

Applying Computationally Efficient Schemes for BioGeochemical Cycles (ACES4BGC)

Forrest M. Hoffman^{5,α}, Pavel B. Bochev⁷, Philip J. Cameron-Smith²,
Richard C. Easter, Jr.⁶, Scott M. Elliot³, Steven J. Ghan⁶, Iulian R. Grindeanu¹,
Robert B. Lowrie³, Donald D. Lucas², Vijay S. Mahadevan^{1,β}, Kara J. Peterson⁷,
Bill Sacks⁴, Manishkumar B. Shrivastava⁶, Mark A. Taylor⁷,
Mariana Vertenstein⁴, and Patrick H. Worley^{5,β};

External Collaborators:

Steven Goldhaber⁴, Alex Guenther⁶, Peter H. Lauritzen⁴, and Xiaohong Liu⁸

¹Argonne National Laboratory, ²Lawrence Livermore National Laboratory, ³Los Alamos National Laboratory,
⁴National Center for Atmospheric Research, ⁵Oak Ridge National Laboratory,
⁶Pacific Northwest National Laboratory, ⁷Sandia National Laboratories, and ⁸University of Wyoming;
^αPrincipal Investigator, ^βSciDAC Institute Liaison

July 31, 2014

SciDAC-3 Principal Investigator Meeting
Omni Shoreham Hotel, Washington, DC, USA



Argonne
NATIONAL LABORATORY

Lawrence Livermore
National Laboratory



U.S. DEPARTMENT OF
ENERGY

Los Alamos
NATIONAL LABORATORY

NCAR
NATIONAL CENTER FOR ATMOSPHERIC RESEARCH

Office of
Science

OAK
RIDGE
National Laboratory



Pacific Northwest
NATIONAL LABORATORY



Sandia
National
Laboratories

Project Goal and Objective

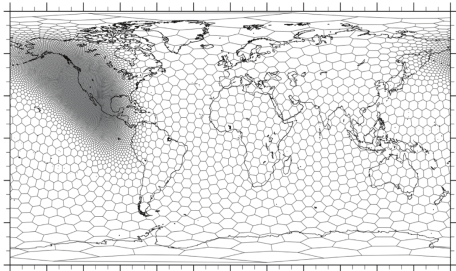
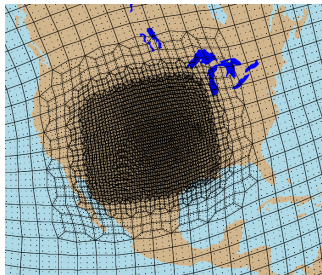
- ▶ **Goal:** Advance predictive capabilities of Earth System Models (ESMs) by reducing two of the largest sources of uncertainty, *aerosols and biospheric feedbacks*, utilizing a *highly efficient computational approach*.
- ▶ **Objective:** Deliver a second-generation ESM with improved representation of biogeochemical interactions at the canopy-to-atmosphere, river-to-coastal ocean, and open ocean-to-atmosphere interfaces.
- ▶ **ACES4BGC** is
 - ▶ implementing and optimizing new computationally efficient tracer advection algorithms for large numbers of tracer species;
 - ▶ adding important biogeochemical interactions between the atmosphere, land, and ocean models; and
 - ▶ applying uncertainty quantification (UQ) techniques to constrain process parameters and evaluate feedback uncertainties.

Research Team

Name	Lab	Science Team	Topic
Pavel B. Bochev	SNL	Atmosphere	Advection
Philip J. Cameron-Smith [†]	LLNL	Atmosphere	Atm. BGC
Richard C. Easter, Jr.	PNNL	Atmosphere	Aerosols
Scott M. Elliott [†]	LANL	Ocean	Ocean BGC
Steven J. Ghan	PNNL	Atmosphere	Aerosols
Iulian R. Grindeanu	ANL	Comp. Tools & Perf.	Mesh Tools
Forrest M. Hoffman [†]	ORNL	Land	Land BGC
Robert B. Lowrie	LANL	Ocean	Advection
Donald D. Lucas	LLNL	Atmosphere	UQ
Vijay S. Mahadevan [‡]	ANL	Comp. Tools & Perf.	Mesh Tools
Kara J. Peterson	SNL	Atmosphere	Advection
Bill Sacks	NCAR	Comp. Tools & Perf.	SE
Manishkumar B. Shrivastava	PNNL	Atmosphere	Aerosols
Mark A. Taylor	SNL	Atmosphere	Advection
Mariana Vertenstein	NCAR	Comp. Tools & Perf.	SE
Patrick H. Worley ^{†‡}	ORNL	Comp. Tools & Perf.	Performance

[†]Science Team Lead; [‡]SciDAC Institute Liaison

Climate Science Needs for Reducing Biogeochemical and Aerosol Feedback Uncertainties



- ▶ Faster tracer transport methods for CESM and ACME atmosphere and ocean components
- ▶ Accurate on fully unstructured grids needed for next generation models
- ▶ Transport hundreds to a thousand of reactive and non-reactive biogeochemical species (trace gases, aerosols, dust, etc.)

Tracer Transport

A tracer, represented by its mixing ratio q and mass ρq , is transported in the flow with velocity \mathbf{u} as

$$\left. \begin{aligned} \frac{\partial \rho}{\partial t} + \nabla \cdot \rho \mathbf{u} &= 0 \\ \frac{\partial \rho q}{\partial t} + \nabla \cdot \rho q \mathbf{u} &= 0 \end{aligned} \right\} \rightarrow \frac{Dq}{Dt} = 0.$$

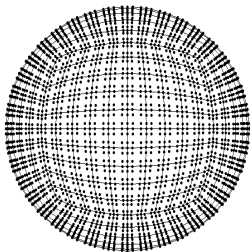
Solution methods should satisfy

- ▶ local conservation of ρq ,
- ▶ monotonicity or bounds preservation of q , and
- ▶ consistency between q and ρ (free stream preserving).

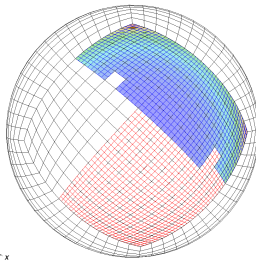
Spectral Element Dynamical Core

The **High-Order Method Modeling Environment (HOMME)** within CAM-SE provides a continuous Galerkin finite element method using Gauss-Lobatto quadrature.

Advection using the standard spectral element method with high-degree polynomials is accurate, but expensive due to time step restrictions.



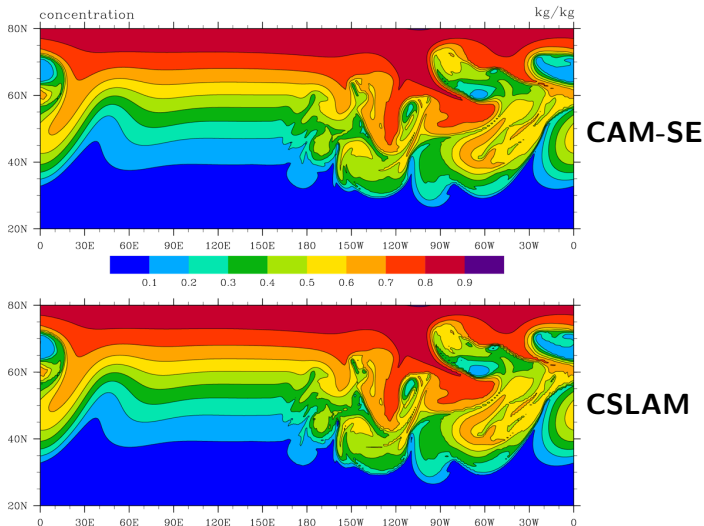
(a) Original CAM-SE mesh



(b) CSLAM mesh (refined, 2/16 proc)

Conservative Semi-Lagrangian Multi-tracer (CSLAM) transport scheme (Lauritzen et al., 2010) offers one approach for improving efficiency for large tracer counts. Stable method for large time steps with $CFL \sim 5$.

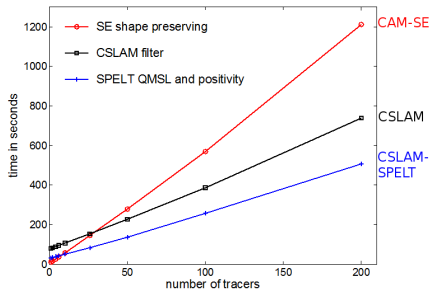
Early CSLAM Performance



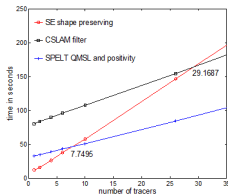
No obvious loss of accuracy.

Erath, Taylor, Lauritzen (SNL & NCAR)

Early CSLAM Performance



- ▶ CSLAM is expensive for one tracer, but breaks even with CAM-SE at ~ 30 tracers.
- ▶ A fast, scalable method for generating grid intersections allowing for $CFL \geq 5$ should improve performance significantly.



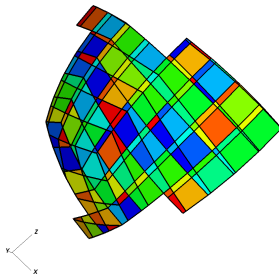
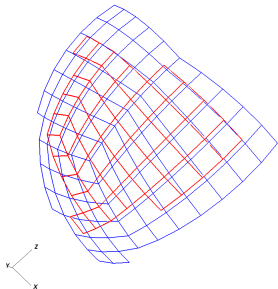
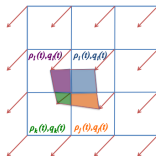
Erath, Taylor, Lauritzen (SNL & NCAR)

Eulerian/Lagrangian Grid Intersection

The CSLAM scheme uses an Eulerian arrival grid and integrates backwards to a Lagrangian departure grid.

An intersection of these two grids is required to compute the disposition of tracers through time.

The **Mesh-Oriented data Base (MOAB)** from the **FASTMath Institute** provides a scalable, parallel algorithm for intersecting arbitrary meshes.



The arrival (red) and departure (blue) meshes are intersected to produce a final set of polygons for reconstruction of all tracer mole fractions.

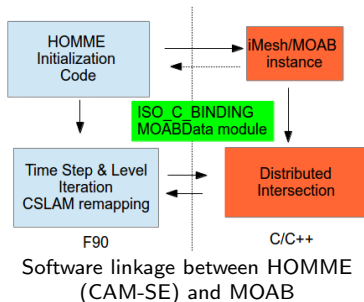
MOAB Now Coupled to HOMME

Initialization:

- ▶ MOAB infrastructure is instanced on every task,
- ▶ arrival mesh is initialized from HOMME (CAM-SE and refined CSLAM meshes), and
- ▶ parallel infrastructure is established.

At every time step:

- ▶ departure point positions are passed to MOAB,
- ▶ MOAB computes the intersections (communicating as needed), and
- ▶ MOAB returns the intersections to HOMME for reconstruction.



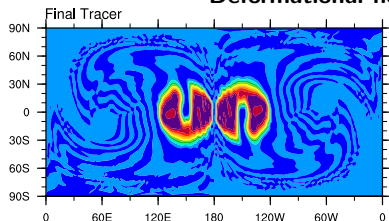
Next Steps:

Complete coupling (return of intersections), verify, and compare results with current CSLAM (cubed-sphere, regular mesh) implementation.

Additional Approaches

- ▶ Characteristic Discontinuous-Galerkin (CDG) represents tracers by discontinuous modal expansion within each element. Modal expansion provides compact, numerically efficient high-order reconstruction “built it”, but difficult to impose exact monotonicity (Lowrie and Ringler, 2011).
- ▶ Semi-Lagrangian spectral element (SL-SE) algorithm using optimization to enforce mass conservation. Optimization is efficient and works for large time steps on unstructured grids (Peterson and Taylor, 2014).

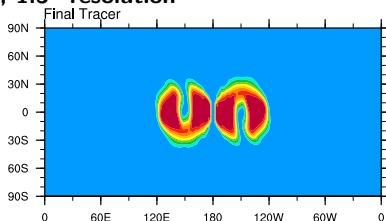
Deformational flow, 1.5° resolution



Mass error = -3.44×10^{-3}

Min value = -0.1070

Max value = 1.1934



Mass error = 1.69×10^{-11}

Min value = 0.1

Max value = 0.9979

Terrestrial Biogeochemistry: Carbonyl sulfide (COS)

Objective:

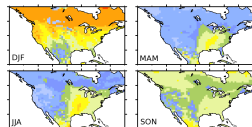
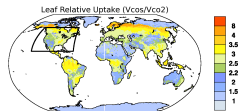
- ▶ Add important biogeochemical interactions between the biosphere and atmosphere to the Community Earth System Model (CESM).

New Science:

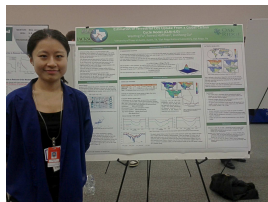
- ▶ Initial parameterization for carbonyl sulfide (COS) uptake by the biosphere tested in the Community Land Model (CLM4) by intern Wenting Fu.

Significance:

- ▶ COS provides a potentially powerful tracer for biosphere–atmosphere exchange of CO₂ and a constraint on global gross primary production.



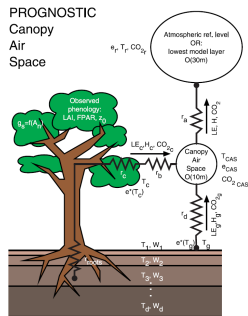
Leaf relative uptake from simulation testing COS uptake in CLM (Fu *et al.*, in prep.).



ORNL intern Wenting Fu presenting preliminary results from her initial implementation of COS uptake in CLM4.

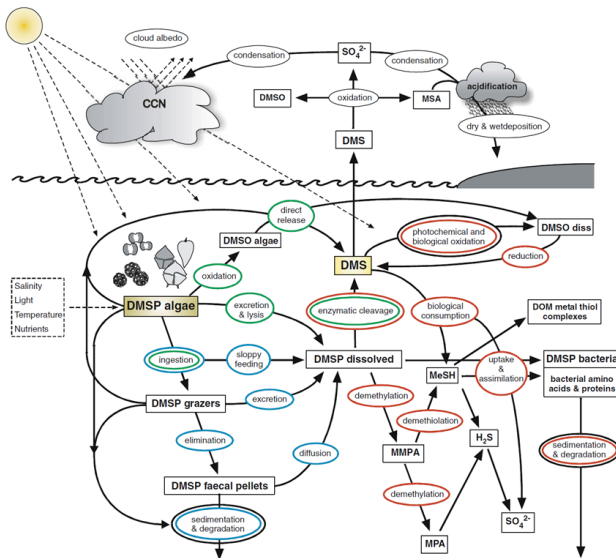
Terrestrial Biogeochemistry: Canopy Air Space

- ▶ Volatile Organic Compounds (VOCs)
 - ▶ Working with Alex Guenther at PNNL to improve VOC emissions factors (ϵ);
 - ▶ improving species-specific emissions in MEGAN2 model, initially by adding plant functional types (PFTs) in CLM4; and
 - ▶ will use GOAmazon2014 observations and UQ to improve model parameters in warm, moist tropical regions.
- ▶ Prognostic Canopy Air Space
 - ▶ Initially implementing single-layer canopy air space scheme of Vidale and Stöckli (2005) and
 - ▶ extending to a multiple-layer CAS to improve representation of canopy trace gas exchange.
- ▶ Ammonia
 - ▶ Focusing on canopy exchange and
 - ▶ adding soil and agricultural emissions (cattle, hogs, fertilizer).



(Vidale and Stöckli, 2005)

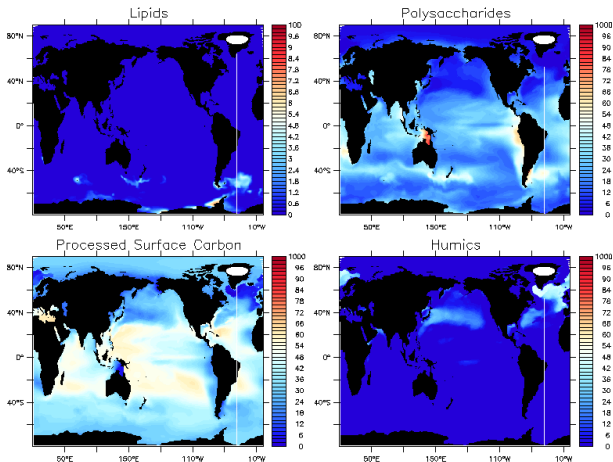
Marine Biogeochemistry



(Stefels et al., 2007)

Marine Biogeochemistry

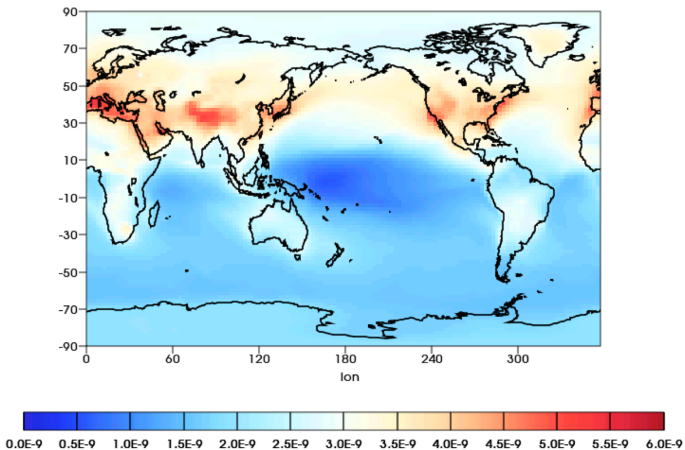
Macromolecular Carriers in February, micromolar C



Scott Elliott (LANL)

Organic ocean emissions are sources of primary organic aerosols.

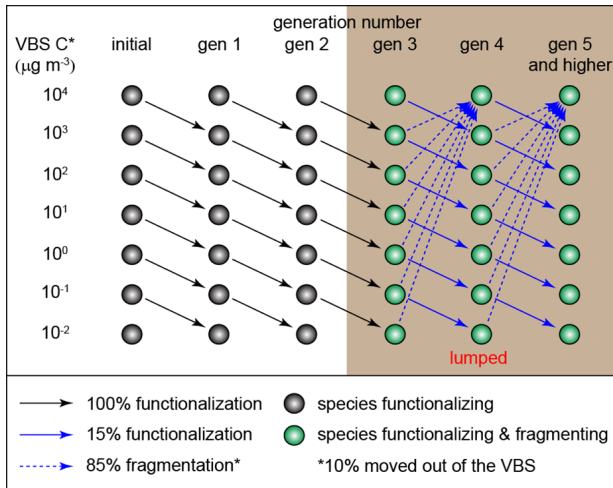
Marine Biogeochemistry



Scott Elliott (LANL)

Ozone concentration differences for simulations of enhanced Arctic Ocean methane released due to clathrate destabilization on continental slopes → complex HO_x/NO_x chemistry.

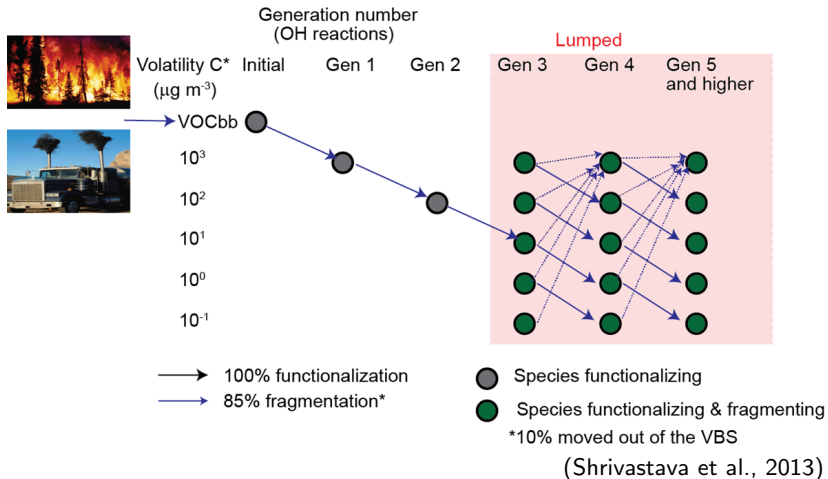
ACES4BGC Aerosol Research



Volatility basis set (VBS) representation for secondary organic aerosol (SOA) precursors

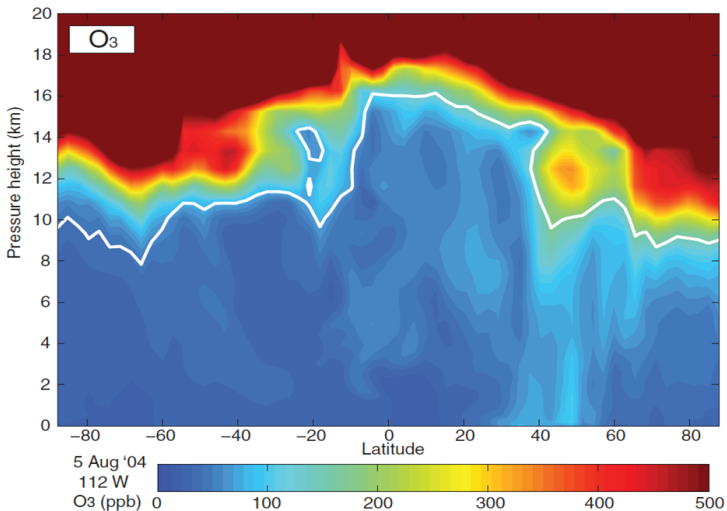
(Shrivastava et al., 2013)

ACES4BGC Aerosol Research



A very simplified volatility basis set (VBS) is used for current climate models, with only 8 tracers.

Atmospheric Chemistry

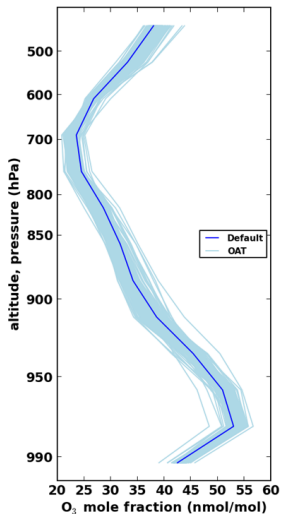


(Prather et al., 2011)

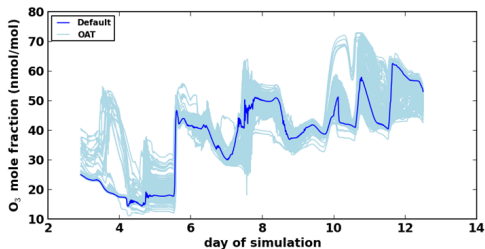
Ozone tracer emitted uniformly at surface with 90-day exponential decay.

ACES4BGC Uncertainty Quantification

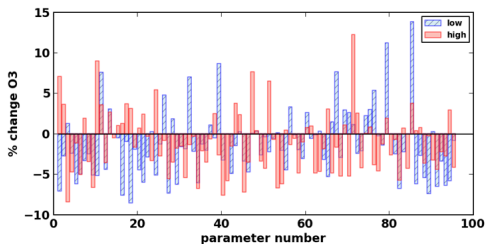
Vertical profile (days 5–10)
191 simulations



Time evolution (level 887 hPa)



Effects of parameter changes (days 5–10, lev 887)

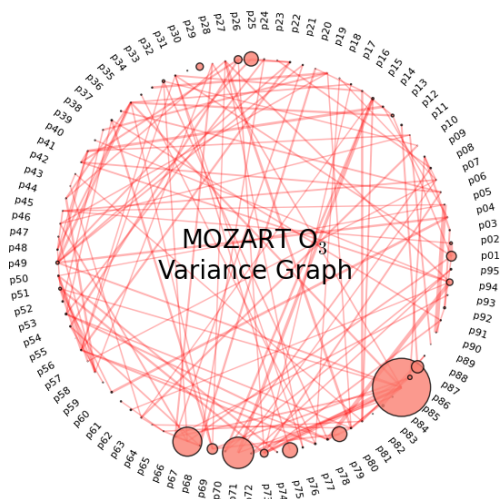


Don Lucas (LLNL)

ACES4BGC Uncertainty Quantification

MOZART Ozone Example

- ▶ Implemented PDFs for 100 photochemical parameters in the MOZART mechanism.
- ▶ Ran $\sim 10^4$ ensemble SCAM simulations using Latin hypercube sampling.
- ▶ Analyzing ensemble variance using new UQ methods in collaboration with **QUEST Institute**.



Don Lucas (LLNL)

Second order decomposition of the variance of daily mean O_3 concentration in the middle troposphere is dominated by 10 laboratory rate constant parameters.

OLCF Director's Discretion Project

How do we pull together all these individual science components?

- ▶ Combine code onto a single ACES4BGC branch of ACMEv0.
- ▶ Perform new science simulations, turning on new biogeochemical and aerosol processes incrementally.
- ▶ Develop a science and computational performance baseline before switching to CSLAM on unstructured grids.
- ▶ Validate and use a GPU-enabled version of the existing finite volume tracer advection scheme with large numbers of tracers.
- ▶ Enabled by **SUPER Institute** collaboration and the Oak Ridge Leadership Computing Facility (OLCF) Director's Discretion Project:
ACES4BGC SciDAC-3 Partnership Project Gen2ESM Foundry
 - Titan: 6M core-hours; Rhea: 6K core-hours

ACES4BGC Benefitting from SciDAC Institute Partnerships

- ▶ **FASTMath Institute** – Development and implementation of MOAB by **Iulian Grindeanu** and **Vijay Mahadevan (ANL)** will provide a significant advance to enable new science.
- ▶ **SUPER Institute** – Critically important performance tracking and optimization by **Pat Worley (ORNL)** continues to enable more science in less time and fewer computing resources and supporting performance portability across new architectures.
- ▶ **QUEST Institute** – Uncertainty quantification tools and methods being used by **Don Lucas (LLNL)** to develop framework for biogeochemistry sensitivity studies.
- ▶ **SDAV Institute** – Began after our project, but we are starting a conversation with **Rob Ross (ANL)** about *in situ* analysis, parallel I/O, and tracer visualization.

Computational Challenges Posed by Simulating Complex Ecosystems and Large Numbers of Tracers in Earth System Models

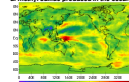
Philip Cameron-Smith (pjcc@llnl.gov), ACES4BGC team (ANL, LANL, LLNL, ORNL, PNNL)

Biological emissions affect climate and air-quality

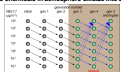
Ocean ecosystem is the source of many gases and aerosols to the atmosphere



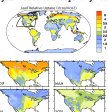
Decrease in soar surface heating due to di-methyl sulfide produced in the ocean



Global mean = 3.5 W/m² Organic chemicals in atmosphere oxidize into aerosols



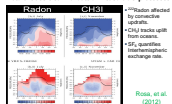
Land ecosystem is source of CO₂ and hydrocarbons



Carbonyl sulfide (COS) is a natural tracer that is similar to CO₂, and can be used to quantify the difference between photosynthesis and respiration.

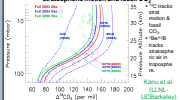
Tracers can answer: who, what, where, why?

Natural tracers can validate unmeasurable processes



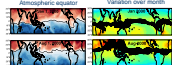
Rosa, et al. (2012)

Natural tracers can constrain stratospheric motion and fossil CO₂



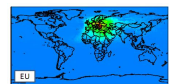
Kahn et al. (LLNL-UCBerkeley)

Idealized tracers can unambiguously identify tropical mixing barrier



Tracers emitted north and south with 90-day decay. Holmes & Pfister (UC Irvine)

Tracers can be tagged in model to quantify contribution from source region or plant type

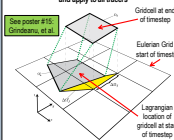


Effect of PM_{2.5} from European emissions Anenberg, et al (2014)

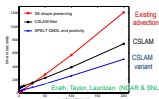
Improving tracer performance with FASTMath & SUPER

Existing tracer advection schemes usually solve the advection equations separately for each tracer, so computational cost scales linearly.

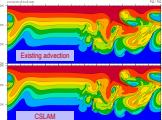
Using MOAB to solve advection once and apply to all tracers



A simpler version (CSLAM) limited to neighboring gridcells (ie CFL=1), is working well.



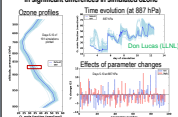
Comparison between advection schemes shows no significant loss of accuracy



Erath, Taylor, Lauritzen (NCAR & SNL)

Uncertainty quantification, validation, & tuning with QUEST

Uncertainty in laboratory chemical rate constants results in significant differences in simulated ozone



QUEST tools enable high dimensional UQ analysis of ozone sensitivity to laboratory parameters



Strategies to circumvent memory limitations These problem sizes require 10-100GB for 2nd to 4th order analyses. Hence, many computers limit our UQ variance analyses to low orders (e.g. Titan has 32GB per node). 'Big data' machines have more memory (e.g. LLNL's Catalyst has 800GB per node). Sparse UQ methods that retain only the relevant information (e.g. compressive sensing) are being implemented to scale to even higher dimensions and orders.

Acknowledgements

Support for this work was provided through Scientific Discovery through Advanced Computing (SciDAC) program funded by U.S. Department of Energy, Office of Science, Advanced Scientific Computing Research and Biological and Environmental Research.

This research used resources of the National Energy Research Scientific Computing Center, which is supported by the Office of Science (BER) of the U.S. Dept. of Energy under Contract No. DE-AC02-05CH11231, the National Center for Computational Sciences at Oak Ridge National Laboratory, which is supported by the Office of Science of the Department of Energy under Contract DE-AC05-00OR22725, and the Argonne Leadership Computing Facility at Argonne National Laboratory, which is supported by the Office of Science of the U.S. Department of Energy under contract DE-AC02-06CH11387.

GC007: Earth System Modeling at the Extreme Scale

Co-conveners: William Collins (LBNL), Forrest M. Hoffman (ORNL), and Stephen F. Price (LANL)

Earth system modeling is entering a new era as the climate community transitions to extreme-scale computing and as the need for more capable models becomes increasingly evident in the face of “no-analogs” climate regimes emergent under global warming. We invite presentations at the frontiers of climate simulation that address the prospects, early development, and proof-of-principle experiments with the next generation of Earth System Models (ESMs). We seek talks and posters demonstrating how to best exploit recent advances in theory, applied mathematics, computational science, process-scale modeling, uncertainty quantification, and observational assimilation to make ESMs more accurate, robust, scalable, and extensible. These more robust ESMs are characterized by increasing reliance on more mechanistic, and more computationally intensive, treatments of core climate processes. Examples include global cloud resolving models, regional large eddy simulation models, full physics, high-resolution land ice models, and high-throughput treatments of chemical and biogeochemical transport across the climate system.

Invited speakers:

- ▶ Omar Ghattas, Univ. of Texas at Austin (next-generation ice sheet models)
- ▶ Peter Lauritzen, NCAR (atmospheric transport)
- ▶ Charlotte DeMott, Colorado State University (cloud/turbulence interactions)
- ▶ Hisashi Yashiro, RIKEN (non-hydrostatic global cloud-resolving models)

Abstracts are due August 6, 2014 at <http://fallmeeting.agu.org/2014/>

Acknowledgements



This material is based upon work supported by the U.S. Department of Energy, Office of Science, Office of Advanced Scientific Computing Research, Scientific Discovery through Advanced Computing (SciDAC) program.