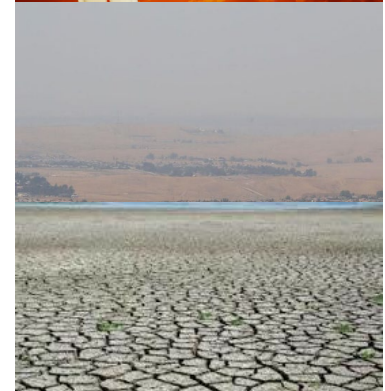
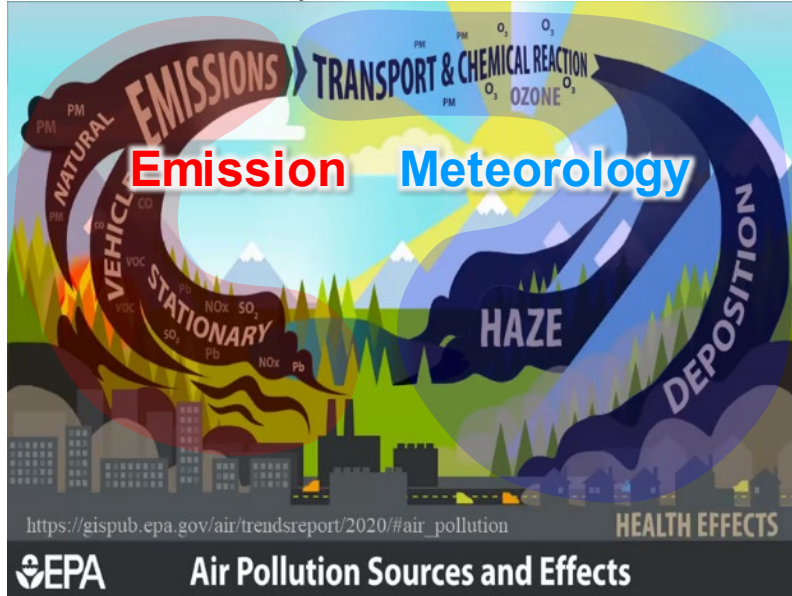


Lessons we learnt

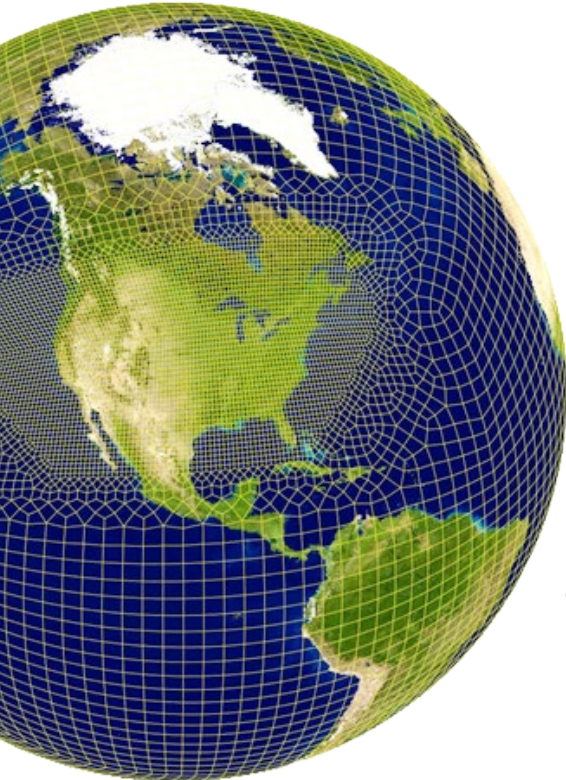
Joshua Fu, University of Tennessee/Oak Ridge National Laboratory



- **Meteorology** has an important influence on the formation, transport, and deposition of chemical components.
- Meteorological patterns favorable the formation or accumulation of air pollutants: **extreme weather events**, such as heatwave, stagnation, or both (compound events).
- Increasing **anthropogenic emissions** lead to air pollution since the modern industrial revolution.

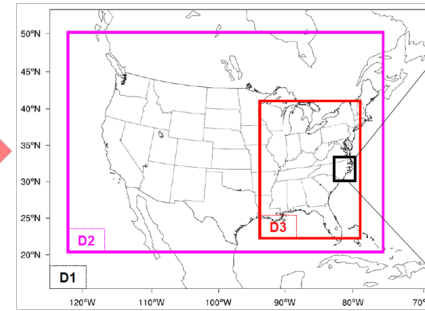
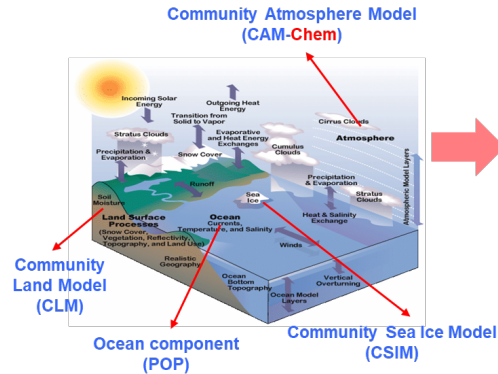


Lessons and Opportunities for Integrated Engineering Earth Systems Science at Scale



2
Community Earth System Model
CESM 1.0

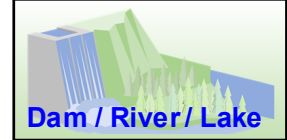
Regional Climate/Chem Model
WRF 3.2.1/CMAQ 5.0



D1/D2/D3: 36-12-4 km

$0.9 \times 1.25 \text{ deg}$ ($\sim 100 \times 140 \text{ km lat/lon}$) $\rightarrow 36\text{-}12\text{-}4 \text{ km} \rightarrow \sim 50 \text{ m}$

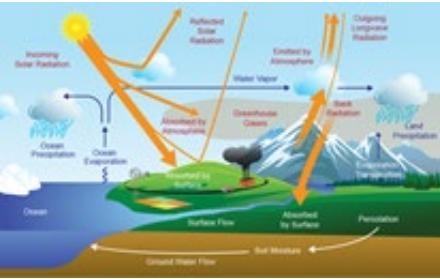
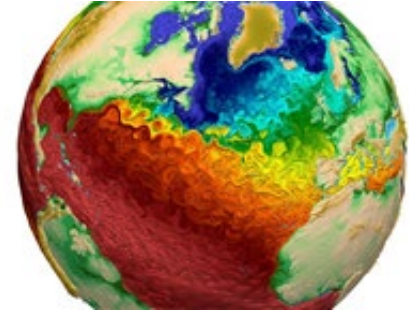
Downscaling



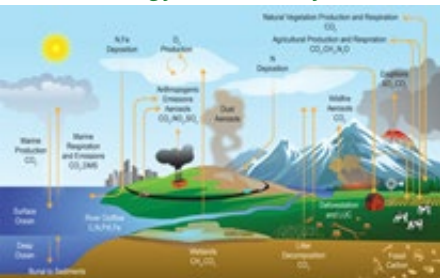
- High resolution regional climate and air quality modeling is inevitable and crucial for regional engineering risk assessment and can provide important information for policymakers when taking actions on climate extreme events, mitigation, and adaptation.

Lessons and Opportunities for Integrated Engineering Earth Systems Science at Scale

- Predictive understanding of the Earth systems is crucial for utilizing its energy and water resources while mitigating costly environmental hazards.
- Increasing frequency of weather extremes and the changing the environment poses risks to energy infrastructure and the built environment.



Energy & Water Cycles



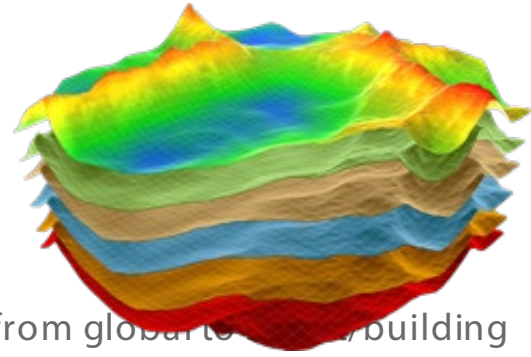
Carbon & Biogeochemical Cycles

- Sparse observations and inadequate model fidelity limit the ability to identify vulnerability (e.g., power grid), mitigate risks, and respond to disasters.
- Foundational Earth systems science of complex and dynamic hydrological, biological, and geochemical processes and their interactions is required.
- Earth system models, models of engineered systems, and machine learning must be integrated to practicably predict vulnerability.



Lessons and Opportunities for Integrated Engineering Earth Systems Science at Scale

- Water resources are critical for energy production, human health, food security, and economic prosperity.
- **Water cycle extremes**, driven by weather extremes, environmental change, and disturbances such as wildfire and land-use change (e.g., roughness-dust), directly impact water availability/quantity and water quality.



- **Downscaling** the exposure from global to regional/building scale should not only rely on ESMs modeling, other data sources (e.g. satellite data, land-use data) or techniques (e.g. machine learning) but also should be involved to enhance the modeling accuracy.
- Building up **exposure scenario at fine spatial scale** (e.g. city or street level) is the challenge, because the estimations could be very diverse due to different **exascale models and downscaling techniques**.
- **Uncertainty** due to lack of **communication between models**, lack of **physical and chemical mechanisms at a regional scale**, and lack of **local information** need further investigations.

Lessons and Opportunities for Integrated Engineering Earth Systems Science at Scale

- Artificial intelligence (**AI**) and machine learning (**ML**) methods are needed to integrate disparate and diverse **multi -scale data** with models of watersheds, rivers, water utility, civil infrastructure.
- Practicable predictions of air/water quality and quantity, as well as floods and droughts, require **data -driven models** and **smart sensing systems**.
- **Exascale computing** , **edge computing** , and **5G** offer the promise to accelerate scientific discovery and revolutionize engineering approaches through **data -driven** and **physics -constrained AI/ML with Earth Systems**.
- **Engineering cyber -physical system**

Questions and contact: Joshua Fu via jsfu@utk.edu

