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Use of Experimental Design in Climate Change Experiments: Examples from NARCCAP and NA-CORDEX

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EMF Week 2
Snowmass, CO
August 2, 2013

National Center for Atmospheric Research



Outline

- Introduction to downscaling
- NARCCAP brief overview
- Sample Matrices from European Programs
- New program NA-CORDEX

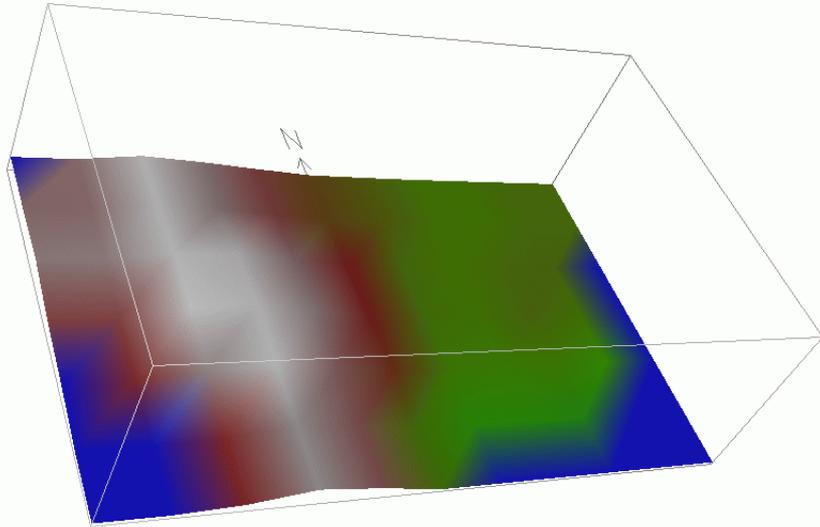


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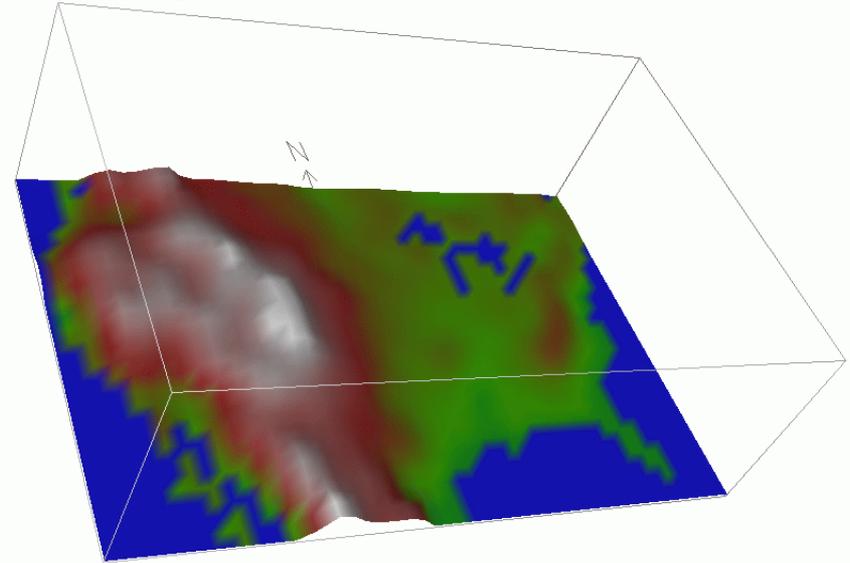
Increasing Spatial Scale of Global Climate Models through Application of Regional Climate Models

Dynamical Downscaling

Global Climate Models

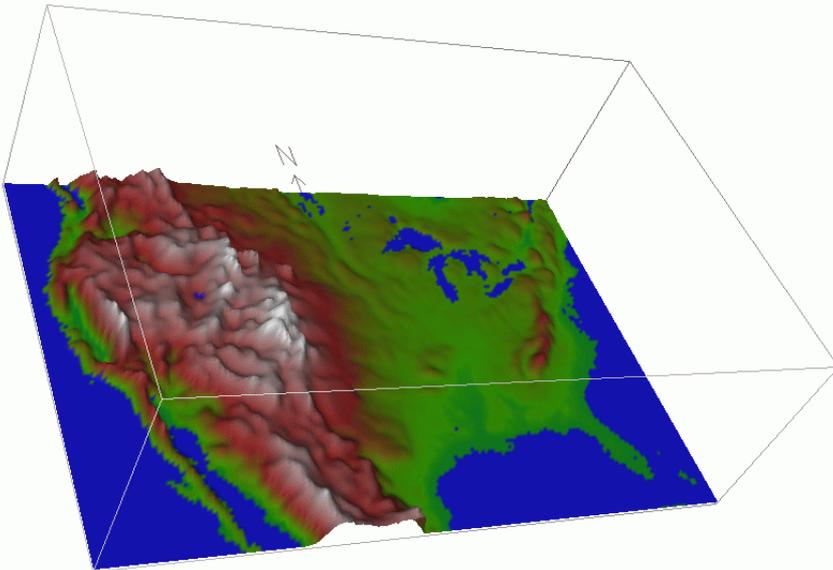


400 km

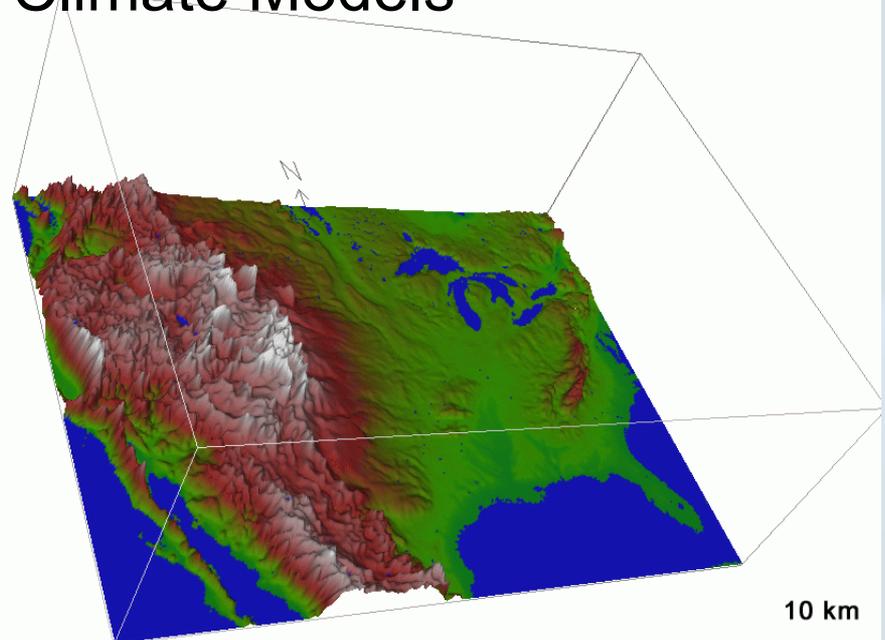


100 km

Regional Climate Models



25 km



10 km



Regional Modeling Strategy

Nested regional modeling technique

- Global model provides:
 - initial conditions – soil moisture, sea surface temperatures, sea ice
 - lateral meteorological conditions (temperature, pressure, humidity) every 6-8 hours.
 - Large scale response to forcing (100s kms)
- Regional model provides finer scale (10s km) response

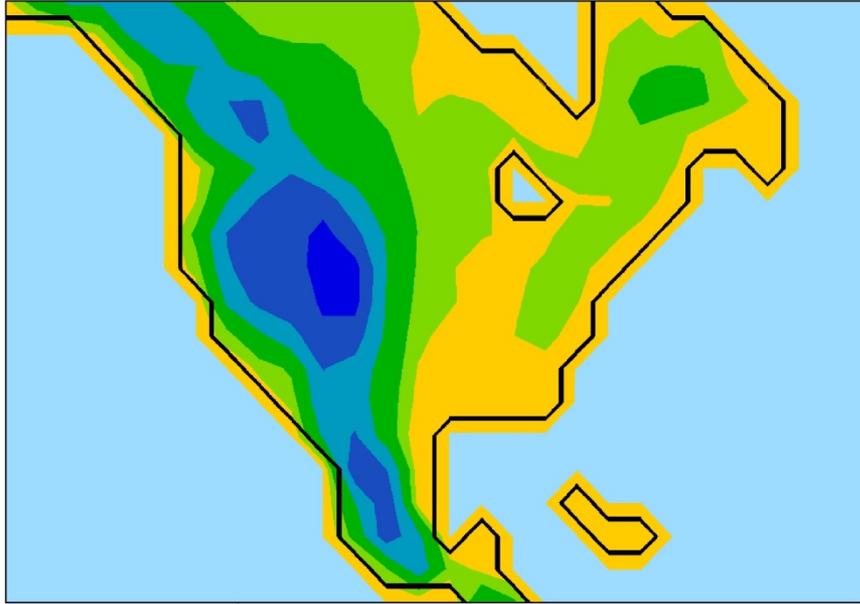
Advantages of higher resolution



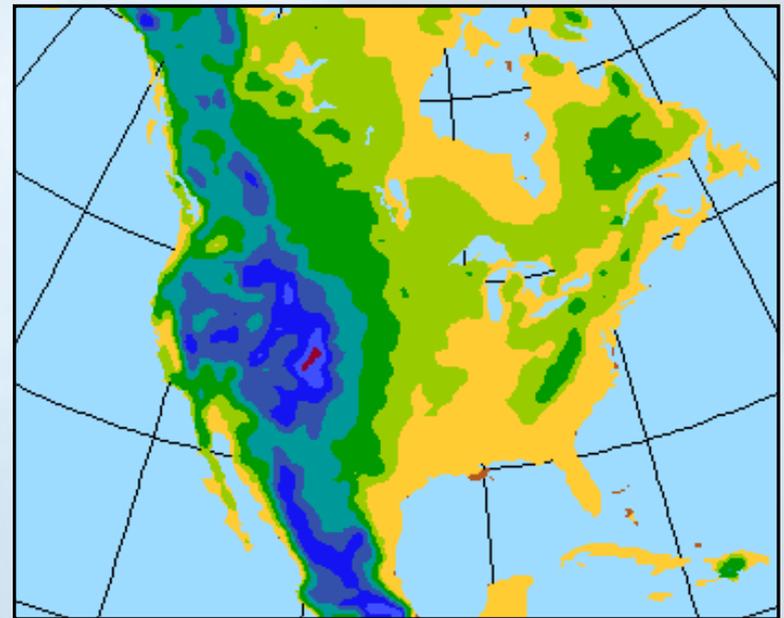
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North America at typical global climate model resolution

Hadley Centre AOGCM (HadCM3),
2.5° (lat) x 3.75° (lon), ~ 280 km



North America at 50 km grid spacing

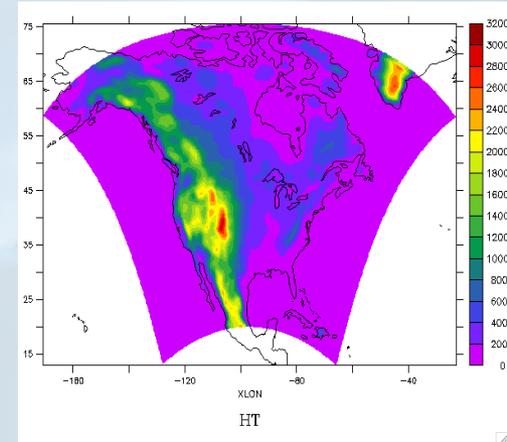


The North American Regional Climate Change Assessment Program (NARCCAP)



www.narccap.ucar.edu

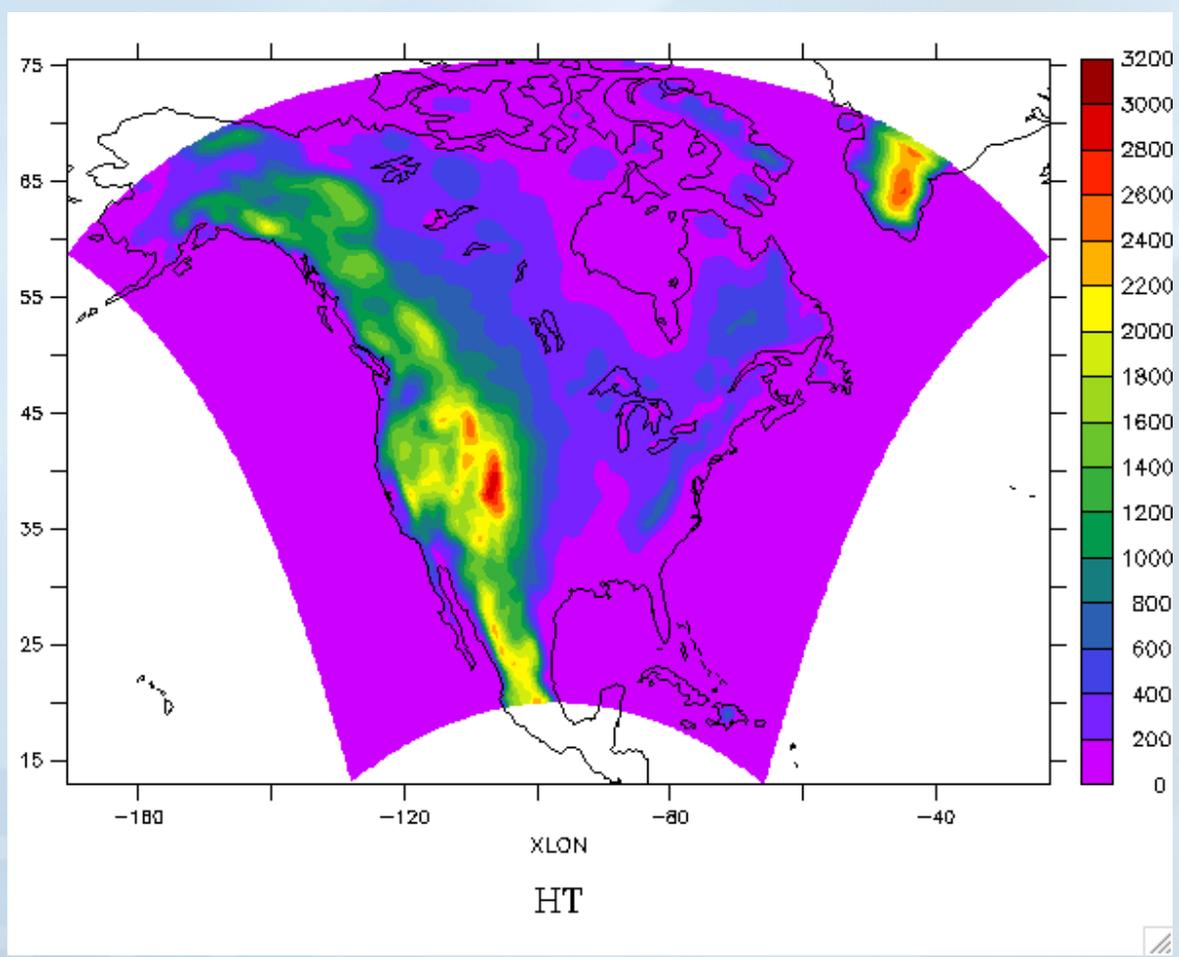
- Explores multiple uncertainties in regional and global climate model projections
 - 4 global climate models x 6 regional climate models
- Develops multiple high resolution (50 km) regional climate scenarios for use in impacts and adaptation assessments
- Evaluates regional model performance to establish credibility of individual simulations for the future
- Participants: Iowa State, PNNL, LLNL, UC Santa Cruz, Scripps, Ouranos (Canada), UK Hadley Centre, NCAR
- Initiated in 2006, funded by NOAA-OGP, NSF, DOE, USEPA-ORD – 5-year program





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NARCCAP Domain



Organization of Program

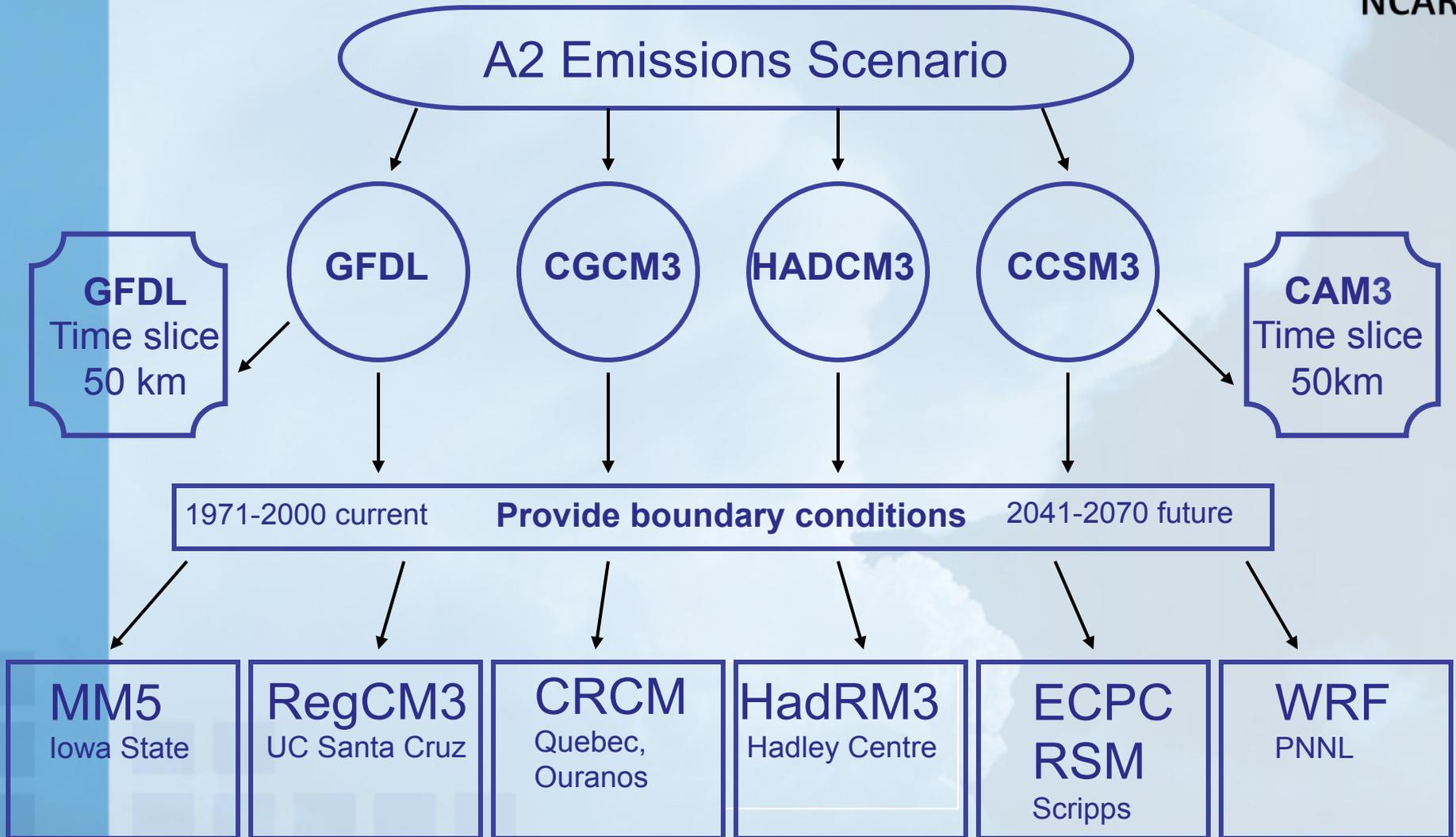


- *Phase I: 25-year simulations using NCEP-Reanalysis 2 boundary conditions (1979—2004)*
- *Phase II: Climate Change Simulations (A2 SRES Scenario)*
 - **Phase IIa: RCM runs (50 km res.) nested in AOGCMs current (30 yrs) and future (30 yrs)**
 - **Phase IIb: Time-slice experiments at 50 km res. (GFDL AM2.1 and NCAR CAM3) -- for comparison with RCM runs**
- **Quantification of uncertainty at regional scales – probabilistic approaches**
- **Scenario formation and provision to impacts community led by NCAR – 53 different variables saved at 3-hr intervals**
- **Opportunity for double nesting (over sub-regions) to include participation of other RCM groups**

NARCCAP PLAN – Phase II



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NARCCAP Experimental Design

A2 Emissions Scenario

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AOGCMs

	GFDL	CGCM3	HADCM3	CCSM3
RCMs				
MM5			X**	X1**
RegCM	X1**	X**		
CRCM		X1**		X**
HadRM	X**		X1**	
RSM	X1**		X	
WRF		X**		X1**

1 = chosen first GCM

Red = run completed

** = data loaded

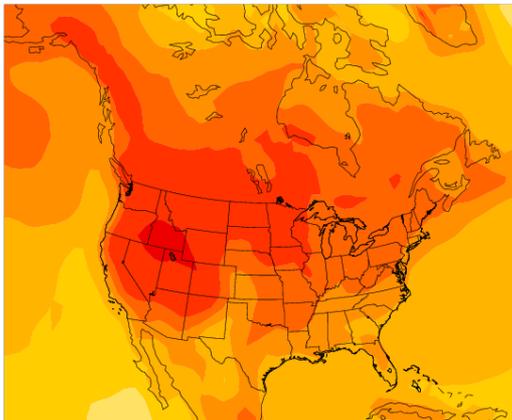


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CCSM-driven change in summer temperature

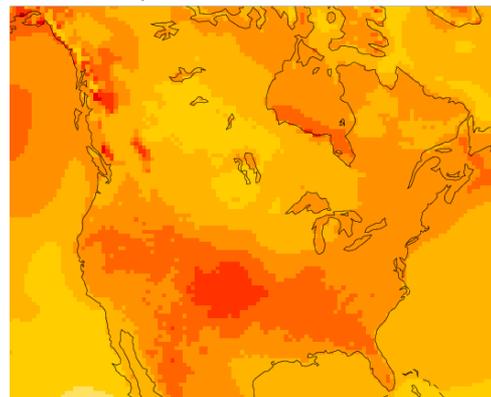
CCSM Change In Seasonal Avg Temp

JJA 2041-2070 minus 1971-2000 Deg C



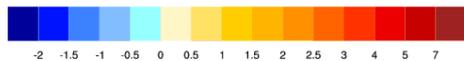
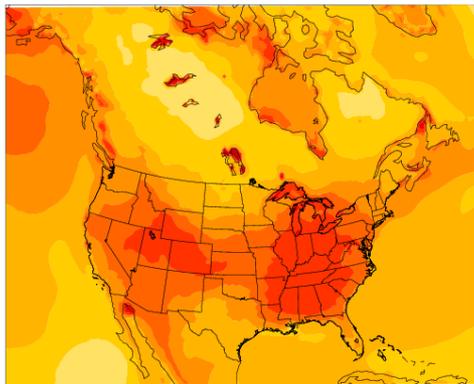
MM5+CCSM Change in JJA Avg Temp

Surface Air Temperature C



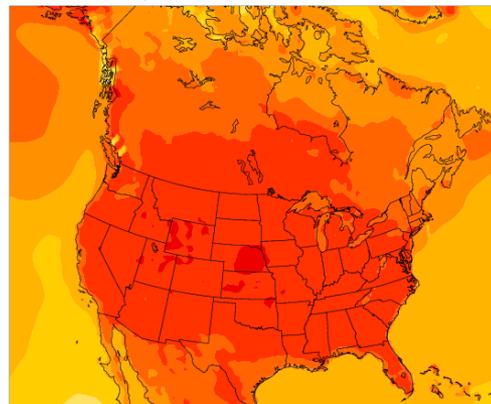
WRFG+ccsm Change In Seasonal Avg Temp

JJA 2041-2070 minus 1971-2000 Deg C



CRCM+CCSM Change in JJA Avg Temp

Surface Air Temperature C





Advantages of Experimental Design

- More robust estimates of error due to missing cells
- Particularly important for determining the relative contribution of the different factors in ANOVA – also provides more robust results

Analysis of Variance



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[Observed variance in a variable is partitioned into different components attributable to different sources of variations]

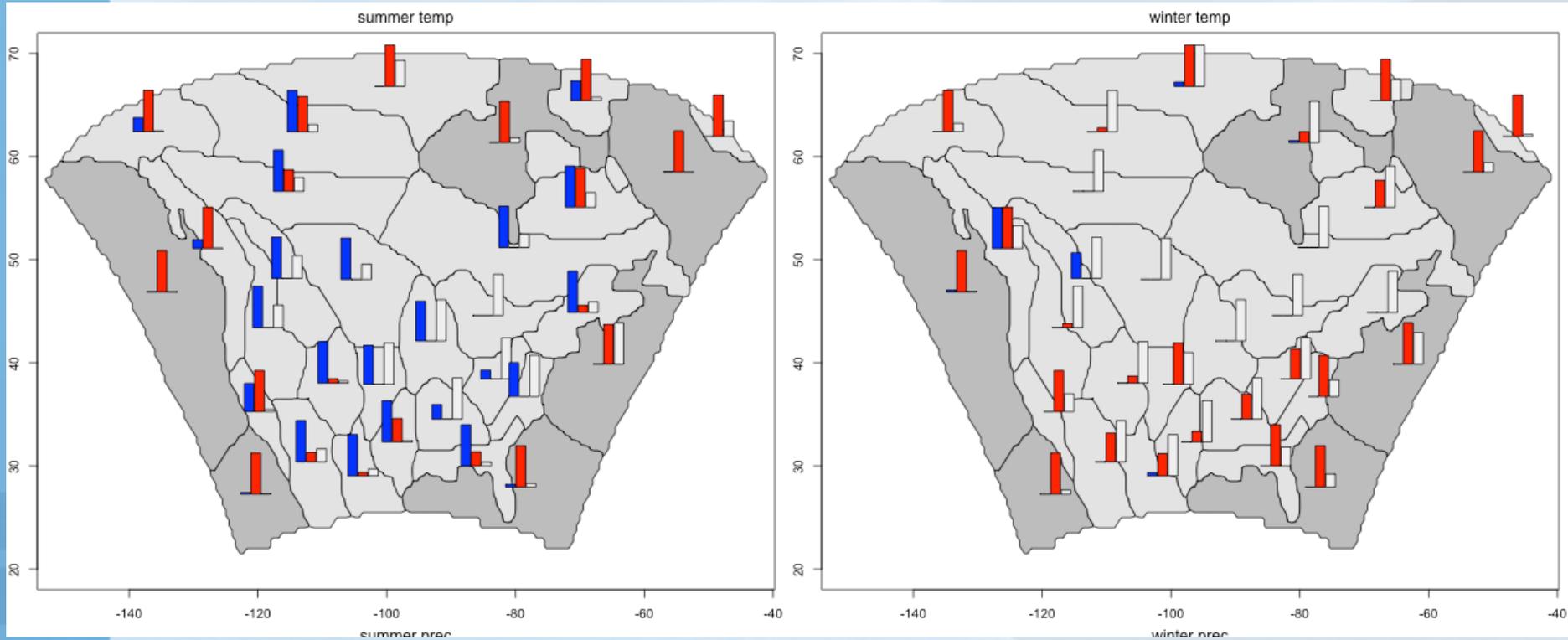
- Focuses on three sources of variation
 - AOGCMs
 - RCMs
 - Error or residual term
- Postulates that total variation in RCM output can be decomposed into these three terms
- Performed seasonally for temperature and precipitation (over sub-regions)

NARCCAP ANOVA Results Temperature



Summer

Winter



Red = contribution from GCMs
Blue = contribution from RCMs
White = remainder variance

S. Sain, NCAR
In Mearns et al., 2013

Climate Change Conclusions

- The RCMs tend to intensify patterns of change in precipitation (i.e., greater decreases in summer; greater increases in winter) compared to GCMs
- RCMs dominate overall variance in summer (for temperature and precipitation) and GCMs are dominant in winter
- But more process level studies will be necessary to determine if RCM changes are more credible than those of GCMs

RCM-GCM Matrix from Prudence



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	CNRM	DMI	ETHZ	GKSS	HC	ICTP	KNMI	MPI	SMHI	UCM
A2+HadAM3H		3	1	1	3	1	1	1	1	1
A2+ECHAM4		1							1	
A2+ARPEGE3	1									
B2+HadAM3H					1	1			1	1
B2+ECHAM4		1							1	
B2+ARPEGE3	3									

RCM-GCM Matrix from ENSEMBLES



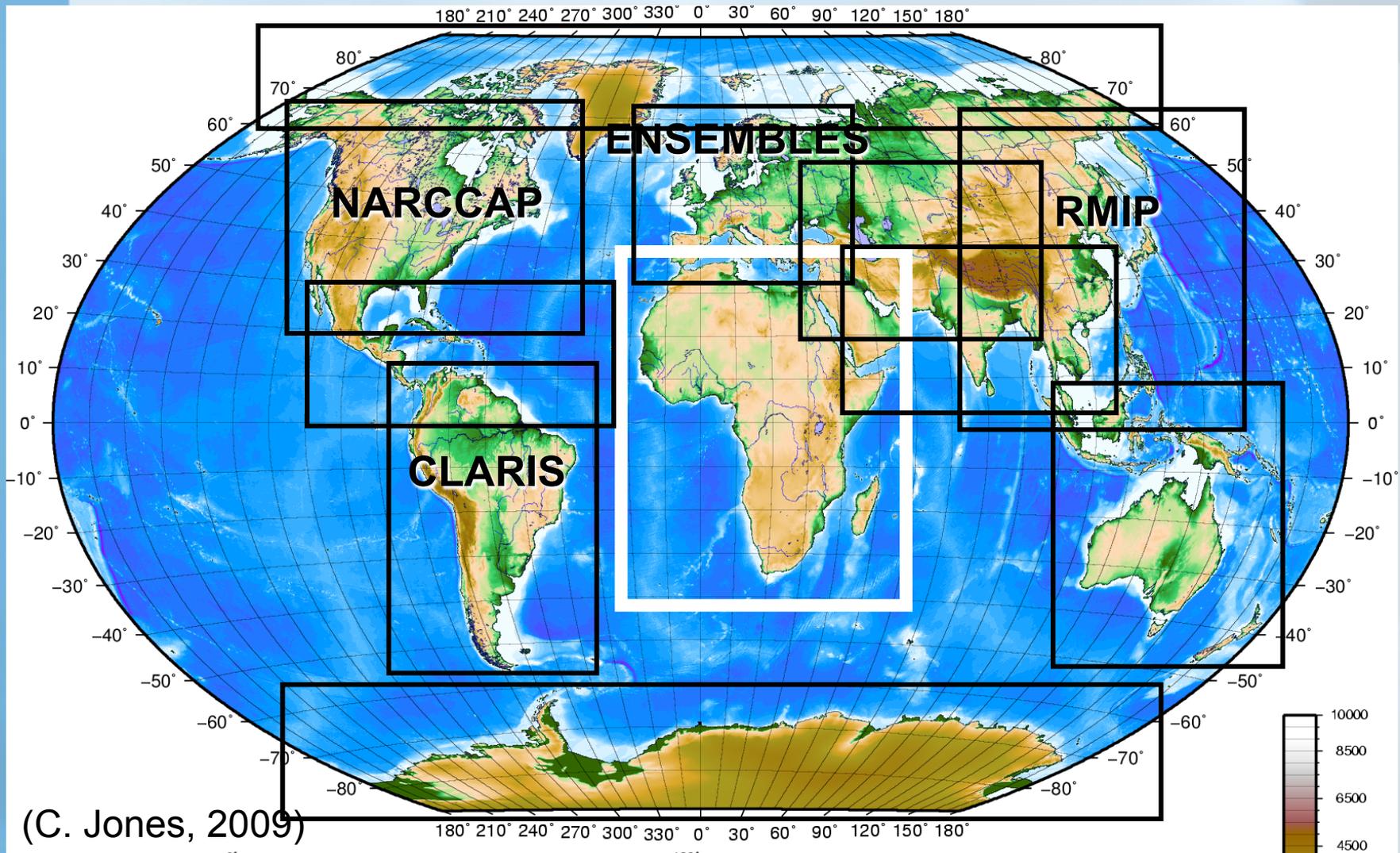
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Table 1 The RCM \times GCM matrix; label X indicates that the corresponding RCM \times GCM pair was available in ENSEMBLES at the time of the study

	BCM	CNRM	HC-lo	HC-med	HC-hi	MPI
C4I					X	
CNRM		X				
DMI	X	X				X
ETHZ				X		
HC-lo			X			
HC-med				X		
HC-hi					X	
ICTP						X
KNMI						X
METN	X			X		
MPI						X
SMHI	X		X			X
UCLM				X		

Déqué et al.,
2011
ENSEMBLES

Coordinated Regional Downscaling Experiment (CORDEX) ~ Regions ~



General Aims and Plans for CORDEX



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Provide a set of regional climate scenarios covering the period 1950-2100, for the majority of the populated land-regions of the globe.

Make these data sets readily available and useable to the impact and adaptation communities.

Provide a generalized framework for testing and applying regional climate models and downscaling techniques for both the recent past and future scenarios.

Foster coordination between regional downscaling efforts around the world and encourage participation in the downscaling process of local scientists/organizations

Progress in Other Regions (Examples)

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1. Africa (10 RCMs)

- Initial focus
- Workshops promoting analyses by Africans

2. Euro-CORDEX (9 distinct RCM + variants)

- Runs at 0.44° , 0.22° and (in process) 0.11°

3. South America (7 RCMs)

- Built off CLARIS
- Publications submitted

4. CORDEX South Asia

- Workshop Feb 2012
- Workshop planned for Aug 2013

Progress in Other Regions (Examples)

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5. CORDEX Arctic (~ 5 RCMs)
 - Workshop March 2012
 - Mtg. @ WCRP CORDEX Brussels (Nov 2103)

6. Med-CORDEX (9 RCMs, 12 A-O RCMs)
 - Add to original regions
 - Built off funded program

7. East Asia (7 RCMs)
 - Built partly off APN RMIP program
 - Workshops: Sep 2011, Nov 2012, Brussels 2013

8. CORDEX-SEA [Oceania]
 - Tentative new region
 - Building from funded program



WCRP CORDEX: A Coordinated Regional Downscaling Experiment ~ North America Program ~

Executive Committee

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Linda Mearns – NCAR (Co-Chair)

David Behar – San Francisco Public Utilities Commission

Lawrence Buja – NCAR

Dennis Lettenmaier – Univ. WA

Ruby Leung – PNNL

Greg Garfin – Univ. AZ

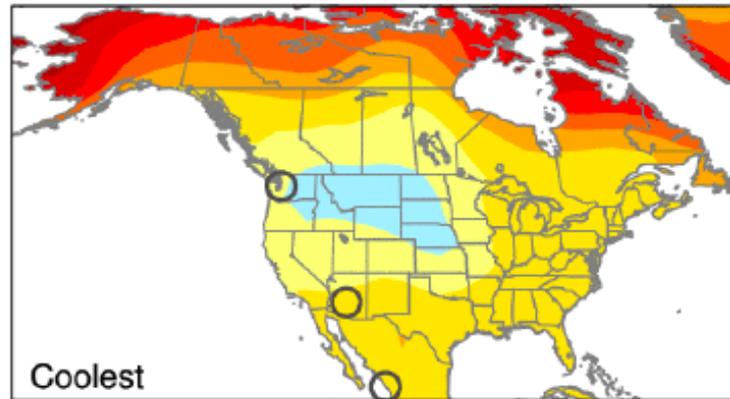
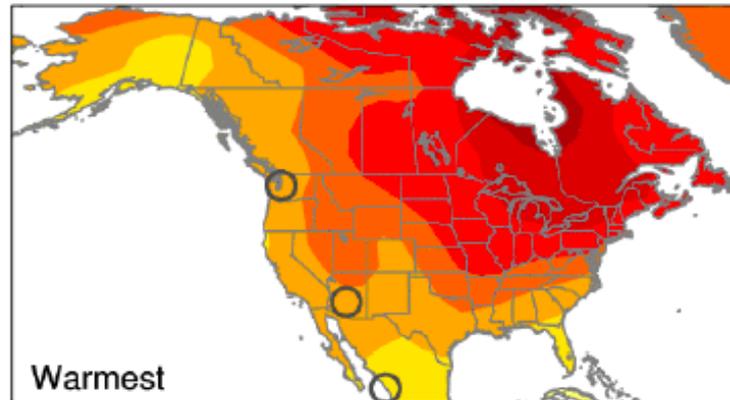
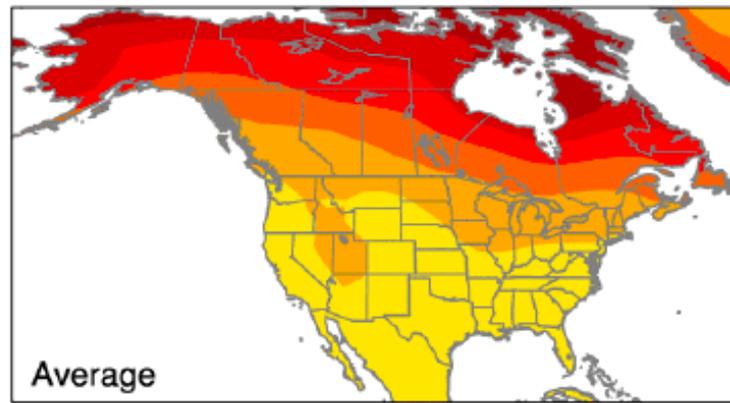
Details at: <http://wcrp-cordex.ipsl.jussieu.fr/>
(Search: "WCRP CORDEX climate")



Priorities of Uncertainties

- Sampling range of GCMs
- Sampling range of RCMs
 - And investigating multiple resolutions
- **Internal variability** (i.e., sampling multiple realizations of single GCM)
 - This element has been under-explored in GCMs and RCMs
- RCPs - lower priority – not important until after 2050 – much might be gleaned from pattern scaling from one RCP to another

DJF
Temperature
Trend
(Deg. C per
55 years –
(2005 - 2060)



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CCSM3
AIB Scenario

40-member
ensemble

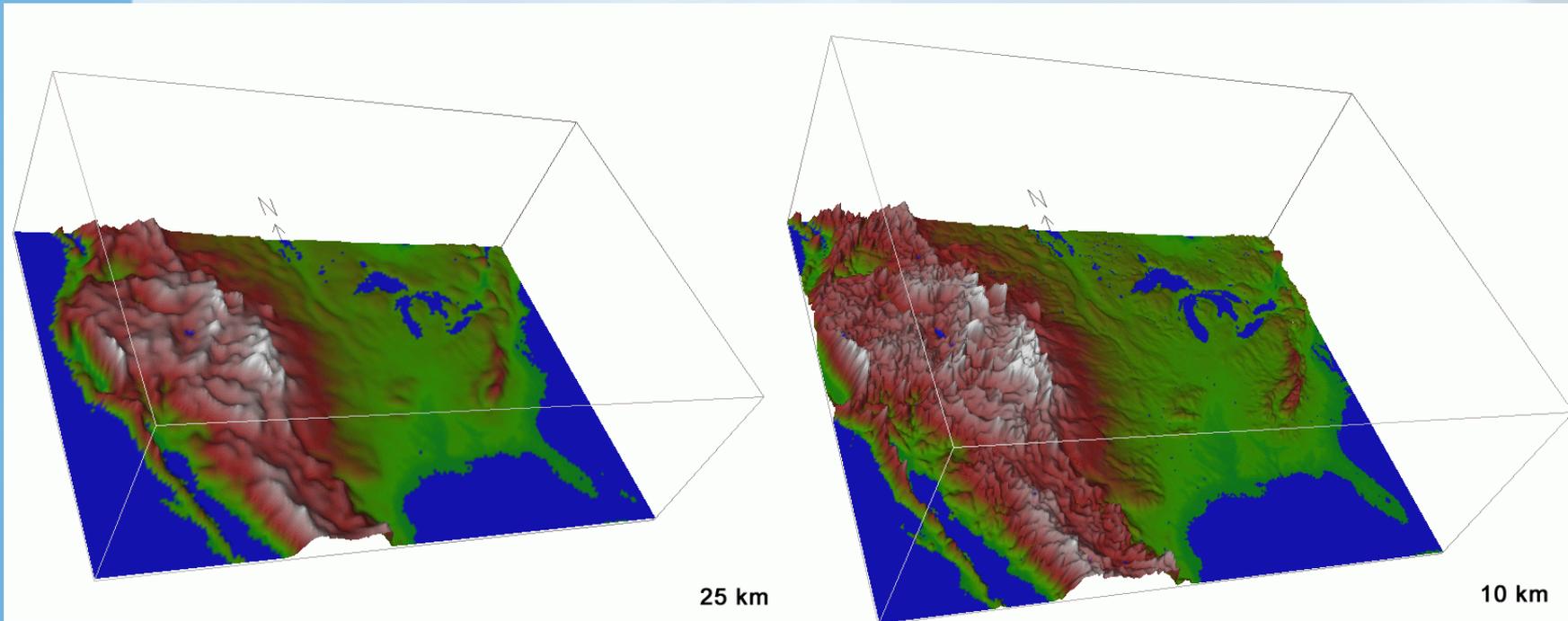
Deser et al., 2012
Nature Climate
Change



Some Basics

- 5 different RCMs
- 6 different GCMs
- 150 years 1950-2100 each simulation
- High representative concentration pathway (RCP 8.5) (future scenario)
- Two spatial resolutions 25 km and 12 km
- ERA-Interim runs (20 years) at 50, 25, 12 km
- In planning phase – proposal being written

Topography of the US at two Different Spatial Resolutions



Regional Climate Models

How much more meaningful information about future climate do we obtain at higher resolutions?

Value of Scenarios of Experimental Designs



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- Provides series of options based on different funding possibilities
- Clearly presents what can be explored (e.g., GCM, RCM, and interaction effects; or GCM, RCM, remainder term) and degree of error in calculations based on matrix density

Scenarios of Experiments



- Common to all: ERA-Interim driven runs – at 3 resolutions: 50, 25, 12 km for all RCMs (total of 300 years).
- Assume a fairly even sampling of GCMs and RCMs (based on Mearns et al. 2013 results)
- Then three possible experimental designs based primarily on different sampling schemes for 25 and 12 km simulations
- All will include similar sampling of internal variability

Scenario I



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5 RCMS, 6 GCMs, full matrix at 25 km = 30 simulations, 150 years each; half matrix (15 simulations at 12 km). IV – from two GCMs, 3 additional realizations, each RCM at 25 km

50 km	RCM1	RCM2	RCM3	RCM4	RCM5
ERA-I	1	1	1	1	1

25 km	RCM1	RCM2	RCM3	RCM4	RCM5
ERA-I	1	1	1	1	1
GCM1*	4	4	4	4	4
GCM2*	4	4	4	4	4
GCM3	1	1	1	1	1
GCM4	1	1	1	1	1
GCM5	1	1	1	1	1
GCM6	1	1	1	1	1



Scenario 1 (cont'd)

12 km	RCM1	RCM2	RCM3	RCM4	RCM5
ERA-I	1	1	1	1	1
GCM1*	1	1			1
GCM2*	1	1			
GCM3	1		1		1
GCM4		1		1	
GCM5			1	1	1
GCM6			1	1	

Total years: 9,000 at 25 km; 2,250 at 12. Half of years at 25 km are the IV runs.

Scenario II



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25 km	RCM1	RCM2	RCM3	RCM4	RCM5
ERA-I	1	1	1	1	1
GCM1*	4		4		4
GCM2*		4		4	
GCM3	1	1			
GCM4	1	1			1
GCM5			1	1	1
GCM6			1	1	

Half
fraction

12 km	RCM1	RCM2	RCM3	RCM4	RCM5
ERA-I	1	1	1	1	1
GCM1*	1		1		1
GCM2*		1		1	
GCM3	1	1			
GCM4	1	1			1
GCM5			1	1	1
GCM6			1	1	

Half
fraction

Total years:
4,500 at 25
2,250 at 12



Scenario IIIa

25 km half fraction as in Scenario II and 1/3 fraction (10 simulations) at 12 km

3a: 2/3 fraction

12 km	RCM1	RCM2	RCM3	RCM4	RCM5
ERA-I	1	1	1	1	1
GCM1*	1		1		1
GCM2*		1		1	
GCM3	1				
GCM4		1			1
GCM5			1		
GCM6				1	

Years:
4,500 at 25
1,500 at 12

Activities



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- NA-CORDEX Meetings Feb. 19, 2013 and June 21, 2013 at NCAR – to further develop integrated plans/proposal to send to agencies, non-profits, etc.
- Survey of potential users – to determine more detailed user needs
- Coordination with groups already producing simulations
- Discussion with agency program managers on level of interest

THE END



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