



# **Grid-Stretching Capability for the GEOS-Chem 13.0.0 Atmospheric Chemistry Model**

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**Abstract.** Modeling atmospheric chemistry at fine resolution globally is computationally expensive; the capability to focus on specific geographic regions using a multiscale grid is desirable. Here, we develop, validate, and demonstrate stretched-grids in the GEOS-Chem atmospheric chemistry model in its high performance implementation (GCHP). These multiscale grids are specified at runtime by four parameters that offer users nimble control of the region that is refined and the resolution of the

- 5 refinement. We validate the stretched-grid simulation versus global cubed-sphere simulations. We demonstrate the operation and flexibility of stretched-grid simulations with two case studies that compare simulated tropospheric NO<sub>2</sub> column densities from stretched-grid and cubed-sphere simulations to retrieved column densities from the TROPOspheric Monitoring Instrument (TROPOMI). The first case study uses a stretched-grid with a broad refinement covering the contiguous US to produce simulated columns that perform similarly to a C180 ( $\sim$ 50 km) cubed-sphere simulation at less than one-ninth the compu-
- 10 tational expense. The second case study experiments with a large stretch-factor for a global stretched-grid simulation with a highly localized refinement with  $\sim$ 10 km resolution for California. We find that the refinement improves spatial agreement with TROPOMI columns compared to a C90 cubed-sphere simulation of comparable computational demands, despite conducting the simulation at a finer resolution than parent meteorological fields. Overall we find that stretched-grids in GEOS-Chem are a practical tool for fine resolution regional- or continental-scale simulations of atmospheric chemistry. Stretched-grids are
- 15 available in GEOS-Chem version 13.0.0.





# 1 Introduction

Global simulations of atmospheric chemistry are computationally demanding. Chemical mechanisms in the troposphere typically involve more than 100 chemical species, emitted by anthropogenic and natural sources, mixing through 3-D transport on all scales. Typical global model resolutions are on the order of hundreds of kilometers and generally limited by the availability
of computational resources. Massively parallel models such as GEOS-Chem in its high-performance implementation (GCHP; Eastham et al. (2018)) can run on more than 1000 cores (Zhuang et al., 2020) with demonstrated capability of 50 km resolution. The coarse resolution of global models can lead to systematic errors in applications when scales of variability finer than the model resolution are relevant, such as vertical transport and scavenging by convective updrafts (Mari et al., 2000; Li et al., 2018, 2019), nonlinear chemistry such as NO<sub>x</sub> titration (Valin et al., 2011), localized emission sources (Davis et al., 2001;

- 25 Freitas et al., 2007), a priori profiles for satellite retrievals (Heckel et al., 2011; Goldberg et al., 2017; Kim et al., 2018), and simulated concentrations for population exposure estimates (Punger and West, 2013; Li et al., 2016). Nested grids are commonly used for simulations that need to capture fine-scale modes of variability. With one-way nested grids, a global simulation generates boundary conditions for a fine resolution regional simulation (Wang et al., 2004; Lin et al., 2020). With two-way nested grids, the global simulation is dynamically coupled to the regional simulation (Yan et al., 2014; Feng et al., 2020). An
- 30 alternative type of multiscale grids that are well-established in the regional climate modeling community are stretched-grids (Fox-Rabinovitz et al., 2006, 2008). Stretched-grids are deformed model grids with increased grid density in the region of interest, and transition smoothly between the refinement and coarser global resolutions. Stretched-grids have the advantage of being inherently two-way coupled, and since stretching does not change the grid topology, grid-independent models like GEOS-Chem can implement stretched-grids without structural changes or online simulation couplers. Stretched-grid simula-
- 35 tions have little overhead and are economical because their computational cost is similar to a cubed-sphere simulation with the same grid size. Here we implement, validate, and demonstrate stretched-grids in GEOS-Chem, enabling massively parallel global multiscale simulations of atmospheric chemistry.

Several recent works set the stage for the development of grid-stretching in GEOS-Chem. Long et al. (2015) developed the grid-independent capability of GEOS-Chem. Harris et al. (2016) developed the capability for stretched-grids in the GFDL

- 40 Finite-Volume Cubed-Sphere Dynamical Core (FV3), which GCHP uses to calculate advection. Eastham et al. (2018) developed the capability for GEOS-Chem to operate on cubed-sphere grids in a distributed memory framework for massive parallelization, and to use the Model Analysis and Prediction Layer (MAPL) of the NASA Global Modeling and Assimilation Office (GMAO) together with the Earth System Modeling Framework (ESMF) to couple model components. GEOS-Chem version 12.5.0 added grid-independent emissions that produce consistent emissions regardless of the model grid (Weng et al.,
- 45 2020; The International GEOS-Chem User Community, 2019). Most recently, MAPL version 2 (Thompson et al., 2020) of the NASA GMAO added stretched-grid support.

This manuscript describes the development and validation of the grid-stretching capability in GCHP and discusses practical considerations for running stretched-grid simulations. Sect. 2.1 provides an overview of GCHP and its underlying gnomonic cubed-sphere grid. Sect. 2.2 describes stretching the grid with the Schmidt (1977) transform following the methodology of





- Harris et al. (2016). Sect. 2.3 discusses considerations for stretched-grid simulations and a simple procedure for choosing an 50 appropriate stretch-factor. Sect. 2.4 describes the model configuration for the simulations in the manuscript. Sect 2.5 summarizes the testing of stretched-grids in GCHP and provides a comparison of simulated oxidants and PM<sub>2.5</sub> concentrations from stretched-grid and cubed-sphere simulations. Sect. 3 presents two case studies that demonstrate and explore stretchedgrid applications, with comparisons of stretched-grid and cubed-sphere simulations with observations from TROPOspheric Monitoring Instrument (TROPOMI). 55

### **Development of Stretched-Grids in GEOS-Chem** 2

#### 2.1 **GEOS-Chem in its High-Performance Implementation (GCHP)**

We use GEOS-Chem version 13.0.0 in its high-performance implementation (GCHP; Eastham et al. (2018)). GEOS-Chem, originally described in Bey et al. (2001), simulates tropospheric-stratospheric chemistry by solving 3-D chemical continuity equations. GCHP uses MAPL (Suarez et al., 2007) and ESMF (Hill et al., 2004), which facilitate the coupling of model 60 components and the use of the High-Performance Computing (HPC) infrastructure. The 3-D advection component is the GFDL Finite-Volume Cubed-Sphere Dynamical Core (Putman and Lin, 2007). Columnar operators (Long et al., 2015) are used for columnar or local calculations such as convection and chemical kinetics. Emissions are aggregated, parameterized, and computed with the Harmonized Emissions Component (HEMCO) described in Keller et al. (2014). Offline meteorological

- data is from the Goddard Earth Observing System (GEOS) data assimilation system. All regridding, including the regridding 65 of emissions data and meteorological data, is performed online by ESMF. GCHP discretizes the atmosphere with a gnomonic cubed-sphere grid with levels extending from the surface to 1 Pa. The cubed-sphere grid has several advantages over the conventional latitude-longitude grid, stemming from its more uniform grid-boxes that benefit the parallelization and numerical stability of transport (Eastham et al., 2018). The horizontal resolution of a GCHP simulation is a key determinant of its 70 computational demands.
  - 2.2 Grid-stretching

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The grid-stretching procedure in GCHP, described here, uses a simplified form of the Schmidt transform for gnomonic cubedsphere grids, and follows the methodology of Harris et al. (2016). The Schmidt (1977) transform can be applied to any grid, and effectively stretches the grid to increase its density in a region. The grid-stretching procedure has two steps and starts with

a gnomonic cubed-sphere grid. First, the grid is refined at the South Pole by remapping the grid coordinate latitudes with a 75 modified Schmidt transform

$$\phi'(\phi) = \arcsin\frac{D + \sin\phi}{1 + D\sin\phi} \quad \text{where} \quad D = \frac{1 - S^2}{1 + S^2} \tag{1}$$

where  $\phi$  is an input latitude,  $\phi'$  is the output latitude, and S is a parameter called the *stretch-factor*. The stretch-factor controls the strength of this remapping operation, which effectively attracts the grid coordinates towards the South Pole along meridians. The second step is rotating the entire grid so that the refinement at the South Pole is repositioned to the region of interest. The







Figure 1. Three stretched-grids that illustrate the effect of the stretch-factor (S) on stretching a C16 cubed-sphere. Local scaling is the relative change to a grid-box's edge length induced by stretching.

user specifies a *target latitude* and *target longitude* ( $\phi_t$ ,  $\theta_t$ ), and the refinement is re-centered to this coordinate. In GCHP, according to the right-hand-rule, these rotations are  $\phi_t + 90$  about 90 °E and  $\theta_t + 180$  about 90 °N. Note that nonstretched cubed-sphere grids in GCHP have a -10 °E offset, so a stretched-grid with parameters S = 1,  $\phi_t = -90$  °N,  $\theta_t = 170$  °E is identical to a nonstretched cubed-sphere grid.

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Figure 1 illustrates the effect of S on stretching a cubed-sphere grid. A stretch-factor greater than one causes stretching. Larger stretch-factors cause more stretching, and result in a finer and more localized refinement. The resolution at the center of the refinement is approximately S times finer than it was before stretching, and similarly, the antipode resolution is approximately S times coarser. These relative changes are approximate since the Schmidt transform is continuous and the grid-boxes have nonzero length edges. The grids in Figure 1 illustrate three noteworthy features of stretched-grids: (1) the changes in res-

90 olution are smooth, (2) the refined domain gets smaller as S increases, and (3) grid-boxes outside the refined domain expand. The cubed-sphere face at the center of the refined domain is called the *target-face*.

The relative change to a grid-box's size from stretching can be quantified by *local scaling*. This quantity represents the effect of grid-stretching at a given point. For a stretch-factor of S, the local scaling at a given point depends exclusively on how far that point is from the target coordinate. Local scaling, L, can be derived from Eqn. 1, and expressed as

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$$L(\Theta;S) = \frac{1 + \cos\Theta + S^2(1 - \cos\Theta)}{2S}$$
(2)

where  $\Theta$  is the angular distance to the target point. Appendix B contains the derivation of Eqn. 2. Figure 2 shows local scaling as a function of distance, for stretch-factors between 1 and 10. Overlaid are dashed lines that show the distance of cubed-sphere face edges after stretching. In the target-face, local scaling is approximately 1/S and nearly constant. Grid-stretching refines the resolution to the distance where L = 1, and coarsens the resolution at farther distances.







Figure 2. Local scaling as a function of distance from the target point, for stretch-factors in the range 1–10. The dashed lines show the distance from the target point to the cubed-sphere face edges after stretching. The lower dashed line is the distance to the center of the target-face's edges, and the upper dashed line is the distance to the center of the opposite face's edges.

100 Four scalar parameters fully describe a stretched-grid: the size of the cubed-sphere, the stretch-factor (S), the target latitude  $(\phi_t)$ , and the target longitude  $(\theta_t)$ . These concise parameters are conceptually simple, precise, and give the user nimble control of the grid. The combination of cubed-sphere size and stretch-factor controls the grid resolution. The target latitude and longitude specify the center of the refined domain. Moderate stretch-factors (e.g., 1.4–3.0) are suitable for broad refinements for continental-scale studies. Large stretch-factors (e.g., >5.0) are suitable for localized refinements for regional-scale studies.

#### 105 Choosing an appropriate stretch-factor 2.3

Although the stretch-factor is a well-defined parameter, an appropriate value is application-specific and moderately variable. For computational efficiency, it is desirable to use the largest viable stretch-factor, to achieve the finest refinement for a given cubed-sphere size. However, larger stretch-factors also result in a smaller domain being refined and a coarser resolution at the target's antipode. To determine the maximum suitable stretch-factor for a given application, one should consider the size of

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- the domain to be refined, and the sensitivity of the study species to coarse resolution outside the refined domain. It is also worth noting that there is limited prior model evaluation of GEOS-Chem at resolutions coarser than C24 ( $\sim$ 400 km). A simple procedure for choosing a stretch-factor, S, is choosing the maximum stretch-factor subject to two constraints:
  - 1. Constraining S by the size of the refined domain. Local scaling is approximately constant and equal to 1/S throughout the target-face. Therefore, defining the refined domain as the region whose resolution is enhanced by a factor of  $\sim S$ , the





- 115 target-face is a reasonable approximation of the refined domain. A constraint for *S*, such that the width of the target-face is greater than  $w_{tf}$ , is  $S < 0.414 \cot(w_{tf}/4 r_E)$  where  $r_E$  is Earth's radius. For example, for a refined domain with a diameter of at least 3000 km, S < 3.5. Alternatively, one can inspect Figure 2 to find the distance from the target point to the edge of the target-face for a given value of *S*.
  - Constraining S by a maximum and minimum resolution. The target resolution is S<sup>2</sup> times finer than the antipodal resolution; therefore, a constraint for S based on the desired maximum resolution, R<sub>max</sub>, and minimum resolution, R<sub>min</sub>, is S < √(R<sub>max</sub>/R<sub>min</sub>). For example, for a maximum and minimum resolution comparable to a nonstretched C360 and C24 cubed-sphere, S < 3.9.</li>

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Once the constraints for S are determined, one can choose S and the grid size for their simulation. It is worth noting that GCHP requires that the grid size is an even integer (e.g., C88, C90, and C92). For example, for a stretched-grid with refined domain with a diameter greater than 3000 km, a maximum resolution of C360, and a minimum resolution of C24, the constraints would be S < 3.5 and S < 3.9. Then, one would choose a cubed-sphere size of C104 and S = 3.46.

# 2.4 Model configuration

All simulations in this manuscript use GCHP version 13.0.0-alpha.3 with a common configuration. Table 1 describes emissions for the US. We use monthly anthropogenic emissions based on the National Emission Inventory (NEI) for 2011 with updated annual scaling factors to account for changes in annual totals since 2011. In 2018, the scaling factor for NO was 0.64. Biomass burning emissions are from the Global Fire Emissions Database version 4 (GFED4). Aircraft emissions are from the Aviation Emissions Inventory Code (AEIC; Stettler et al. (2011)). We use inventories for NO<sub>x</sub> emissions from soil microbial activity and lightning calculated offline at the native resolution of the meteorology (Weng et al., 2020; The International GEOS-Chem User Community, 2019). Offline soil NO<sub>x</sub> emissions are based on the scheme described in Hudman et al. (2012), and offline
135 lightning NO<sub>x</sub> emissions are based on the scheme described in Murray et al. (2012). We use meteorological inputs from the

GEOS-FP archive, which are archived on a  $0.25^{\circ} \times 0.3125^{\circ}$  grid. We use a 10-minute timestep for chemistry and a 5-minute timestep for transport. The initial conditions for each simulation were regridded offline.

Simulations are named according to their grid. Nonstretched cubed-sphere simulations are named by their resolution with the suffix "-global", referring to their resolution being quasi-uniform globally. For example, a nonstretched C180 cubed-sphere

140 simulation is named "C180-global". Stretched-grid simulations are named according to their refinement effective resolution, with a suffix denoting the region that is refined. For example, a stretched-grid simulation with an effective resolution of C180 in the contiguous US is named "C180e-US". "C180e" refers to the stretched-grid refinement being comparable to the resolution of a C180 cubed-sphere grid.

# 2.5 Stretched-grid development and validation

145 Developing and testing stretched-grids in GCHP involved multiple stages. The first step was developing a prototype simulation to confirm the functionality of grid-stretching in each model component. The prototype simulation excluded chemistry and





Table 1. Simulation emission sources for the US.

Source type	Inventory	Resolution	Notes
Anthropogenic	NEI-2011	$0.1^{\circ} \times 0.1^{\circ}$	With updated annual totals for 2018 <sup>1</sup>
Lightning		$0.25^{\circ} \times 0.3125^{\circ}$	Described in Murray et al. (2012)
Soil		$0.25^{\circ} \times 0.3125^{\circ}$	Described in Weng et al. (2020)
Biomass burning	GFED4	$0.25^{\circ} \times 0.25^{\circ}$	Monthly fluxes
Aircraft	AEIC	$1.0^{\circ} \times 1.0^{\circ}$	Described in Stettler et al. (2011)
Shipping	CEDS <sup>2</sup>	$0.5^{\circ}{ imes}0.5^{\circ}$	Described in McDuffie et al. (2020)

1. Monthly fluxes, including diurnal and weekday-weekend variations and vertical allocations, based on criteria pollutants National Tier 1 from https://www.epa.gov/air-emissions-inventories/air-pollutant-emissions-trends-data (Accessed May 8, 2020).

2. Community Emissions Data System (CEDS)

used a simplified set of emissions. Once the prototype simulation was operational, full chemsitry and the full set of emissions were enabled. Specialized benchmarking code was then used to compare stretched-grid and cubed-sphere simulations, to debug and test the implementation.

- Next we compare the concentrations of oxidants and  $PM_{2.5}$  from cubed-sphere and stretched-grid simulations. The domain for this comparison is the contiguous US, and a C96 cubed-sphere simulation was chosen as the control (C96-global). The stretched-grid simulation, C96e-NA, had a grid size of C48, and its parameters were chosen so its average resolution was the same as C96-global in the contiguous US. C96e-NA's parameters were S = 2.4,  $\phi_t = 35^\circ$  N, and  $\theta_t = 96^\circ$  W. Figure 3 compares the resolution of C96e-NA and C96-global grids. Note that the stretch-factor is 2.4, rather than 2.0, because the
- 155 cubed-sphere's quasi-uniform resolution is finer in the US than its nominal global resolution. A consequence of C96e-NA and C96-global having similar resolution is that their grid-boxes have minimal overlap. This makes the comparison sensitive to the precision of upscaling emissions (i.e. differences in upscaled emissions like NO point sources from the differences in how the grids cover a region). To calibrate expected differences between C96e-NA and C96-global, we compare C96-global to a second cubed-sphere simulation, C94-global. The resolution difference between C96-global and C94-global is 2.1 %; C96-global and
- 160 C94-global grid-boxes have minimal overlap (beat frequency of 2), and the only overlapping occurs at the edges and center lines of faces.

Figure 4 compares C96e-NA with C96-global, and C94-global with C96-global. These comparisons are done for the fourth simulation month, to accomodate relaxation time for CO and  $O_3$ . The scatter near the surface is caused by differences in the spatial allocation of emissions on different grids (the precision of upscaling). Figure 4 shows that simulated averages from

165 C96e-NA are consistent with C96-global and that their differences are comparable to the differences between two similar cubed-sphere simulations.







**Figure 3.** Comparison of C96-global and C96e-NA grids. The top panels show the variability of resolution for both grids. The bottom panel shows the grid face edges for C96-global and C96e-NA, with the 125 km, 250 km, and 500 km resolution contours for C96e-NA.

# 3 Stretched-Grid Case-Studies

Next, we focus on two case studies to further demonstrate the operation of stretched-grid simulations and the flexibility of stretched-grid refinements. The first is a typical case that considers a stretched-grid simulation with a moderate stretch-factor
for a broad refinement covering the contiguous US at ~50 km (C180e) resolution. The second is an exploratory case that experiments with a large stretch-factor for a localized refinement covering California at ~10 km (C900e) resolution. The resolution of our second case study (~10 km) is more than twice as fine as GEOS-Chem's native resolution of C360 (~25 km) determined by the GEOS assimilated meteorological data.

We focus on NO<sub>2</sub> as a well measured species that is sensitive to resolution. Simulated tropospheric NO<sub>2</sub> column densities from stretched-grid and cubed-sphere simulations are compared to retrieved column densities from TROPOMI (Veefkind et al., 2012). TROPOMI is an instrument onboard the Sentinel-5P satellite launched in 2018 into a sun-synchronous orbit with a local overpass time of 13:30. TROPOMI includes ultraviolet and visible band spectrometers, and the retrieved NO<sub>2</sub> column







**Figure 4.** Comparison of simulated concentrations from C96e-NA with C96-global, and C94-global with C96-global. Points are 1-month time averages for each grid-box in the contiguous US for the fourth simulation month (September 2018). The right column gauges expected differences due to the precision of upscaling emissions to different grids.





densities at  $3.5 \times 5.5$  km<sup>2</sup> resolution use a modified version of the Dutch OMI NO<sub>2</sub> (DOMINO) retrieval algorithm (Boersma et al., 2011, 2018). We include observations with retrieved cloud fractions less than 10 %. Retrieved NO<sub>2</sub> column densities

- 180 are sensitive to the a priori profiles used to calculate the air mass factors (Boersma et al., 2018; Lorente et al., 2017). To avoid spurious differences from the retrieval's a priori profiles when comparing simulated and retrieved NO<sub>2</sub> column densities, we recalculate the air mass factors with the mean simulated relative vertical profiles (shape factors) from the stretched-grid simulations following the approach described in Cooper et al. (2020) and Palmer et al. (2001). Evaluations of TROPOMI NO<sub>2</sub> columns show good correlation with ground-based measurements with a small low bias (Griffin et al., 2019; Ialongo et al., 185 2020; Zhao et al., 2020; Tack et al., 2020).

# 3.1 A stretched-grid simulation with a moderate stretch-factor

Stretched-grids with moderate stretch-factors have broad refinements and are well-suited for continental-scale simulation purposes. Here, we compare a global fine resolution C180 cubed-sphere simulation (C180-global) to a stretched-grid simulation with a moderate stretch-factor. This comparison focuses on the contiguous US. The stretched-grid simulation, C180e-US, has a grid size of C60 and parameters S = 3.0,  $\phi_t = 36^{\circ}$  N, and  $\theta_t = 99^{\circ}$  W. Figure 5 compares the grids of C180-global and 190 C180e-US. For the contiguous US, the average resolution of C180-global is 47.9 km and the average resolution of C180e-US is 56.6 km. The two simulations have comparable resolution, but the cost of C180e-US is comparable to that of a C60 simulation; C180e-US has nine times fewer grid-boxes than C180-global. The coarsest resolution of C180e-US is approximately C20e in the southern Indian Ocean. In addition to C180-global and C180e-US, we conducted a C60 cubed-sphere simulation

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(C60-global) for comparison with C180e-US.
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Figure 6 shows tropospheric NO<sub>2</sub> column densities from TROPOMI, C180-global, C180e-US, and C60-global for the US in July 2018. The three simulations included a 1-month spinup. The TROPOMI columns have high-concentrations over major cities and low NO<sub>2</sub> concentrations in rural and remote regions. Simulated NO<sub>2</sub> column densities from C180-global and C180e-US are consistent throughout the domain and generally capture the plumes over cities and the low concentrations in rural and

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remote areas. Small differences like those seen at the Four Corners, or near Denver, can be attributed the differences from upscaling NO point sources to the simulation grids. C60-global failed to resolve the local enhancements over major cities, and comparison with C180e-US highlights the effectiveness of grid-stretching.

The computational demands of C180e-US were significantly less than C180-global and comparable to C60-global. Table 2 gives timing test results for C180-global, C180e-US, and C60-global. The total CPU time for C180e-US was nearly a factor of

20 less than C180-global, resulting from fewer grid-boxes and reduced overhead. The total CPU time for C180e-US was 15 % 205 greater than C60-global. The slight increase of data input cost in C180e-US is suspected to be caused by a load imbalance in online input regridding in ESMF. Work to mitigate this load imbalance is underway.

#### A stretched-grid simulation with a large stretch-factor 3.2

Stretched-grids with large stretch-factors have localized refinements. Here we experiment with a large stretch-factor to create a localized refinement covering California at  $\sim 10$  km resolution. Our focus on California is motivated by the pronounced 210







**Figure 5.** Comparison of C180-global and C180e-US grids. The top panels show the variability of resolution for both grids. The bottom panel shows the grid face edges for C180-global and C180e-US, with the 100 km, 250 km, and 500 km resolution contours for C180e-US.

heterogeneity in sources and topography that has challenged global models. The stretched-grid simulation, C900e-CA, has a grid size of C90 and stretch parameters S = 10,  $\phi_t = 37.2$  °N, and  $\theta_t = 119.5$ ° W. This simulation demonstrates that computationally, stretched-grid simulations are capable of very fine resolutions that are comparable to those of regional models. This experiment leverages the fine resolution of anthropogenic NO emissions from the NEI-2011 inventory ( $0.1^{\circ} \times 0.1^{\circ}$  or ~9 km).

- 215 The meteorological data is conservatively downscaled from its native resolution of 0.25°×0.3125°. This downscaling, along with all other regridding is performed online by ESMF. Work is underway in the GCHP–GMAO community to prepare finer resolution meteorological inputs for GEOS-Chem (including more vertical levels). Figure 7 shows the grids of C900e-CA and a nonstretched C90 cubed-sphere simulation, C90-global. The average resolution of C900e-CA in California is 11.2 km. The large stretch-factor used in C900e-CA causes some grid-boxes to expand significantly. Local scaling is useful for understanding
- the variability of the grid's resolution. For example, New York is approximately 4000 km from C900e-CA's target point. Figure 2 shows that for S = 10, the local scaling at 4000 km is close to 1. Equivalently, substituting S = 10 and  $\Theta = 4000 \text{ km/r}_{\text{E}}$







**Figure 6.** Mean tropospheric  $NO_2$  column densities from C180-global, C180e-US, C60-global, and TROPOMI observations for July 2018. Simulated means only include points where TROPOMI observations were available. TROPOMI columns shown here use shape factors from C180e-US. TROPOMI columns with shape factors from C180-global were nearly identical.

Table 2. Timing test results comparing the computational expense of C180-global, C180e-US, and C60-global.

		C180-global	C180e-US	C60-global
Number of cores	(CPUs)	384	48	48
Wall times				
Chemistry	(hours)	21.8	7.0	7.2
Dynamics	(hours)	3.1	1.7	1.7
Data Input	(hours)	0.5	1.8	0.3
Other	(hours)	0.3	0.2	0.2
Total wall time	(hours)	25.7	10.7	9.4
Total CPU time	(days)	411	21.3	18.7







**Figure 7.** Comparison of C90-global and C900e-CA grids. The top panels show the variability of resolution for both grids. The bottom panel shows the grid face edges for C90-global and C900e-CA, with the 100 km, 500 km, and 1000 km resolution contours for C900e-CA.

in Eqn. 2 gives L = 1.04. Therefore, the resolution of C900e-CA in New York is similar to a nonstretched C90 cubed-sphere. This can be confirmed in Figure 7.

- Figure 8 shows tropospheric NO<sub>2</sub> column densities from TROPOMI, C900e-CA, and C90-global for California in July 2018.
  The TROPOMI columns have significant fine-scale variability throughout California, high-concentrations over Los Angeles and in the San Francisco Bay Area, and smaller high-concentration features over Sacramento, Fresno, and Bakersfield. C900e-CA resolves many of the fine-scale spatial features seen in the TROPOMI columns, including the small high-concentration features over Sacramento, Fresno, and Bakersfield. The coarse resolution of C90-global fails to resolve most spatial features seen in the TROPOMI and C900e-CA columns, and significantly underestimates high concentrations except in Los Angeles
- 230 (LA). A subtle feature in the TROPOMI columns is the strong gradient along the LA Basin perimeter. Neither simulation captures this gradient well, and LA's plume spuriously spreads into the Mojave Desert. The shallow inversion that prevents the plume from rising over the mountains might be better represented in finer resolution meteorological inputs that could better







**Figure 8.** Mean tropospheric  $NO_2$  column densities from C90-global, C900e-CA, and TROPOMI observations for July 2018. Simulated means only include points where TROPOMI observations were available. TROPOMI columns shown here use shape factors from C900e-CA.

capture sea breeze effects. Nonetheless, C900e-CA demonstrates a pronounced improvement over C90-global at resolving the challenging heterogeneity of California with similar computational expense (within 17 %).

# 235 4 Conclusions

Fine resolution simulations of atmospheric chemistry are necessary to capture fine-scale modes of variability such as localized sources, nonlinear chemistry, and boundary layer processes, but fine resolution simulations have been impeded by computational expense. This work developed stretched-grids for the high-performance implementation of GEOS-Chem (GCHP). The capability was validated against global cubed-sphere simulations, and applications were probed with case studies that compared simulated concentrations with observations from the TROPOMI satellite instrument.

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Stretched-grids enable multiscale grids in GCHP and complement the other multiscale grid methods that are available in GEOS-Chem variants. The primary benefit of grid-stretching is ease of use. The refinement is flexible and controlled by four simple runtime parameters. Stretched-grids operate naturally in GCHP, so switching between stretched-grids and cubed-sphere grids is seamless. Stretched-grid simulations are standalone simulations, and do not require any pregenerated or dynamically-





245 coupled boundary conditions. Compared to nested grids, the main disadvantage of grid-stretching is that there is a single refinement, and that one cannot control the refined domain, refinement resolution, and global resolution independently. Stretched-grid simulations can be used for regional- or continental-scale simulation purposes. Generally, stretch-factors

in the range 1.4–4.0 are applicable for large refined domains. Higher stretch-factors can be used for very fine resolution simulations for regional-scale applications. To aid in choosing an appropriate stretch-factor, we propose a simple procedure

250 based on choosing the maximum stretch-factor subject to two constraints: the size of the refinement, and the maximum and minimum resolution.

Computationally, stretched-grid simulations are capable of unprecedented spatial resolutions for GEOS-Chem. Improved emissions, with more accurate spatial and temporal variability, and meteorological inputs with finer horizontal, temporal, and vertical resolution are needed to fully exploit these newly achievable resolutions. Stretched-grids are publicly available and ready for scientific application in GEOS-Chem version 13.0.0.

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*Code availability.* GEOS-Chem is an open source project distributed under the MIT License at https://github.com/geoschem/GCHP. The exact version of GCHP used in this manuscript was 13.0.0-alpha.3, and is archived on Zenodo (The International GEOS-Chem User Community, 2020).









## Appendix A: Variability of cubed-sphere grid resolution

Figure A1 shows the variability of a C180 cubed-sphere grid's resolution. The coarsest resolutions is at the center of faces, and the finest resolutions are at the corners of the faces. The average resolution is 51.1 km. The resolution at the center of the face is 61.9 km (21.1 % greater than the average resolution). The resolution at the corner of the face is 40.6 km (25.8 % less than the average resolution).

# **Appendix B: Derivation of local scaling**

Local scaling, L, is the relative change to a grid-box's length from grid-stretching. Consider a line segment that follows a meridian. The line segment starts at y and has length Δy. After remapping the line segment with the Schmidt transform (Eqn. 1), the line segment starts at y' and has length Δy'. The limit of the segment's local scaling as Δy → 0 is equal to the derivative of the Schmidt transform:

$$L(y';S) = \lim_{\Delta y \to 0} \frac{\Delta y'}{\Delta y} = \lim_{\Delta y \to 0} \frac{\phi'(y + \Delta y) - \phi'(y)}{\Delta y} = \frac{\mathrm{d}}{\mathrm{d}y}\phi'(y)$$
(B1)

270 The derivative of the Schmidt transform is

$$\frac{d}{dy}\phi'(y) = \frac{2S}{S^2(1-\sin y) + \sin y + 1}$$
(B2)



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so the local scaling at y' is

$$L(y';S) = \frac{2S}{S^2(1-\sin y) + \sin y + 1}$$
(B3)

We can obtain the local scaling at y, rather than y', by substituting the inverse of the Schmidt transform into Eqn. B3. This gives

$$L(y;S) = \frac{S^2(1+\sin y) - \sin y + 1}{2S}$$
(B4)

Finally, we can generalize Eqn. B5 so it is a function of arclength from the target. The center of the refinement after applying Eqn. 1 is at the South Pole. The arclength from y to the South Pole is  $\Theta = y - (-\pi/2)$ . Substituting  $y = \Theta - \pi/2$  into Eqn. B5 gives

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$$L(\Theta;S) = \frac{S^2(1-\cos\Theta)+\cos\Theta+1}{2S}$$
(B5)

Author contributions. LB implemented and validated the stretched-grid capability in GCHP. RVM, DJJ, and SP provided project oversight and top-level design. MJC reprocessed TROPOMI columns with shape factors from simulations. EWL, LB, and SDE performed MAPL 2 upgrade in GCHP. BMA and TLC developed stretched-grid capability in MAPL 2. HW, JL, LTM, and JM developed grid-independent emissions for GEOS-Chem, and CAK developed HEMCO. LB wrote the manuscript. All authors contributed to manuscript editing and revisions.

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