



Fixing Biases For Good

The Long, Difficult, and Rewarding Task of
Improving km-Scale Climate Models

Andreas F. Prein - prein@ucar.edu

National Center for Atmospheric Research (NCAR)

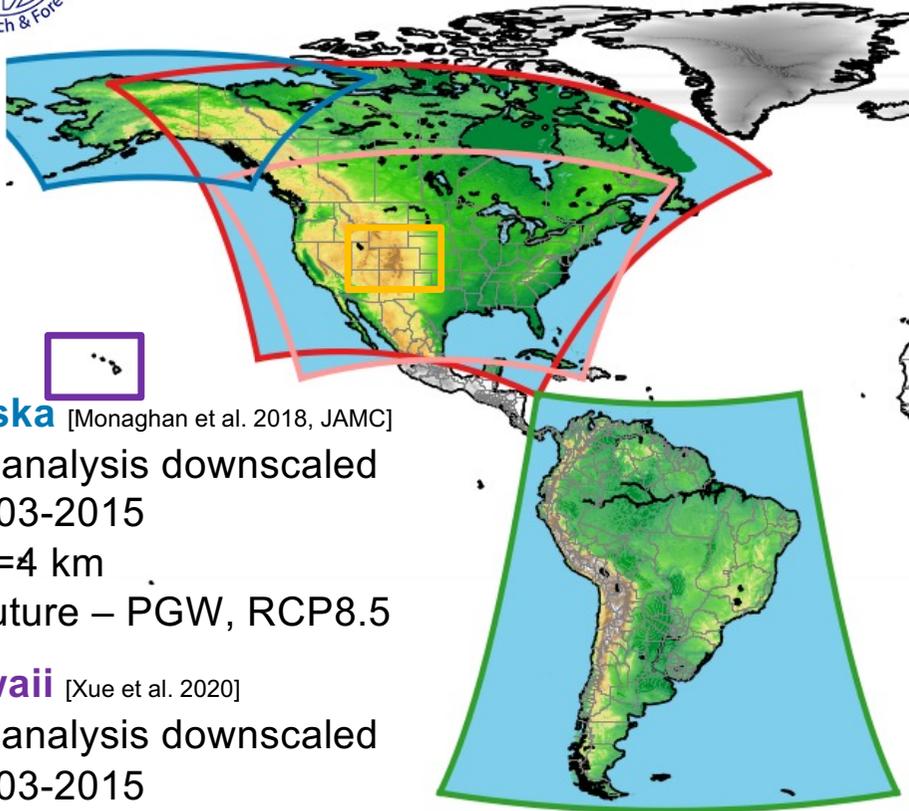
37th Session of the Working Group on Numerical Experimentation (WGNE)

Nov 10, 2022 | Boulder Colorado

This material is based upon work supported by the National Center for Atmospheric Research, which is a major facility sponsored by the National Science Foundation under Cooperative Agreement No. 1852977.



WRF K-scale Simulations

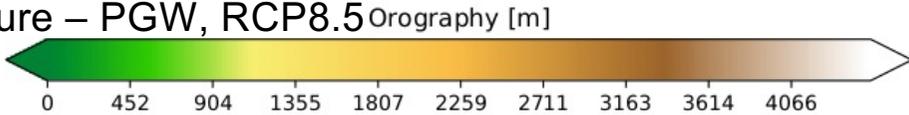
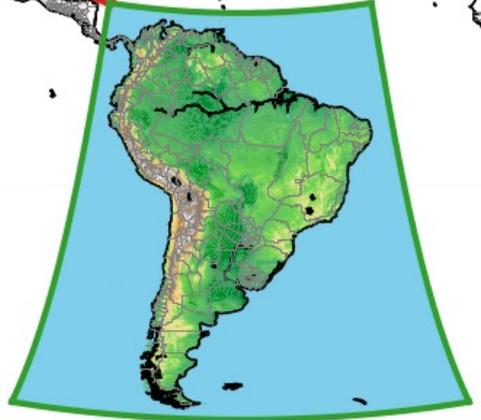


Alaska [Monaghan et al. 2018, JAMC]

- Reanalysis downscaled
- 2003-2015
- dx=4 km
- future – PGW, RCP8.5

Hawaii [Xue et al. 2020]

- Reanalysis downscaled
- 2003-2015
- dx=4 km
- future – PGW, RCP8.5



NCAR/RAL Kilometer-Scale Climate Simulations

CO-Headwaters [Rasmussen et al. 2014]



- Reanalysis downscaled
- 2001-2008
- dx=4 km
- future – PGW, RCP8.5

CONUS-1 [Liu et al. 2017, Clim Dyn]



- Reanalysis downscaled
- 2001-2013
- dx=4 km
- future – PGW, RCP8.5

CONUS-2 [in progress]



- GCM downscaled
- 1995-2014
- dx=4 km

CONUS404 [finished]



- Reanalysis downscaled
- 1979-2019
- dx=4 km

South America [finished]



- Reanalysis downscaled
- 20-years
- dx=4 km
- future – PGW, RCP8.5

Precipitation and Temperature Biases in North America

(CAUSES) project

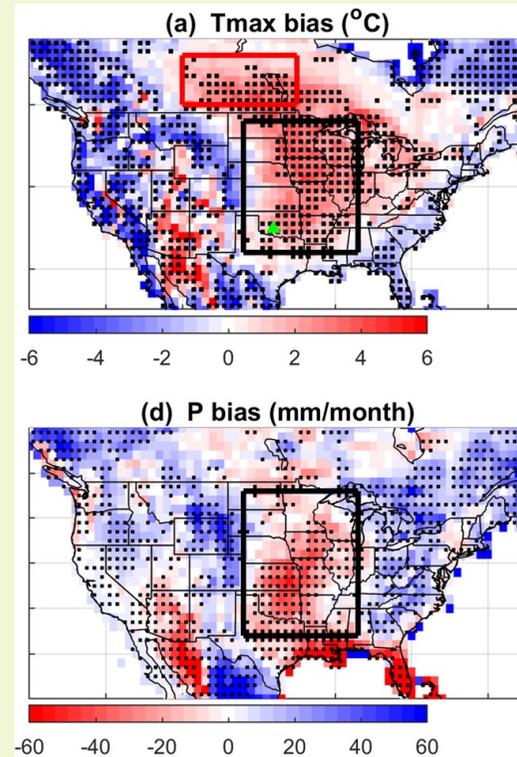
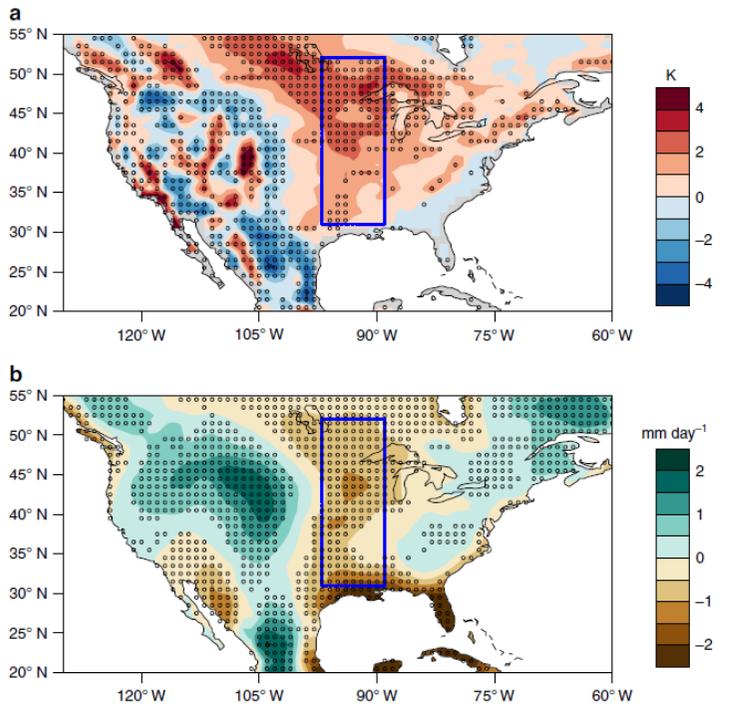
Clouds Above the United States
and Errors at the Surface
[Lin et al. 2017, Nat. Com.]

CMIP5

“The precipitation deficit is associated with the widespread failure of models in capturing strong rainfall events in summer over the central U.S.”

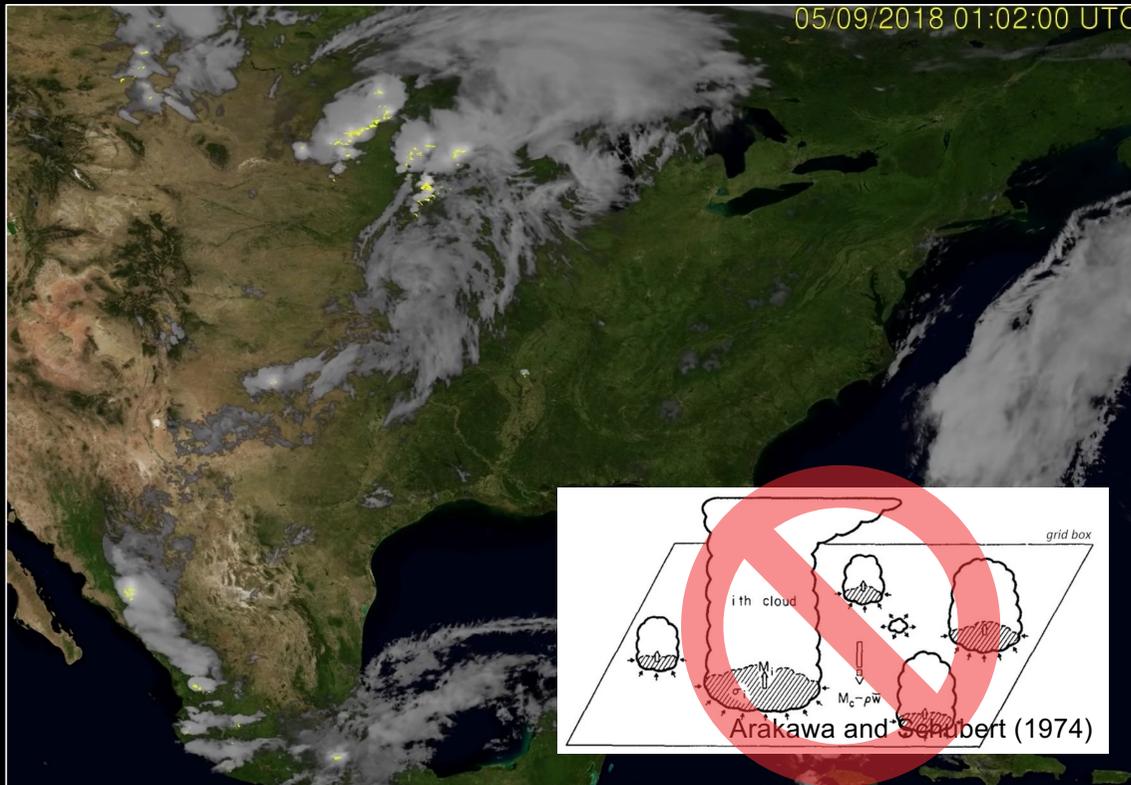
CMIP6

[Dong et al. 2022, Nat. Com.]



“CMIP6 ESMs do not effectively use available rootzone soil moisture for summertime transpiration and instead rely excessively on shallow soil and canopy-intercepted water storage to supply ET.”

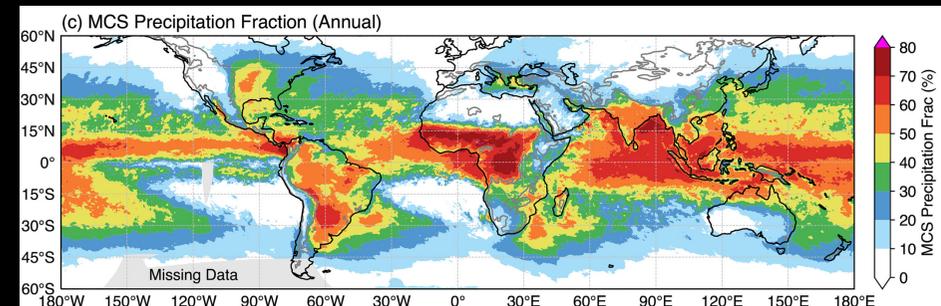
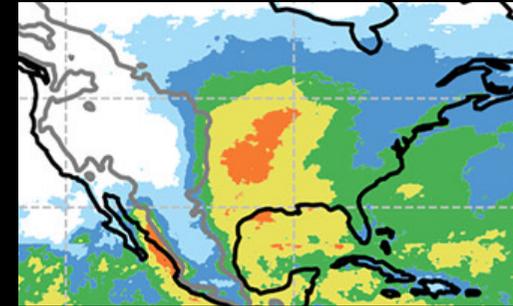
The Importance of Mesoscale Convective Systems in the Central U.S.



NOAA - <https://www.youtube.com/watch?v=QFTrwqhEaKE>

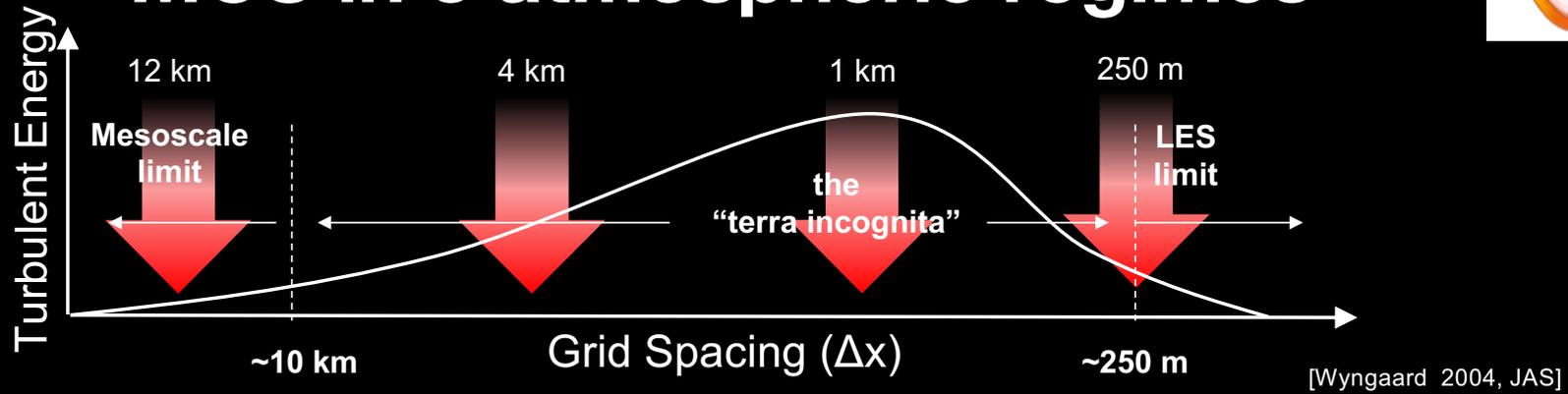
Fritsch et al. 1986:

“MCSs contribute between 30—70% to the warm season precipitation (April—September) in region between the Rocky mountains and the Mississippi River.”

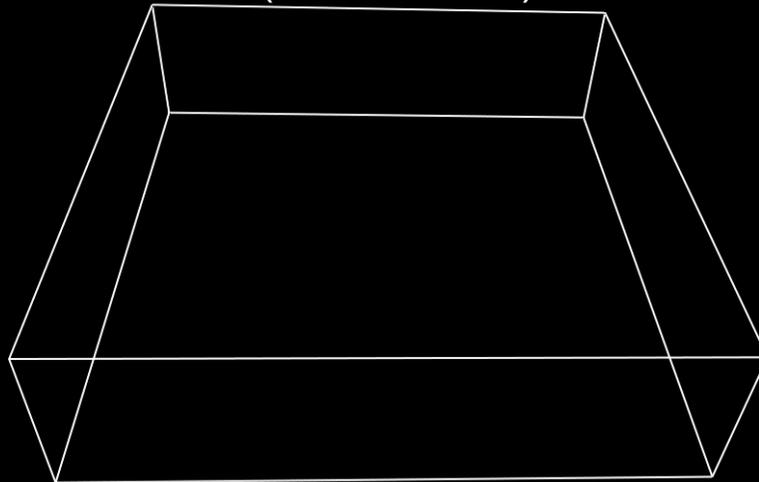


[Feng et al. 2021]

MCS in 3 atmospheric regimes

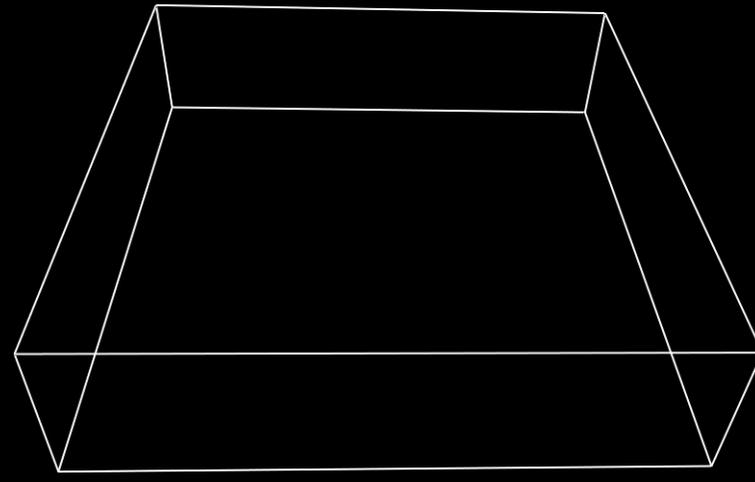


$\Delta x = 12$ km
(K-F scheme)



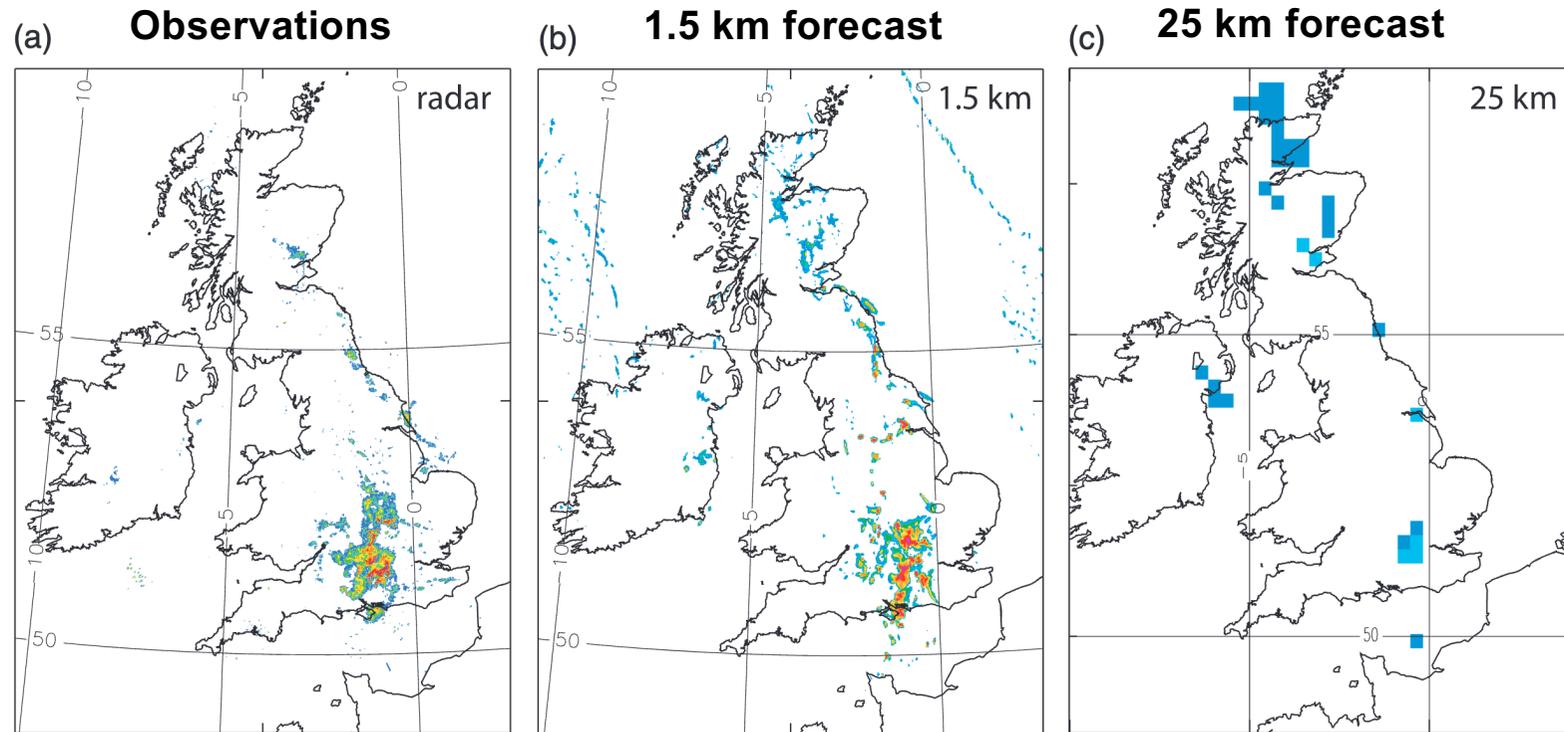
Date/Time: 0001-01-01_00:00:00

$\Delta x = 4$ km



Date/Time: 0001-01-01_00:00:00

Mesoscale convective system (MCS) over the UK



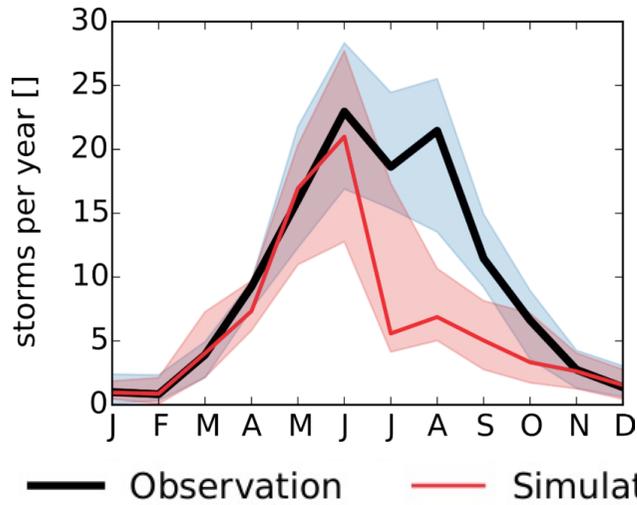
0 250 km



Clark et al. 2016

Annual Cycle of Mesoscale Convective Systems

MCSs per Year

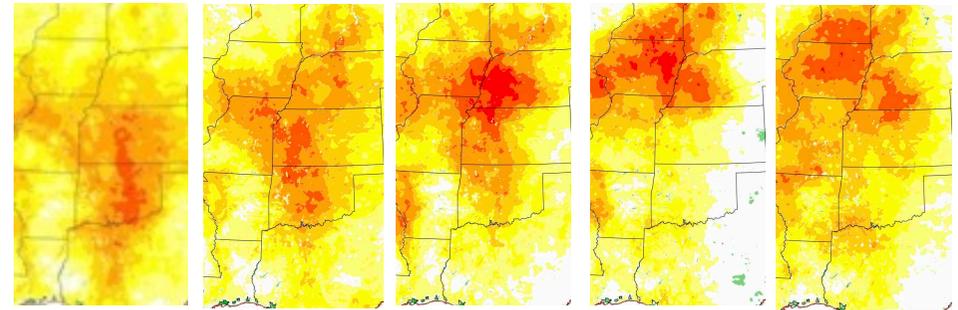


4 km Hindcast

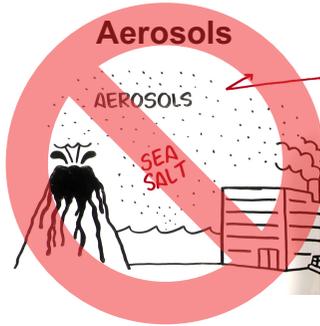
Liu et al. (2017)
Prein et al. (2017)



Temperature Bias in Central U.S.



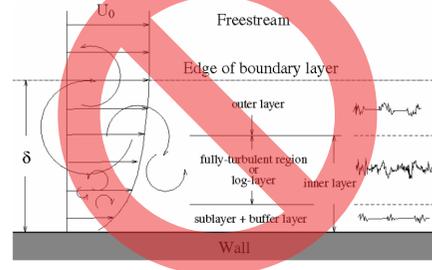
April May June July Aug
[Barlage et al. 2021]



Shallow Convection



Boundary Layer Scheme



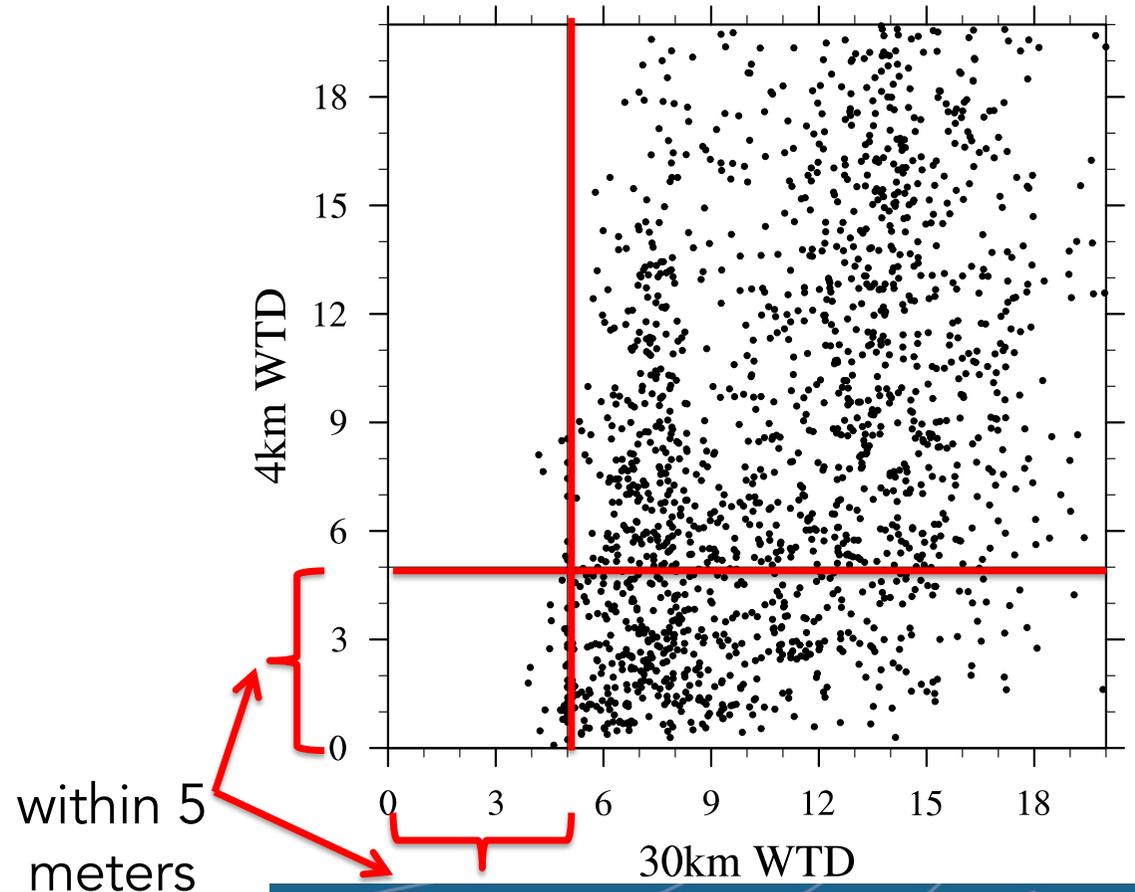
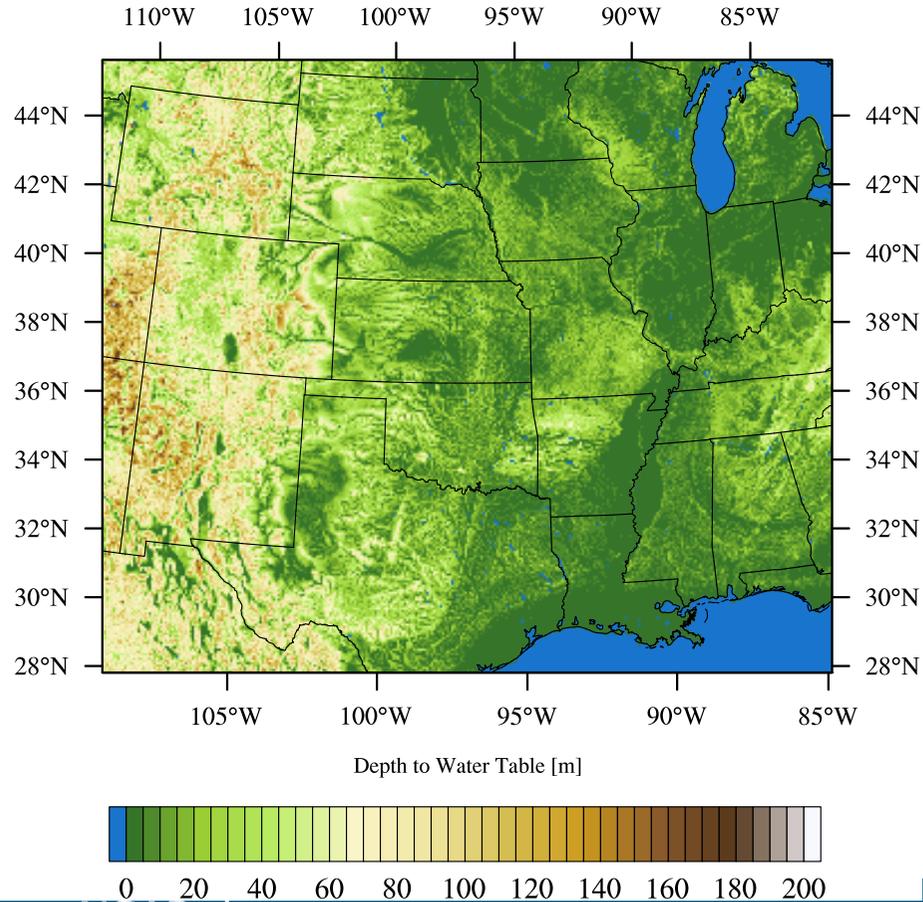
-6 -5 -4 -3 -2 -1 0 1 2 3 4 5 6

Temperature bias relative to PRISM

Scale Dependencies of the Water Table Depth

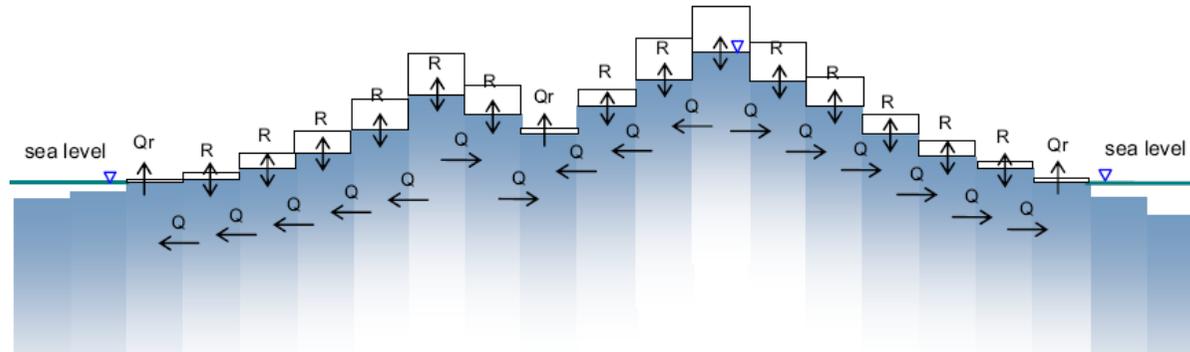
Significant sub-grid variability is missed when using coarse resolution

[Barlage et al. 2021]

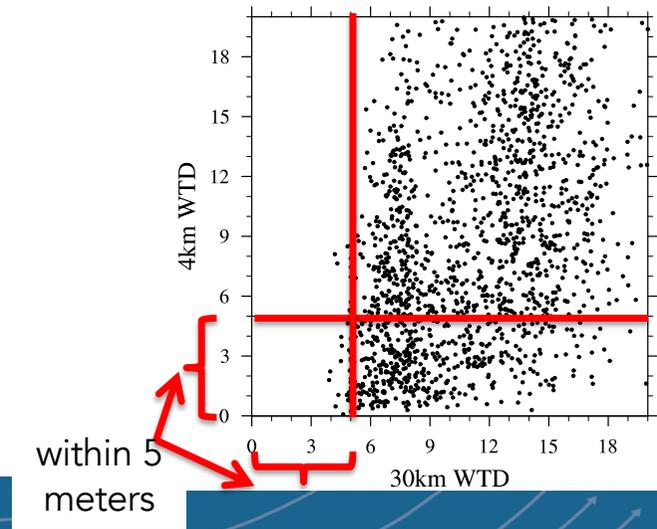
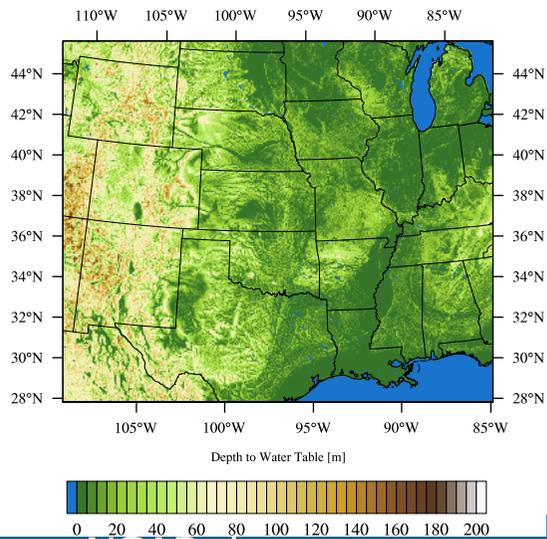


Scale Dependencies of the Water Table Depth

Significant sub-grid variability is missed when using coarse resolution

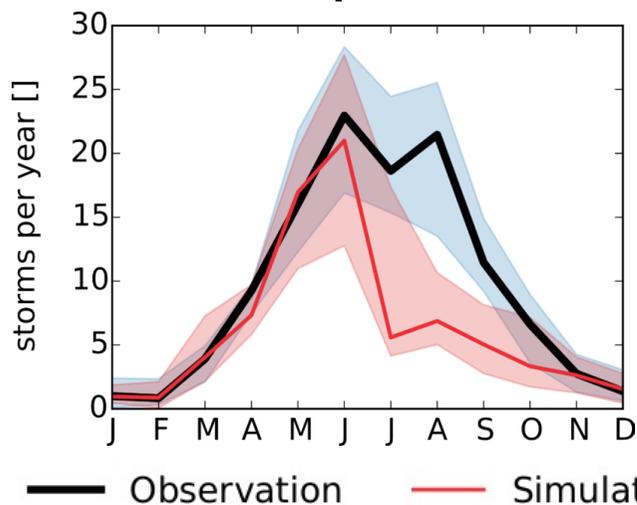


Fan et al, JGR 2007
Miguez-Macho et al., JGR 2007



Annual Cycle of Mesoscale Convective Systems

MCSs per Year

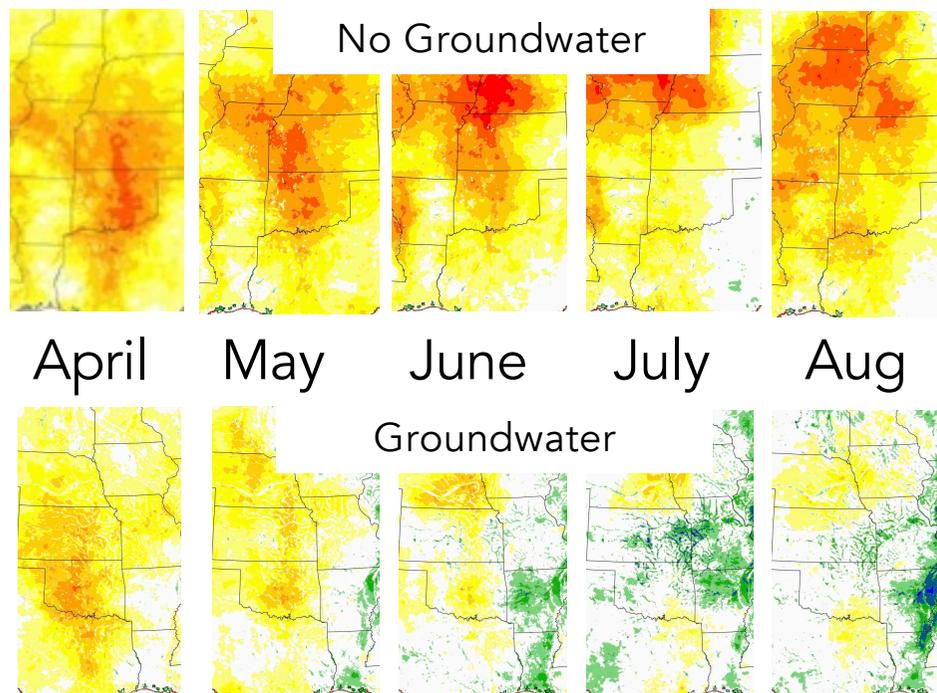


4 km Hindcast

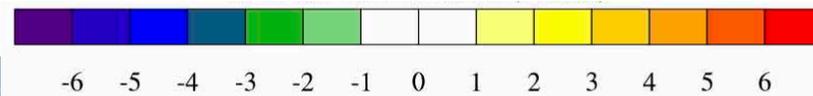
Liu et al. (2017)
Prein et al. (2017)



Temperature Bias in Central U.S.



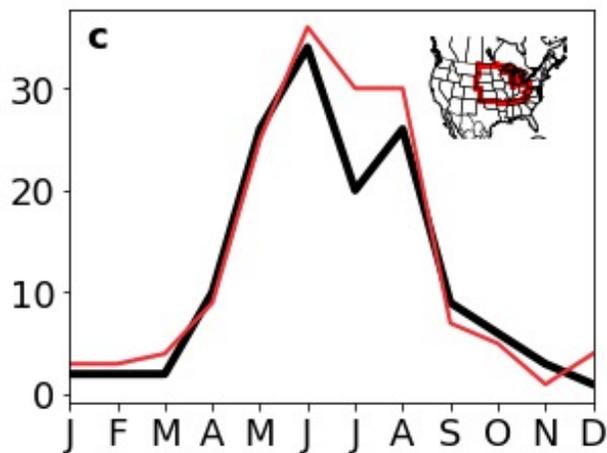
[Barlage et al. 2021]



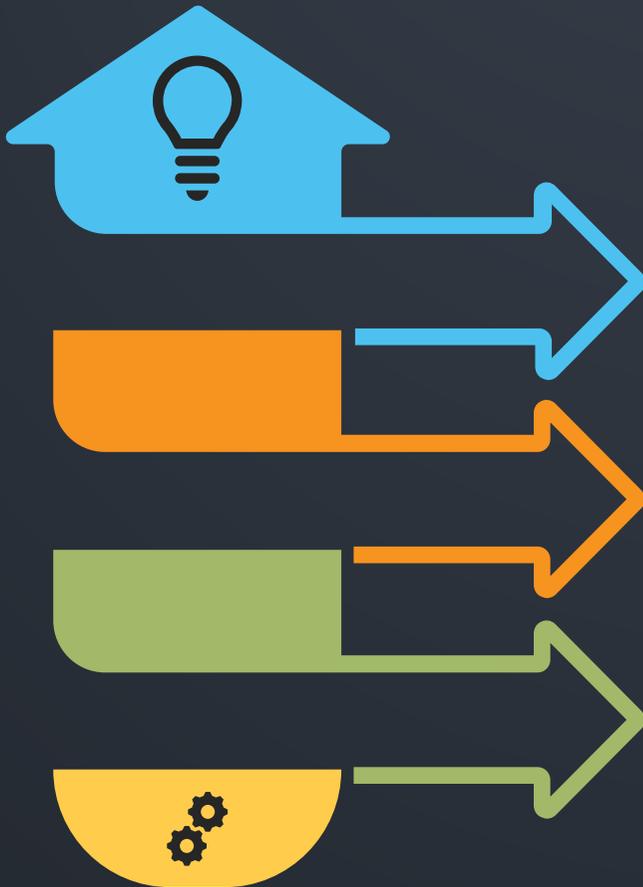
Temperature bias relative to PRISM

4 km Hindcast

with groundwater



What I want you to remember from this talk



Do not expect that everything gets immediately better at high-resolution. Key processes might be missing.

The coupling strength between earth system components is grid spacing depended. You need experts from different disciplines to fix model errors.

There is a serious lack of communication and collaboration between modeling communities.

Thank you

prein@ucar.edu

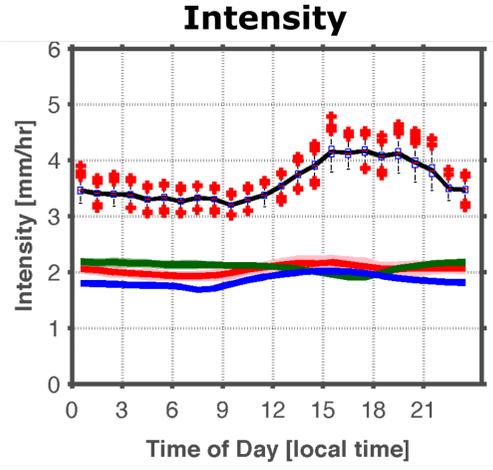
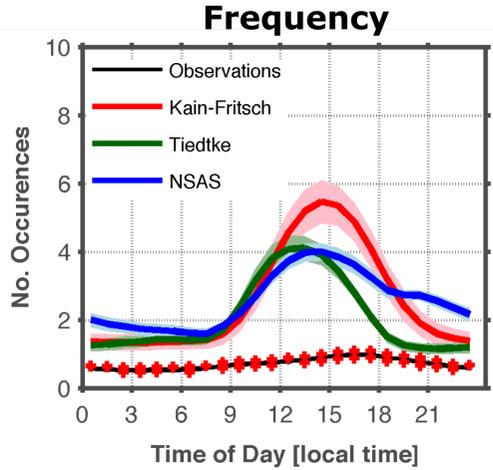
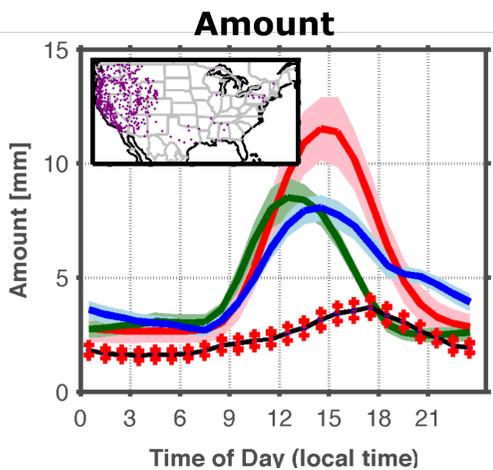


7th Workshop
Bergen, Norway

Aug. 29-31, 2023
ral-cpcm@ucar.edu

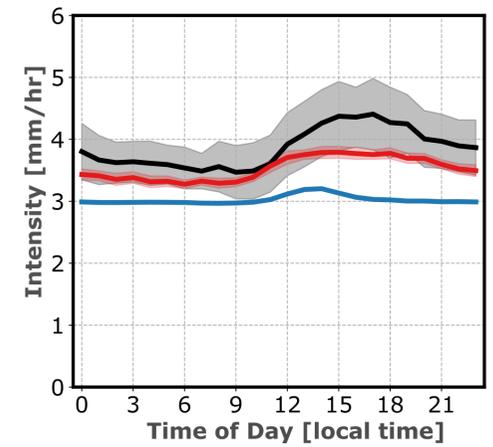
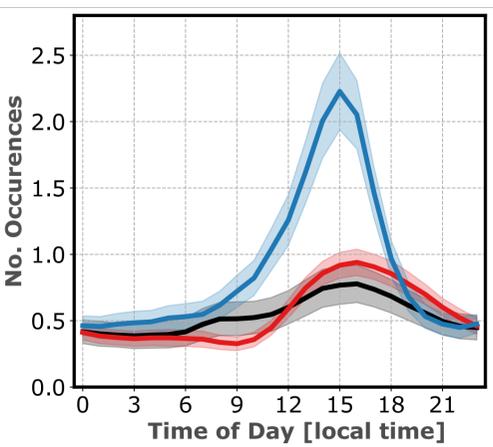
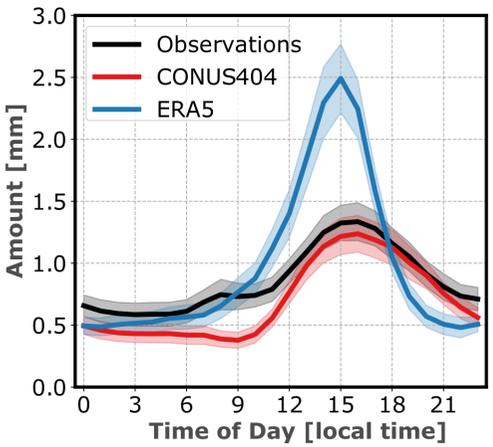
Easter U.S. Cold and Wet Biases

36 km WRF
Multi-Physics
Ensemble



Mooney et al. (2017)

4 km WRF
& ERA5

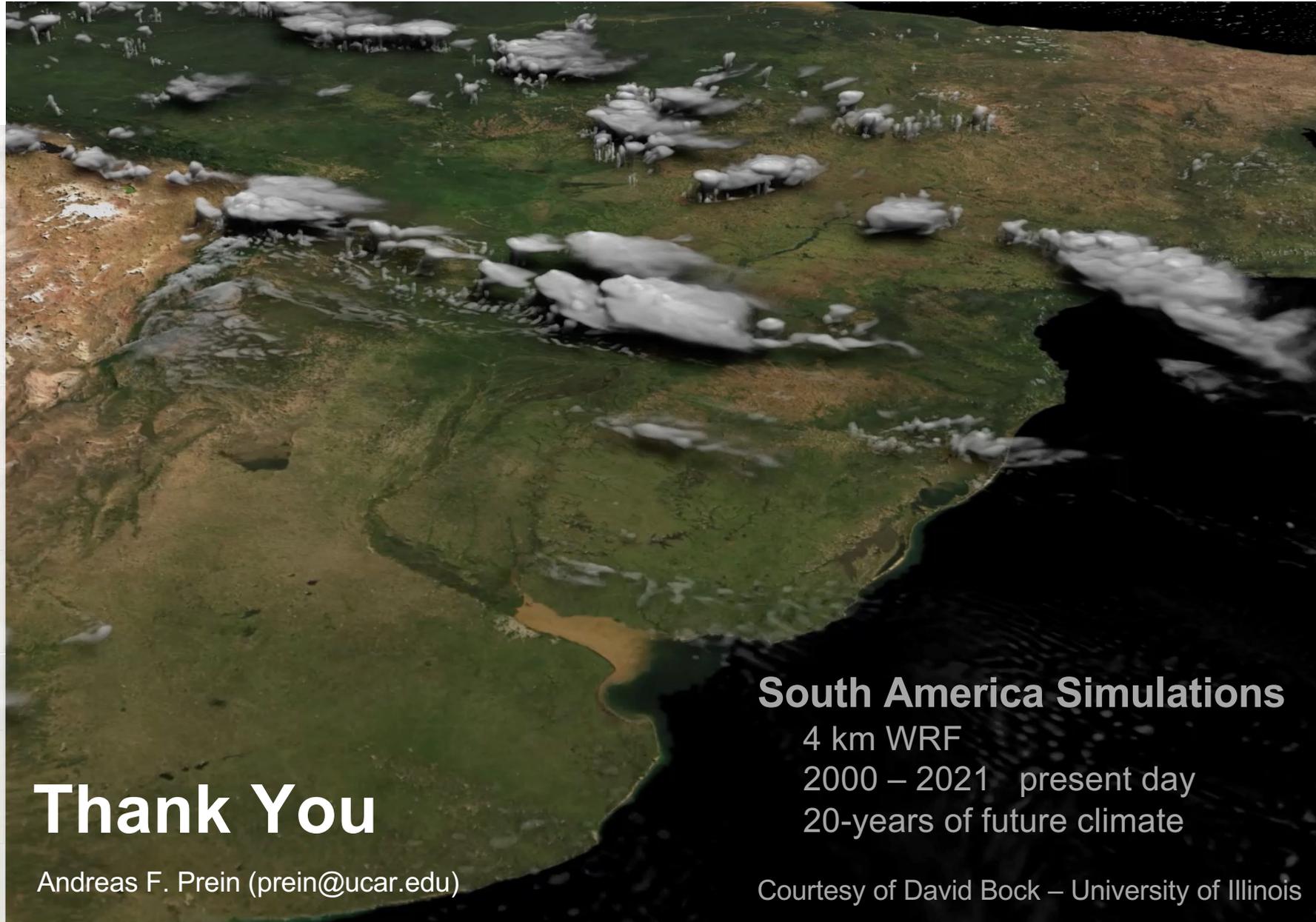


Rasmussen et al. (submitted)

Km-Scale models largely improve the wet bias and precipitation characteristics in the Western U.S. during summer



NCAR	GEVEX	University of Saskatchewan	Colorado State University
CONICET	UFMS Universidade Federal de Santa Maria	Hong Kong Baptist University	U. of Illinois
Maine's Public Universities	Met Office	Oxford University	Pacific Northwest National Laboratory
Senamhi	State Univ. of New York at Albany	Universidad de Antioquia	University of Manchester
University of Minnesota	USP Universidade de São Paulo	THE UNIVERSITY OF ARIZONA	UCSB UC Santa Barbara
UCLA UC Los Angeles	UFMS Universidade Federal de Santa Maria	UBA Universidad de Buenos Aires	Universidad Nacional de Colombia
Universidad de la Frontera	University of Oklahoma	University of Richmond	University of Saskatchewan
THE UNIVERSITY OF UTAH	USC Universidad de Santiago de Compostela	UGA University Grenoble Alpes	Instituto de Astronomía, Geofísica e Ciências Atmosféricas
Center for Climate and Resilience Research	Universidad de Chile		



Thank You

Andreas F. Prein (prein@ucar.edu)

South America Simulations

4 km WRF
2000 – 2021 present day
20-years of future climate

Courtesy of David Bock – University of Illinois

How to Move Foreword?

Define community activities that help to test and improve **processes** in km-scale coupled modeling systems

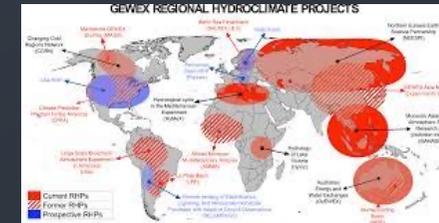
WCRP Digital Earths LHA could play a **coordinating role** and help to set **research priorities**

This will only work if we get broad **community engagement**

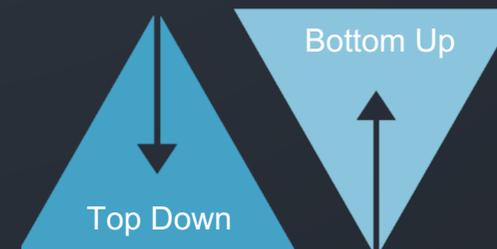
NCAR efforts in Americas



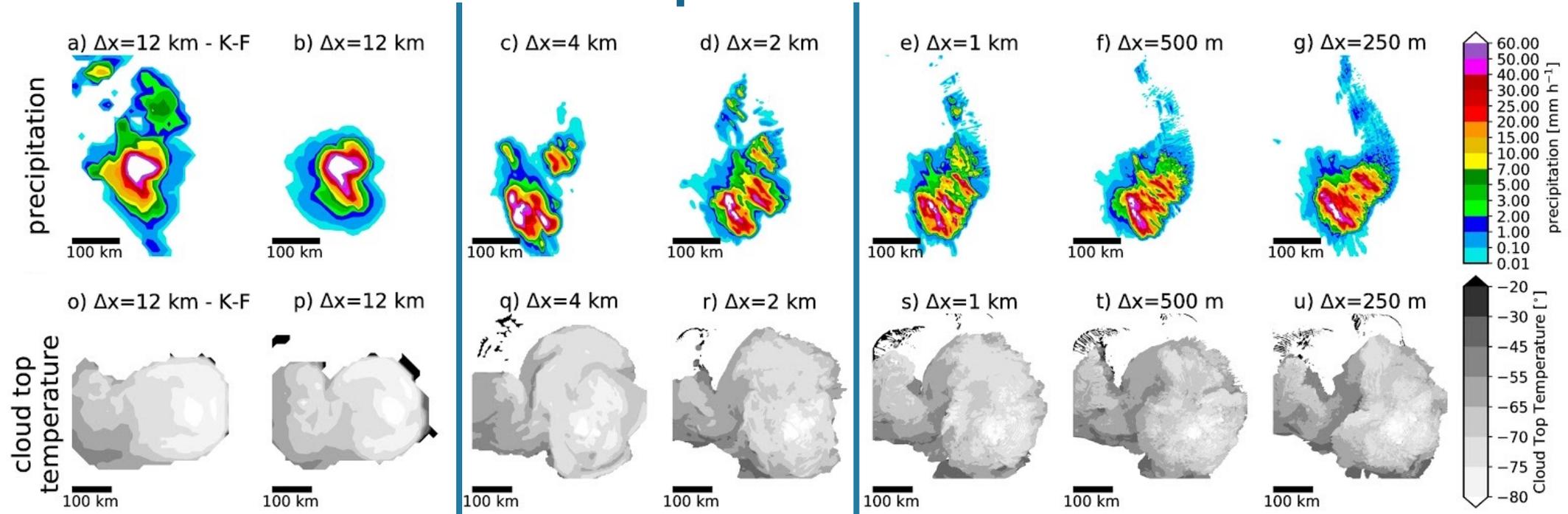
GEWEX RHPs



CORDEX FPSs



Example MCSs Features



bulk convergence

step improvement
from $\Delta x=12$ km to $\Delta x=4$ km

further structural improvements from
 $\Delta x=4$ km to $\Delta x=1$ km

[Prein et al. 2021]

NCAR/RAL Kilometer-Scale Climate Simulations

CO-Headwaters [Rasmussen et al. 2014]

- Reanalysis downscaled
- 2001-2008
- dx=4 km
- future – PGW, RCP8.5

CONUS-1 [Liu et al. 2017, Clim Dyn]

- Reanalysis downscaled
- 2001-2013
- dx=4 km
- future – PGW, RCP8.5

CONUS-2 [in progress]

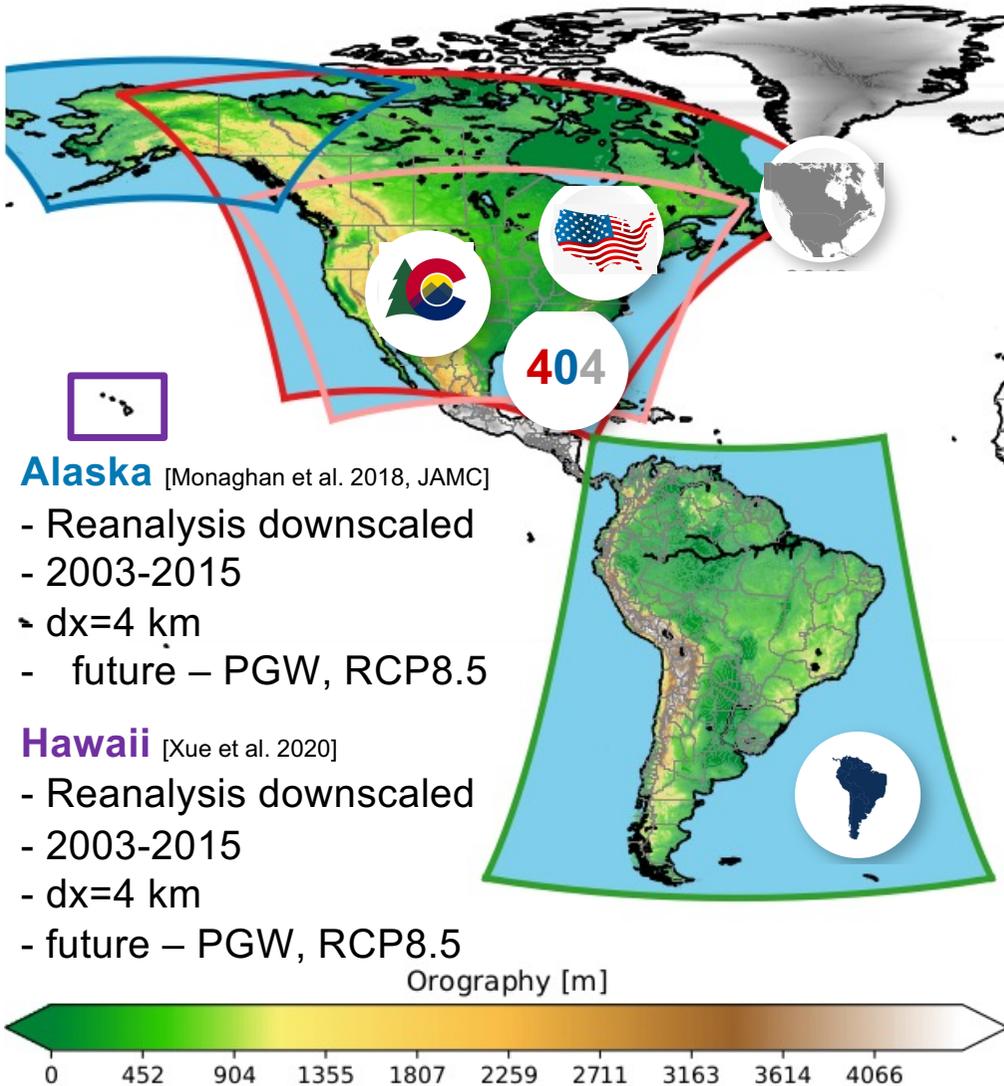
- GCM downscaled
- 1995-2014
- dx=4 km

CONUS404 [finished]

- Reanalysis downscaled
- 1979-2019
- dx=4 km

South America [in progress]

- Reanalysis downscaled
- 20-years
- dx=4 km
- future – PGW, RCP8.5



2014
CONUS1

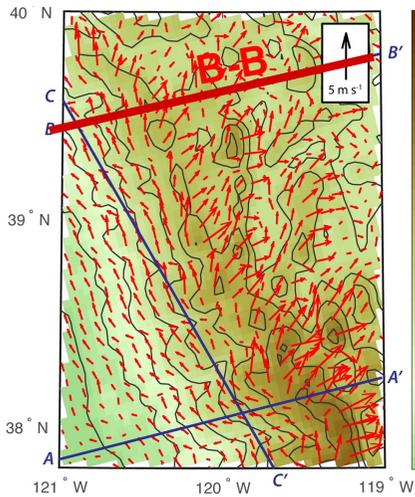
ERA-Interim forcing



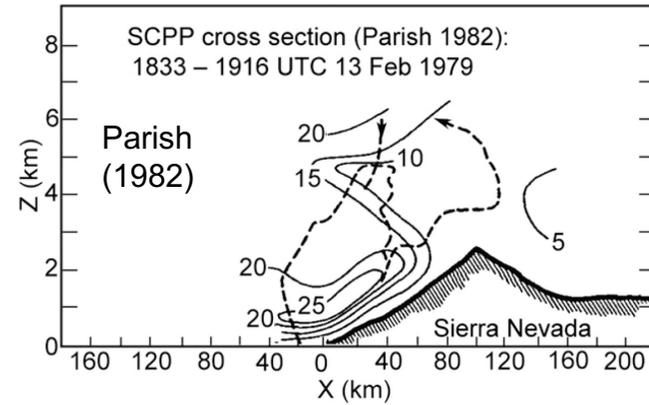
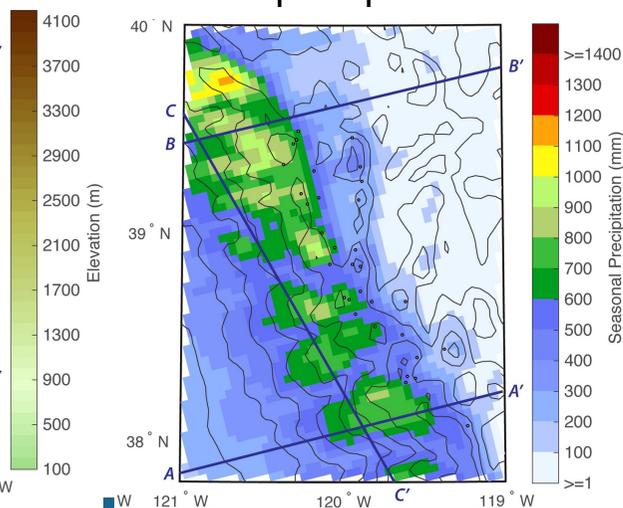
Flow Interaction with Topography

The Sierra Nevada Barrier Jet in CONUS1

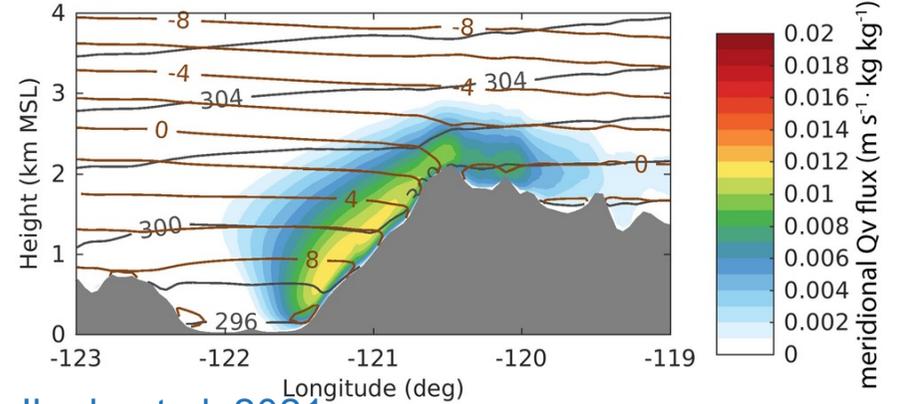
10 m DJF wind



DJF precipitation



Meridional Qv flux (B-B)

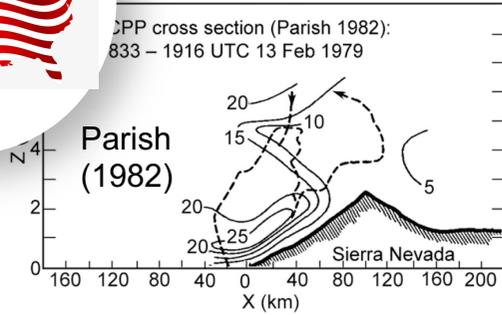


[Ikeda et al. 2021](#)

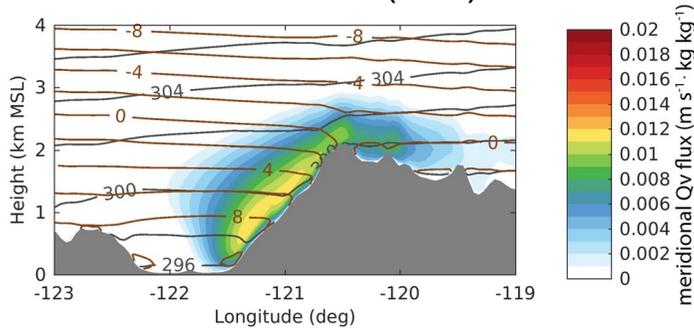
2014 CONUS1 ERA-Interim forcing

Precipitation Shadowing Effect

ERA-Interim forcing



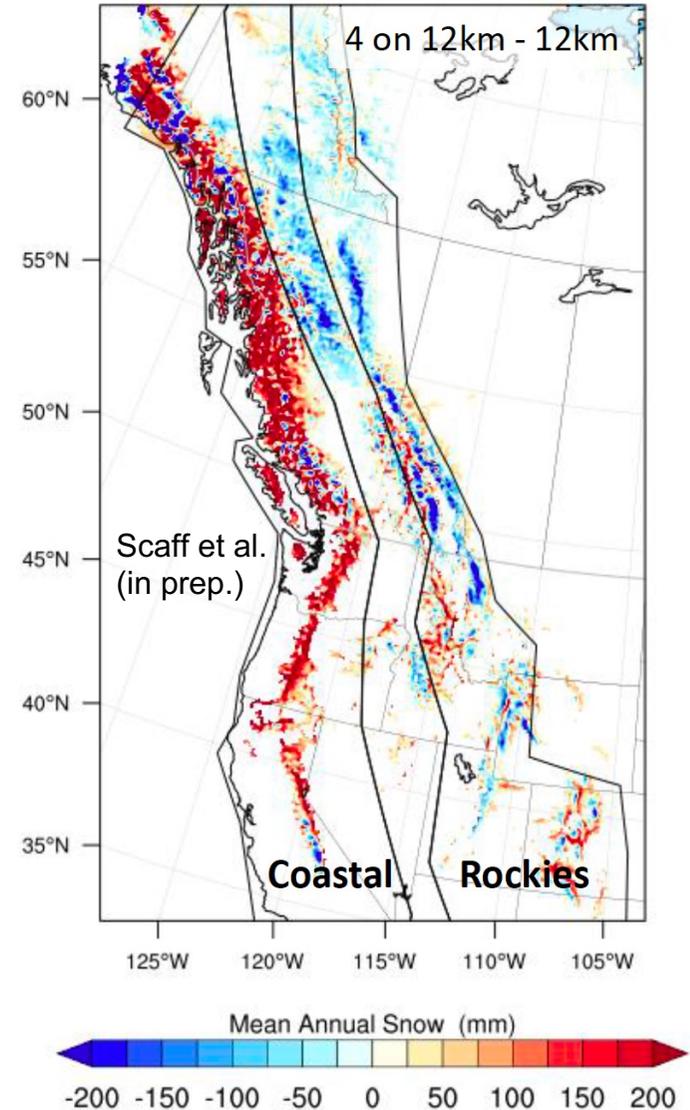
Meridional Qv flux (B-B)



[Ikeda et al. 2021](#)

Snow accumulation in 12 km vs 4 km simulation

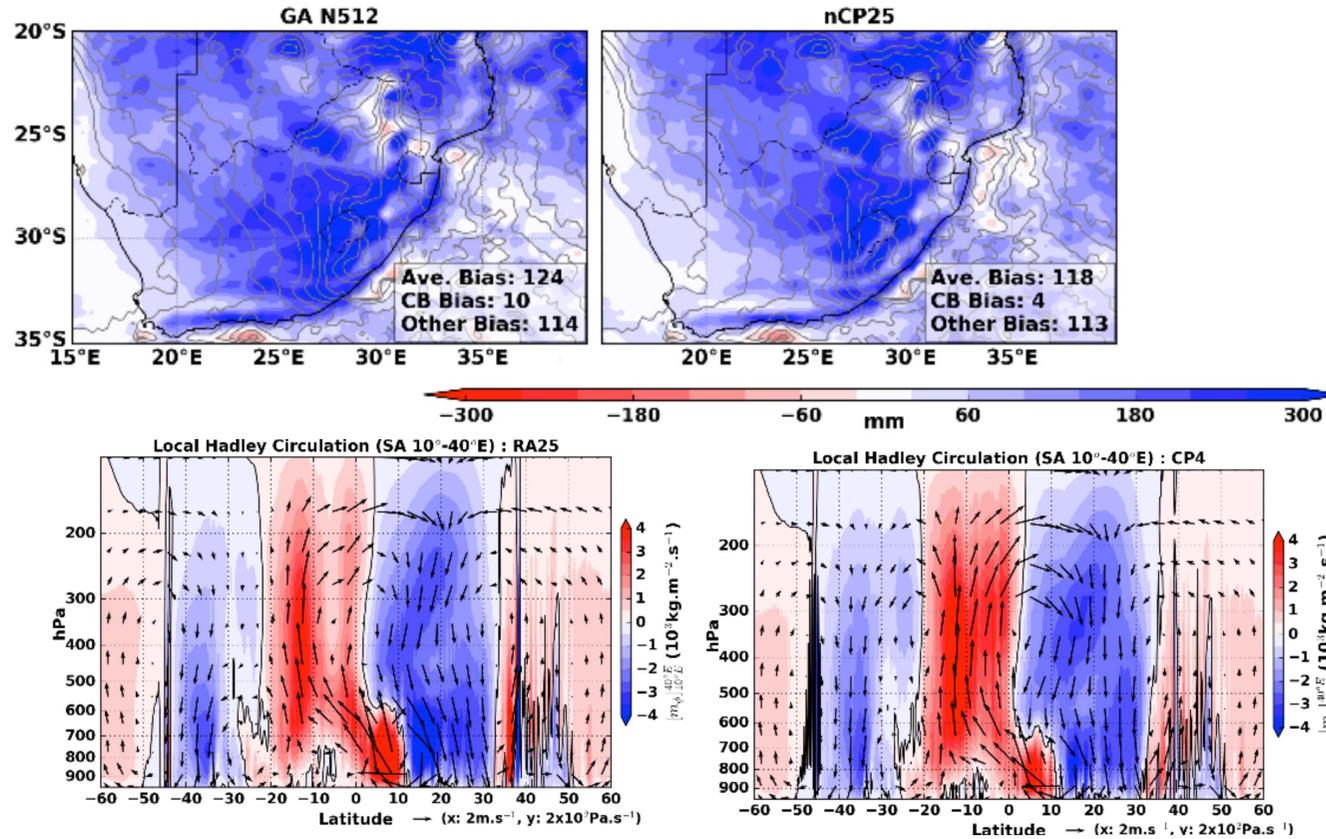
12 km model underestimates snowfall in the coastal mountains but overestimates it along the Continental Divide compared to a 4 km counterpart



Upscaling Effects

Global Model

25 km Model



4 km has more realistic Hadley overturning circulation which halves the subtropical wet bias in

Hart et al. 2018; GRL

Thank You

Andreas F. Prein (prein@ucar.edu)

