

Centre for Climate Change Economics and Policy

**The Munich Re Programme:** *Evaluating the Economics of Climate Risks and Opportunities in the Insurance Sector* 



# Can We Expect to Predict Climate If We Cannot Shadow Weather?

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#### Can we expect to predict climate if we cannot shadow weather?

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What limits our ability to predict (or project) useful statistics of future climate? And how might we quantify those limits? In the early 1960s, Ed Lorenz illustrated one constraint on point forecasts of the weather (chaos) while noting another (model imperfections). In the mid-sixties he went on to discuss climate prediction, noting that chaos, per se, need not limit accurate forecasts of averages and the distributions that define climate. In short, chaos might place draconian limits on what we can say about a particular summer day in 2010 (or 2040), but it need not limit our ability to make accurate and informative statements about the weather over this summer as a whole, or climate distributions of the 2040's. If not chaos, what limits our ability to produce decision relevant probability distribution functions (PDFs)? Is this just a question of technology (raw computer power) and uncertain boundary conditions (emission scenarios)?

Arguably, current model simulations of the Earth's climate are limited by model inadequacy: not that the initial or boundary conditions are unknown but that state-of-the-art models would not yield decision-relevant probability distributions even if they were known. Or to place this statement in an empirically falsifiable format: that in 2100 when the boundary conditions are known and computer power is (hopefully) sufficient to allow exhaustive exploration of today's state-of-the-art models: we will find today's models do not admit a trajectory consistent with our knowledge of the state of the earth in 2009 which would prove of decision support relevance for, say, 25 km, hourly resolution. In short: today's models cannot shadow the weather of this century even after the fact. Restating this conjecture in a more positive frame: a 2100 historian of science will be able to determine the highest space and time scales on which 2009 models could have (i) produced trajectories plausibly consistent with the (by then) observed twenty-first century and (ii) produced probability distributions useful as such for decision support.

As it will be some time until such conjectures can be refuted, how might we best advise decision makers of the detail (specifically, space and time resolution of a quantity of interest as a function of lead-time) that it is rational to interpret model-based PDFs as decision-relevant probability distributions? Given the nonlinearities already incorporated in our models, how far into the future can one expect a simulation to get the temperature "right" given the simulation has precipitation badly "wrong"? When can biases in local temperature which melt model-ice no longer be dismissed, and neglected by presenting model-anomalies? At what lead times will feedbacks due to model inadequacies cause the 2007 model simulations to drift away from what today's basic science (and 2100 computer power) would suggest? How might one justify quantitative claims regarding "extreme events" (or NUMB weather)?

Models are unlikely to forecast things they cannot shadow, or at least track. There is no constraint on rational scientists to take model distributions as their subjective probabilities, unless they believe the model is empirically adequate. How then are we to use today's simulations to inform today's decisions? Two approaches are considered. The first augments the model-based PDF with an explicit subjective-probability of a "Big Surprise". The second is to look not for a PDF but, following Solvency II, consider the risk from any event that cannot be ruled out at, say, the one in 200 level. The fact that neither approach provides the simplicity and apparent confidence of interpreting model-based PDFs as if they were objective probabilities does not contradict the claim that either might lead to better decision-making.



http://www.lse.ac.uk/collections/cats/publications.htm

## **Expensive Decisions now consider Climate Change**





EG-373 Rlattorm Enchillada Snapper Platform GB 189,A Plätform

Nansen Spar Facility Gunnison Spar Platform Magnolia TL

Boomvang

NATIONAL WEATHER SERVICE/NATIONAL HURRICANE CENTER TROPICAL STORM AND HURRICANE FORCE WIND SWATHS OF IKE FROM ADVISORIES 1 THROUGH 53 Overselling today's models can mut tomorrow's science.

#### Wednesday, September 17, 2008 Offshore Rig Damage Caused by Hurricane Ike (Updated)

As companies evaluate their offshore assets and begin to report on their findings, it is quickly becoming apparent that lke has dealt a harsh blow the Gulf of Mexico rig fleet. Thus far, 3 jackups and 1 platform rig have apparently been lost. In addition, another jackup has lost if drilling package and derrick, and two others suffered damages while in the shipyard. Four moored semisubmersibles sustained damage to their mooring systems and submersible rig was pushed off of its prestorm location.

Rig Name	Manager	Rig Type	Built	Cost	Day gerlander
ENSCO 74	ENSCO	375' ILC jackup	1925	\$84 million	Rig missing - probable total loss
Pride Wyoming	Pride	250' MS jackup	1976	\$26 million	Rig missing - probable total loss
Rowan Anchorage	Rowan	250' ILS jackup	1572	\$9 million	Rig missing - probable total loss
Ocean Tower	Diamond	350' ILC jackup	1972	\$10 million	Section of the sectio
<u>Mad Dog</u>	Pride / BP	Platform Rig	2004	n/a	Derrick collapsed & sunk
<u>Transocean Marianas</u>	Transocean	7,000' Semisub	1998	\$224 million	Mooring system damaged, rig moved
Noble Amos Runner	Noble	8,000' Semisub	1999	\$152 million	Broke moorings & set adrift
<u>Noble Paul Romano</u>	Noble	6,000' Semisub	1998	\$118 million	Broke moorings & set adrift
Noble Lorris Bouzigard	Noble	4,000' Semisub	1975	\$31 million	Mooring system damaged, maintained station
Hercules 78	Hercules	85' Submersible	1983	\$34 million	Moved 600' during storm
<u>Rowan Mississippi</u>	Rowan	400' ILC jackup	2008	\$165 million	Struck by vessel in shipyard, not expected to delay delivery
Blake 208	Blake Offshore	250' MC jackup	1977	n/a	damaged in shipyard, may delay avail.

d. For an overview of the locations of rigs affected by Hurricane Ike, take a look at our Offshore Damage Map.

## Climate<sub>1959</sub> was not an average!

climate—"The synthesis of the weather" (C. S. Durst); the long-term manifestations of weather, however they may be expressed. More rigorously, the climate of a specified area is represented by the statistical collective of its weather conditions during a specified interval of time (usually several decades).

#### GLOSSARY OF METEOROLOGY

Edited by RALPH E. HUSCHKE

Sponsored by U. S. Department of Commerce Weather Bureau

U. S. Air Force Air Weather Service, MATS and Geophysics Research Directorate AFCRC, ARDC

U. S. Army Signal Corps

U. S. Navy Office of Naval Research



AMERICAN METEOROLOGICAL SOCIETY Boston, Massachusetts 1959



Climate Change Economics and Policy

### The critical question is whether or not model-PDFs are fit for purpose: are they decision support relevant?

PDFs of averages per se are not.

How might we decide if high resolution model-PDFs might be?

Reproducing the "statistical collective of weather conditions" would be sufficient.

That implies Φ-shadowing

### On what space and times scales is real weather statistically indistinguishable from model output? Decision-support indistinguishable?

LA Smith (2000) <u>'Disentangling Uncertainty and Error: On the Predictability of Nonlinear</u> <u>Systems'</u> in *Nonlinear Dynamics and Statistics*, ed. Alistair I. Mees, Boston: Birkhauser, 31.

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## Scientific Uncertainty in GMT >> model range

Summary for Policymakers



MULTI-MODEL AVERAGES AND ASSESSED RANGES FOR SURFACE WARMING

Figure SPM.5. Solid lines are multi-model global averages of surface warming (relative to 1980–1999) for the scenarios A2, A1B and B1, shown as continuations of the 20th century simulations. Shading denotes the  $\pm 1$  standard deviation range of individual model annual averages. The orange line is for the experiment where concentrations were held constant at year 2000 values. The grey bars at right indicate the best estimate (solid line within each bar) and the likely range assessed for the six SRES marker scenarios. The assessment of the best estimate and likely ranges in the grey bars includes the AOGCMs in the left part of the figure, as well as results from a hierarchy of independent models and observational constraints. {Figures 10.4 and 10.29}



#### **IPPC** holds model range too narrow even in GMT!

### How big are systematic errors in global temp for the IPCC AR4 models?

# **IPCC AR4:**

FAQ 8.1, Figure 1. Global mean near-surface temperatures over the 20th century from observations (black) and as obtained from 58 simulations produced by 14 different climate models driven by both natural and human-caused factors









# Models are tools, not Miracles

#### "Best available" does not imply "fit for purpose"

Including a process does not mean it is realistically simulated.

### The plural of "simulation" is not "information."

Model diversity can not be translated into decision-relevant probability...

... the new spurious accuracy.

# The significant value of Geophysical models may be ignored if oversold.

But how do we communicate uncertainty? And deep uncertainty?



2min x 2min obs – HadCM3

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## Model Relevance in Quantitative Decision Support



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#### **Missing mountain ridges:** And long term feedbacks

(bio-feed backs, albedo, ...)

At what lead times do inadequacies in downstream flow (or precipitation) result in feedbacks with beyond local impacts?



One-way coupled regional models **cannot** account for missing physics or inactive feedbacks.





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### AR4 models given SSTs miss things as small as: The 1930's Dust bowl

# Would Advance Knowledge of 1930s SSTs Have Allowed Prediction of the Dust Bowl Drought?\*

Richard Seager, Yochanan Kushnir, Mingfang Ting, Mark Cane, Naomi Naik, and Jennifer Miller

Lamont-Doherty Earth Observatory, Columbia University, Palisades, New York

# This hypothetical drought prediction would have been of limited success because of differences in the modeled and observed patterns

Decision makers should expect "Big Surprises" when using model-PDFs to anticipate future events similar to those our models do **not** capture well in the past.

If we misplace a decade long drought, can we claim P(Big Surprise) is small for the 2080's hottest day of the year in OX1 1DW?

# When might Model-based PDFs be of value?

Arguably, we they must be:

Robust, Representative and Relevant

### (My goal here is similar to R. Cox's "Stable probabily" (AJP, 1946))

Because of the various simplifications of the model described above, it is not advisable to take too seriously the quantitative aspect of the results obtained in this study. Nevertheless, it is hoped that this study not only emphasizes some of the important mechanisms which control the response of the climate to the change of carbon dioxide.

> The Effects of Doubling the  $CO_2$  Concentration on the Climate of a General Circulation Model<sup>1</sup>

> > SYUKURO MANABE AND RICHARD T. WETHERALD

Geophysical Fluid Dynamics Laboratory/NOAA, Princeton University, Princeton, N.J. 08540 (Manuscript received 6 June 1974, in revised form 8 August 1974)



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# Robust, Representative and Relevant

Robust: not fragile, meteo PDFs are not expected to change substantially (a) as models undergo incremental development or (b) under slight changes in the analysis or (c) given the evidence suppressed. "Cox-Stable" Where E = (EC U ES) Representative: each meteo driver known to play a significant role in the question of interest is thought to be adequately represented (realistically

simulated) to the extent that **each** simulation is fit to inform this question.

**Relevant**: in a form that users can use/exploit for the decision of interest using tools they like, spatial and temporal resolution and so on.

#### This is an ordered list:

First relax **relevant**, as other useful questions might be answered. Impact PDFs are only decision-relevant if **robust** and **representative**.

Next relax **representative**: a set of simpler questions might still be addressed, given only a subset of the meteo drivers, as long as PDFs of those meteo phenomena were **robust**.

Without **Robust**, arguably the model-PDF is not a subjective PDF for the phenomena at all. (Recall Manabe and Wetherall, 1975) (doesn't someone have to believe it for it a Bayesian to count it as a PDF?)



### What is the chance of falling above the 90% line of model-PDFs?



A climate scientist can easily know that the probability of the real world falling above the 90% line of the UKCP PDF can be much **much** greater than 10%. Say > 50%

Traders in CAT bonds are already considering how this "information arbitrage" might be an opportunity...

It is irrational to base decisions on a model-based PDF when known model inadequacy dominates the model-PDF ("blocking")!

(Or for the Bayesians in the room: my subjective PDF is not constrained by any model-PDF when I know (aka believe) that the model is likely to be mis-informative!)

**Diversity of My Models need not reflect Uncertainty in My Future** 

If I want a decision-relevant PDF I have to return to the Science

Sit and think <-----> Simylaxe and Coynt





You are here - <u>Welcome to LSE</u> > <u>CATS</u> > Publications

## Publications <u>http://www.lse.ac.uk/collections/cats/publications.htm</u>

#### Papers

R Hagedorn and LA Smith (2009) <u>Communicating the value of probabilistic forecasts with weather roulette</u>. *Meteorological Applications1*6 (2): 143-155. <u>Abstract</u>

K Judd, CA Reynolds, LA Smith & TE Rosmond (2008) <u>The Geometry of Model Error (DRAFT</u>). *Journal of Atmospheric Sciences* 65 (6), 1749--1772. <u>Abstract</u>

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A Weisheimer, LA Smith & K Judd (2004) <u>A New View of Forecast Skill: Bounding Boxes from the DEMETER Ensemble Seasonal Forecasts</u>, *Tellus* **57** (3): 265-279 MAY. <u>Abstract</u>

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I Gilmour, LA Smith & R Buizza (2001) <u>Linear Regime Duration: Is 24 Hours a Long Time in Synoptic Weather Forecasting?</u> J. Atmos. Sci. 58 (22): 3525-3539. <u>Abstract</u>

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LA Smith (2000) <u>'Disentangling Uncertainty and Error: On the Predictability of Nonlinear Systems</u>' in *Nonlinear Dynamics and Statistics*, ed. Alistair I. Mees, Boston: Birkhauser, 31-64. <u>Abstract</u>

## **Background Reading:**



 LA Smith(2002) What might we learn from climate forecasts? P. Nat. Acad. Sci (99)
LA Smith (2003) Predictability Past Predictability Present. Predictability and Weather Forecasting (ed. Tim Palmer, CUP).

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http://www.lse.ac.uk/collections/cats/publications.htm



CHAOS



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WROWING DEGUTCETONE SEE MEONS

sorry for any inconvenience



When in doubt, distrusting the indications, or inferences from them (duly considered on purely scientific principles, and checked by experience), the words "Uncertain," or "Doubtful," may be used, without hesitation. Fitzroy, 1862

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#### Sciences knows more than we can Model



If important, this leads to nonlocal effects. (and the effective creation of water!)







Before we start using phrases like "Laws of Physics" in public, can we:

A) check for internal consistency

**B)** Find necessary (not sufficient) conditions for this model to contain decision relevant information?

Not "how to downscale?" but "whether to downscale?".



### A Schematic of a Test For Quantitative Decision Relevance

- Specify the Decision Question in terms of local environmental phenomena that impact it. ("hot dry periods")
- Determine the larger scale "meteorological" phenomena that impact the local. ("blocking")
- Identify all relevant drivers (which are known).

("mountains")

# Pose necessary (*NEVER SUFFICIENT*) conditions for model output to quantitatively inform prior subjective science-based reflection:

Are local phenomena of today realistically simulated in the model?

(If not: Are relevant larger scale (to allow "prefect prog")).

- □ Are all drivers represented? (to allow "laws-of-physics" "extrapolation")
- □ Are these conditions likely to hold given the end-of-run model-climate?

If one cannot clear these hurdles, the scientific value of the results does not make them of value to decision makers. They can be a detriment.

And claiming they are the "Best Available Information" is both false and misleading.

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**Wheeler and Weekeen** 

Sit and think will trump Simulate and Count

## So what about UKCP probabilities? What is the chance of falling above the 90% line of UKCP PDFs?



The shortcoming of climate models are more clearly acknowledged in the peer reviewed literature than in the UKCP user guidance.

It is important to stress that our approach to the specification of discrepancy can only be <u>expected to capture a subset of possible structural modelling errors</u> and should be regarded as <u>a lower bound</u>. This is because models tend to share certain common systematic biases, which can be found in diverse elements of climate including multiannual means of basic quantities such as surface temperature,

> A methodology for probabilistic predictions of regional climate change from perturbed physics ensembles

Phil. Trans. R. Soc. A 2007 **365**, 1993-2028 Joi: 10.1098/rsta.2007.2077

PHILOSOPHICAL TRANSACTIONS OF

## Plausible Planets or Implausible Earths?

The kitchen sink approach "includes" everything we can think of that might be important. At best, this yields an implausible Earth, and parameter variation samples an empirically vacuous space of unphysical, unbiological, uninteresting & irrelevant model diversity. (Unless the model is empirically adequate!)

One alternative is to build plausible planets, while omitting any Earth-relevant process for which the model cannot provide coherent physical drivers on Earth-like scales. (no suggestion of linear superposition intended!)

Does water vapour come after mountains? Does vegetation come after water vapour? Do we avoid the penguin effect? (until it is simulated realistically)









When in doubt, distrusting the indications, or inferences from them (duly considered on purely scientific principles, and checked by experience), the words "Uncertain," or "Doubtful," may be used, without hesitation.

Objection has been taken to such forecasts, because they cannot be always exactly correct,—for all places in one district. It is, however, considered by most persons that general, comprehensive expressions, in aid of local observers, who can form independent judgments from the tables and *their own instruments*, respecting their immediate vicinity, *though not so well for distant places*, may be very useful, as well as interesting : while to an unprovided or otherwise uninformed person, an idea of the kind of weather thought *probable* cannot be otherwise than acceptable, provided that he is in no way *bound* to act in accordance with any such views, against his own judgment.

Certain it is, that although our conclusions may be incorrect—our judgment erroneous—the laws of nature, and the signs afforded to man, are invariably true. <u>Accurate interpretation is the real deficiency</u>.

**Fitzroy, 1862** 

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#### Reference: Probability level

#### Probability level

Describes the strength of evidence associated with a given value within a **probabilistic climate projection**. Probabilistic climate projections fall under subjective probability as the probabilities are a measure of the degree to which a particular level of future climate change is consistent with the evidence considered. In the case of UKCP09, the evidence comes from observations and outputs from a number of climate models, all with their associated uncertainties.

#### In detail

One of the main advances associated with UKCP09 is that it provides probabilistic climate projections. This means that different future climate outcomes described by a probabilistic projection have different strengths of evidence associated with them. As such, probability levels associated with a given change should be interpreted as indicating the relative likelihood of the projected change being at or less than the given change.

For example, if a projected temperature change of +4.5°C is associated with the 90% at a particular location in the 2080s for the UKCP09 medium emission scenario, this should be interpreted as it is projected that there is a 90% likelihood that temperatures at that location will be up to and including 4.5°C warmer than temperatures in the 1961–90 baseline period. Conversely, there is a 10% likelihood that those temperatures will be at or greater than 4.5°C warmer than the baseline period.

Probability level is associated with a cumulative probability. Another way of describing the probabilities in UKCP09 is to use a Probability Density Function.

#### Find out more

#### A report of Working Group I of the **Intergovernmental Panel on Climate Change**

### **Summary for Policymakers**





Figure SPM.6. P and right panels averaged over the probabilities of es studies for the sa Therefore the diff {Figures 10.8 and

One would be exposed to significant losses/costs if distributions which are not decision-support relevant probabilities are interpreted as if they were.

The IPCC itself might say this a bit louder/earlier:

Of course, they do not face users breaking ground on powerplant in 6 years, which have been badly designed by overinterpreting UKCP PDFs...