

Advanced Cosmological Simulations

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Enzo Workshop
北海道大学 – 19 Oct 2013

Outline

- We will consider additional physics in Thursday's AMR (no nested grids) cosmology simulation.
- Refresher on the hydro + N-body run performed on Thursday with an adiabatic equation of state.
- Adding radiative cooling and a ultraviolet background
- Adding star formation and feedback (only supernovae)
- Adding radiative feedback from stars

Hydrodynamics with an Adiabatic Equation of State

- On Thursday, everyone ran a 32^3 AMR simulation with hydrodynamics and N-body dynamics.
- Go to the run directory. For example
 - `cd ~/sapporo_cosmo/sapporo_cosmo_nbody`
- Let's analyze it.
 - Projections
 - Phase plots in density and temperature

Hydrodynamics with an Adiabatic Equation of State

- source ~/yt-x86_64/bin/activate
- We will be using the yt script, any1.py

```
ts = TimeSeriesData.from_filenames(fname)
for pf in ts.piter():
    test_pic_name = "pics/%s_Projection_x_%s_Density.png" % (pf, fields[0])
    if os.path.exists(test_pic_name): continue
    for dim in 'xyz':
        p = ProjectionPlot(pf, dim, fields, weight_field="Density", center=[0.5]*3)
        for f in fields:
            if f in zlim.keys():
                p.set_zlim(f, zlim[f][0], zlim[f][1])
            if f in cmap.keys():
                p.set_cmap(f, cmap[f])
        p.annotate_text((1.1, 1.08), 'z = %.2f' % pf.current_redshift,
                        text_args={'ha': 'right', 'va': 'top'})
        p.save("pics/%s" % pf)
        del p
    pc = PlotCollection(pf)
    ad = pf.h.all_data()
```

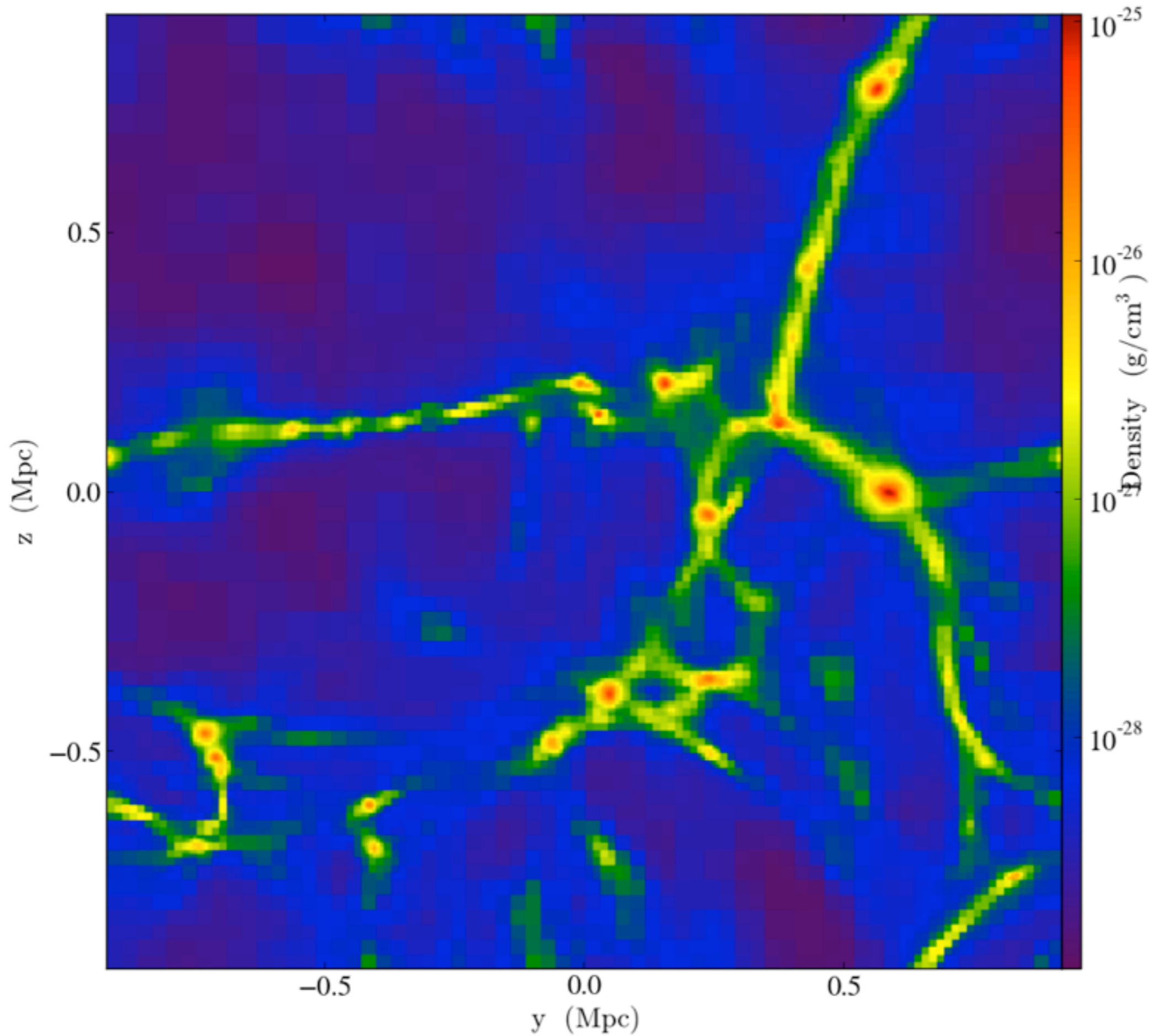

Hydrodynamics with an Adiabatic Equation of State

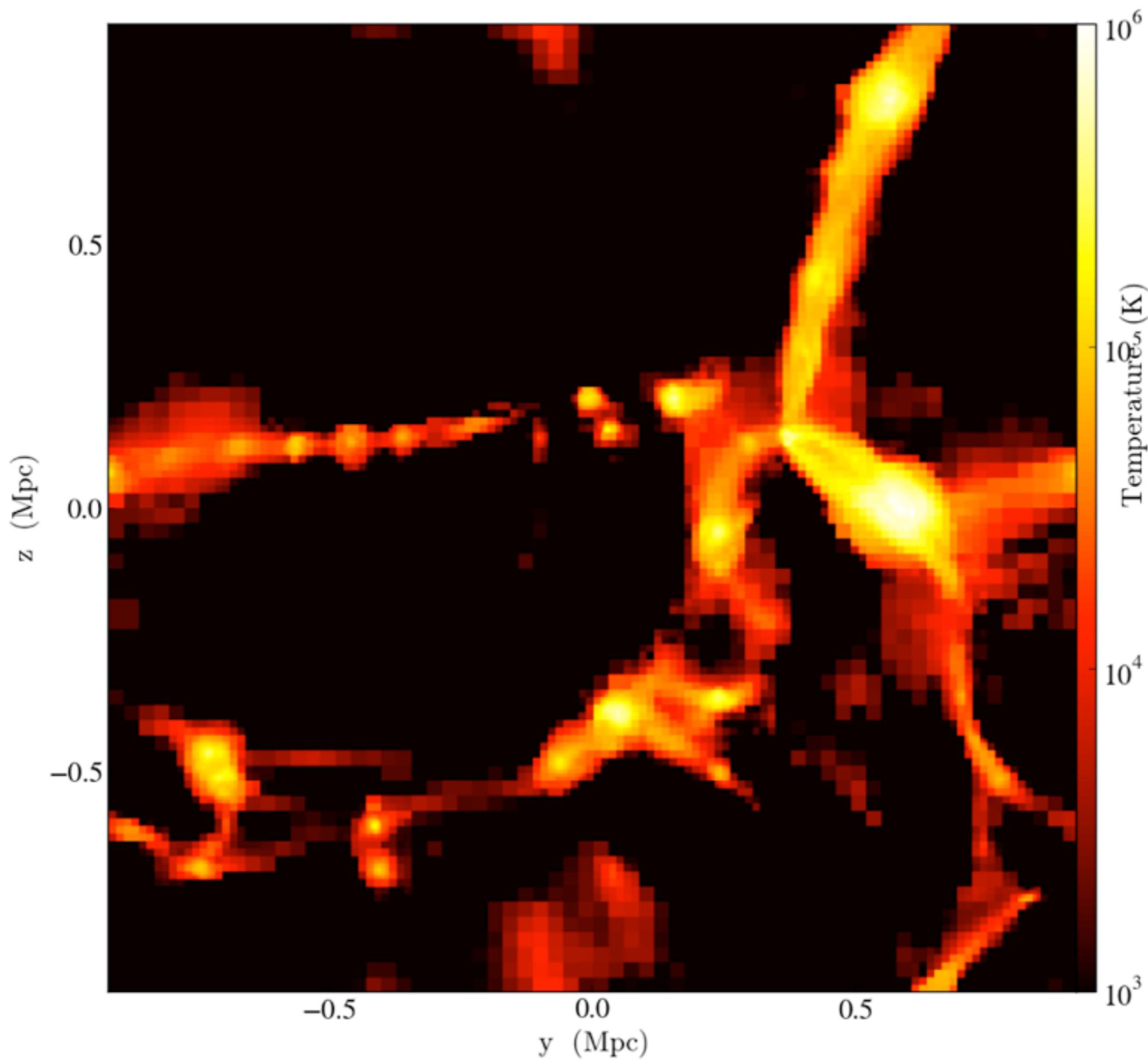
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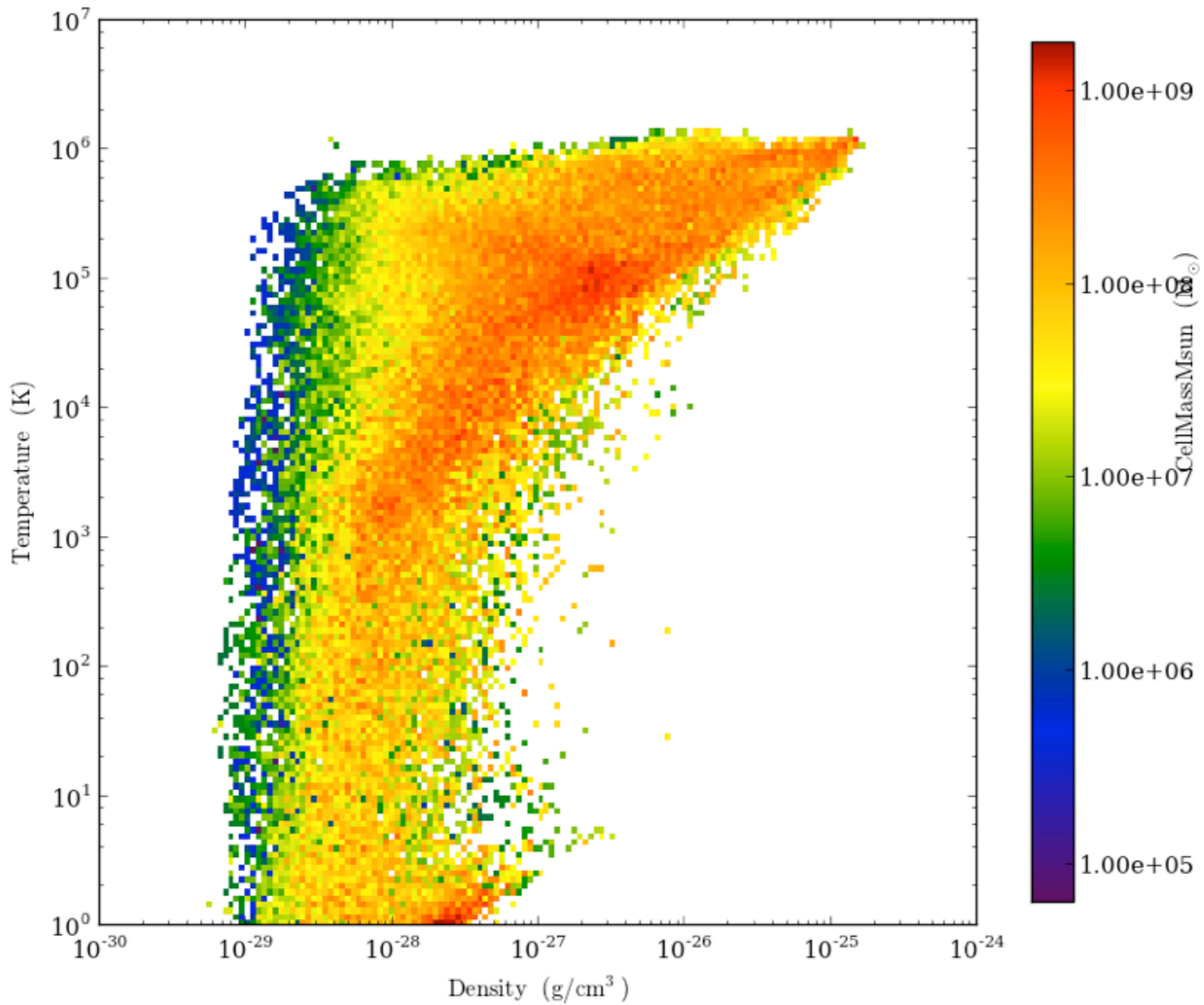
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        p.save("pics/%s" % pf)
        del p
    pc = PlotCollection(pf)
    ad = pf.h.all_data()
    pc.add_phase_object(ad, ['Density', 'Temperature', 'CellMassMsun'], weight=None)
    pc.save("pics/%s" % pf)
    del pc
    pf.h.clear_all_data()
```

Hydrodynamics with an Adiabatic Equation of State

- Run the yt script for the last dataset. For example,
 - `python ../any1.py DD0049/DD0049`
- Creates the projections and phase plots and places them in `pics/`
- Note: I have written the script so that if **no argument is given**, all datasets are analyzed.
 - `python ../any1.py`







Radiative Cooling and Ultraviolet Background

- Now we can add more physics to the adiabatic simulation.
 ~`guest009/cooling/cooling.enzo`
- Add radiative cooling and non-equilibrium chemistry.

```
RadiativeCooling = 1
MultiSpecies     = 1
```

- Add optically-thin ultraviolet background

```
#
# UV background parameters
#
RadiationFieldType = 15 // 0 = None, 15 = Haardt-Madau 2012
```

```
RadiationRedshiftOn      = 7.000000
RadiationRedshiftOff     = 0.000000
RadiationRedshiftFullOn  = 6.000000
```

Cosmology Simulations

```
RadiationFieldRedshift = 0.000000
```

Non-cosmology Simulations

Different Ultraviolet Backgrounds

Radiation Parameters

Background Radiation Parameters

`RadiationFieldType` (external)

This integer parameter specifies the type of radiation field that is to be used. Except for `RadiationFieldType` = 9, which should be used with `MultiSpecies` = 2, UV backgrounds can currently only be used with `MultiSpecies` = 1 (i.e. no molecular H support). The following values are used. Default: 0

- 1 - Haardt & Madau spectrum with `q_alpha` = 1.5
- 2 - Haardt & Madau spectrum with `q_alpha` = 1.8
- 3 - Modified Haardt & Madau spectrum to match observations (Kirkman & Tytler 2005).
- 4 - Haardt & Madau spectrum with `q_alpha` = 1.5 supplemented with an X-ray Compton heating background from Madau & Efstathiou (see astro-ph/9902080)
- 9 - Constant molecular H₂ photo-dissociation rate
- 10 - Internally computed radiation field using the algorithm of Cen & Ostriker
- 11 - Same as previous, but with very, very simple optical shielding fudge
- 12 - Haardt & Madau spectrum with `q_alpha` = 1.57
- 15 - Haardt & Madau 2012. See Table 3 in '2012ApJ...746..125H <<http://adsabs.harvard.edu/abs/2012ApJ...746..125H>

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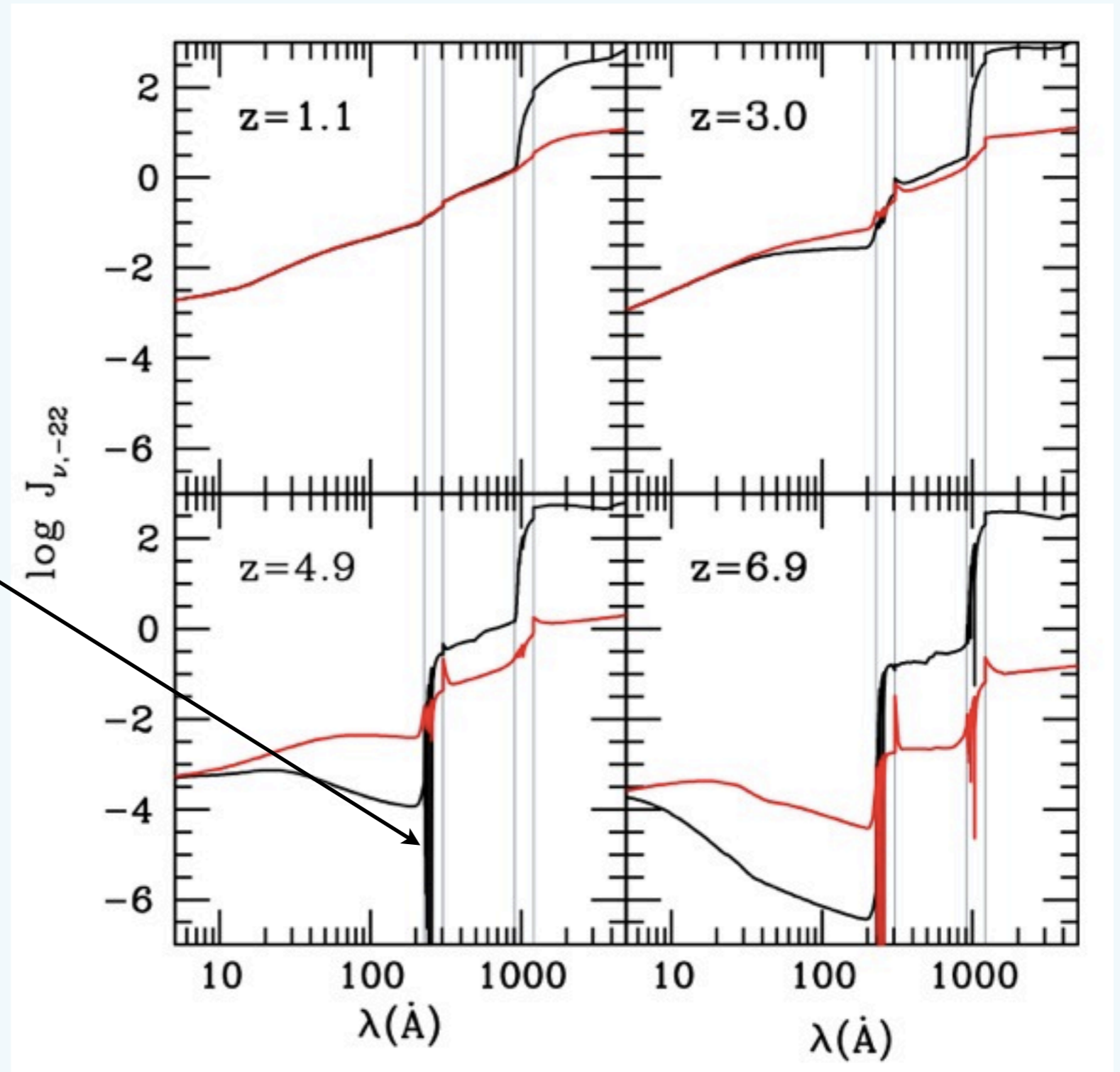
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Ultraviolet Background (Haardt & Madau 2012)

QSO only

QSO + Galaxies

Includes Lyman series lines



Ultraviolet Background (Haardt & Madau 2012)

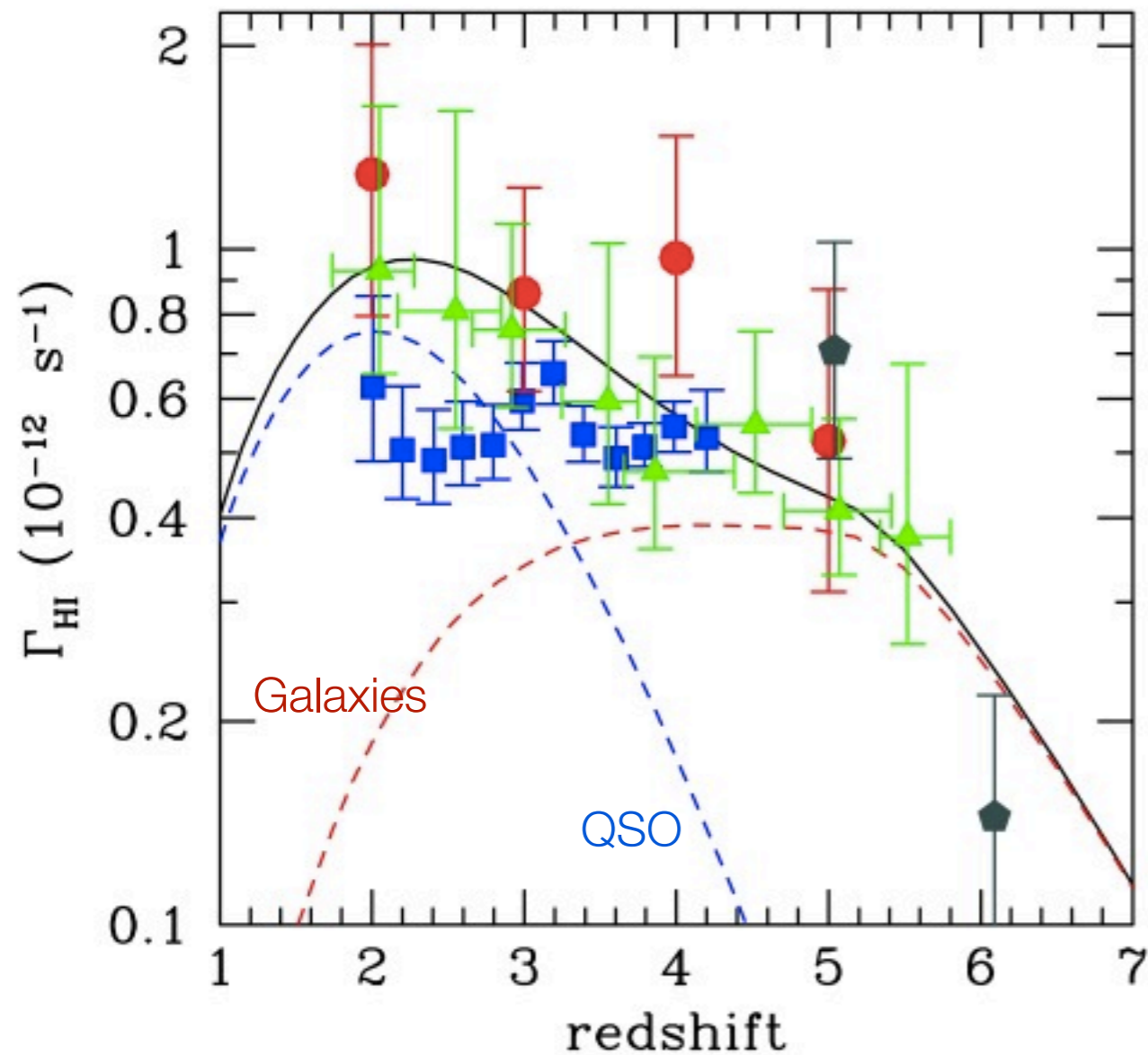


Photo-ionization Rate

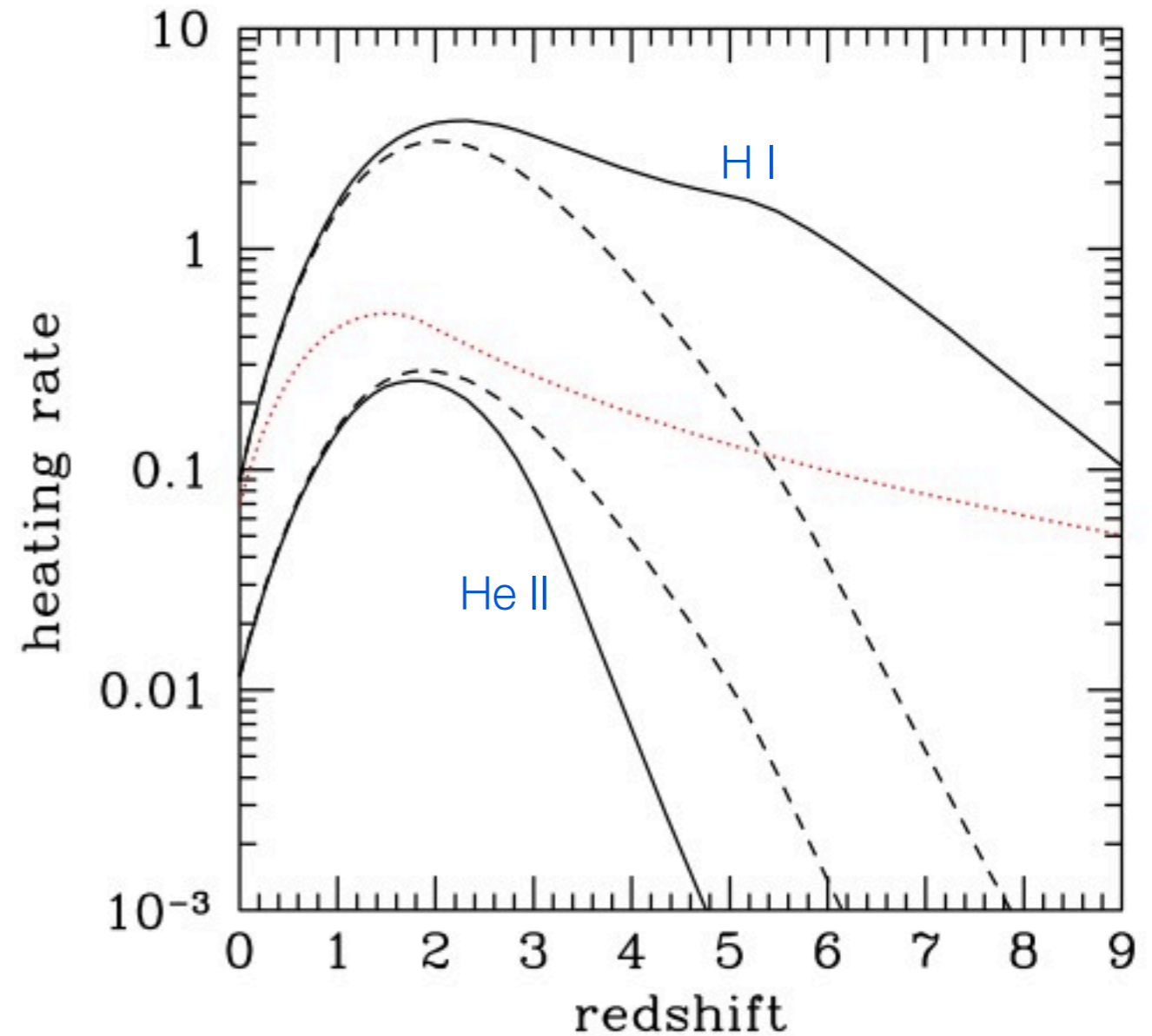


Photo-heating Rate

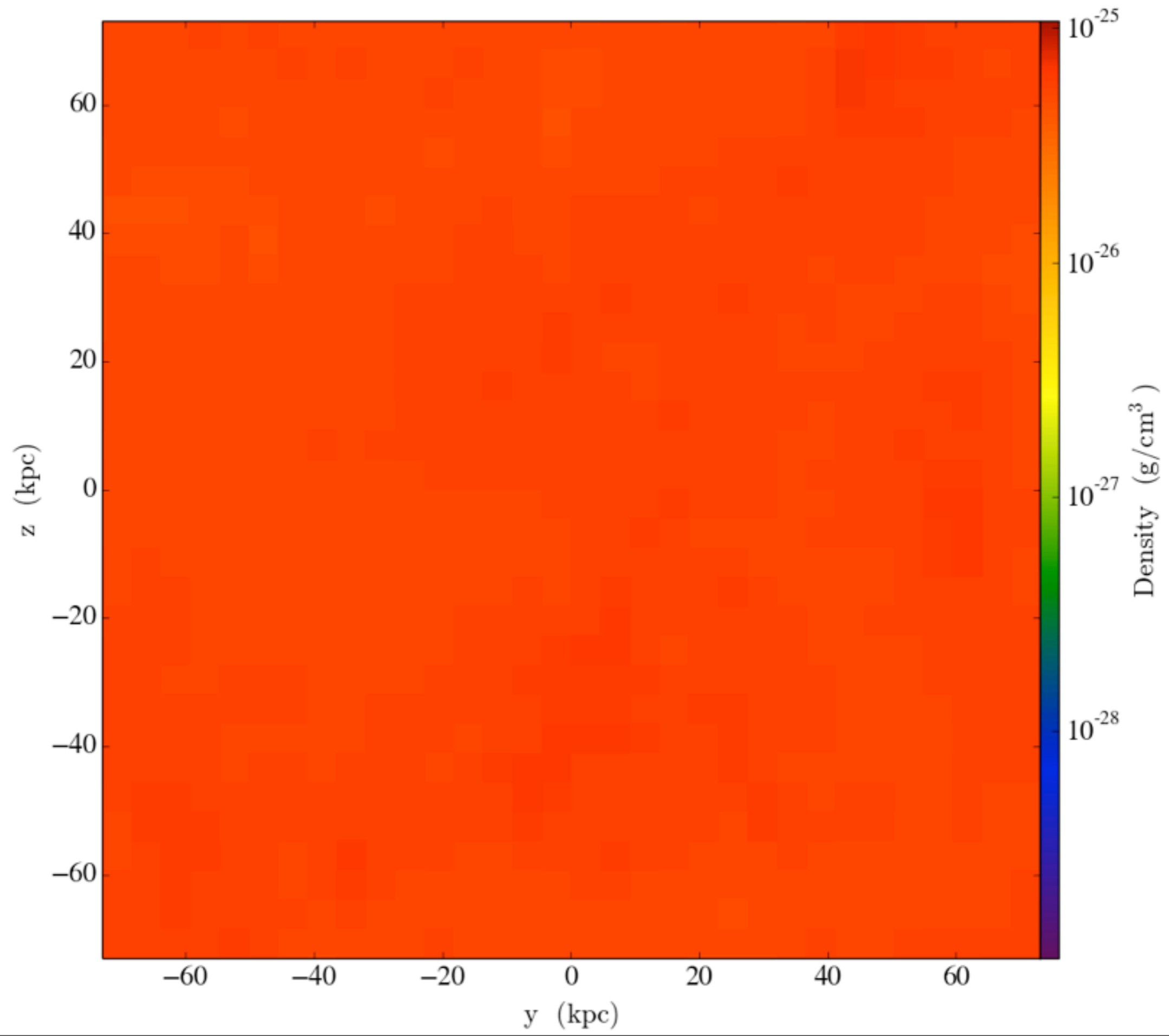
Radiative Cooling and Ultraviolet Background

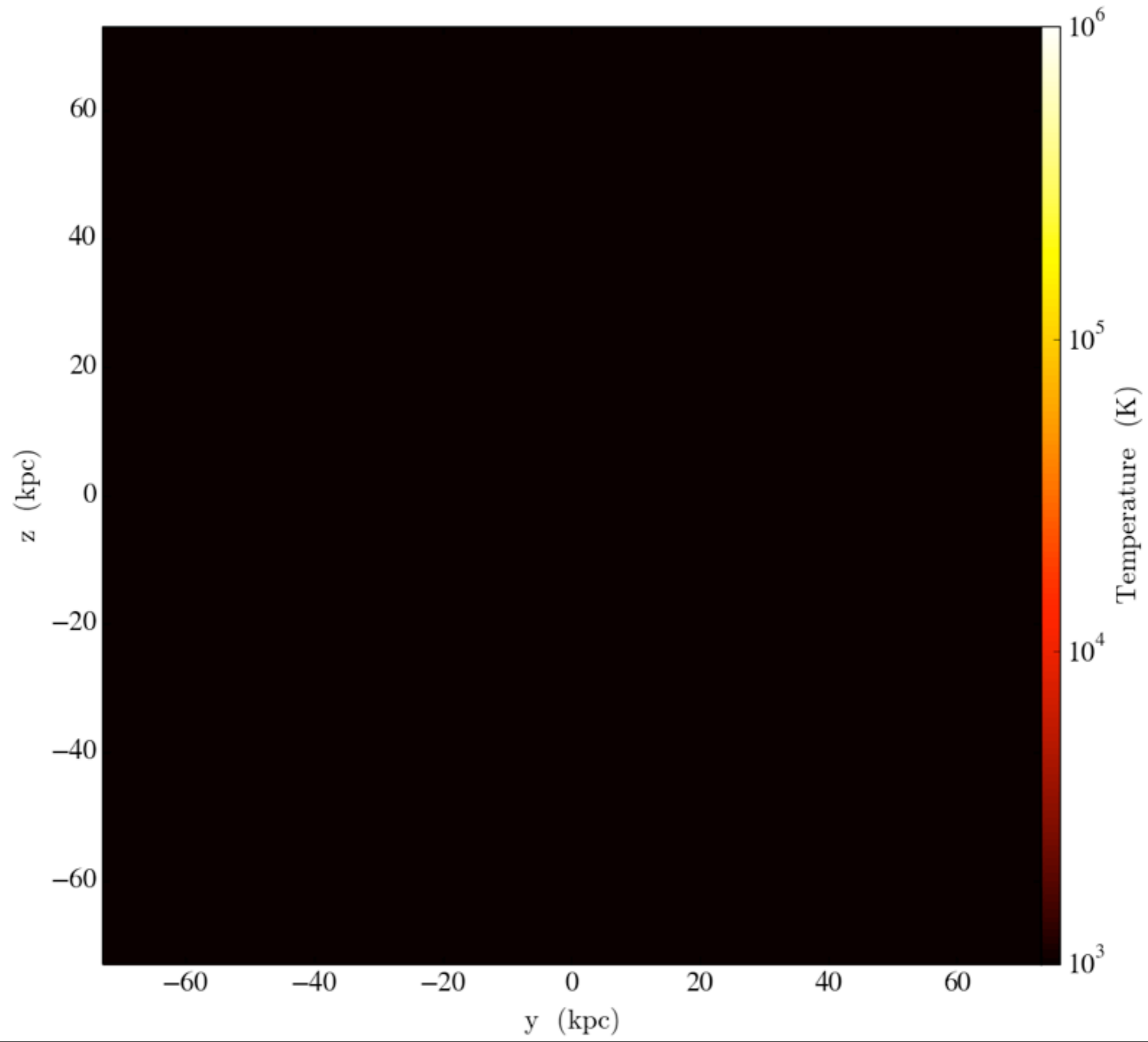
- This simulation takes 50 minutes to run on my laptop with 2 cores.
- Requires the tabulated UV background in the run directory.
 - `~/enzo-stable/input/hm12_photorates.dat`
- If you want to run the simulation later, you can copy the parameter file and initial conditions files from the adiabatic simulation

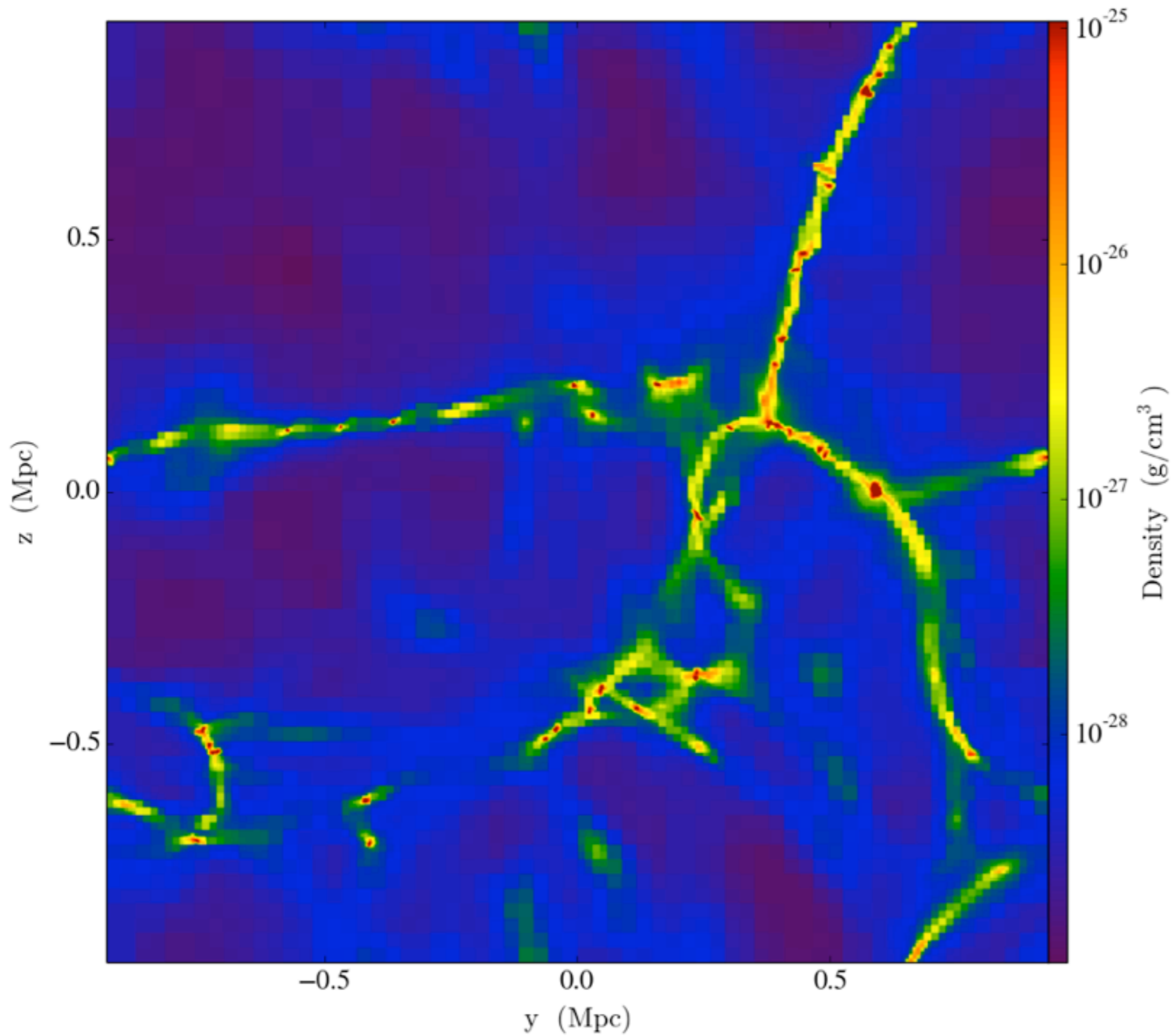
```
cd ~/sapporo_cosmo
mkdir cooling
cp sapporo_cosmo_nbody/Grid* sapporo_cosmo_nbody/Particle* cooling
cd cooling
cp ~guest009/cooling.enzo .
cp <where enzo is>/enzo.exe .
./enzo.exe -d cooling.enzo
```

Radiative Cooling and Ultraviolet Background

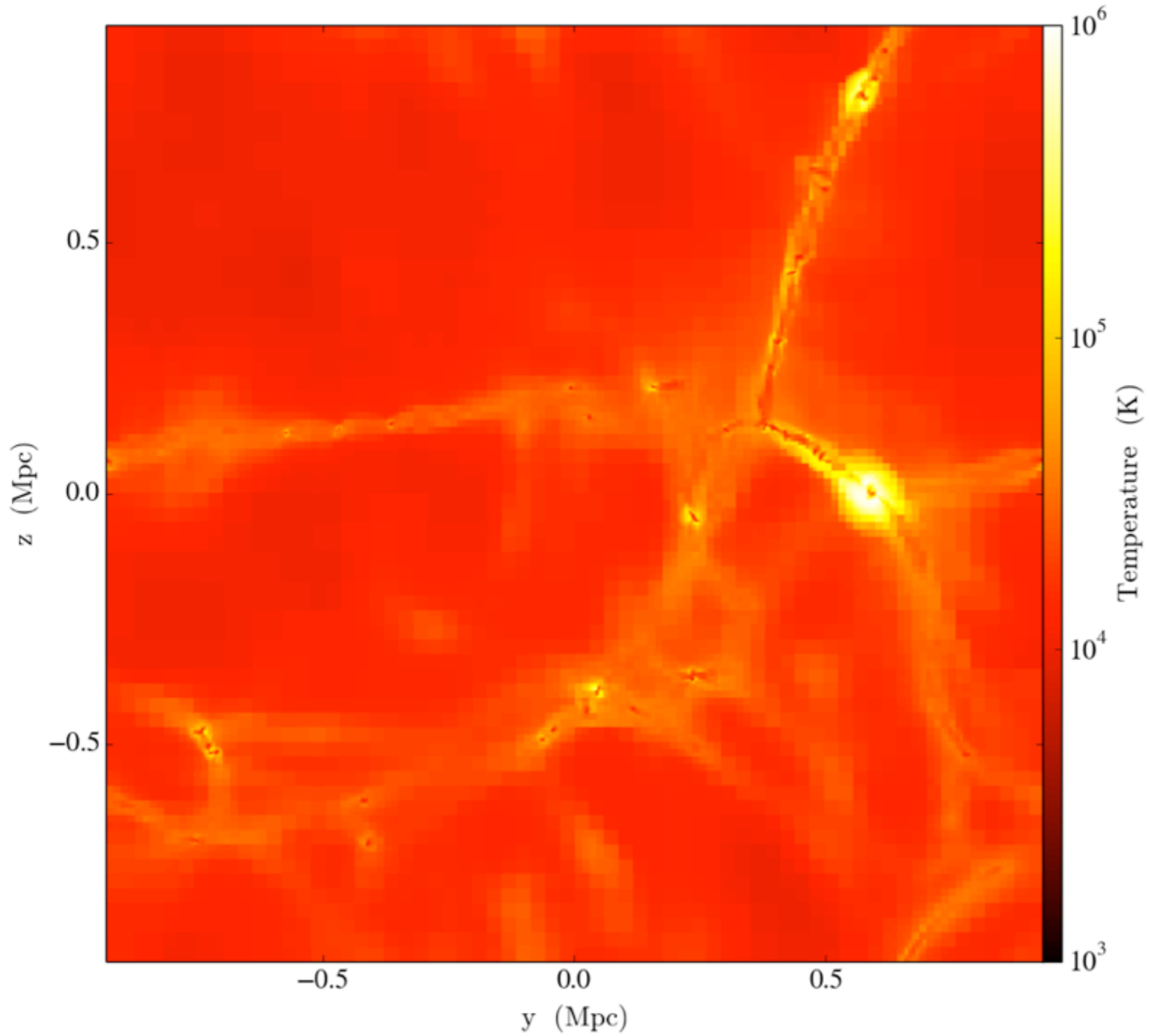
- I have copied the last output to conival. You can copy it to your directory
 - `cp -r ~guest009/cooling/DD0050 .`
- Let's inspect it!

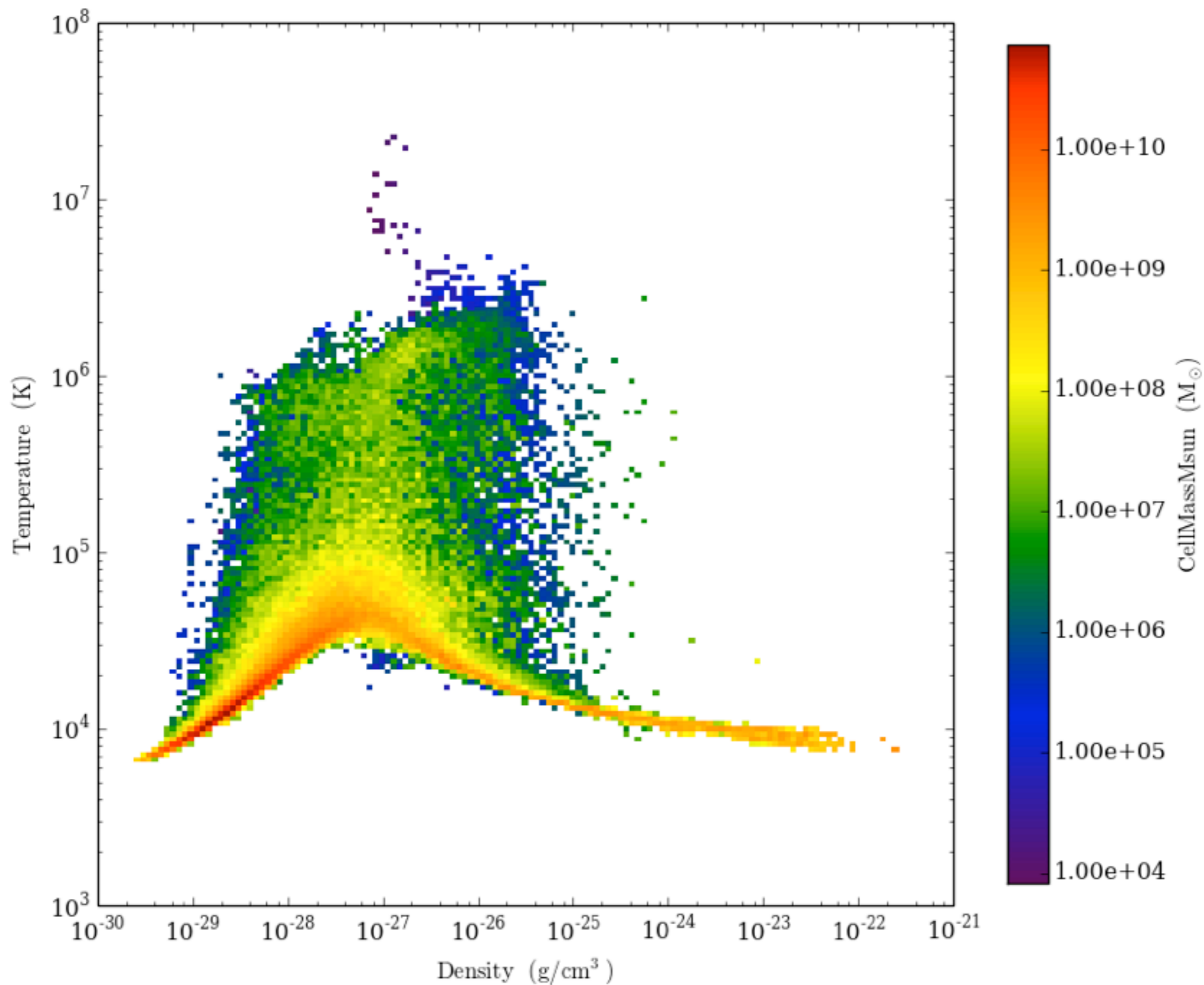


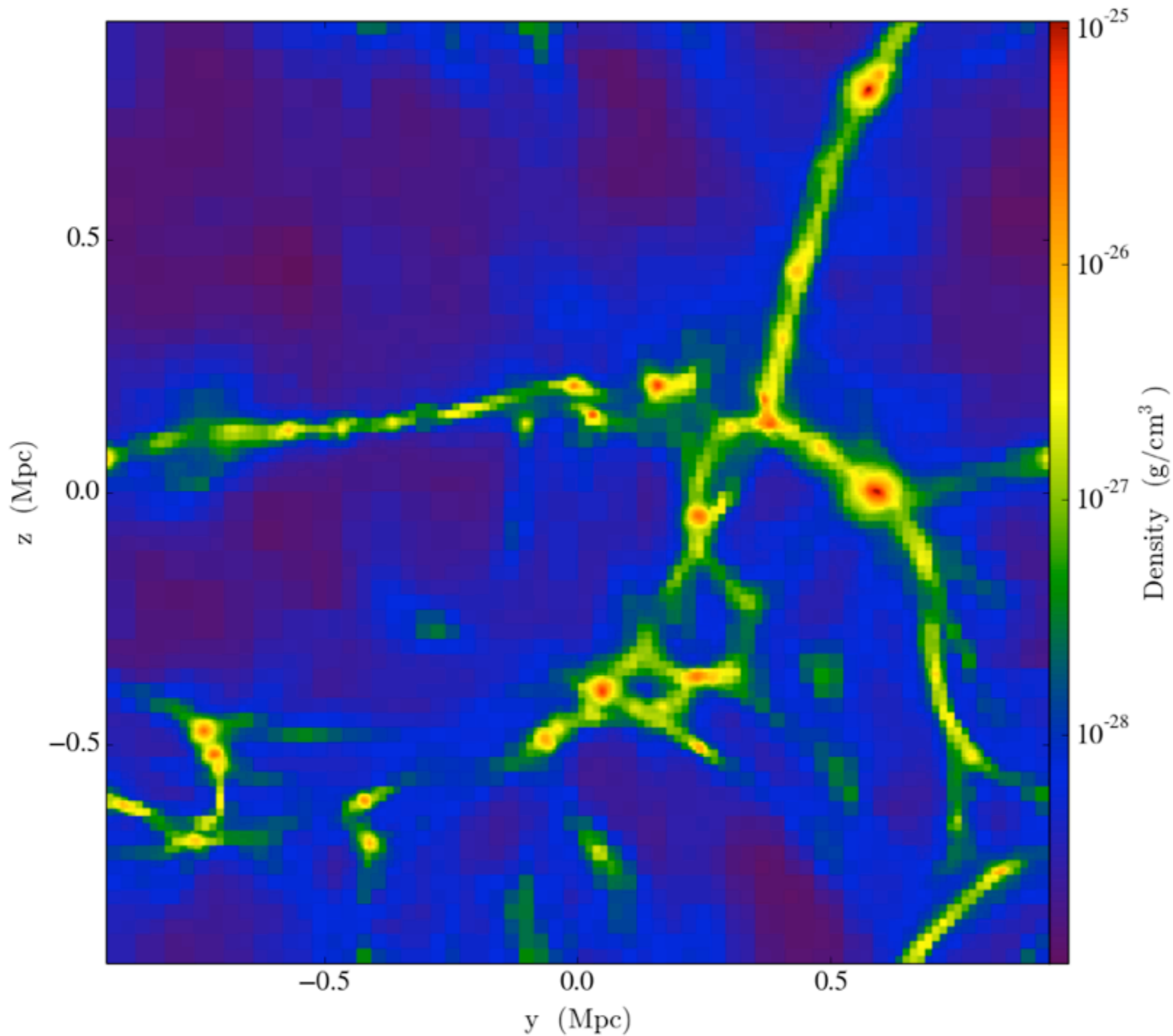


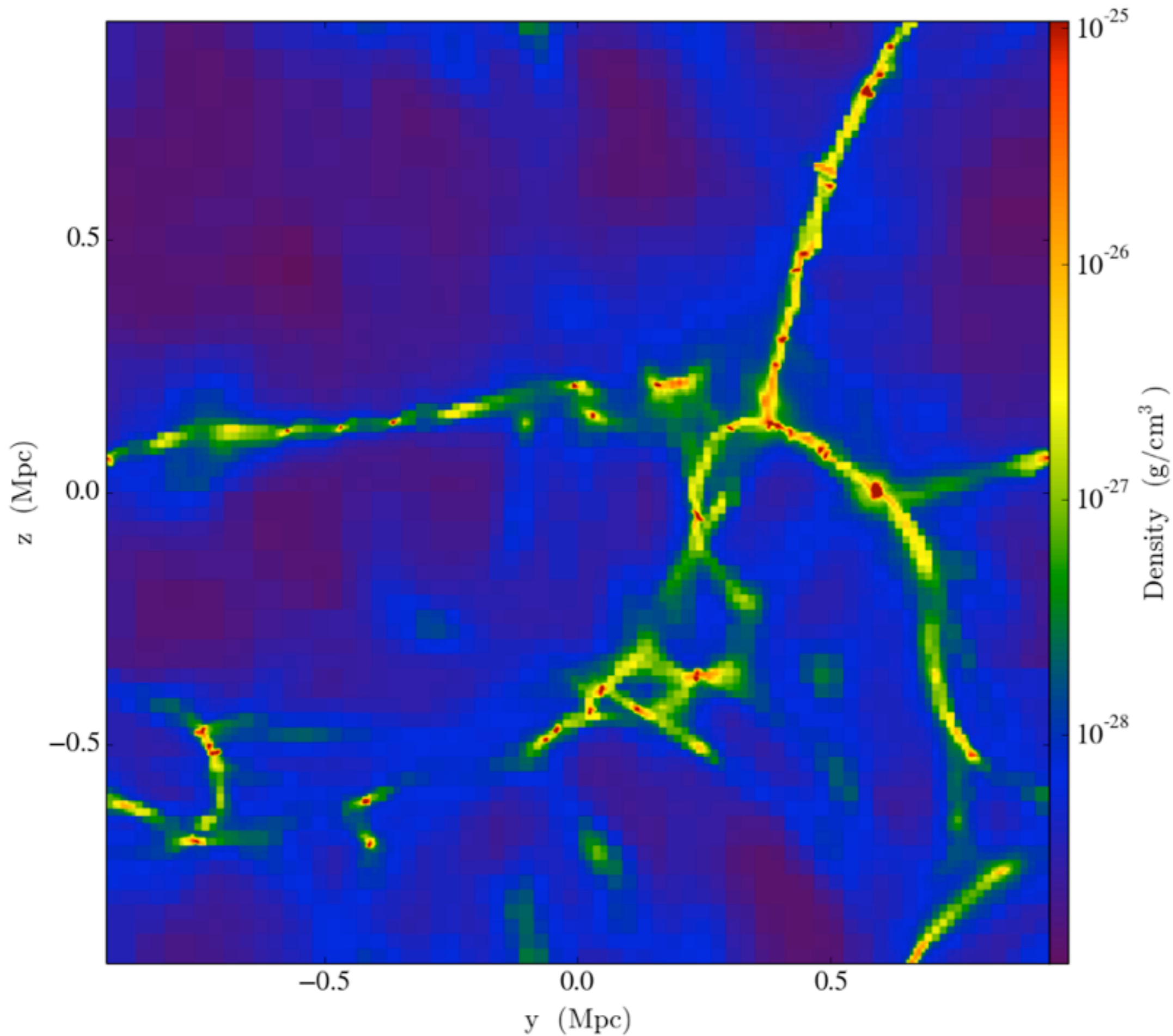


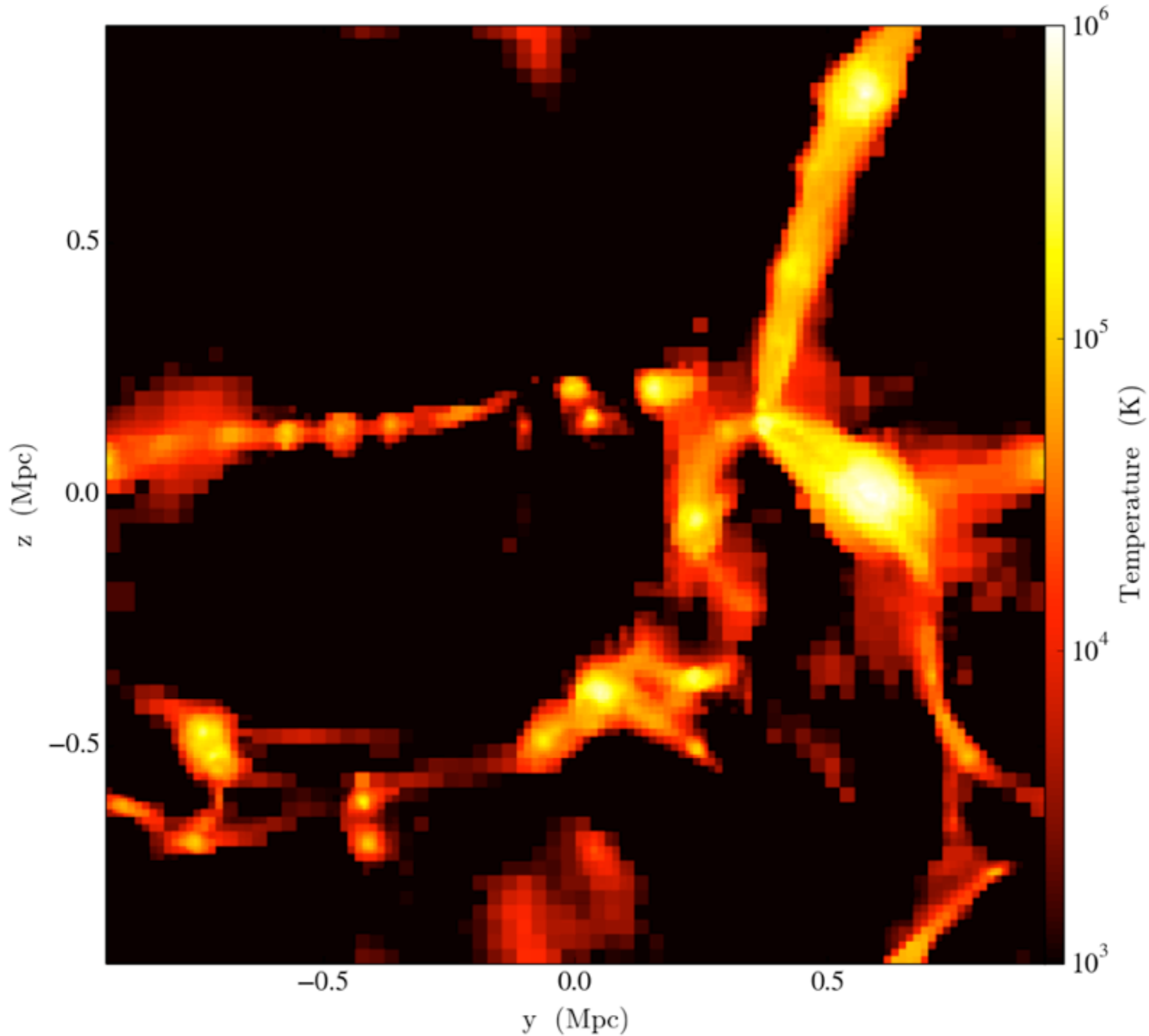
$z = 3.00$

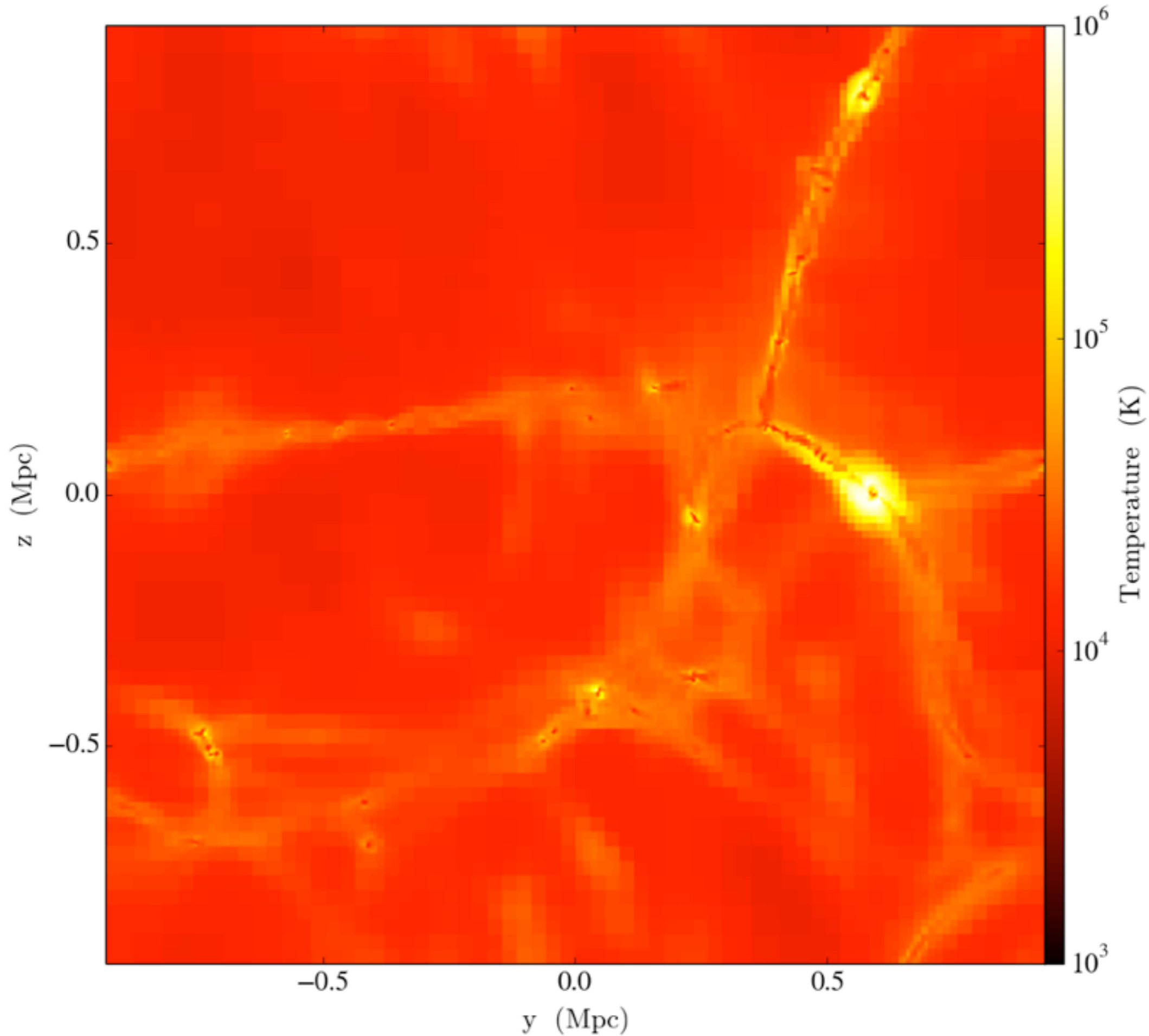


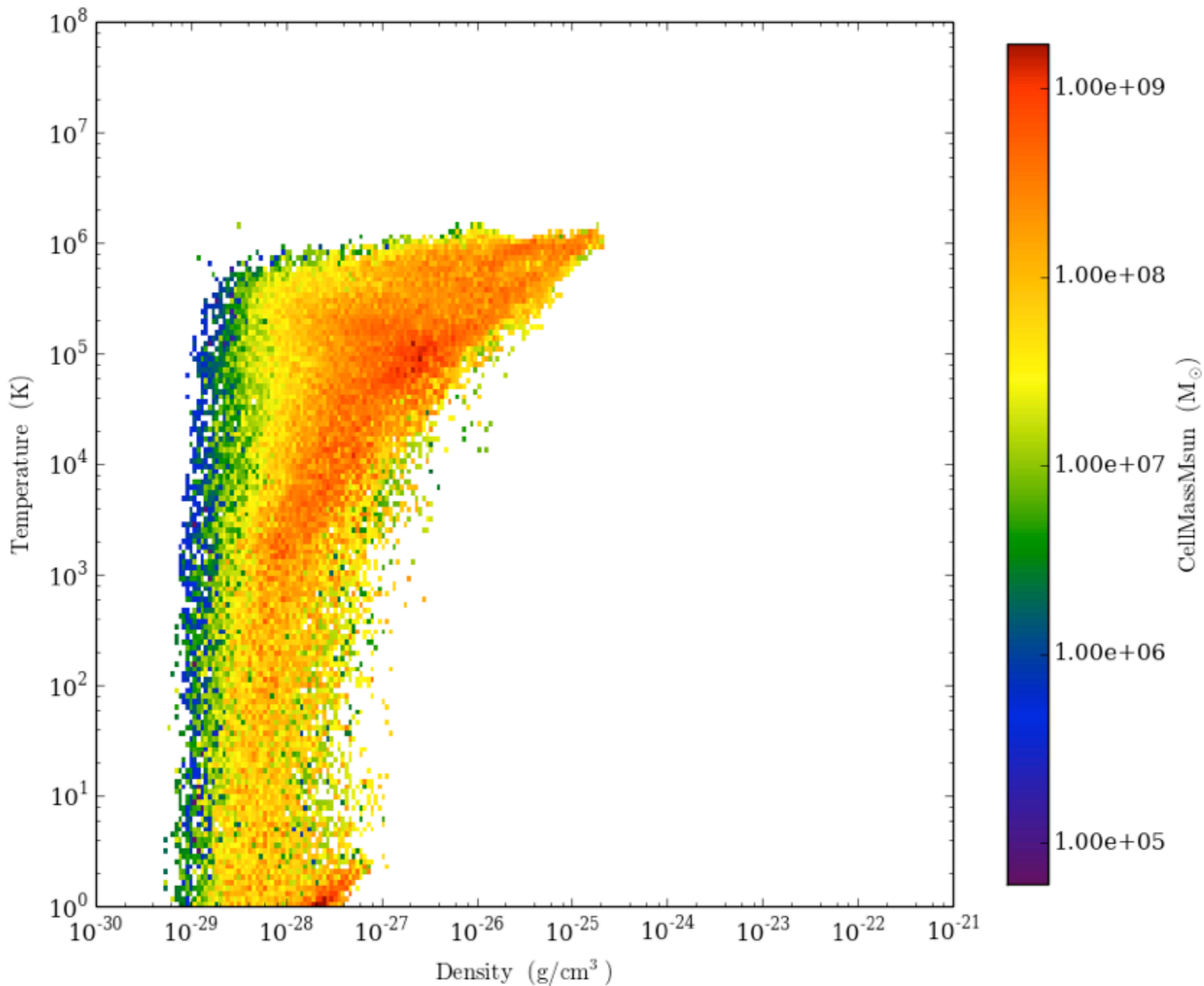


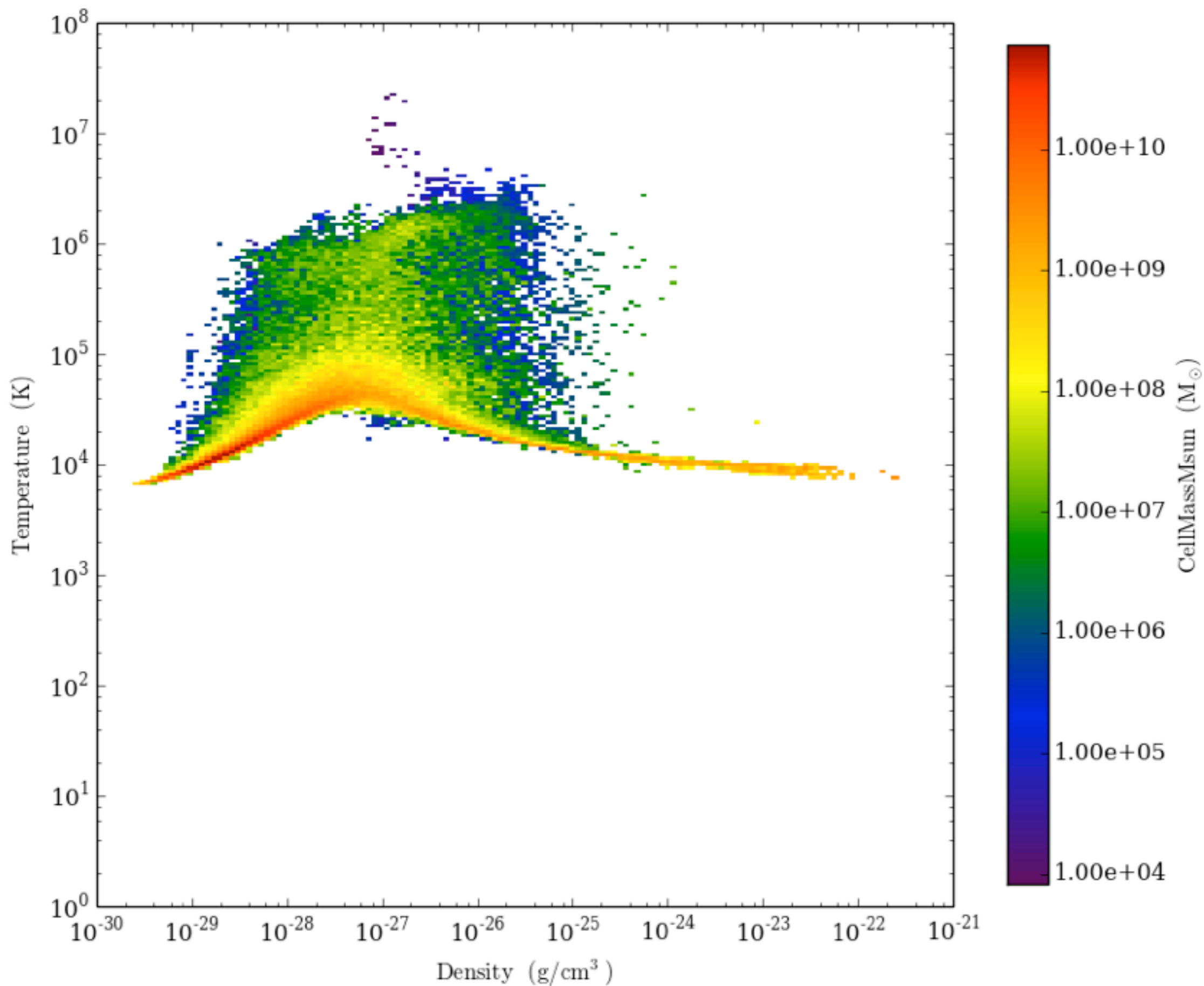












Radiative Cooling and Ultraviolet Background

- I have also uploaded a IPython notebook to my directory.
 - `cp ~guest009/cooling/Cooling.ipynb .`

+ Star Formation and Supernova Feedback

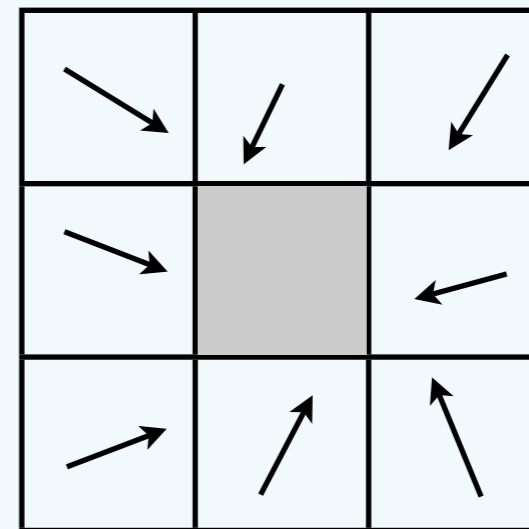
- Let's add more physics! Star formation and supernova feedback.

- Star Formation (original formulation: Cen & Ostriker 1992)

- Overdense: $\rho > \rho_{\text{SF}}$

- Converging flow: $\nabla \cdot \mathbf{v} < 0$

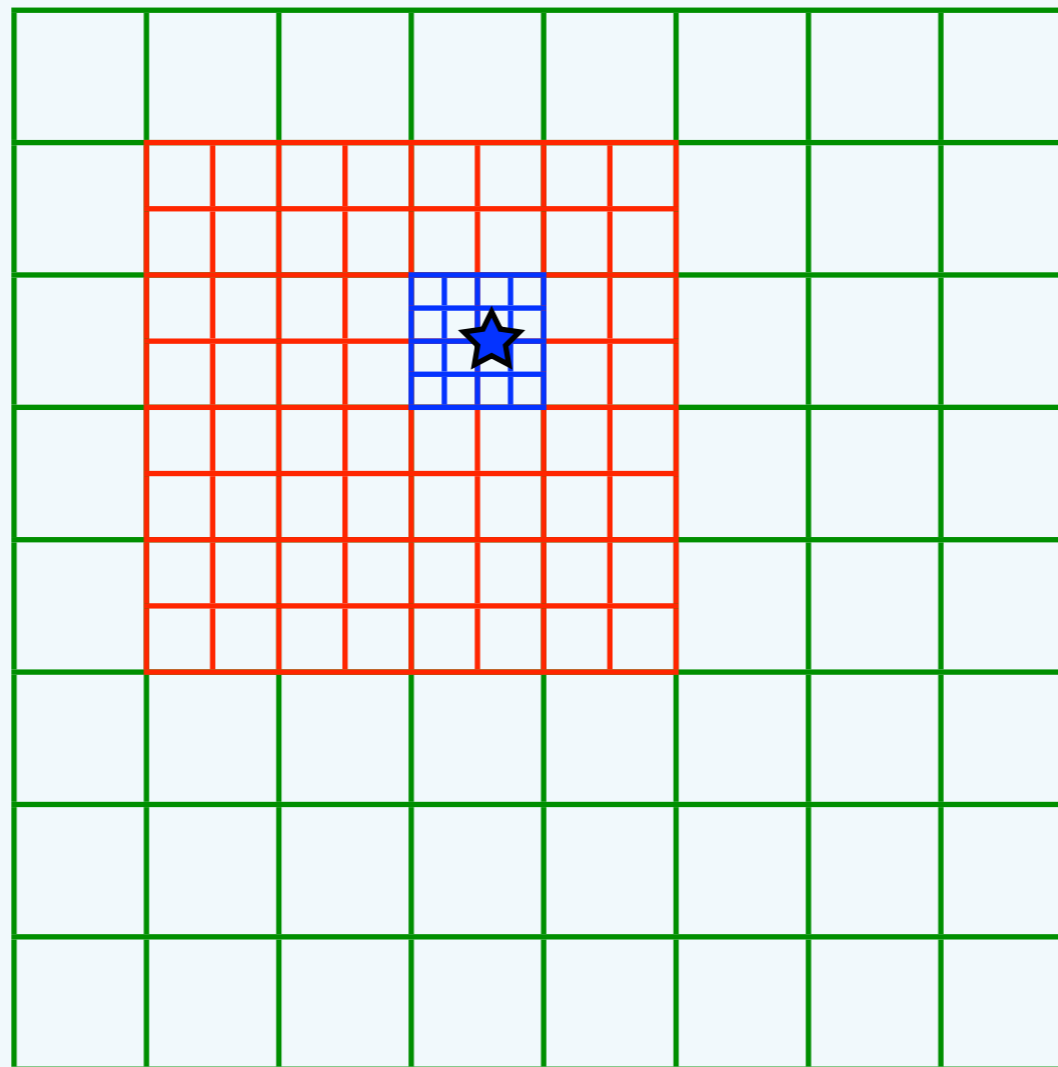
- Cooling: $t_{\text{cool}} < t_{\text{dyn}}$



- Gravitational unstable (originally used, but not in the specific algorithm we'll be using): $M_{\text{cell}} > M_J$

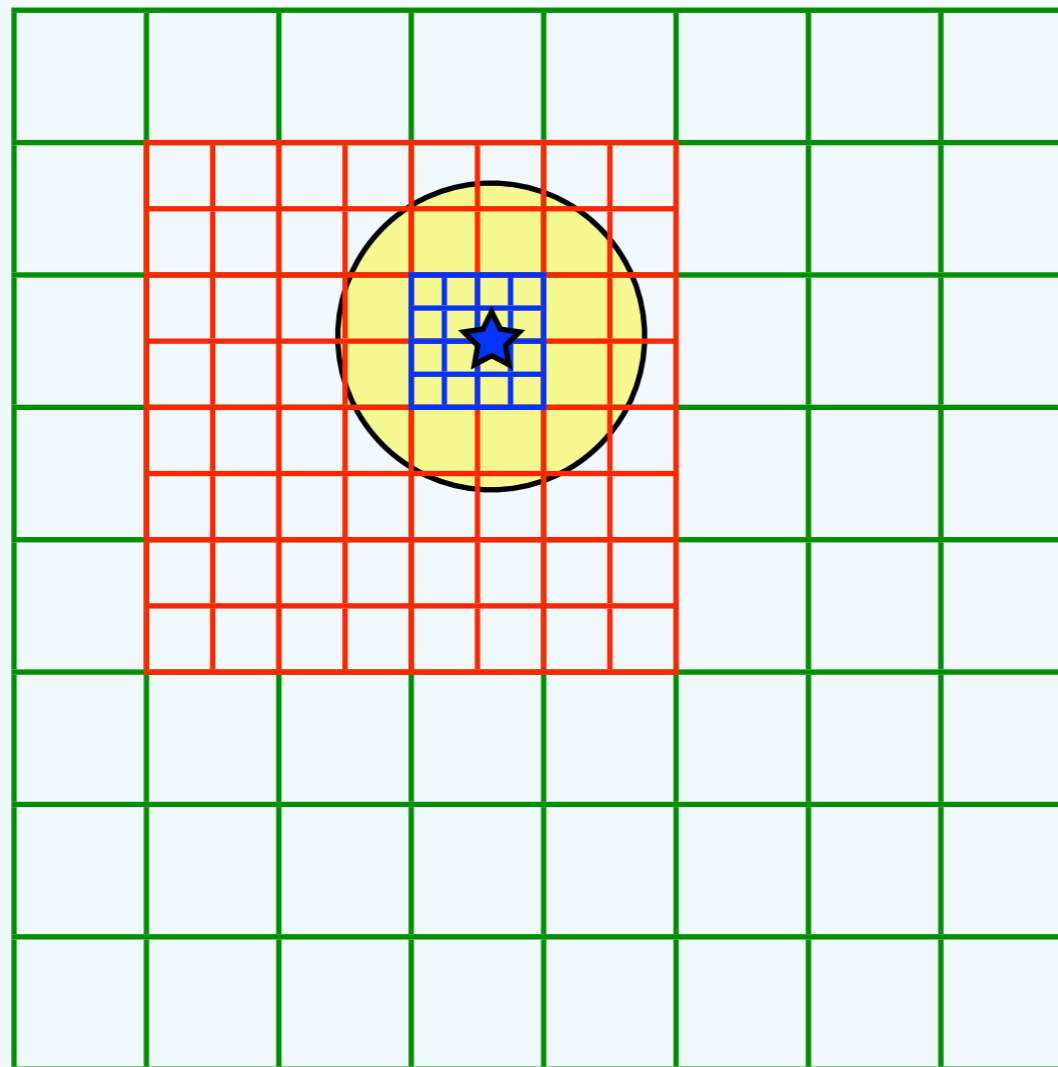
+ Star Formation and Supernova Feedback

- Supernova feedback is modeled with thermal energy injection



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+ Star Formation and Supernova Feedback

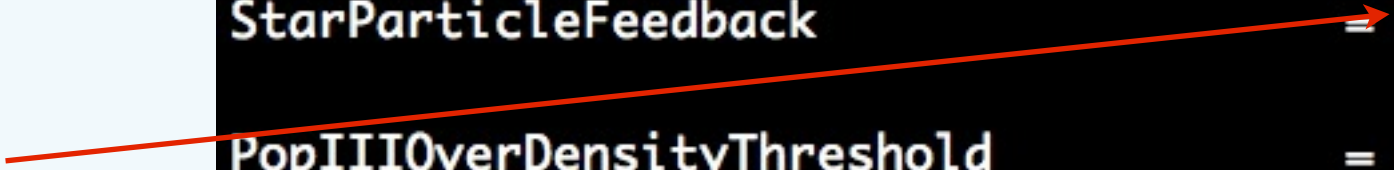
- You can find the parameter file in
 - sapporo_cosmo/stars-uvb.enzo

- Star formation and feedback.

- Method 5 $\rightarrow 2^5 = 32$

```
StarParticleCreation = 32
StarParticleFeedback = 32
PopIIIOverDensityThreshold = -0.1
PopIIIMetalCriticalFraction = 1e-30

StarClusterUseMetalField = 1
StarClusterUnresolvedModel = 1
StarClusterMinDynamicalTime = 1e+07
StarClusterIonizingLuminosity = 3e+46
StarClusterSNEnergy = 1.25e+49
StarClusterSNRadius = 100
StarClusterFormEfficiency = 0.07
StarClusterMinimumMass = 1e7
```



+ Star Formation and Supernova Feedback

`StarParticleCreation` (external)

This parameter is bitwise so that multiple types of star formation routines can be used in a single simulation. For example if methods 1 and 3 are desired, the user would specify 10 ($2^1 + 2^3$), or if methods 1, 4 and 7 are wanted, this would be 146 ($2^1 + 2^4 + 2^7$). Default: 0

- 0 - Cen & Ostriker (1992)
- 1 - Cen & Ostriker (1992) with stochastic star formation
- 2 - Global Schmidt Law / Kravstov et al. (2003)
- 3 - Population III stars / Abel, Wise & Bryan (2007)
- 4 - Sink particles: Pure sink particle or star particle with wind feedback depending on choice **for** `HydroMethod` / Wang et al. (2009)
- 5 - Radiative star clusters / Wise & Cen (2009)
- 6 - [reserved **for** future use]
- 7 - Cen & Ostriker (1992) with no delay in formation
- 8 - Springel & Hernquist (2003)
- 9 - Massive Black Hole (MBH) particles insertion by hand / Kim et al. (2010)
- 10 - Population III stellar tracers
- 11 - Molecular hydrogen regulated star formation

+ Star Formation and Supernova Feedback

- Star formation and feedback.
Method 5 $\rightarrow 2^5 = 32$
- Method 3 (Population III stars) and method 5 use the same minimum overdensity. **Negative** number means units in cm^{-3} . **Positive** number is in code units.
- Critical metallicity to transition from Population III to Population II. For this simulation, we only want to consider **Pop II stars**, so we set to a tiny_number.

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StarParticleFeedback	= 32
PopIIIOverDensityThreshold	= -0.1
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+ Star Formation and Supernova Feedback

- Use metal feedback in supernova.
- Use Cen & Ostriker prescription for time-dependent feedback.
- Dynamical time (\rightarrow avg. density) of a sphere that accretes onto the star particle.
- Ionizing photon luminosity (in units of photons / s / M_{\odot})
- Supernova thermal energy (in units of erg / M_{\odot})
- Radius of sphere where the energy is injected (in units of pc)

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StarParticleFeedback	= 32
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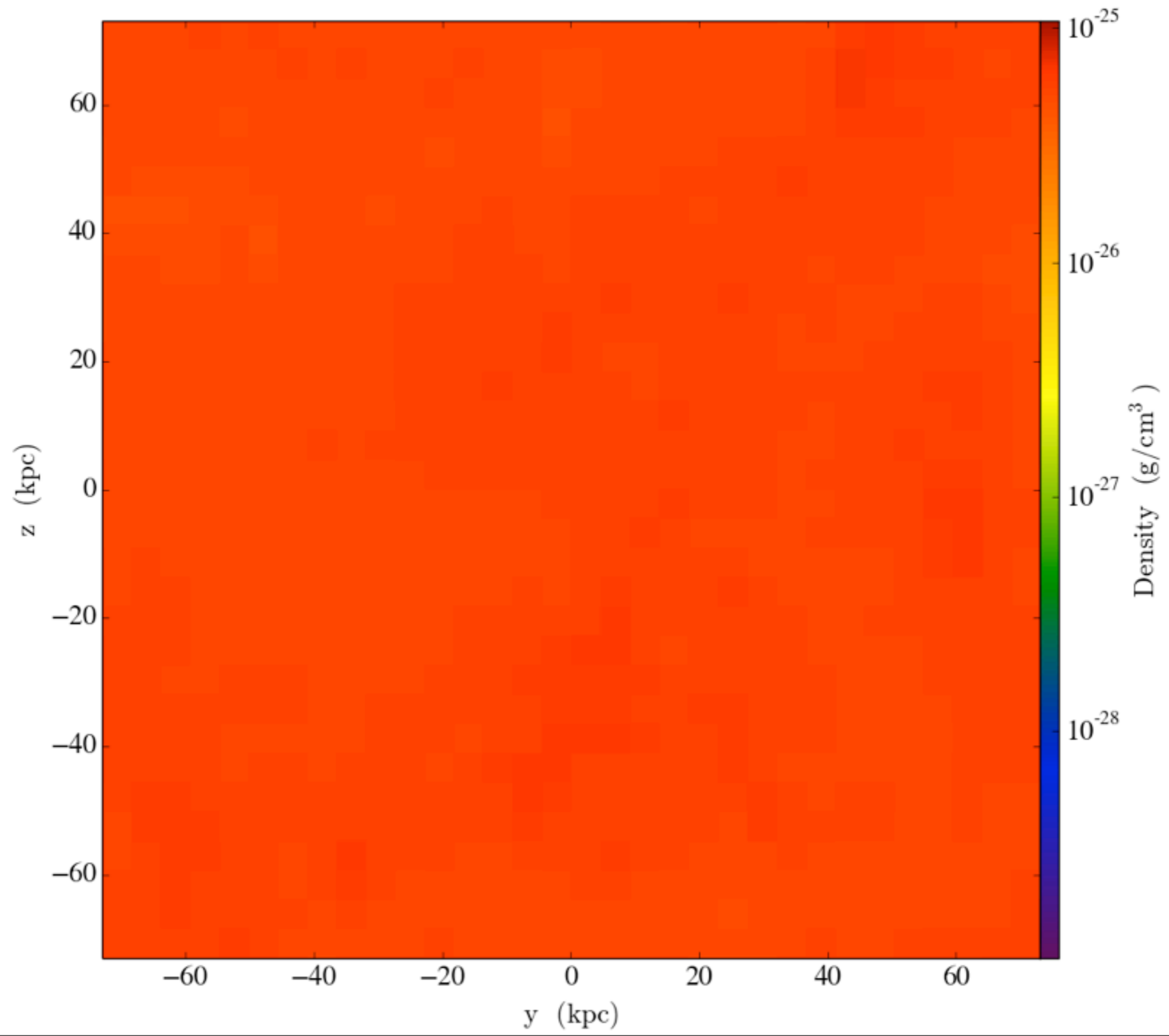
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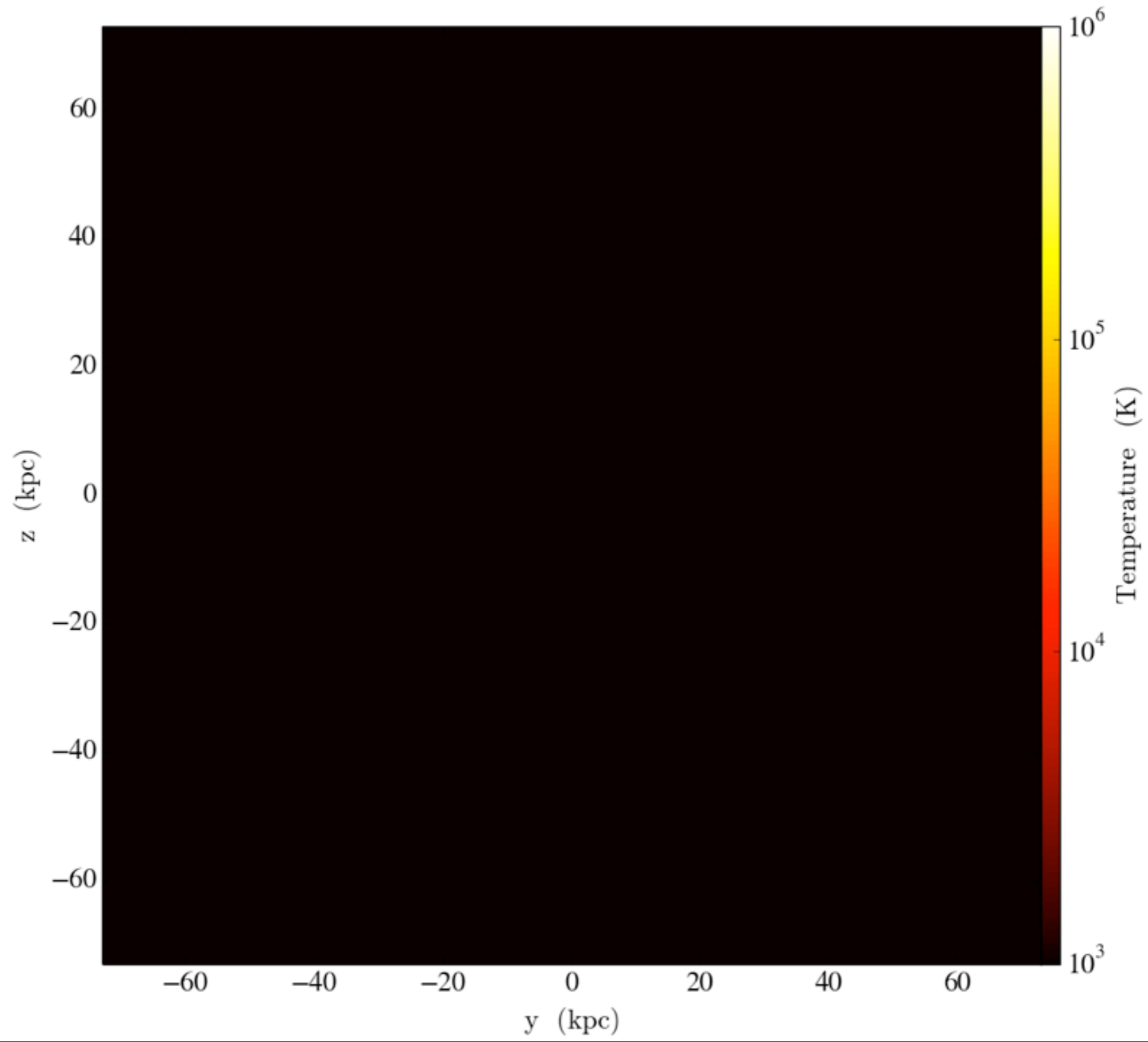
- Mass fraction of cold gas inside the sphere that is deposited into the star particles.
- Minimum mass (in units of M_{\odot}) of star particles

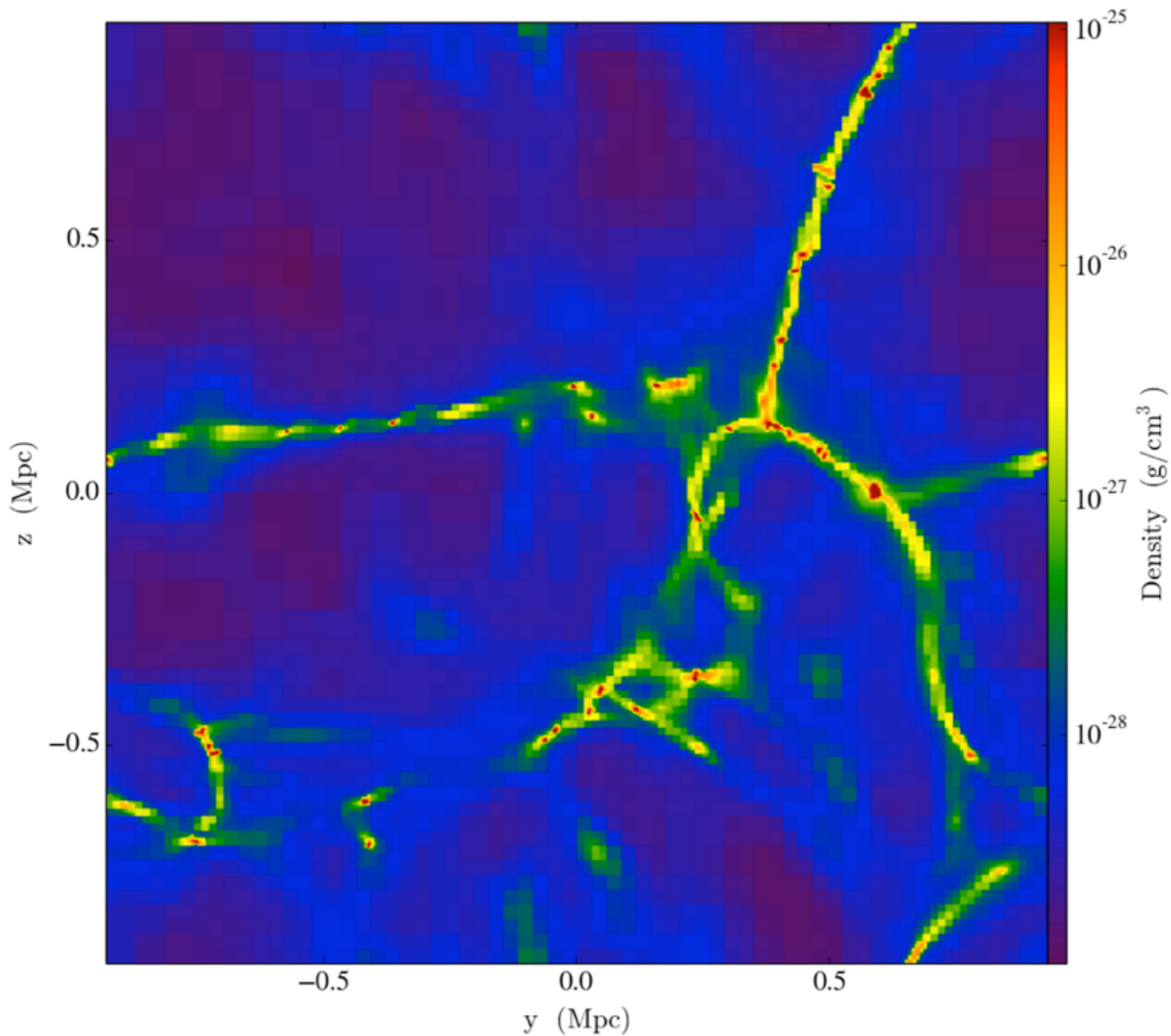
<code>StarParticleCreation</code>	<code>= 32</code>
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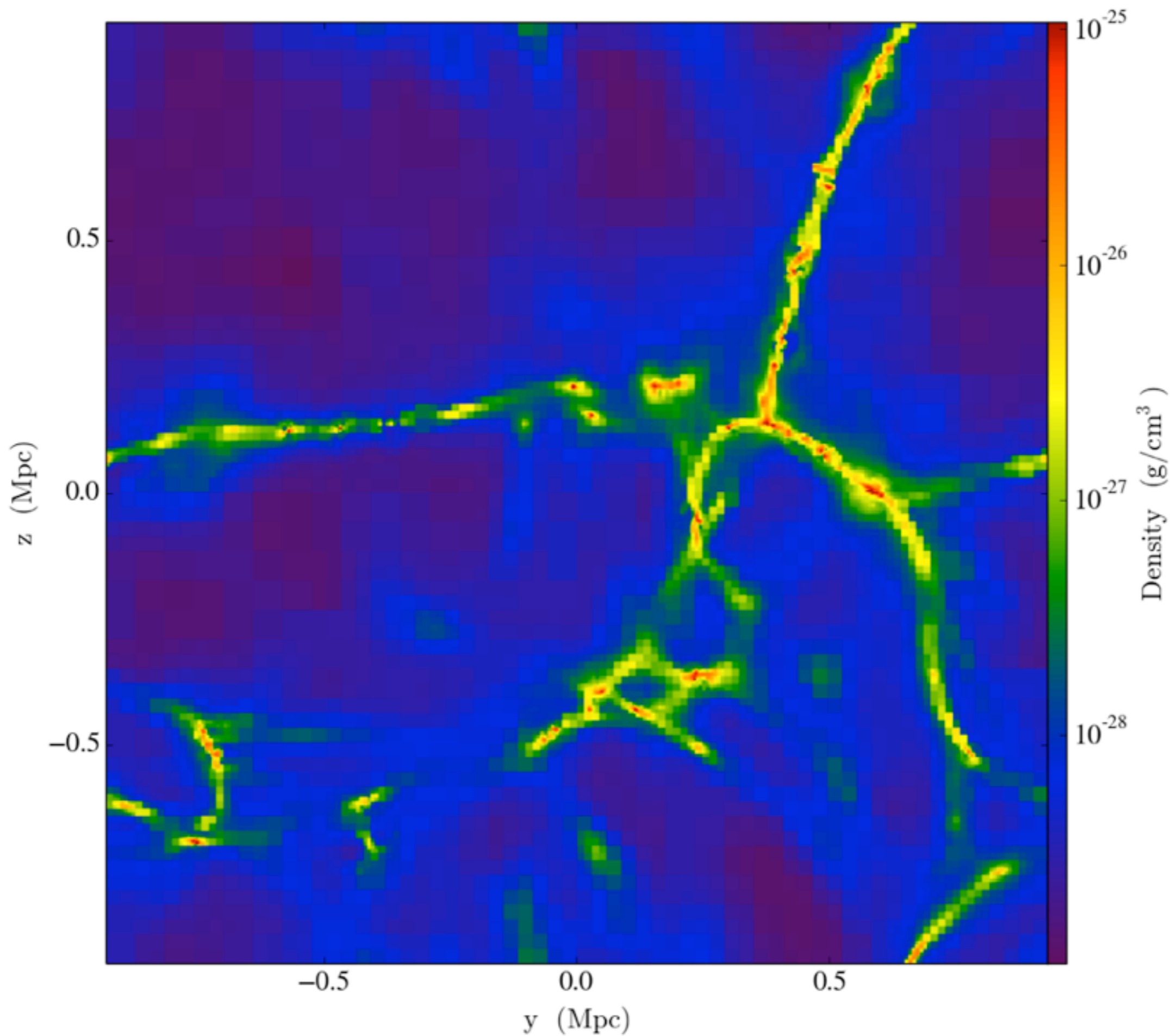
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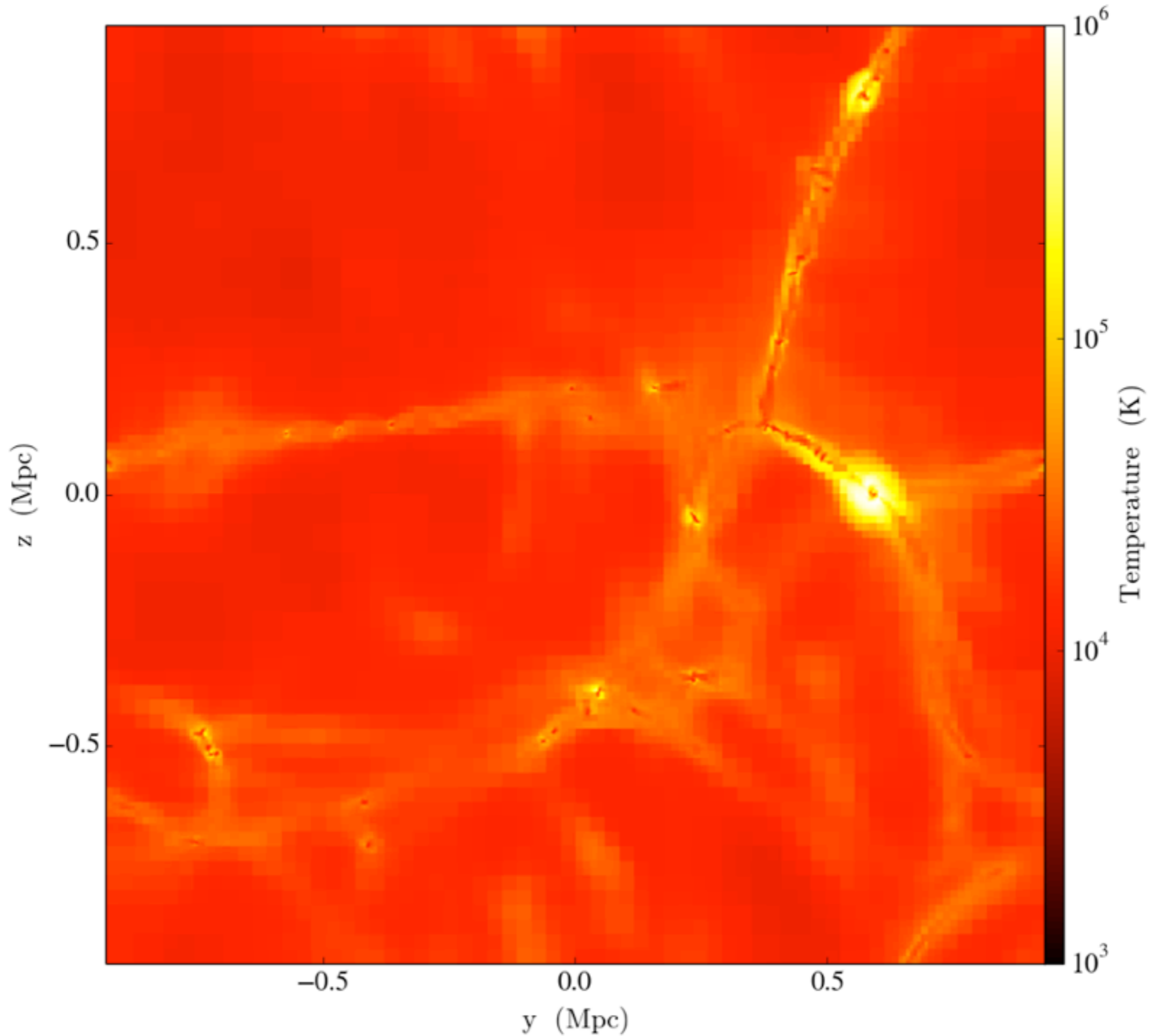
- Again, this simulation takes some time to complete. About an hour.
- I have uploaded the last output at redshift 3 and IPython notebook to
 - `~guest009/SNe/DD0050`
 - `~guest009/SNe/Supernovae.ipynb`
- Let's inspect it!

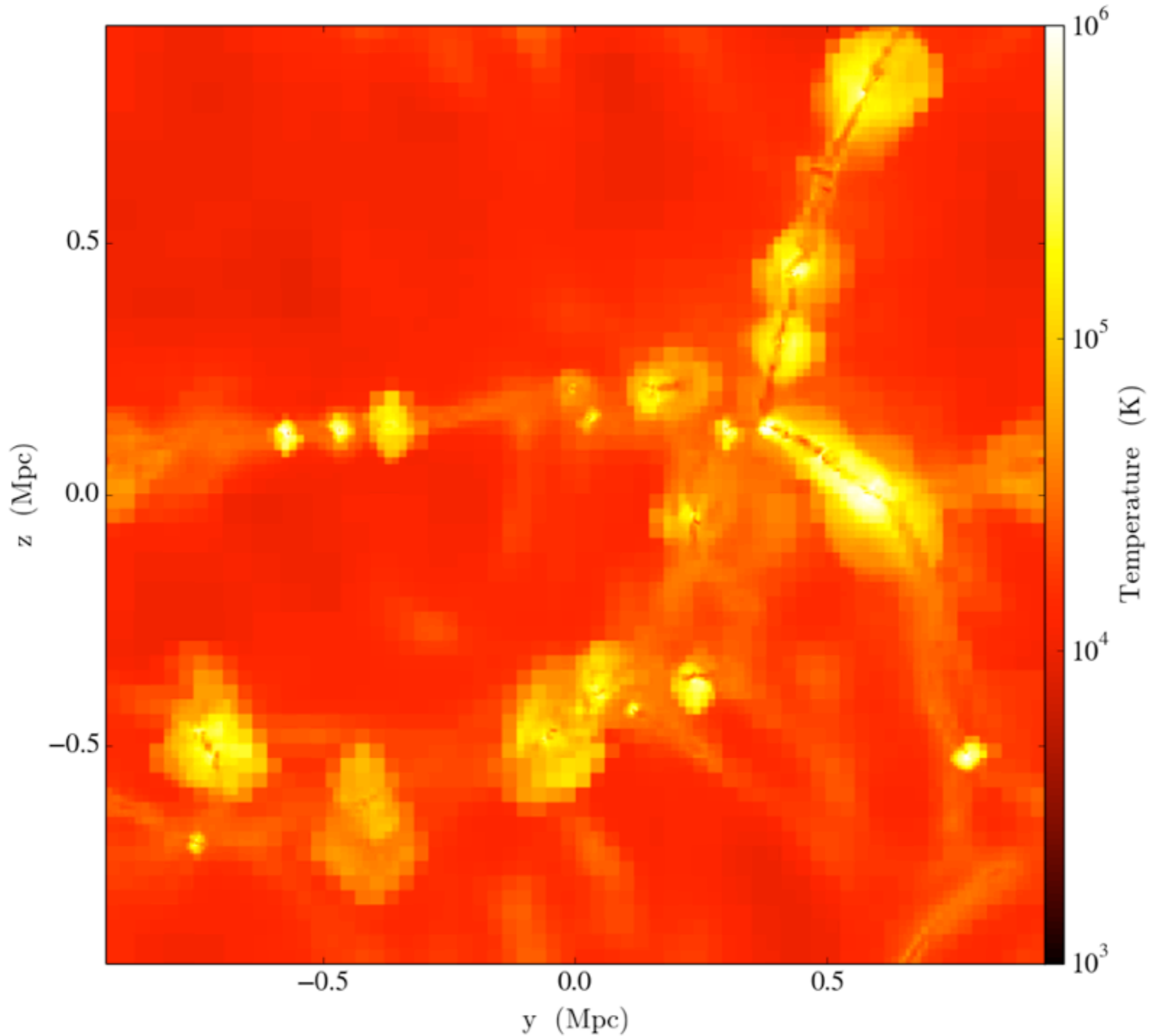


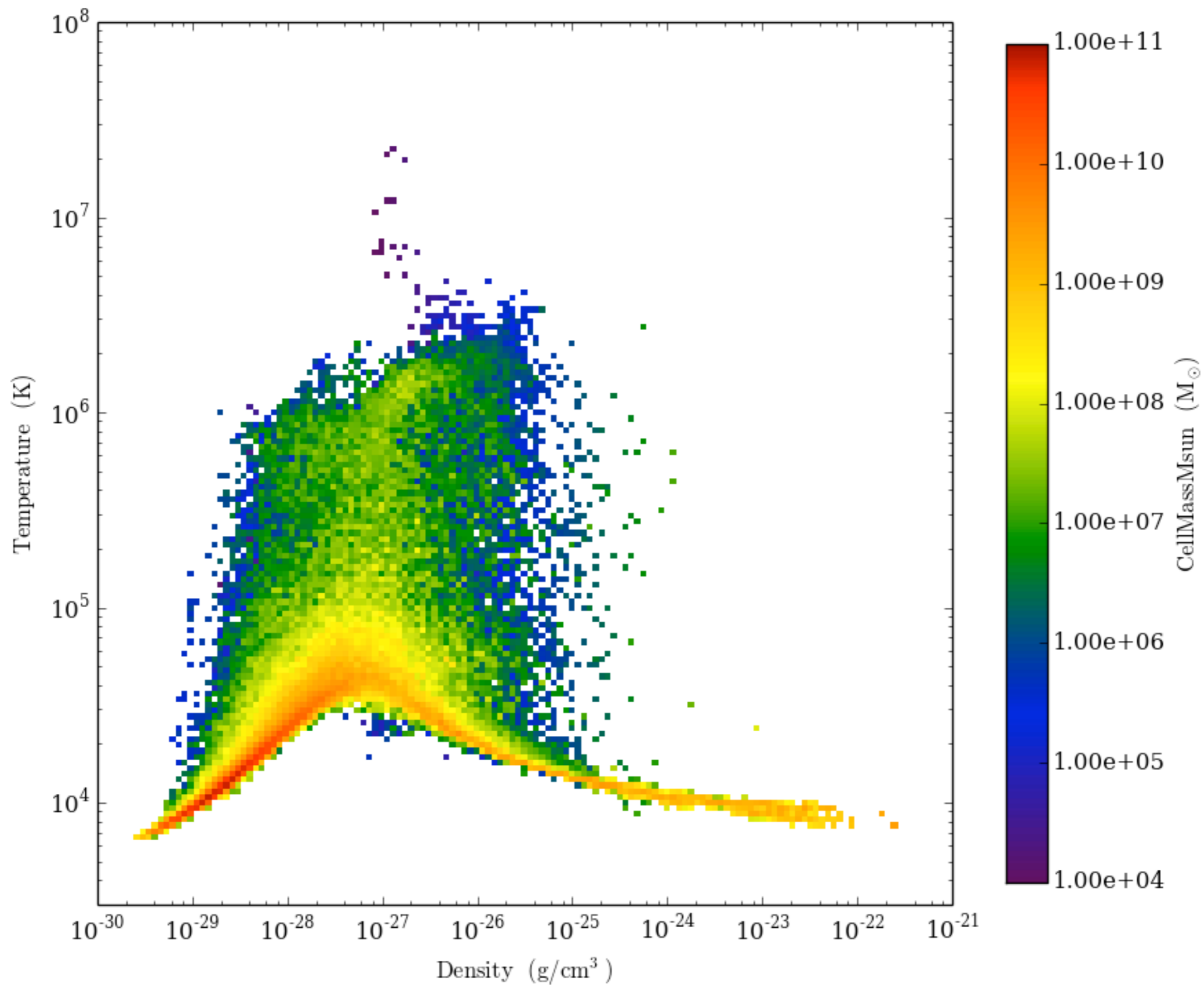


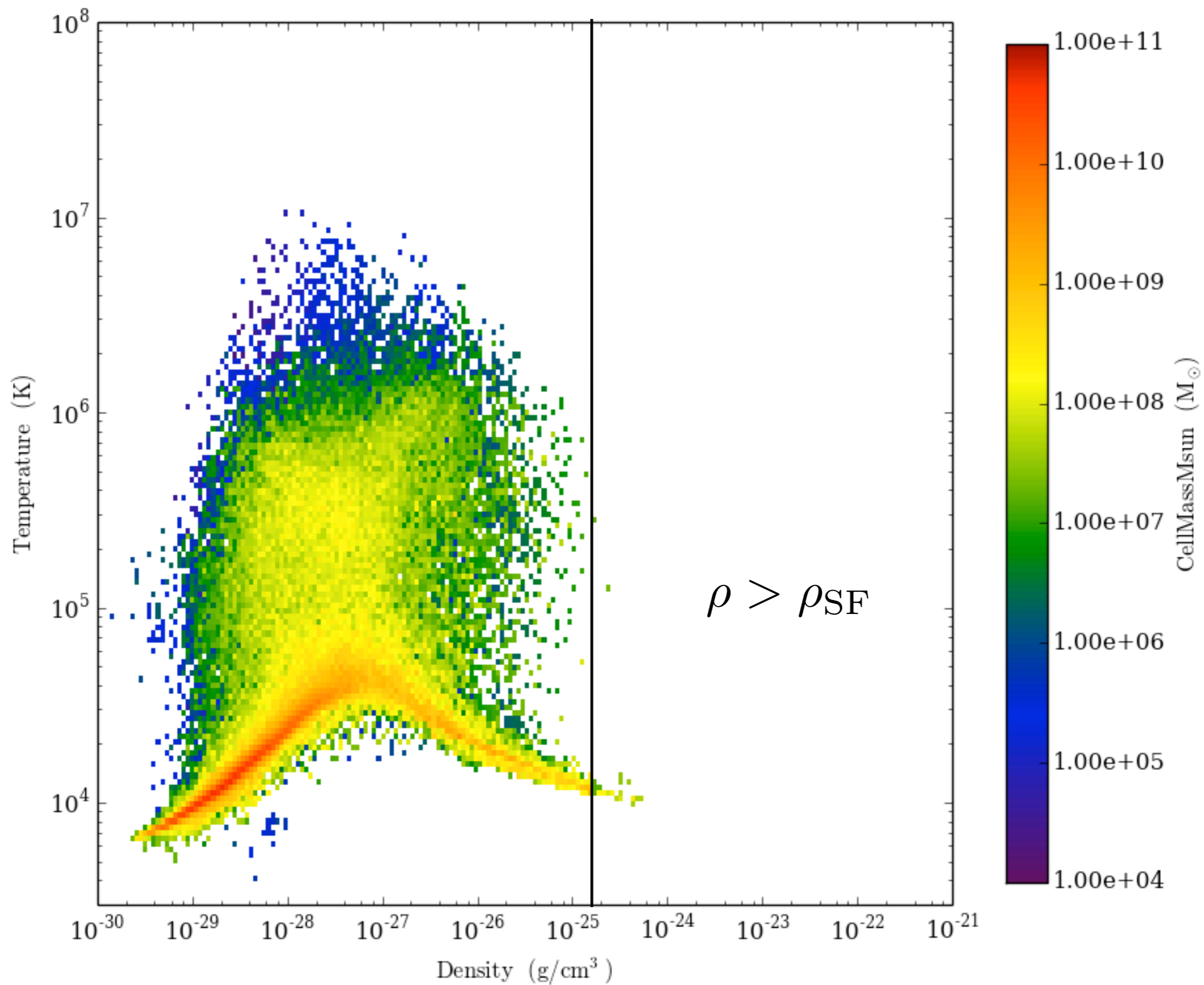












+ Radiative Feedback

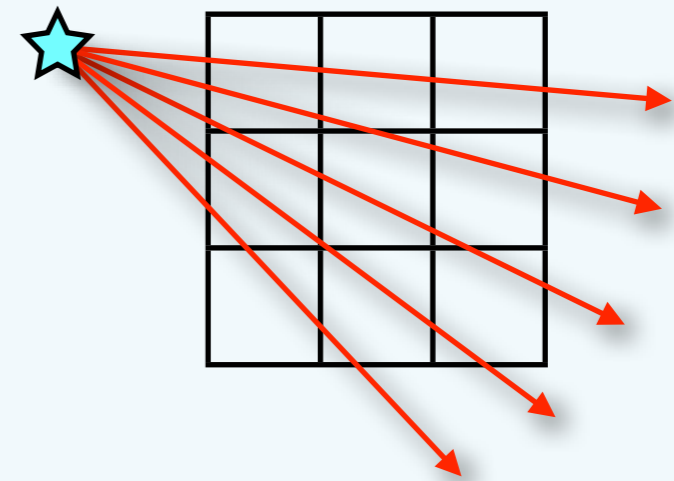
- Enzo has two prescriptions to solve the radiative transfer equation:
 - Adaptive ray tracing
 - Flux limited diffusion
- This allows for an inhomogenous radiation field with spatially dependent absorption and emission coefficients.
- Can be used in conjunction with a radiation background.

+ Radiative Feedback

- Enzo has two prescriptions to solve the radiative transfer equation:

- Adaptive ray tracing ←

- Flux limited diffusion



- This allows for an inhomogeneous radiation field with spatially dependent absorption and emission coefficients.
- Can be used in conjunction with a radiation background.

Cosmological Radiative Transfer Equation

$$I_\nu \equiv I(\nu, \mathbf{x}, \Omega, t)$$

\hat{n} := normal vector
 a := scale factor
 \bar{a} := a/a_{em}
 H := Hubble factor
 ν := frequency

$$\frac{1}{c} \frac{\partial I_\nu}{\partial t} + \frac{\hat{n} \cdot \nabla I_\nu}{\bar{a}} - \frac{H}{c} \left(\nu \frac{\partial I_\nu}{\partial \nu} - 3I_\nu \right) = -\kappa_\nu I_\nu + j_\nu$$

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Propagation &
Cosmic Expansion

Redshifting

Cosmological Dilution

Absorption

Emission

Simplifications – “Local” Approximation

1. Short timesteps ($\bar{a} = 1$)
2. Ignore cosmological redshift and dilution (may become important >50 Mpc)

$$\frac{1}{c} \frac{\partial I_\nu}{\partial t} + \frac{\hat{n} \cdot \nabla I_\nu}{\bar{a}} - \frac{H}{c} \left(\nu \frac{\partial I_\nu}{\partial \nu} - 3I_\nu \right) = -\kappa_\nu I_\nu + j_\nu$$

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Propagation &
Cosmic Expansion

Redshifting

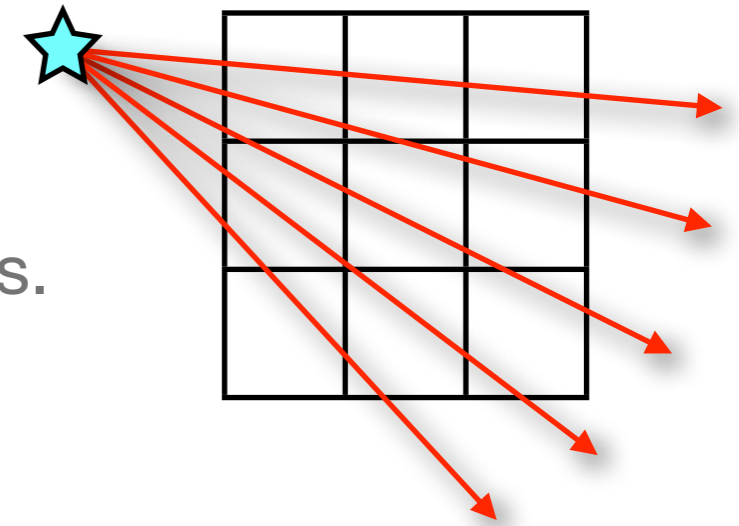
Cosmological Dilution

Absorption

Emission

RT Equation along a Ray

- Consider point sources of radiation
- Initially, the radiation flux is split equally among all rays.



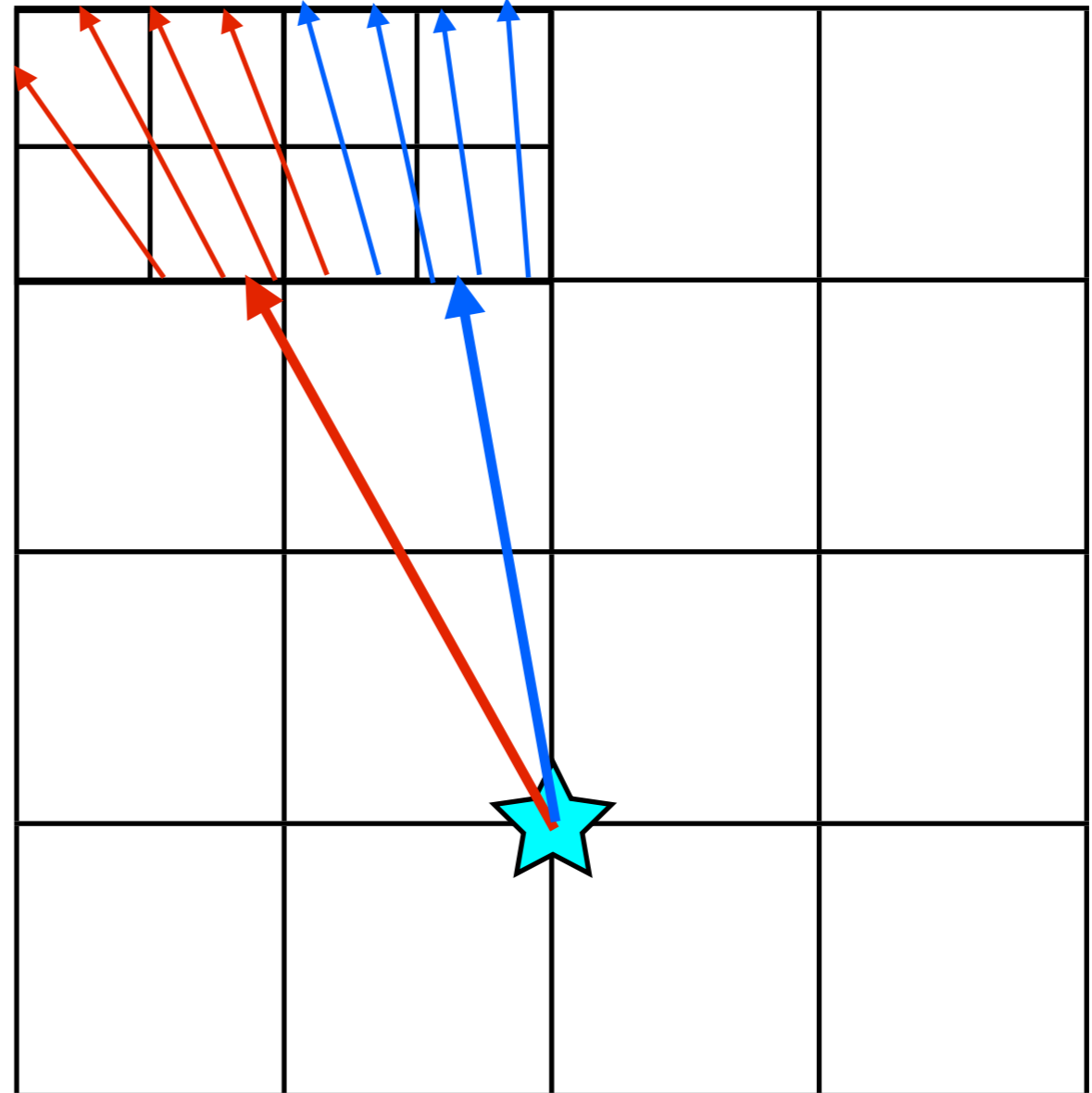
$$\frac{1}{c} \frac{\partial P}{\partial t} + \frac{\partial P}{\partial r} = -\kappa P$$

- P := photon flux in the ray

Adaptive Ray Tracing (Enzo+Moray)

Abel & Wandelt (2002)
Wise & Abel (2011)

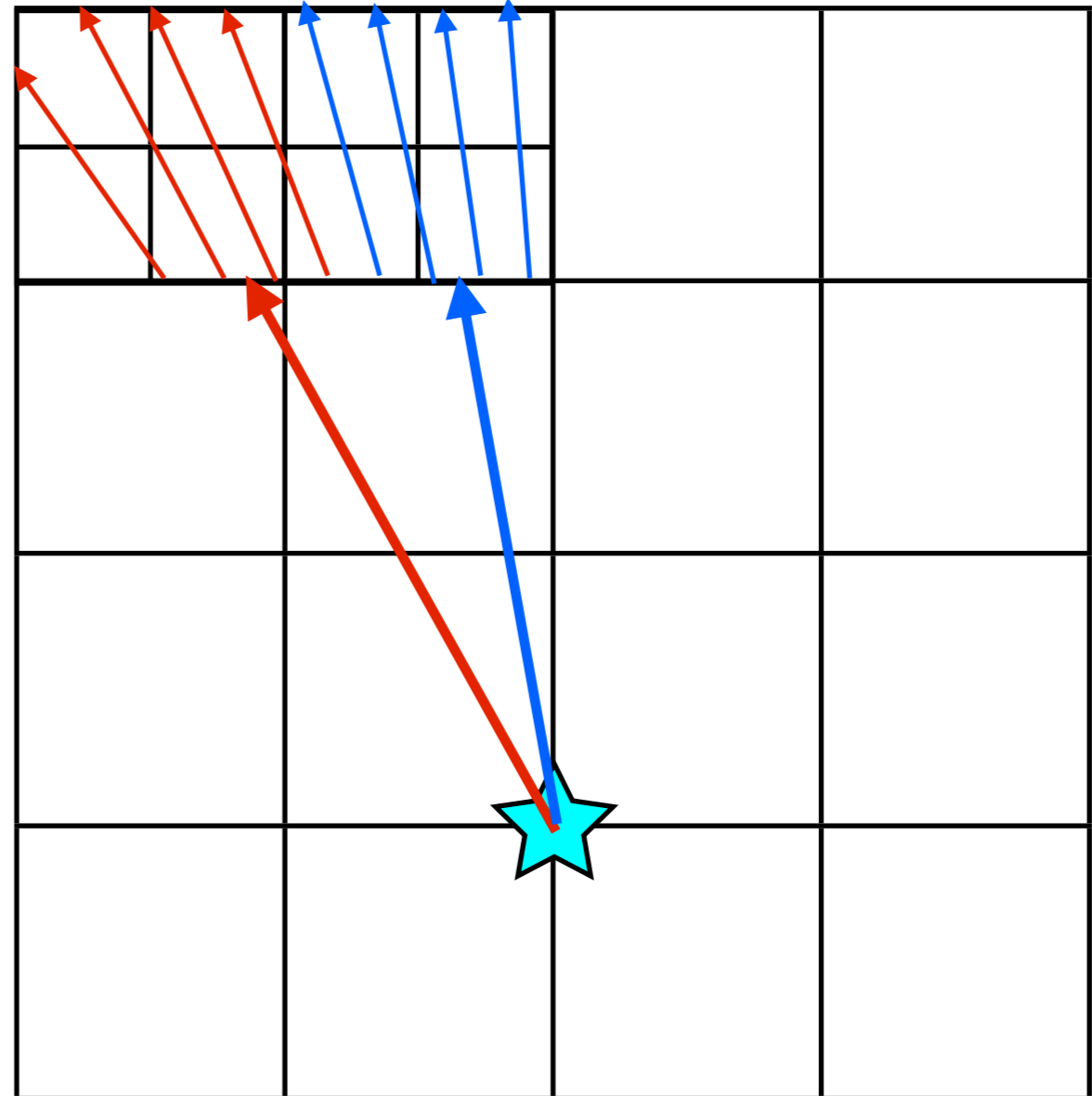
- Ray directions and splitting based on HEALPix (Gorski et al. 2005)
- Coupled with (magneto-) hydrodynamics of Enzo
- Rays are split into 4 child rays when the solid angle is large compared to the cell face area
- Well-suited for AMR
- Can calculate the photo-ionization rates so that the method is photon conserving.
- MPI/OpenMP hybrid parallelized.



Adaptive Ray Tracing (Enzo+Moray)

Abel & Wandelt (2002)
Wise & Abel (2011)

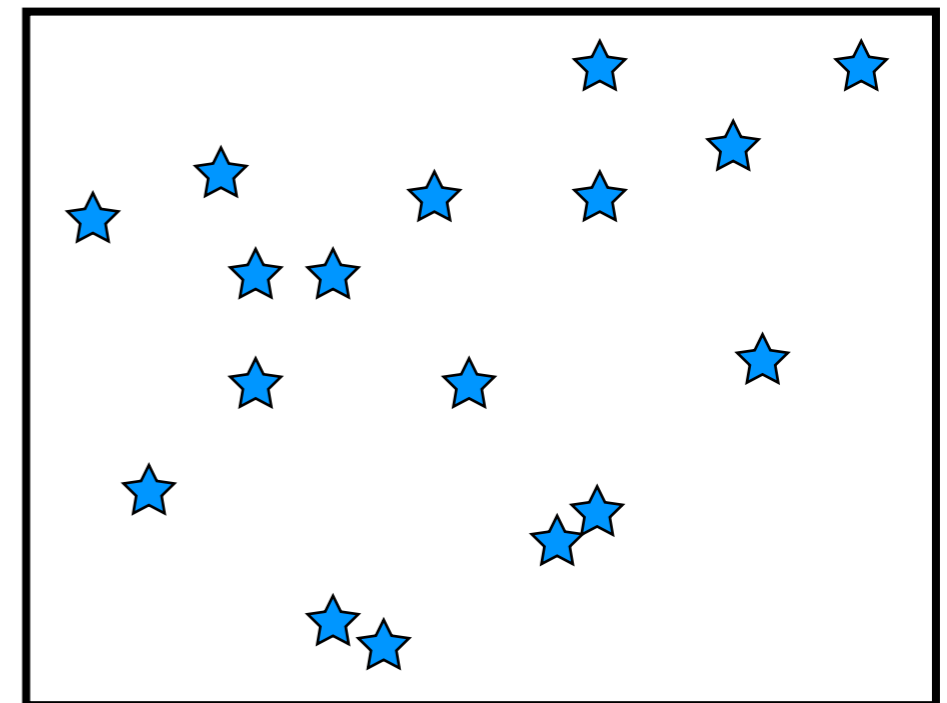
- H + He ionization (heating)
- X-rays (secondary ionizations)
- Lyman-Werner transfer (based on Draine & Bertoldi shielding function)
- Choice between energy discretization and general spectral shapes (column density lookup tables, see C²-Ray)
- See Mirocha+ (2012) for optimized choices for energy bins.
- Radiation pressure from continuum
- Choice between $c = A c, \infty$
- Can delete a ray when its flux drops below some fraction of the UVB for local UV feedback.



OVERCOMING $O(N_{\text{STAR}})$:: RAY / SOURCE MERGING

Okamoto et al. (2011)
Wise & Abel (in prep)

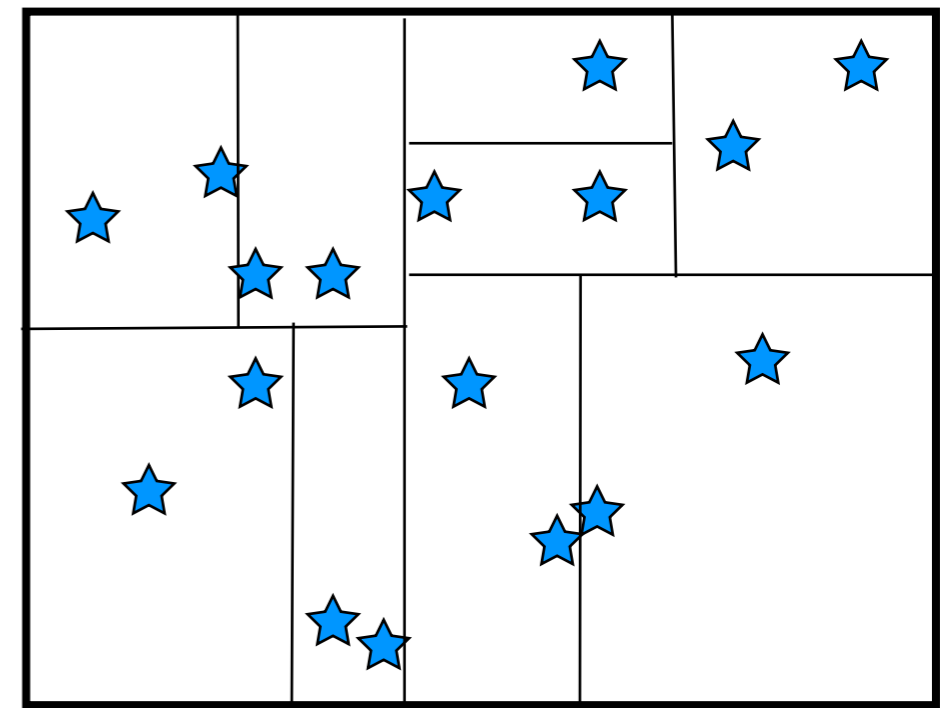
- Sources are grouped on a binary tree.
- On each leaf, a “super-source” is created that has the center of luminosity.
- After the ray travel $\sim 3-5$ times the source separation, the rays merge.
- Recursive.
- Have run simulations with 25k point sources.



OVERCOMING $O(N_{\text{STAR}})$:: RAY / SOURCE MERGING

Okamoto et al. (2011)
Wise & Abel (in prep)

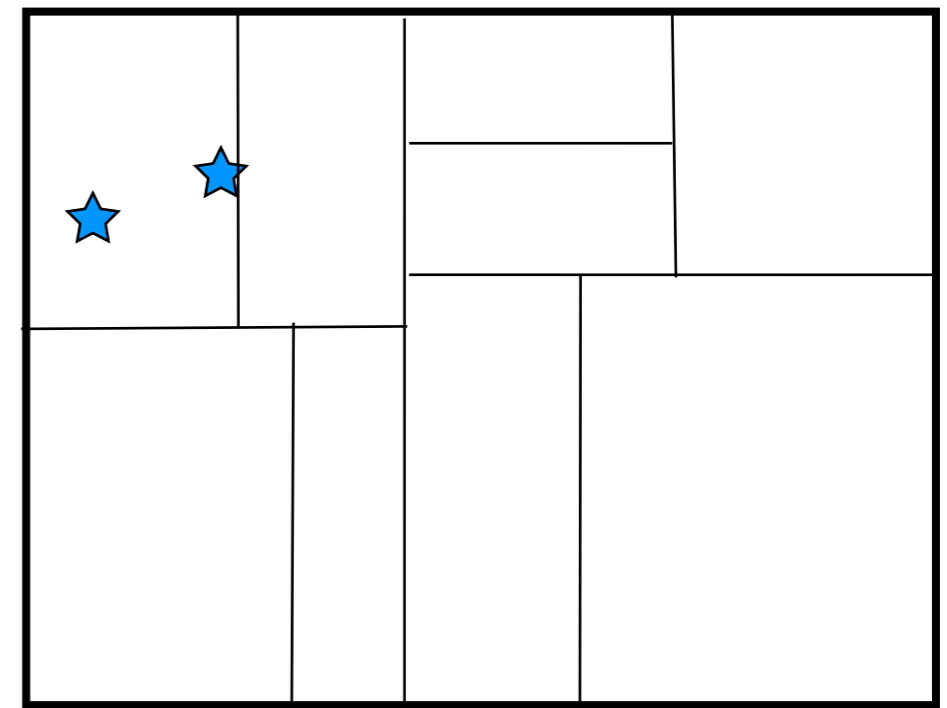
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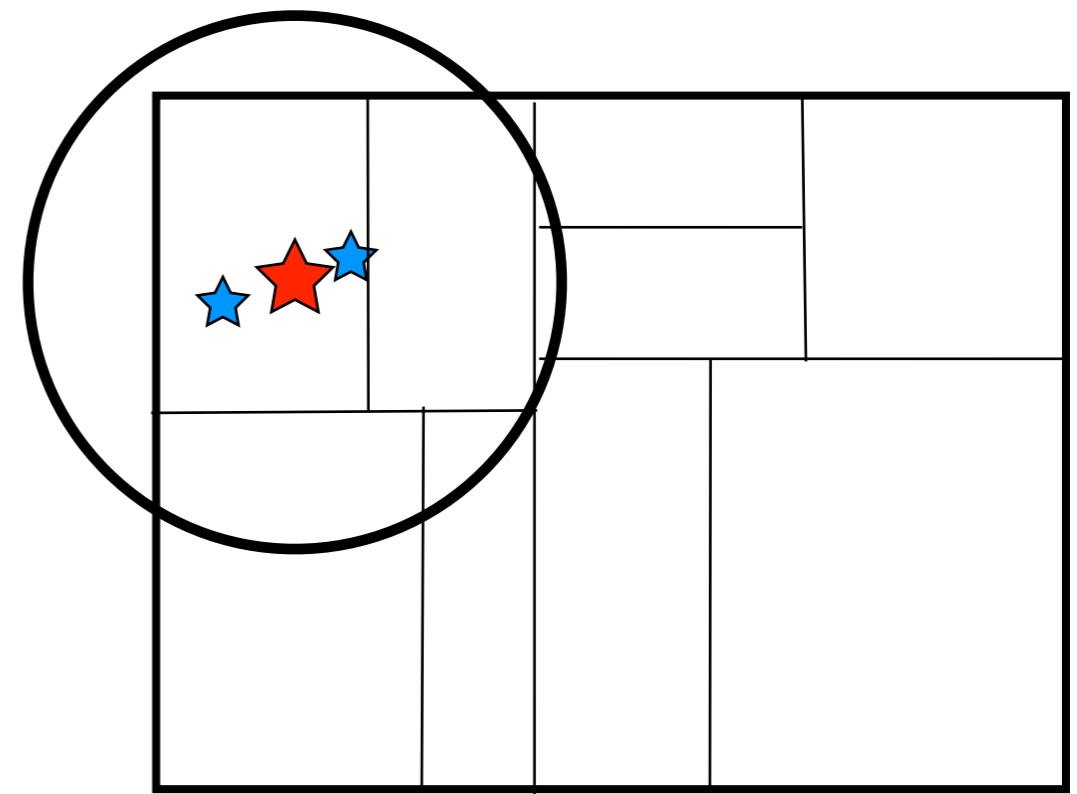
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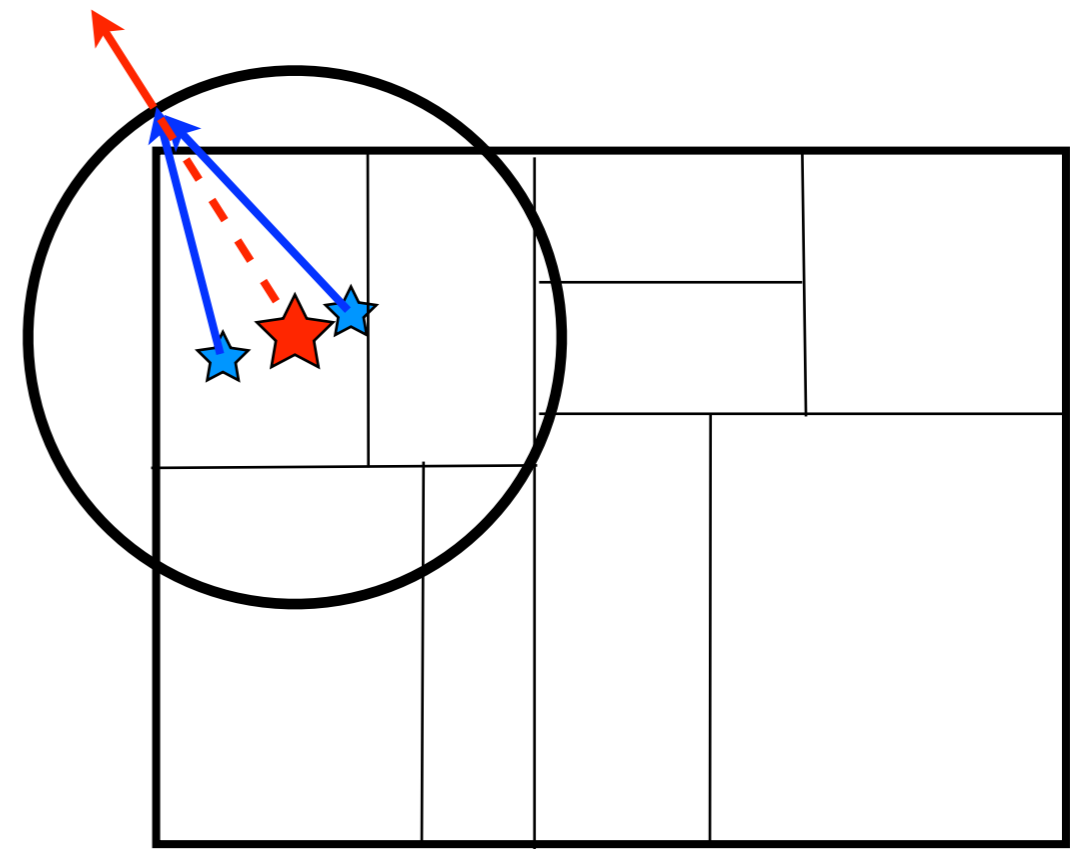
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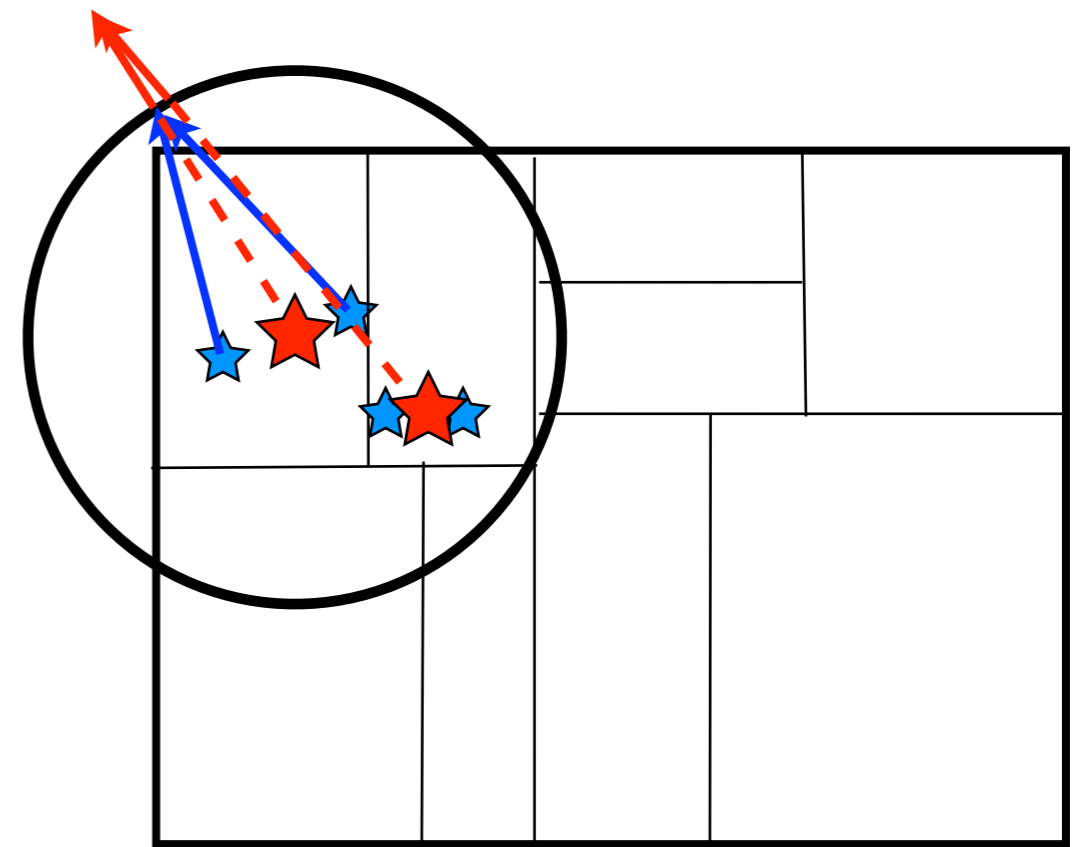
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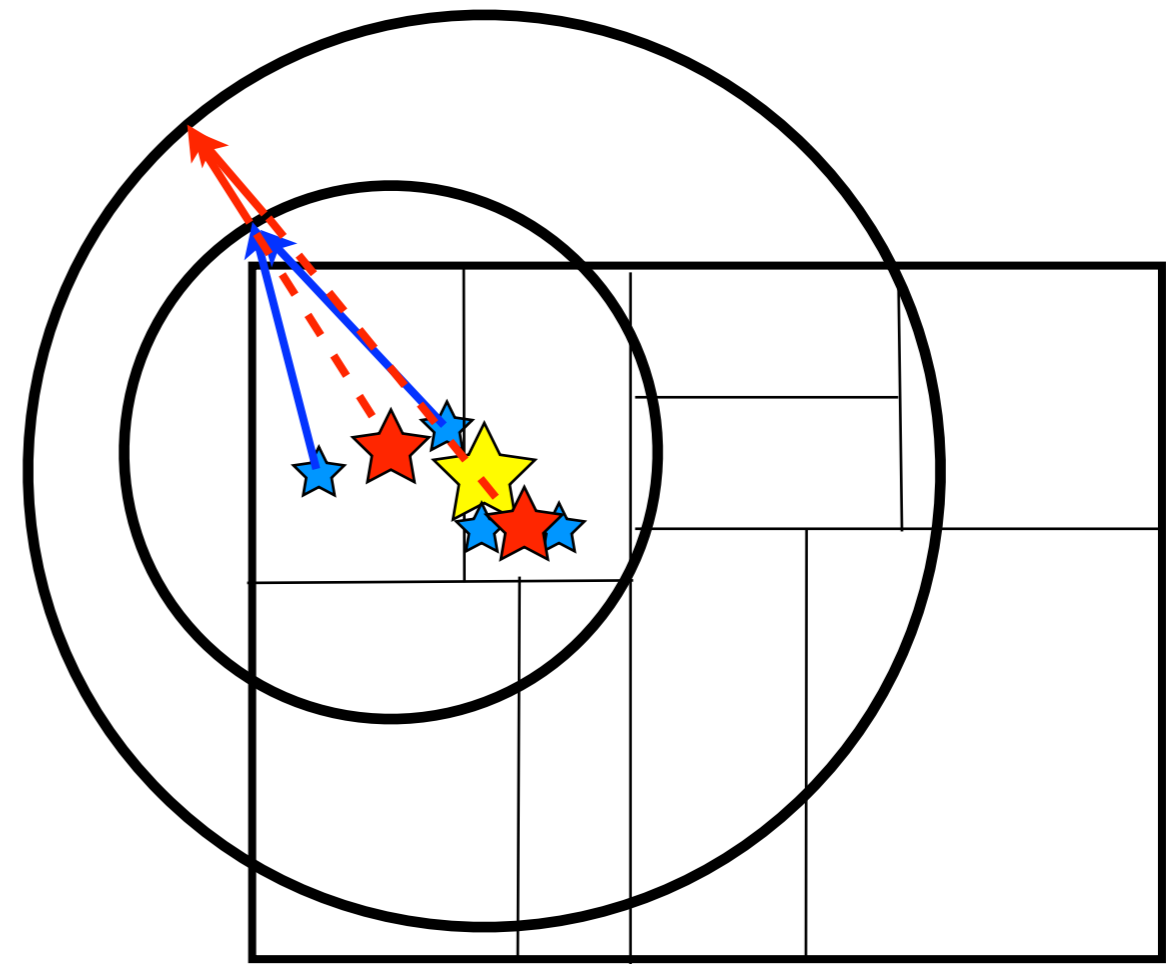
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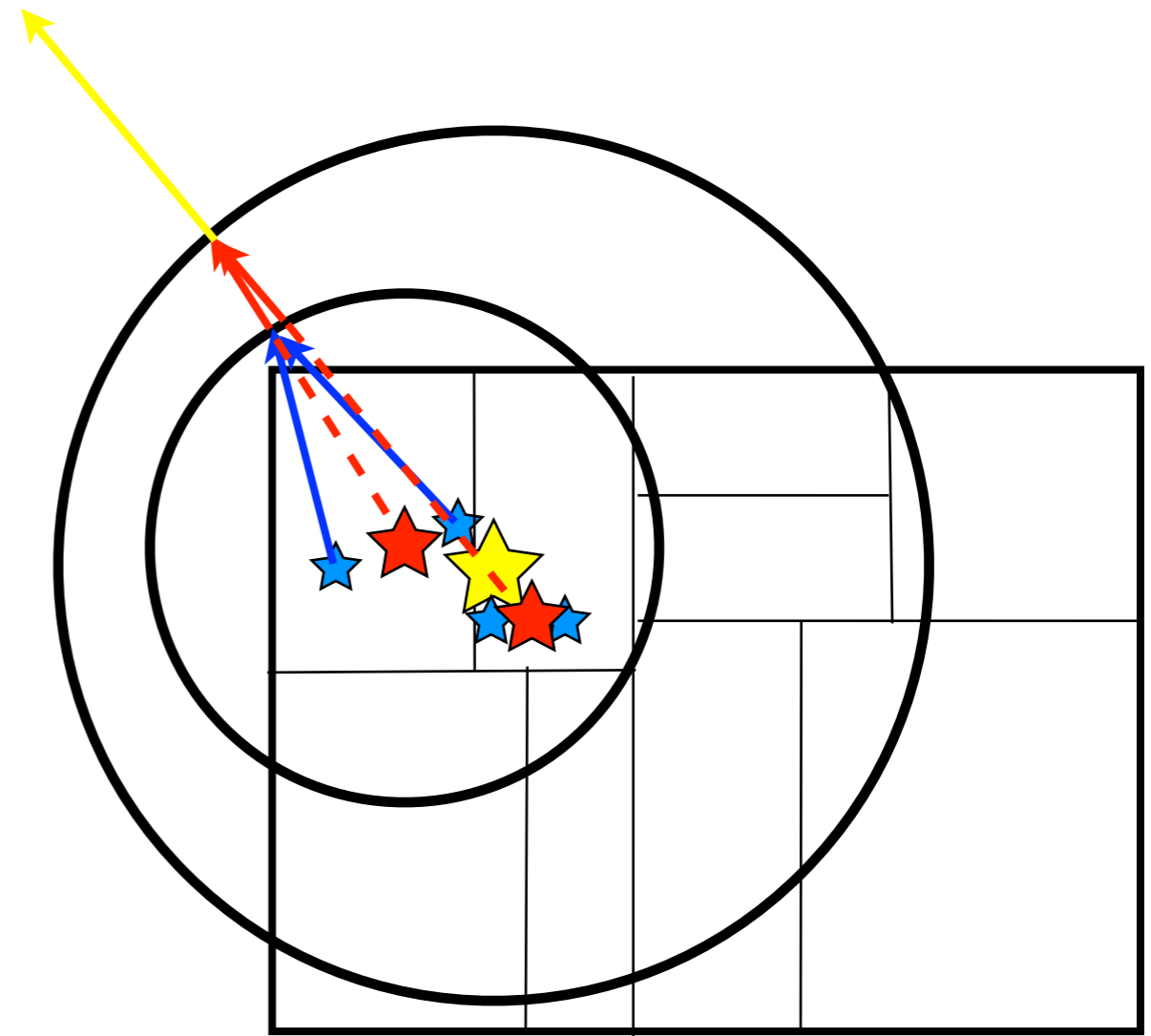
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+ Radiative Feedback

sapporo_cosmo/stars-rt.enzo

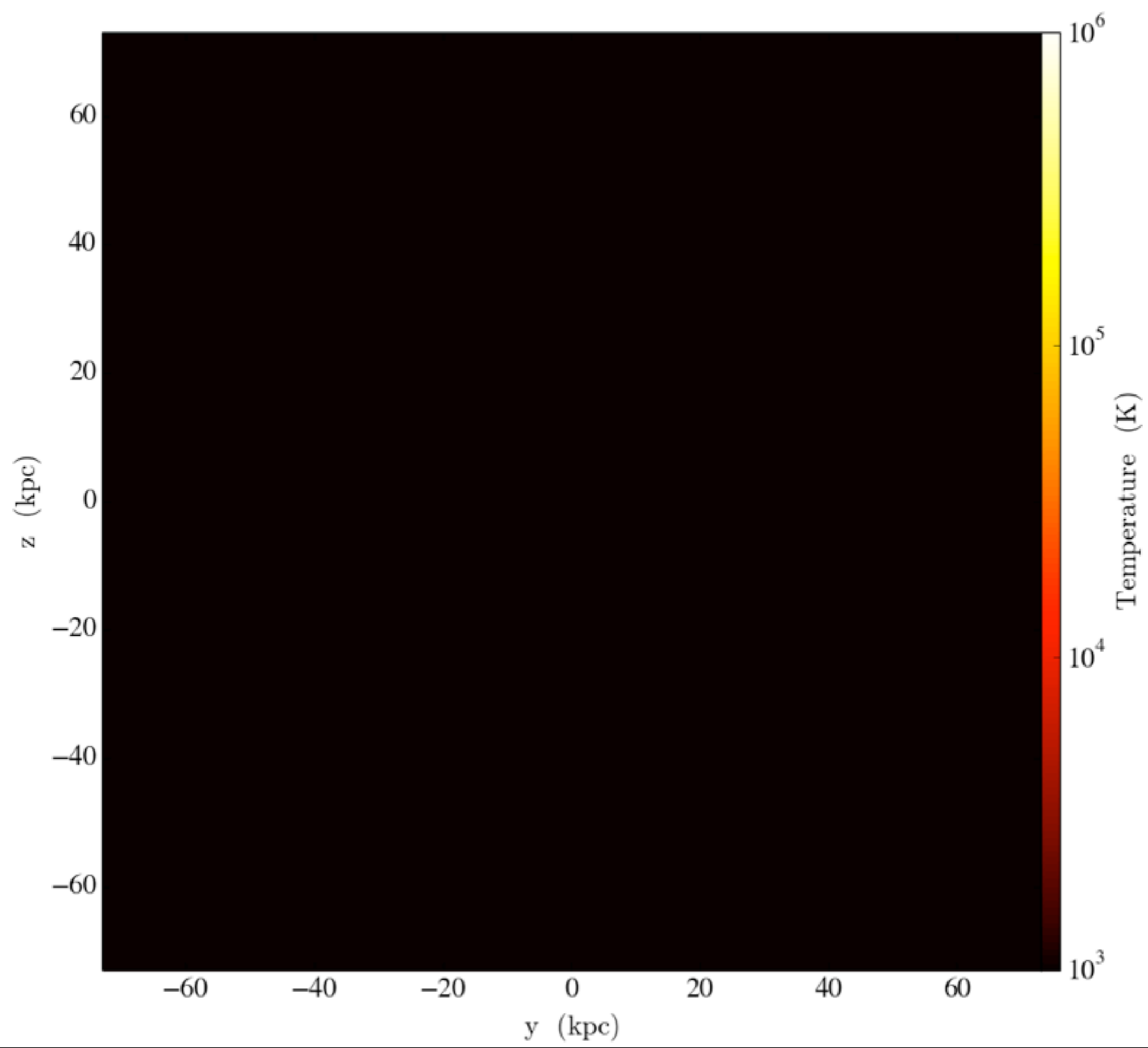
- Radiative transfer ON
- Minimum rays per cell (angular resolution)
- Hydrogen photo-ionization only
- Radiation periodic boundary
- Ray merging ON
- Ray merging radius (in units of separation of source pairs)

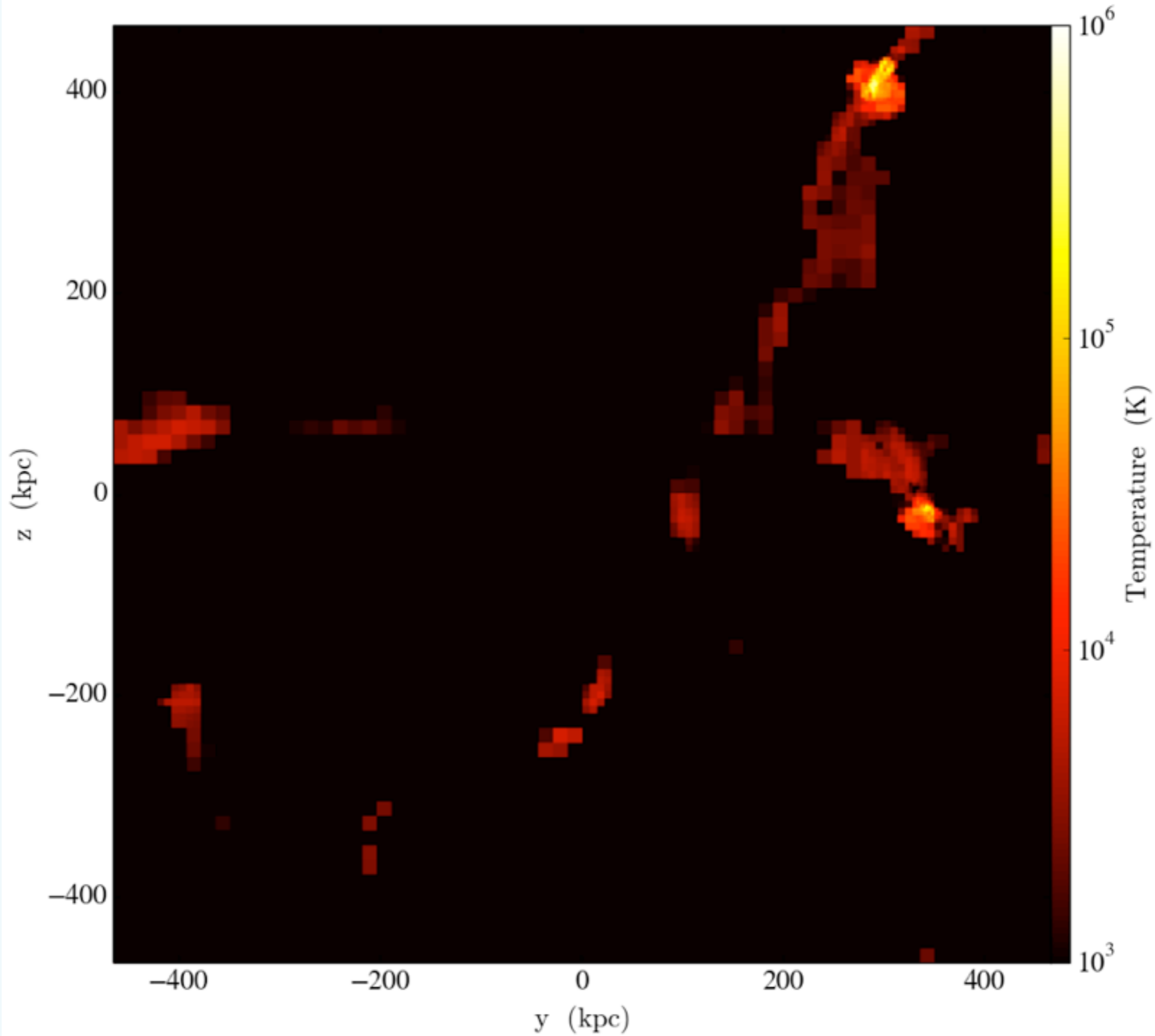
```
#
# Star formation and feedback parameters
#
RadiativeTransfer = 1
RadiativeTransferRaysPerCell = 3.100000
RadiativeTransferFluxBackgroundLimit = 0.01
RadiativeTransferInitialHEALPixLevel = 1
RadiativeTransferHydrogenOnly = 1
RadiativeTransferOpticallyThinH2 = 0
RadiativeTransferPeriodicBoundary = 1
RadiativeTransferAdaptiveTimestep = 1
RadiativeTransferSourceClustering = 1
RadiativeTransferPhotonMergeRadius = 3.0
```

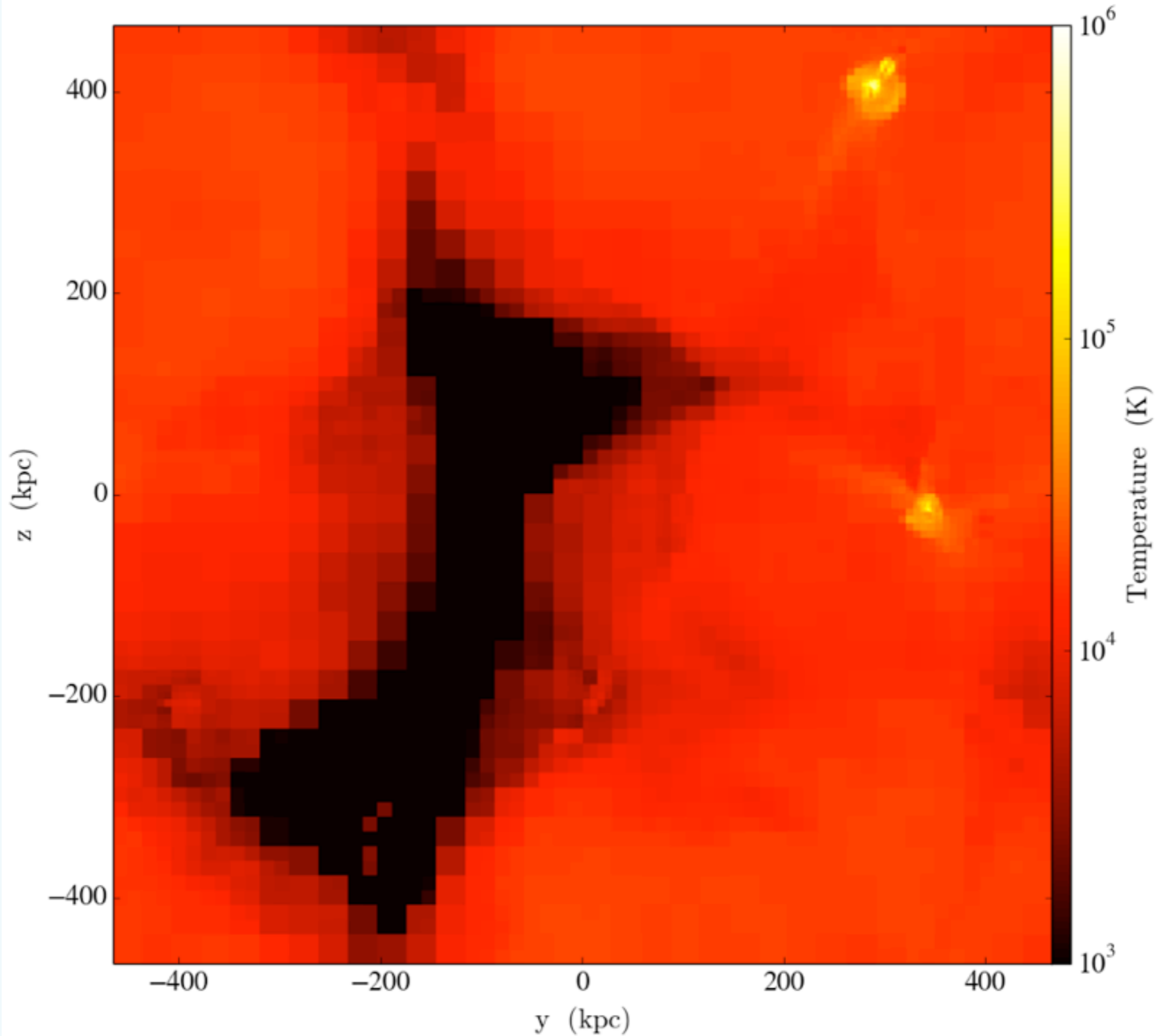
+ Radiative Transfer

- This simulation only runs to $z = 7$, so we can run this simulation.

```
cd ~/sapporo_cosmo
mkdir RT
cp stars-rt.enzo RT
cp sapporo_cosmo_nbody/Grid* sapporo_cosmo_nbody/Particle* RT
cp ~/enzo-stable/input/hm12_photorates.dat RT
cd RT
cp ~/enzo-stable/src/enzo/enzo.exe .
./enzo.exe -d stars-rt.enzo
```







Summary

- Today we have covered some advanced topics in cosmology simulations.
- Usually when doing research, it is best to introduce physics progressively to understand the effect of each physical process.
- We have compared the same cosmological volume with the following physics.
 - Adiabatic equation of state
 - + Radiative cooling (H, He) and an ultraviolet radiation background
 - + Star formation and supernova feedback
 - + Stellar radiative feedback, using adaptive ray tracing