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# Development of a Class of Smoothness-Increasing-Accuracy-Conserving (SIAC) Methods for Post-Processing Discontinuous Galerkin Solutions

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### 14. ABSTRACT

Although discontinuous and continuous Galerkin methods have advantages mathematically and computationally, they suffer from one feature that can in turn become a disadvantage - they do not require high levels of smoothness at the element boundaries. Lack of smoothness across elements can hamper simulation post processing like feature extraction and visualization. The purpose of this proposal is to develop smoothness-increasing accuracy-conserving filters that respect the mathematical properties of the data while providing levels of smoothness so that commonly used visualization tools can be used appropriately, accurately, and efficiently. The goals of this effort are to define, investigate, and address the technical obstacles inherent in visualization of data derived from high-order discontinuous Galerkin methods and to provide robust and easy to use algorithms to overcome the difficulties that arise due to lack of smoothness. In particular, we propose to contribute both mathematically and algorithmically to the class of smoothness increasing and accuracy-conserving (SIAC) methods and to provide a robust and freely available software solution to the high-order simulation community.

#### 15. SUBJECT TERMS

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# DEVELOPMENT OF A CLASS OF SMOOTHNESS-INCREASING ACCURACY-CONSERVING (SIAC) METHODS FOR POST-PROCESSING DISCONTINUOUS GALERKIN SOLUTIONS

## EOARD/AFOSR FA86550913055

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#### **Abstract**

Although discontinuous and continuous Galerkin methods have advantages mathematically and computationally, they suffer from one feature that can in turn become a disadvantage - they do not require high levels of smoothness at the element boundaries. Lack of smoothness across elements can hamper simulation post-processing like feature extraction and visualization. The purpose of this proposal is to develop smoothness-increasing accuracy-conserving filters that respect the mathematical properties of the data while providing levels of smoothness so that commonly used visualization tools can be used appropriately, accurately, and efficiently. The goals of this effort are to define, investigate, and address the technical obstacles inherent in visualization of data derived from high-order discontinuous Galerkin methods and to provide robust and easy to use algorithms to overcome the difficulties that arise due to lack of smoothness. In particular, we propose to contribute both mathematically and algorithmically to the class of smoothness-increasing and accuracy-conserving (SIAC) methods and to provide a robust and freely available software solution to the high-order simulation community.

This work is done in active collaboration with Dr. Robert M. Kirby at the University of Utah, who is sponsored by the Air Force Office of Scientific Research, Air Force Material Command, USAF, under grant number FA9550-08-1-0156 and currently under grant number FA9550-12-1-0428.

## Status/Progress

AFOSR funding to support this research was obtained in April 2009. This funding is currently used to support Mr. Xiaozhou Li (December 2010 – current) and Ms. Mathea Vuik (October 2012 – current), PhD researchers in Numerical Analysis at Delft University of Technology. Previous funds supported Ms. Paulien van Slingerland (April 2009 – June 2010). Ms. van Slingerland successfully defended her thesis in June of 2013 and Mr. Li is expected to defend his thesis in December 2014. During the Spring of 2012, Mr. Li worked with Dr. Kirby and his former PhD student Hanieh Mirzaee at the University of Utah.

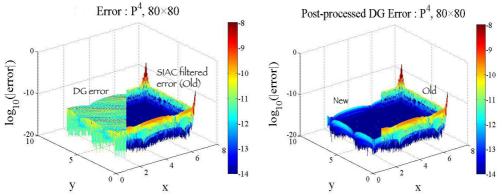
This funding has allowed us to make several contributions over the lifetime of this grant:

• In the first year of the project, the focus was on creating a more effective one-sided post-processing technique that allows for maintaining the appropriate boundary values and producing errors that were of the same magnitude as in the interior. By modifying the filter based upon the evaluation point, we overcame the decrease in accuracy at the boundaries. This position-dependent Smoothness-Increasing Accuracy-Conserving (SIAC) filter for enhancing discontinuous

Galerkin solutions easily switches between one-sided post-processing to handle boundaries or discontinuities and symmetric post-processing for smooth regions. Different filtering kernels are used for different domain regions. The improvements to the one-sided kernel are accomplished by combining previous concepts by the PI used in one-sided post-processing for DG solutions with those from spectral methods and finite difference methods to improve the one-sided filter. This work resulted two papers [15,18] and has been presented in various arenas [22,24-26,30-32]. We then focused on the application of the new position-dependent SIAC filter to streamline visualization [18].

- In the second year of the grant, the theoretical extension of the symmetric kernel to nonlinear hyperbolic equations [19] was performed. The extension to nonlinear hyperbolic equations is possible provided the derivative of the flux with respect to u is bounded. In this case, it is possible to improve the order of the accuracy to (2k+m), where m depends upon the numerical flux. This was presented at the U.S. National Congress on Computational Mechanics [29] as well as the European Conference on Numerical Mathematics and Advanced Applications [23].
- The third year of the grant concentrated on theoretical and computational extensions that are more useful for dealing with various visualization applications (streamlines, streaklines and isosurfaces). For the theoretical extensions, pointwise error estimates demonstrating that higher-order accuracy of order 2k+2-[d/2] is indeed achieved in the  $L^{\infty}$ -norm, where d is the dimension and k is the highest degree polynomial used in the approximation [18]. Theoretical results extending the current  $L^2$ -error estimates to the *entire* domain were also done. This was a significant extension as pointwise error estimates will be more useful for quantifying errors in isosurface extraction. Further, together with Mike Kirby, the filter was demonstrated to be computationally viable for structured triangular meshes [17]. This work was presented at the SIAM Conference on Computational Science and Engineering [27-28]. Further, in the third year there were significant benefits from the collaboration that combines both mathematics and computation. We were able to make significant strides forward in both the theoretical and computational viability of the SIAC filter for applications. The theoretical results obtained include the extension of the  $L^2$ -error estimates for: variable coefficient hyperbolic equations for DG solutions over a structured triangular mesh [17], as well as extending the theoretical results to adaptive meshes [20]. Combining these proofs with the computational results that demonstrate the efficiency of the filter [16] as well as applicability with GPU computing [20] allowed us to piece together the components necessary to recover higher-order accuracy for unstructured triangular meshes in the remaining duration of the grant and give insight into possible modification of the filter. These results were also presented in various arenas [2-4,12-14,21-22].
- In the last year of this grant, the focus has been on using the mathematical analysis and creating more computationally efficient solutions for various geometries, including unstructured triangular meshes. These explorations continue to focus on post-processing near boundaries, as the insight gained is more useful for application to unstructured triangular meshes. The main challenge for the one-sided post-processor in [15] is that for higher-order approximations, the number of B-splines needed is excessive and that increased precision is required. The excessive number of B-splines creates three problems: it increases the constant in the error term significantly, makes for a large condition number in the matrix that determines the kernel coefficients, and requires a larger support causing the

filter to become more global. The combination of these makes for longer computations and results in round-off errors when computing using double precision. The major finding was that reducing the number of central B-Splines back to 2k+1, shifting the kernel nodes and using one general B-spline improved the computational efficiency significantly. This modifies the shape of the kernel so that actual boundary information has more weight than for the previous kernel. This makes the kernel more computationally efficient while improving the smoothness of the solution (see Figure 1). This work has resulted in two papers [6,7] as well as one in preparation [5]. It has been presented in a variety of venues [1-4,8,11].



**Figure 1:** Left: A comparison of the errors in the DG approximation to the SIAC filtered approximation using the boundary method introduced in [15]. Higher computational costs are encountered along with round-off error at the boundaries. Right: A comparison of the SIAC filtered errors with the modified filter introduced in [6] and the filter used in [15]. The new boundary filter is more computationally efficient and results in less round-off error.

The results of this work are currently being used to improve the streamline and streakline integration process (see Figure 2 and [5]). Investigating streamlining requires two approaches: (1) Filtering the entire field and then performing the streamline integration; and (2) Using one-sided filtering along the streamline during the streamline integration process. The latter approach leads to more questions about the content of the errors, including which are from the filter and which are from the time-stepping. In order to reduce the errors from the time-stepping, we have created a one-sided derivative filter so that backwards differentiation formulas (BDF) can be used. Regardless of the approach, the SIAC filtered DG solution always does as well as the DG solution, and sometimes better at obtaining the correct streamline (see Figure 2).

Further to this, the first proof that the SIAC filter is indeed accuracy conserving,

$$||u(x,t)-u_h^*(x,t)|| \le ||u(x,t)-u_h(x,t)||,$$

was obtained. In this estimate, u(x,t) is the exact solution,  $u_h(x,t)$  is the approximation solution obtained through use of the discontinuous Galerkin (DG) discretization and  $u_h^*(x,t)$  is the SIAC filtered DG solution [6]. This is a very important result that combines the knowledge gained throughout the grant and helps to give insight into the role of the B-Splines and kernel shape determine the accuracy-conserving and accuracy-increasing properties.

Lastly, related to boundary issues and computational performance is the issue of geometry. This required performing a study of the kernel scaling for various mesh types. These results showed that the kernel scaling is the optimal point where superconvergence and improved errors align. This allowed us to properly scale the kernel for use on unstructured triangular meshes [9] as well as

structured tetrahedral meshes [10] in order to obtain reduced errors and a smoother solution. More importantly, the results from the study of the mesh scaling give are a crucial step in our future work. Specifically, it is clear that the mesh scaling for the kernel filter will be chosen not only on the polynomial degree, but also based on the mesh resolution. It also gives insight into how to modify the kernel function based on the mesh.

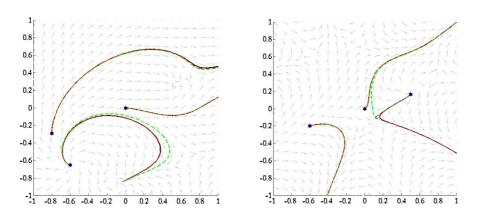


Figure 2: Left: Filtering the entire field and then calculating the streamline. Right: Filtering the streamline during the streamline calculation. Both streamline calculations use BDF. Black streamlines were created based upon integration on the continuous field, green streamlines were created based upon integration on the discontinuous Galerkin field and red streamlines denote the DG filtered field.

## **Most Significant Accomplishments**

Over the period of the grant, the most significant accomplishments are:

- (1) The establishment through empirical study of a position-dependent smoothness-increasing accuracy-conserving (SIAC) filter that easily switches between a symmetric kernel for use in the domain interior to a one-sided kernel for use near boundaries [6];
- (2) The establishment of various error estimates:
  - a. The first  $L^{\infty}$ -error estimates for this position-dependent filter for hyperbolic equations [18];
  - b.  $L^2$ -estimates that establish that SIAC filtering methodology can be applied to structured triangular meshes [17];
  - c. The establishment of  $L^2$ -estimates for nonlinear hyperbolic conservation laws with bounded flux function [19];
  - d. The establishment of the effectiveness of the SIAC filter on adaptive meshes [20];
  - e. The establishment of the accuracy-conserving nature of the SIAC filter [6] and
- (3) The computational efficiency of the filter for one-sided post-processing [6], parallel and GPU computing [16,20] as well as for triangular, adaptive, and tetrahedral meshes [9,10,17,20].
- (4) In the last year of funding, the most significant accomplishments were carried out: That of defining the necessary geometric conditions for appropriate filtering and computationally efficient filtering and proof that the SIAC filter is indeed accuracy-conserving [5-7].

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