

# 1 PROJECT ACHIEVEMENTS

“Galactic winds” are large-scale outflows of mass and momentum from galaxies, and are thought to originate from thermal pressure- or momentum-driven expansion of gas as a result of supernova explosions from the deaths of massive stars or other star formation-related feedback mechanisms. Almost all modern theories of galaxy formation invoke galactic winds to regulate the gas content of low-mass galaxies, keeping them faint and helping us to reconcile the meager abundance of dwarf galaxies relative to the number of low-mass dark matter halos expected from cosmological simulations. Understanding galactic winds through simulations is extraordinarily difficult as the hydrodynamics, radiative cooling, and other physics of the winds must be well-resolved (on  $\sim$  few parsec scales) everywhere in the flow that extends kiloparsecs above the galaxy before it merges with the circumgalactic medium. The linear dynamic range is therefore several up to  $\sim$  ten thousand, which nominally requires tens of billions of cells over the volume surrounding the galactic disk to simulate. Since the winds consist of a multiphase medium that includes hot and cold components outflowing at high velocities, capturing all relevant hydrodynamical processes in the wind is best addressed through enormous fixed-grid Eulerian simulation methods. Our 2017 INCITE project “Revealing the Physics of Galactic Winds with Petascale GPU Simulations” is specifically designed to test the physical mechanisms that launch galactic-scale outflows and shape their observed properties by leveraging the unique power of *Titan* and the cutting-edge technology of our GPU-native *Cholla* code to simulate winds in global simulations of isolated galaxies.

Semester 1 of our project (Jan-June 2017) resulted in several notable achievements. First and foremost, the project has lead to the single largest hydrodynamic simulation of an isolated galaxy (and associated galactic outflow) ever performed to our knowledge. With a volume containing over 17 billion cells, our simulation dwarfs others of this type by over an order of magnitude in computational elements – a feat uniquely enabled by *Titan*. In order to perform this simulation, the culmination of our work in Semester 1, our project utilized 8192 GPUs on *Titan* for a total of  $\sim$ 8 million core-hours. Our project activities in Semester 1 involved careful preparation for this simulation, including the generation and testing of specialized initial conditions featuring a stable gaseous disk galaxy in hydrostatic equilibrium, an implementation of a supernova feedback scheme to drive a galactic wind, and the improvement of performance, hydrodynamics algorithms, and other physical modules available in our *Cholla* code. Each of these accomplishments is described in further detail in the sections below. These significant achievements now position us well to explore and characterize the physics of galactic winds through petascale simulations on *Titan*, as described in the Project Plans document.

## 1.1 Significance of Accomplishments to Date

Our original INCITE proposal focused on the role that radiatively-cooling galactic winds may play in galaxy evolution. While observations routinely show the presence of a fast ( $v > 1000$  km/s) yet cool ( $T \sim 10^4$  K) component of winds being driven out of galaxies with high rates of star formation, numerical simulations of galaxies have thus far failed to reproduce their observed properties. Cosmological simulations lack the resolution required to capture correctly the multiphase structure of the winds, and high-resolution simulations of isolated disks have lacked the volume to track gas once it has been driven out of the galaxy. Recent theoretical work (Thompson et al. 2016) has suggested the cold components of the wind originate via radiative cooling if the wind is sufficiently dense such that its cooling time is shorter than the advection time of the wind as it leaves the system. Our project aims to bridge the gap between previous cosmological and isolated disk simulations by producing high resolution simulations of disk galaxies that span a sufficient volume from the wind-generation region within the disk to demonstrate whether starburst-driven winds can cool radiatively and give rise to the observed cold wind components.

In order to carry out the simulations described in our proposal, a number of preparatory efforts were completed in the first semester. In Tables 1 and 2, we list the research objectives and milestones from our program’s original INCITE proposal. We expand on the current status of each objective and related achievements in the following subsections.

**Table 1: Completed INCITE Proposal Research Objectives**

<b>RO.A</b>	Simulate galactic outflows with numerical models that allow for supersonic wind velocities (COMPLETE).
<b>RO.B</b>	Quantify the importance of radiative cooling for the multiphase structure of observed galactic outflows (PARTIALLY COMPLETE).

**Table 2: Completed INCITE Proposal Research Milestones**

Milestone	Objective
<i>Semester 1</i>	
<b>RM.A</b>	Create and test initial conditions for galactic disk simulations (COMPLETE). RO.A
<b>RM.B</b>	Implement and calibrate feedback model for driving galactic outflows (COMPLETE). RO.A
<i>Semester 2</i>	
<b>RM.C</b>	Model the multiphase structure and radiative cooling of galactic outflows on $\sim 10\text{kpc}$ scales (PARTIALLY COMPLETE). RO.A, RO.B
<i>(Originally Planned in) Semester 3</i>	
<b>RM.D</b>	Determine the role of full three-dimensionality on the velocity and density structure of galactic outflows (PARTIALLY COMPLETE). RO.A, RO.B

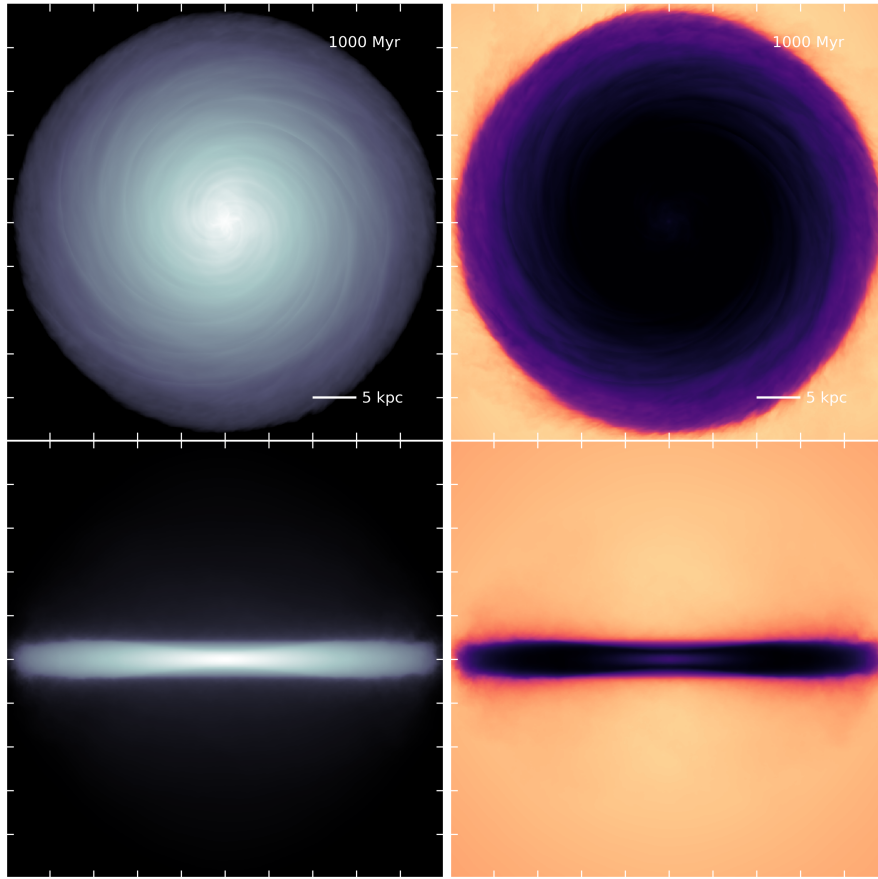
**Table 3: Completed Research Simulations**

Simulation Type and Details		Objective	Resolution	Titan Nodes	Titan Core Hours
Semester 1					
RS.A	Initial Conditions Test Simulations	RO.A	$N = 1024^3$	512	0.5M
RS.B	Feedback Model Calibration Simulations	RO.A	$N = 1024^2 \times 2048$	1024	1.5M
Semester 2					
RS.C	Adiabatic Wind Simulation	RO.A, RO.B	$N = 2048^2 \times 4096$	8192	11M

### 1.1.1 Research Milestone A: Create and test initial conditions for galactic disk simulations

A first major accomplishment during Semester 1 of our project is the completion of Research Milestone A: the successful creation of an initial conditions generator for our global galactic disk simulations. The goal of the ICs generator was to create realistic gaseous disks with correct dynamical properties set to match real galaxies, while ensuring numerical stability in simulations with billions of cells. In the global disk models we simulate, the dynamics of the model galaxies are set by a background gravitational potential that consists of a dark matter halo with a Navarro-Frenk-White density profile and an exponential disk

representing the gravitational field generated by the gaseous and stellar components of the galaxy with a Miyamoto-Nagai potential. Given a chosen equation of state for the interstellar gas in the disk, the equation of hydrostatic equilibrium is solved by balancing the vertical gravitational force from the potential and the vertical pressure gradient generated by the density and pressure profile everywhere in the disk. The gas is initialized to rotate differentially, with the radial velocity gradient balancing the radial pressure gradient resulting from the surface mass density distribution of the disk. Outside the disk a spherical hot gaseous halo is added, initialized in hydrostatic equilibrium with the background potential to prevent the external gas from collapsing onto the disk. The initial conditions generator has been implemented as a module in our code *Cholla*, such that the disk galaxy ICs can be selected at runtime without re-compiling the code. This feature enables additional flexibility in testing and validating physics models in idealized simulations before applying them to our global disk models.



**Figure 1.** Isolated Milky Way-like disk galaxy after 1 Gyr of evolution, simulated with  $1024^3$  cells. Shown are the density (left) and temperature (right) projected in the x-y (upper) and x-z (lower) planes. The model includes a background gravitational potential for the dark matter halo and disk, a gaseous disk with an exponential surface mass density profile, and a hot gaseous halo in hydrostatic equilibrium. To test for the thermal and dynamical stability of the initial conditions, the wind driving mechanisms have been turned off. The galaxy is very stable over billion year timescales, more than sufficient for simulations of the launching of galactic-scale winds. The simulated evolution of a smaller, M82-like galaxy shows comparable excellent performance. These initial conditions complete Research Milestone A listed in Table 1.

We have used the initial conditions generator to create two carefully crafted galaxy models representing a Milky Way-like galaxy and a mimic of the nearby starburst galaxy M82 with a well-studied galactic wind. To test for thermal and dynamical stability, we have performed calibration simulations that evolve these galaxy models for many rotational periods in isolation and without including an engine for driving galactic winds. A snapshot of the Milky Way model after 1 Gyr of evolution is shown in Figure 1. The left panels show projected gas density in the x-y and x-z planes, while the right panels show projected gas temperature. After many millions of years of evolution, the differential rotation of the gas in the disk leads to the minor spiral features that can be seen in the x-y density projection. A small amount of turbulence is generated on the surface of the disk due to the shear between disk and halo gas (only the disk gas is given an initial rotation). Otherwise, the disk and halo look almost identical to their initial setup and validate the physical realism of the initial conditions generator. Adiabatic simulations of the Milky Way and M82 initial conditions have demonstrated that they are both stable for at least a gigayear, far longer than the duration of our galactic wind simulations. Compared to similar projects in the literature, our initial conditions are considerably more realistic (see e.g. Cooper et al. 2008, Fielding et al. 2017). Most models simply use an isothermal disk with no halo gas, or an isothermal gaseous halo out of hydrostatic equilibrium – we have verified in experimental calculations that simple isothermal halos lead to unphysical accretion onto the central disk, and that capturing the effects of halo gas swept by the wind requires physically realistic galaxy models like what we employ. We view these initial conditions as a significant advancement in the physical realism of isolated galaxy models and the developmental work conducted through this program necessary for ensuring numerically stable galaxy models in simulations using many billions of cells.

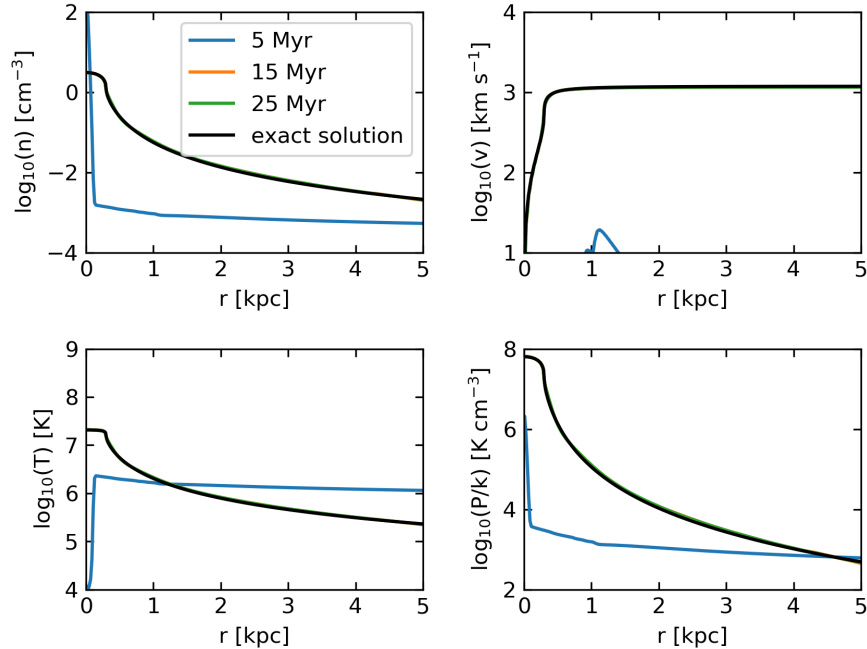
### *1.1.2 Research Milestone B: Implement and calibrate feedback model for driving galactic outflows*

A second major accomplishment of our program is the completion of Research Milestone B: an original implementation of a supernova feedback model that will allow us to test the premise that supernova-driven winds can cool radiatively at large radii from the disk. The theoretical framework for modeling galactic winds analytically harkens to Chevalier & Clegg (1985; CC85), who computed the radial density, velocity, and temperature profiles of a centrally-driven outflow in spherical symmetry. In CC85, the supernova feedback from the deaths of massive stars leads to an input of mass and energy at the center of the galaxy in a “gain region”, resulting in a spherically-expanding flow of gas that eventually accelerates to a supersonic wind velocity. The CC85 model considers neither the potential radiative cooling of the wind nor the effect of a gravitational potential on the outflow dynamics (physics we include in our simulations). Despite the simplicity of the CC85 model, X-ray observations indicate that the model provides a good fit for the central region of the superwind in M82 (Strickland & Heckman, 2009). More recent models have extended the CC85 model to include the effects of both gravity and radiative cooling (Wang 1995, Thompson 2016). These models suggest that given sufficient mass-loading of the hot wind, dramatic cooling can take place at radii 1 - 10 kpc from the wind-generation radius, which could account for the fast-moving, cool gas observed around starburst galaxies. The simulation of galactic-scale winds that led to the *ab initio* formation of radiatively cooling outflows would represent a significant scientific result in astrophysics, and serves as strong motivation for the prior and continuing work of our INCITE program.

In order to test effectively this picture for the physical origin of cold multiphase material in galactic winds, we have created a supernova feedback model that matches the CC85 model as closely as possible. Our current feedback model assumes a constant rate of mass and energy injection within a starburst radius of the gain region, with the mass and energy injection set by three parameters: the star formation rate, the mass-loading factor, and the supernova thermalization efficiency. Our initial models use consistent values for the past star formation rate, mass-loading, and supernova thermalization efficiency as inferred from observations of M82. The resulting wind can then be compared against the theoretically-calculated model,

as shown in Figure 2.

Our fiducial feedback model used in the simulations of an M82-like galaxy uses a star formation rate of  $20 M_{\odot}/\text{yr}$ , a mass-loading factor of  $\beta_{\text{hot}} = 1.4$  (the ratio of the mass in the hot wind to the mass expelled from supernovae into the interstellar medium), and a supernova thermalization efficiency of  $\alpha = 0.9$  (describing the fraction of supernovae energy thermalized into the internal energy of interstellar medium gas). Figure 2 displays the density, velocity, temperature, and pressure of the resulting wind as a function of radius. Plotted in Figure 2 are both the exact CC85 solution (black line), as well as the fluid properties measured along the  $z$ -axis of one of our galactic-scale outflow calibration simulations after 5 (blue), 15 (orange), and 25 Myr (green). In these simulations, we initialize the supernova feedback after 5 Myr, and the outflow quickly evolves from the initial conditions reflecting the structure of the gaseous disk and halo (blue line) to radial profiles at 15 and 25 Myr (shown as the orange and green lines) that match the CC85 solution (black) extremely closely. Indeed, the evolved models in Figure 2 are difficult to see because they lie *directly* in agreement with the exact solution, demonstrating that within 10 million years, this feedback model has set up a stable wind with outflow parameters that match those expected from CC85 (note that this is a simulation *without* radiative cooling). Our results represent achievements both for the CC85 analytic model and our code *Cholla*, and complete Research Milestone B. In Year 2, we will continue our on-going developmental work to extend our feedback model to incorporate more realistic versions of supernova feedback (see Project Plan).



**Figure 2.** Radial density (upper left), velocity (upper right), temperature (lower left), and pressure (lower right profiles) of the analytical Chevalier & Clegg (1985; CC85) model for the M82 galactic wind, and values measured from our 512x512x1024 test simulation with the *Cholla* code (colored lines). Although the initial conditions of the simulation start far away from the CC85 model (blue lines), the outflow properties quickly converge to the CC85 solution and maintain the solution over 15 (orange) and 25 (green) Myr timescales.

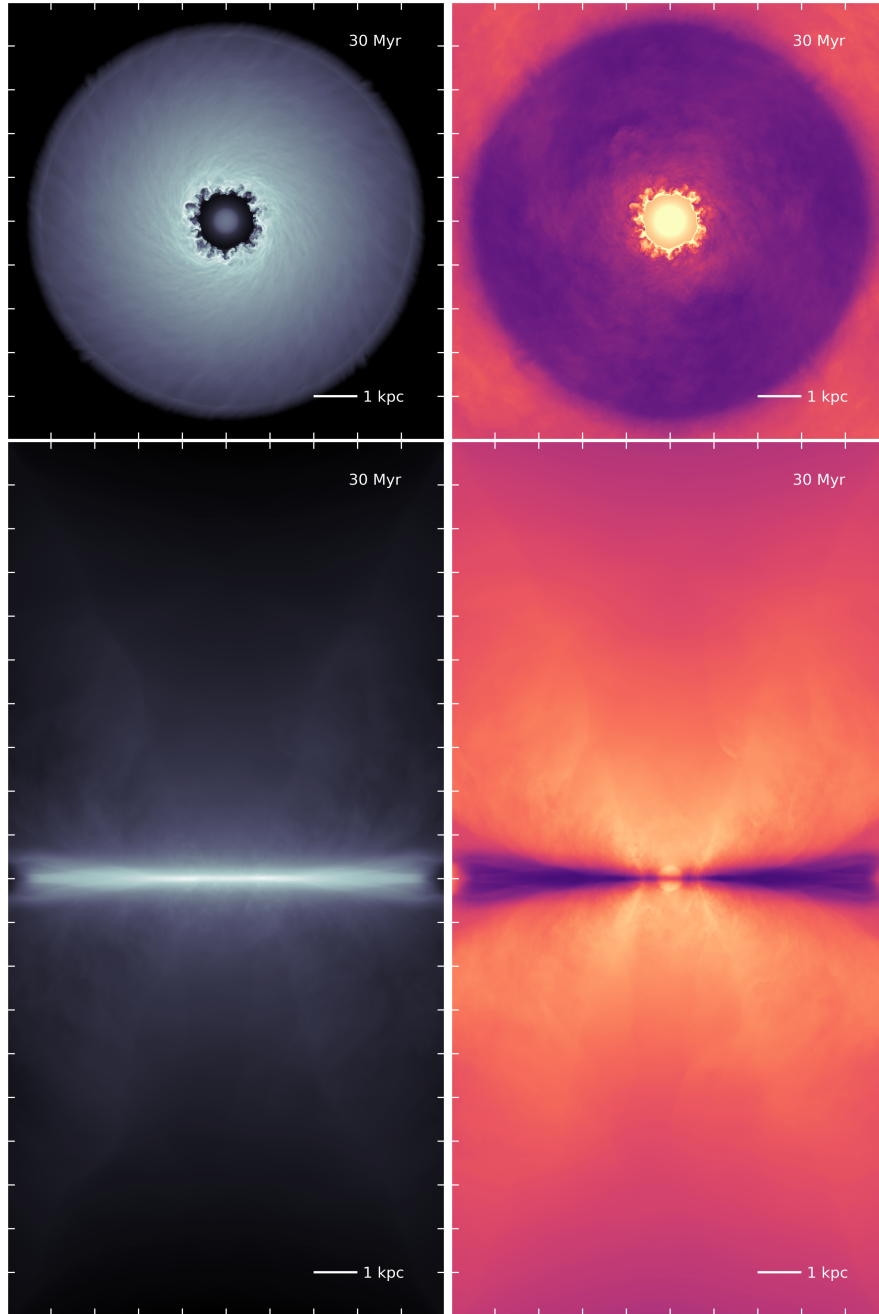
As a control for our radiatively-cooling wind simulations, we have run a production-scale adiabatic simulation with our fiducial feedback model parameters. Our production simulations are run on grids with  $2048 \times 2048 \times 4096$  cells, in a domain with dimensions  $5 \text{ kpc} \times 5 \text{ kpc} \times 10 \text{ kpc}$ , giving a resolution of  $\Delta x = 4.9 \text{ pc}$  at all locations in the simulation volume. Density and temperature projections for this adiabatic control simulation after 30 million years of evolution are shown in Figure 3. The biconical outflow driven by the central energy and mass input is clearly visible in the temperature projection, as is the fall-off in temperature with radius due to the expansion of the flow. The energy injection has resulted in the blow-out of all of the gas from the central region of the disk. This simulation represents by far the largest hydrodynamic simulation of an isolated galaxy ever performed, and its number of computational elements tops that of even large cosmological simulations (e.g. the IllustrisTNG simulation, see Nelson et al. 2017, which has  $\sim 15.6$  billion hydrodynamic particles, vs. our  $\gtrsim 17$  billion cells). Thus, despite the fact that this calculation is merely our control simulation, it represents a major achievement and technological milestone for our program. An advantage of our current simple feedback scheme is that it allows us to easily adjust the three feedback model parameters (star formation rate, mass-loading, and thermalization efficiency) to determine what range of parameters lead to galactic outflows that can cool on large scales. With our remaining 2017 allocation, we will be able to perform three production simulations with radiatively cooling physics that will explore the range of necessary mass-loading in order to enable the development of cold multiphase components in the galactic-scale outflows (see Project Plan for details).

#### *1.1.3 Research Objective A: Simulate galactic outflows with numerical models that allow for supersonic wind velocities*

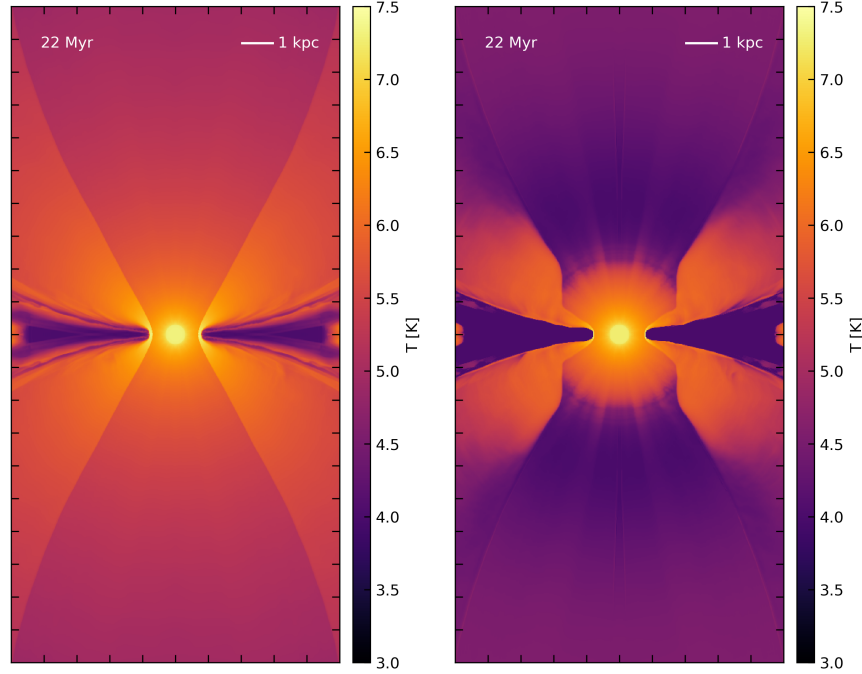
With the completion of Research Milestones A and B in Semester 1, we have achieved Research Objective A of our INCITE program: to simulate galactic outflows with numerical models that allow for supersonic wind velocities. While theoretical models had indicated that these starburst-driven winds should achieve supersonic velocities, the planar geometries employed in previous studies prevented winds from developing a sonic point (see discussion in Martizzi et al. 2016). By simulating winds on a global scale that allow for the outflows to diverge geometrically and develop a sonic point, we have demonstrated that winds achieve supersonic velocities and that in scenarios where the injection rates can be well-approximated by the CC85 model the large-scale features of those winds can be well-approximated by the analytical CC85 theory. We now turn to a discussion of the radiatively-cooling wind models that are the focus of our research program.

#### *1.1.4 Research Milestone C: Model the multiphase structure and radiative cooling of galactic outflows on $\sim 10 \text{ kpc}$ scales*

Our 2016 INCITE proposal devoted Semester 2 to achieving Research Milestone C. As we are only a few weeks into Semester 2, we do not yet have most of the results, but we do have some early indications that the predictions of the theoretical models with radiative cooling will be born out in our production simulations. Figure 4 shows the temperature in slices through the x-z plane for a calibration simulation (resolution  $512 \times 512 \times 1024$  cells) with and without radiative cooling (left and right, respectively). Both snapshots show the simulations after 22 million years of evolution. While the cold gaseous disk is clearly visible on both simulations, the simulation with cooling also shows a large amount of gas between 2 - 5 kpc that has cooled to  $10^4 \text{ K}$  where the physical cooling mechanisms become inefficient. Early analysis of this simulation suggests that the velocities of this cool gas may be consistent with observations, which would make these the first simulations to reproduce successfully gas in this phase in large-scale galactic winds. The exciting indications of successful radiatively cooling wind simulations motivate the remainder of our calendar year 2017 work, and the renewal of the program into 2018 as outlined in the Project Plan document.



**Figure 3.** Global disk simulations of an M82-like galaxy at high resolution (2048x2048x4096 cells) using adiabatic gas physics, the largest simulation of an isolated disk galaxy ever performed (to our knowledge). Shown are the density (left) and temperature (right) projections in the x-y (upper) and x-z (lower) planes. The gas temperatures range from  $10^4$  K (purple) in the cool disk to  $10^7$  K in the hot outflow (peach). The simulations include a model for injecting mass and energy associated with supernovae feedback at the center of the system, driving a large-scale galactic outflow. By performing a global simulation the three-dimensional nature of the wind is captured, allowing the wind to develop a sonic point and become a supersonic flow outside of the disk. The outflow precisely matches the wind structure of the Chevalier and Clegg (1985) analytical model (as demonstrated in the Figure 2 above) that reproduces the bulk properties of the galactic outflow in M82.



**Figure 4.** Initial results from global disk simulations, comparing adiabatic (left) and radiatively-cooling (right) gas. Shown are temperature slices of the x-z plane at  $y=0$  for a  $512 \times 512 \times 1024$  simulation of an M82-like galactic outflow. Given the supernova feedback parameters assumed, the Thompson et al. (2016) analytical wind model would predict that the galactic outflow should cool radiatively on a timescale shorter than the wind advection timescale across the simulation volume. Indeed, when radiative cooling is included, the outflow cools and demonstrates that the Thompson et al. (2016) explanation for the origin of cold absorbers in galactic outflows is plausible. With this important demonstration achieved, our program will now perform these simulations at higher resolution and with more realistic supernovae feedback modeling.

We are currently finalizing the feedback model parameters for our production-scale radiative cooling wind simulations. Once we have decided on the appropriate physical parameters, we will run three production simulations with radiative cooling that will be compared with the adiabatic simulation presented in the previous section and thereby allow us to definitively answer the question posed by our Research Objective B: Quantify the importance of radiative cooling for the multiphase structure of observed galactic outflows. These production simulations will exhaust the remainder of our 2017 core-hour allocation, and set the stage for our work in 2018.

## 1.2 Allocation Use

As of July 25th, our project has used 8.14 million core-hours, of the 46 million core-hours we were allotted for Year 1. This burn rate follows closely the original plans in our 2016 INCITE proposal, and we have been able to reprioritize and reach production simulation capability more quickly than first planned. In particular, our calibration simulations were more efficient than initially anticipated, which resulted in our usage for Semester 1 totaling  $\sim 1.5$  million hours, rather than the 5 million we projected in the proposal. The large calibration simulations consisted of two  $1024^3$  simulations, each run on 512 GPUs, and a



$1024 \times 1024 \times 2048$  simulation run on 1024 GPUs. The first two were tests of the stable Milky Way and M82 initial conditions (such as the simulation shown in Figure 1). The third, larger calibration simulation was a test of the supernova feedback model and wind generation scheme for the adiabatic model. The initial conditions test simulations took only  $\sim 200,000$  core-hours, as the Courant condition in the simulations is not taxed by the presence of very hot ( $T > 10^7$  K) gas. In contrast, the similar simulation including galactic-scale winds required approximately  $\sim 1$  million core-hours owing to the presence of very hot gas and a correspondingly shortened simulation timestep.

In the course of creating and testing our initial conditions and supernova feedback schemes, we have run many smaller (16 - 256 GPUs) test simulations, but these have not contributed significantly to our allocation usage. We anticipate that we will continue to run these small test simulations throughout the first half of Semester 2, as we finalize the parameters for the remainder of our Year 1 production simulations. The majority of time spent thus far was used on the first of our Production Simulations, with the remaining simulations scheduled to be run in Semester 2 in keeping with our original proposal. Each production simulation will be run in a volume containing  $2048 \times 2048 \times 4096$  cells, and will be run on 8192 GPUs. The first of these production simulations, shown in Figure 3, will take a total of  $\sim 10$  million core-hours (it is currently about 70% complete). Based on this simulation, we anticipate running an additional three production simulations in Semester 2, ideally between August and October. The remaining three simulations will include the effects of radiative cooling on the outflow, and will differ in the parameters of the supernova feedback in order to test the conditions under which large-scale cooling does and does not occur.

### 1.3 Application Parallel Performance

Our primary tool, the hydrodynamics code *Cholla*, was built natively to run on many NVIDIA GPUs in parallel. As we have demonstrated using the unique scale of *Titan*, our *Cholla* code maintains excellent weak scaling to the entire system. Keeping the number cells per GPU fixed, our simulation timesteps only take about 50% longer when running on 8192 GPUs vs. 16. The modest weak scaling loss owes entirely to MPI communications, which are well-optimized but imperfect. We have not encountered any significant technical challenges in scaling *Cholla* from dozens to thousands of *Titan* nodes, a testament to both the infrastructure design of the *Titan* system and our engineering of the *Cholla* code. As the *Cholla* code was being built great care was taken to optimize it for the GPU architectures, but register pressure on the K20's currently limits the efficiency of most kernels. Using profiling tools, we estimate that the efficiency of the GPU kernels in *Cholla* ranges from 10 - 20%. Using our local NVIDIA DGX-1 system with GPU architectures closer to Summit's design, we have verified that register pressure will be mitigated on newer GPU architectures that devote more registers / GPU - for example, our code runs 5x faster on the P100 vs K20x without any modification. An additional 25% of each timestep is spent on copying memory to and from the GPU, so we estimate that our overall performance (percent of peak) is around 10-15%. We also expect this to improve on systems like Summit that have increased bandwidth between the GPU and CPU.

### 1.4 Data Storage

Our project is currently using about 40 terabytes of data storage. Each of the production simulations that will be run this semester is expected to require about as much storage, so we anticipate needing  $\sim 160$  TB by the end of 2017. This space enables us to save 100 full snapshots throughout the 100 million year evolution of the simulation, providing a vital high-frequency look at the development and evolution of galactic winds. If necessary, we could reduce the frequency of output for the full grid - in an effort to reduce the amount of data required to be stored, we have engineered new routines in the code to output more frequent

projections in several crucial variables. This capability allows us to make high time resolution movies of the simulations without accumulating nearly as much data (the size of the projected snapshots is negligible compared to the full grid). Our data storage needs for 2018 will be similar to our 2017 requirements.

Thus far, we have relied entirely on writing our own routines to reduce and analyze the data. This process has been effective - all of the images shown in this proposal were made with our python-based analysis and visualization code. We are working to deploy a website to share movies and animations from our project. We will also share what data we can, and we are constructing a data server at UCSC to store the vital simulation data from our project. All of our code and analysis routines are already publicly available on GitHub.

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