

# Model Errors in Precipitation, Cloudiness, and Radiation in the NARCCAP Hindcast Experiment

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# Introduction

- Precipitation, clouds and surface insolation are among the most crucial variables in shaping the energy and water cycle, especially in the surface climate.
- These variables directly affect agriculture, water resources, snowpack, and natural ecosystems that are key targets in a number of climate change impact assessment studies for practical applications.
- Thus, estimating model errors in simulating precipitation, clouds and insolation are an important concern in climate simulations and their application to energy/water cycle analyses and impact assessments – especially for multi-model ensemble and bias correction.
- The relationship between the model errors in these variables may provide clues *for the source of model errors and/or for improving climate model performance.*

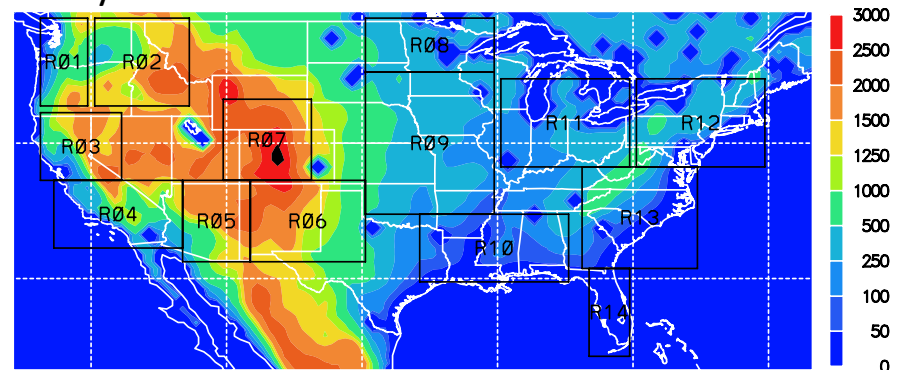
# Experiment

- We examined the relationship between the model biases in **precipitation**, **cloudiness**, and **surface insolation** over the conterminous United States in the NARCCAP multi-RCM climate hindcast data for 1984-2003.
  - Cloudiness is selected to represent "**cloud effects**".
  - Cloud effects are determined by, in addition to cloudiness, the content, size distribution, and phase of cloud particles.
- Data from 4 RCMs and their *ENS* are used (Table).
- Reference datasets include the *station-based* **CRU3.1** for precipitation and *satellite-based* Clouds and the Earth's Radiant Energy System (**CERES**) datasets for cloudiness and surface insolation.
  - The JPL Regional Climate Model Evaluation System (RCMES) is used to access and process the reference and model data in this study.

Table: RCMs incorporated in this study

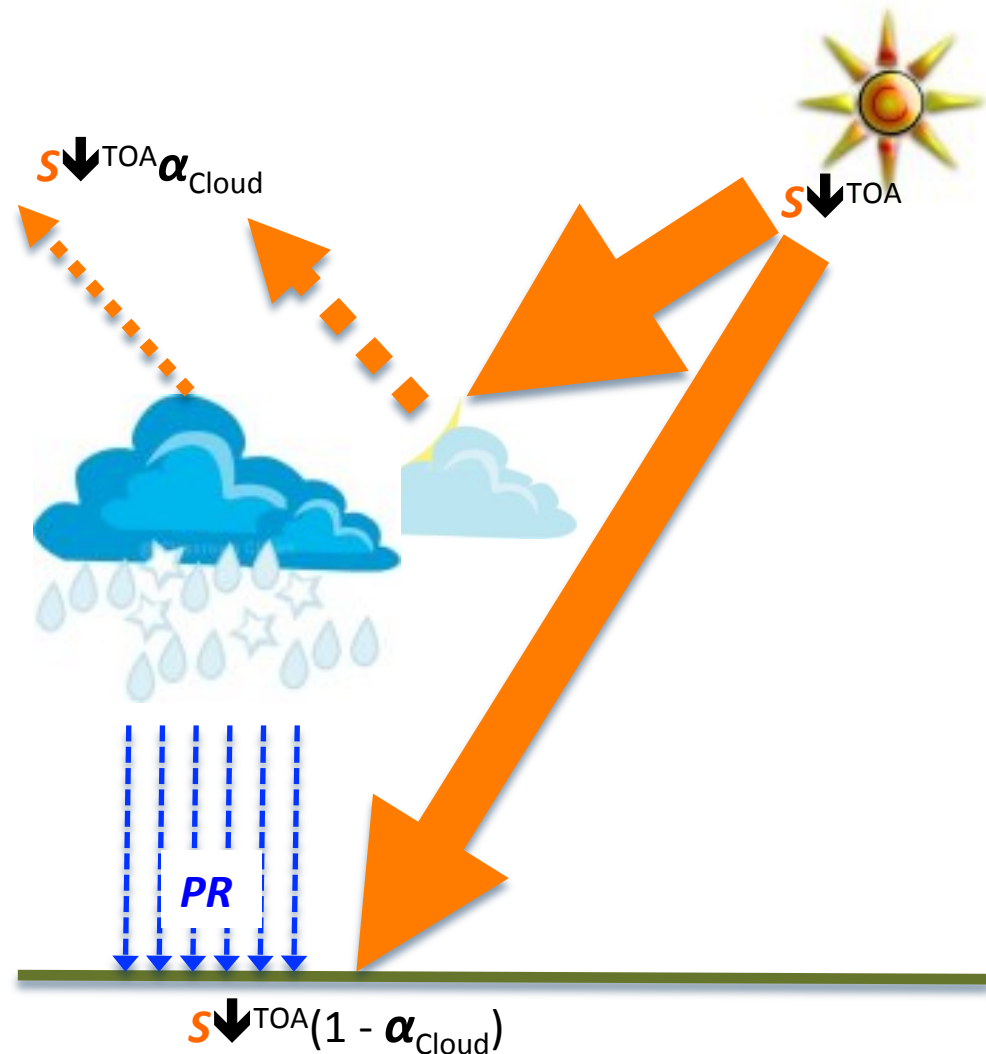
ID	Model Name
<b>CRCM</b>	Canadian Regional Climate Model
<b>HRM3</b>	Hadley Center Regional Climate Model
<b>RCM3</b>	ICTP Reg. Climate Model 3 (run by UCSC)
<b>WRFG</b>	Weather Research and Forecast Model
<b>ENS</b>	Uniform-weighted multi-model Ensemble

Analysis domain

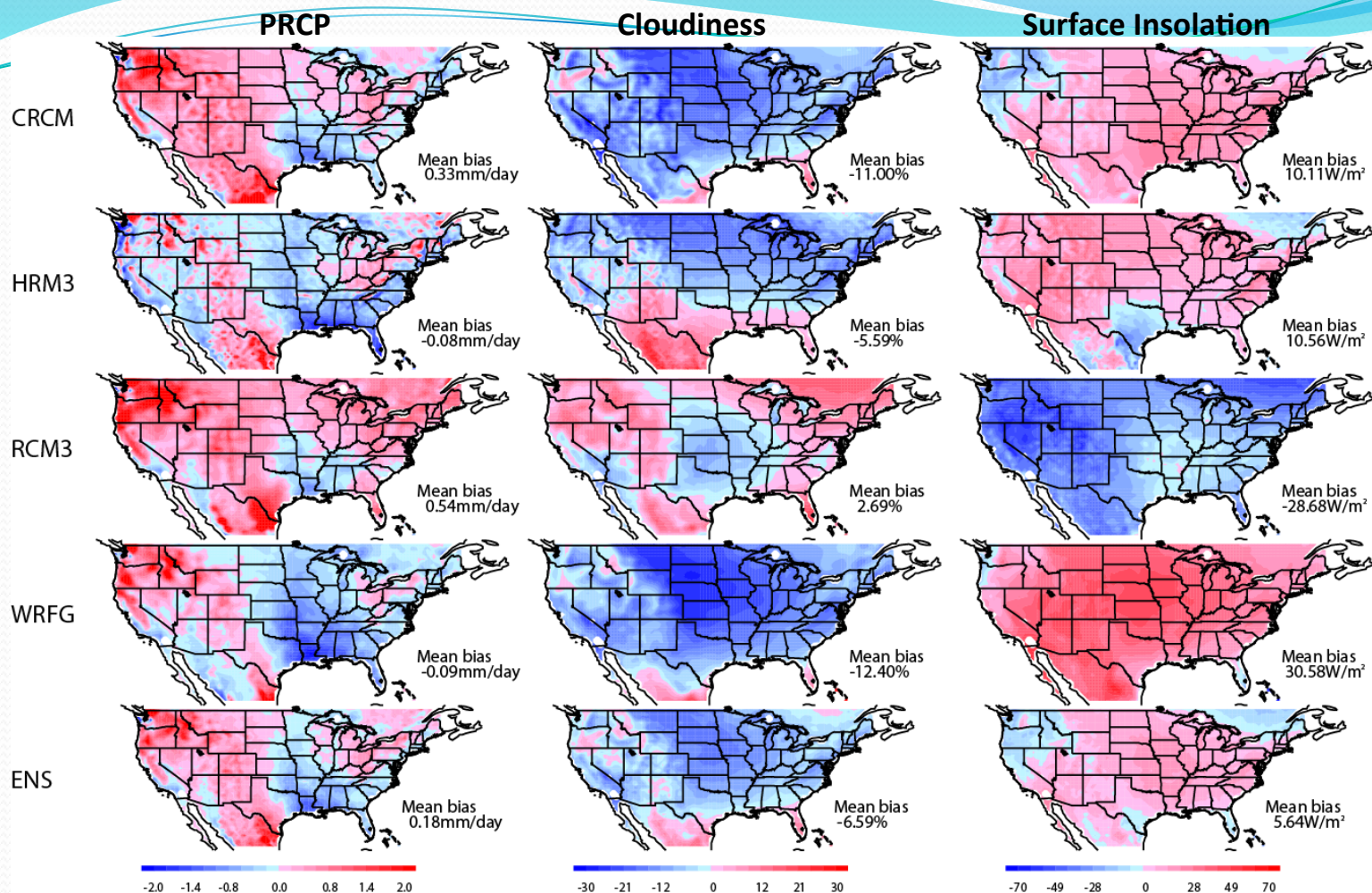


# Precipitation, Surface Insolation, and Clouds

- Precipitation and surface insolation are related via clouds.
- Calculations of these three fields are among the most uncertain components in today's climate models.
- *Working Hypothesis:*
  1. Model biases in *precipitation* and *cloudiness* are positively correlated,
  2. The biases in *surface insolation* are negatively correlated with the biases in *cloudiness* (and thus *precipitation*).

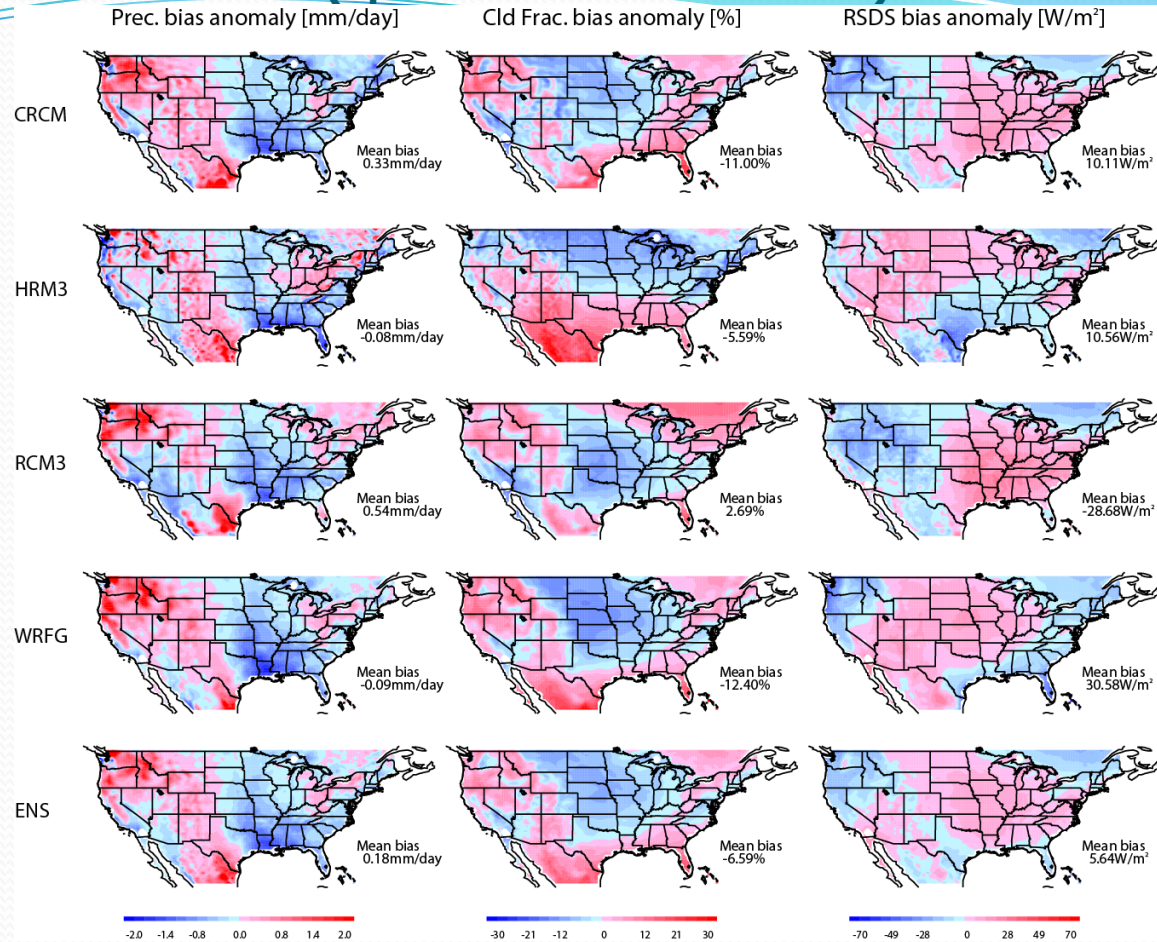


# Biases in Annual-mean precipitation, Cloudiness, and Insolation



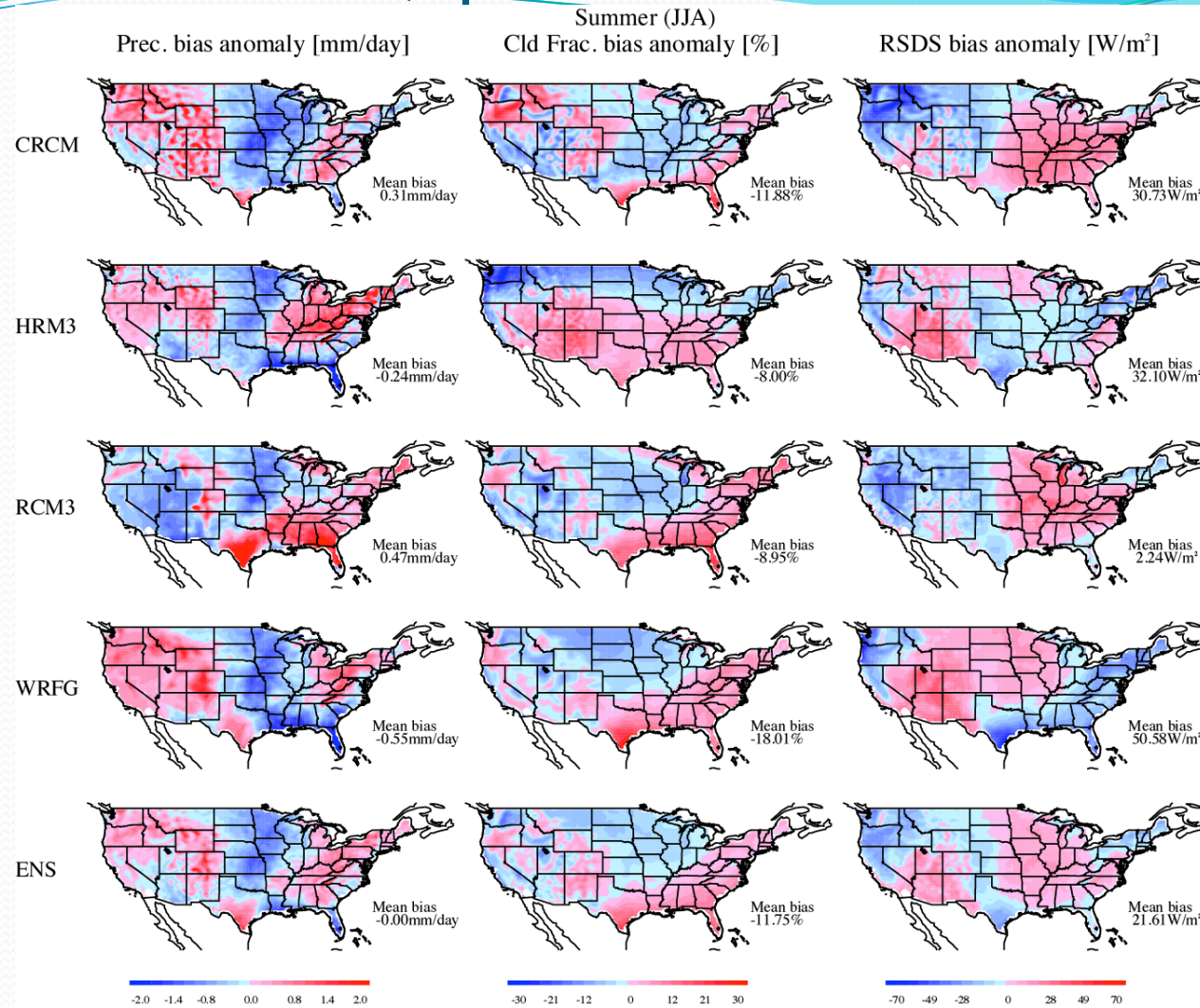
- Model biases show regionally systematic variations. E.g.,
  - Wet/Dry biases in the western US/Gulf of Mexico
  - Overall negative cloudiness biases in the US
  - General positive biases in insolation except in the Pacific NW
  - RCM3 is an outlier among the four RCMs in the cloudiness & insolation biases.
- The expected relationship between these three bias fields is not clear.

# Biases in Annual-mean precipitation, Cloudiness, and Insolation (Spatial mean removed)



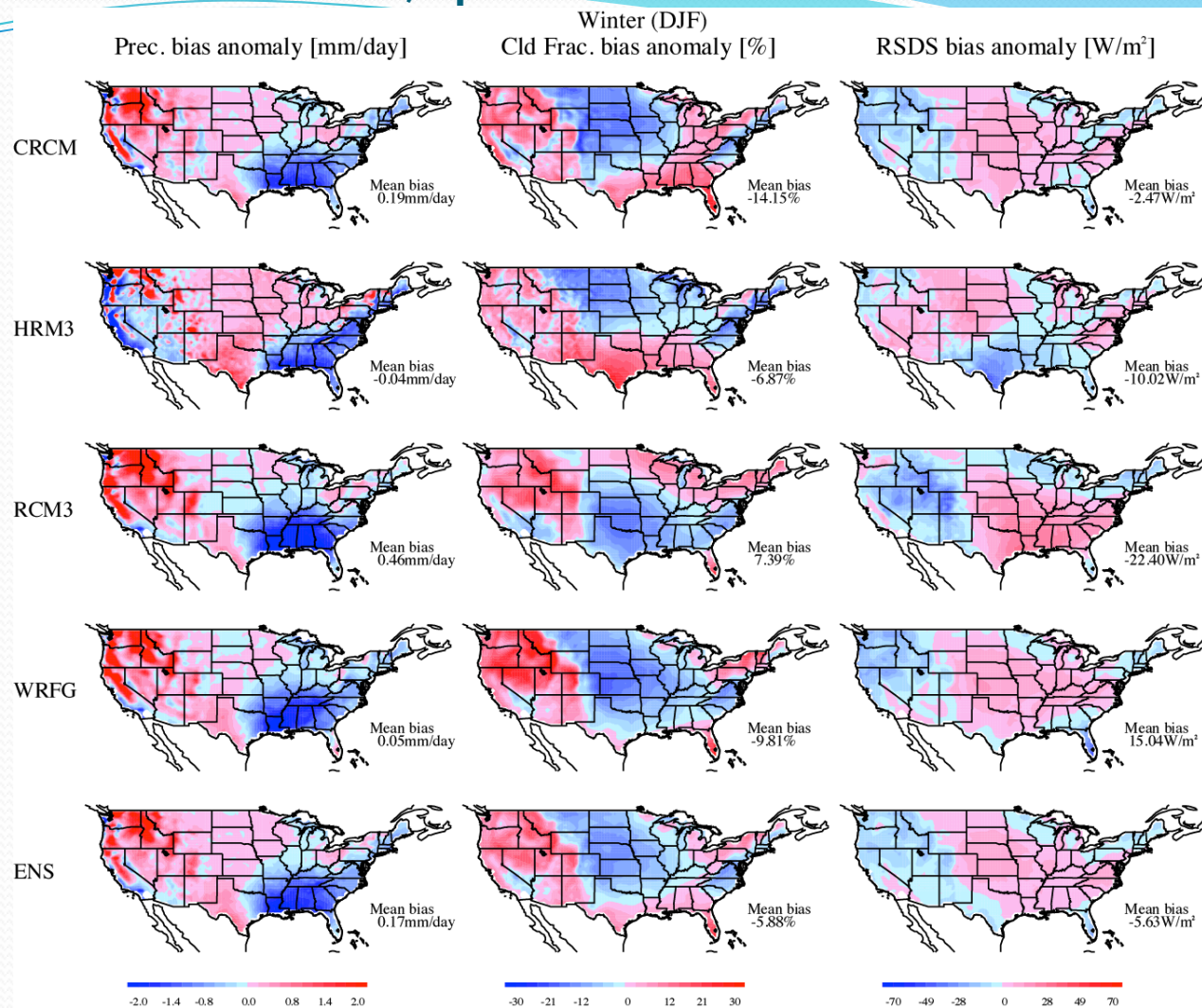
- Spatial anomalies of model biases show more systematic patterns
  - Most RCMS show positive/negative precipitation bias anomalies in WUS/EUS, most notably in the Pacific NW/Gulf of Mexico-Atlantic coast regions.
  - Positive/negative cloudiness bias anomalies in WUS/EUS.
  - Positive/negative insolation bias anomalies in EUS/WUS.
- These patterns show the expected relationship between the three error fields.

# Biases in Annual-mean precipitation, Cloudiness, and Insolation: Summer, Spatial mean removed



- The negative correlation btn cloudiness & insolation bias is well established.
- The positive correlation btn rainfall & cloudiness bias varies geographically
  - Well established in the EUS region
  - Not clear in the WUS region (most WUS is very dry during summer)

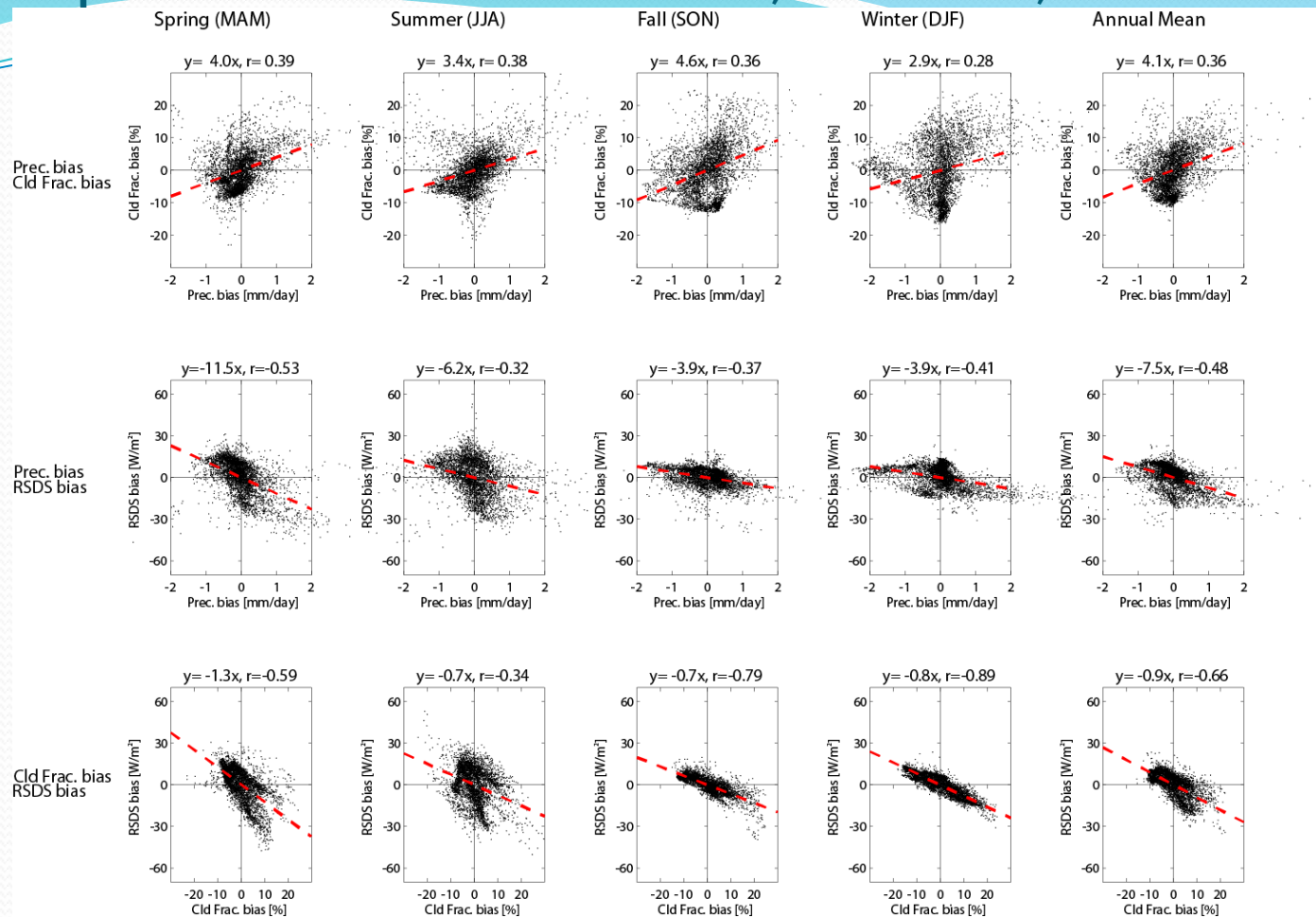
# Biases in Annual-mean precipitation, Cloudiness, and Insolation: Winter, Spatial mean removed



- The negative correlation btn cloudiness & insolation bias is well established.
- The positive correlation btn rainfall & cloudiness (negative with insolation) is generally established, especially for the WUS region
  - WUS winter precipitation is mostly related with stratiform clouds.



# Relationship between the model bias in PR, Cloudiness, and Insolation: ENS



- The bias anomalies of multi-model ensemble shows consistent relationship between precipitation, insolation, and cloudiness for season totals as well as annual totals.
  - Positive correlation: PR vs. Cloudiness
  - Negative correlation: PR vs. Insolation & Cloudiness vs. Insolation
- The strongest correlation between cloudiness and surface insolation; the weakest for precipitation and cloudiness.

# Biases in Precipitation, Cloudiness, and Insolation Overland Means

	Model	PR (mm/day)	Cloudiness (%)	Insolation (W/m <sup>2</sup> )
All Year	CRCM	0.33	-11.0	10.1
	HRM3	-0.08	-5.6	10.6
	RCM3	-0.54	2.7	-28.7
	WRFG	-0.09	-12.4	30.6
	<b>ENS</b>	<b>0.18</b>	<b>-6.6</b>	<b>5.6</b>
Spring	CRCM	0.60	-12.8	10.7
	HRM3	0.22	-5.7	-43.5
	RCM3	0.96	5.5	-26.7
	WRFG	0.23	-12.9	35.6
	<b>ENS</b>	<b>0.50</b>	<b>6.5</b>	<b>-6.0</b>
Summer	CRCM	0.45	-11.7	29.9
	HRM3	-0.18	-7.9	31.0
	RCM3	0.62	-7.4	-28.1
	WRFG	-0.44	-16.9	49.6
	<b>ENS</b>	<b>0.11</b>	<b>-11.0</b>	<b>20.6</b>
Fall	CRCM	-0.04	-6.9	3.9
	HRM3	-0.51	-3.9	66.6
	RCM3	0.01	3.1	-32.9
	WRFG	-0.34	-11.9	23.5
	<b>ENS</b>	<b>-0.22</b>	<b>-5.1</b>	<b>15.2</b>
Winter	CRCM	0.32	-12.6	-3.8
	HRM3	0.16	-5.1	-11.6
	RCM3	0.57	8.8	-27.0
	WRFG	0.16	-8.0	14.3
	<b>ENS</b>	<b>0.31</b>	<b>-4.3</b>	<b>-7.0</b>

- The overland-mean values of the model biases in precipitation, cloudiness, and surface insolation do not show the relationship expected from the physical processes except for fall.
- This may suggest problems in the formulations related with precipitation, clouds, and insolation in the RCMs examined in this study.

# Biases in Precipitation, Cloudiness, and Insolation

## Spatial Anomalies

	Model	PR vs. Cloudiness	PR vs. Insolation	Cloudiness vs. Insolation
All Year	CRCM	0.24	-0.48	-0.46
	HRM3	0.29	-0.30	-0.51
	RCM3	0.47	-0.49	-0.64
	WRFG	0.36	-0.22	-0.60
	<b>ENS</b>	<b>0.36</b>	<b>-0.48</b>	<b>-0.66</b>
Spring	CRCM	0.30	-0.43	-0.45
	HRM3	0.36	-0.43	-0.49
	RCM3	0.59	-0.52	-0.75
	WRFG	0.39	-0.26	-0.75
	<b>ENS</b>	<b>0.39</b>	<b>-0.53</b>	<b>-0.59</b>
Summer	CRCM	0.42	-0.35	-0.58
	HRM3	0.00	-0.33	0.03
	RCM3	0.59	-0.07	-0.22
	WRFG	0.22	-0.14	-0.56
	<b>ENS</b>	<b>0.38</b>	<b>-0.32</b>	<b>-0.34</b>
Fall	CRCM	-0.06	-0.34	-0.50
	HRM3	0.40	-0.36	-0.58
	RCM3	0.53	-0.61	-0.57
	WRFG	0.40	-0.40	-0.44
	<b>ENS</b>	<b>0.36</b>	<b>-0.37</b>	<b>-0.79</b>
Winter	CRCM	0.08	-0.28	-0.72
	HRM3	0.27	-0.35	-0.75
	RCM3	0.37	-0.49	-0.82
	WRFG	0.38	-0.41	-0.79
	<b>ENS</b>	<b>0.28</b>	<b>-0.41</b>	<b>-0.89</b>

- The spatial pattern correlation coefficients between the spatial anomalies of the model biases in the three fields show the expected relationship between the three fields.
- The presence of the expected relationship between the spatial anomalies of these model biases may imply some consistency in simulating these variables within RCMs – a subject that needs further exploration.

## Summary

- Relationships between model biases in simulating precipitation, insolation, and cloudiness over the conterminous US region are examined for the NARCCAP hindcast experiment data.
- The relationship between *the domain-averaged* model bias based on a simple physical model are not well established, but
- The *spatial anomalies (i.e., domain mean is subtracted)* of model biases show consistent relationships between **precipitation-and-insolation (negative)**, **cloudiness-and-insolation (negative)**, and **precipitation-and-cloudiness (positive)** for all seasons and for (nearly) all models.
  - *Cloudiness vs. Insolation bias relationship is most clearly established.*
- Mean biases in precipitation, clouds, and insolation in these RCMs are not well related; *however*,
  - The spatial anomalies of these model biases show the expected relationship.
  - *This indicate that model sensitivity may possess useful skill.*
- *Cloudiness may not be the right choice for quantitative representation of cloud effects on precipitation – may need to examine more directly related fields such as the content, phase and size distribution of cloud particles.*
  - We are currently developing key reference datasets especially from satellite-based remote sensing and methodologies for more *thorough examinations/evaluations of model precipitation-cloud-radiation interaction in terms of more detailed cloud structures and hydrometeor concentrations.*

## Related publications

- Kim, J., D. Waliser, C. Mattmann, L. Mearns, C. Goodale, A. Hart, D. Crichton, S. McGinnis, H. Lee, P. Loikith, and M. Boustani, 2013: Evaluation of the surface air temperature, precipitation, and insolation over the conterminous U.S. in the NARCCAP multi-RCM hindcast experiment using RCMES. *J. Climate*, Submitted.
- Li, J., D. Waliser, W. Chen, B. Guan, T. Kubar, G. Stephens, H. Ma, M. Deng, L. Donner, C. Segman, and L. Horowitz, 2012: An observationally based evaluation of cloud ice water in CMIP3 and CMIP5 GCMs and contemporary reanalyses using contemporary satellite data. *J. Geophys. Res.*, 117, DOI: 10.1029/2012JD017640.
- Waliser, D., J. Li, T. L'Ecuyer, and W. Chen, 2011: The impact of precipitating ice and snow on the radiation balance in global climate models. *Geophys. Res. Lett.*, 38, L06802, doi: 10.1029/2010GL046478.