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Docket Number:	17-IEPR-09
<b>Project Title:</b>	Climate Adaptation and Resiliency
TN #:	220894
Document Title:	Addressing Deep Uncertainty in Climate Change Impacts and Adaptation Analysis for the Energy System
Description:	8.29.2017: Presentation by Alan H. Sanstad of Lawrence Berkeley National Laboratories
Filer:	Raquel Kravitz
Organization:	California Energy Commission
Submitter Role:	Commission Staff
Submission Date:	8/25/2017 10:31:11 AM
Docketed Date:	8/25/2017

Addressing Deep Uncertainty in Climate Change Impacts and Adaptation Analysis for the Energy System

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IEPR Joint Agency Workshop on Climate Adaptation and Resilience for the Energy System

California Energy Commission, August 29, 2017



### What is "deep" uncertainty?

- A traditional distinction:
  - "Risk" probabilities can be assigned
  - "Uncertainty" they can't
    - Note that in practice, even determining which concept is appropriate can be very challenging
    - Example: Uncertainty characterizations of the IPCC
- This terminology is not completely standard, but the underlying idea has only grown in importance over time
- While there is no single definition, in general "deep" uncertainties are particularly difficult and/or complicated instances of the second type



# Deep uncertainty and climate change impact and adaptation analysis (CCI&AA)

- In general and regarding the energy system in particular, strictly speaking virtually everything in this area qualifies as deeply uncertain due to the combination of limited or absent probability information and large ranges of possibilities – i.e., complexity:
  - Projections of climate change (climatic and meteorological variables) especially at regional scales
    - Projections of physical / ecosystem impacts, such as sea level and wildfires
  - Long-run evolution of energy system and its drivers even prior to climate considerations, including
    - Energy technology evolution
    - Economic, market, and institutional changes
    - Economic growth and demographic trends



### Decision-making under deep uncertainty

- Although not usually framed this way, scenario analysis is in essence a way of trying to deal with deep uncertainty
  - Given scenario choices, standard methods can be used
  - But with very few exceptions, scenario analysis as a rule takes account of a very limited degree of deep uncertainty
    - A relatively very small number of possibilities are typically addressed
- When deep uncertainty is fully confronted,
  - Traditional cost-benefit analysis is difficult to apply
  - Standard decision- making- under- uncertainty methods and stochastic analysis are difficult to apply
    - These are based on probability information and computationally challenging for large problems

In general, finding "optimal" solutions is not possible



### Robustness

- There are alternative decision-making methodologies
- Of particular importance are different approaches to robustness analysis
- While there are several technical definitions of this term, it refers to identifying solutions to problems that, while not optimal, will be "satisfactory" under a wide range of conditions defined by deep uncertainty



## Methods of robustness analysis

#### These include

- Max-min: Make the best possible decision assuming the worst case
  - This (and variations) has been pioneered by macroeconomists, and has been applied to climate economics (see References)
- Complete or exhaustive accounting for all possibilities in the "space" defining deep uncertainty
  - This has been pioneered by Rand, and applied to energy and climate economics and policy, water planning, and other problems (see References)



### Deep uncertainty and model complexity

- Computational modeling has become the dominant analytical methodology in many fields in the physical, social, and engineering sciences, including
  - General circulation climate modeling
  - Modeling in energy economic, policy, and planning analysis
- CCI&AA is an emerging field, but is and will continue to be primarily based on the application of such models (and others)
- In practice, deep uncertainty is usually embodied in *model* uncertainty:
  - Uncertainty about the correct fundamental principles/ structure/ features/ inputs of models of a given system (see References)



### Deep uncertainty and model complexity in CCI&AA

- A fundamental challenge is that the models are very complex and getting more so
  - There are reasons for this, and highly detailed models are essential for certain purposes, but...
  - It presents considerable barriers computational, theoretical, and empirical – to addressing deep uncertainty, including applying any form of formal robustness analysis, in energy system CCI&AA
    - Examples cited previously mostly involve small (low-dimensional) models
- Continued development of improved methods for simpler modeling in parallel to, and articulated with, ongoing CCI&AA analysis could prove very useful
  - A key research topic: What are the "returns to complexity" in modeling adaptation strategies for the energy system?



### Thank you

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ENERGY TECHNOLOGIES AREA

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