

SciDAC Visualization and Analytics Center  
for  
Enabling Technologies

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UC Davis Final Report

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## Summary

The purpose of the SciDAC Visualization and Analytics Center for Enabling Technologies (VACET) focused on leveraging scientific visualization and analytics software technology as an enabling technology for increasing scientific productivity and insight. The vision for VACET was to adapt, extend, create (when necessary) and deploy visualization and data understanding technologies for our science stakeholders. UC Davis was a significant part of this effort, working directly with science stakeholders to motivate the discovery and creation of new visualization and analytics technologies, which are addressed by our team.

This document reports the accomplishments of the UC Davis component of VACET. In short, we have developed significant advances in the visualization of flow, the application of statistical methods to visualization, the integration of visualization methods into problem-solving methodologies for science, and the parallelization of these methods. The grant supported several graduate students, postdocs, professional researchers and undergraduates, a number of which have taken positions at the National Laboratories.

State-of-the-art computational science simulations generate large-scale vector field datasets. Visualization and analysis are key aspects of obtaining insight into these datasets and represent an important challenge. The VACET Center enabled the discovery and development of a number of innovative visualization and analysis techniques at UC Davis that, because of our collaborative methods with national laboratory researchers and our science stakeholders, could not have been accomplished otherwise.

## Personnel

The UC Davis component of the SciDAC II Visualization and Analytic Center for Enabling Technologies (VACET) has supported a number of faculty, postdoc and student researchers over the course of the grant. Notably, the project supported

- Kenneth I. Joy, a faculty member in the Computer Science Department and the VACET/UC Davis site PI, through summer salary.
- Christoph Garth, postdoc, now a faculty member at Kaiserslautern University in Germany. Garth won the 2011 UC Davis award for the outstanding postdoc at the University.
- Eduard Deines, postdoc, now working for cd-Adapco in Austin TX
- Harald Obermaier, postdoc, now working for Apple
- Hank Childs, serving a shared position between UC Davis and Lawrence Berkeley National Laboratory. Now a faculty member at the University of Oregon and researcher at Lawrence Berkeley National Laboratory. Hank has subsequently won a DoE Career Award.
- Harinan Krishnan, graduate student. Now working at Lawrence Berkeley National Laboratory.
- David Camp, graduate student. Now working at Lawrence Berkeley National Laboratory
- Kevin Bensema, graduate student. Graduating June, 2016. Working summers with Pacific Northwest National Laboratory
- Jennifer Chandler, graduate student. Jennifer was also supported through an NSF Fellowship.
- Iuri Prilepov, graduate student. Iuri received his Master's Degree in 2013 and is currently working at Google.
- Alex Agranovsky, graduate student
- Luke Gosink, graduate student. Received a Ph.D. in 2009 and now works for Pacific Northwest National Laboratory

## Projects

### Streamlines

This effort has accomplished the initial goal of implementing and deploying a parallel capable streamline infrastructure with several different user definable parallelization strategies. This work resulted in several publications and was implemented through a new advection-based method that was inserted into the VisIt visualization package. We implemented a streamline integration method for block-structured AMR data, developed new methods for pathline, pathsurface, stream surface, time surface, and streak surface methods. All of these methods were integrated into VisIt and is now available to researchers throughout the National Laboratories.

### Parallelization

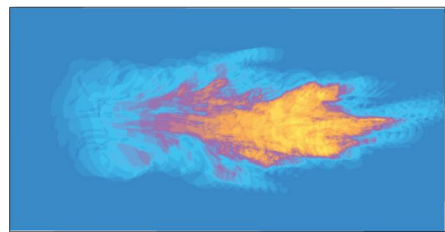
We completed design and implementation of several hybrid parallelization algorithms focused on advection-based visualization algorithms, being the first group to attempt to integrate these methods into a large-scale parallel environment. We have also developed new methods that focus on using interpolation of short streamlines/pathlines as a replacement for the time-consuming advection methods necessary in current techniques. These methods look very promising.

### Lagrangian Techniques

The mathematical interpretation of integral curves as the solutions of ordinary differential equations coincides with that of massless point particles that are advected along the vector field. The Lagrangian view examines the evolution from the point of view of an observer attached to a particle moving with the vector field. While both approaches are technically on equal footing, the Lagrangian perspective allows a more natural and intuitive description and analysis of the overall behavior. We have developed integral-curve methods that support Lagrangian techniques and have adapted them to parallel systems.

### Multi-temporal Visualization of Scalar and Vector Fields

A significant contribution of VACET researchers is the development of methods beyond that of the “streamline” to those of “integral curves”, which can be used for a base to enable a number of vector-field visualization methods. These methods include the generation of path lines, streak lines, and time lines, as well as their surface equivalents, path surfaces, streak surfaces and time surfaces. We were able to expand these methods to show the end user summary statistics over time. These multi-temporal techniques will be very valuable in ensemble methods.



**Figure 1: Multi-temporal visualization with a flow example**

## Material Interfaces

Many important classes of computer simulations of physical phenomena require support for “materials,” i.e. discrete regions of space with different physical properties. For example, a simulation of tidal waves needs to partition space into water and air, and a simulation of an automobile accident must model glass, metal, and rubber. We have developed new methods of determine boundaries in materials, given data sets based upon “volume fractions.”

These are difficult problems as there are multiple “correct” solutions and many criteria for a good reconstruction: Does it honor the volume fractions? Does it place materials from neighboring cells next to each other? Does it create large discontinuities? Although simulations reconstruct interfaces themselves, their primary concern is advecting materials through the mesh correctly, not visualization and analysis. Their reconstructions often lead to inaccurate analysis and poor aesthetics.

## Statistical Methods

We have been working with researchers from Lawrence Berkeley National Laboratory and Pacific Northwest National Laboratory to develop new methods of visualization based upon statistics quantities. These methods have been used to develop methods for visualizing correlations between variables in multi-dimensional data analysis methods, and to assist the analysis of ensemble methods.

## Publications

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