

## Physics-dynamics coupling with element-based high-order Galerkin methods: quasi equal-area physics grid

ADAM R. HERRINGTON\*

*School of Marine and Atmospheric Sciences, Stony Brook University, Stony Brook, New York, USA.*

PETER H. LAURITZEN

*Climate and Global Dynamics, National Center for Atmospheric Research, 1850 Table Mesa Drive, Boulder, Colorado, USA.*

MARK A. TAYLOR

*Sandia National Laboratories, Albuquerque, New Mexico, USA.*

STEVE GOLDHABER AND BRIAN E. EATON

*Climate and Global Dynamics, National Center for Atmospheric Research, 1850 Table Mesa Drive, Boulder, Colorado, USA.*

KEVIN A. REED

*School of Marine and Atmospheric Sciences, Stony Brook University, State University of New York, Stony Brook, New York.*

PAUL A. ULLRICH

*Department of Land, Air and Water Resources, University of California, Davis, California, USA.*

### ABSTRACT

Atmospheric modeling with element-based high-order Galerkin methods presents a unique challenge to the conventional physics-dynamics coupling paradigm, due to the highly irregular distribution of nodes within an element and the distinct numerical characteristics of the Galerkin method. The conventional coupling procedure is to evaluate the physical parameterizations (*physics*) on the dynamical core grid. Evaluating the physics at the nodal points exacerbates numerical noise from the Galerkin method, enabling and amplifying local extrema at element boundaries. Grid imprinting may be substantially reduced through the introduction of an entirely separate, approximately isotropic finite-volume grid for evaluating the physics forcing. Integration of the spectral basis over the control-volumes provides an area average state to the physics, which is more representative of the state in the vicinity of the nodal points rather than the nodal point itself, and is more consistent with the notion of a ‘large-scale state’ required by conventional physics packages. This study documents the implementation of a quasi-equal area physics grid into NCAR’s Community Atmosphere Model with Spectral Elements, and is shown to be effective at mitigating grid imprinting in the solution. The physics grid is also appropriate for coupling to other components within the Community Earth System Model, since the coupler requires component fluxes to be defined on a finite-volume grid, and one can be certain that the fluxes on the physics grid are indeed, volume-averaged.

### 1. Introduction

An increasing number of numerical methods publications in the atmospheric science literature concern trans-

port, shallow-water, and three-dimensional models employing element-based high-order Galerkin discretizations such as finite-element and discontinuous Galerkin methods (for an introduction to these methods see, e.g., Durran 2010; Nair et al. 2011; Ullrich 2014). Some global models based on Galerkin methods have reached a level of maturity for which they are being considered for next generation climate and weather models due to their in-

\*Corresponding author address: Adam R. Herrington, School of Marine and Atmospheric Sciences, Stony Brook University, Stony Brook, New York, USA.

E-mail: adam.herrington@stonybrook.edu



FIG. 1. Example of CAM-SE GLL quadrature grids, marked with red filled circles, (a & c) on the cubed-sphere and (b & d) in an element. (a)-(b) and (c)-(d) use  $4 \times 4$  ( $np = 4$ ) and  $8 \times 8$  ( $np = 8$ ) GLL quadrature points in each element, respectively. (a) and (c) have the same average grid-spacing at the Equator ( $7.5^\circ$ ) which is obtained by using (a)  $4 \times 4$  ( $ne = 4$ ) and (b)  $2 \times 2$  ( $ne = 2$ ) elements on each cubed-sphere face/panel, respectively. The element boundaries are marked with thick light blue lines. The grid configurations shown on (a) and (c) are referred to as  $ne4np4$  and  $ne2np8$ , respectively.

herent conservation properties, high-order accuracy (for smooth problems), high parallel efficiency, high processor efficiency, and geometric flexibility facilitating mesh-refinement applications. NCAR's Community Atmosphere Model (CAM; Neale et al. 2012) offers a dynamical core based on continuous Galerkin finite elements (Taylor and Fournier 2010), referred to as CAM-SE (CAM Spectral Elements; Taylor et al. 2008; Dennis et al. 2012; Lauritzen et al. 2018). CAM-SE is, in particular, being used for high resolution climate modeling (e.g., Small et al. 2014; Reed et al. 2015; Bacmeister et al. 2018) and static mesh-refinement applications (e.g., Fournier et al. 2004; Zarzycki et al. 2014a,b; Guba et al. 2014b; Rhoades et al. 2016). Other examples of models based on high-order Galerkin methods that are being considered for ‘operational’ weather-climate applications are Giraldo and Restelli (2008), Nair et al. (2009), Brdar et al. (2013) and Rasch et al. (in progress).

Assumptions inherent to the physical parameterizations (also referred to as *physics*) require the state passed by the dynamical core represent a ‘large-scale state’, for example, in quasi-equilibrium-type convection schemes (Arakawa and Schubert 1974; Plant 2008). In finite-volume methods (e.g., Lin 2004), one may think of the dynamical core state as the average state of the atmosphere over a control volume, and for resolutions typical of climate simulations is entirely consistent with the notion of a ‘large-scale state’. For finite-difference methods (e.g., Suarez et al. 1983) the point value is thought of as

representative for the atmospheric state in the vicinity of the point value and one can usually associate a volume with the grid-point. Hence the physics grid (the grid on which the state of the atmosphere is evaluated and passed to physics) and the dynamics grid (the grid the dynamical core uses) coincide. Having the physics and dynamics grids coincide is obviously convenient since no interpolation is needed (which could disrupt conservation properties) and the number of degrees of freedom on both grids is exactly the same.

For the regular latitude-longitude, cubed-sphere and icosahedral grids the distance between the grid-points is gradually varying for finite-volume/finite-difference discretizations. Examples of models that use these grids are CAM-FV (latitude-longitude grid, Lin 2004), FV3 (cubed-sphere grid, Putman and Lin 2007) and ICON (icosahedral grid, Wan et al. 2013). For high-order element-based Galerkin methods, the dynamical core grid is defined by the quadrature points. In CAM-SE, these are the Gauss-Lobatto-Legendre (GLL) quadrature nodes. A unique aspect of the high-order quadrature rules is that the nodes within an element are located at the roots of the basis set, which may be irregularly spaced. For example, Figure 1 shows GLL points on an individual element of a cubed-sphere grid for degree 3 ( $np \times np = 4 \times 4$  quadrature points) and degree 7 ( $np \times np = 8 \times 8$  quadrature points) Lagrange polynomial basis used in CAM-SE. The higher the order of the quadrature rule, the greater variance in distance between GLL quadrature points within an each element. GLL quadrature points cluster near the edges and, in particular, the corners of the elements.

The resolved scales of motion are not determined by the distance between quadrature nodes, but rather the degree of the polynomial basis in each element. The nodes may be viewed as irregularly spaced samples of an underlying spectrally truncated state. From this perspective, one might expect the nodal solutions to be independent of location within an element. While the interior quadrature nodes are  $C^\infty$  in CAM-SE (i.e. the basis representation is infinitely smooth and all derivatives are continuous), the smoothness of boundary nodes are constrained by the need to patch neighboring solutions together to form the global basis set, an operation known as the direct stiffness summation (DSS; Maday and Patera 1987; Canuto et al. 2007). The DSS operation is attractive because it allows for high-order accuracy with minimal communication between elements, but degrades the solution to  $C^0$  at element boundaries (i.e., all derivatives are discontinuous). Through evaluating the physics at the nodal points, strong grid-scale forcing or oscillatory behavior near an element boundary may exacerbate the discontinuity, and our initial expectation, that the nodal solutions are independent of within-element location, is unlikely for non-smooth problems, e.g., the presence of rough topography or moist physics grid-scale forcing.

It is the purpose of this paper to document the implementation of an entirely separate, quasi-equal area finite-volume physics grid into CAM-SE. In this framework, the dynamical core state is integrated over control volumes to provide a volume averaged state to the physics, thereby minimizing the influence of any one particular nodal value on the physics forcing. Section 2 provides a thorough explanation of how grid imprinting manifests in high-order Galerkin methods for non-smooth problems. The implementation of the physics grid configuration into CAM-SE is presented in Section 3. Results from a hierarchy of idealized model configurations are presented in Section 4, illustrating the physics grid is effective at mitigating undesirable grid imprinting in the solution. Section 5 contains a discussion of results and concluding remarks.

## 2. The Quadrature Node Problem

Figure 2 is a one-dimensional schematic illustrating how grid-imprinting is enabled by the physics, when the dynamical core is represented by high-order Galerkin methods. The schematic depicts a time-step, starting from smooth initial conditions (Figure 2a), and subsequently advancing the dynamics one Runge-Kutta time-step (Figure 2b). Since the boundary nodes of adjacent elements overlap one-another, there are now two solutions for each boundary node. The DSS operator, effectively a numerical flux applied to the element boundaries such that overlapping nodal values agree, is applied (Figure 2c), degrading the boundary nodes to  $C^0$  in the process. This discontinuity may be exacerbated if, e.g., the physics updates the state at an element boundary (Figure 2d,e), resulting in characteristically tighter gradients on the boundary nodes compared to if the physics forcing were applied to an interior node (Figure 2g,h).

To test the degree to which nodal solutions depend on within-element position, an aqua-planet simulation (Neale and Hoskins 2000; Medeiros et al. 2016), which consists of an ocean covered planet in perpetual equinox, with fixed, zonally symmetric sea surface temperatures idealized after the present day climatology, is carried out using CAM-SE, with CAM4 physics (Neale et al. 2010) and run for one year. The nominal low resolution  $ne30np4$  grid is used, pertaining to an average equatorial grid spacing of 111.2km. The probability density distribution of the upward vertical pressure velocity ( $\omega$ ), conditionally sampled based on three categories - ‘interior’, ‘edge’ and ‘corner’ nodes - is provided in Figure 3a. The rationale for concentrating on the  $\omega$  field is that it closely follows divergent modes, which are sensitive to the discontinuous pressure gradients that characterize boundary nodes. There is an apparent dependence on nodal location, with interior nodes being characteristically sluggish, and corner and

edge nodes having systematically larger magnitude vertical motion. This behavior is consistent with the smoothness properties of the different nodal locations, with discontinuous pressure gradients resulting in greater vertical motion at ‘edge’ and ‘corner’ nodes. The main division of solutions shown in Figure 3a is primarily between whether a node is, or is not situated on an element boundary, and is a nuanced signature of high-order element-based Galerkin methods for non-smooth problems.

If the conventional physics-dynamics coupling paradigm is applied to CAM-SE, then the physics are to be evaluated at the GLL nodes, and a volume associated with the quadrature point should be defined. One approach to construct this grid is to decompose each spectral element into  $(np-1) \times (np-1)$  subcells and then take the dual grid of this subcell grid. For cubed-sphere meshes, this dual grid will have a control volume associated with each quadrature point. These control volumes will be triangles for the cube corner quadrature points and quadrilaterals for all remaining quadrature points. Newton iteration can then be used to adjust the corners of these control volumes so that their spherical area exactly match the Gaussian weight multiplied by the metric term (these weights are used for integrating the basis functions over the elements and can therefore, in this context, be interpreted as areas). For cubed-sphere meshes, the Newton iteration can be replaced by a direct method if some of the quadrilaterals are replaced by pentagons giving additional flexibility in matching the spherical area to the quadrature weights. Such a dual grid is shown in Figure 4. This grid is used in the NCAR CESM (Community Earth System Model) coupler for passing states between ocean, atmosphere and land components since the current remapping method is finite-volume based and therefore requires control volumes (it is noted that methods exist that do not require control volumes for conservative interpolation, e.g., Ullrich and Taylor (2015)). Hence the components ‘see’ an irregular atmospheric grid. Similarly, the parameterizations in the atmosphere ‘see’ a state that is anisotropically sampled in space (see Figure 1 and 5 in Kim et al. 2008).

The quadrature grid in element-based Galerkin methods is defined to perform mathematical operations on the basis functions, e.g., computing gradients and integrals, rather than evaluating the state variables for physics-dynamics coupling. One may argue that it would be more consistent to integrate the basis functions over quasi-equal area control volumes within each element and pass those control volume average values to physics rather than irregularly spaced quadrature point values. In this case when integrating basis functions over control volumes a grid-cell average value is more representative of the values near the extrema at the element boundary than the quadrature point value. The relationship between the nodal values, the basis functions and the proposed control volumes is illustrated

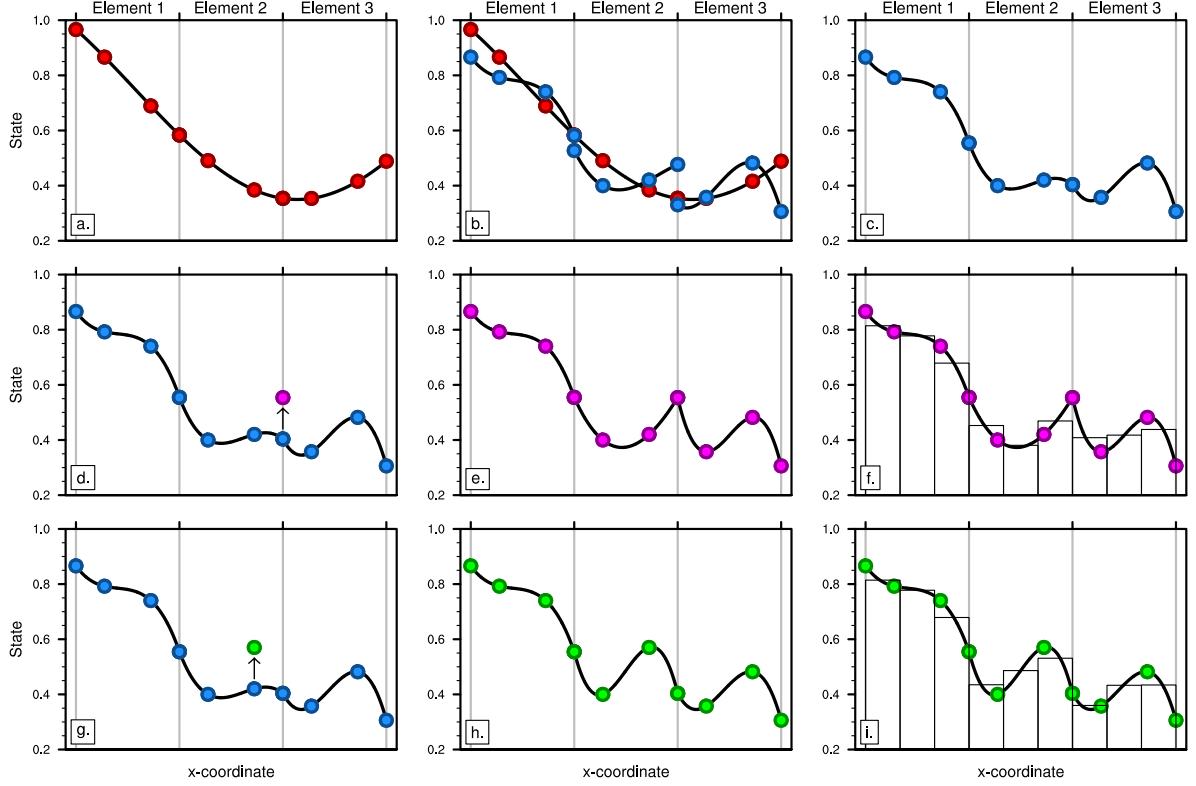


FIG. 2. A one-dimensional schematic showing the relationship between the basis functions, the quadrature nodes and the proposed physics grid, over the coarse of a time-step. The filled circles are the GLL quadrature points in each element, which are connected by a Lagrange polynomials basis (curves). (a) Smooth initial condition are (b) advanced by the dynamics one Runge-Kutta step (blue), and (c) shows the solution after applying the DSS operator. Applying (d) grid-scale forcing to an element boundary node, (e) the basis representation is clearly  $C^0$  at the element boundary. In contrast, (d) applying grid-scale forcing to an interior node (e) results in a smooth,  $C^\infty$  continuous field. (f),(i) Vertical bars represent the physics grid, found through integrating the basis over the control volumes.

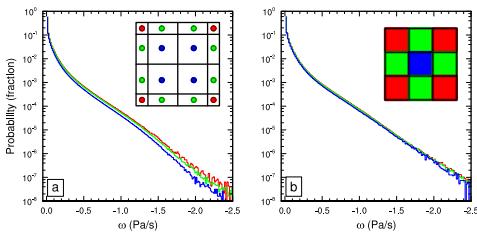


FIG. 3. Probability density distribution of instantaneous upward  $\omega$  in a pair of aqua-planet simulations using CAM4 physics. Figure is constructed from one year of six hourly data, at all vertical levels. (a)  $ne30np4$  configuration conditionally sampled for interior, edge and corner node control volumes, and similarly (b) for the  $ne30pg3$  configuration. Note the consistently larger magnitude  $\omega$  for boundary nodes compared with interior nodes in (a), and that the bias is substantially reduced through mapping to a quasi-equal area physics grid.

schematically in one-dimension in parts (f) and (i) in Figure 2.

### 3. Methods

Here we focus on CAM-SE, however, in principle the methods apply to any element-based high-order Galerkin model. The physics grid in CAM-SE is defined by sub-dividing each element using equi-angular gnomonic coordinate lines to define the sides of the physics grid control volumes (see the Appendix for details). Note that the element boundaries are defined by equi-angular gnomonic grid lines. The notation  $pg = 3$  refers to the configuration where the elements are divided into  $pg \times pg = 3 \times 3$  equi-angular physics grid cells (see Figure 5), and is therefore not an equal-area grid, but rather a quasi-equal area grid. Defining the physics grid by sub-dividing elements makes it possible to use the same element infrastructure as already used in CAM-SE, thereby facilitating its implementation. Here we make use of the  $ne30np4$  and  $ne30pg3$  grids that use GLL quadrature point physics grid (physics and dynamics grid coincide), and the same ( $pg = 3$ ) resolution quasi equal-area physics grids, respectively. In all

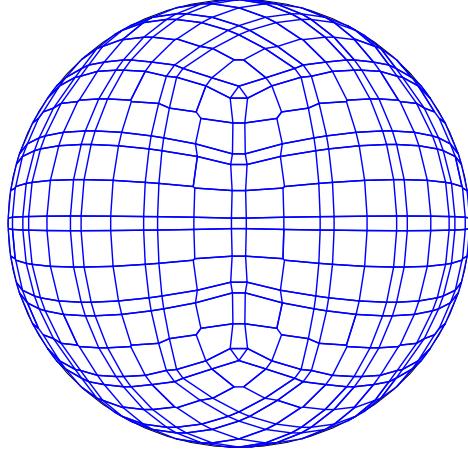


FIG. 4. An example of control volumes constructed around GLL quadrature points ( $ne4np4$ ) so that the spherical area of the control volumes exactly match the quadrature weight multiplied by the metric factor.

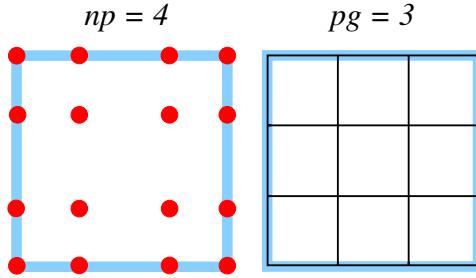


FIG. 5. A schematic illustration of an element, indicating the relationship between (left) the dynamical core grid, and (right) the proposed quasi-equal area physics grid. The physics grid contains  $pg \times pg = 3 \times 3$  grid cells in each element.

configurations we use degree three Lagrange basis ( $np = 4$ ) and  $ne \times ne = 30 \times 30$  elements on each cubed-sphere panel.

A consequence of separating physics and dynamics grids is that the atmospheric state must be mapped to the physics grid and the physics tendencies must be mapped back to the dynamics grid. This is discussed in separate sections below. When separating physics and dynamics grids it is advantageous to use a vertical coordinate that is static during physics-dynamics coupling. This was one motivation to switch to a dry-mass vertical coordinate in CAM-SE (Lauritzen et al. 2018); since dry mass remains constant throughout physics the dry-mass vertical coordinate remains fixed during physics-dynamics coupling. The dry mass coordinate subsequently evolves as floating Lagrangian layers by the dynamics (Lin 2004) periodically mapped back to a reference hybrid-sigma-pressure coordinate

dinate after Simmons and Burridge (1981). All variables mapped between grids are collocated, layer-mean values (Lauritzen et al. 2018).

#### a. Mapping state from dynamics grid (GLL) to physics grid (pg)

The dynamics state is defined on the GLL grid in terms of temperature  $T^{(gll)}$ , zonal wind component  $u^{(gll)}$ , meridional wind component  $v^{(gll)}$ , and dry pressure level thickness  $\Delta p^{(gll)}$ . In the mapping of the atmospheric state to the physics grid it is important that the following properties are met:

1. conservation of scalar quantities such as mass and dry thermal energy,
2. for tracers; shape-preservation (monotonicity), i.e. the mapping method must not introduce new extrema in the interpolated field, in particular, negatives,
3. consistency, i.e. the mapping preserves a constant,
4. linear correlation preservation.

Other properties that may be important, but not pursued here, includes total energy conservation and axial angular momentum conservation; the main reason being that we did not manage to construct a high-order reversible map that is consistent, shape-preserving and conservative but also that enforcing local total energy conservation through mapping total energy has proven problematic (e.g. Williamson et al. 2015). We argue that the most consistent method for mapping scalar state variables from the GLL grid to the physics grid is to integrate the Lagrange basis function representation (used by the SE dynamical core) over the physics grid control volumes, i.e. integrate the basis function representation of  $\Delta p^{(gll)} \times T^{(gll)}$  and  $\Delta p^{(gll)}$  over the physics grid control volume (see, e.g., Lauritzen et al. 2017; Ullrich and Taylor 2015)

$$\Delta p^{(pg)} = \frac{1}{A^{(pg)}} \int_{A^{(pg)}} \Delta p^{(gll)} dA, \quad (1)$$

$$T^{(pg)} = \frac{1}{A^{(pg)} \Delta p^{(pg)}} \int_{A^{(pg)}} T^{(gll)} \Delta p^{(gll)} dA, \quad (2)$$

where  $A^{(pg)}$  is the physics grid area. The integrals are numerically computed using the GLL quadrature rule which exactly (to machine precision) integrates the basis functions (Lauritzen et al. 2017). Thermal energy and dry air mass is conserved and the mapping is consistent. For the wind, which is a vector, the zonal and meridional wind components are mapped by transforming to contra-variant wind components, evaluating the basis function representation thereof at the equi-angular center of the physics grid control volumes and then transformed back to latitude-longitude coordinate system winds. All of the operations

are local to the element and do not require communication between elements.

The mapping of tracers is more problematic since the SE basis function representation is oscillatory although the shape-preserving filter guarantees shape-preservation at the GLL nodes (Guba et al. 2014a). To avoid this issue we use the CAM-SE-CSLAM version of CAM-SE (Conservative Semi-Lagrangian Multi-tracer transport scheme Lauritzen et al. 2017), where tracers are advected on the  $pg = 3$  physics grid. Note that in CAM-SE-CSLAM the dry mass internally predicted by CSLAM,  $\Delta p^{(cslam)}$ , is, by design, equal to  $\Delta p^{(gll)}$  integrated over the CSLAM/physics grid control volume (Lauritzen et al. 2017). Since the tracer grid and physics grids are co-located and  $\Delta p^{(pg)} = \Delta p^{(cslam)}$  then the mass conservation, correlation preservation, consistency and shape-preservation constraints are inherently fulfilled.

#### *b. Mapping tendencies from physics grid (pg) to dynamics grid (GLL)*

The physics tendencies are computed on the finite-volume physics grid and are denoted  $f_T^{(pg)}, f_u^{(pg)}, f_v^{(pg)}$ , and  $f_m^{(pg)}$ . Note that dry air mass is not modified by physics and hence there is no tendency for dry mass,  $f_{\Delta p} \equiv 0$ . Also, it is important to map tendencies and not state from the physics grid to GLL grid otherwise one will get spurious tendencies from mapping errors when the actual physics tendency is zero (unless a reversible map is used).

It is important that this process:

1. for tracers; mass tendency is conserved,
2. for tracers; in each tracer grid cell the mass tendency from physics must not exceed tracer mass available in tracer grid cell (it is assumed that the physics tendency will not drive tracer mixing ratio negative on the physics grid),
3. linear correlation preservation,
4. consistency, i.e. the mapping preserves a constant tendency.

Other properties that may be important, but not pursued here, includes total energy conservation (incl. components of total energy) and axial angular momentum conservation. Scalar variables are mapped from the physics grid to GLL grid using a tensor-product Lagrange interpolation. The local coordinates on a cubed-sphere are discontinuous at the element edges so the interpolation requires special attention at the cube corners and edges. The details are provided in the Appendix. Lagrange interpolation preserves a constant (including zero) and linear correlations. Tracer and physics grids are co-located so tracer

mass, tracer shape, and tracer correlations are trivially preserved on the tracer grid; and the inconsistency in point 2 above will not appear.

We do, however, need to map water tracers (such as water vapor, cloud liquid and cloud ice) to the GLL grid to account for moist effects in the equations of motion solved on the GLL grid. The CSLAM water tracer mixing ratios updated by physics tendencies are mapped to the GLL grid using the same tensor cubic interpolation as is used for temperature and velocity components. In between the calls to physics (i.e. in the dynamical core sub-stepping) the water tracers are advected on the GLL grid with the SE method (see section 3.5 in Lauritzen et al. 2018). Water tracer mass is not conserved in the mapping from tracer/physics grid to GLL grid. This procedure makes sure that the water tracers on the GLL grid are 'nudged' to the CSLAM solution for water tracers and the mass budget is closed on the tracer/physics grid.

In the mapping algorithm from physics to dynamics it was found (a) important to use an algorithm that is smooth across element boundaries and (b) that obtaining mass-conservation without excessive grid imprinting at element edges is difficult. In regard to (a), using an algorithm that only uses information from an element of control volumes will (at best) be  $C^0$  at the element boundaries where most of the GLL points are located. A stencil that extends beyond one element is necessary. Mass-conservation requires a control volume to be defined around the GLL points (see, e.g., Figure 4 in this paper or Figure 8b in Ullrich et al. 2016). These volumes are artificial and not consistent with the SE method. Integrating the CSLAM reconstruction of water tracers of such artificial control volumes led to GLL node grid imprinting in the mapping and will not preserve a constant mixing ratio since the mapping of  $\Delta p^{(pg)}$  to GLL will not yield the GLL node value for dry pressure-level thickness (i.e. the maps are not reversible). Hence, after much experimentation, the best results in terms of grid-imprinting were obtained with tensor-cubic interpolation and by using the CAM-SE-CSLAM configuration (which requires the same boundary exchange/communication as used in CSLAM).

#### *c. Time splitting and physics-dynamics coupling*

The physics and dynamics are integrated in time using a sequential-update approach (Lauritzen et al. 2018). The dynamical core is sub-cycled over the (usually) longer physics time-step,  $\Delta t_{phys}$ , e.g., the vertical remapping time-step  $\Delta t_{remap}$  is cycled  $rsplit$  times, summing to  $\Delta t_{phys}$ . In CAM-SE, a fraction of the physics forcing, e.g.,  $f_q * \Delta t_{remap}$  is applied at the beginning of each  $rsplit$  vertical remap subcycles, such that the full forcing ( $f_q * \Delta t_{phys}$ ) is realized over the course of a physics time-step. This approach of dribbling the tendencies over sub-intervals has the advantage of reducing gravity wave noise (Thatcher

and Jablonowski 2016), but may disrupt tracer mass conservation (Zhang et al. 2017). In CAM-SE-CSLAM, all but the tracer mass quantities are dribbled, with tracer mass receiving the full physics update, e.g.,  $f_q * \Delta t_{phys}$ , applied only at the beginning of the first remap sub-cycle, and thereby conserving tracer mass. This is the  $f_{type} = 2$  configuration described in detail in Section 3.6.3 in Lauritzen et al. (2018).

In the SE integration of the equations of motion on the GLL grid the water species are needed in the computation of the pressure gradient force and generalized expressions for heat capacity at constant pressure  $c_p$ , etc. Hence the mixing ratios for water vapor and dynamically/thermodynamically active condensates (e.g., cloud ice, cloud liquid, ...) are needed on the GLL grid. We have chosen to advect the water species on the GLL grid using the SE method as well as on the physics grid using CSLAM. Every time physics updates the water species on the CSLAM grid, a forcing term (equal to the difference between updated CSLAM water variables and the SE values) is applied to the GLL water variables using dribbling so that the CSLAM solution and SE solution for water species are tightly coupled.

## 4. Results

A hierarchy of idealized model configurations are presented in order to elucidate the differences between CAM-SE and CAM-SE-CSLAM (CAM-trunk revision 88685). Here, the configurations are presented in order of increasing complexity, each with a pair of approximately  $1^\circ$  simulations, pertaining to the *ne30np4* and *ne30pg3* grids.

### a. Moist Baroclinic Wave

The moist baroclinic wave test case was developed as part of the ‘CESM Simple Models’ project (Polvani et al. 2017), and included in the release of CESM2. It is effectively the dry test-case of Ullrich et al. (2014), but initialized with moisture and coupled to the Kessler moist physics routine (Kessler 1969). For more details on this test case (which was part of the 2016 Dynamical Core Model Intercomparison Project, see Ullrich et al. 2017), see Section 4.1 in Lauritzen et al. (2018). A measure of the uncertainty of the reference solution, the  $L_2$  difference norm between two high-resolution solutions using different dynamical cores, was also presented in Lauritzen et al. (2018) and provided again here in Figure 6. The  $L_2$  norm between CAM-SE and CAM-SE-CSLAM lies below the uncertainty of the reference solution, indicating their differences are insignificant.

The flow field of the baroclinic wave test is used to drive the terminator “toy”-chemistry test of Lauritzen et al. (2015b). The terminator test is used to assess the tracer mass conservation properties for linear-correlated reactive species being advected across the terminator line. The

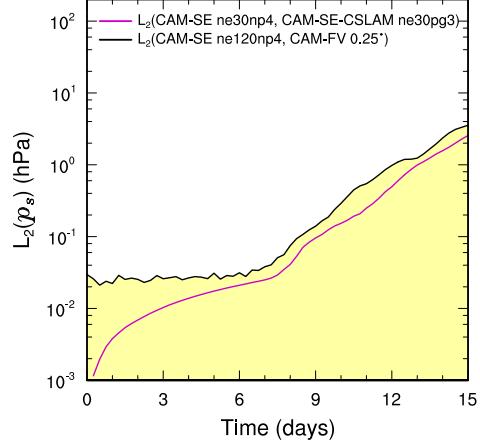


FIG. 6.  $L_2$  difference norms of the surface pressure field,  $p_s$ , in the moist baroclinic wave simulations.  $L_2$  values lying within the yellow region fall below the estimate of the uncertainty in the reference solution (black curve), computed as the difference norm between two approximately  $0.25^\circ$  resolution versions of CAM, the spectral-element and finite-volume (CAM-FV) dynamical cores.

model is initialized with two species for which their total mass is constant everywhere (constant surface pressure and constant mixing ratio  $4e - 6kg/kg$ ), such that if tracer mass is conserved, then the column integrated sum of the species should not vary in time. Figure 7 provides a snapshot of the mass-weighted, vertically integrated tracer mass at day 15. In CAM-SE, the tracer mass is not conserved by day 15 and the field is populated by overshoots and undershoots. In contrast, by day 15, CAM-SE-CSLAM still conserves tracer mass to within machine precision, consistent with the previous results of this test-case initialized with a dry baroclinic wave (Lauritzen et al. 2017).

### b. Aqua-planets

Two year long aqua-planet simulations are performed using CAM-SE and CAM-SE-CSLAM. Away from the grid-scale, the mean states in the two models are very similar. Figure 8 shows the zonal-mean climatological precipitation rates in CAM-SE and CAM-SE-CSLAM. Considering how sensitive this aqua-planet configuration is to design choices in CAM-SE (Lauritzen et al. 2018), it is somewhat unexpected that the zonal means look so similar to one another.

A plot similar to Figure 3a is constructed for the CAM-SE-CSLAM simulation, a probability density distribution of upward  $\omega$  conditionally sampled based on location within the element. Like Figure 3a, Figure 3b divides up the control volumes by corner, edge and interior cells. Through the use of the quasi-equal area physics grid, the dynamical core state appears more or less independent of

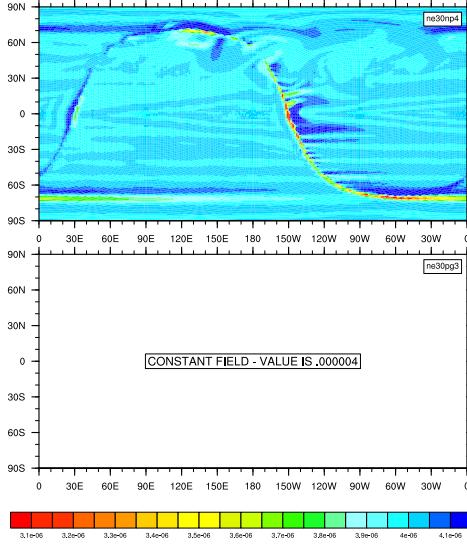


FIG. 7. Results of the terminator "toy"-chemistry test. Snapshot of the total column tracer mass at day 15 of the moist baroclinic wave test. (Top) CAM-SE, (Bottom) CAM-SE-CSLAM.

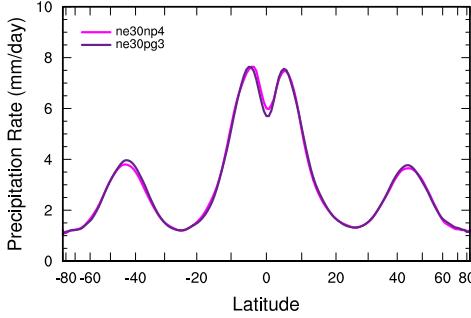


FIG. 8. Climatological zonal-mean total precipitation rate in the aqua-planets, computed from a pair of year long simulations.

location within the element, a marked improvement over CAM-SE. Since the state is approximately independent of in-element location, it follows that the physics forcing, which is evaluated from the dynamical core state, may be expected to also show an improvement in grid-imprinting.

The low-level, mean and variance of the temperature tendencies from the physics in the two simulations are shown in Figure 9. The mean states in the two models resemble one another, consistent with the zonal mean precipitation rates (Figure 8). The mean physics tendencies contains modest grid imprinting in CAM-SE (barely visible near the storm-track regions), while in the variance field, grid imprinting is both ubiquitous and unmistakable. The variance is larger on boundary nodes, manifesting as a 'stitching' pattern resembling the cube-sphere grid. In

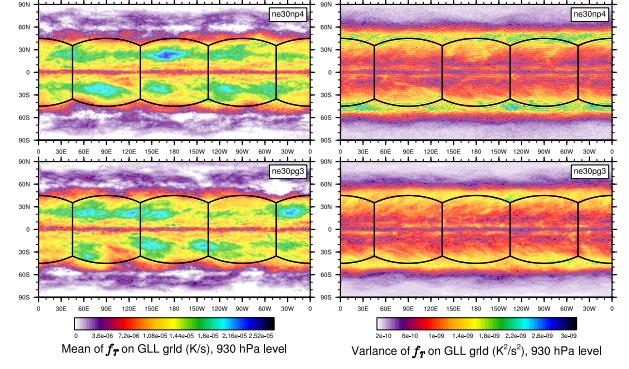


FIG. 9. Mean (left) and variance (right) of the low level temperature tendencies from the physical parameterizations on the GLL grid, with the ne30np4 configuration, (top row) and ne30pg3 configuration (bottom row), in a pair of year-long aqua-planet simulations after Medeiros et al. (2016). Grid imprinting is observed along the element boundaries in ne30np4, but is absent from the ne30pg3 simulation.

CAM-SE-CSLAM, the grid imprinting is all but eliminated based on the mean and variance of the physics tendencies (Figure 9), consistent with our expectation.

As stated in Section 3, the mapping of the state to the physics grid and the reverse interpolation of physics tendencies to the GLL grid is not total energy conserving. CAM has a global energy fixer (Williamson et al. 2015) which can be used to estimate the errors associated with the mapping algorithms. To do so, it is presumed that there are no compensating mapping errors in going to and from the physics and dynamics grids, and that CAM-SE-CSLAM and CAM-SE have the same energy dissipation rates. Under these assumptions the spurious globally integrated total energy errors due to the mapping algorithm is estimated to be approximately  $0.0025 \text{ W/m}^2$  in the aqua-planet simulations. In comparison, the dynamical core total energy dissipation is on the order of  $0.1 \text{ W/m}^2$  (Lauertzen et al. 2018).

#### c. Held-Suarez with Topography

Grid imprinting associated with the flow around obstacles is more problematic than that encountered on the aqua-planets. In order to diagnose grid imprinting due to topographic flow, an idealized held-suarez configuration (Held and Suarez 1994) is outfitted with real world topography after Fox-Rabinovitz et al. (2000); Baer et al. (2006), and run for two years. Figure 10 shows the mean  $\omega$  at two different vertical levels in the middle troposphere. The data are presented as a raster plot on their respective unstructured grids, in order to delineate whether a particular value is associated with an interior, edge or element boundary node.

At higher latitudes (e.g., the southern Andes), the flow is smooth, conforming reasonably to the underlying topography. At lower latitudes (within 20 to 30 degrees from the equator), over the Andes or the Himalayas, there is a clear preference for extrema to occur at the element boundaries (Figure 10). The vertical structure of  $\omega$  in regions of strong grid-imprinting indicates full-troposphere upward/downward motion (not shown). Grid imprinting is therefore more common in regions of weak stratification, such as occurs in the deep tropics, with forced up-slope flow facilitating the release of gravitational instability. Resolved updrafts/downdrafts often align with the element boundaries due to its systematically tighter pressure gradients.

Through the use of the quasi-equal area physics grid, grid imprinting due to topographic flow is reduced (Figures 10). Figure 10 also shows the state in CAM-SE-CSLAM, but on the GLL grid. Arguably, grid imprinting due to topography in CAM-SE-CSLAM is not much of an improvement over CAM-SE, viewed from the GLL grid. The native topography lives on the physics grid, and the topography is mapped to the nodal points at run-time in CAM-SE-CSLAM. Mapping topography to the quadrature nodes ensures that no new extrema will be introduced to the boundary nodes, where the solution is least smooth. This effect can not be very large, since the grid noise is similar in CAM-SE and CAM-SE-CSLAM on the GLL grid. From the perspective of the physics grid, the CAM-SE-CSLAM solution clearly mitigates the influence of grid-induced extrema on the state (Figure 10). The reduction in grid imprinting in CAM-SE-CSLAM is therefore almost entirely a result of the smoothing effect of integrating the basis functions over the control volumes of the physics grid.

#### *d. AMIP*

Grid imprinting has been previously identified in CAM-SE in an AMIP configuration (Figure 7 in Lauritzen et al. (2015a)), manifesting as a band of precipitation near the foot of the Himalayas, not unlike the  $\omega$  field in the held-suzrez simulations (Figure 10).

## 5. Conclusions

Element-based high-order Galerkin Methods possess many of the attractive qualities recommended for next generation global atmospheric models. Among these, high-order accuracy is achieved with minimal communication between elements, allowing for near perfect scaling on massively parallel systems. Element communication amounts to a numerical flux applied to the element boundaries, reconciling overlapping solutions of adjacent elements but degrading the smoothness of the boundary nodes in the process (to  $C^0$ ). For non-smooth problems,

gradients are systematically tighter at the element boundaries, and local extrema often characterize the boundary nodes. This behavior is illustrated using NCAR's Community Atmosphere Model with Spectral Elements dynamics (CAM-SE) in an aqua-planet configuration, and in a Held-Suarez configuration with real-world topography.

The authors argue that the conventional physics-dynamics coupling paradigm, in which the physical parameterizations are evaluated on the dynamical core grid, exacerbates grid imprinting. A separate physics grid is proposed and implemented in CAM-SE, and referred to as CAM-SE-CSLAM, through dividing the elements into quasi-equal areas with equivalent degrees of freedom. The state is mapped to the physics grid with high-order accuracy through integrating CAM-SE's Lagrange basis functions over the control volumes. Control volumes near element boundaries now represent a state in the vicinity of the extrema produced through the boundary exchange, as opposed to the the nodal value itself. These control volumes are also compatible with a 'large-scale state' as required by the physical parameterizations. The physical parameterizations are evaluated on the finite volume grid, and the forcing terms are mapped back to the dynamical core grid using a cubic tensor-product Lagrange interpolation. In aqua-planet simulations, evaluating the parameterizations on the physics grid removes any obvious dependence of proximity to the element boundary, resulting in a more realistic state with negligible grid imprinting. The mapping algorithm does not conserve total energy, but it is estimated that these errors are one to two orders of magnitude less than the total energy dissipation from the dynamical core.

In CAM-SE-CSLAM, the physics grid replaces the default CAM-SE quadrature point-based coupler grid (Figure 4) to compute fluxes between model components in the Community Earth System Model (CESM). The appeal here is two-fold. Through integrating the Lagrange basis functions over control volumes, one can be certain that the fluxes computed from this grid are a volume averaged flux. The same can not be said for CAM-SE, where the nodal values are effectively assigned to each control volume. The second advantage of the new coupler grid is that extrema occurring on boundary nodes may no longer influence other model components, in simulations without rough topography. While grid imprinting is reduced almost entirely in the aqua-planets, experiments with real-world topography reduces, but does not eliminate imprinting from the mean state. The quasi-equal area physics grid is nonetheless effective at mitigating numerical nuances associated with high-order element-based Galerkin methods, for non-smooth problems.

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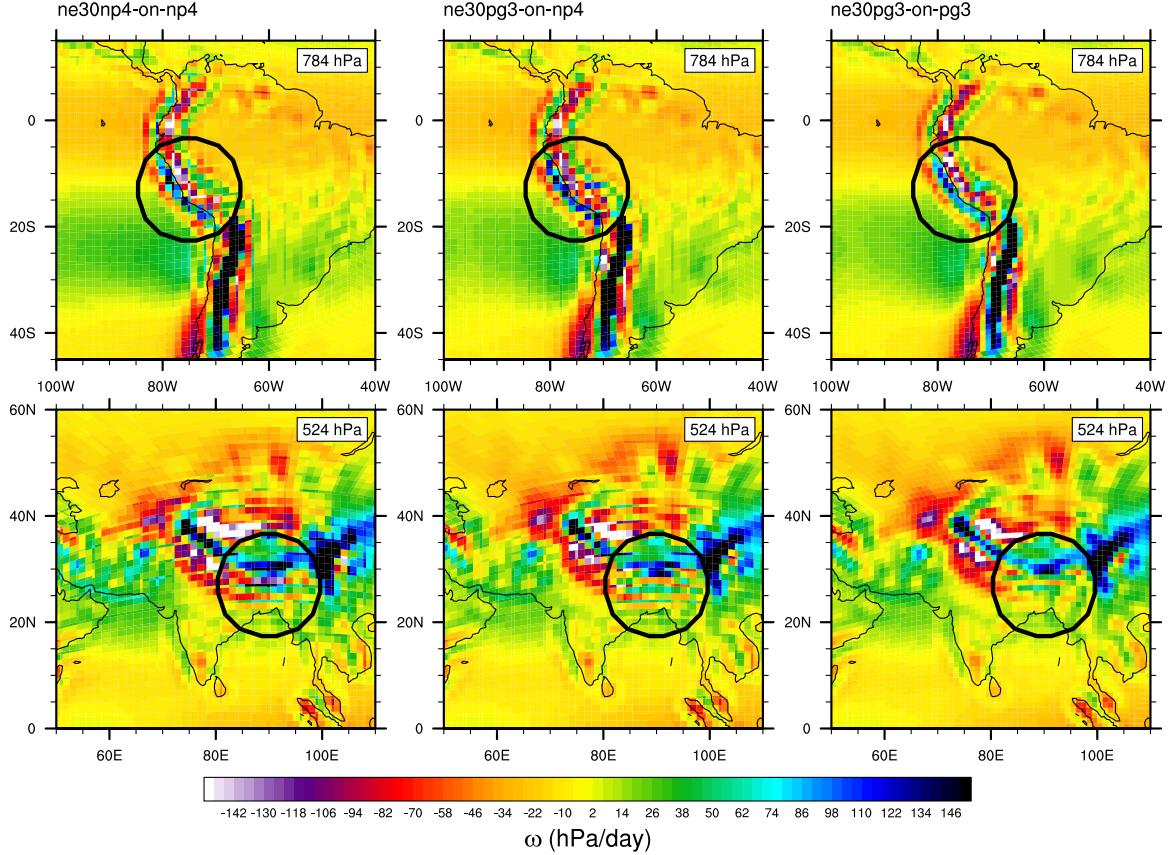


FIG. 10. Mean  $\omega$  at two model levels in the middle troposphere, in a Held-Suarez configuration outfitted with real world topography. (Left) CAM-SE state on the GLL grid, *ne30np4*, (Middle) CAM-SE-CSLAM state on the GLL grid, *ne30np4* and (Right) CAM-SE-CSLAM state on the physics grid, *ne30pg3*. The  $\omega$  fields are computed from a 1200 day Held-Suarez simulation. The data are contoured according to a ‘cell fill’ approach, in which the coupler grids (e.g., Figure 4) are used to delineate the vertices of the control volumes.

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The mapping of the physics tendencies from the physics grid to the GLL grid is done with tensor-cubic Lagrange interpolation. The elements of the cubed-sphere in SE are created from an equi-angular gnomonic projection. Consider one element  $(\alpha, \beta) \in [\alpha_1^{(elem)}, \alpha_2^{(elem)}] \times [\beta_1^{(elem)}, \beta_2^{(elem)}]$ , where  $(\alpha, \beta)$  are central angle coordinates and  $\alpha_1^{(elem)}$  and  $\alpha_2^{(elem)}$  are the minimum and maximum central angles in the  $\alpha$ -coordinate direction, respectively, and similarly for  $\beta$ . Let  $\Delta\alpha^{(elem)} = \alpha_2^{(elem)} - \alpha_1^{(elem)}$  and  $\Delta\beta^{(elem)} = \beta_2^{(elem)} - \beta_1^{(elem)}$ . The physics grid cell central angle centers are located at

$$(\alpha_i^{(pg)}, \beta_j^{(pg)}) = \left[ \alpha_1^{(elem)} + (i - \frac{1}{2}) \Delta\alpha^{(pg)}, \beta_1^{(elem)} + (j - \frac{1}{2}) \Delta\beta^{(pg)} \right], \quad (A1)$$

## APPENDIX

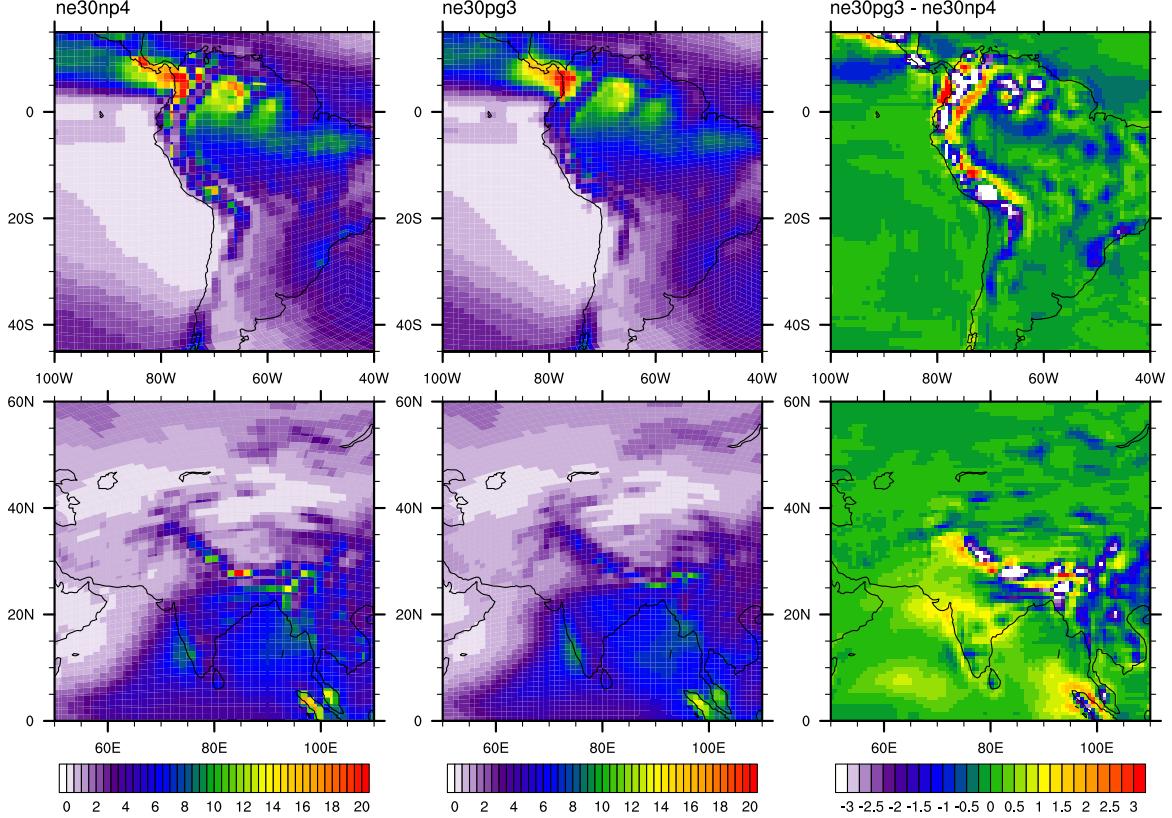


FIG. 11. Climatological total precipitation rate from a twenty year long AMIP simulation. (Left) CAM-SE, (Middle) CAM-SE-CSLAM and (Right) their differences. The difference field is computed through bilinearly interpolating to a common latitude-longitude grid.

where  $\Delta\alpha^{(pg)} = \Delta\beta^{(pg)} = \frac{\Delta\alpha^{(elem)}}{pg} = \frac{\Delta\beta^{(elem)}}{pg}$ . The interpolation is performed in central-angle coordinates using tensor product cubic interpolation. For elements located on a cubed-sphere edge or corner the coordinate system for neighboring elements may be on a different panel. To take into account this coordinate change the central angle locations of physics grid cell centers located on other panels are transformed to the coordinate system of the panel the element in question is located on (the transformations are given in, e.g., Nair et al. 2005). An illustration is given in Figure A1 for an element located in the lower left corner of a panel. The element in question is  $(\xi, \chi) \in (-1, 1)^2$  where, for simplicity, we have transformed the element coordinates into normalized coordinates  $(\xi, \chi) = \left( \frac{2(\alpha^{(pg)} - \alpha_1^{(elem)})}{\Delta\alpha^{(elem)}} - 1, \frac{2(\beta^{(pg)} - \beta_1^{(elem)})}{\Delta\beta^{(elem)}} - 1 \right)$ ; also used internally in the SE dynamical core (see, e.g., section 3.3 in Lauritzen et al. 2018). The GLL points are located at  $-1, -\sqrt{5}/5, \sqrt{5}/5$ , and  $1$  in each coordinate direction. Near the edges/corners of an element cubic ex-

trapolation is used if the centered stencil expands beyond the panel.

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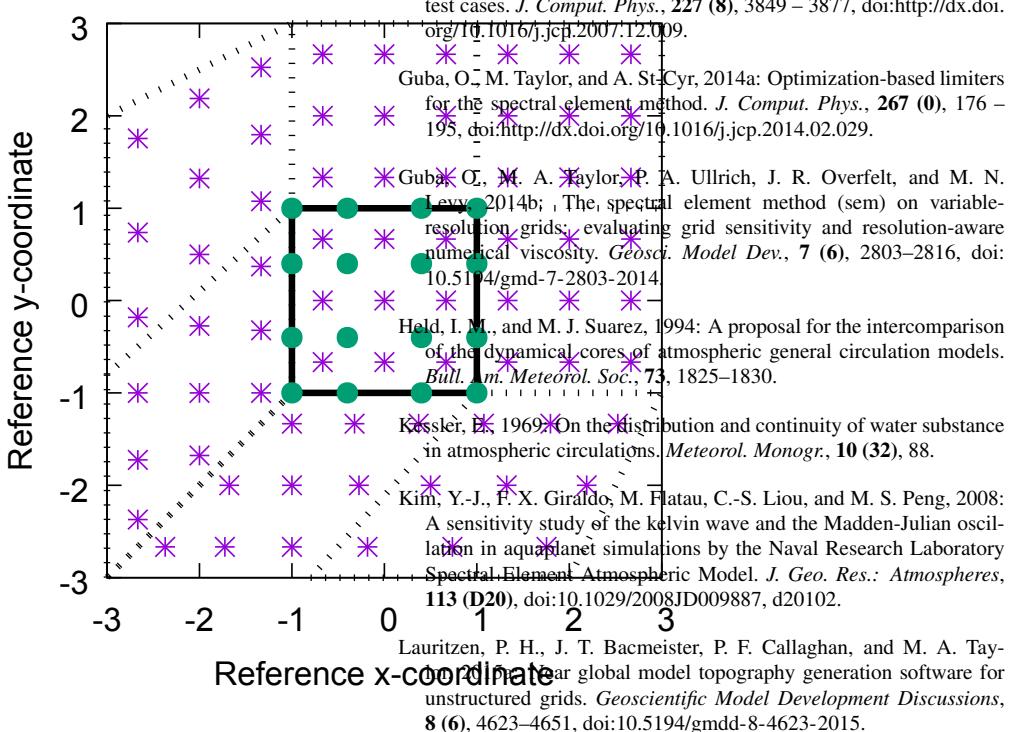


FIG. A1. Schematic of the coordinate system in which the dimensionally split cubic Lagrange interpolation is computed. The physics grid centers are marked with asterisks and the GLL points, we are interpolating to, with solid filled circles. The element in which the GLL points are located is bounded by thick black lines and located in the lower left corner of a panel. The stippled lines mark the boundaries of the remaining elements. For simplicity we are using the normalized coordinate centered at the element on which the GLL points we are interpolating to are located. Note that the coordinates for points on neighboring panels (using a different local coordinate system) must be transformed to the coordinate system of the element in question.

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