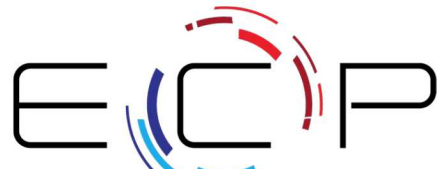


# The Super-Parameterized E3SM

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U.S. DEPARTMENT OF  
**ENERGY**

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EXASCALE COMPUTING PROJECT

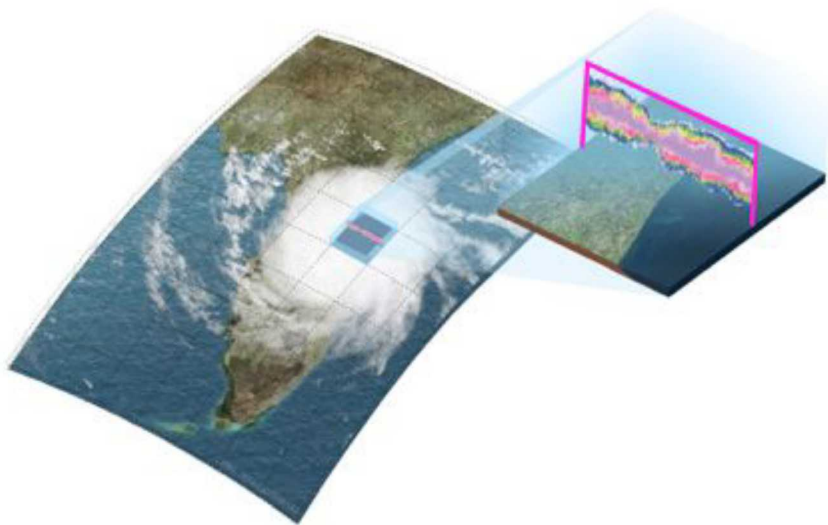
# The problem

- Goal to develop capability to assess regional impacts of climate change on the water cycle that directly affect the US economy (e.g., agriculture and energy production)
- Cloud-resolving scales desired to reduce systematic errors in climate simulations due to structural uncertainty in numerical treatments of convection
- Achieving cloud resolving model resolutions for climate-length timescales requires Zettascale computational resources; the desire for grid refinement is outpacing computational resources!

# Our solution (project goals)

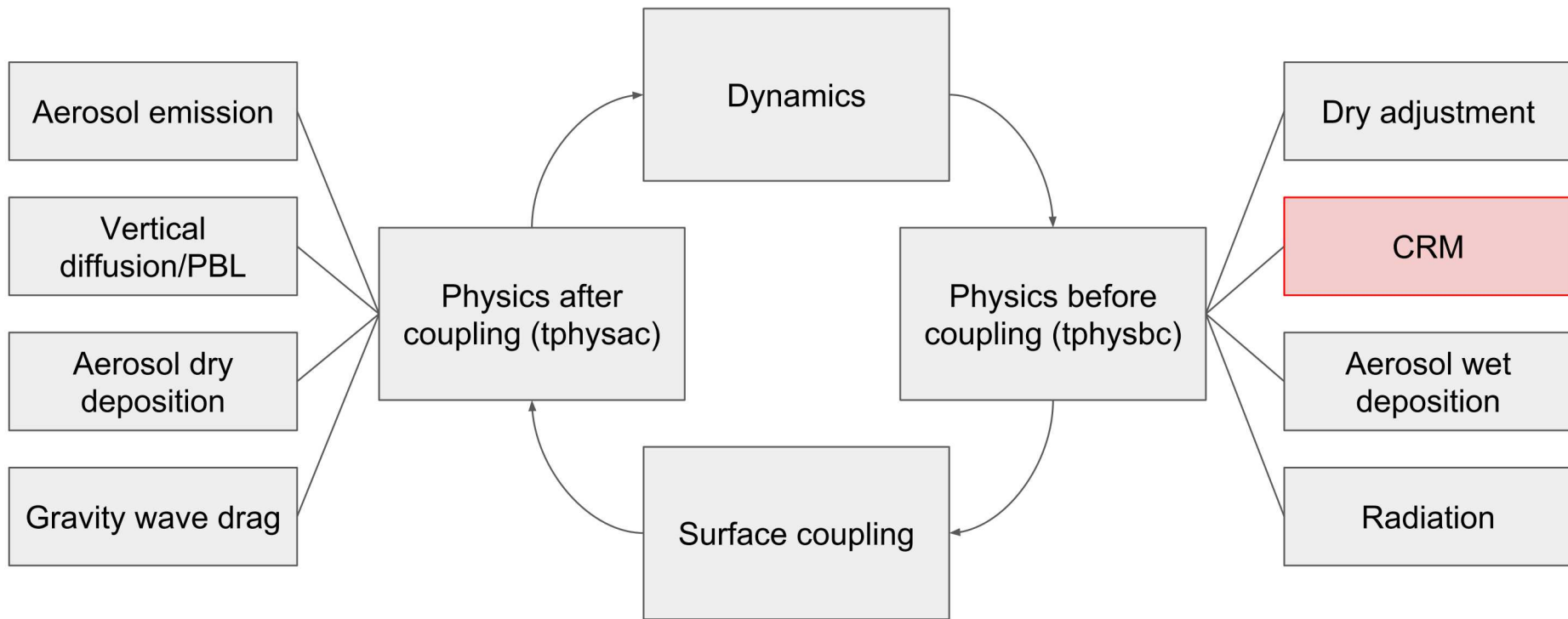
- Develop a “super-parameterized” earth system model with computational efficiency enabling multi-decadal climate experiments
- Efficient use of next-generation computational resources: leveraging GPU acceleration to maintain target of 5 SYPD while improving physical realism by capturing *some* aspects of a cloud resolving model
- The multi-scale modeling framework/super-parameterization approach is ideal for this task

# The Multi-scale Modeling Framework (Super-Parameterization)



- Addresses structural uncertainty in cloud processes by replacing traditional parameterizations with explicit cloud resolving modeling within each grid cell of global climate model
- Dramatically increases arithmetic intensity, making the MMF approach one of the few ways to achieve exascale performance on upcoming architectures
- Exascale + MMF approach will make it possible for the first time to perform climate simulation campaigns with some aspects of cloud resolving resolutions

# Model formulation/coupling schematic



# Model overview

Based on E3SM v1 (forked from master, with periodic merges from E3SM master to keep pace with development)

Similar to older SP-CAM formulations, but with some key differences:

- Coupling with spectral element dynamical core
- More vertical levels and higher model top
- New radiation scheme (RRTMG)
- Explicit scalar momentum transport
- Pseudo-random CRM orientation

|                   | SP-E3SM             | SP-CAM<br>(2-mom) | SP-CAM<br>(1-mom) |
|-------------------|---------------------|-------------------|-------------------|
| Dynamical<br>core | SE                  | FV                | FV                |
| Micro             | sam1mom<br>or m2005 | m2005             | sam1mom           |
| CRM/GCM<br>levels | 58/72               | 28/30             | 24/26             |
| Model top         | 0.1 hPa             | 3.5 hPa           | 3.5 hPa           |
| Radiation         | RRTMG               | RRTMG             | CAMRT             |
| Aerosol           | MAM4                | MAM3              | BAM               |

# GPU Acceleration

- Super-Parameterization is attractive for GPU acceleration because CRMs do not communicate directly through MPI; no communication slowdown at scale
- CRM code ported to offload work to GPUs using directives-based approach: flexible, maintain single codebase for both GPU and CPU-only configurations, use either PGI or XL compilers (OpenACC or OpenMP)
- Up to ~17x speedup possible using GPU, but acceleration is limited by work per node; smaller workload to achieve throughput constraint limits benefit of using accelerators (~4-10x speedup estimated on Summit)

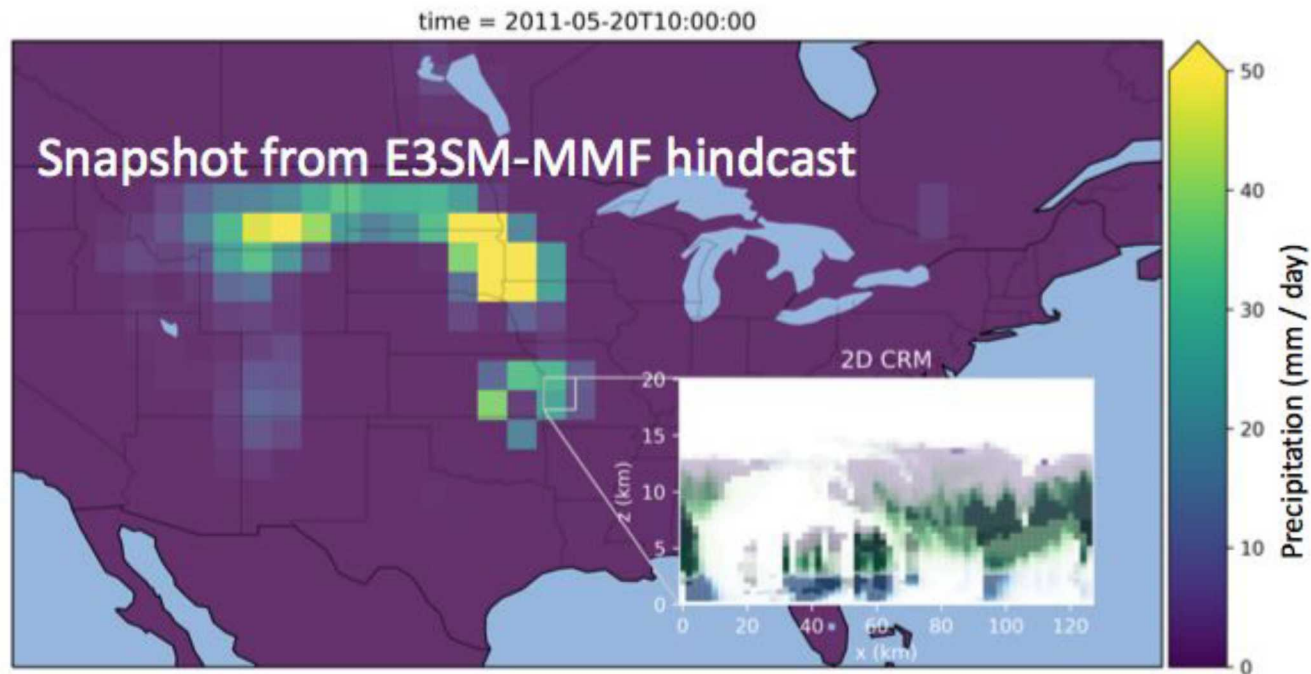
# Performance

- SP-E3SM vs E3SM: ~60x slower (0.1 SYPD vs 6 SYPD on Titan)
- SP-E3SM vs estimated “conventional” E3SM with cloud resolving atmosphere (3 km) and eddy resolving ocean: ~20x algorithmic speedup (0.1 SYPD vs 0.005 SYPD)
  - E3SM 3 km figure estimated based on current high-resolution (25 km atmosphere ,18-6 km ocean) throughput
  - We expect ~4-10x speedup on Summit with GPU acceleration (~1 SYPD)

Early success

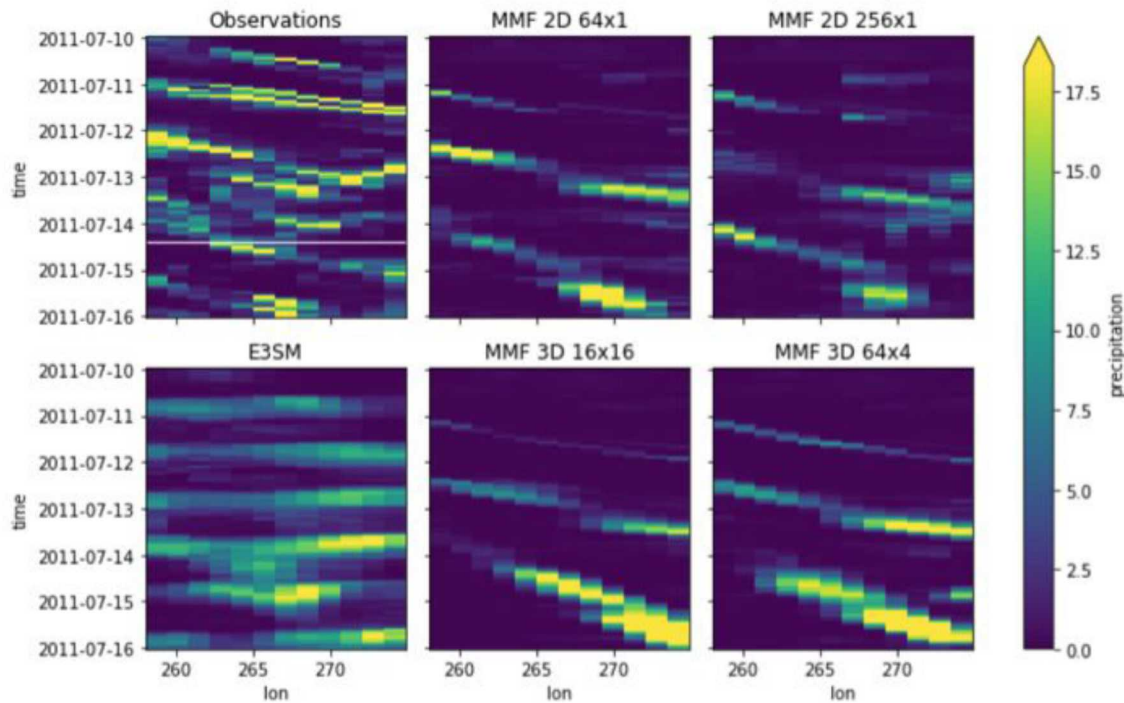
# Mesoscale convective systems in SP-E3SM

- 5-10 day hindcasts with E3SM and SP-E3SM at ne30 resolution
- Hindcasts coincide with observed MCSs from May-Aug 2011
- Initial conditions generated from extended E3SM simulation with horizontal winds nudged to ERA-I



# Mesoscale convective systems in SP-E3SM

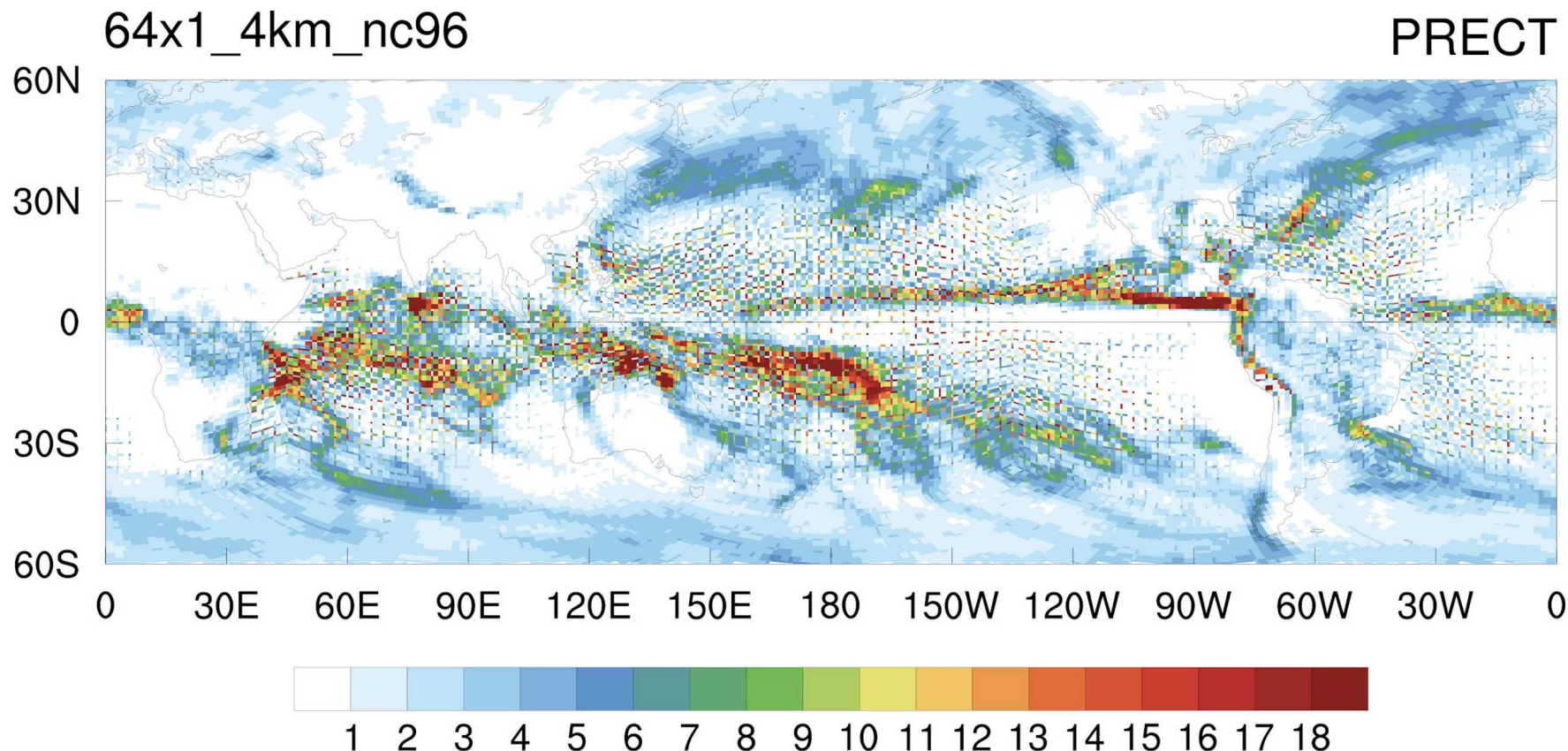
Realistic eastward propagation of MCS in SP-E3SM, regardless of CRM configuration



Hovmöller diagrams of precipitation for hindcast initialized on July 10, 2011

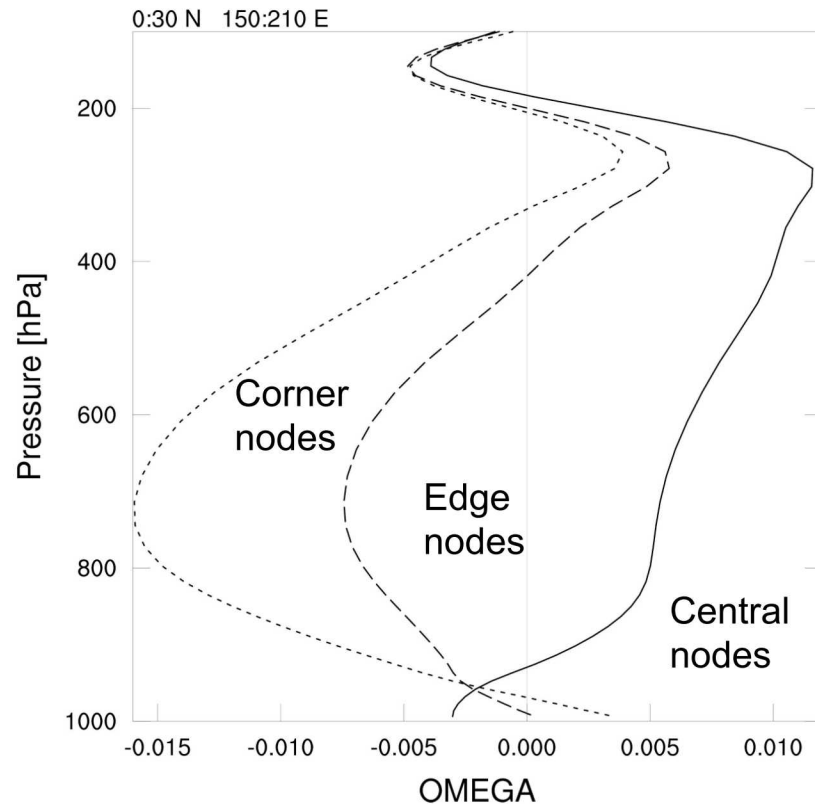
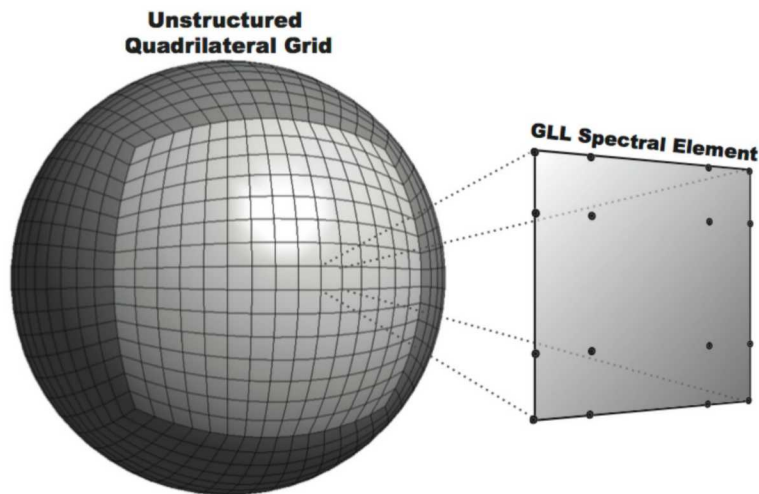
# Challenges

# Grid imprinting



# Grid imprinting

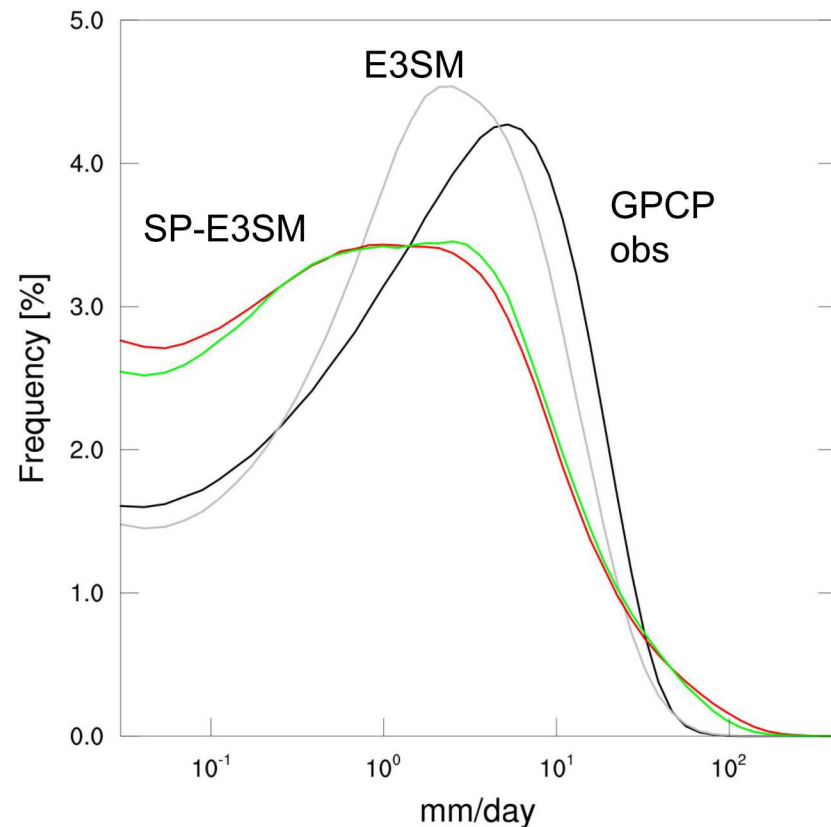
Enhanced precipitation on corner and edge  
GLL nodes



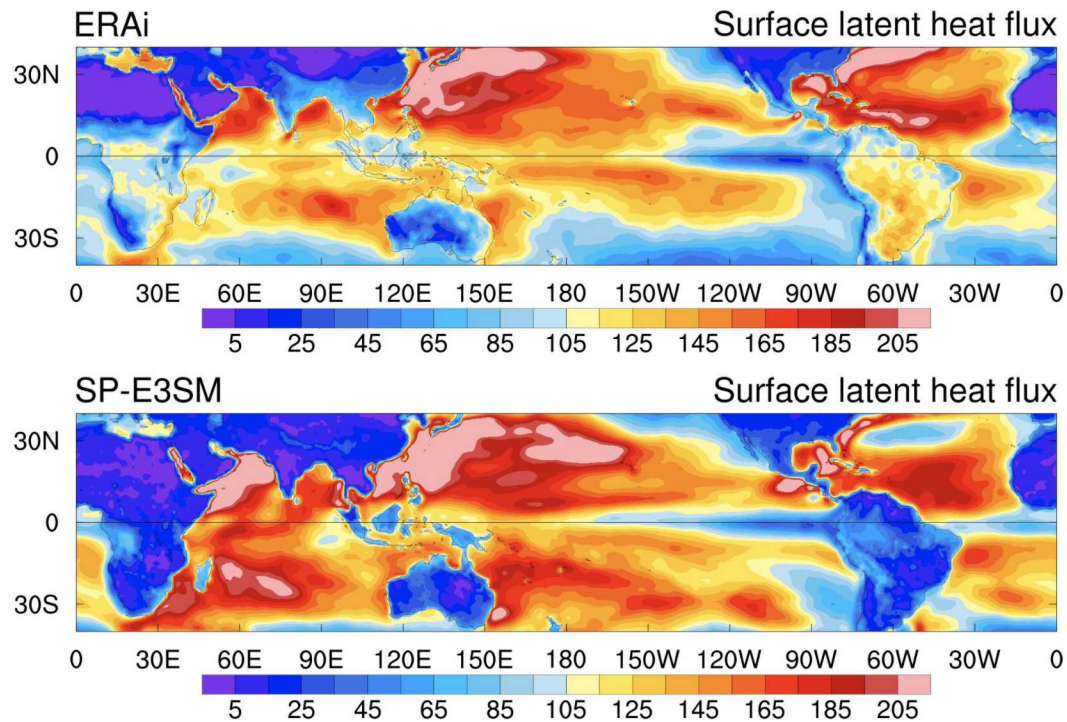
Not evident in fields that are not directly  
related to convection, but shows up strongly  
in large-scale vertical velocity

# Problematic precipitation

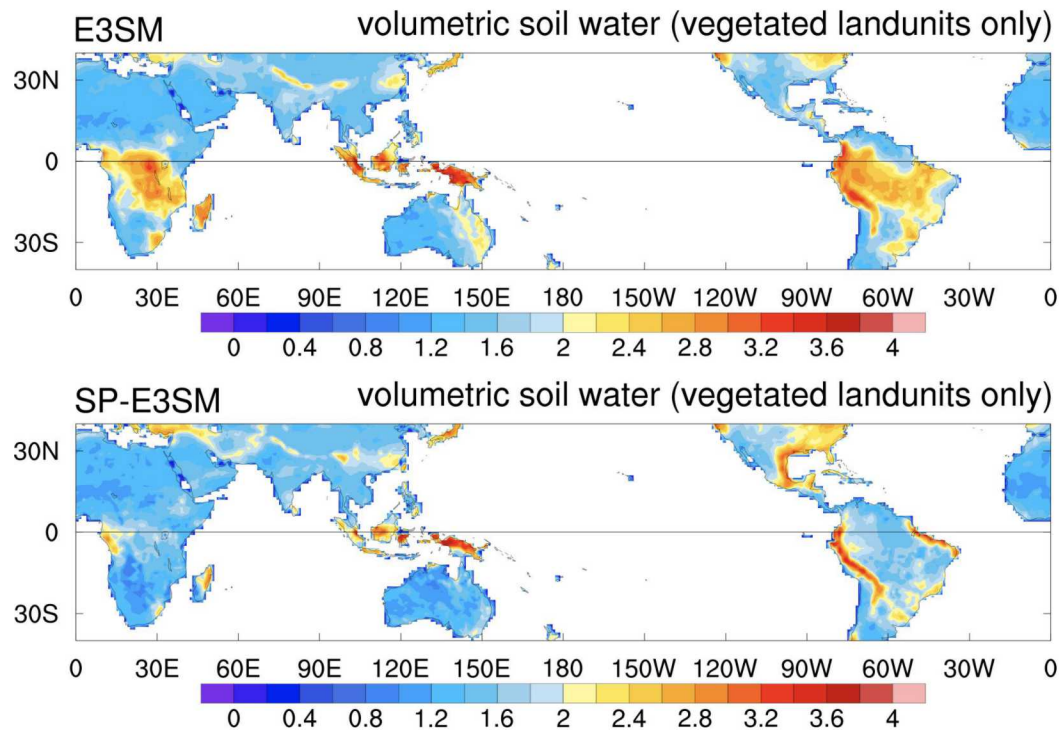
- Distribution of daily rain rates (year 2000, 60S to 60N)
- SP-E3SM has more extremes at both ends: more heavy rain events, and more light drizzle rain events



# Dry bias



# Dry bias



# Take-aways

## Successes:

- Ideal approach to leverage next generation HPC resources while improving physical realism
- Propagating MCS features are well-captured
- Ripe opportunity to explore coupling between small and large-scale processes

## Remaining questions and biases:

- Coupling with SE dycore leads to grid imprinting in precipitation field
- Precipitation statistics and evaporation bias

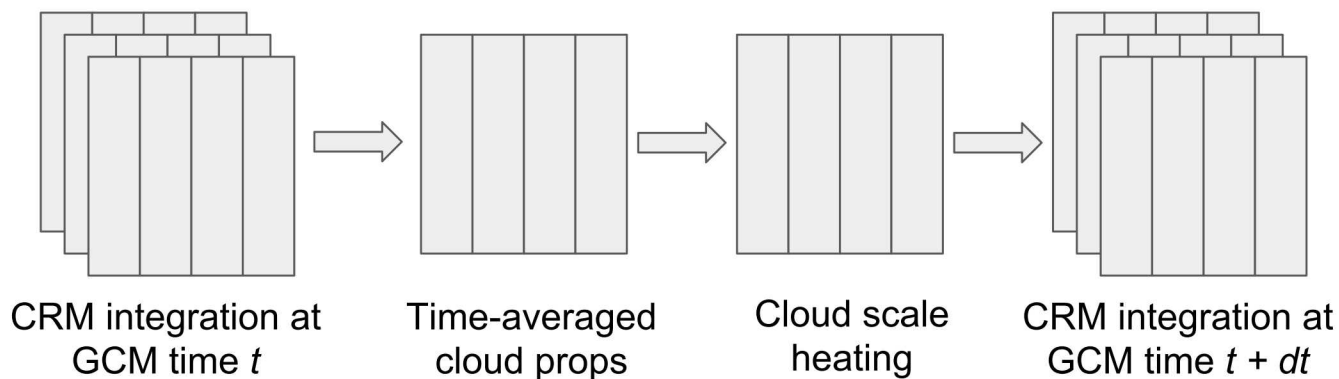
Bonus

# Radiative transfer in SP-E3SM

- RRTMG replaced with RTE/RRTMGP: optimized for parallel applications
- (show cost of radiation in relation to rest of the model)
- Primary goal: utilize GPU port of radiation kernels
- Bonuses: radiation code is more flexible, portable, and testable than RRTMG
- Available for use in standard E3SM already (add “-rad rrtmgrp” to CAM\_CONFIG\_OPTS)

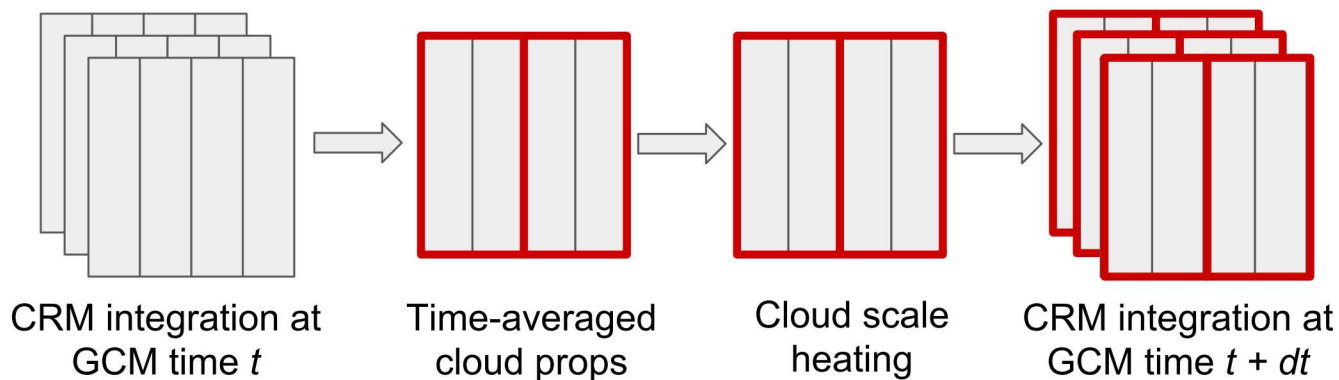
# Cloud-radiative coupling

- Radiative heating is updated every GCM (physics) timestep
- Calculated through the GCM interface to take advantage of updated aerosol properties
- Radiative fluxes and heating rates calculated using *cloud-scale*, but *time-averaged* cloud properties
- Cloud scale heating rate applied at *next* CRM call (next physics timestep)



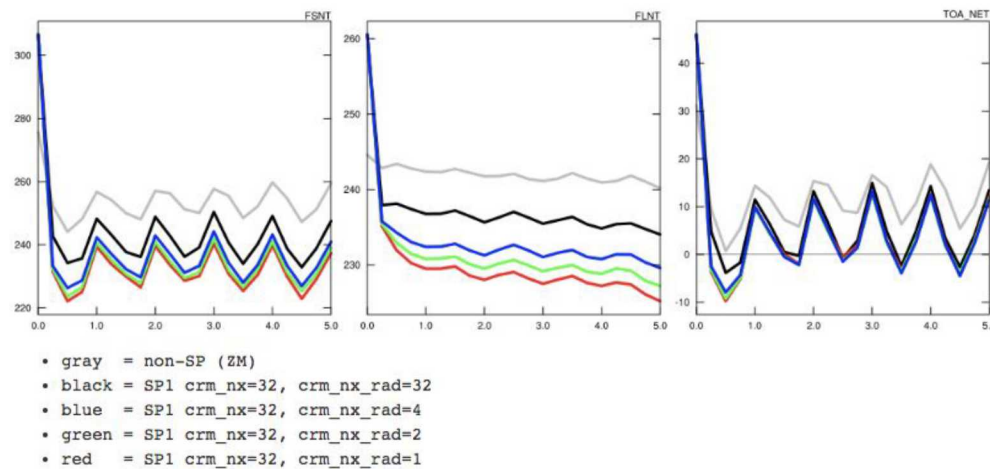
# Reduced radiation

- Reduce cost of radiation by calculating heating on *groups* of columns
- Average cloud properties over group of columns, calculate heating from average, apply back to same group of CRM columns
- Maintain *some* heterogeneity of cloud properties, but at reduced cost (versus doing radiation on full CRM resolution)

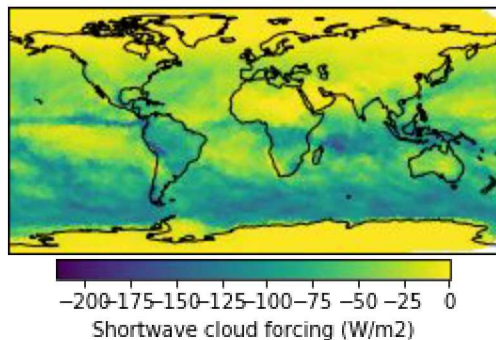


# Reduced radiation

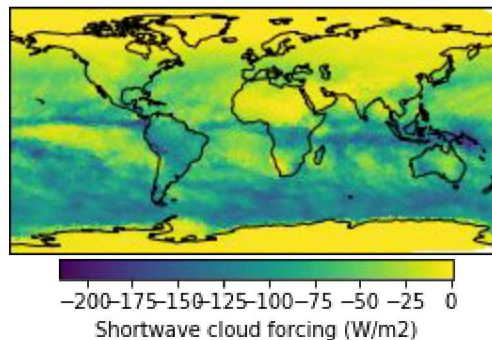
- Shortwave and longwave differences compensate
- Little effect on net TOA flux
- Can we use some version of this to reduce cost, while maintaining accuracy?



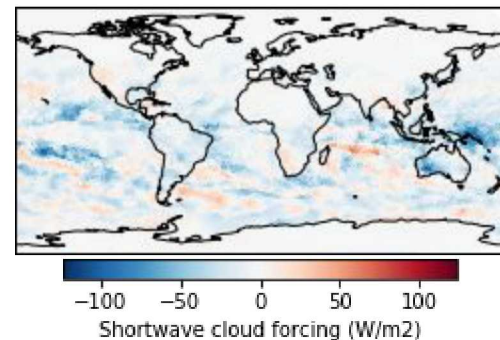
No McICA, nxrad = 64 (-50.677)



No McICA, nxrad = 1 (-59.288)

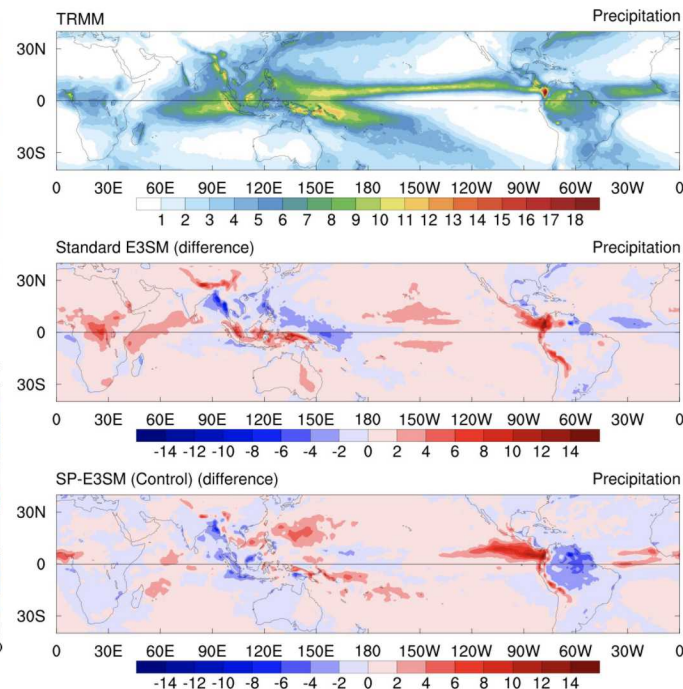
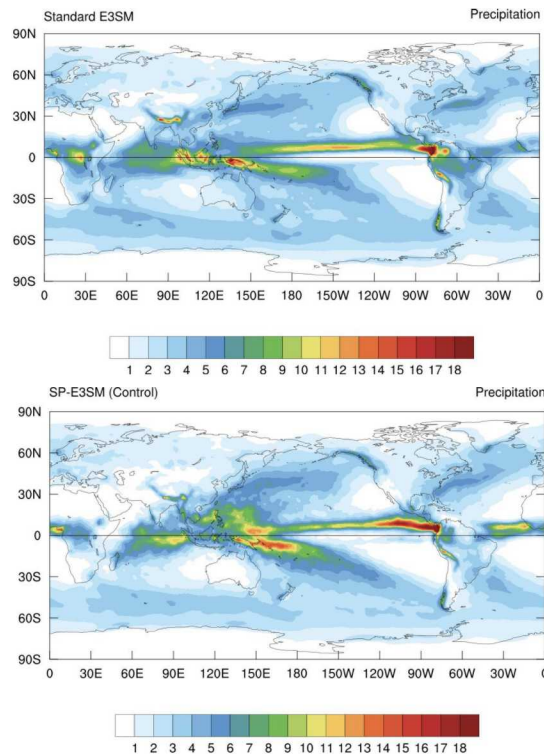


Difference (-8.611)



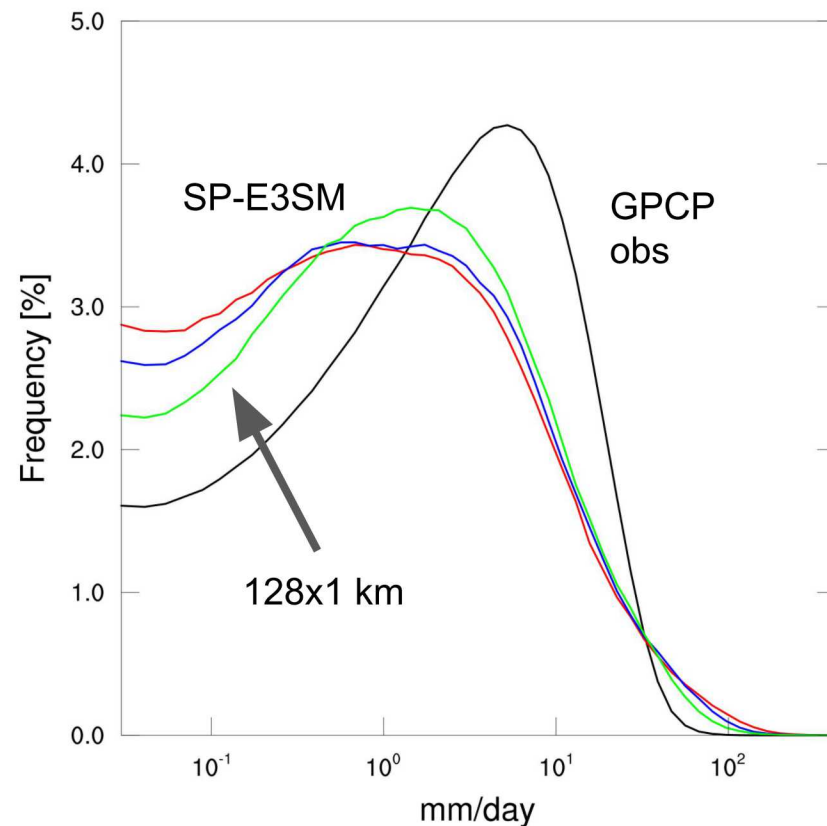
# Early climatology

- Climatology of precipitation looks reasonable
- Familiar biases
- Large bias over Amazon...

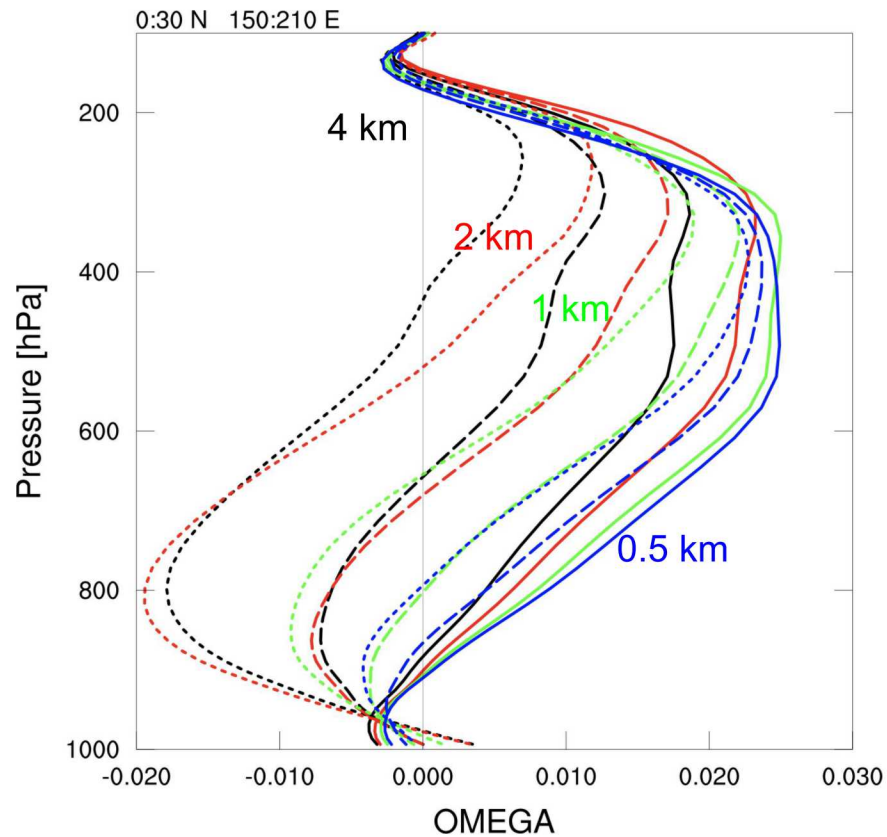
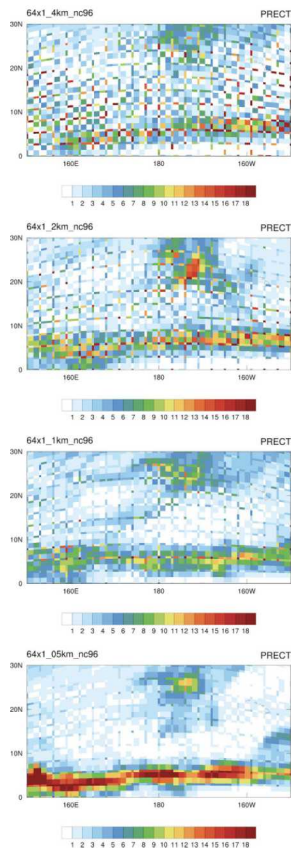


# Precip distribution improved with larger CRM

- Distribution of daily rain rates (year 2000, 60S to 60N)
- SP-E3SM has more extremes at both ends: more heavy rain events, and more light drizzle rain events



# Grid imprinting reduced with smaller dx



# Dry bias

