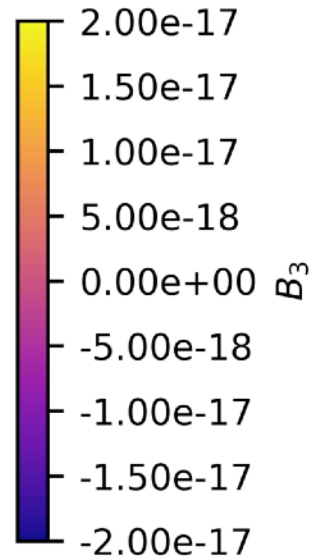
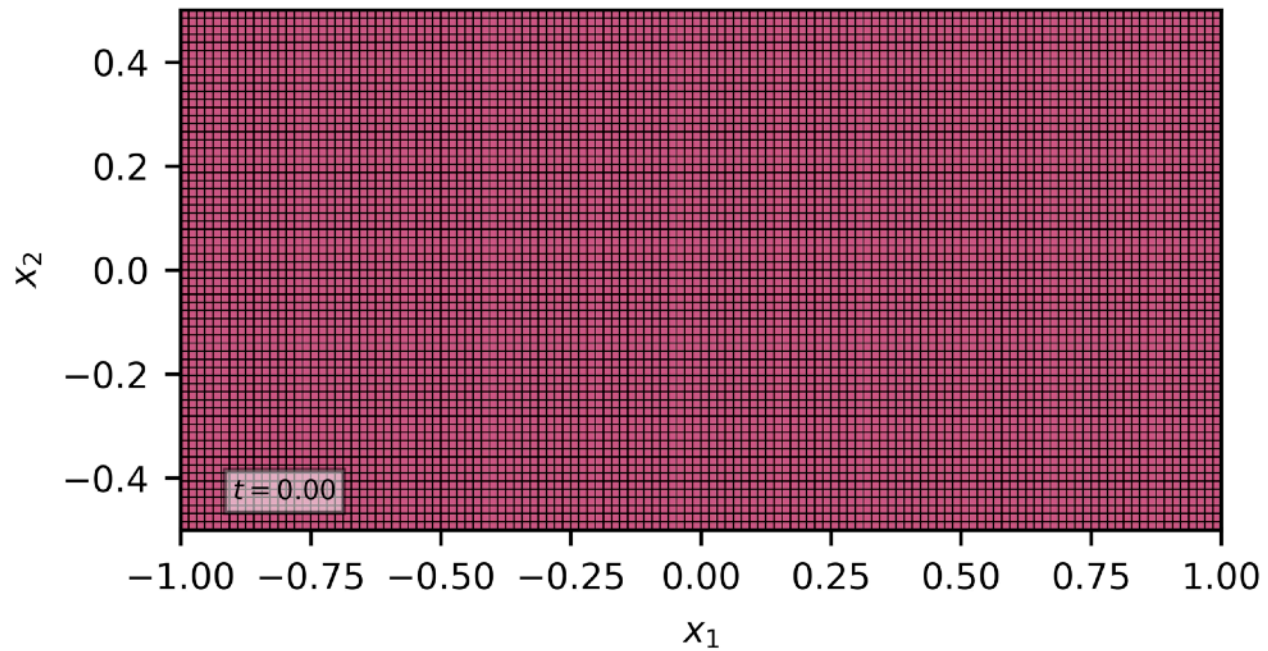
Fourth-order



$P_B$

Diagonal  
advection  
of field  
loop

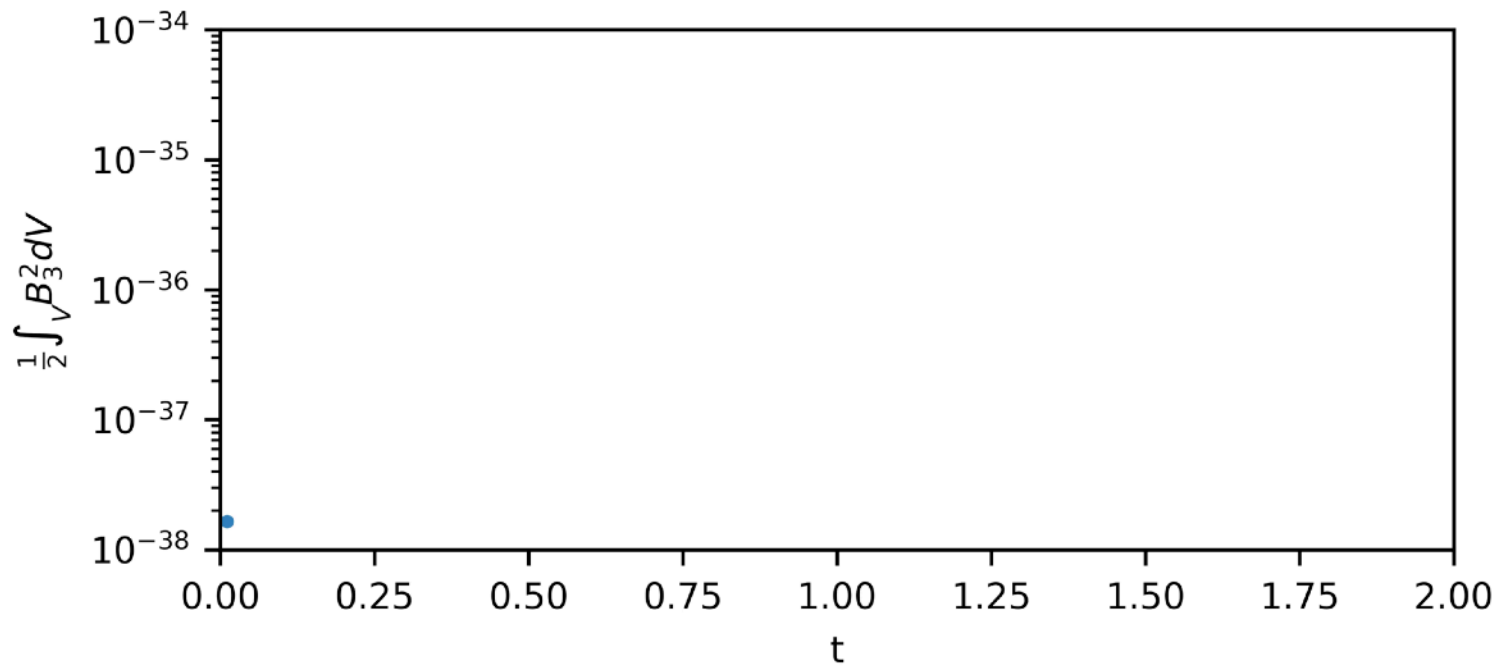
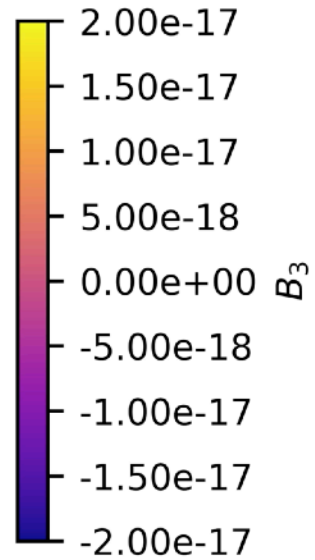
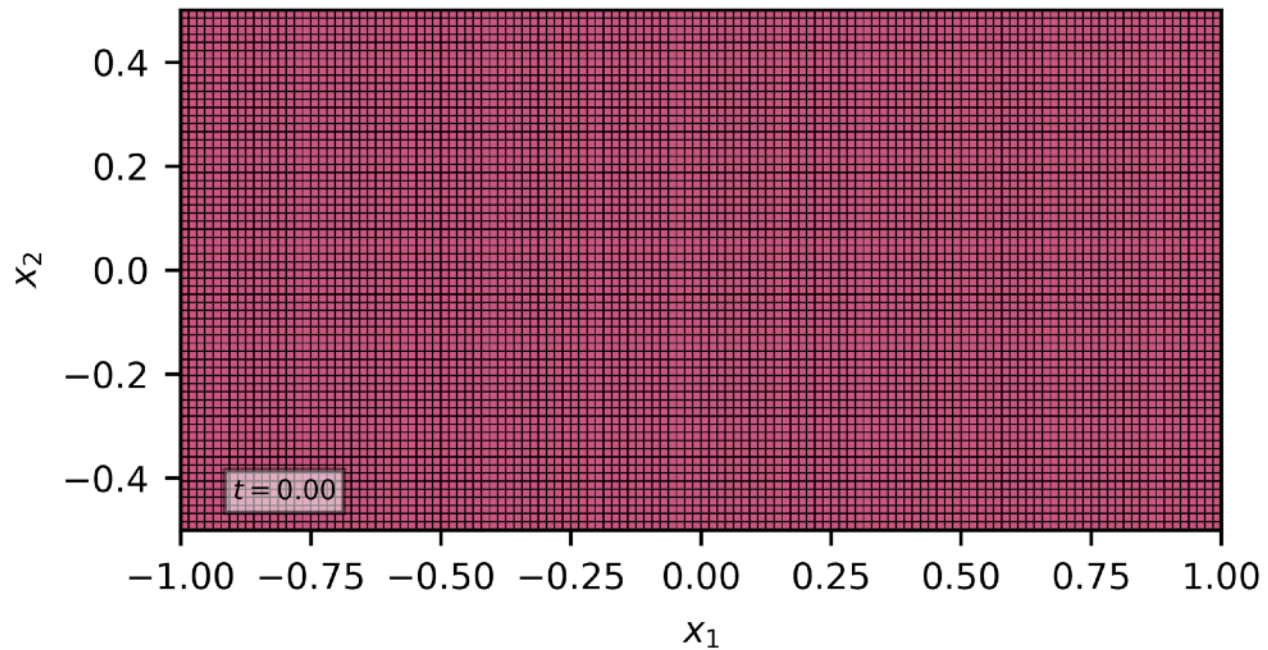
### Fourth-order



Numerical  
monopole  
suppression

$$\nabla \cdot \mathbf{B} = 0$$

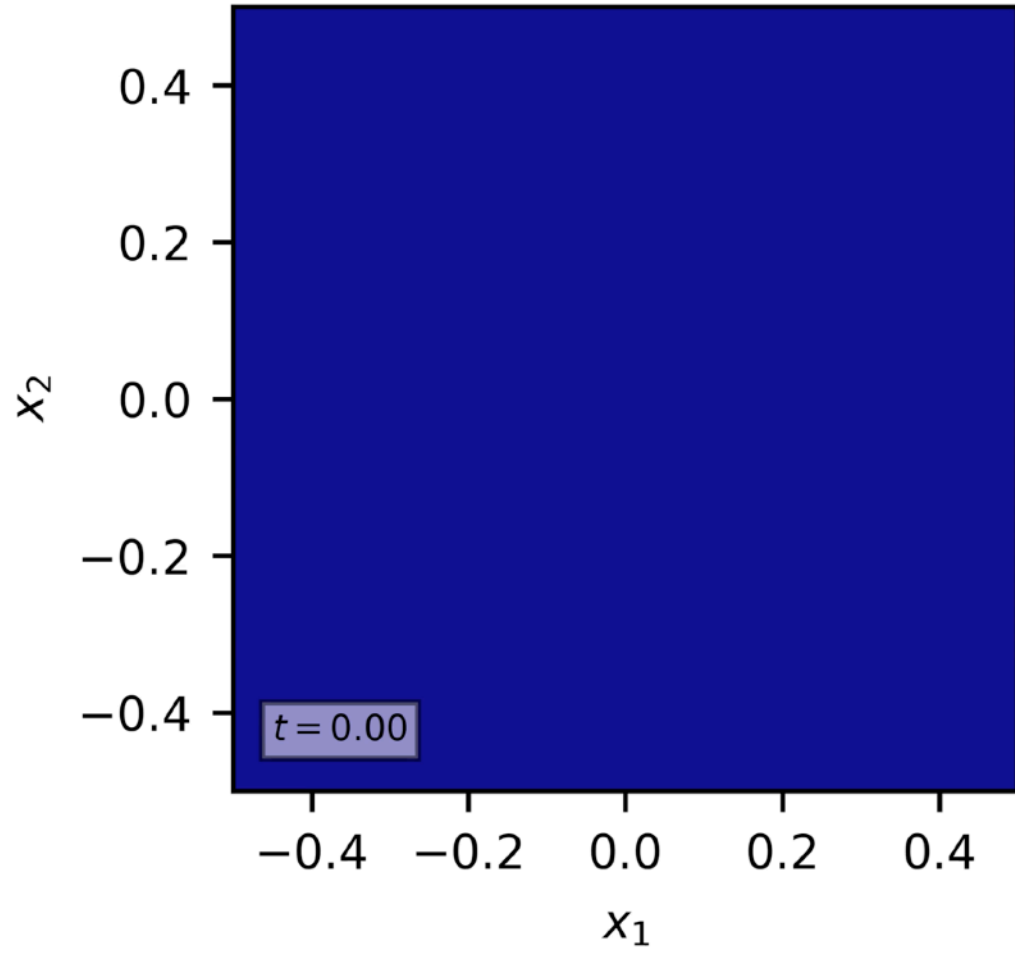
### Fourth-order



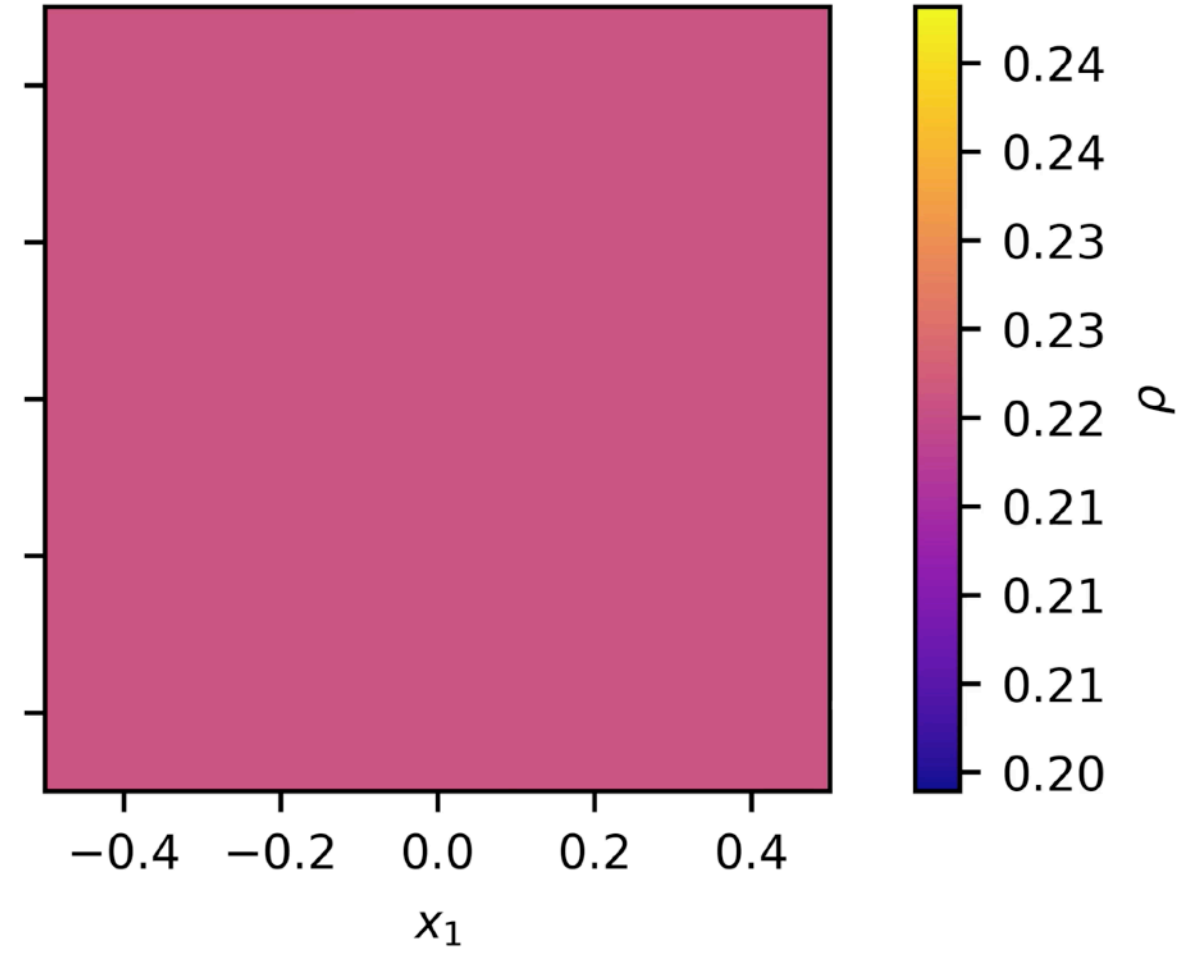
Numerical  
monopole  
suppression

$$\nabla \cdot \mathbf{B} = 0$$

Second-order

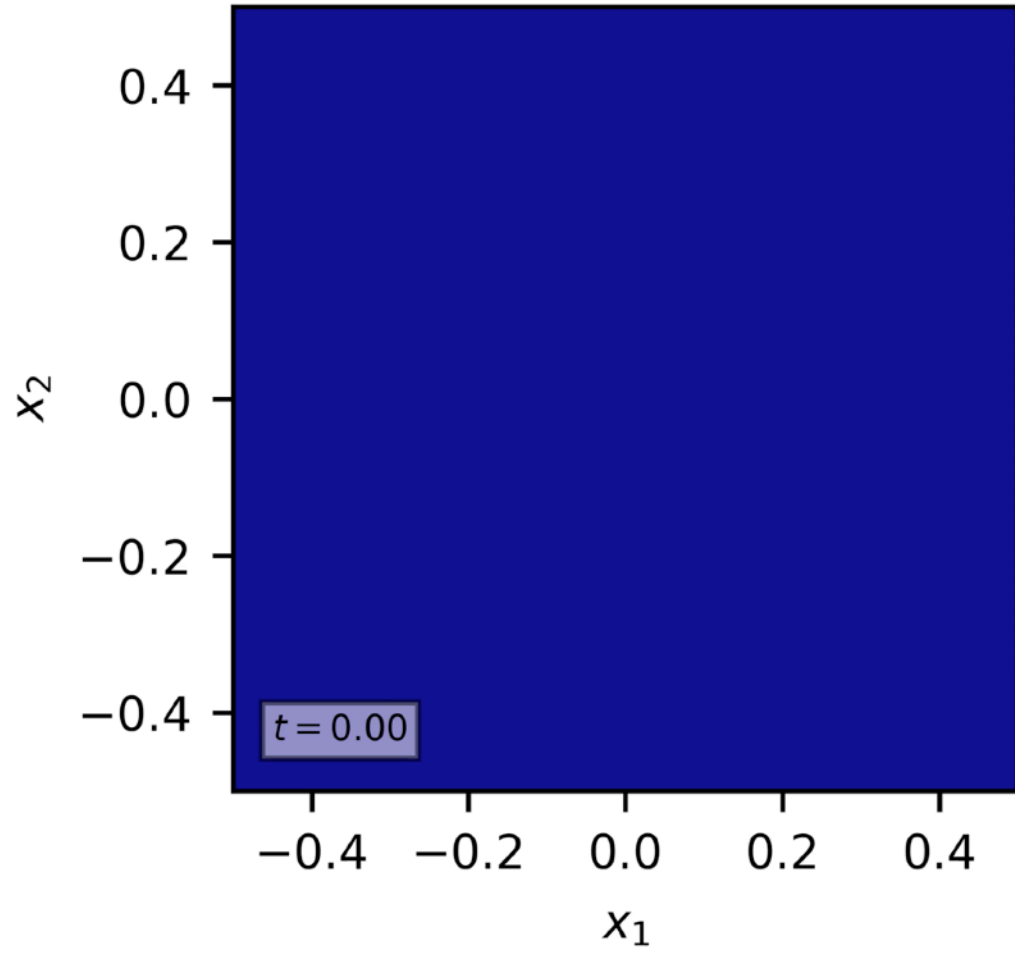


Fourth-order

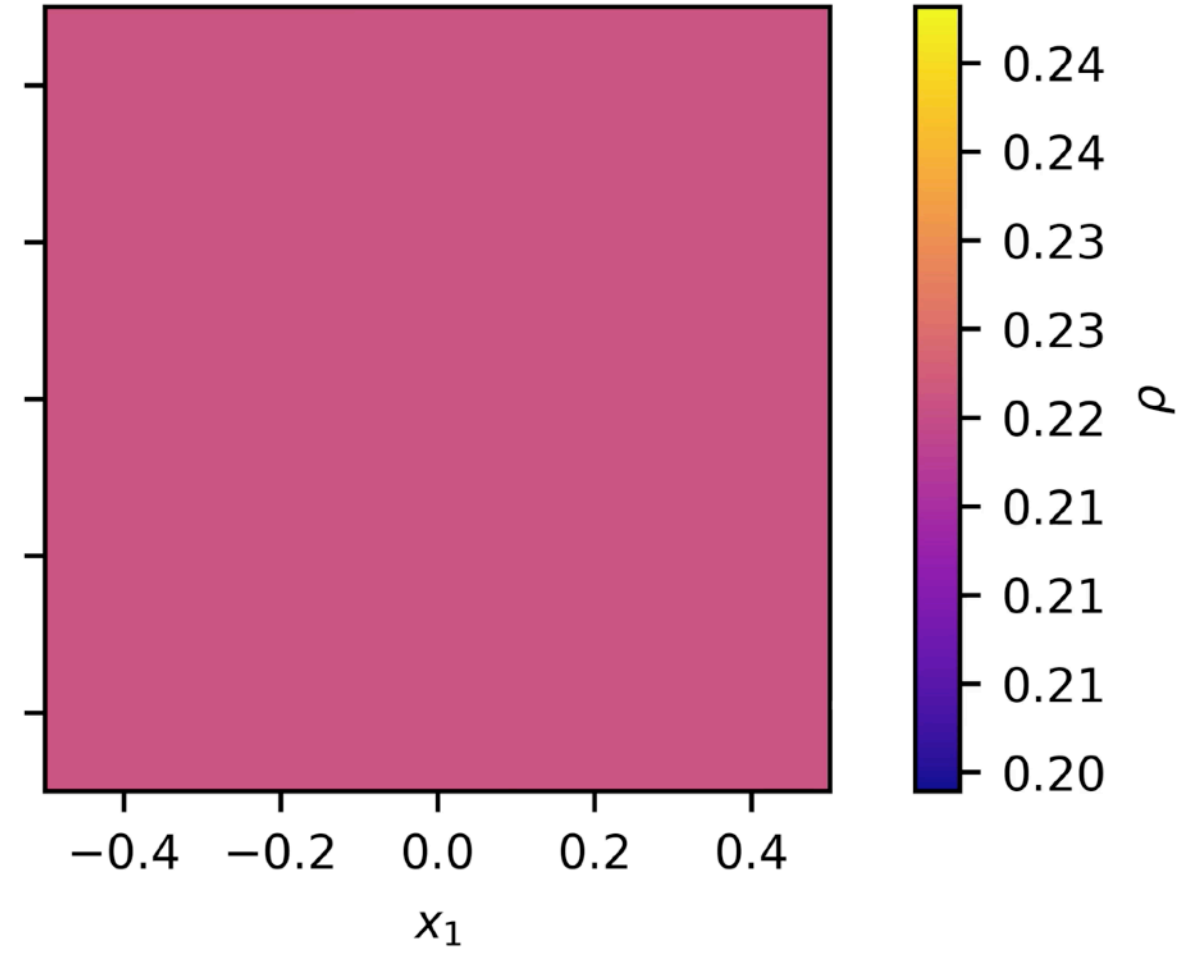




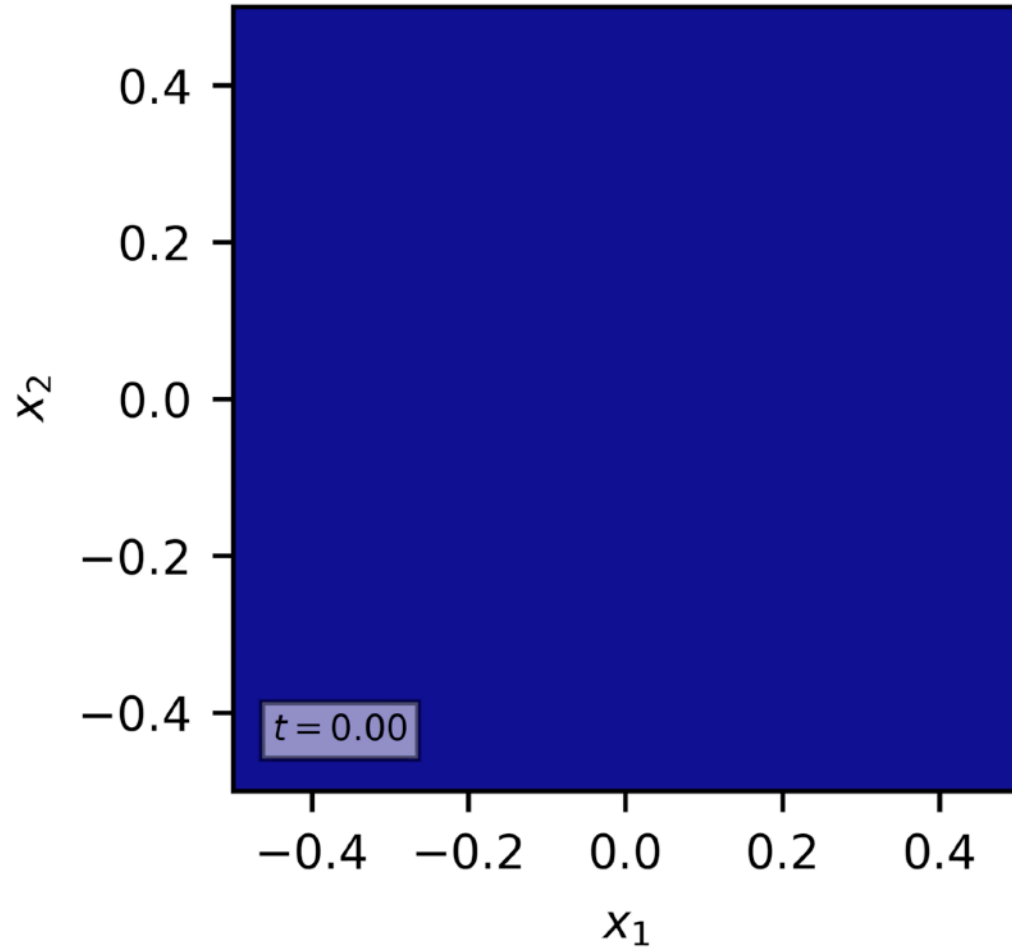
Second-order



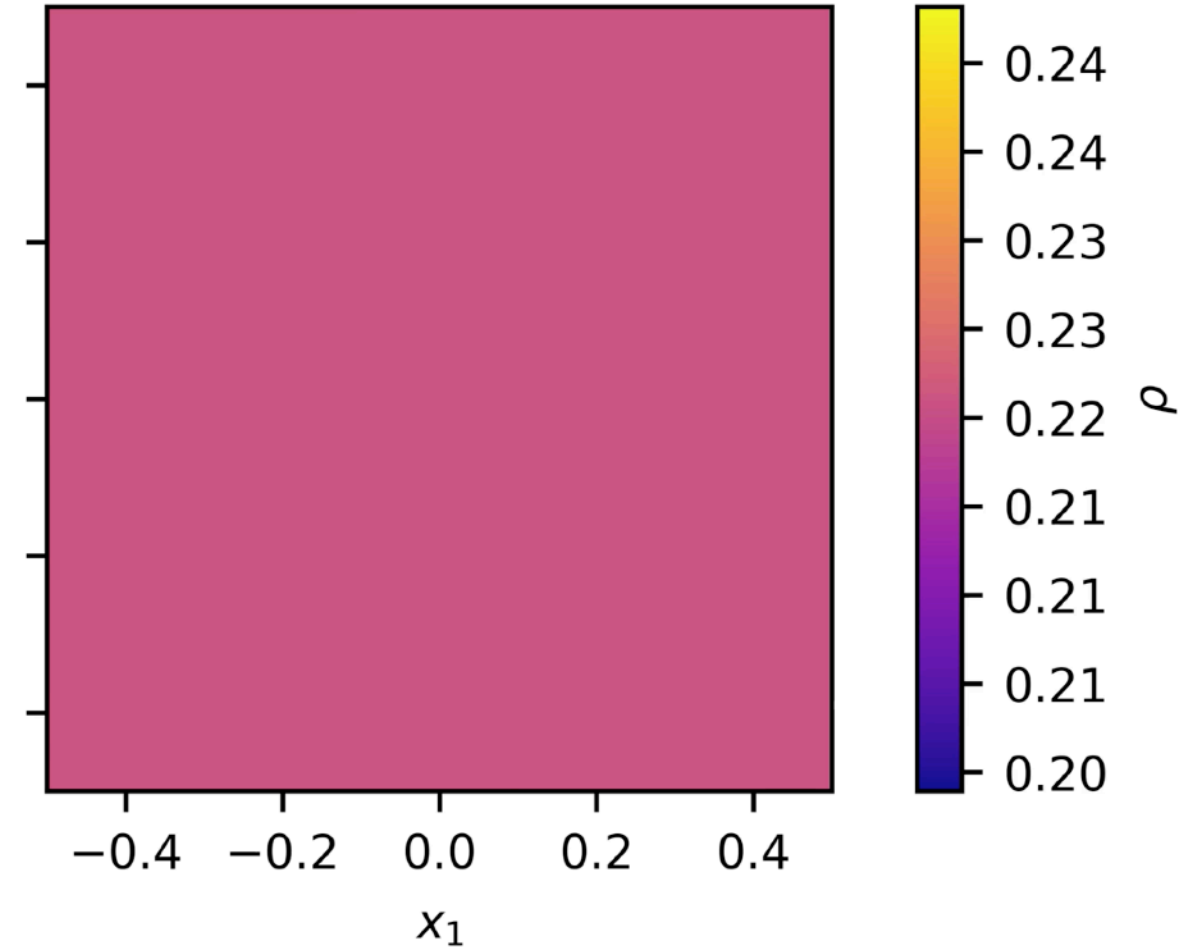
Fourth-order



Second-order



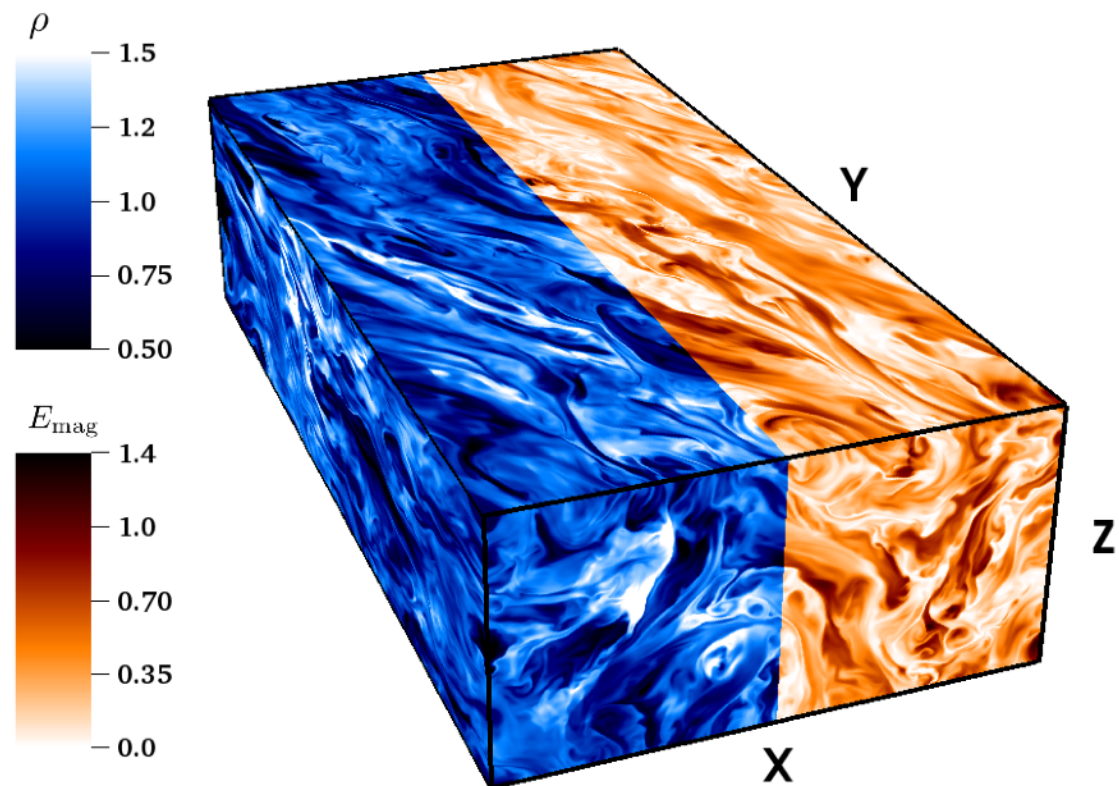
Fourth-order



~ 6-8x more expensive  
(but higher arithmetic  
intensity)!

# Future work

- Candidate for release in next public version of Athena++, v1.2.0
- Computational cost and efficiency study:
  - Explore the zoo of algorithmic options in Athena++
- Fourth-order shearing box simulations
- Extend to grids with adaptive mesh refinement and general relativity



Thank you!