

# Accelerated convergence of convective simulations using boundary value problems

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We present a method for coupling boundary value problems (BVPs) with initial value problems (IVPs) in order to achieve thermally converged convective solutions on dynamical timescales, rather than the long thermal timescale. We study this method in the context of Rayleigh-Bénard convection. We demonstrate that the solution reached by BVP and the solution reached by a long thermal rundown of the IVP are similar, and demonstrate that this method works at a large range of supercriticalities. The BVP method is used to achieve converged solutions at high supercriticality ( $10^8$ ), and its extensions to more complex scenarios are discussed.

## I. INTRODUCTION

Natural convection occurs in the presence of disparate timescales which prohibit numericists from studying realistic models of natural systems. For example, flows in the Sun’s convection zone range from a Mach number (Ma) of order unity near the solar surface to order  $10^{-5}$  deep in the solar interior. Explicit methods which are bound by the Courant-Friedrich-Lewy (CFL) timestep limit must resolve the fastest motions (sound waves and surface convection), resulting in timesteps which are prohibitively small for studies of the deep, low-Ma motions. These systems are numerically stiff. Even in the absence of the fast surface motions, the disparity between the sound crossing time and the deep flows have made studies of low-Ma stellar convection difficult. Traditionally, approximations such as the anelastic approximation, in which sound waves are explicitly filtered out, have been used to study low-Ma flows [1, 2]. More recently, advanced numerical techniques which use implicit or mixed implicit-explicit timestepping mechanisms have made it feasible to study convection at low Mach numbers [3–8], and careful studies of deep convection which would have been impossible a decade ago are now widely accessible.

While solutions to problem of disparate dynamical timescales have proven useful, the difference between convective timescales and system relaxation timescales remains a significant problem facing studies of convection. As modern simulations aim to model natural convection by increasing into the high-Rayleigh-number (Ra) regime, the thermal diffusion timescale on which the system relaxes grows with respect to the dynamical timescale, which stays roughly constant across all Ra [7]. Solar convection is, once again, a prime example of this phenomenon. Dynamical timescales in the Solar convective zone are relatively short (10 min overturn at solar surface, one month solar rotation rate) compared to the Kelvin-Helmholtz timescale of  $3 \cdot 10^7$  years [9]. Furthermore, as dynamical and diffusive timescales separate, simulations become more turbulent. More turbulent motions require finer grid meshes and smaller timesteps to capture advective dynamics. Thus, the progression of simulations into the high-Ra regime of natural convection is slowed by two simultaneous effects: timestepping through a single convective overturn time becomes more computationally expensive while the number of overturn times required for systems to reach thermal equilibration grows.

The vast difference between convective and diffusive timescales has long plagued numericists studying convection, and a plethora of approaches has been employed to study thermally converged solutions. One popular method for accelerating the convergence of high-Ra solutions is by “Bootstrapping,” or the process of using the flow fields in a converged solution at lower Ra as initial conditions for a simulation at a higher Ra. This method has been used with great success [10, 11], but it is not without its faults. Bootstrapped solutions are susceptible to hysteresis effects, in which large-scale convective structures present in the low Ra solution imprint onto the dynamics of the new, high Ra solution. In moderate-Ra simulations, a commonly-used tactic is to use a simple model of the full convective state as initial conditions. For example, past studies have used a linear eigenvalue solve to set the initial convective state [12] or used an axisymmetric solution as initial conditions for convection in a 3D cylinder [11]. In certain systems, the approximate state of the evolved solution can be estimated, and there an appropriate set of initial conditions can either be solved for analytically [13] or by using knowledge of Mixing Length Theory or other convective theories to adjust the initial profile towards the proper adiabatic state [14].

Despite the plethora of methods that have been used, the most straightforward way to achieve a thermally converged solution is to evolve a convective simulation through a thermal timescale. Some modern studies do just that [2], but it is becoming increasingly difficult. Such evolution is *expensive*, and state-of-the-art simulations at the highest values of Ra can only be reasonably run for tens to hundreds of buoyancy times [15], much less the thousands of buoyancy

timescales required for thermal convergence.

In this work, we study a method of achieving accelerated evolution of a convective simulation through adjusting the thermodynamic state using information from resolved, convective dynamics. We couple measurements of the (non-converged) convective solution with knowledge about energy balances in the eventual solution to self-consistently adjust the mean thermodynamic profile towards. While such a method has been used previously [16], we find no explanation in the current literature of the steps involved in employing this method, nor any study into the accuracy of such a method. In section II, we describe our convective simulations, our numerical methods, and our method for achieving accelerated evolution. In section III, we compare solutions reached through the accelerated evolution method to those that have been evolved through a full diffusive timescale, and we examine select simulations at very high Ra which have achieved accelerated evolution. Finally, in section IV, we discuss extensions of the methods presented here to stratified, compressible systems.

## II. EXPERIMENT

We adopt the Oberbeck-Boussinesq approximation. Under this choice, the fluid has constant kinematic viscosity ( $\nu$ ), thermal diffusivity ( $\kappa$ ), and coefficient of thermal expansion ( $\alpha$ ). The variables of the fluid that are evolved are the velocity,  $\mathbf{u} = u\hat{x} + v\hat{y} + w\hat{z}$ , the temperature  $T = T_0 + T_1$ , and the pressure,  $P$ . The density of the fluid is a constant,  $\rho_0$ , except on the term where the constant gravitational acceleration,  $\mathbf{g} = -g\hat{z}$ , acts in the vertical momentum equation, where  $\rho = \rho_0(1 - \alpha T_1)$ . Under these choices, the equations of motion are [17]

$$\nabla \cdot \mathbf{u} = 0, \quad (1)$$

$$\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} = -\frac{1}{\rho_0} \nabla P - g(1 - \alpha T_1)\hat{z} + \nu \nabla^2 \mathbf{u}, \quad (2)$$

$$\frac{\partial T_1}{\partial t} + \mathbf{u} \cdot \nabla (T_0 + T_1) = \kappa \nabla^2 T_1, \quad (3)$$

We non-dimensionalize these equations on the layer height ( $L_z$ ), the initial temperature jump across the layer ( $\Delta T_0 = L_z \nabla T_0$ ), and the freefall velocity ( $v_{\text{ff}} = \sqrt{g L_z^2 \nabla T_0}$ ). by these choices, one time unit is a freefall time ( $L_z/v_{\text{ff}}$ ). We further re-arrange the momentum equation by introducing a reduced kinematic pressure,  $\varpi \equiv P/\rho_0 + \phi + |\mathbf{u}|^2/2$ , where the gravitational potential,  $\phi$ , is defined such that  $\mathbf{g} = -\nabla \phi$ . The nature of  $P$  in Rayleigh-Bénard convection, as a Lagrange multiplier, allows the treatment of  $\varpi$  as a linear variable. We time evolve the equations in the form,

$$\nabla \cdot \mathbf{u} = 0, \quad (4)$$

$$\frac{\partial \mathbf{u}}{\partial t} + \nabla \varpi - T_1 \hat{z} + \mathcal{R} \nabla \times \boldsymbol{\omega} = \mathbf{u} \times \boldsymbol{\omega} \quad (5)$$

$$\frac{\partial T_1}{\partial t} - \mathcal{P} \nabla^2 T_1 + w \frac{\partial T_0}{\partial z} = -\mathbf{u} \cdot \nabla T_1, \quad (6)$$

where  $\boldsymbol{\omega} = \nabla \times \mathbf{u}$  is the vorticity, and the temperature has been decomposed as  $T \equiv T_0 + T_1$  where  $T_0$  is the initial temperature profile. We find Eq. (5) to be slightly faster numerically than the standard form in Eq. (2). The dimensionless control parameters are set by the Rayleigh and Prandtl numbers,

$$\mathcal{R} \equiv \sqrt{\frac{\text{Pr}}{\text{Ra}}}, \quad \mathcal{P} \equiv \frac{1}{\sqrt{\text{Pr Ra}}}, \quad \text{Ra} = \frac{g \alpha L_z^4 \nabla T_0}{\nu \chi} = \frac{(L_z v_{\text{ff}})^2}{\nu \chi}, \quad \text{Pr} = \frac{\nu}{\chi}. \quad (7)$$

The dimensionless vertical extent of the domain is  $z = [-1/2, 1/2]$ , and at the top and bottom boundaries we impose no-slip, impenetrable boundary conditions such that  $u = v = w = 0$  at  $z = \pm 1/2$ . At the lower boundary, we employ a fixed flux condition such that  $\partial T_1 / \partial z = 0$  at  $z = -1/2$ , and we impose a fixed temperature condition of  $T_1 = 0$  at  $z = 1/2$ . Both horizontal directions are periodic, extending over a range  $x, y = [0, \Gamma]$ , where the aspect ratio is  $\Gamma = 2$ . In our 2D cases, we only examine the  $x$  and  $z$  dimensions and we set  $v = \partial_y = 0$ .

The chosen thermal boundary conditions at the upper and lower plates determine key quantities of the evolved state. Studies of incompressible, Boussinesq, Rayleigh-Bénard convection often employ fixed temperature (Dirichlet) or fixed heat flux (Neumann) boundary conditions at both plates. Dirichlet conditions represent plates of infinite conductivity, whereas Neumann conditions model plates of finite conductivity. Both types of conditions transport heat in the same manner [10], at least when the upper and lower conditions are symmetric. Studies of convection which aim to model astrophysical systems such as stars often employ a mixture of these two types of boundary conditions [12, 18, 19]. The flux at the lower boundary is fixed, modeling the constant energy generation of the stellar core, while

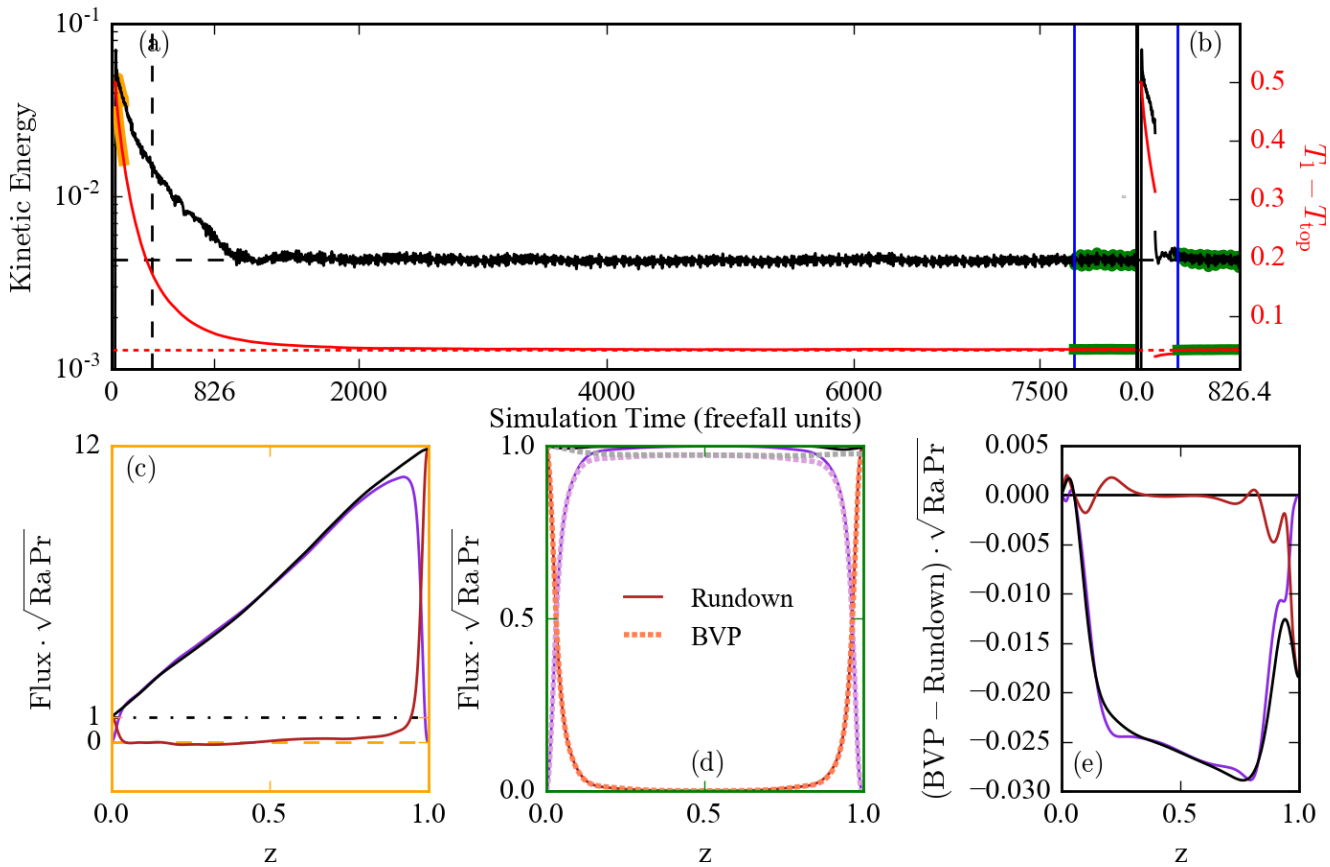


FIG. 1. Traces of system energies vs. time for a long thermal rundown (a) and BVP convergence (b) are shown for  $S = 10^{4+2/3}$ . The horizontal extent of the subplots is set such that one simulation time unit takes up an equal amount of paper space in (a) and (b). Volume averaged kinetic energy is shown in black, and the volume averaged temperature with the top value removed, is shown in red. The dashed vertical line on (a) represents the time at which averaging begins in the BVP solution in (b), and the horizontal dashed lines show the equilibrium value of the energies. The blue vertical lines represent the beginning of the time-averaging window. (c) System fluxes early in the run (the orange highlights in (a)) are shown. Black is the sum of the flux, purple is the convective flux, and red is the conductive flux. (d) Fluxes in the converged rundown IVP compared to the converged BVP. The sum of flux is shown in black & grey, the convective flux is shown in purple & pink, and the conductive flux is shown in red & orange. (e) The differences between the BVP and rundown fluxes is shown. While not in perfect agreement, the BVP fluxes deviate from the rundown fluxes by only a few percent of the total flux, and are much closer to the converged state than the initial fluxes, as in (c).

the outer boundary condition is held at a fixed temperature, modeling the stellar surface which must output the energy generated internally. This setup is a useful model for understanding natural systems, but simulations which employ these boundary conditions suffer from a long thermal relaxation as the atmosphere loses energy and approaches the adiabat chosen by the Dirichlet condition. We choose these mixed conditions in part to better understand them, and in part because these conditions minimize the number of assumptions that must be made in setting up the boundary value problem. For this choice of boundary conditions, the critical Ra is  $Ra_{\text{crit}} = 1295.78$ , and we will often speak in terms of the supercriticality,  $S = Ra/Ra_{\text{crit}}$ .

### A. The Boundary Value Problem

It is reasonable to assume that convection will evolve the mean temperature profile that drives it over the course of a thermal diffusion time,  $t_\chi = \mathcal{P}^{-1}$ . Thus, as Ra increases, the timescale for achieving a thermally converged mean temperature profile becomes intractable. This prohibitively long thermal timescale in an Initial Value Problem (IVP) can be skipped by coupling the IVP with a simple Boundary Value Problem (BVP) solve. By using information about the convecting dynamical state of an unconverged solution, a BVP can be used to solve for the evolved system state.

A comparison of a simulation running for the thermal timescale, and another where a BVP is used to fast-forward atmospheric evolution, are shown in Fig 1a&b.

The Boussinesq BVP in essence contains equations of hydrostatic balance and thermal equilibrium,

$$\frac{\partial}{\partial z} \langle \varpi \rangle - \langle T_1 \rangle \hat{z} = \langle \mathbf{u} \times \boldsymbol{\omega} \rangle, \quad (8)$$

$$\frac{\partial}{\partial z} \langle wT_1 \rangle - \mathcal{P} \frac{\partial^2}{\partial z^2} \langle T_1 \rangle = 0, \quad (9)$$

where  $\langle A \rangle$  represents a time- and horizontally averaged profile of the quantity  $A$ . These equations arise from assuming that the atmosphere is in a steady state ( $\partial_t \rightarrow 0$ ), then taking time and horizontal averages of Eqns (5&6) and neglecting terms that vanish due to the symmetry of the problem. Convective flows are perturbations around a thermal profile defined by these equations in the proper evolved, statistically stationary state.

Under eqns (8&9), the thermal structure ( $\langle T_1 \rangle$ ,  $\langle \varpi \rangle$ ) of the atmosphere is fully determined by the specification of two profiles: the convective flux,  $F_{conv} = \langle wT_1 \rangle$ , and the nonlinear advection,  $\langle \mathbf{u} \times \boldsymbol{\omega} \rangle$ . If these profiles are known, then solving for  $\langle T_1 \rangle$  and  $\langle \varpi \rangle$  depends only upon the choice of boundary conditions.

By definition, the profile of  $F_{conv}$  is not in a time stationary state early in the IVP. In fact, as the atmosphere approaches the isotherm specified by the upper (fixed  $T$ ) boundary condition, the motions display an asymmetric flux as energy leaks through the upper boundary condition (Fig. 1c) in order to reach a lower temperature state. In order to construct the evolved convective flux from the current fluxes in the atmosphere, we assume that the atmospheric dynamics have properly developed the thickness of the boundary layers. In other words, if we know the quantities  $F_{conv}$ ,  $F_{cond} = \langle -P\partial_z T \rangle$ , and  $F_{tot} = F_{conv} + F_{cond}$ , we assume that the profiles

$$f_{conv}(z) = \frac{F_{conv}}{F_{tot}}, \quad f_{cond}(z) = \frac{F_{cond}}{F_{tot}} \quad (10)$$

early in the evolution are the same as they will be in the final steady state solution. By definition, the evolved total flux through the atmosphere must be the same as the flux entering the atmosphere at the bottom boundary,  $F_{tot, steady} = F_{bot}$ . The proper convective flux profile to use in Eqn. (9) is then  $\langle wT_1 \rangle_{steady} = F_{tot, steady} \cdot f_{conv}$ .

In order to carry the converged amount of flux appropriately, the velocity field and temperature fluctuations in the system must be scaled by a quantity  $\xi(z) = \langle wT_1 \rangle_{steady} / \langle wT_1 \rangle$ . Thus, we multiply the velocities and the thermal fluctuations,  $T - \langle T \rangle$ , by  $\sqrt{\xi}$ , such that the product of all fluctuations (which carry the convective flux) are diminished by a factor of  $\xi$ . This also means that  $\langle \mathbf{u} \times \boldsymbol{\omega} \rangle_{steady} = \xi \langle \mathbf{u} \times \boldsymbol{\omega} \rangle$ . Once these profiles are appropriately adjusted, they can be used in the BVP solve to find  $\langle T \rangle$  and  $\langle \varpi \rangle$ .

In general, the BVP solve is completed in the following steps:

1. Run the convective IVP. Once the convection achieves a volume-averaged Re of  $\sqrt{\text{Ra}/\text{Ra}_{crit}}$ , wait for 50 freefall time units.
2. Start taking the averages of  $F_{conv}$ ,  $F_{tot}$ , and  $\langle \mathbf{u} \times \boldsymbol{\omega} \rangle$ , waiting either 30 freefall time units or until the average profiles change by no more than 1 part in 1000 on a given timestep, whichever is a more difficult criterion. This ensures that the profiles being used in the BVP are steady and smooth, and that they sample the full behavior of the convection.
3. Construct  $\langle wT_1 \rangle_{steady}$ ,  $\xi$ , and  $\langle \mathbf{u} \times \boldsymbol{\omega} \rangle_{steady}$  from the flux profiles.
4. Solve for  $\langle T_1 \rangle$  and  $\langle \varpi \rangle$  of the evolved state. Adjust the mean profiles in the IVP.
5. Multiply the velocity field and the fluctuations in  $T_1$  about its horizontal average by  $\sqrt{\xi}$  in the IVP.
6. Continue running the IVP for freefall 50 time units to allow for the velocities to equilibrate to their new background state.
7. Repeat steps 2-6 to complete a second BVP and get closer to the right solution now that we are far from the very unstable transient period.
8. Take averages for the amount of time specified for the given run in Appendix A.

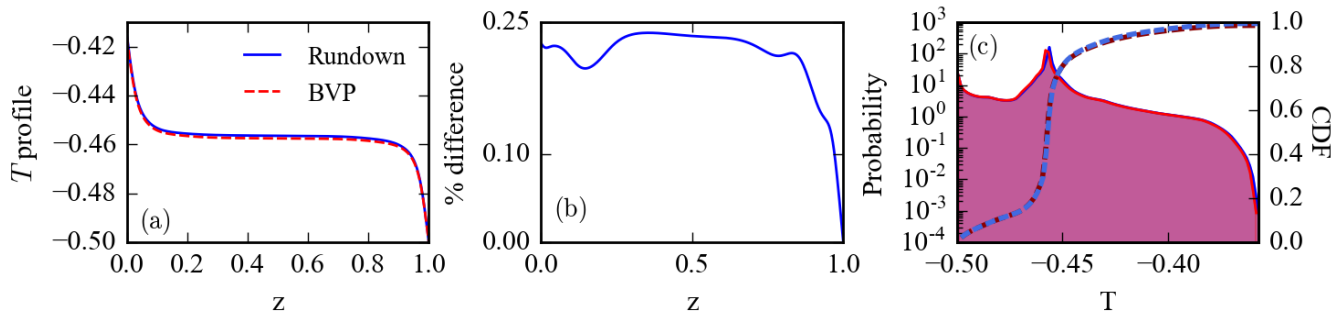


FIG. 2. Comparisons of the evolved thermodynamic states of a BVP solution and a long IVP rundown at  $S = 10^{4+2/3}$  are shown. (a) Evolved temperature profiles, as a function of height. (b) The percentage difference between the temperature profiles (as shown in (a)), as a function of height. (c) Probability distributions of point-by-point measurements of  $T$  throughout the two domains over the averaging windows are shown. The cumulative distribution functions are overplotted and the maximum difference between them is 0.0407. This difference arises due to the imperfect alignment of the mean domain temperatures, but it is clear that otherwise the statistics are quite similar.

## B. Numerics

We utilize the Dedalus<sup>1</sup> pseudospectral framework [20] to time-evolve (4)-(6) using an implicit-explicit (IMEX), third-order, four-step Runge-Kutta timestepping scheme RK443 [21]. The linear terms (on the LHS of the equations) are solved implicitly, while the nonlinear terms (RHS) are explicitly solved. The temperature field is decomposed as  $T = T_0(z) + T_1(x, y, z, t)$  and the velocity is  $\mathbf{u} = w\hat{\mathbf{z}} + u\hat{\mathbf{x}} + v\hat{\mathbf{y}}$ . In our 2D runs,  $v = 0$ . Variables are time-evolved on a dealiased Chebyshev (vertical) and Fourier (horizontal, periodic) domain in which the physical grid dimensions are  $3/2$  the size of the coefficient grid.

As initial conditions, we fill  $T_1$  with random white noise whose magnitude is  $10^{-6}(\text{Ra Pr})^{-1/2}$ . This ensures that the initial perturbations are much smaller than the evolved convective temperature perturbations, even at large Ra. We filter this noise spectrum in coefficient space, such that only the lower 25% of the coefficients have power.

## III. RESULTS

While Fig. 1 shows us that the post-BVP and post-rundown solutions exhibit similar system energies and fluxes, it is important to examine other aspects of the evolved solution. The BVP mainly serves to adjust the thermodynamic state of the solution; in Rayleigh-Bénard convection, this means that the evolved temperature profile is a good measure of whether or not the BVP achieves the proper solution.

The temperature profiles of a 2D run at  $S = 10^{4+2/3}$  for both the BVP solve and the long rundown are shown in Fig. 2a. While they are not perfectly aligned they are within less than 0.25% of each other throughout the depth of the atmosphere, as shown in Fig. 2b. While the mean temperature profile is interesting, the point-by-point fluctuations in the temperature are what lead to convective transport, and thus examining the spread of temperature and the allowed values that it can take are important to characterizing the system. As seen in Fig. 2c, aside from the noticeable difference in the mode of the temperatures, the two runs exhibit largely the same spread of temperatures. (AUTHOR NOTE: we aren't quite sure how to do a KS test properly here, but we can at least list the KS statistic – currently this is in the caption.)

In addition to examining the thermodynamics of the solutions, we are especially interested in determining if the post-BVP solution appropriately captures key features of the nonlinear dynamics. We show point-by-point probability distributions of the horizontal velocity, vertical velocity, and nonlinear transport in Fig. 3. All of these measures have a sharp peak at zero due to the no-slip, impenetrable boundary conditions and the denser grid sampling near the boundaries of our Chebyshev grid. Regardless, we see that the velocities of the two solutions are largely consistent. The nonlinear transport in Fig. 3c shows that the rundown solution experiences a larger number of energetic, extreme events, but the BVP displays a larger number of moderately energetic events than the IVP (as evidenced by the differences in the cumulative distribution functions).

<sup>1</sup> <http://dedalus-project.org/>

The goodness of this method has been tested across a broad range of supercriticality. We have examined both Rundown and BVP solutions in the range  $S = [10^{1/3}, 10^5]$  in 2D and  $S = [10^1, 10^4]$  in 3D. We have also further explored up to  $S = 10^6$  (AUTHOR NOTE: we're going up to  $10^8$  in 2D right now, need to mention this is state of the art and give refs). We show the volume averaged Nusselt number, RMS Reynolds number, and mean temperature in the evolved BVP solutions in in Fig. 4a-c. The relative error of the BVP measurements of these values is compared to the IVP measurements for these values in Fig. 4d-f.

In Fig. 4a, we show the Nusselt number scaling in 2D and 3D. We use a classic definition of the Nusselt number to measure the heat transport in these systems, where

$$\text{Nu} = \frac{\langle F_{\text{conv}} + F_{\text{cond}} \rangle}{\langle F_{\text{cond, ref}} \rangle} = \frac{\langle wT - (\text{Ra Pr})^{-1/2} \nabla T \rangle}{\langle -(\text{Ra Pr})^{-1/2} \nabla T \rangle}. \quad (11)$$

At small values of  $S$ , we achieve a steady state solution with a clear value of Nu. Near  $S \sim 10^3$ , our simulations begin to achieve a horizontally oscillatory state. Due to the use of no-slip boundaries, these states never give way to full scale shearing states, but they do reduce the overall heat transport through the system and cause the systems to oscillate between periods of high- and low- heat transport. The vertical lines represent the standard deviation of Nu associated with these oscillations, while the error bars show the drift of the mean value of Nu over the averaging window. We find that  $\text{Nu} \propto \text{Ra}^{1/5}$ , a weaker scaling law than that seen in traditional Rayleigh-Bénard convection [10], but similar to that seen in shearing states [cite Goluskin]. (AUTHOR NOTE: Ben, I think this is entirely because of the oscillatory states. I wonder what would happen if we included viscous fluxes...)

In Fig. 4b, we measure the rms Reynolds number, where  $\text{Re} = \langle |\mathbf{u}| \rangle / \mathcal{R}$ . We find that this scales roughly as  $\text{Re} \propto \text{Ra}^{0.45}$ .

In Fig. 4c, we measure the volume averaged temperature of our solution, then subtract out the value at the upper (fixed  $T$ ) boundary. If the atmosphere were perfectly isothermal, this value would be exactly zero. Thus, this is a measure of the temperature jump across the boundary layers, and it provides insight both into whether or not the temperature profiles of two runs are the same and into whether the fluxes through the two systems are the same (it is in some ways an alternate measure of Nu [cite King 2009 supp materials]). We find that this measure is  $\propto \text{Ra}^{-1/5}$ , approaching zero, as expected.

For each of these measurements, the BVP achieves the same value as the IVP to within about 3% (Fig. 4d-f). This is good agreement, and the residuals have a scattered distribution of positive and negative values, indicating that the method is not biased towards the wrong answer in a clear manner.

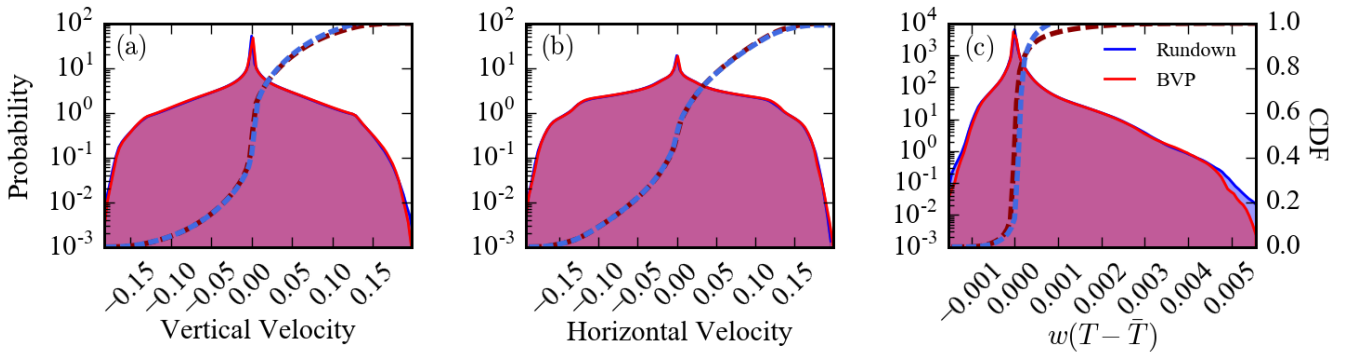


FIG. 3. Probability distribution functions of the vertical velocity (a), horizontal velocity (b), and nonlinear vertical transport (c) are shown for a 2D run at  $S = 10^{4+2/3}$ . We sample flows every 0.1 time units for 500 freefall times, and include the flows at all points on the grid at each of these samples in these distributions. All distributions are biased by the no-slip, impenetrable boundary conditions, coupled with the dense spacing of our Chebyshev grids near the boundaries, so there is a large peak around zero. The cumulative distribution function is overlaid on each plot, with a maximum difference of (a) 0.027, (b) 0.0061, and (c) 0.035. There is an excess of higher-flux carrying elements in the BVP solution than in the IVP rundown, despite the rundown's distribution having more powerful, rare events.



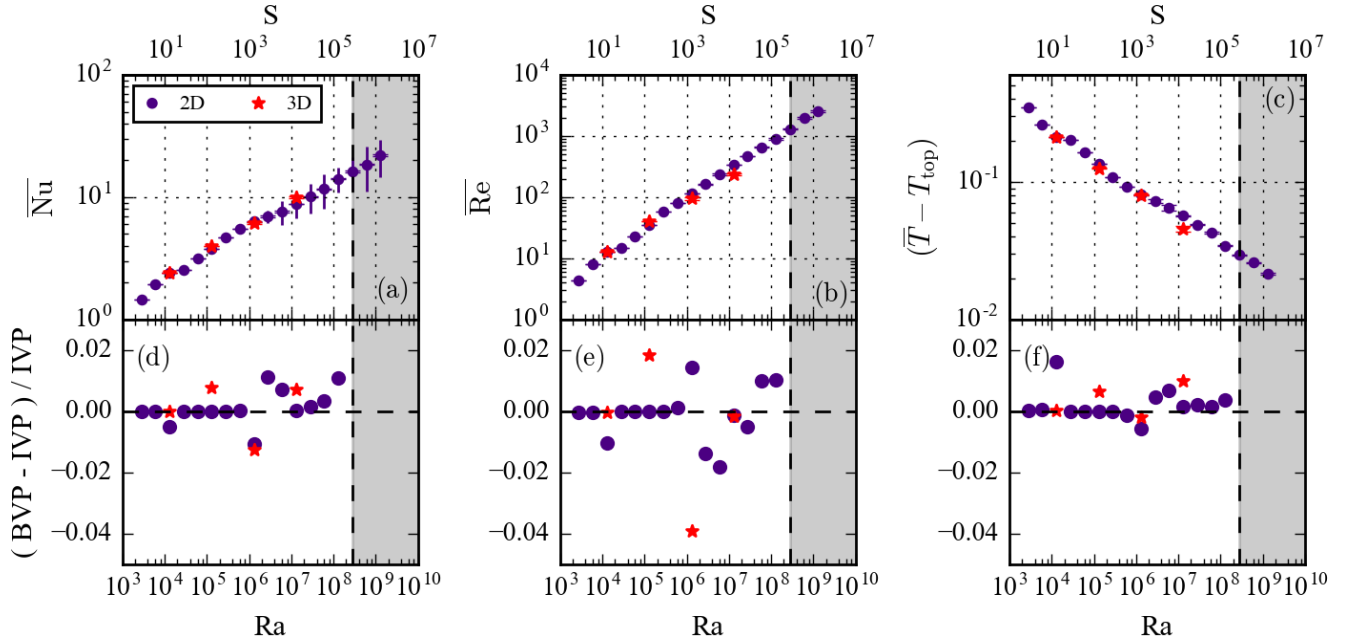


FIG. 4. Scaling plots are shown for the Nusselt number (a), the Reynolds number (b), and the volume-averaged temperature (c). Symbols represent the mean value of a measurement, vertical lines represent the standard deviation of the measurement over the time window, and error bars represent the shift in the mean value over the window. (a)  $Nu$ , which measures heat transport, scales roughly like  $Ra^{1/5}$ , and above  $Ra \geq 10^6$ , simulations display horizontally oscillating plumes which have oscillating periods of high transport and low transport. The mean value is marginally diminished as a result, and the variance of  $Nu$  with time is large. (b)  $Re$ , which measures the level of turbulence in the evolved solution, scales as  $Ra^{0.45}$  in 2D and is not distinctly different in 3D. (c) The average temperature fluctuation, minus the top temperature, which is a scalar measure of the final average thermodynamic state and should approach zero in the limit of infinitely large  $Ra$ . The temperature profile is slow to adjust, and differences between BVP solutions and rundown solutions are quite easy to pick out in this measure. (d-f) Relative error is shown between the BVP and IVP measurements of  $Nu$  (d),  $Re$  (e), and the mean temperature (f). The grey box indicates the region in which only BVP runs were carried out due to computational expense.

#### IV. DISCUSSION & CONCLUSIONS

The method presented here is a first step towards taking meaningful measurements of highly turbulent convection on manageable, human timescales. As demonstrated in Figs. 1-4, this BVP method quickly converges simulations to within a few percent of the true final state. Furthermore, the total simulation time required to use the BVPs does not change drastically from low  $S$  to high  $S$ , so the main prohibition on high  $Ra$  states is the difficulty of timesteps becoming increasingly small as turbulence increases. Additionally, post-BVP, we generally see an increase of the timestep size by nearly a factor of two due to the less intense driving of the near-converged state that is achieved quickly.

It is important to note that the measurements made in this paper were generally done for short timescales (a few hundred buoyancy times) in order to show the precise differences between the BVP solutions and the IVP solutions. Where there are differences, the BVP solution is trending towards the IVP solution, and if measurements were taken over long timescales (e.g., a thermal time), the differences between the BVP solution and IVP solution would be negligible.

One major benefit of the BVP method used here is that it preserves the natural behavior of the convective solution (such as the horizontally oscillatory rolls of high- $Ra$  2D states in Fig. 4). One frequently used method of measuring dynamics in high- $Ra$  simulations is that of bootstrapping, in which the converged solution of a low- $Ra$  state is used as initial conditions for a higher- $Ra$  simulation. While this method is powerful, it can be influenced by hysteresis effects, and the steady rolls achieved at low  $Ra$  can result in an artificially over-stable high- $Ra$  roll solution. The BVP method we present here uses random noise initial conditions which allows the convective solution to naturally choose the dynamics.

Another benefit of our BVP method is that it can be easily extended to more complicated configurations. For example, to use this method in simulations of stratified compressible convection, one need only adapt the BVP

equations to the appropriate equations of hydrostatic equilibrium and thermal equilibrium obtained by averaging the fully compressible, ideal gas steady state momentum and energy equations [6, 7]. In compressible convection, where the density is allowed to change, it is also essential to conserve mass by adding boundary conditions on the integrated mass density at the upper and lower boundaries, much as stellar structure codes do [22].

While we have not chosen to use them here, this BVP method can be extended to other boundary conditions. To solve for fixed temperature boundary conditions, the main difficulty is in finding the amount of flux through the system,  $F_{\text{tot, steady}}$ . However, by knowing the averaged value of the conductive flux (from the boundary conditions) and the ratios in Eqn. (10),  $F_{\text{tot, steady}}$  can be found. In the case of fixed flux boundary conditions, the temperature solution is degenerate. However, using knowledge about the system – such as the initial symmetry of the RB state around  $T = 0$ , the final solution can be pegged onto the proper profile.

Future work will aim to apply the methods presented here to compressible systems, internally heated systems, and systems with more complex forms of the conductive flux.

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## Appendix A: Table of Runs

| $S$          | Ra                | nz   | nx, ny | $t_{\text{therm}}$ | $t_{\text{avg}}$ | Nu <sub>run</sub> | Nu <sub>BVP</sub> |
|--------------|-------------------|------|--------|--------------------|------------------|-------------------|-------------------|
| $10^{1/3}$   | $2.79 \cdot 10^3$ | 32   | 128    | 52.8               | 100              | (TBD)             | (TBD)             |
| $10^{2/3}$   | $6.01 \cdot 10^3$ | 32   | 128    | 77.6               | 100              | –                 | –                 |
| $10^1$       | $1.30 \cdot 10^4$ | 32   | 128    | 114                | 100              | –                 | –                 |
| $10^{1+1/3}$ | $2.79 \cdot 10^4$ | 32   | 128    | 167                | 100              | –                 | –                 |
| $10^{1+2/3}$ | $6.01 \cdot 10^4$ | 32   | 128    | 245                | 100              | –                 | –                 |
| $10^2$       | $1.30 \cdot 10^5$ | 64   | 256    | 360                | 100              | –                 | –                 |
| $10^{2+1/3}$ | $2.79 \cdot 10^5$ | 64   | 256    | 528                | 100              | –                 | –                 |
| $10^{2+2/3}$ | $6.01 \cdot 10^5$ | 64   | 256    | 776                | 100              | –                 | –                 |
| $10^3$       | $1.30 \cdot 10^6$ | 128  | 512    | $1.14 \cdot 10^3$  | 200              | –                 | –                 |
| $10^{3+1/3}$ | $2.79 \cdot 10^6$ | 128  | 512    | $1.67 \cdot 10^3$  | 500              | –                 | –                 |
| $10^{3+2/3}$ | $6.01 \cdot 10^6$ | 256  | 1024   | $2.45 \cdot 10^3$  | 500              | –                 | –                 |
| $10^4$       | $1.30 \cdot 10^7$ | 256  | 1024   | $3.60 \cdot 10^3$  | 500              | –                 | –                 |
| $10^{4+1/3}$ | $2.79 \cdot 10^7$ | 256  | 1024   | $5.28 \cdot 10^3$  | 500              | –                 | –                 |
| $10^{4+2/3}$ | $6.01 \cdot 10^7$ | 256  | 1024   | $7.76 \cdot 10^3$  | 500              | –                 | –                 |
| $10^5$       | $1.30 \cdot 10^8$ | 512  | 2048   | $1.14 \cdot 10^4$  | 500              | –                 | –                 |
| $10^{5+1/3}$ | $2.79 \cdot 10^8$ | 512  | 2048   | $1.67 \cdot 10^4$  | 500              | –                 | –                 |
| $10^{5+2/3}$ | $6.01 \cdot 10^8$ | 512  | 2048   | $2.45 \cdot 10^4$  | 500              | –                 | –                 |
| $10^6$       | $1.30 \cdot 10^9$ | 1024 | 4096   | $3.60 \cdot 10^4$  | 500              | –                 | –                 |

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