

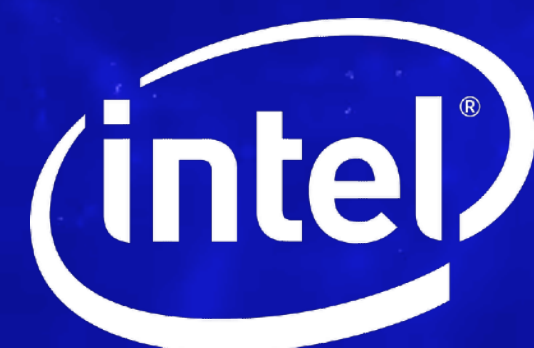
Choosing the best flavour of SPH for astrophysics problems:

# More complex may not be better

Josh Borrow

ICC, Durham

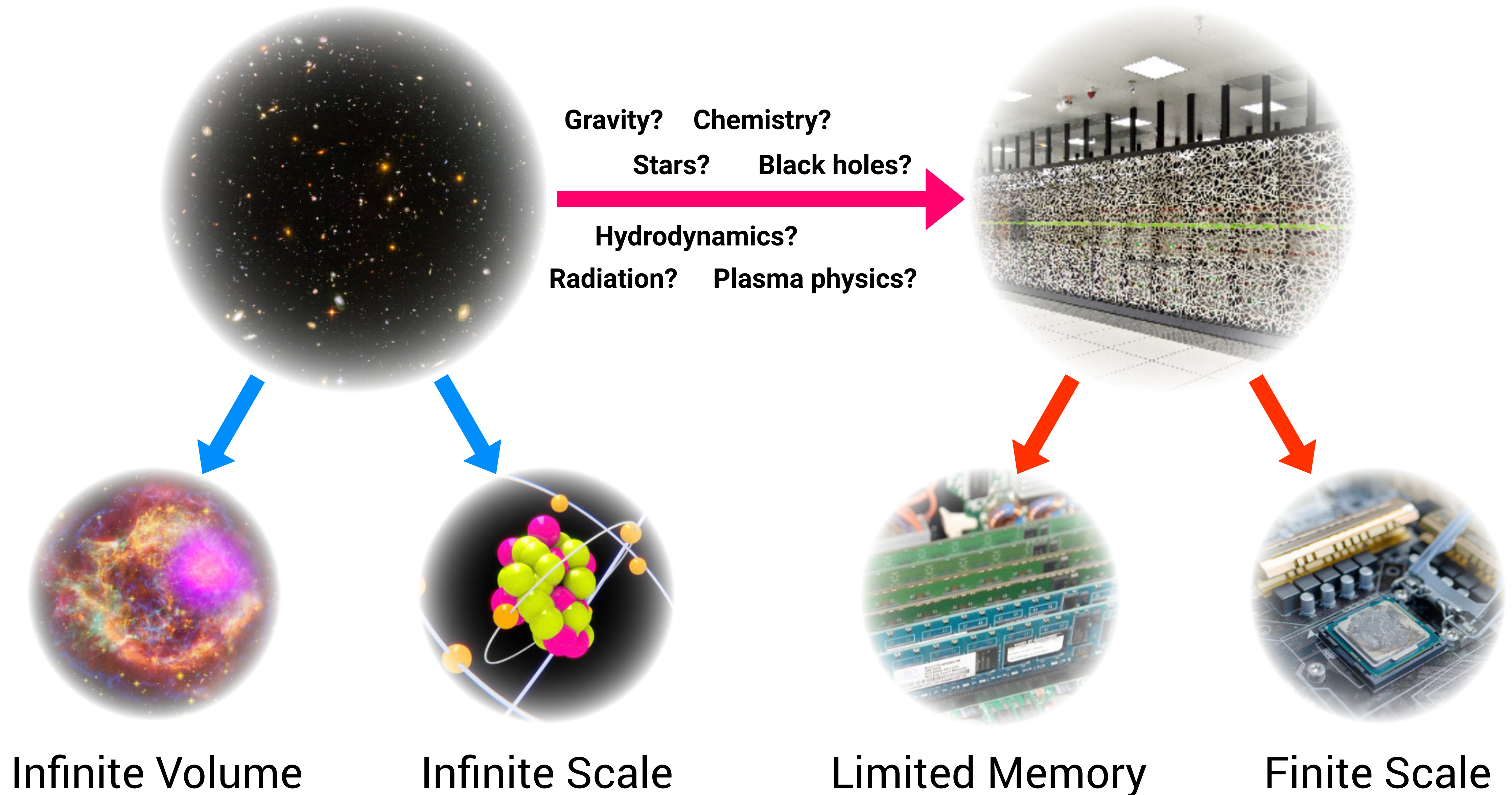
With Bert Vandenbroucke (St. Andrews) and Matthieu Schaller (Leiden Observatory)



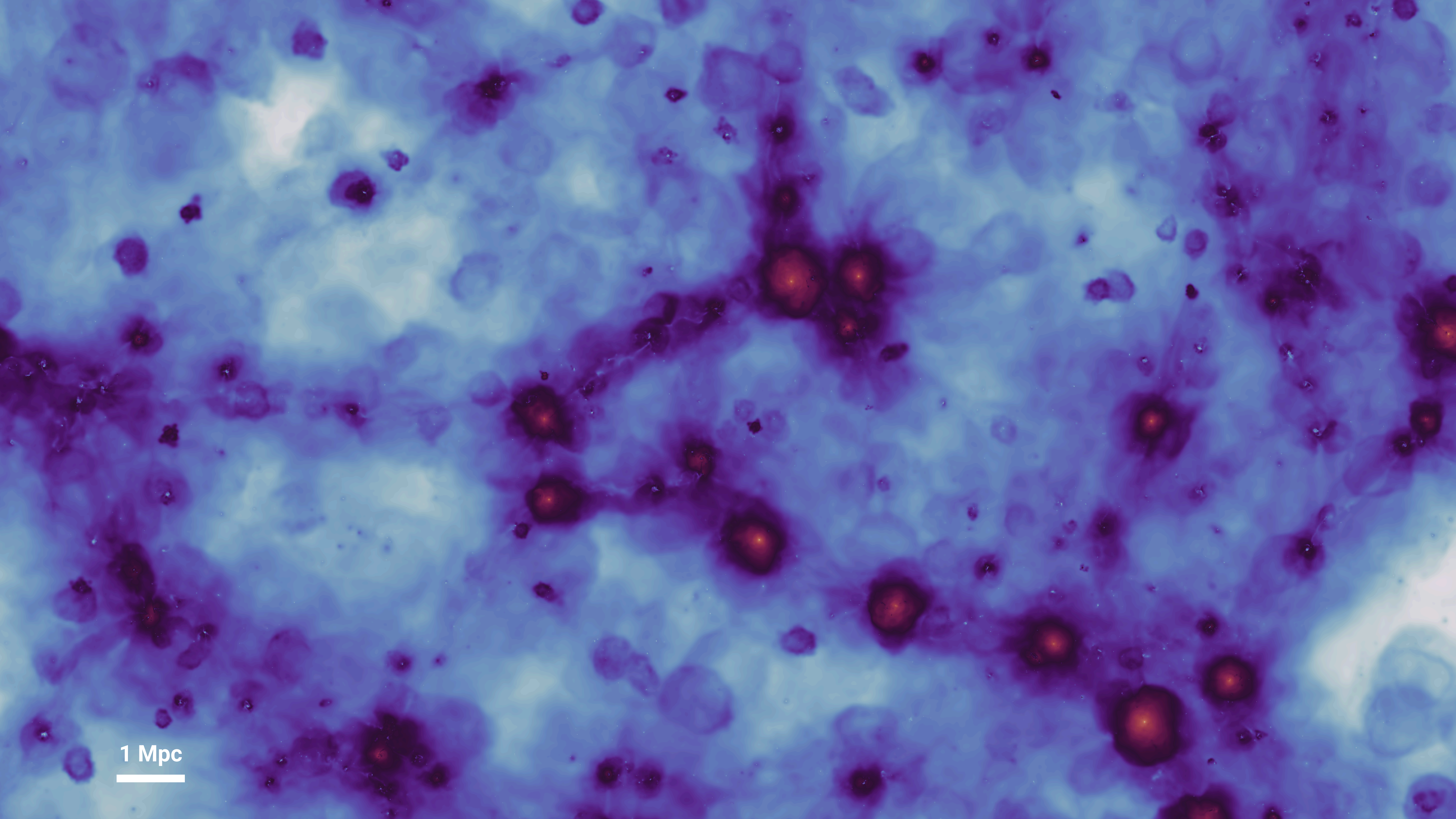


# The Universe

# HPC System

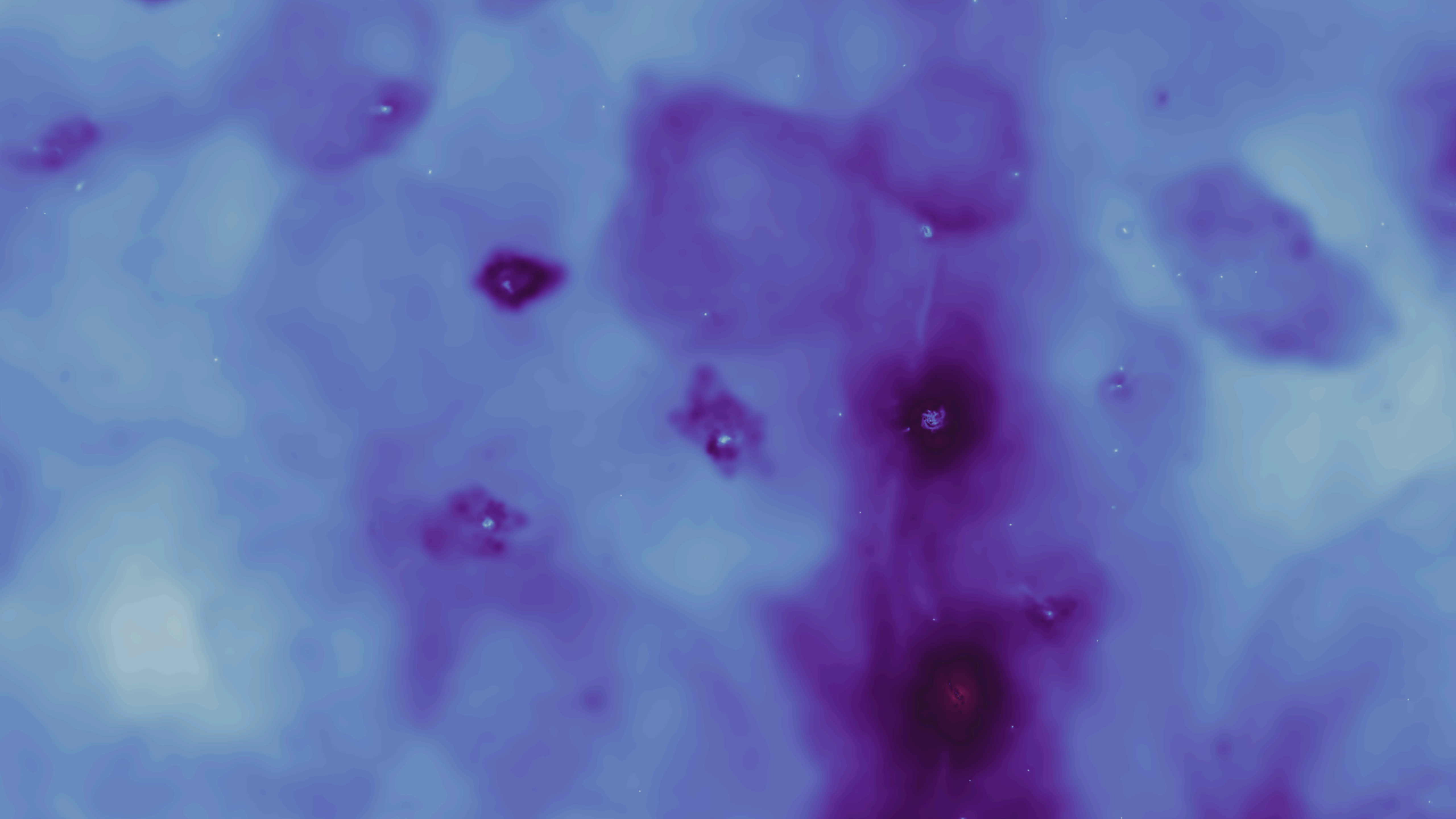




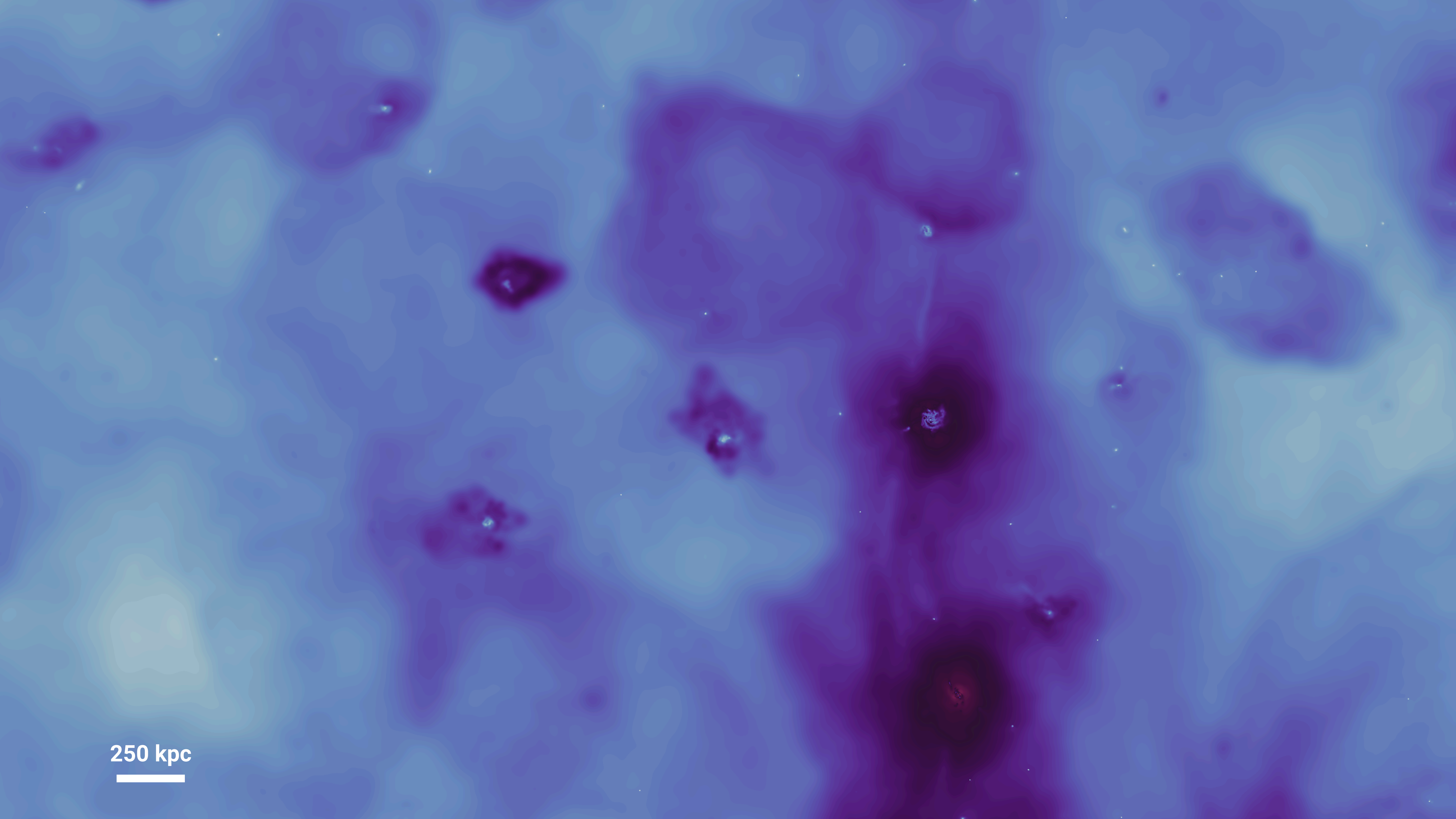


1 Mpc



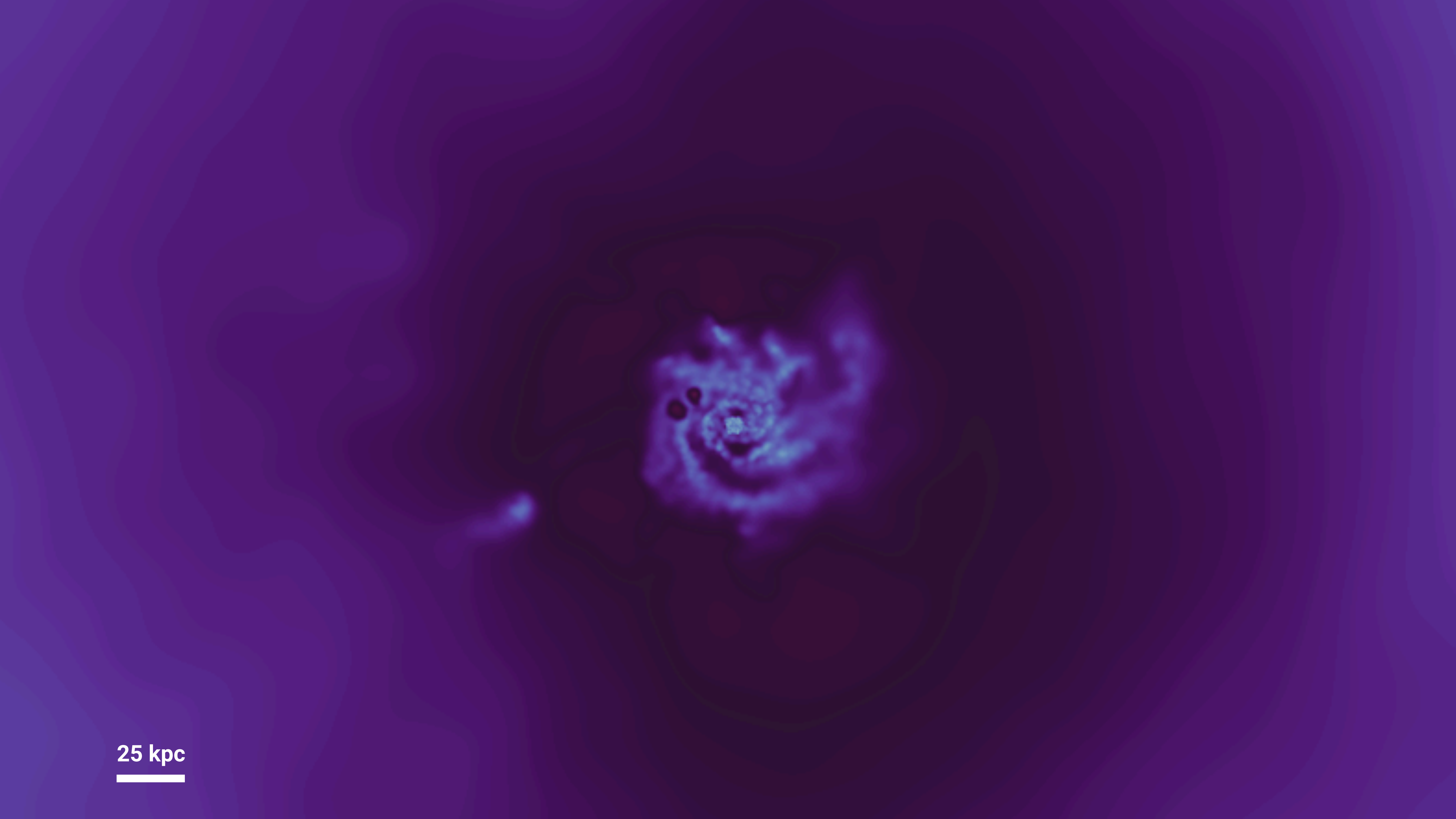






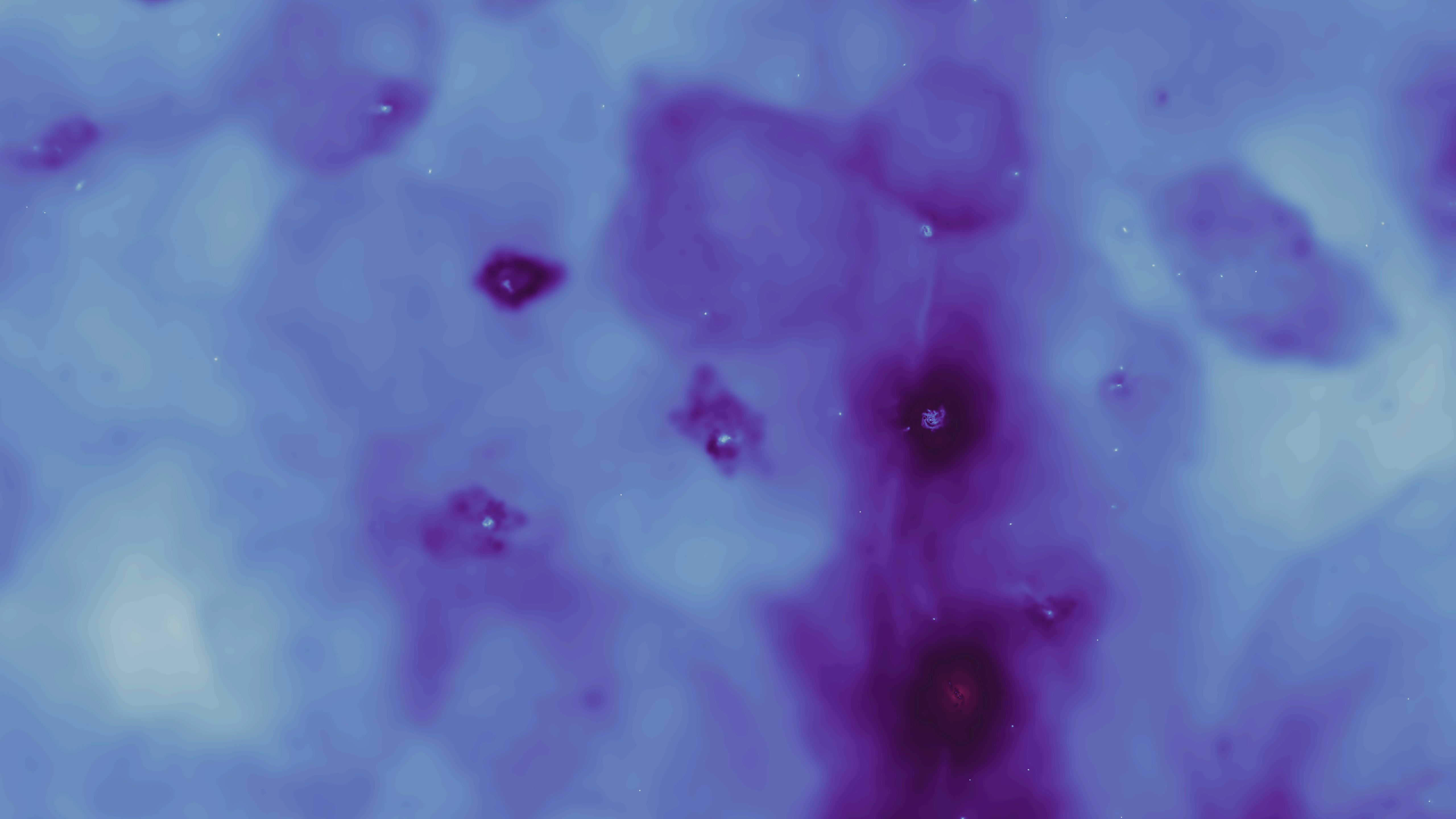
250 kpc



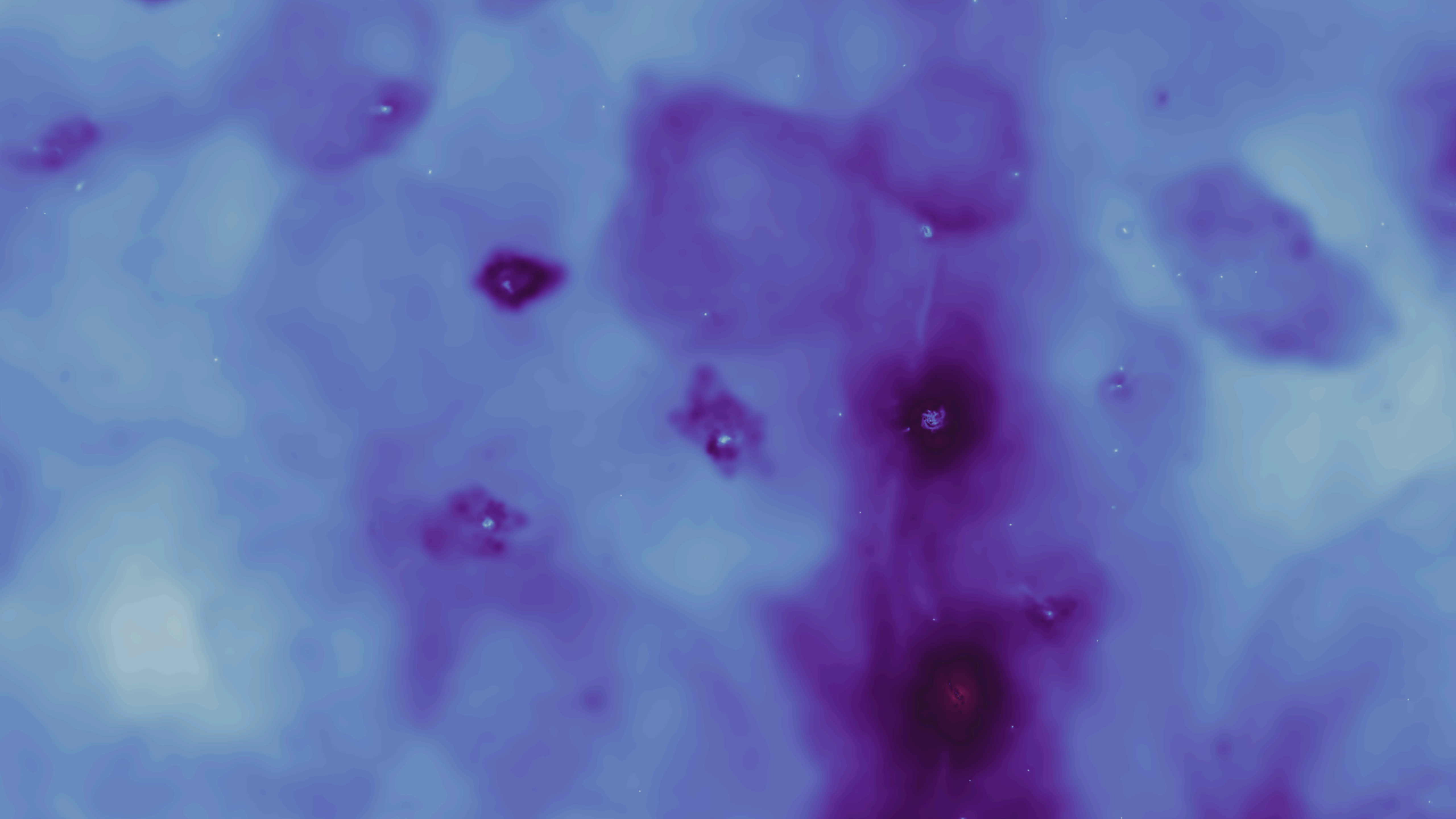


25 kpc

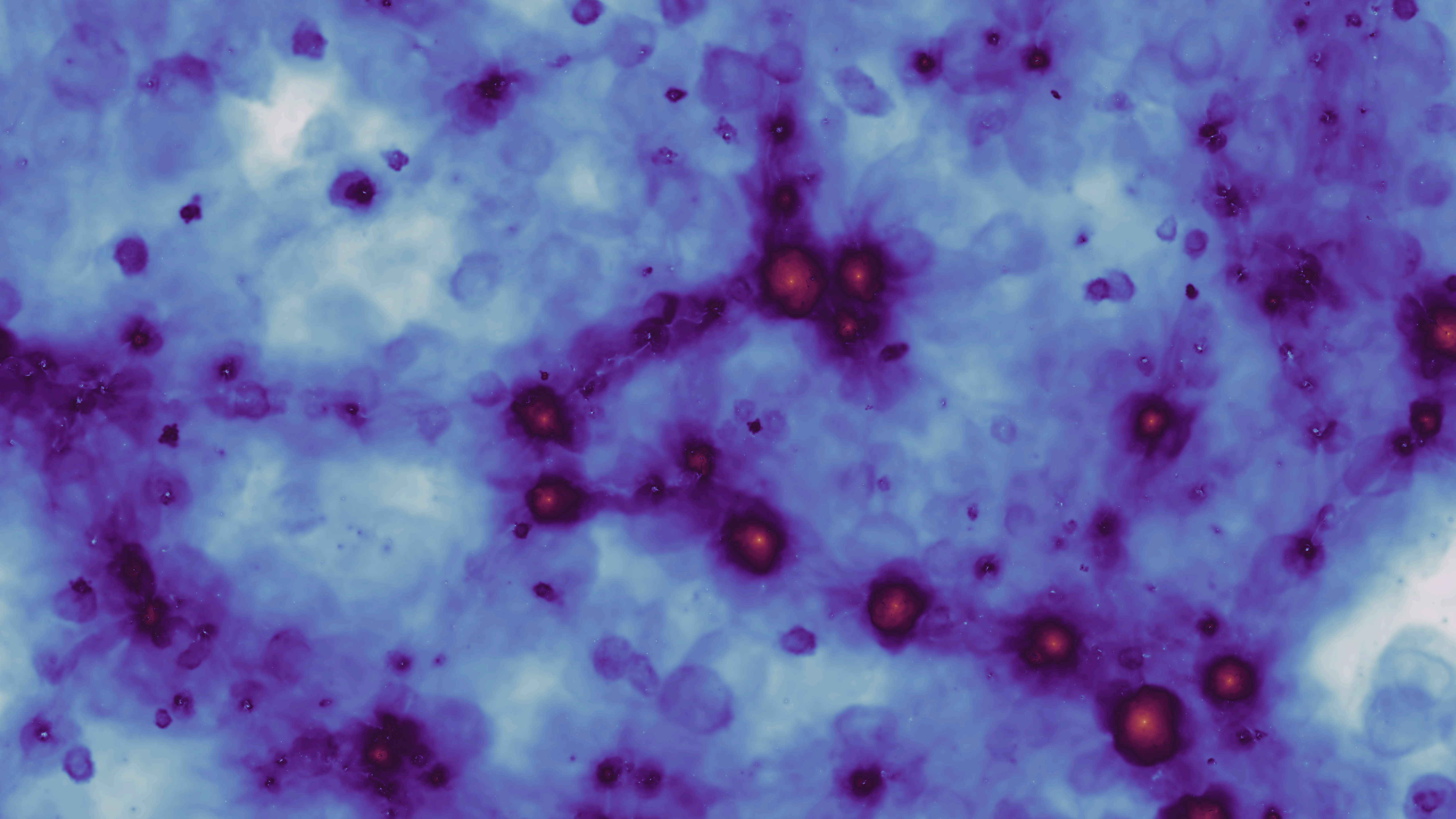




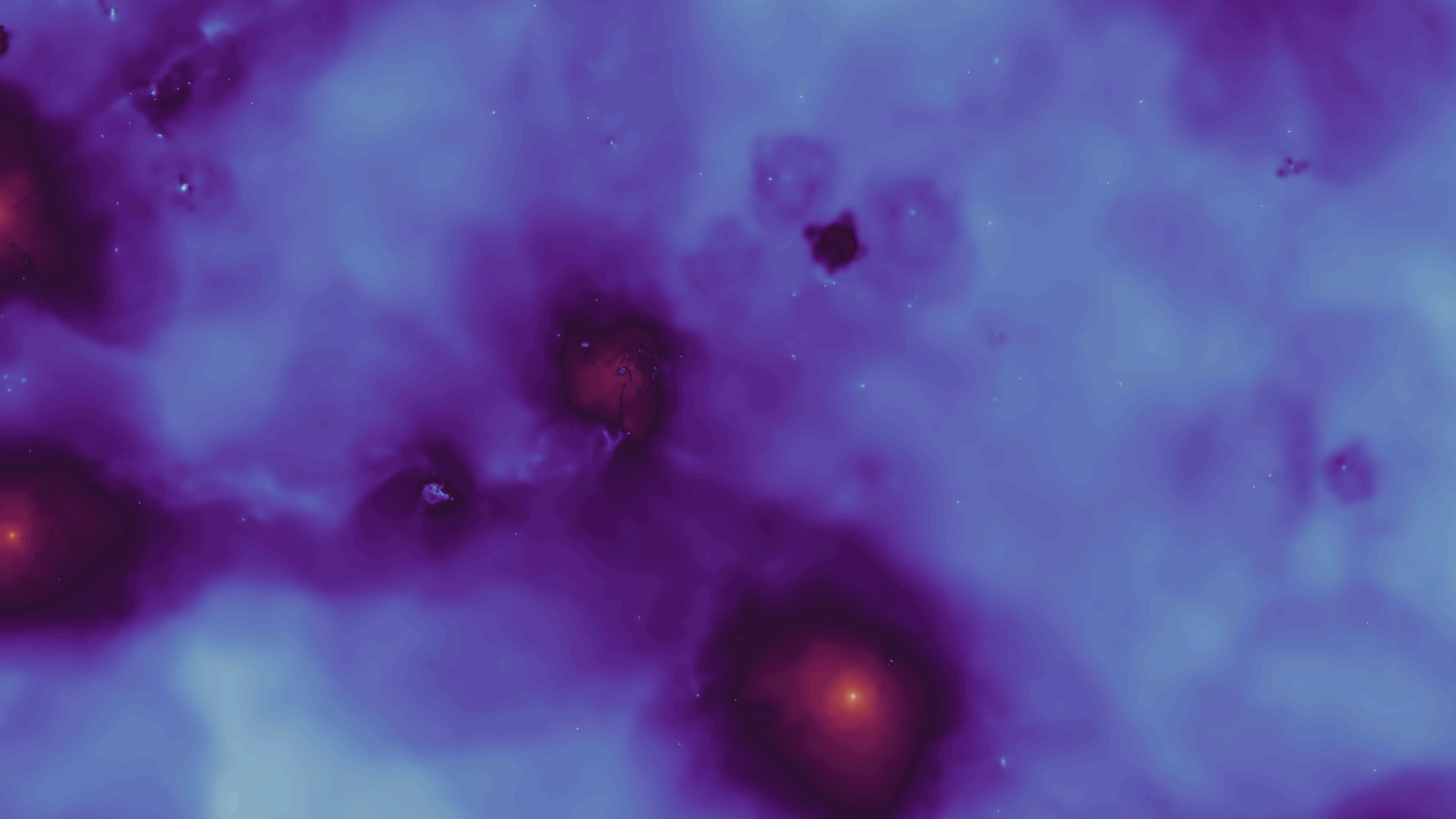




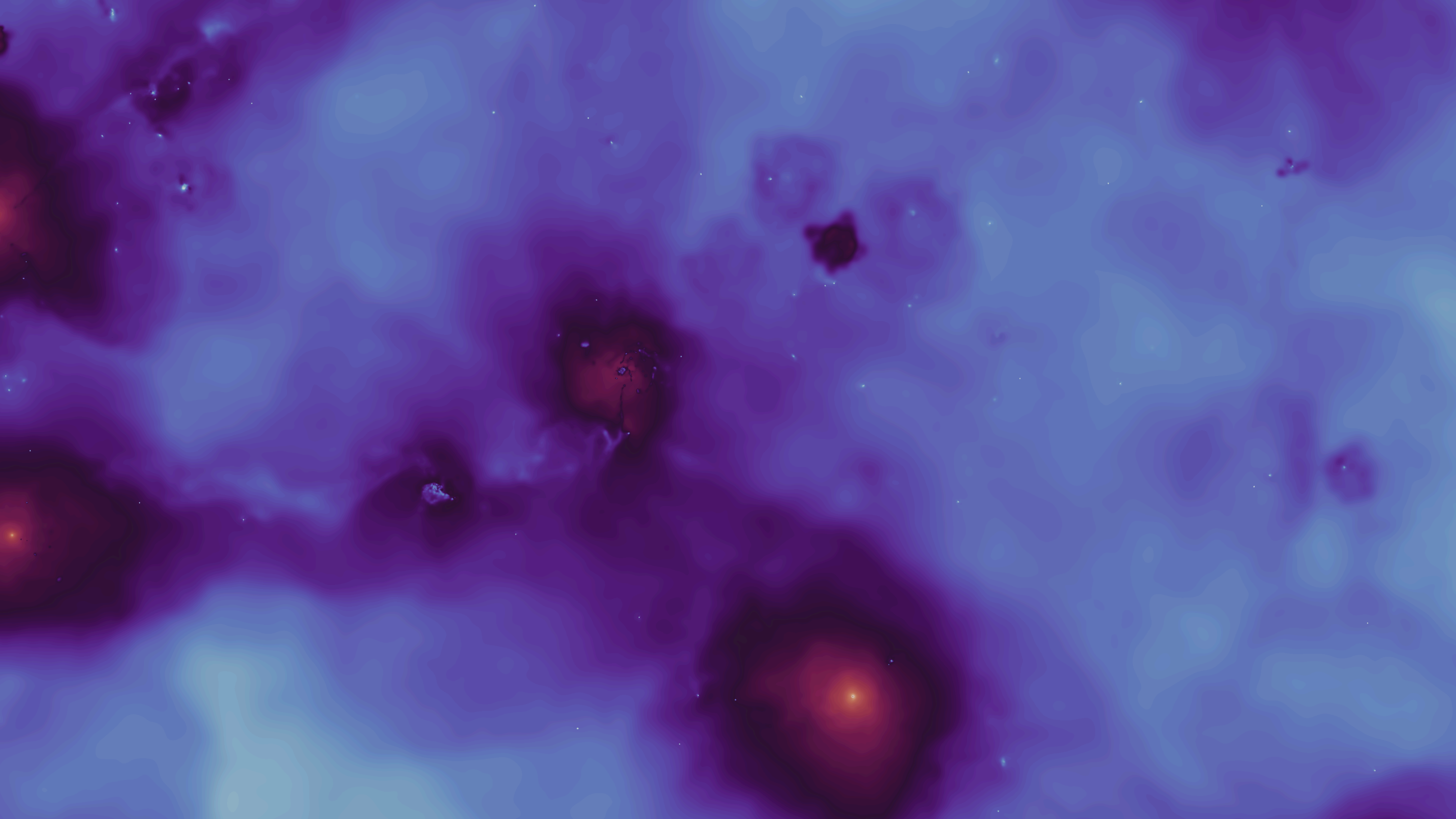


















**Sheared satellite accretion**



**Individual feedback event**



**Spiral structure**

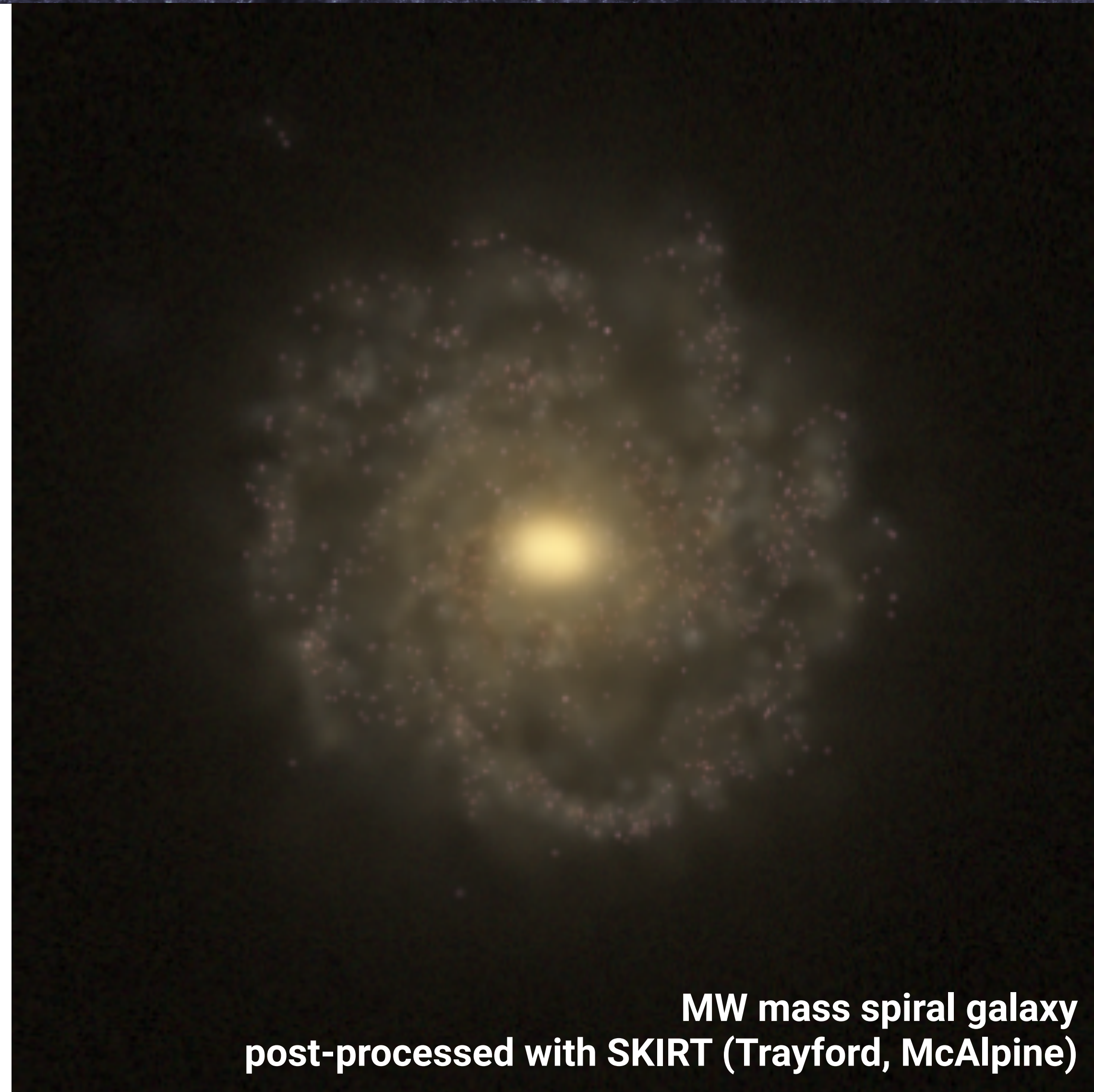


**25 kpc**  
A white horizontal scale bar representing 25 kpc.



# What can we actually see?

- Mass resolution  $M_g = M_* \approx 10^6 M_\odot$
- Spatial resolution  $\ell_g \approx 1 \text{ kpc}$
- Processes on smaller scales than these included in '**sub-grid**' models
- Galaxies resolved by **100'000** particles, despite there being **100 billion** particles integrated

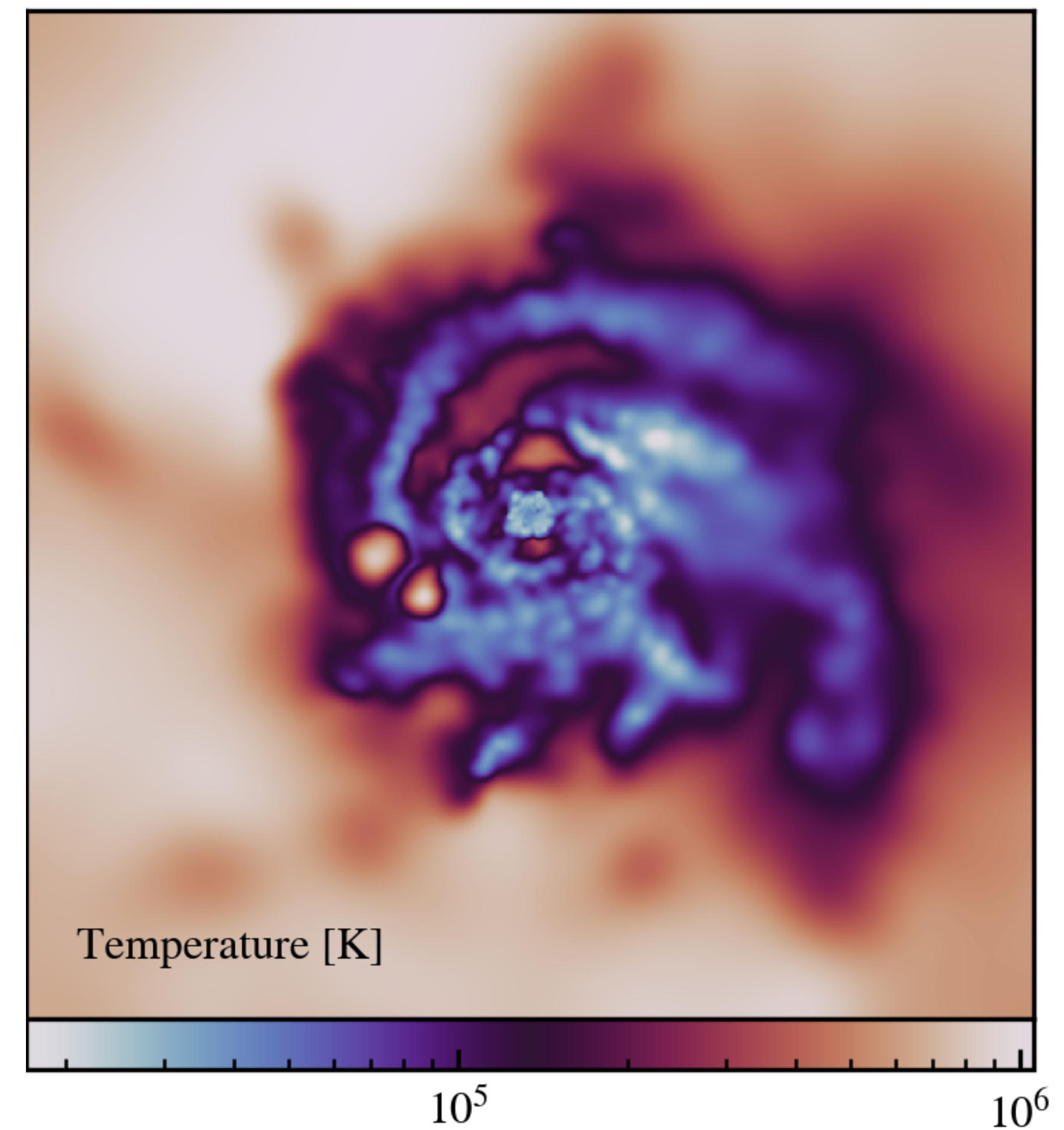


MW mass spiral galaxy  
post-processed with SKIRT (Trayford, McAlpine)



# What are the challenges?





- **Computational:** how do we scale our calculation to tens of thousands of cores?  
Multiple time-stepping  
Variable  $h$
- **Physical:** how do we model the gas dynamics and sub-grid physics?
- **Astrophysical:** how do we calibrate our model?



Grand design spiral from SWIFT/EAGLE tests



# Cosmological hydrodynamics

	Accuracy (per part)	Cost	Number of parts	Sub-grid precision
• <b>Smoothed Particle Hydrodynamics</b> (SPH / ANARCHY) - EAGLE, FIRE				
• <b>SPH-Arbitrary Lagrange-Euler</b> (SPH-ALE / GIZMO) - FIRE-II, SIMBA				
• <b>Moving mesh</b> (AREPO) - Illustris, Illustris-TNG				



# Possible Schemes

## "Traditional SPH"

Basic Density-Energy SPH

$$\rho_i = \sum_j m_j W_{ij}$$

$$\left. \frac{dv}{dt} \right|_{\text{sph}} \propto \sum_j \frac{P_i}{\rho_i^2} \nabla W_{ij}$$

Fixed artificial viscosity (Monaghan 1992)

$$\left. \frac{dv}{dt} \right|_{\text{visc}} \propto \alpha \sum_j \nabla W_{ij}$$

## SPH-ALE (Finite Mass)

Volume estimate from SPH

$$V_i = \frac{1}{\sum_j W_{ij}}$$

Primitive interface moves with the velocity  
of the contact discontinuity

Gradient-based slope-limiter

HLLC Riemann Solver

## ANARCHY-SPH

Variable artificial viscosity

$$\alpha \sim \dot{\nabla} \cdot \mathbf{v}$$

Artificial diffusion/conduction

$$\alpha_D \sim \nabla^2 u$$

$$\left. \frac{du}{dt} \right|_{\text{diff}} \propto \sum_j \alpha_{D,i} (u_i - u_j)$$

No Riemann solver!



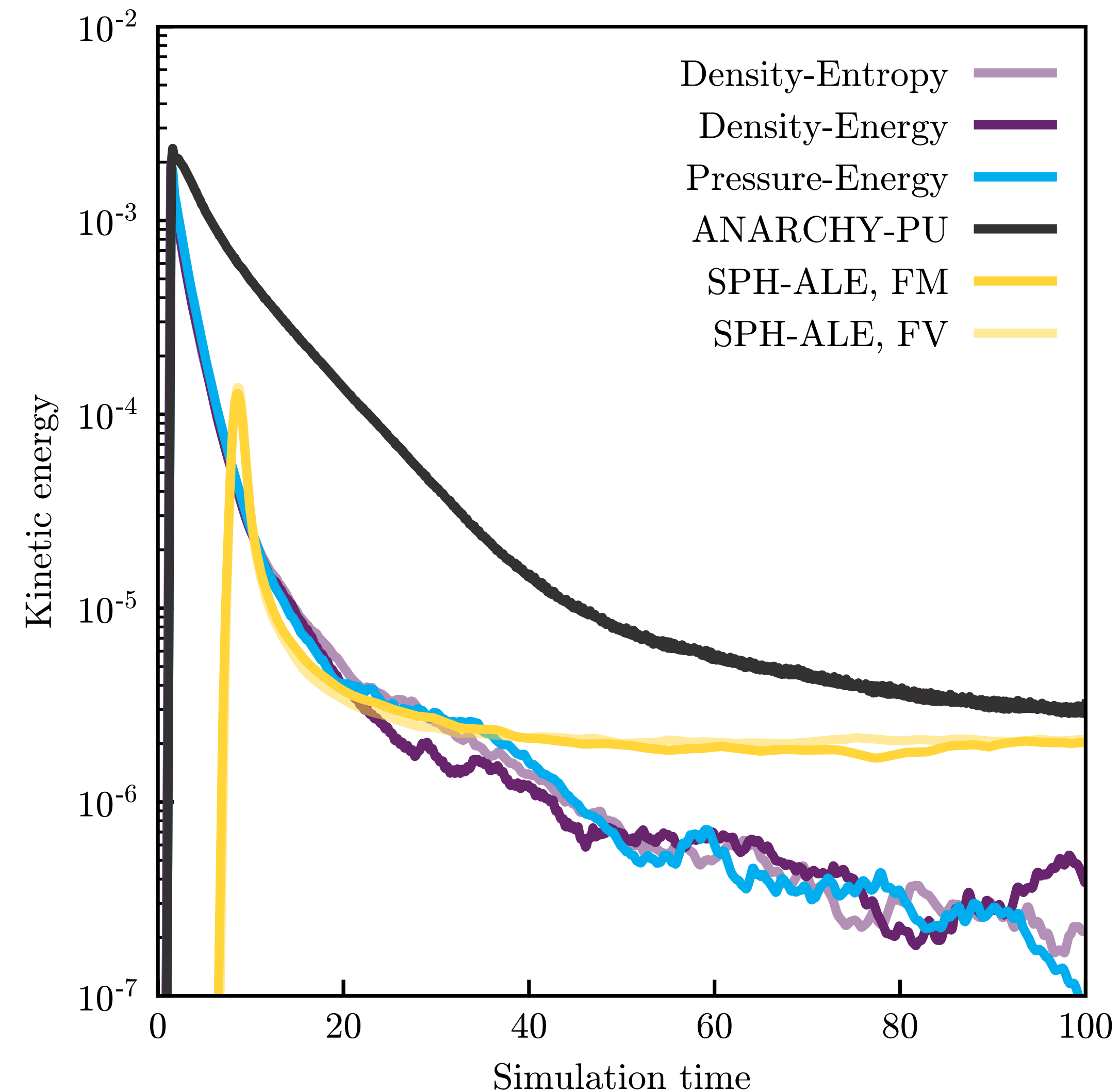
# How do you decide on a scheme?

- Selection of **hydrodynamics test problems that are relevant**
- Important to study these at the **relevant resolutions** to your problem (here we mean that to have a number of particles comparable to the number of particles in a Milky-Way galaxy)
- Lots of schemes are shown to converge at high resolution but we are **fundamentally in a low resolution regime.**
- Need to **fix everything else** - neighbour search, gravity, etc. - use **SWIFT!**



# Realistic ICs

- Generate **glass files**, instead of using perfect BCC ICs
- In a real simulation, this is the best feasible situation
- We then 'mess around' with particles, **changing their internal energies** and **removing/adding particles** as part of our **sub-grid** modelling.





# Sedov-Taylor Blastwave

- Very high mach shock;  $\mathcal{M} = 1000$
- Created by injection of energy into a handful of particles
- Relevance:
  - Shock handling
  - This is exactly how supernovae are implemented in our sub-grid model





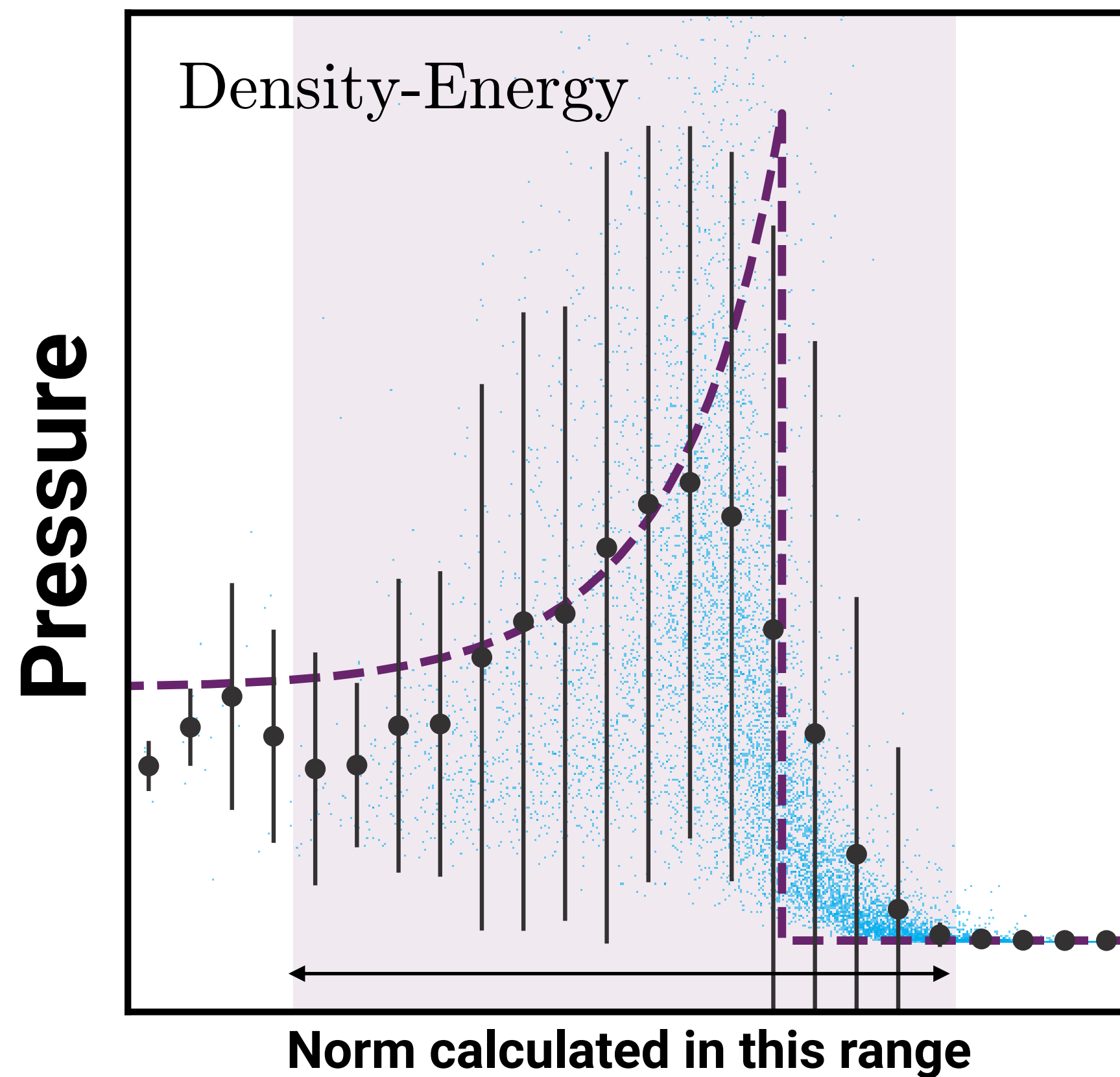
# Sedov-Taylor Blastwave

Monaghan 1992, Agertz+ 2007 for deficiencies

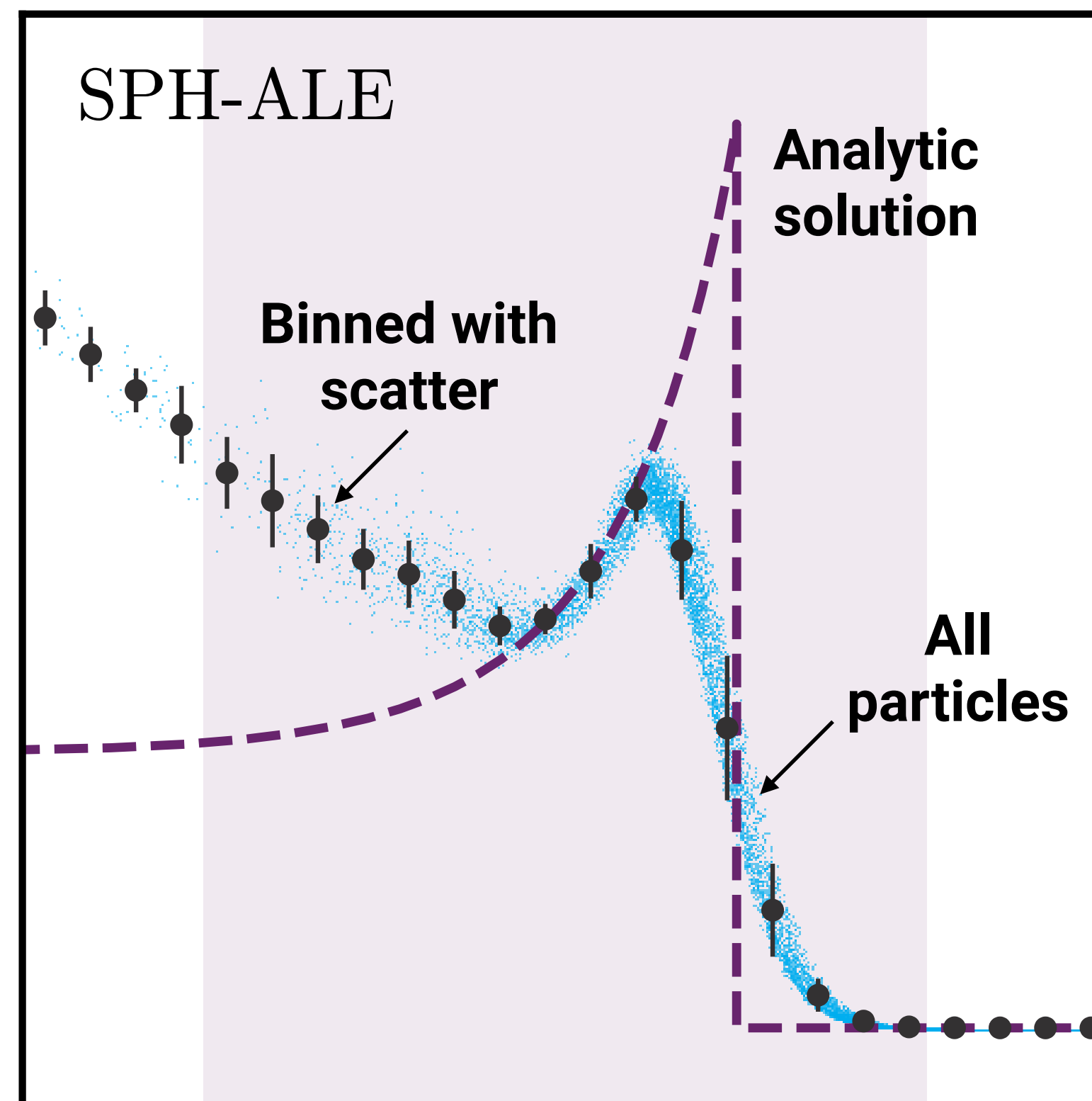
Moussa+ 1999, Villa+ 2012, Hopkins 2015

Agertz+ 2007, Price+ 2008, Hopkins 2013, Price+ 2018

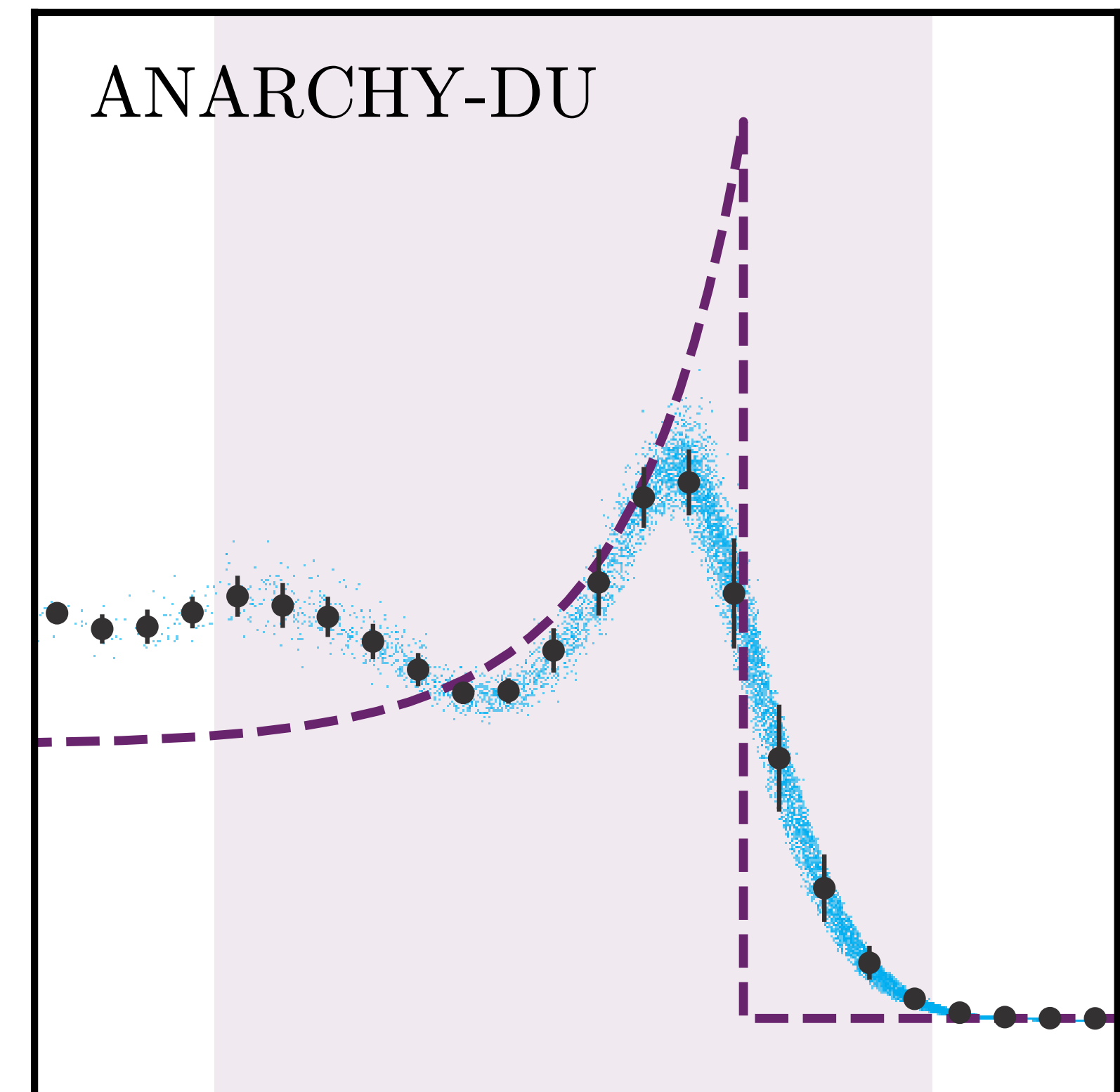
## Density-Energy SPH



## SPH-ALE (MFM)



## ANARCHY SPH

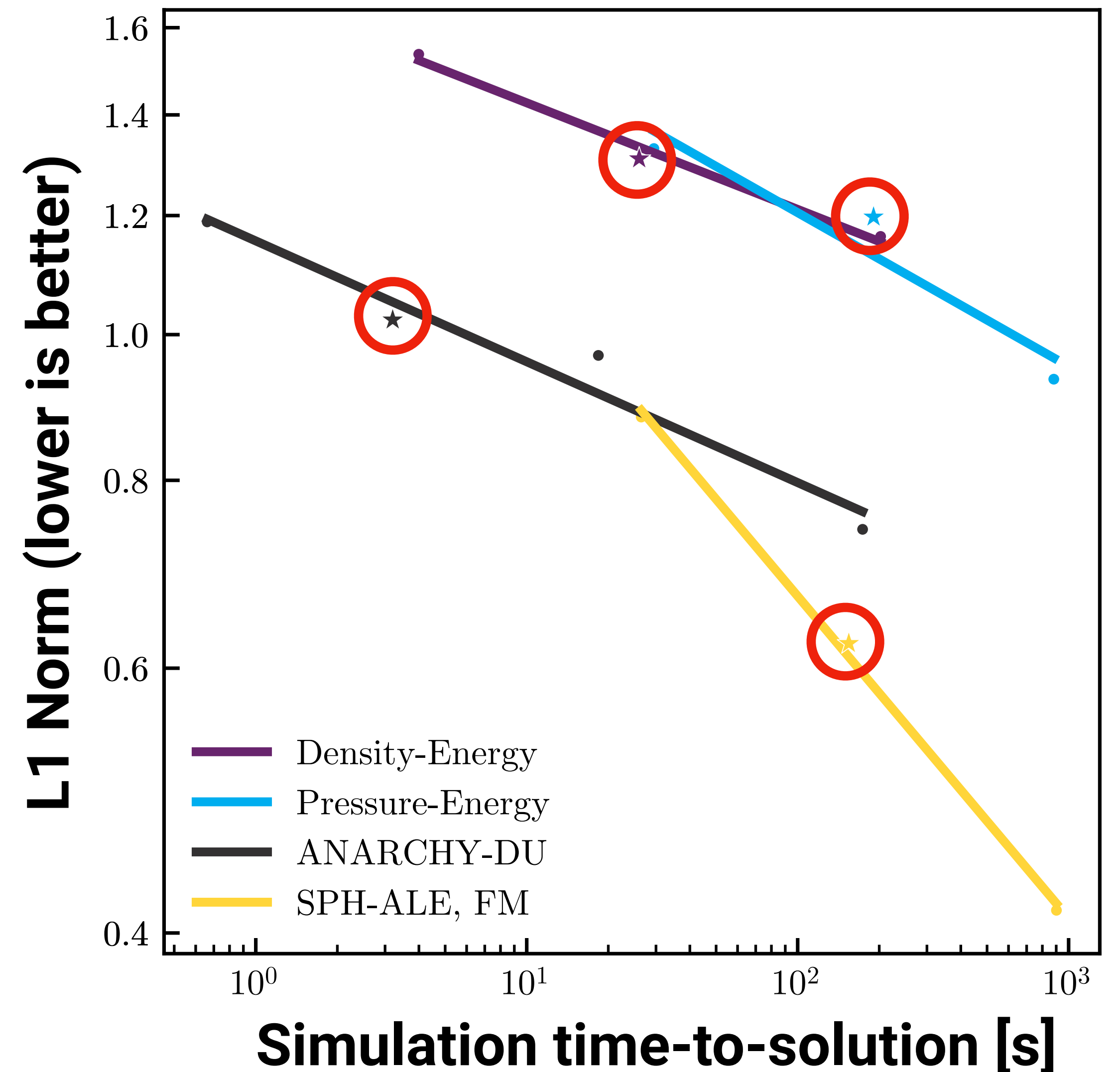


Radius from centre of blastwave



# Sedov-Taylor Blastwave

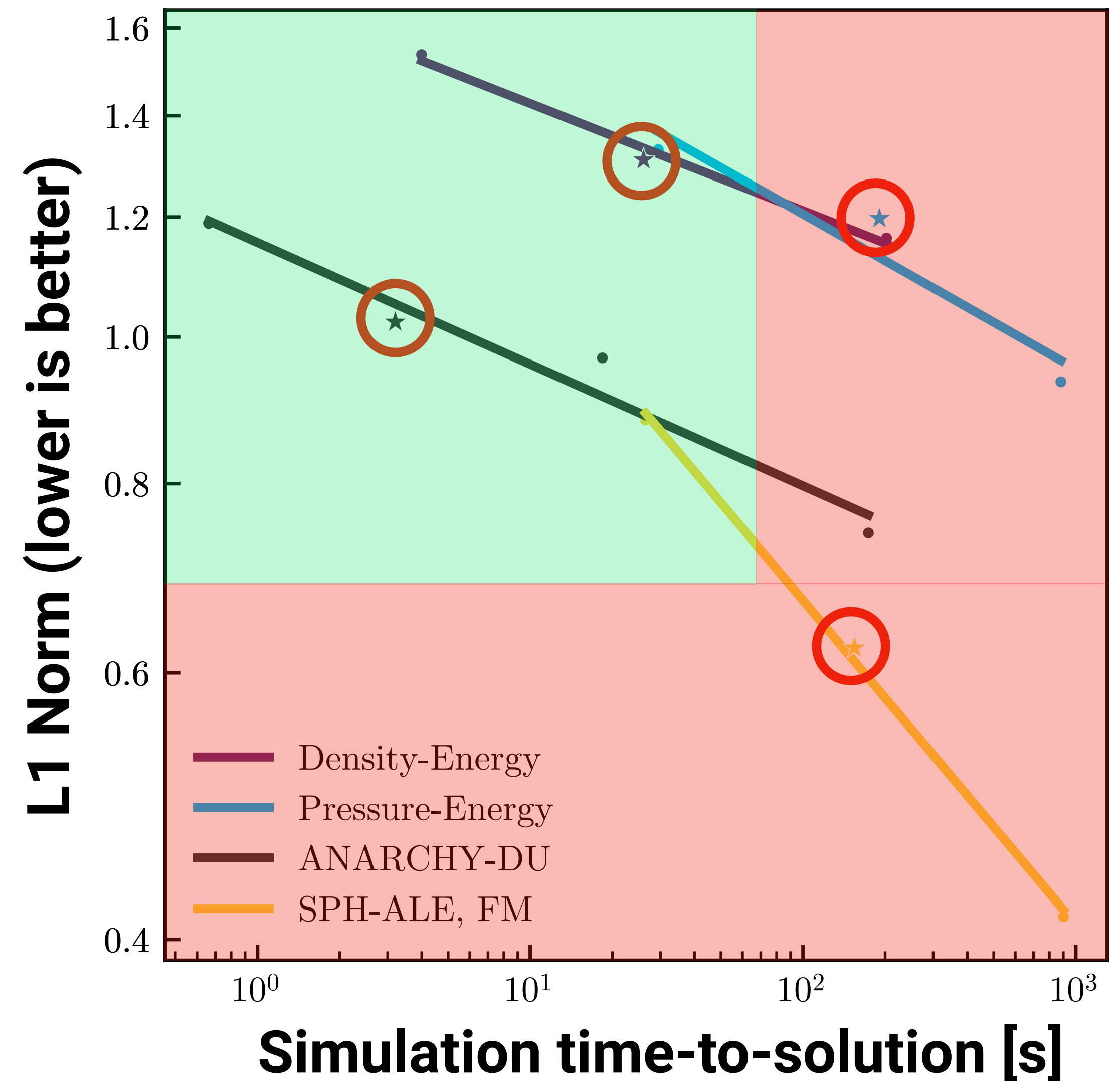
- **SPH-ALE** gives a **lower L1 norm** in this regime
- We see from the previous images, though, **that this doesn't necessarily mean a 'better' answer**
- Note how **traditional SPH** gives a **longer time-to-solution** on this problem; it takes **more steps**





# Sedov-Taylor Blastwave

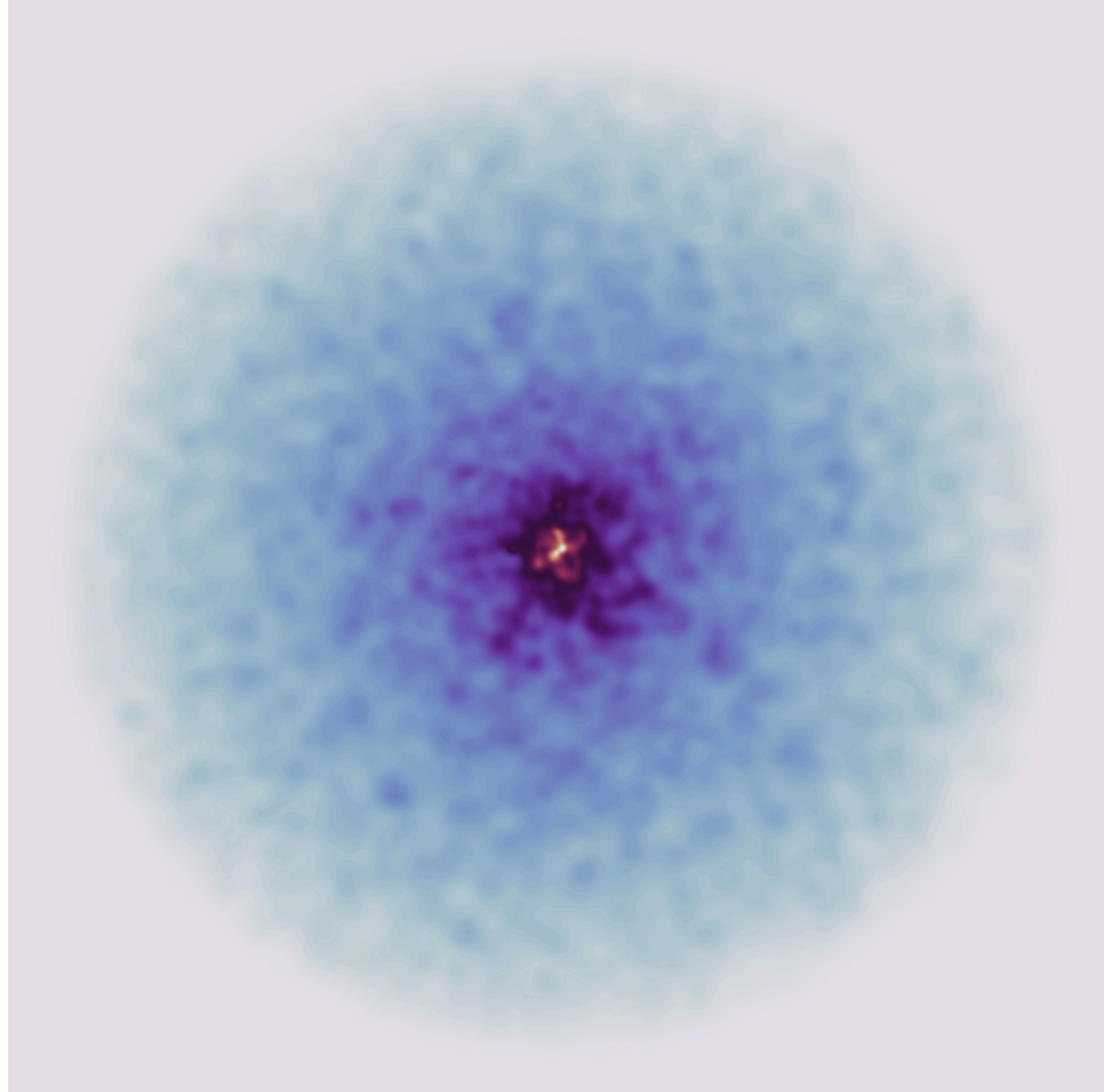
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# Evvard Collapse

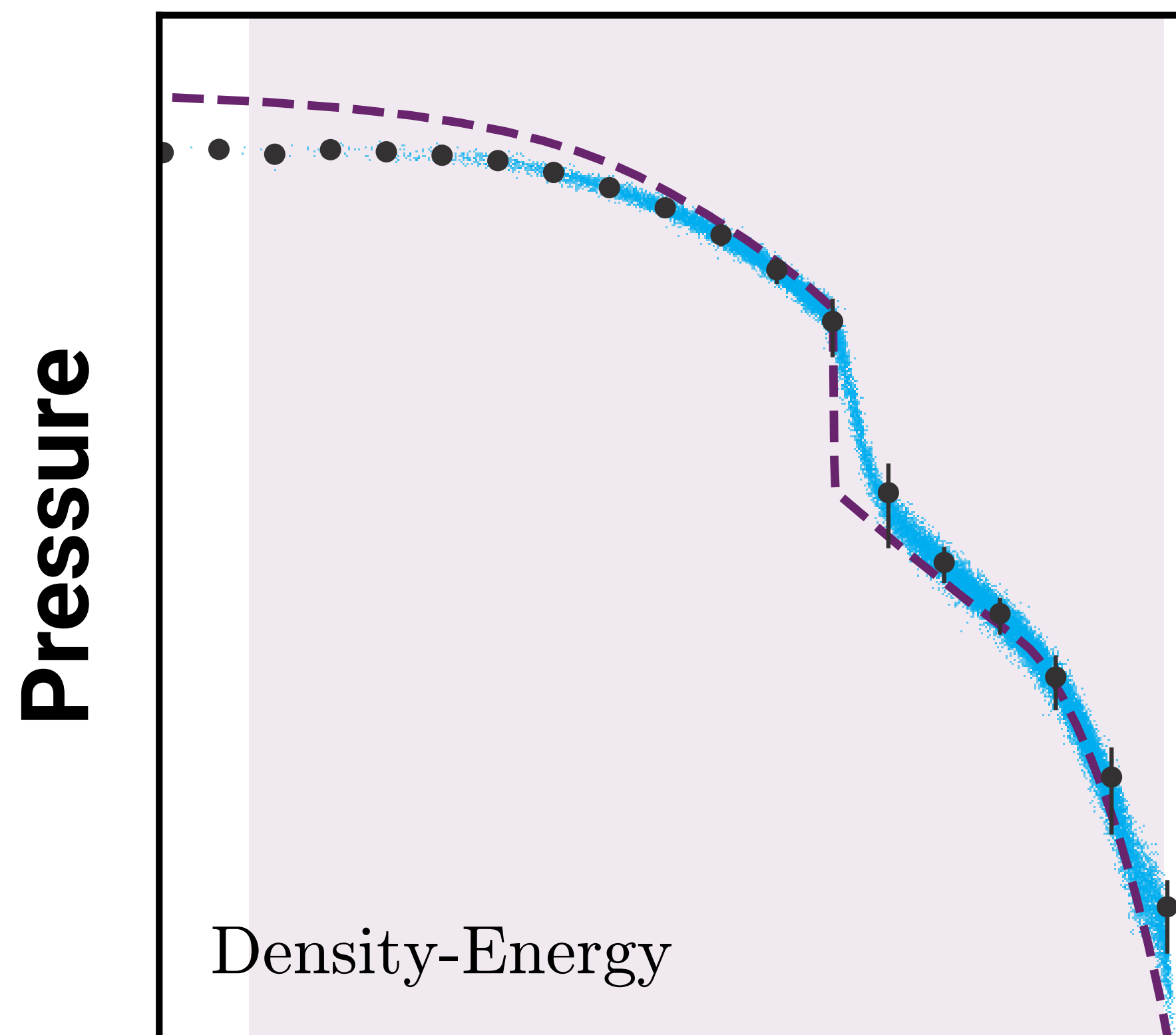
- **Self-gravitating** sphere of gas
- Shock that **propagates outwards**
- Eventually settles into an equilibrium state
- Relevance:
  - Shock handling
  - Coupling to gravity



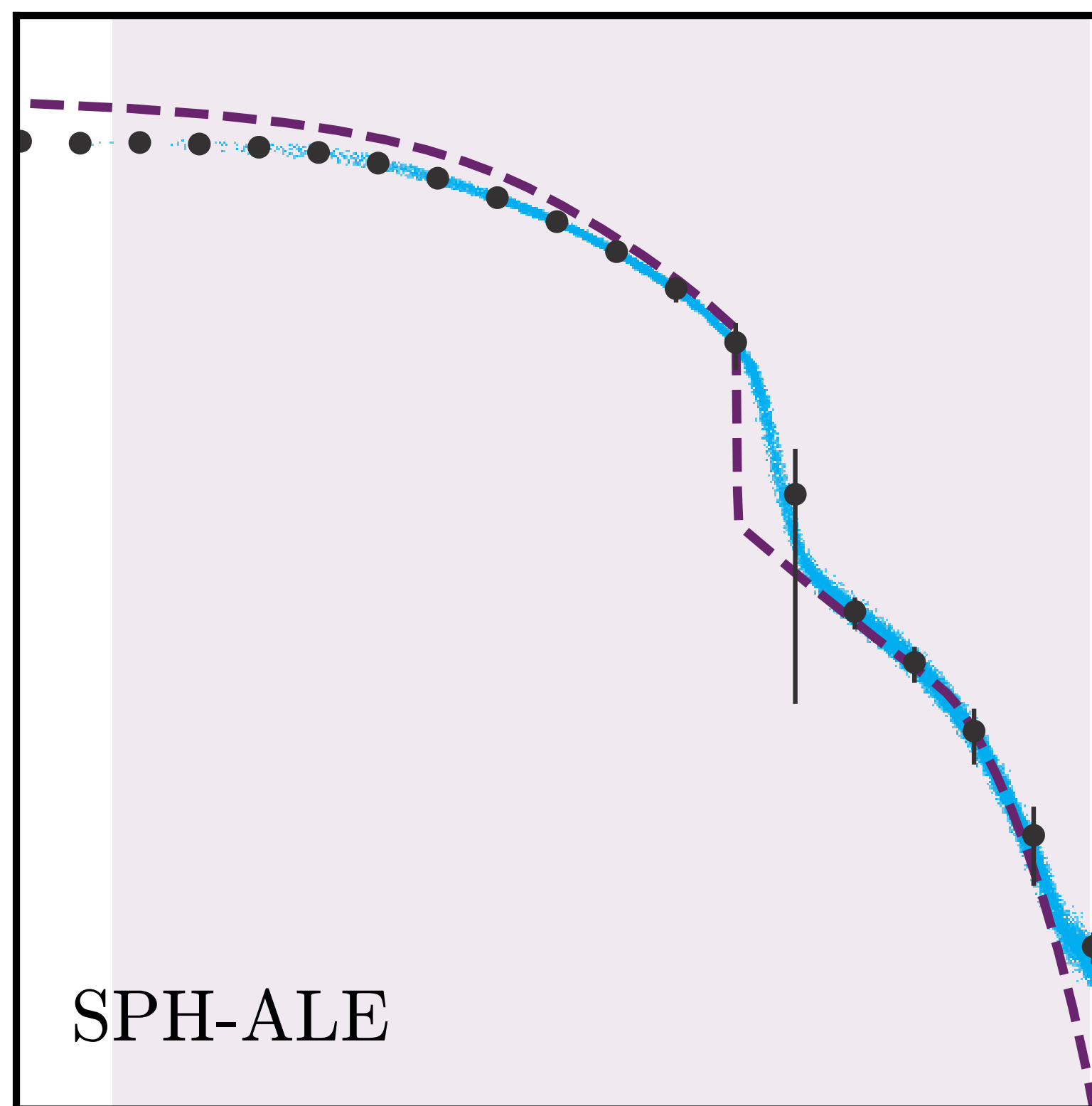


# Evvard Collapse

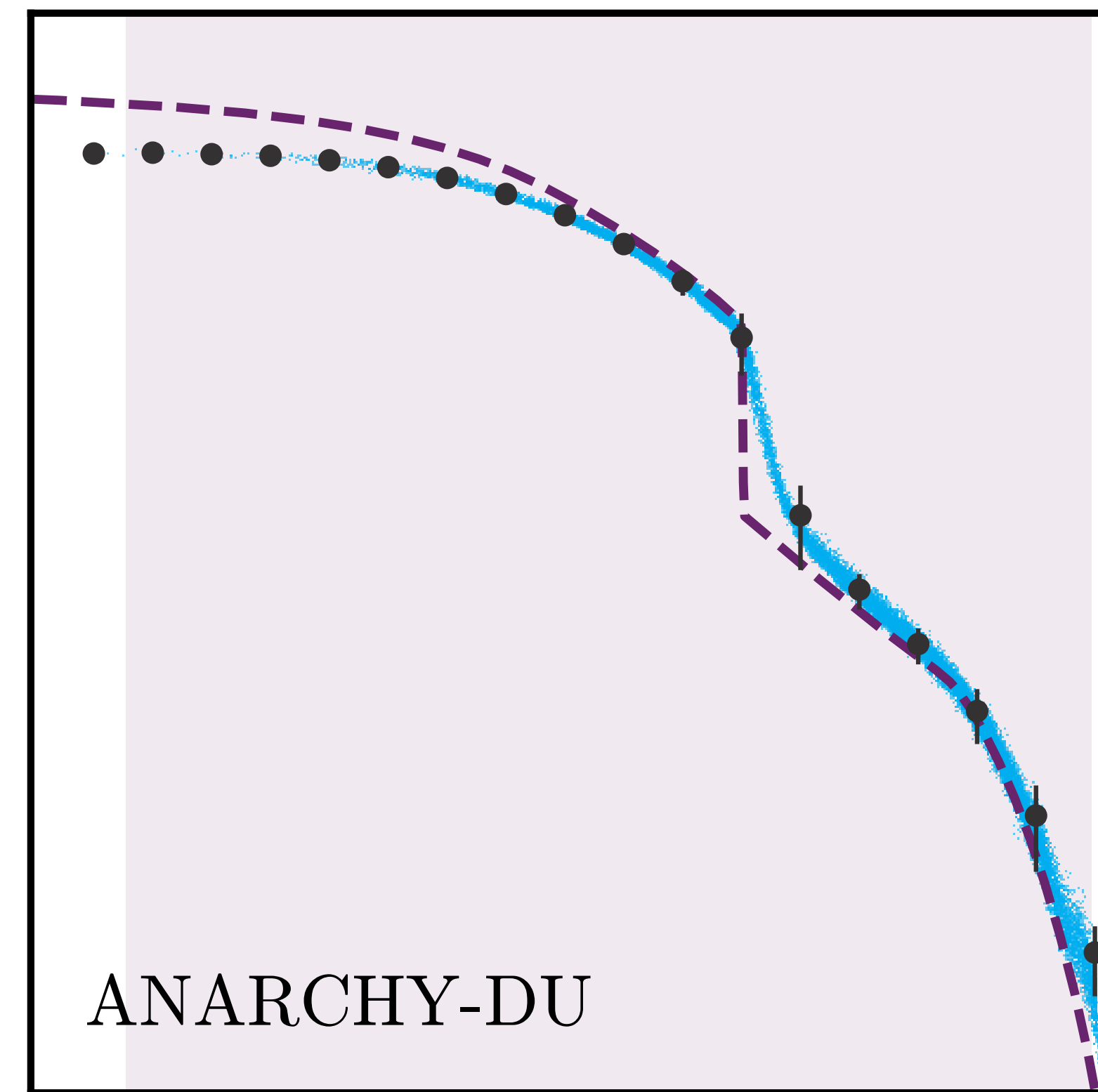
**Traditional SPH**



**GIZMO**



**Modern SPH**

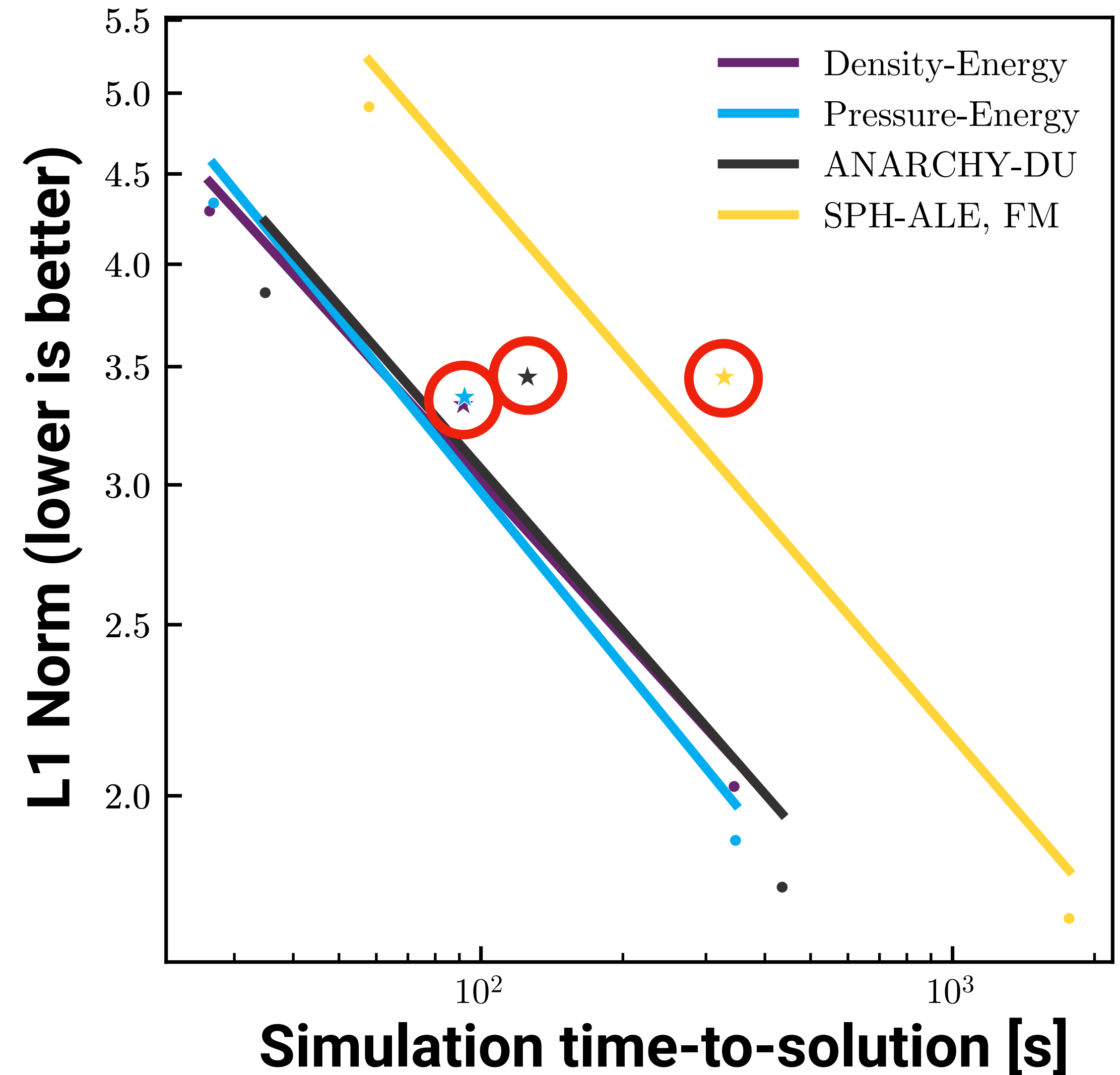


**Radius from centre of sphere**



# Evvard Collapse

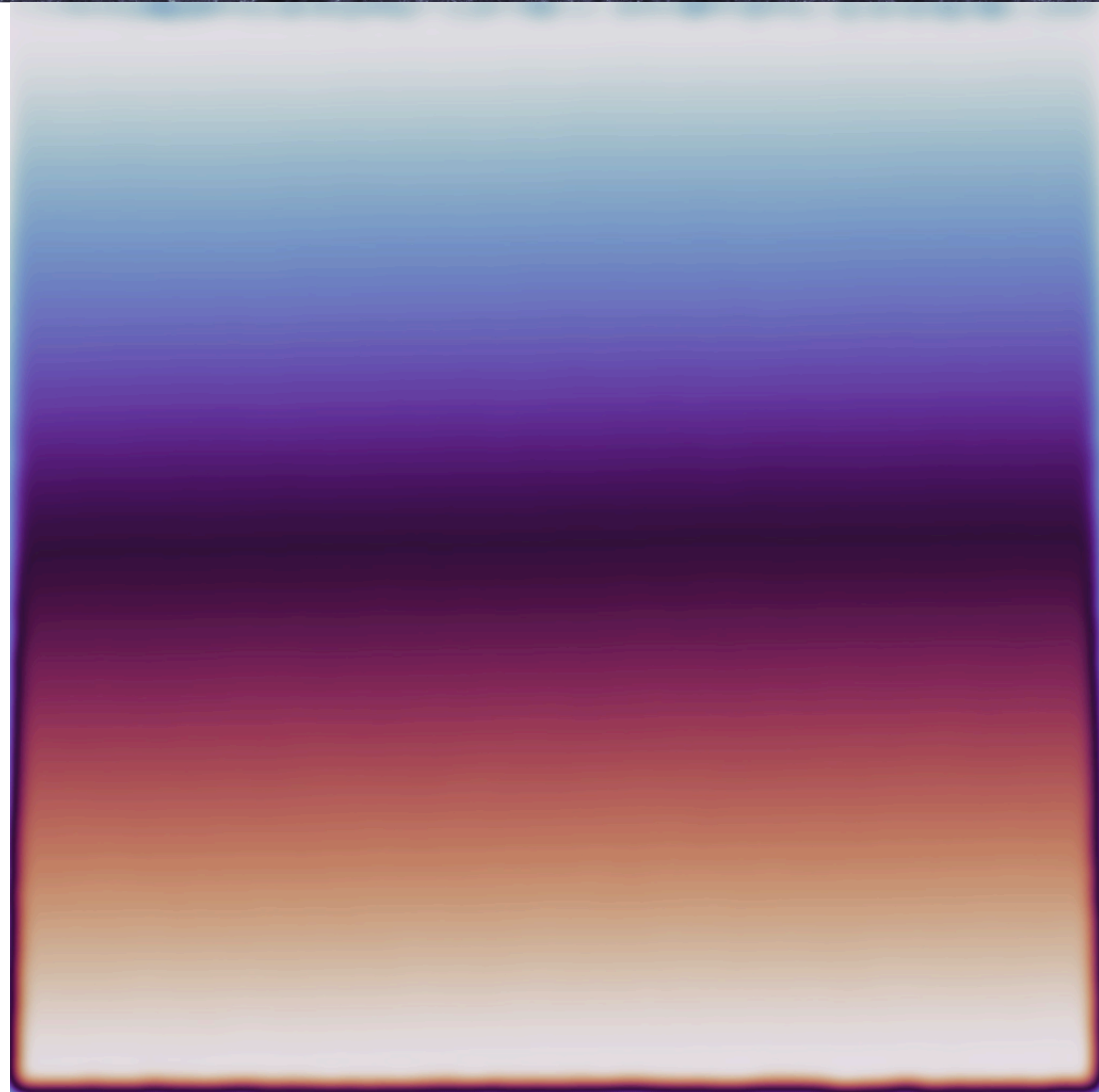
- All schemes give **approximately the same result** here
- Leads to **very similar norms** and convergence
- For the **same cost** as GIZMO, we can integrate **8x more particles** with SPH





# Gresho Vortex

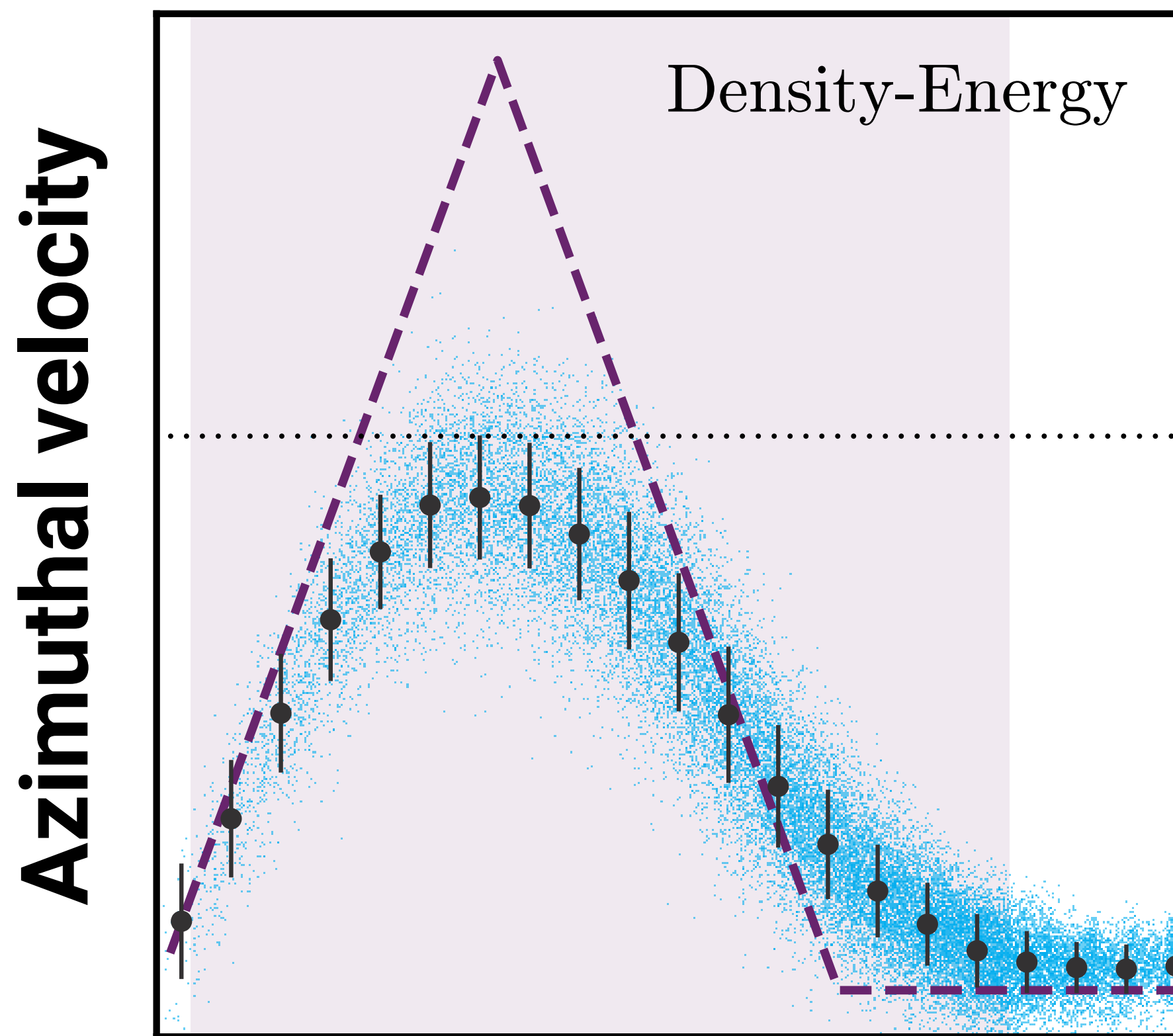
- Twirling vortex of gas
- Constant density everywhere
- Relevance:
  - Conservation of angular momentum
  - Numerical stability



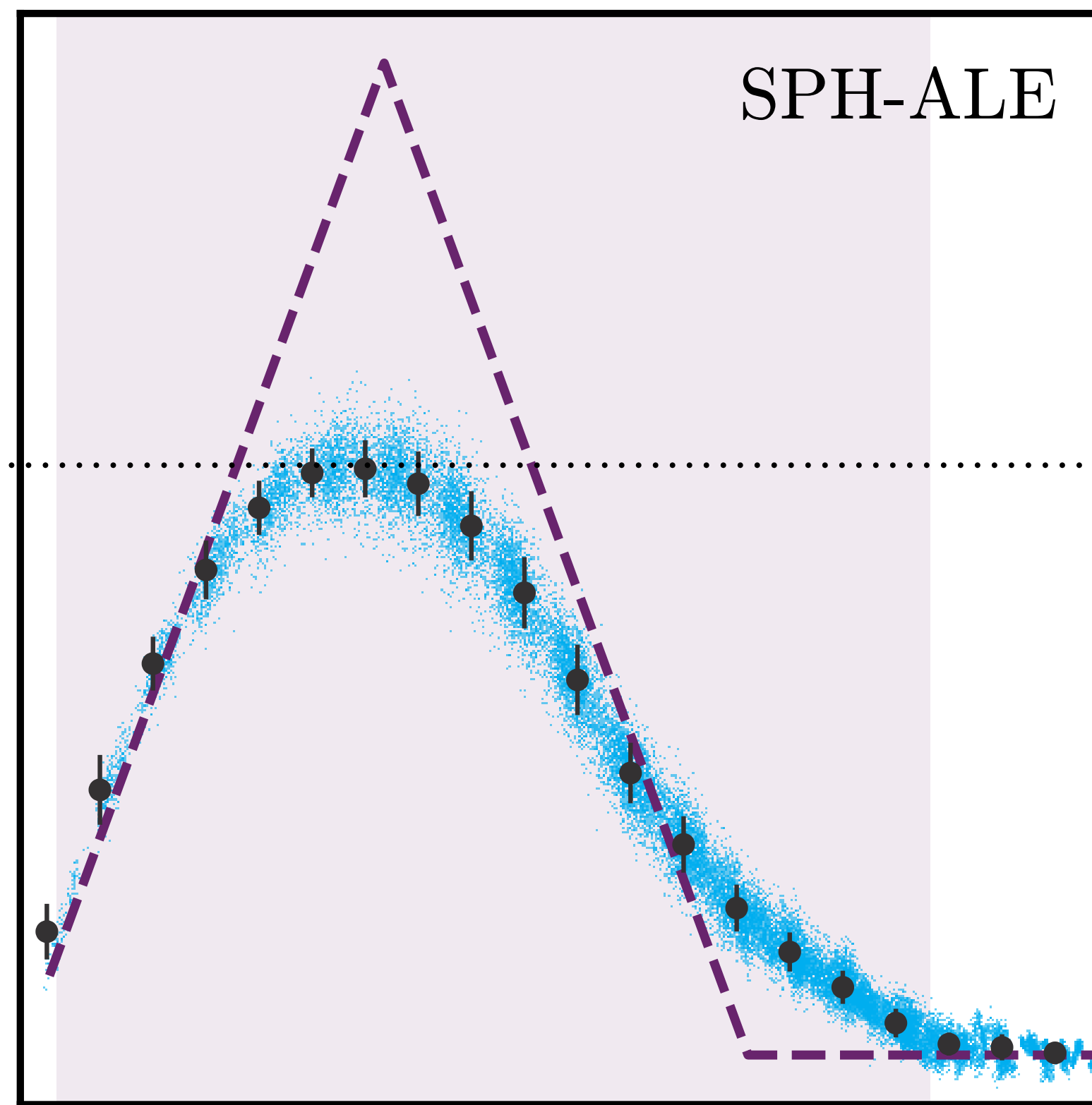


# Gresho Vortex

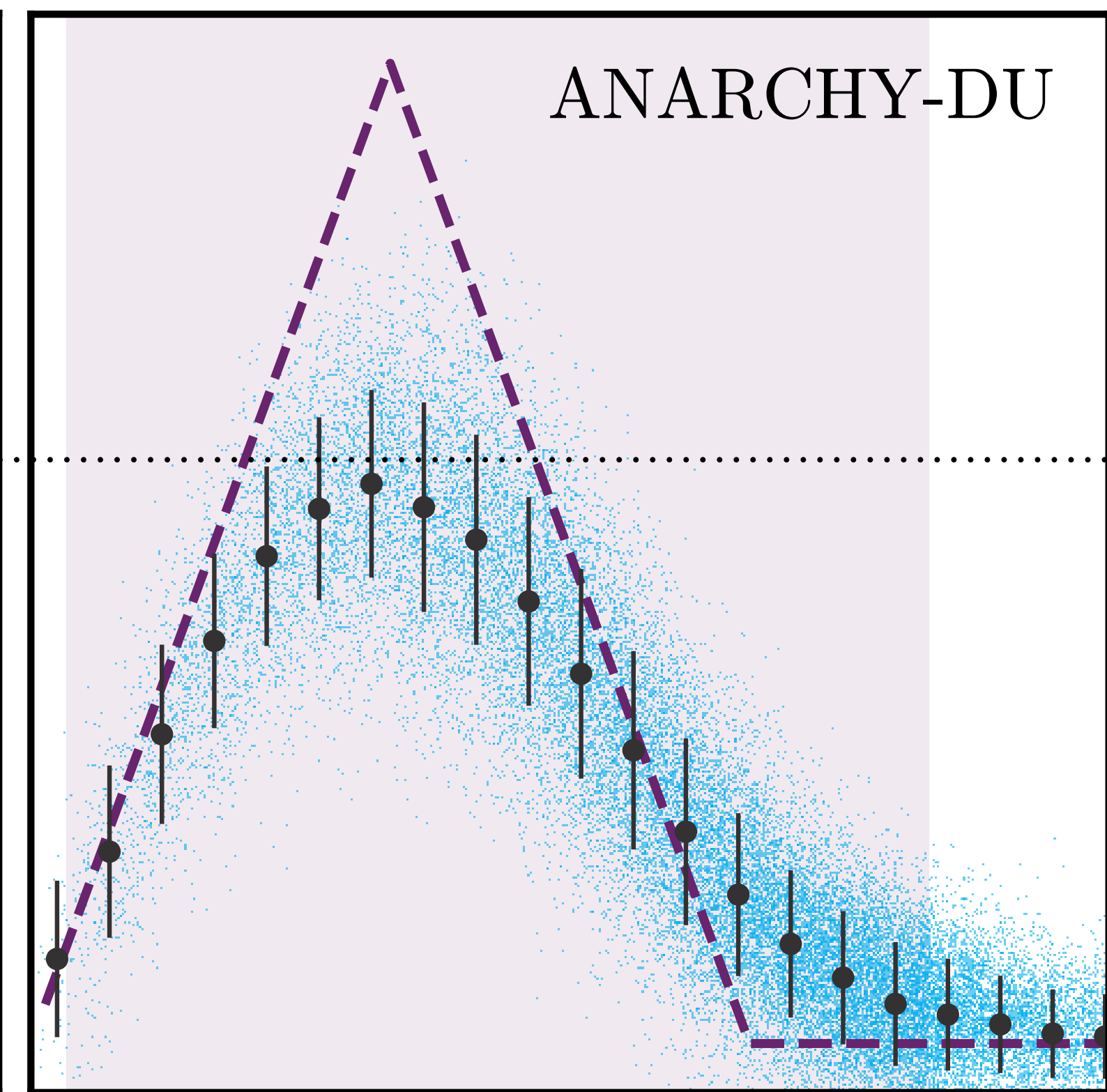
**Traditional SPH**



**GIZMO**



**Modern SPH**

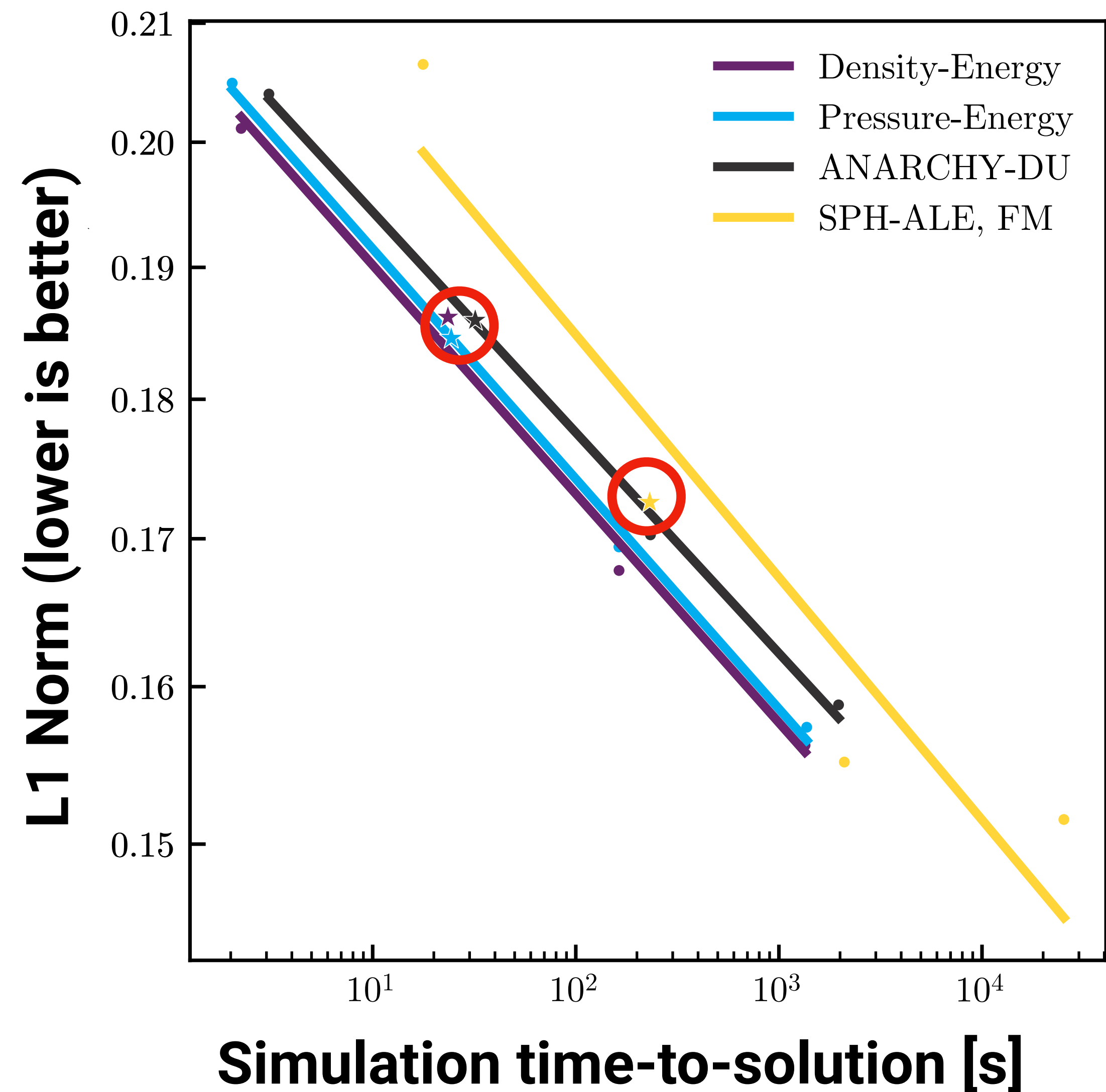


**Radius from centre of vortex**



# Gresho Vortex

- GIZMO performs extremely well here, but at **8x the cost** again!
- SPH is **never as stable** as GIZMO at late times; the vortex always collapses
- Realistic simulations are nowhere near this idealised case.

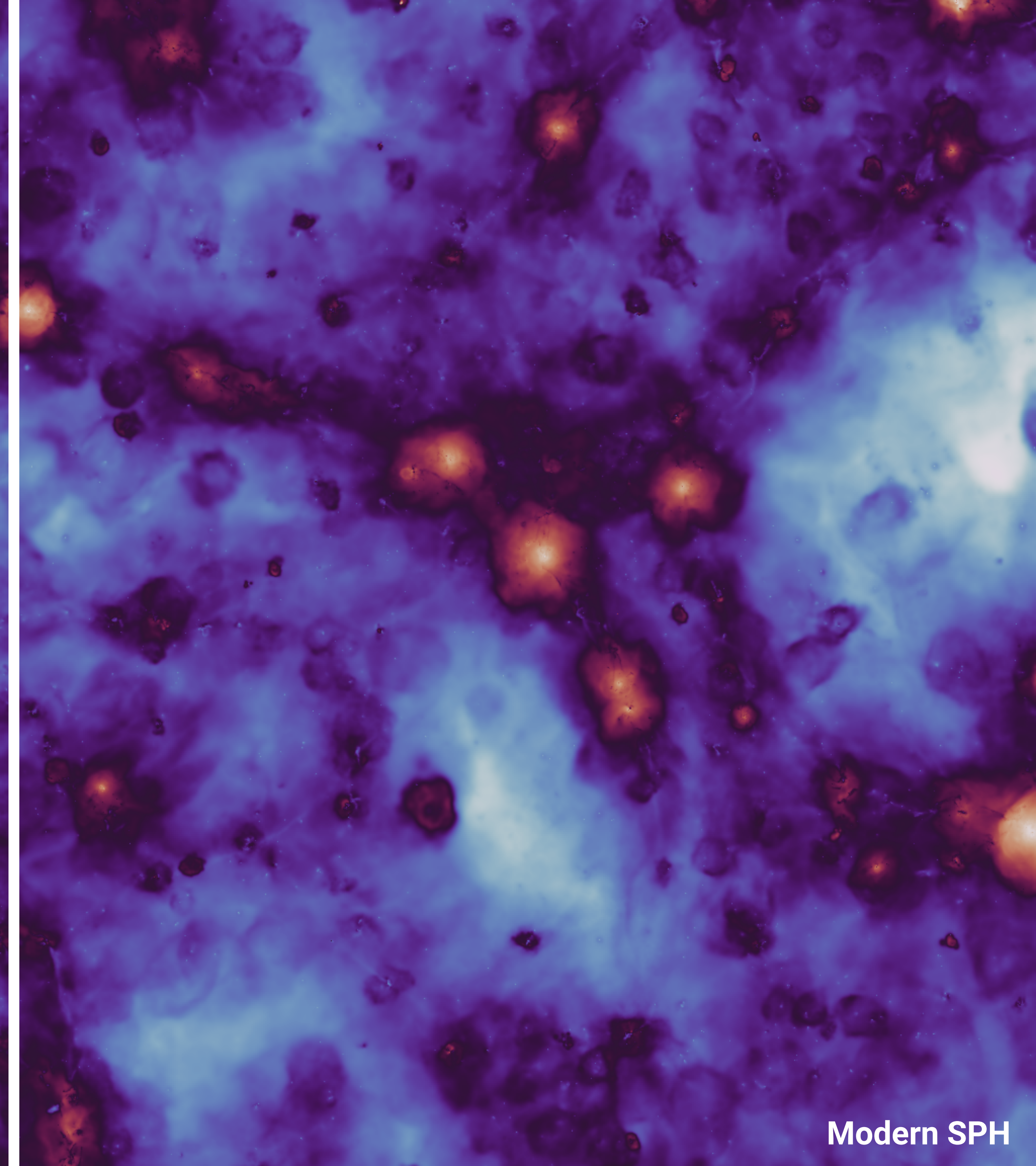
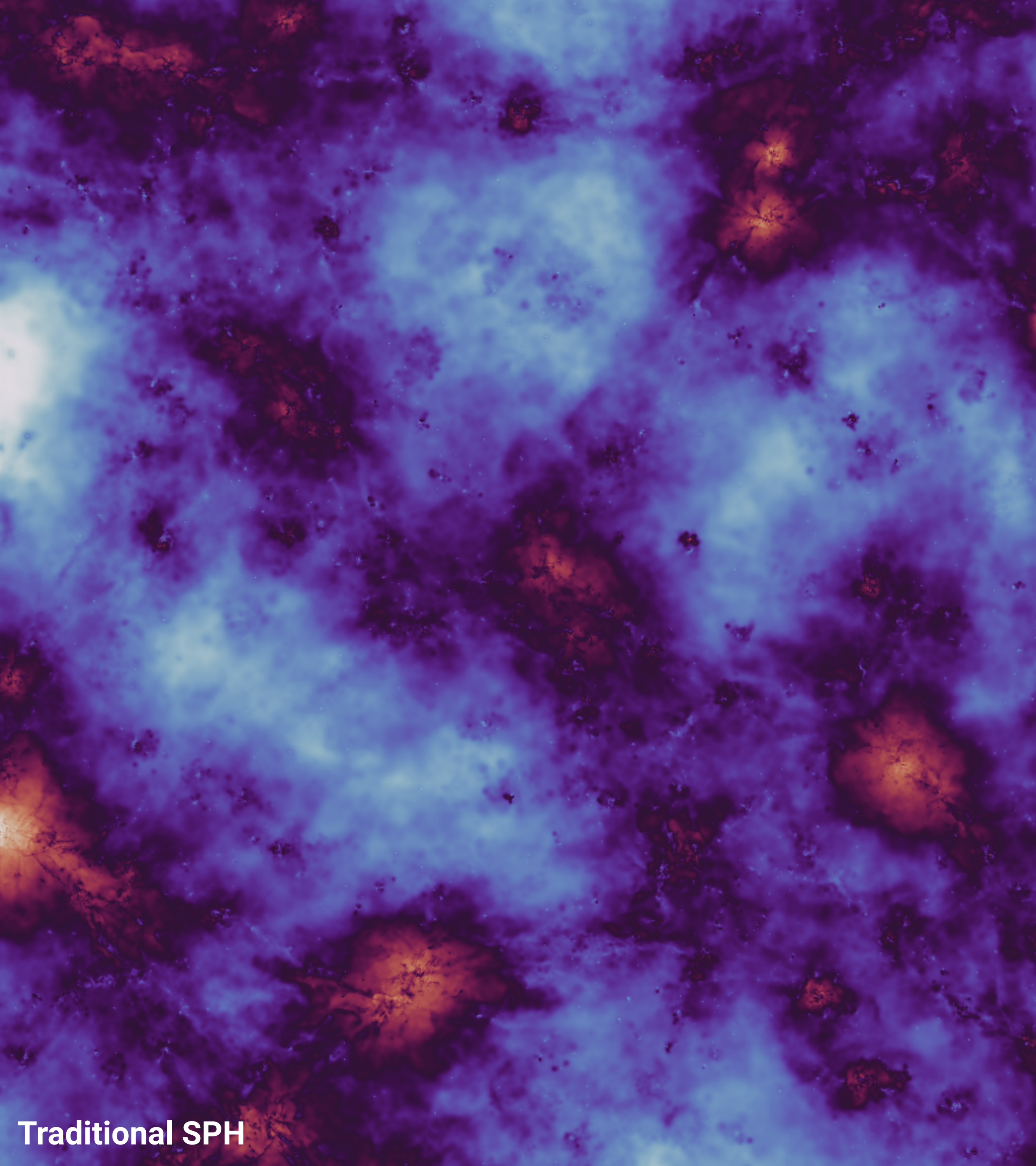




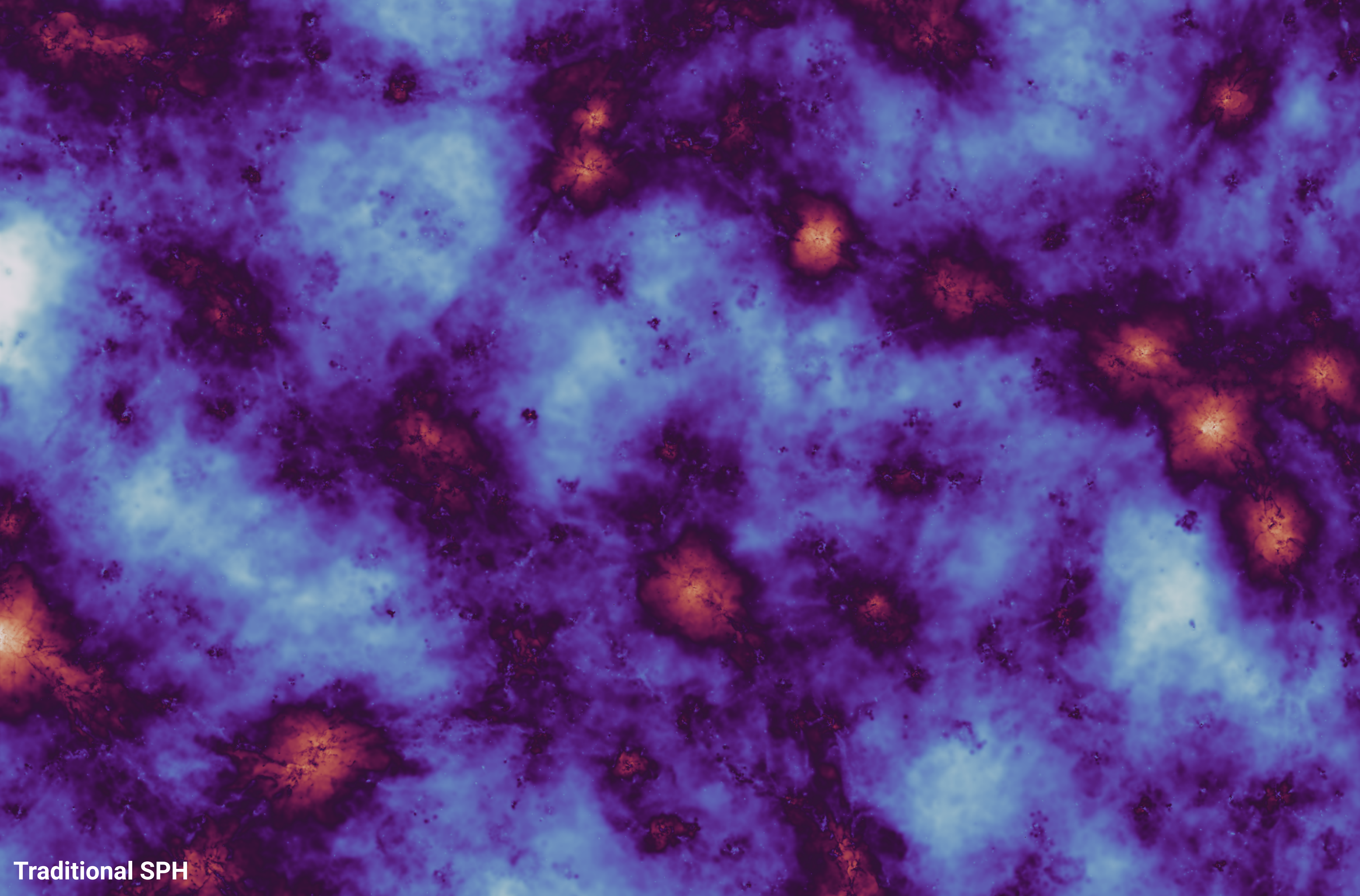
# Mini-Summary

- The major gains in the past ~12 years for **SPH** have allowed it to **perform similarly to SPH-ALE** at the **resolutions we run at**.
- This makes it a **great choice** for large-scale simulations like **EAGLE**
- What are these advancements?
  - Artificial viscosity (shock handling)
  - Numerical diffusion/conduction (energy transport)

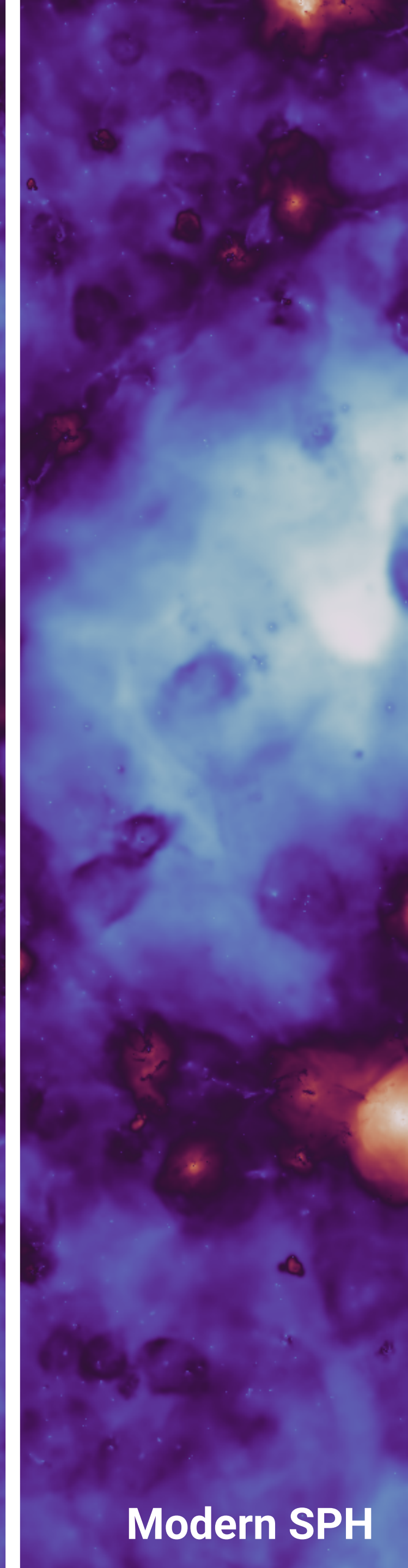






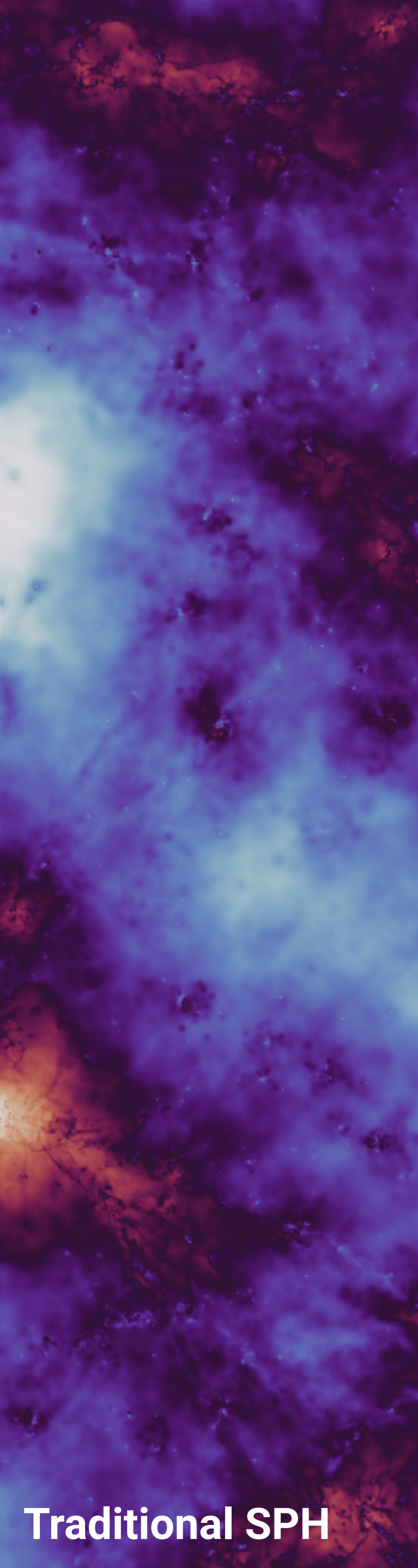


Traditional SPH

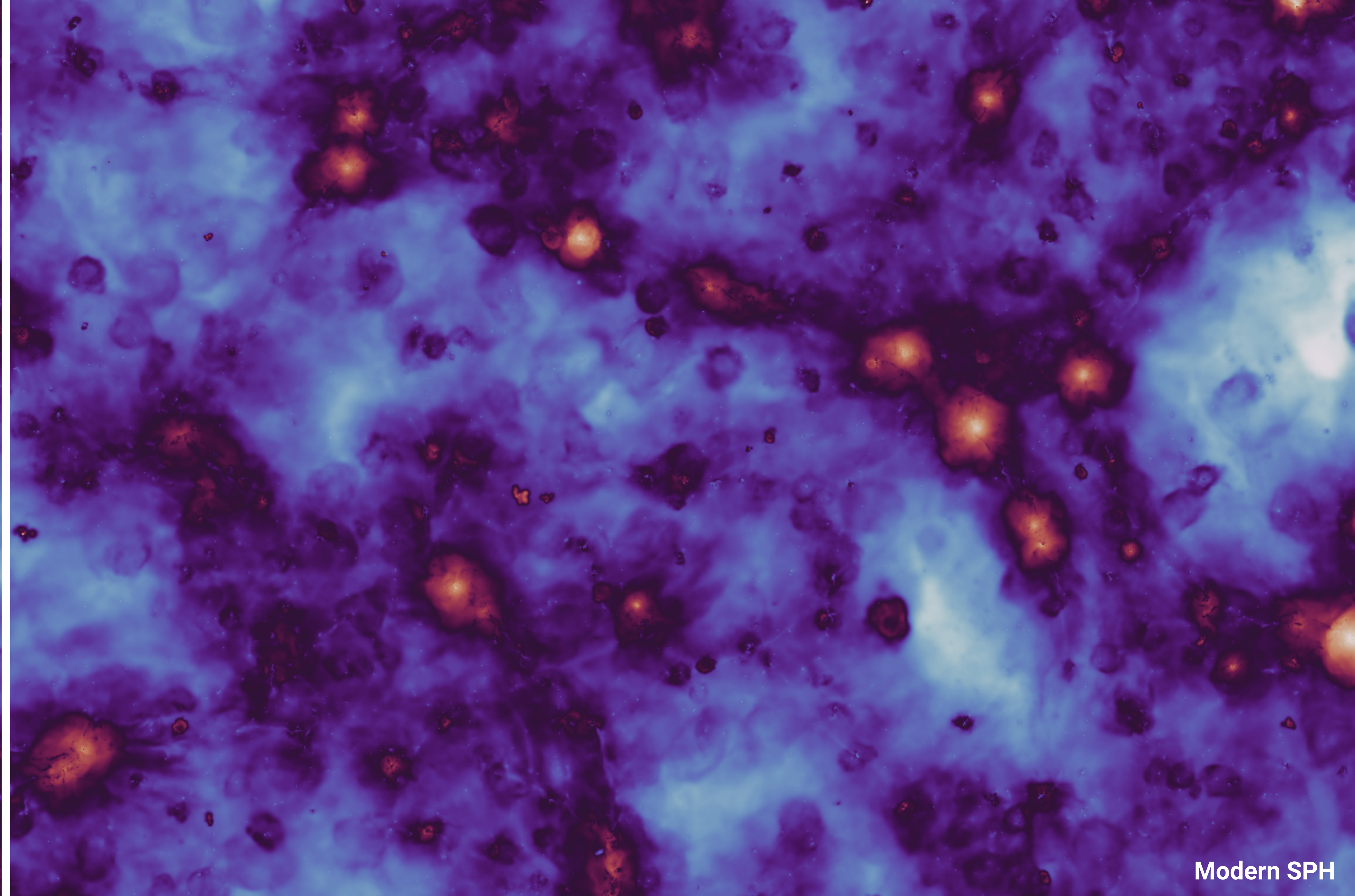


Modern SPH





Traditional SPH



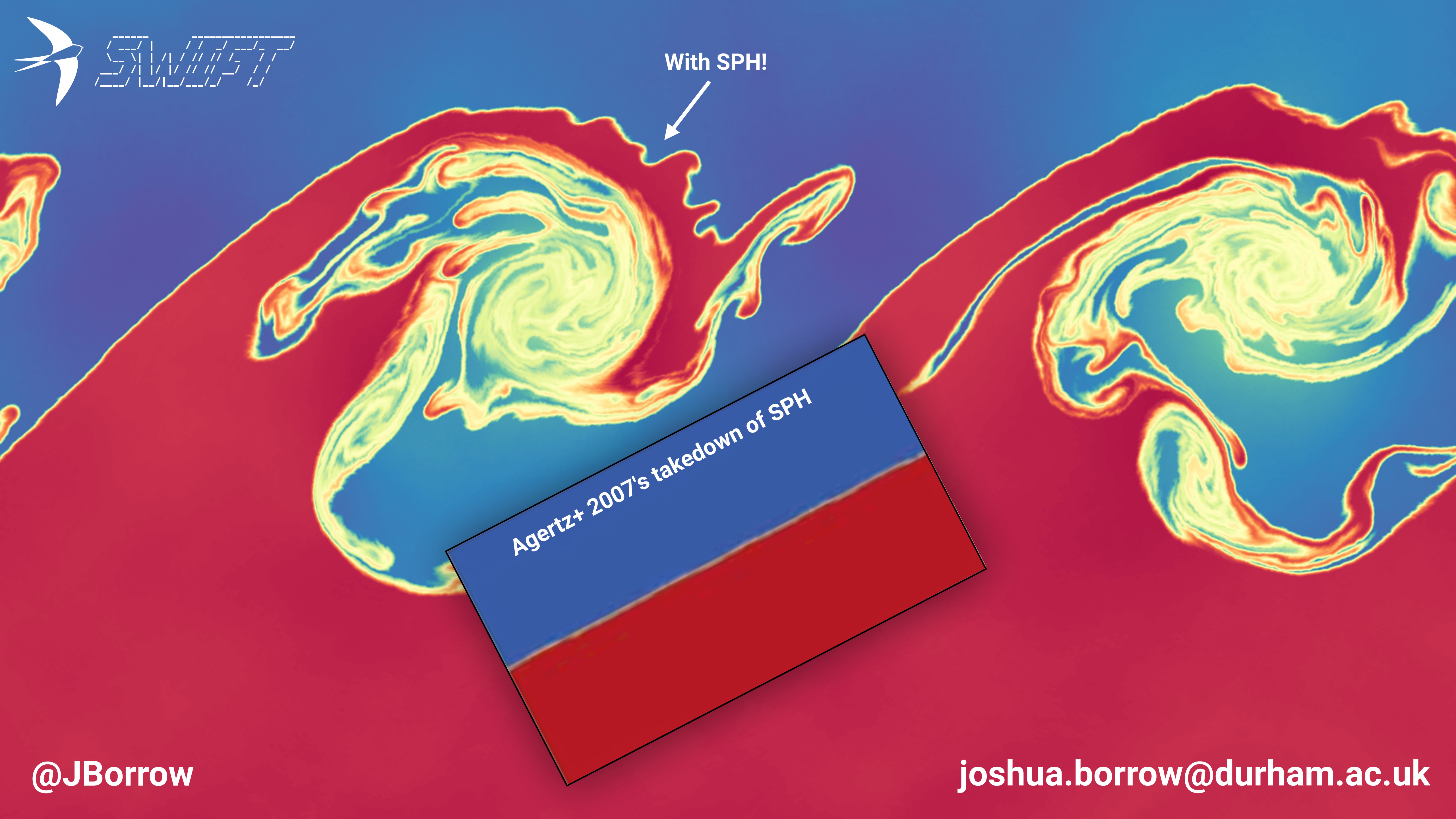
Modern SPH



# Conclusions

- 'Modern' SPH is still a useful alternative to SPH-ALE
- Our ANARCHY scheme **prevents excess diffusion** in the very **low resolution**, high mach number flows that we simulate
- Choosing the scheme to use is non-trivial and is very problem-dependent: **more complex may not be better!**
- SWIFT is publicly available and ready for general use





With SPH!

Agertz+ 2007's takedown of SPH