Reto Knutti Institute for Atmospheric and Climate Science ETH Zurich, Switzerland reto.knutti@env.ethz.ch

Yes



Yes No Stupid question

- What is the purpose, and is the model adequate for that purpose?
- What means "best" anyway?
- What is the evidence that a model is doing the right thing?
- Why are predictions uncertain?
- How well can we quantify uncertainty?
- How do we combine evidence from different models and observations?
- Why is it so hard, and are we making progress?

How do we measure model performance?



Performance metric Measure of agreement between model and observation

Model quality metric

Measure designed to infer the skill of a model for a specific purpose

My model is better

than your model



Confidence in climate models What is the evidence?

$\frac{\partial \rho}{\partial t} + \frac{\partial (\theta)}{\partial t}$	$\frac{(\rho u)}{\partial x} + \frac{\partial(\rho)}{\partial x}$	$\frac{\partial v}{\partial y} + \frac{\partial (\rho v)}{\partial z}$	$\frac{v}{v} = 0$
$\frac{\partial(\rho u)}{\partial t} +$	$\frac{\partial(\rho u^2)}{\partial x}$ +	$+\frac{\partial(\rho uv)}{\partial y}+$	$\frac{\partial(\rho uw)}{\partial z}$
$\frac{\partial(\rho v)}{\partial t}$	$+\frac{\partial(\rho uv)}{\partial x}$	$+\frac{\partial(\rho v^2)}{\partial y}+$	$+\frac{\partial(\rho vw)}{\partial z}$
$\frac{\partial(\rho_w)}{\partial t} +$	$\frac{\partial(\rho uw)}{\partial x}$	$+\frac{\partial(\rho vw)}{\partial y}$	$+\frac{\partial(\rho w^2}{\partial z}$







Physical principles

Reproduce climate

Reproduce trends

Processes



Weather



Past climate



Robustness

Distance to observations (tas/pr) Is CESM the best model?



Masson and Knutti, GRL 2011, Knutti, Masson and Gettelman, in preparation

Distance to observations (tas/pr) Is CESM the best model?



Climate model genealogy

Models are not independent

Dissimilarity for surface temperature and precipitation BCCR-BCM2.0 CNRM-CM3 *CNRM-CM5 INGV-SXG GFDL-CM2.0 GFDL-CM2.1 *GFDL-ESM2M *GFDL-ESM2G *GFDL-CM3 ECHAM5/MPI-OM *MPI-ESM-LR *MPI-ESM-P *MPI-ESM-MR *CMCC-CM CSIRO-Mk3.0 CSIRO-Mk3.5 UKMO-HadCM3 UKMO-HadGEM1 *HadGEM2-CC *HadGEM2-ES *ACCESS1.0 *ACCESS1.3 CCSM3 *CCSM4 *CESM1(FASTCHEM) *CESM1(CAM5) *CESM1(WACCM) *NorESM1-M *NorESM1-ME *BCC-CSM1.1 *FGOALS-g2 *FGOALS-s2 MRI-CGCM2.3.2 *ECHO-G *IPSL-CM5B-LR *MRI-CGCM3 IPSL-CM4 *IPSL-CM5A-LR "IPSL-CM5A-MR *CSIRO-Mk3.6.0 INM-CM3.0 PCM *GISS-E2-H *GISS-E2-R *INM-CM4 GISS-EH FGOALS-g1.0 GISS-AOM GISS-ER

Climate model genealogy Models are not independent







CSIRO-Mk3.0 CSIRO-Mk3.5 *CanESM2 UKMO-HadCM3 UKMO-HadGEM1 *HadGEM2-CC *HadGEM2-ES *ACCESS1.0 *ACCESS1.3 CCSM3 *CCSM4 *CESM1(FASTCHEM) *CESM1(CAM5) *CESM1(WACCM) *NorESM1-M *NorESM1-ME



Climate model genealogy Models are not independent



Climate model genealogy

Distance from CESM1(CAM5)

Surface temperature distance from CESM1(CAM5)



Climate model genealogy Distance from CESM1(CAM5)

Precipitation distance from CESM1(CAM5)



CCSM4 to CESM1(CAM5)

Tracing model development



CCSM4 to CESM1(CAM5)

Tracing model development



Conclusions

Metrics and model quality

- An infinite number of metrics can be defined.
- Many metrics are dependent.
- Observation datasets and uncertainty matters.
- The concept of a "best model" is ill-defined.
- There may be a best model for a particular purpose, where "best" measured in a specific way. But determining that is hard.





Conclusions

Where CESM certainly stands out

- Free availability
- Documentation
- Portability
- Support
- Community involvement
- Tutorials

Relating model performance to projections



Knutti, Phil Trans Roy Soc 2008

How do we relate

model performance to projections?

We don't.



IPCC AR4, Fig. SPM7

Present day temperature and warming do not correlate across models



Some observable climate indices do correlate with future warming



Huber et al., J. Climate 2011

Some observable climate indices do correlate with future warming



Some relationships

are not stable in different ensembles



Summer to winter interannual variability

Masson and Knutti, J. Climate, submitted

Some relationships

are not stable in different ensembles



Summer to winter interannual variability

Masson and Knutti, J. Climate, submitted

Model spread in an ensemble of opportunity not always useful as a measure of uncertainty



MULTI-MODEL AVERAGES AND ASSESSED RANGES FOR SURFACE WARMING

IPCC 2007

Assumptions in the weighting matter for the result



Tebaldi and Knutti, Phil Trans Roy Soc, 2007

Arctic sea ice decline Faster than forecast?

Arctic sea ice

decreases in all models, but less than observed



Stroeve et al., GRL 2007, Mahlstein and Knutti, 2012, JGR

Arctic sea ice

is approximately linearly related to temperature



Arctic sea ice A calibrated prediction



Mahlstein and Knutti, 2012, JGR

How is the weather tomorrow? **Combining lines of evidence**











Next steps Where are we going?

Are we making progress?

The end of model democracy?

- "There should be no minimum performance criteria for entry into the CMIP multi-model database."
- "Researchers may select a subset of models for a particular analysis but should document the reasons why."
- "IPCC assessments should consider the large amount of scientific work on CMIP3, in particular in cases where lack of time prevents an in depth analysis of CMIP5."

Boulder, Colorado, USA 25-27 January 2010 Good Practice Guidance Paper on Assessing and Combining Multi Model Climate Projections Core Writing Tean: Meto Knutti (Switzerland), Gabriel Abramowitz (Australia), Matthew Collins (United Kingdom), Peter J. Gleckler (USA), Bruce Hewitson (South Africa), Linda Mearns (USA)

www.ipcc.unibe.ch

Are we making progress? Projections are robust, uncertainties remain



Old

New

Are we making progress? June-August precipitation projections



Limits of predictability Warmest and coolest of 40 realizations

DJF Temperature Trend 2005-2060 **DJF** Temperature Mazatlán, Mexico 2 0 -2 Phoenix, Arizona 2 Average 0 -2 Seattle, Washington 2 n 2 Warmest United States 2 0 -2 2 Globe 0 Mmmm Coolest -2 1910 1930 1950 1970 1990 2010 2030 2050 -6-5-4-3-2-10 1 2 3 4 5 6

Limits of predictability Wettest and driest of 40 realizations



Deser, Knutti, Solomon and Phillips in press

Are we making progress? Yes and no. And why it is hard.

- Open system, complex, non-linear
- Interaction from seconds to millennia, from micrometers to thousands of kilometers
- Dimensionality
- Natural variability
- Limited and uncertain observations
- Model discrepancy
- Expensive models, petabytes of data
- Calibration problem in a high-dimensional space
- Out of sample prediction, no proper verification

Establishing confidence in a prediction Why do you believe the weather forecast?

BRECKENRIDGE CO							
	Fair 61°F 16°C		Humidity 7% Wind Speed SW 17 G 21 mph Barometer 30.40 in Dewpoint -2°F (-19°C) Visibility 10.00 mi				
10 7			Last Update on	18 Jun 10:12 am MDT			
TODAY	TONIGHT	TUESDAY	TUESDAY	WEDNESDAY			
ĪĒ				*			
Breezy	Breezy	Breezy	Breezy	Sunny			
High: 74 °F	Low: 45 °F	High: 70 °F	Low: 41 °F	High: 71 °F			

Tuesday: Sunny, with a high near 70. Breezy, with a west southwest wind 9 to 18 mph, with gusts as high as 29 mph

Establishing confidence in a prediction Lack of verification



Establishing confidence in a prediction Lack of verification







Conclusions

and challenges

Climate models have reached a remarkable level of maturity, but:

- Model sampling is neither systematic nor random.
- We use a collection of 'best guesses' not designed to span any uncertainty range, and not independent.
- Models are getting "better" at things we observe, but model spread is not reduced for projections.
- Model performance varies but we don't know how to translate into weights. But we discard old models.
- Combining model may help but can create unphysical results.
- No independent verification of the prediction.
- There is no best model without defining a purpose.