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46 My testimony today draws on my above experiences and my publication record of over 200 peer-
47 reviewed papers on land-atmosphere-ocean interface processes, weather and climate modeling,
48 hydrometeorology, remote sensing, nonlinear dynamics, and big data analytics. In particular, it
49 draws on my research and my extensive interactions with DOE and other scientists on the science
50 and user facilities related to the topic of today's hearing.

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52 This testimony is organized into four brief sections: 1) current status of DOE's climate and
53 environmental systems research, 2) unique aspects of these research efforts, 3) major challenges,
54 and 4) future directions.

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56 **1) What is the current status of DOE's climate and environmental systems research?**

57 DOE Office of Science manages its research portfolio through six program offices, including
58 Biological and Environmental Research (BER). BER has two divisions, including the Earth and
59 Environmental Systems Sciences (EESS) Division. The EESS Division supports fundamental
60 science and research capabilities that enable major scientific developments in Earth system-
61 relevant atmospheric and ecosystem process and modeling research in support of DOE's mission
62 goals for transformative science for energy and national security. All of DOE's climate science
63 research is housed within the EESS Division which supports three primary research activities:

- 64 ➤ Atmospheric System Research Program addresses a main source of uncertainty in Earth
65 system models: the interdependence of clouds, atmospheric aerosols, and precipitation that in
66 turn influences the Earth's radiation balance. This Program works closely with the
67 Atmospheric Radiation Measurement (ARM) user facility in support of its activities.
- 68 ➤ Environmental System Science Program supports research to provide an integrated, robust
69 and scale-aware predictive understanding of environmental systems, including the role of
70 hydro-biogeochemistry from the subsurface to the top of the vegetative canopy. Experimental
71 and modeling research is supported in part by capabilities at the Environmental Molecular
72 Sciences Laboratory (EMSL).
- 73 ➤ Earth and Environmental Systems Modeling Program supports three areas:
- 74 • to develop physical, chemical, and biological model components, as well as fully coupled
75 Earth System Models;
 - 76 • to develop multi-sector (e.g., energy, water, agriculture) dynamics models for human
77 system and integrated human-Earth system modeling; and
 - 78 • to enhance a predictive understanding of variability and change within the Earth System
79 through modeling and data analysis.

80 In particular, the first program area supports the Energy Exascale Earth System Model
81 (E3SM), which is a world-class, variable-resolution climate model that is run on DOE's
82 Leadership Computing Facility supercomputers.

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84 In addition, the EESS Division supports two scientific user facilities:

- 85 ➤ ARM provides unique, multi-instrumented capabilities for continuous, long-term observations
86 and mobile facilities as well as model-simulated high resolution information to improve
87 understanding and test hypotheses involving the role of clouds and aerosols on the
88 atmosphere's solar and terrestrial radiative balance over a variety of spatial scales; and

89 ➤ EMSL provides world-class laboratory equipment and integrated experimental and
90 computational resources to extend understanding of the physical, biogeochemical, chemical,
91 and biological processes that underlie DOE’s energy and environmental mission.
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93 To illustrate the success of these activities, here I provide three examples. First, E3SM version 1
94 was released in 2018, including a unique capability of regional refinement in all of its components
95 for high resolution modeling. E3SM results at both low (~100 km) and high (~25 km) resolutions
96 are used in the Intergovernmental Panel on Climate Change (IPCC) Sixth Assessment Report
97 (AR6). More recently, a new global cloud-permitting modeling capability at 3 km grid spacing has
98 been developed and demonstrated through participation in an international effort to intercompare
99 global cloud-permitting simulations, making E3SM the world’s highest resolution climate
100 prediction capability. These simulations show substantial improvements in addressing
101 longstanding model biases (with a grid spacing of ~100 km) such as the diurnal cycle of
102 precipitation – which is the focus of an international project led by a DOE E3SM scientist.
103

104 ARM developed and implemented the LES (Large-Eddy Simulation) ARM Symbiotic Simulation
105 and Observation (LASSO) workflow. LASSO uses ARM observations to constrain and evaluate
106 LES simulations to provide high-resolution (100 m grid spacing), three-dimensional datasets for
107 studying atmospheric processes. Besides the LES simulations of shallow cumulus clouds over the
108 Southern Great Plains ARM site, LASSO has recently been expanded to study deep convection
109 and heavy precipitation in conjunction with a major ARM field campaign in Argentina and to
110 study marine stratocumulus clouds, which is crucial for the Earth’s radiation balance, at the Eastern
111 North Atlantic atmospheric observatory established by ARM.
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113 As part of the Earth and Environmental Systems Modeling Program, the multi-sector dynamics
114 program area has been further developed in order to extend beyond the more constrained emphasis
115 on Integrated Assessment Modeling. This (MultiSector Dynamics) program area has launched a
116 Community-of-Practice to explore the co-evolution of human and natural systems over time and
117 to build the tools that bridge across sectors (energy, water, land, economy) and scales (spatial,
118 temporal). Furthermore, the Global Change Analysis Model (GCAM), which represents many of
119 the interactions among human and Earth system, has been in continuous development by this
120 program area and is currently being incorporated into E3SM. Given this, E3SM is the only climate
121 model that includes details on the human component (i.e., infrastructures, economics, land use,
122 etc.) that is built within the prediction modeling framework.
123

124 **2) What is unique about these research efforts?**

125 Research efforts supported by the BER EESS Division are part of the interagency U.S. Global
126 Change Research Program (USGCRP), that in turn is comprised of 13 federal agencies that
127 conduct or use research on global change and its impacts on society, in support of the Nation’s
128 response to global change. Here I identify four unique aspects of DOE’s climate and environmental
129 systems research.
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131 First, there are ~50 Earth system models in the world. E3SM stands out for having a close
132 integration with DOE’s world-leading high-performance computing. Indeed, “exascale”
133 computing is even included in the name of E3SM. While supercomputer speed can be measured

134 and benchmarked, the actual speed realized in modeling strongly depends on the model
135 architecture and software. By optimizing the E3SM code for DOE's advanced computers, DOE
136 not only maximizes its ability to leverage its own resources but is also developing new knowledge
137 and best practices that will improve other models worldwide. E3SM is the first model of its kind
138 to be run on the ultra-fast supercomputers, i.e., exascale computers, developed by DOE.

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140 Another unique aspect is DOE's heavy emphasis on extreme events (e.g., hurricanes) and
141 geographic domains that exhibit sharp gradients (e.g., coastlines and complex terrain over western
142 U.S.) in the context of larger-scale and longer-term changes such as the global warming and other
143 climate changes induced by greenhouse gas increases and other human activities. This is done, for
144 example, through E3SM's unique capability of regional refinement in all of its components for
145 high resolution modeling. Recent progress in the development of a GPU (graphics processing
146 unit)-enabled, rather than the traditional CPU (central processing unit)-based, version of the E3SM
147 global cloud permitting model, will further enhance E3SM's ability to resolve extreme events and
148 tight spatial gradients in the context of a global Earth system model that can simulate multi-decadal
149 changes. Complementing the modeling of these complicated regions, DOE also supports long term
150 field experiments such as in the Arctic, Tropics, and mid-latitude U.S. sites, to calibrate, validate,
151 and test predictive models with a focus on characterizing and reducing prediction uncertainty.

152
153 GCAM is one of only a handful of integrated human-simplified Earth system models that has
154 contributed scenarios (e.g., Representative Concentration Pathways and Shared Socioeconomic
155 Pathways) to drive climate model simulations in all of the IPCC's major assessment reports,
156 including AR5 and AR6, as well as other important community activities such as the Coupled
157 Model Intercomparison Projects (CMIP5 and CMIP6). One weakness of current approaches used
158 by most climate modeling centers is that the greenhouse gas concentrations at the end of 21st
159 Century from these scenarios would be different from those using Earth system models with the
160 same natural and anthropogenic emissions. To avoid this inconsistency, GCAM is being integrated
161 into E3SM, which represents the world's first attempt to develop a fully coupled human-Earth
162 system model to make more consistent and realistic predictions.

163
164 Both ARM and EMSL are world-leading user facilities in the relevant fields. For instance, ARM
165 provides the world's most comprehensive, continuous, and precise observations of clouds,
166 aerosols, and related meteorological information. This is done through a combination of ground-
167 based measurements and aerial measurements with piloted aircraft, unmanned aerial systems and
168 tethered balloon systems. This comprehensive "supersite" observatory approach is now widely
169 adopted by other national and international programs. Besides supporting BER atmospheric
170 sciences and Earth system modeling research, the ARM facility freely provides key information
171 to other agencies; e.g., for calibration and validation of space-borne sensors at NASA.

172 173 **3) What are the challenges for DOE's climate and environmental systems research?**

174 To continue DOE's leadership in climate and environmental systems research, several major
175 challenges will need to be addressed.

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177 First, to further enhance the integration of Earth system modeling with exascale computing, there
178 are a number of scientific and software engineering challenges. For instance, while the numerical

179 solution of partial differential equations for atmospheric dynamics (e.g., for the movement of water
180 vapor by wind in the atmosphere) has been traditionally emphasized, the numerical solution of
181 physical, chemical, and biological processes (e.g., aerosols, clouds, precipitation, radiation,
182 turbulence), interactions among these processes, and their interaction with atmospheric dynamics
183 have not received enough attention. Additionally, there is an urgent need to develop approaches
184 that take maximum advantage of both GPU- and CPU-based computing, which is a paradigm shift
185 for many Earth system modelers, who have traditionally emphasized CPU-based architectures.
186 These challenges can be addressed through the Scientific Discovery Through Advanced
187 Computing (SciDAC) Program jointly supported by BER and DOE's Office of Advanced
188 Scientific Computing Research and through DOE Office of Science's Graduate Student Research
189 Program (to develop the future pipeline in this area).

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191 Understanding Earth system predictability (which represents the upper bound of prediction using
192 physics-based equations) is already recognized as a multi-agency grand challenge in the U.S. It is
193 even more challenging to understand the predictability of the fully coupled human-earth system.
194 New understanding is urgently needed through innovative theoretical studies, global data analysis,
195 and global modeling of human, natural, and coupled human-natural systems. It is unclear if current
196 global models are adequate for predicting extreme events, as such models may contain numerical
197 and spurious chaos and may dampen extreme events. Also needed is the use of innovative Artificial
198 Intelligence (AI)/Machine Learning (ML) approaches to address predictability issues in both
199 human and natural systems, such as the prediction of extreme events as the climate evolves.

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201 A major goal of BER's modeling efforts is to help examine the resilience of our Nation's
202 infrastructure, especially energy infrastructure and its interaction with other sectors such as water
203 systems and land use changes, and to help inform energy infrastructure investment decisions and
204 national security. This requires smaller horizontal model grid spacing (e.g., using the global cloud-
205 permitting model at 3 km grid spacing), better representation of important processes (e.g., cloud-
206 aerosol, water cycle, biogeochemistry, and the cryosphere) assisted by ARM and EMSL user
207 facilities, better understanding of how human activities influence and are influenced by climate
208 change, and quantification and possible reduction of key uncertainties, based on integration of
209 AI/ML with physics-based approaches. Also needed are the close interactions between BER
210 activities and DOE's applied energy programs.

211
212 To continue the leadership of the ARM and EMSL user facilities, the challenge is to keep up with
213 new observing technologies, develop new capabilities, and provide better user support to enhance
214 the user base and scientific and societal impacts. For example, the newly acquired manned aircraft
215 significantly enhances ARM's aerial capabilities. The ARM data center currently holds over 2
216 Petabytes of data from over 11,000 datasets and these numbers are steadily increasing. While ARM
217 is doing an excellent job in access and stewardship, the challenge is on data discovery,
218 visualization, and tailored needs of users.

219 220 **4) What are the future directions of DOE's climate and environmental systems research?** 221

222 Based on the above discussions, the future directions include:
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224 **Coupled model development.** A GPU-enabled version of the E3SM global cloud-permitting
225 model (with a grid spacing of 3 km) should continue to be developed for exascale computers.
226 Scale-aware parameterizations of physical, chemical, and biological processes need to be
227 developed for a unified model applicable and skillful at resolutions ranging from 3 – 100 km. In
228 addition, GCAM at even higher resolution should be further integrated into E3SM. Currently, the
229 primary interactions between the two codes are with respect to biogeochemistry and land surface
230 changes, but more complete integrations (e.g., water demand from GCAM influencing water
231 availability in E3SM) are needed.

232
233 To further accelerate coupled human-earth system modeling, AI/ML approaches should be
234 explored:

- 235 ➤ to improve the representation of both natural processes and human systems, including human
236 decision-making and other social science-oriented aspects (e.g., to explore the potential of
237 developing a hybrid modeling system with both AI/ML and traditional modeling
238 components);
- 239 ➤ to better quantify uncertainty in future climate projections (e.g., for energy infrastructure
240 design and resilience assessment);
- 241 ➤ to make the modeling more efficient computationally (e.g., for downscaling to local
242 information); and
- 243 ➤ to study coupled human-Earth system predictability (e.g., to understand if the predictability of
244 extreme events is higher than that for the normal conditions and if model deficiencies decrease
245 the predictability of the coupled system).

246 These AI/ML applications require customized solutions for domain-specific problems, and they
247 can be achieved only through better collaborations between Earth scientists and AI/ML experts.

248
249 **Model application to energy security.** One key application of the coupled human-earth system
250 modeling capability on DOE’s exascale computers is to address science questions relevant to
251 energy security, in the broad sense. With this, the new science derived from Earth observations
252 and model-generated data can be used to achieve broad benefits ranging from informing the design
253 of robust resilient energy infrastructures to risk analysis involving natural disaster impact
254 mitigation to natural resource management and environmental stewardship. BER should work
255 more closely with DOE applied energy programs and Office of Energy Policy and Systems
256 Analysis to assist in the planning of our Nation’s energy infrastructure and in the assessment and
257 mitigation of potential damages to, e.g., energy and related infrastructures. In particular, this
258 planning can be assisted by tradeoff and scenario analyses using fully coupled human-Earth system
259 modeling along with exascale computing. For this purpose, the framework widely used in making
260 major observing system decisions would be very valuable: the Observing System Simulation
261 Experiment (OSSE) which is a modeling experiment used to evaluate the value of a new observing
262 system when actual observational data are not available.

263
264 **ARM and EMSL user facilities.** These observing facilities provide the backbone to test and
265 improve models, and they need to keep up with new capabilities (e.g., phased-array radar and a
266 variety of edge computing technologies for ARM). Tighter integration across BER’s observing
267 and modeling platforms is also needed. For instance, LASSO should be further expanded by
268 working with modeling groups to develop (or expand) frameworks for data-model integration at
269 even fine resolutions. To expand the user base and help convert data into information and then into

270 knowledge, enhanced data service is needed for data discovery, visualization and animations, and
271 tailored needs of users. For instance, with the expansion of ARM data volume for data sets from
272 instruments such as scanning radars or LASSO simulations, local computing at the ARM Data
273 Center becomes necessary for some users.

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275 **Outreach and Partnership.** Recognizing the lack of under-represented researchers in the relevant
276 field, DOE's climate and environmental systems research projects and programs should
277 proactively reach out to colleges and universities with a focus on Minority-Serving Institutions
278 and Historically Black Colleges and Universities (e.g., through summer internship, summer
279 school, developing training materials, building modules to apply observational and model data in
280 the classroom). The results from multi-sector dynamics modeling (e.g., on economics, population,
281 land use, and climate drivers for coastal development and engineering) are directly relevant to the
282 study of environmental equity and justice, and hence outreach to relevant communities is needed
283 and collaborations should be pursued.

284
285 In the U.S., interagency collaborations (e.g., through the USGCRP) should be strengthened. For
286 instance, the collaboration between ARM and NASA-supported scientists leads to the use of ARM
287 data for the calibration and validation of satellite remote sensing retrievals and data. As another
288 example, further interagency collaborations could be pursued to study the water cycle (e.g.,
289 precipitation, snowpack, evaporation, soil moisture, river streamflow, and lake water levels) over
290 the U.S. through the USGCRP's Integrated Water Cycle Group. Besides these interagency
291 collaborations, the coupled human-Earth system modeling capabilities will also allow potential
292 partnerships with the private sector on topics like extreme events under climate change (e.g.,
293 relevant to the insurance and reinsurance industry).

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295 Internationally, E3SM has participated in the CMIP6 model intercomparison activities for the
296 IPCC AR6, GCAM has contributed scenarios that drive CMIP5 and CMIP6, and ARM has a close
297 collaboration with the GEWEX Global Atmospheric System Studies Panel in data archive and in
298 organizing a competition of early-career researchers (including graduate students) in using the
299 ARM data for atmospheric process understanding. A new opportunity is the World Climate
300 Research Programme's lighthouse initiative on Digital Earth - a dynamic representation of the
301 Earth system founded on an optimal blend of models and observations. With the development of
302 the E3SM global cloud-permitting model (with a grid spacing of 3 km) for exascale computers,
303 DOE should actively participate in this international activity and take leadership where
304 appropriate. These and other international collaborations can benefit DOE and the Nation, and can
305 be used to continuously monitor the health of the Earth, study the effects of climate change and
306 the state of the oceans and cryosphere, and improve modeling and predictive capabilities around
307 extreme weather events and over heterogeneous or high gradient regions (e.g., urban, coastal).