

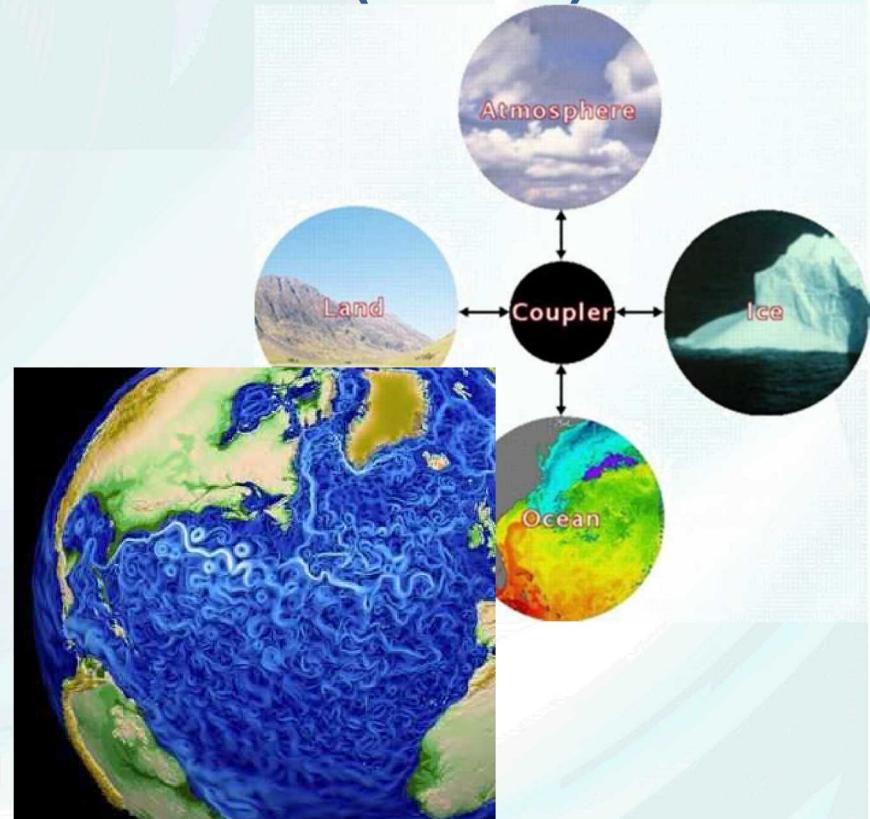
# SCREAM: a performance-portable, global cloud-resolving model based on the Energy Exascale Earth System Model

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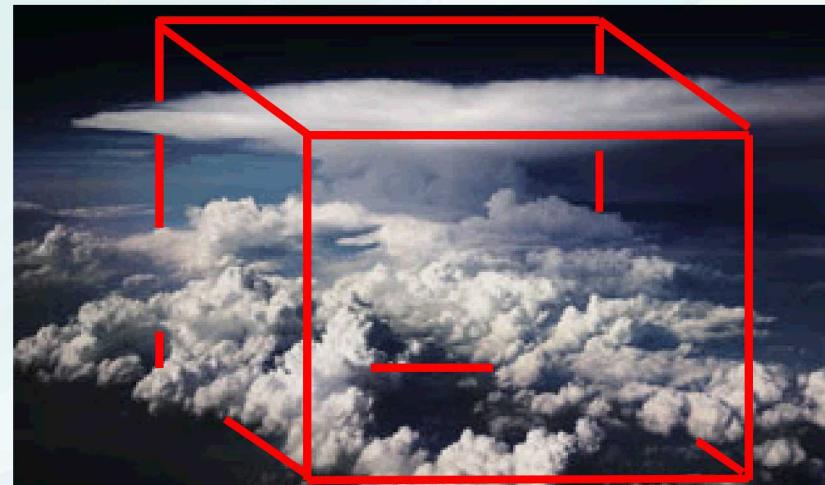
# Energy Exascale Earth System Model (E3SM)

- Global earth system modeling framework
- Collaborative project involving 8 U.S. DOE labs and 12 universities
- Development driven by energy and water issues over the next 40 years
- Key computational goal: performance on exascale computers
- Open source / open development
  - Website: [www.e3sm.org](http://www.e3sm.org)
  - Github: <https://github.com/E3SM-Project>
  - DOE Science youtube channel:  
[https://www.youtube.com/channel/UC\\_rhpi0IBeD1U-6nD2zvIB](https://www.youtube.com/channel/UC_rhpi0IBeD1U-6nD2zvIB)



# Context: the problem with coarse resolution

- Coarse resolution results in heavy reliance on complicated/empirical subgrid-scale parameterizations
- Uncertainty in subgrid-scale parameterizations can be a major source of uncertainty in large-scale models / climate projections



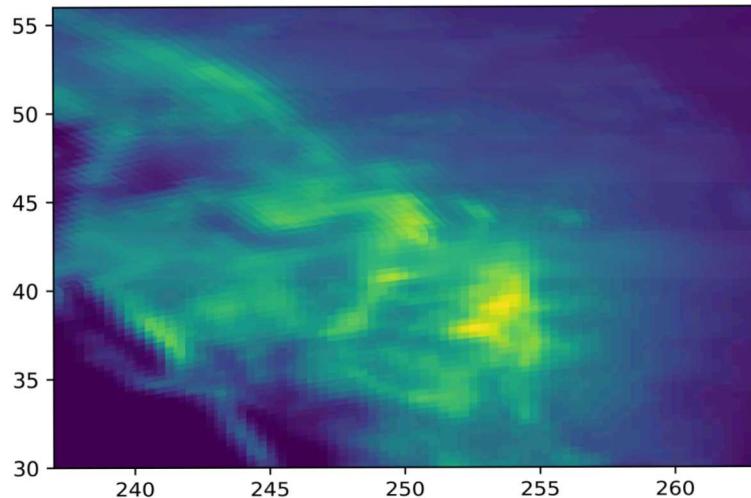
Problem: how to parameterize this subgrid-scale variability?

# SCREAM - Simple Cloud-Resolving E3SM Atmosphere Model

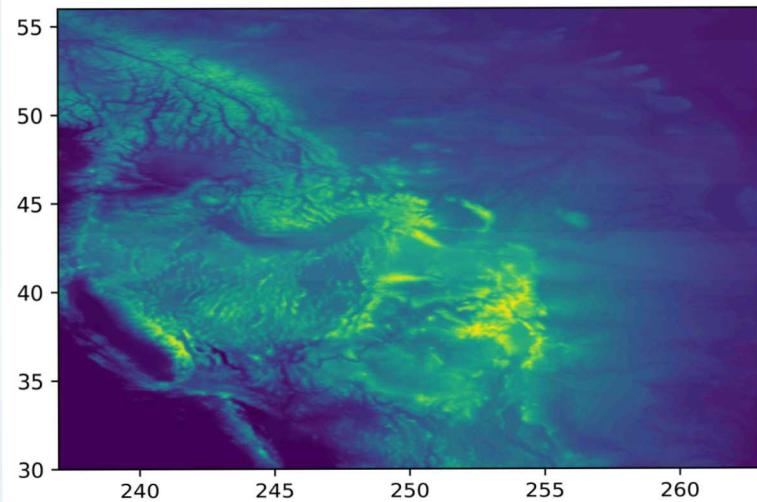
- Goal is to keep code as simple as possible
  - You shouldn't trust results you don't understand physically...
  - Simplicity makes clean rewrite (needed for performance) possible
  - Resolving more makes complex parameterizations less important
- Not quite cloud-resolving (yet!), but makes for a cool acronym
  - Target  $dx = 3$  km globally, 128 vertical layers with a top at 40 km
- E3SM: “Energy Exascale Earth System Model” (US Department of Energy coupled earth system model)
- E3SM ocean and sea-ice already work at these scales
  - Goal here is a *coupled* km-scale system, not just an atm model

# Why 3 km resolution?

Topography at 25 km resolution



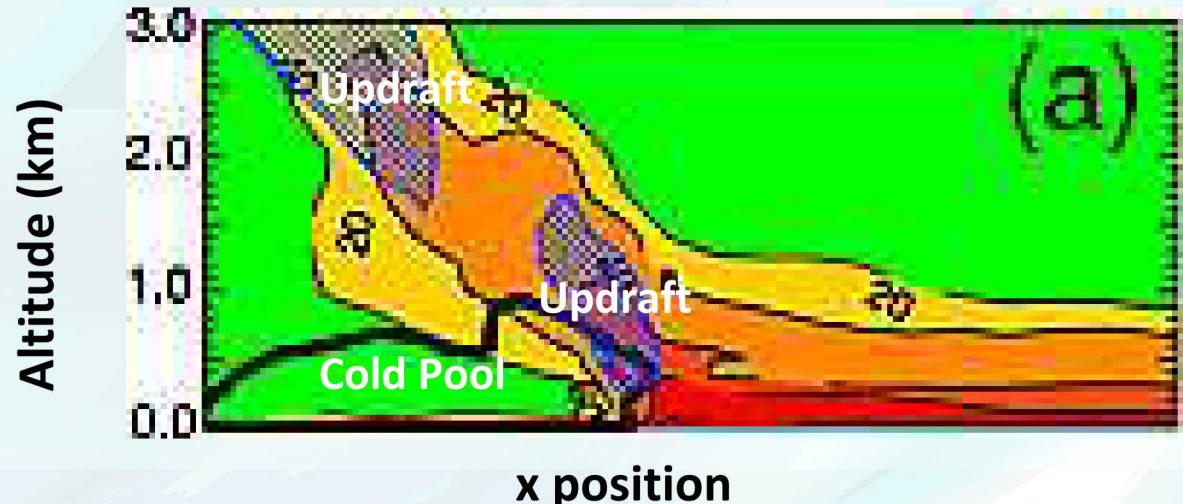
Topography at 3 km resolution



New 3 km resolution for SCREAM better resolves topographic features, as well as eliminates need for parameterization of processes unresolved at previous “high resolution” configuration of 25 km.

# Why 3 km resolution?

- The impact of cold pools on DMS transport illustrates what's missing at coarser scales (see figure)



*Fig: Snapshot of DMS concentration (green=low, red=high) in a 2d CRM of oceanic deep convection (domain = 256 km,  $\Delta x = 1$  km). Neglecting the spatial pattern of DMS reduced convective transport by 50%. From Devine et al, 2006 GRL, pointed out by Ken Carslaw*

# Thesis: Climate Change Can be Understood from Short Runs

This thesis is critical to SCREAM because high-res requires short timesteps (for CFL stability), limiting simulation length

Reasonable because:

- Clouds are the main source of climate uncertainty
- Clouds respond rapidly to forcing change  
    ⇒ Cleverly-designed short runs should tell us a lot
- Several clever short tests already exist
  - 5 yr Cess (prescribed SST increase) runs
  - 15 mo aerosol sensitivity tests nudged to observations

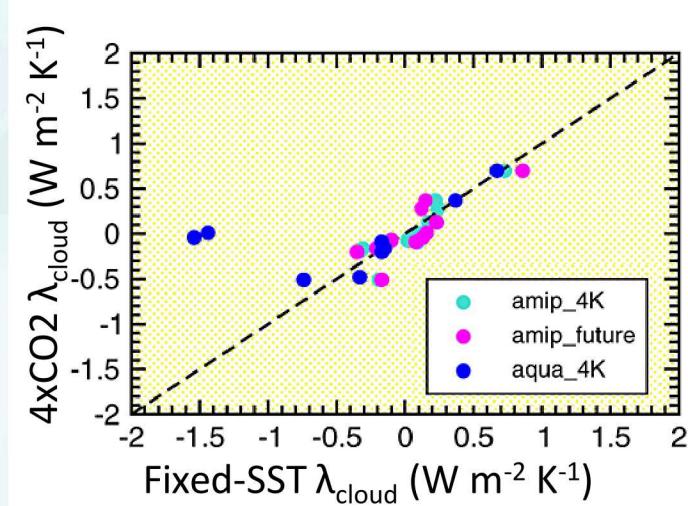
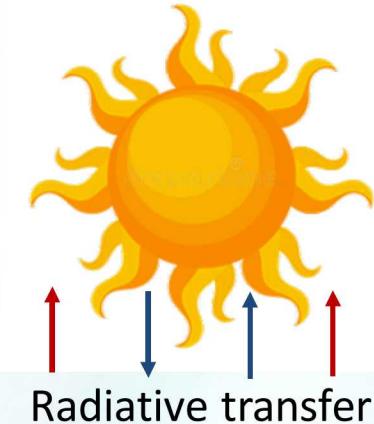
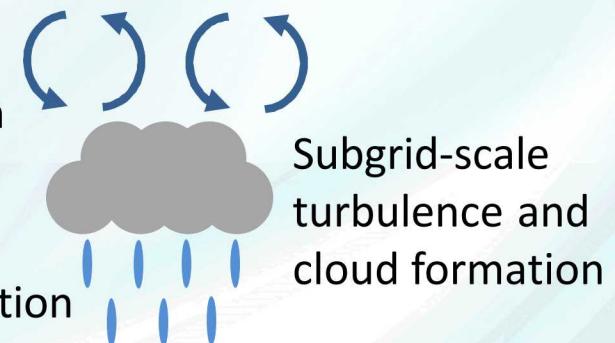
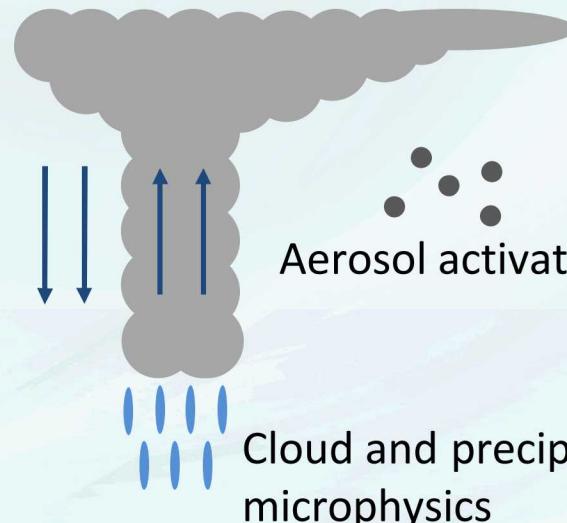


Fig: Cloud feedback from full-complexity (y-axis) versus fixed SST simulations in CMIP5.  
Adapted from Ringer et al, (2014 GRL).

# Components of a typical global atmosphere model



Resolved-scale fluid dynamics

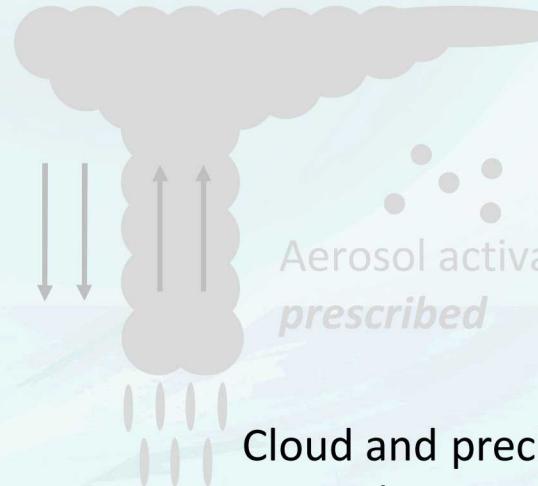


# Components of a typical global atmosphere model



Resolved-scale fluid dynamics:  
***HOMME*** non-hydrostatic  
spectral element model; semi-  
lagrangian tracer transport

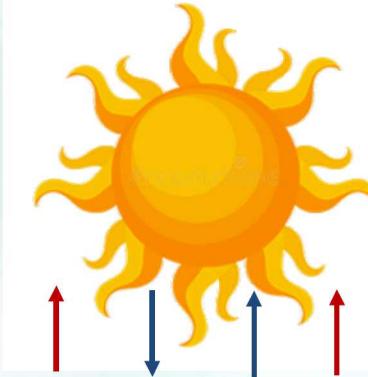
Deep convective  
motion is *resolved*



Cloud and precipitation  
microphysics:  
***Predicted Particle  
Properties (P3)***



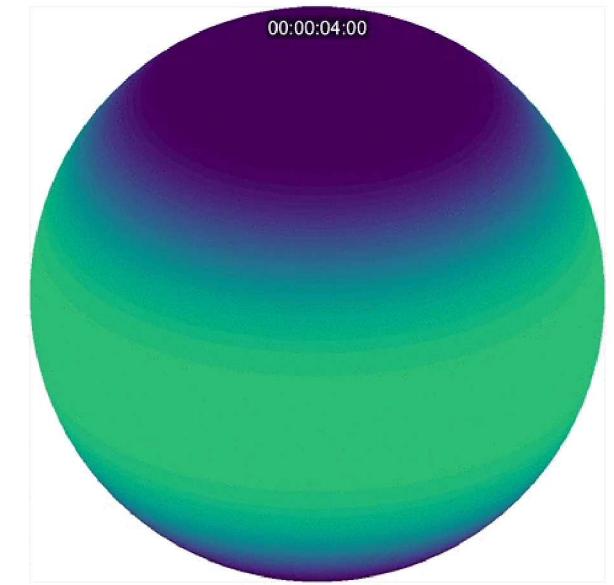
Radiative transfer:  
***RRTMGP***



Subgrid-scale  
turbulence and  
cloud formation:  
***Simplified  
Higher-Order  
Closure (SHOC)***

# HOMME

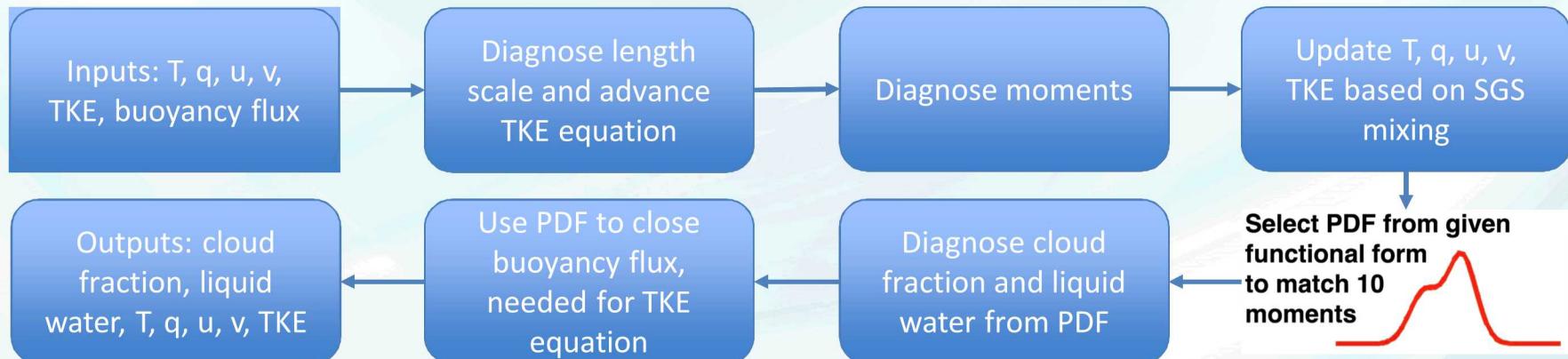
- New non-hydrostatic dynamical core
  - Important for non-hydrostatic effects at 3 km and finer resolutions
- Reformulation of thermodynamic equation in terms of potential temperature
- IMEX time-stepping
- Semi-Lagrangian tracer transport
- C++/Kokkos for performance portability



DCMIP2016 baroclinic instability test at 3 km (showing specific humidity)

# Simplified Higher-Order Closure (SHOC)

- Bogenschutz and Krueger (2013)
- Represent subgrid-scale clouds and turbulence in cloud resolving models, but at reduced computational cost relative to comparable methods
- PDF-based tri-variate double Gaussian closure



# RTE-RRTMGP

- Pincus et al. (2019)
- Re-write of popular RRTMG radiative transfer package, designed with increased parallelism in mind
- Ported to C++/YAKL as part of Exascale Computing Project effort (Matt Norman)

RRTMGP++ performance on Summit

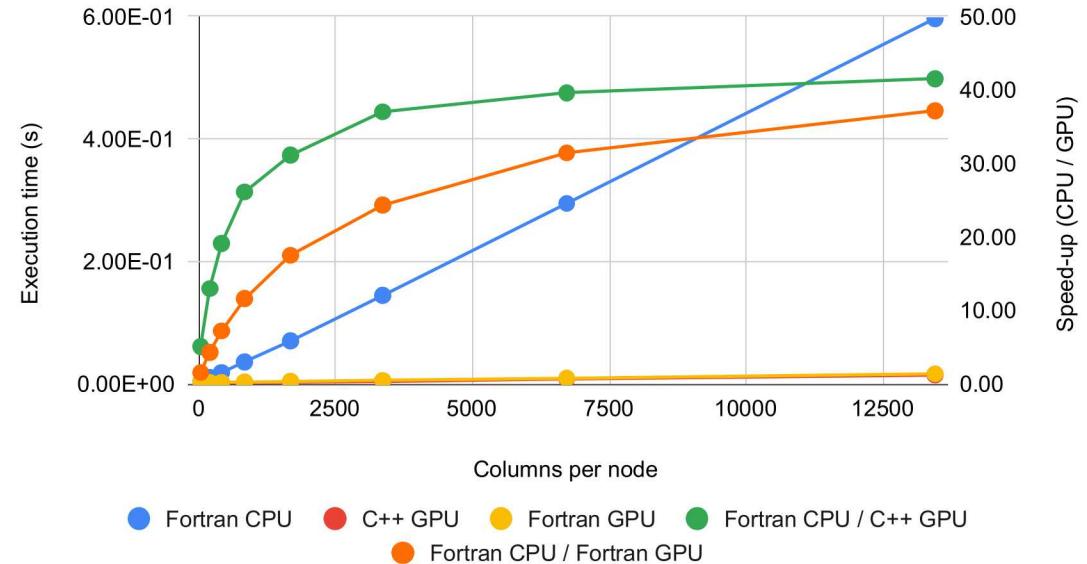
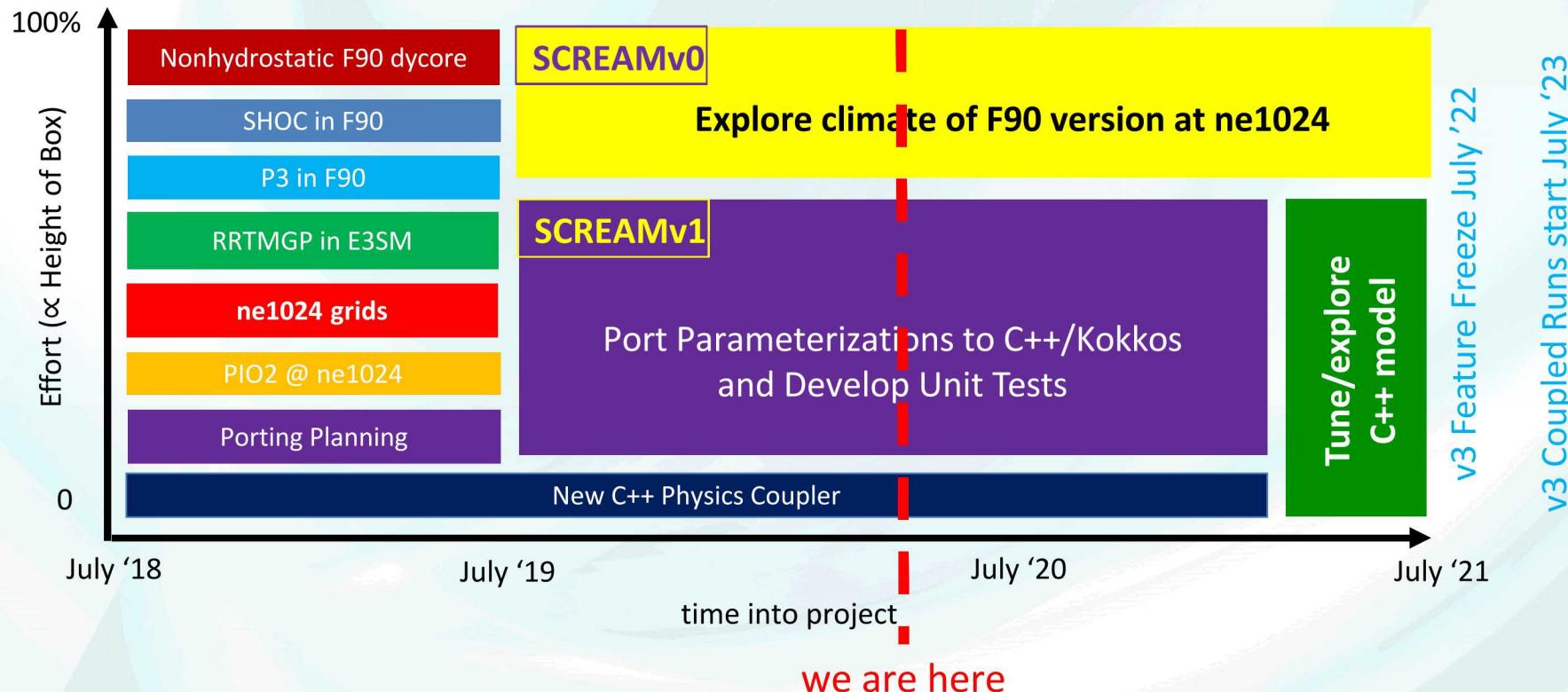


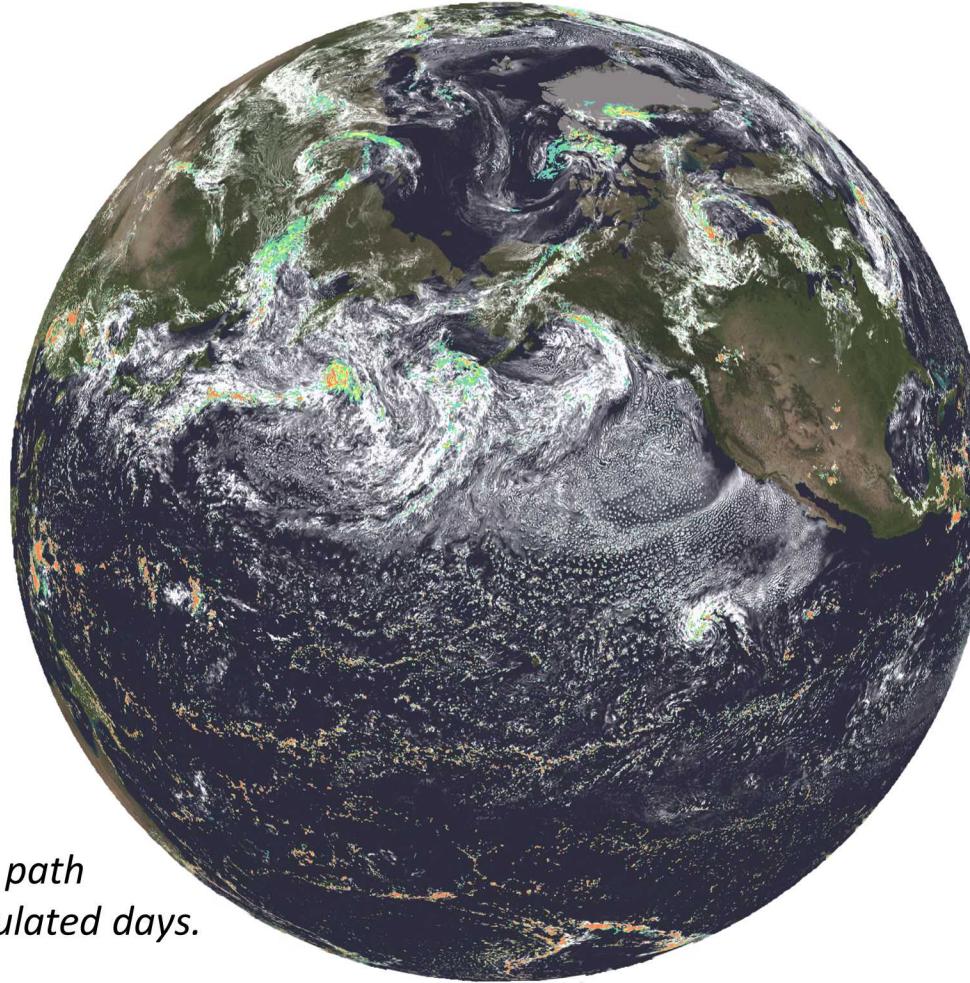
Figure: single-node performance on Summit for example problem (longwave only; similar results for shortwave)

# Implementation strategy



# SCREAM v0 (F90 ver)

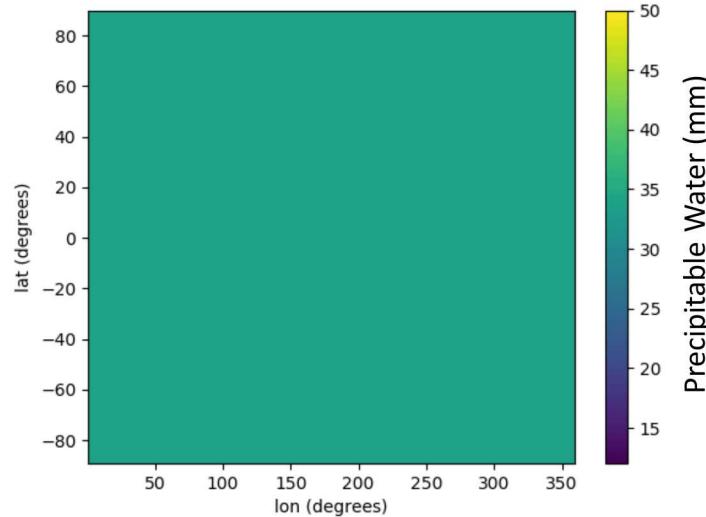
- Goal = DYAMOND Phase 2 Intercomparison
  - Includes ~10 global storm-system models (GSRMs)
  - 40 day run starting Jan 20, 2020
  - Results due Jan 1, 2021
- ne1024pg2 gets 5.2 simulated days wallday on 3072 nodes of cori-k
  - without performance optimization
  - $\Rightarrow$  40 day run costs 22.7M NERSC



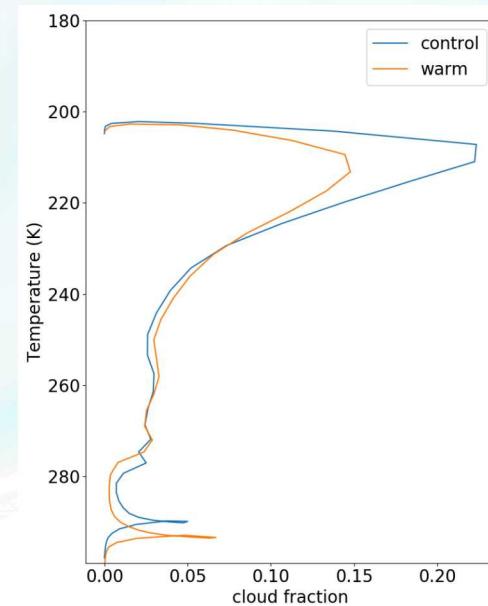
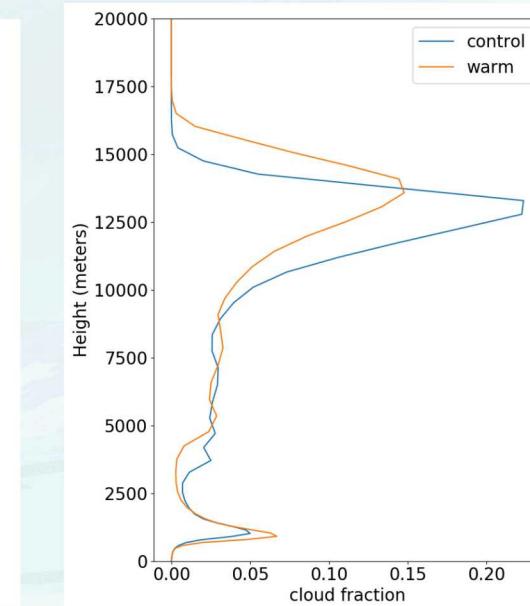
*Fig: Snapshot of precipitation (color) and liquid water path (opacity with opaque white =  $200 \text{ g m}^{-2}$ ) after 2.5 simulated days.*

# SCREAMv0 Radiative Convective Equilibrium (RCE)

Like other models, SCREAM self-aggregates in RCE



Running varying SST simulations to look at cloud response to warming as well as model physical soundness in an idealized setup.



# Coding

- SCREAM will be rewritten in C++ using the Kokkos performance portability library
  - Abstracts on-node parallelism
  - Single codebase runs efficiently with variety of hardware (CPU, GPU, etc)
  - Performance portability often comes at the cost of increased code complexity

Ported to C++/Kokkos

Original F90

```
kloop_sedi_c2: do k = k_qxtop,k_qxbot,-kdir
  qc_notsmall_c2: if (qc_incld(k)>qsmall) then
    !-- compute Vq, Vn
    call get_cloud_dsd2(qc_incld(k),nc_incld(k),mu_c(k),rho(k),nu,dnu,    &
                         lamc(k),tmp1,tmp2,lcldm(k))

    nc(k) = nc_incld(k)*lcldm(k)
    dum = 1._rtype / bfb_pow(lamc(k), bcn)
    V qc(k) = acn(k)*bfb_gamma(4._rtype+bcn+mu_c(k))*dum/(bfb_gamma(mu_c(k)+4._rtype))
    V nc(k) = acn(k)*bfb_gamma(1._rtype+bcn+mu_c(k))*dum/(bfb_gamma(mu_c(k)+1._rtype))

  endif qc_notsmall_c2
  Co_max = max(Co_max, V qc(k)*dt_left*inv_dzq(k))

enddo kloop_sedi_c2
```

```
Kokkos::parallel_reduce(
  Kokkos::TeamThreadRange(team, kmax-kmin+1), [&] (int pk_, Scalar& lmax) {
    const int pk = kmin + pk_;
    const auto range_pack = scream::pack::range<IntSmallPack>(pk*Spack:::n);
    const auto range_mask = range_pack >= kmin_scalar && range_pack <= kmax_scalar;
    const auto qc_gt_small = range_mask && qc_incld(pk) > qsmall;
    if (qc_gt_small.any()) {
      // compute Vq, Vn
      Spack nu, cdist, cdist1, dum;
      get_cloud_dsd2<false>(qc_gt_small, qc_incld(pk), nc_incld(pk), mu_c(pk), rho(pk), nu, dnu, lamc(pk), cdist
      nc(pk).set(qc_gt_small, nc_incld(pk)*lcldm(pk));
      dum = 1 / (pack::pow(lamc(pk), bcn));
      V qc(pk).set(qc_gt_small, acn(pk)*pack::tgamma(4 + bcn + mu_c(pk)) * dum / (pack::tgamma(mu_c(pk)+4));
      if (log_predictNc) {
        V nc(pk).set(qc_gt_small, acn(pk)*pack::tgamma(1 + bcn + mu_c(pk)) * dum / (pack::tgamma(mu_c(pk)+1));
      }

      const auto Co_max_local = max(qc_gt_small, -1,
                                     V qc(pk) * dt_left * inv_dzq(pk));
      if (Co_max_local > lmax)
        lmax = Co_max_local;
    }
  }, Kokkos::Max<Scalar>(Co_max));
team.team_barrier();
```

# Testing

- Strive for *property tests* (check that code behaves physically) in addition to BFB testing (check that answers have not changed)
- Example of property tests: convergence in  $dt$ ,  $dz$ ,  $dx$ ; Applying to SHOC revealed problems with:
  - Bretherton & Park (2009) shear production boundary condition
  - Blackadar (1984) turbulent length scale near surface
- Encapsulation of parameterizations makes unit testing straightforward

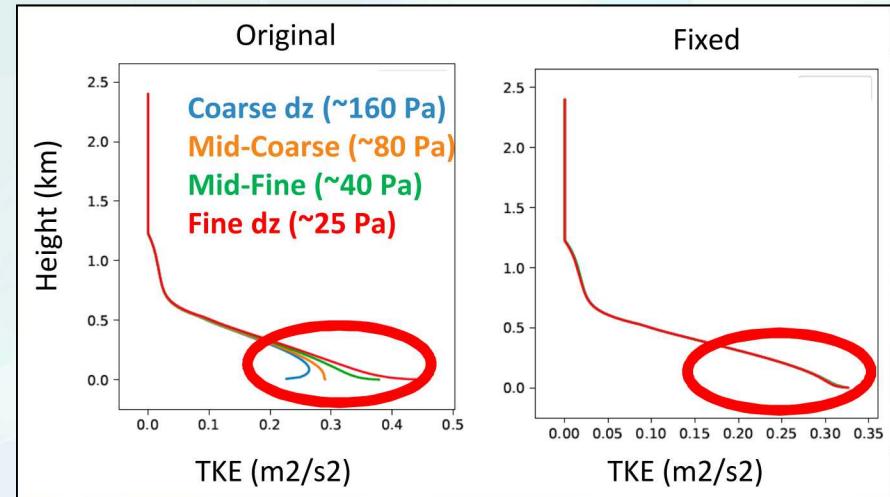


Fig: SHOC standalone simulations running the BOMEX test case (trade wind Cumulus) for 6 hrs with a variety of vertical resolutions. By Peter Bogenschutz

# SCREAMv1

- C++ version of non-hydrostatic (NH) dycore done
  - Used for recent Gordon-Bell submission (see figure)
  - 0.97 SYPD using all of Summit
  - Not including semi-lagrangian advection, which gives a further speed-up
  - P3 port nearing completion
  - SHOC port starting now
  - RRTMGP port mostly done (starting interface now)

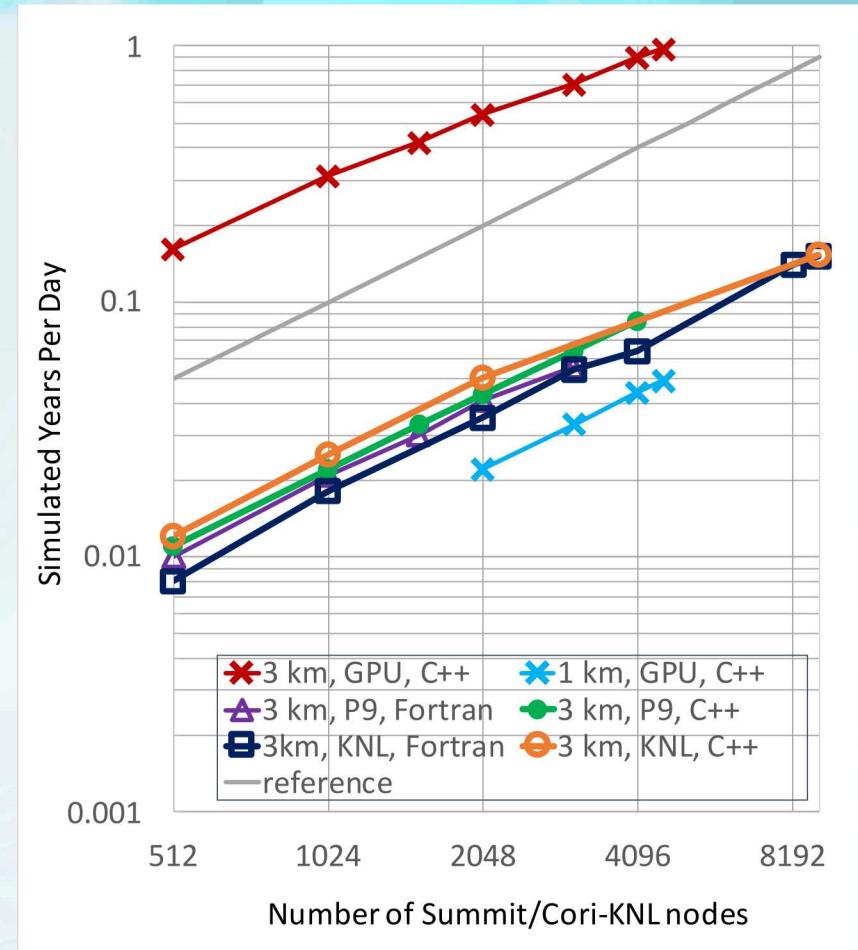


Fig: Nonhydrostatic C++ dycore-only NGGPS benchmark scaling (10 tracers).

# Process coupling

- New atmosphere driver; all atmosphere processes are instances of a `atm_process` class
- Having all processes behave the same way:
  - Makes adding/reorganizing/parallelizing processes easy
  - Improves code readability
- Processes broken into:
  - SCREAM-specific **interface layers**
  - Model-agnostic **process implementations** that make:
    - Code easy to share with/implement in other models
    - Standalone process simulations straightforward (useful for testing)
- Processes communicate entirely through a **field manager** that provides interface layers with pointers to requested variables

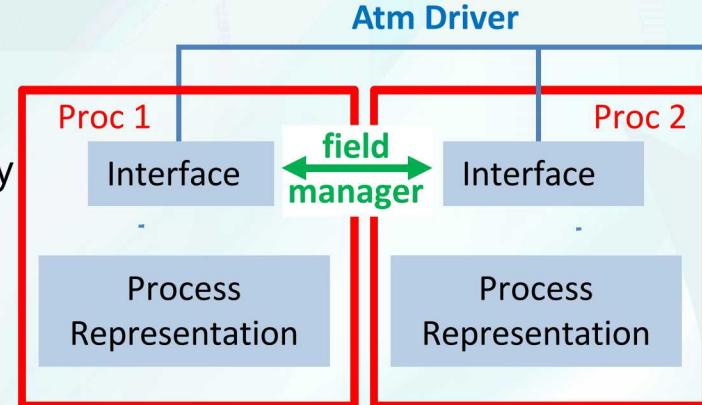


Fig: SCREAM coupler structure

# Initial results

- DYAMOND Phase 1 configuration
  - Initialized from IFS reanalysis for 01 August 2016
  - Showing 2-day simulation from initialization
  - Prescribed SST/sea ice
- Results are *reasonable* after initial spin-up
  - Both shortwave and longwave fluxes are slightly above CERES daily average
  - Global mean precip rate slightly above GPM daily average
- Rigorous evaluation coming soon...

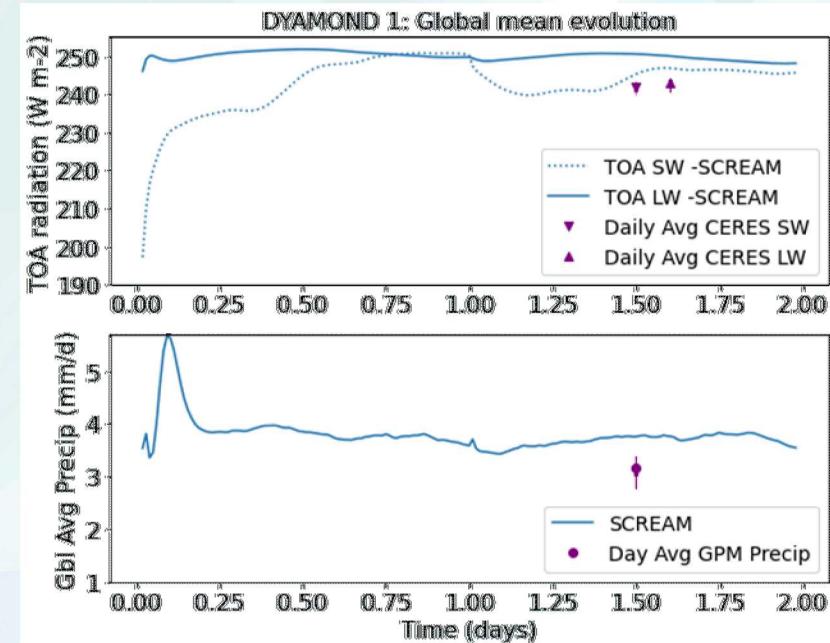


Figure: comparison of SCREAM top of atmosphere fluxes with CERES, and precipitation rate with GPM

# Initial results

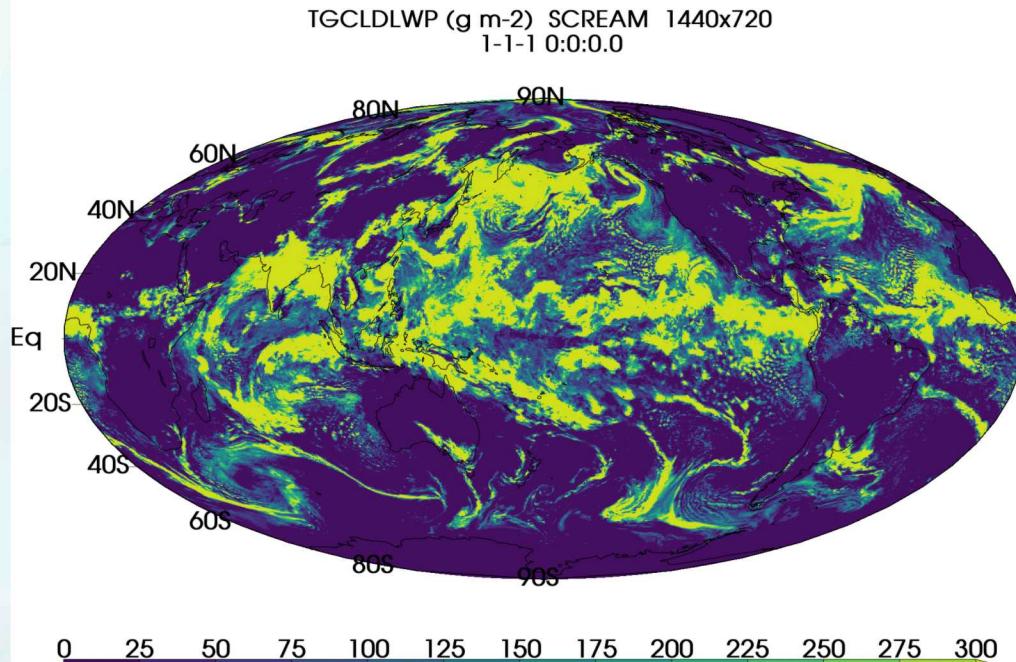


Figure: animation of total gridbox-mean cloud water path from initial simulation at 3 km resolution

# Challenges

- 3 km global resolution makes for *huge* grids
  - Very expensive (~5 simulated *days* per wallclock day)
  - I/O is a problem (restart files for atmosphere alone are > 3 TB in size)
- Debugging
  - Difficult if not impossible to debug at scale
  - Bugs specific to coupling at high resolution not always reproducible at lower resolution

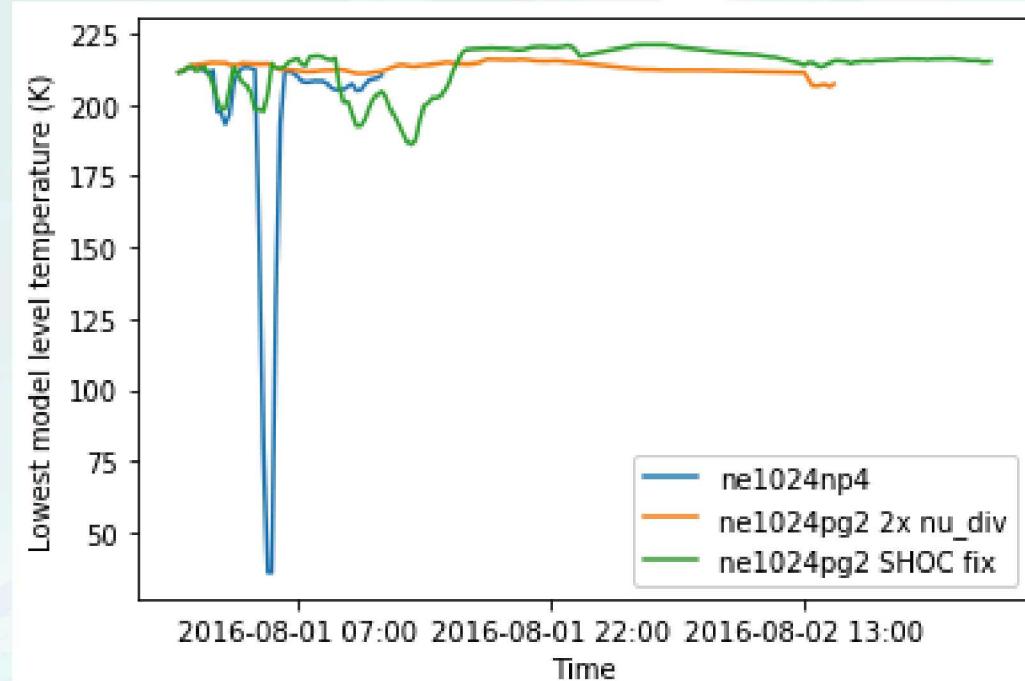


Fig: temperature instability arising only when coupling physics and dynamics at very high resolution

# Next steps

- DYAMOND Phase 2
- Continue porting to C++/Kokkos for performance portability
- Migrate to pre-exascale and exascale machines

# References and further reading

- SHOC: Bogenschutz, P. A., and Krueger, S. K. ( 2013), A simplified PDF parameterization of subgrid-scale clouds and turbulence for cloud-resolving models, *J. Adv. Model. Earth Syst.*, 5, 195–211, doi:[10.1002/jame.20018](https://doi.org/10.1002/jame.20018).
- HOMMEXX: Bertagna, L., Deakin, M., Guba, O., Sunderland, D., Bradley, A. M., Tezaur, I. K., Taylor, M. A., and Salinger, A. G.: HOMMEXX 1.0: a performance-portable atmospheric dynamical core for the Energy Exascale Earth System Model, *Geosci. Model Dev.*, 12, 1423–1441, <https://doi.org/10.5194/gmd-12-1423-2019>, 2019.
- RRTMGP: Pincus, R., Mlawer, E. J., & Delamere, J. S. ( 2019). Balancing accuracy, efficiency, and flexibility in radiation calculations for dynamical models. *Journal of Advances in Modeling Earth Systems*, 11, 3074– 3089 <https://doi.org/10.1029/2019MS001621>
- P3: Morrison, H. and J.A. Milbrandt, 2015: [Parameterization of Cloud Microphysics Based on the Prediction of Bulk Ice Particle Properties. Part I: Scheme Description and Idealized Tests.](#) *J. Atmos. Sci.*, **72**, 287–311, <https://doi.org/10.1175/JAS-D-14-0065.1>