Automatic Error Estimation and Verification Using an Adaptive Wavelet Method

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## Motivation

- The Wavelet Adaptive Multilevel Representation (WAMR) enables systems of partial differential equations to be solved to a user-defined error tolerance.
- For many problems, especially those with a few regions of steep gradients, the WAMR method can achieve a solution under a given error threshold with less computational effort than traditional finite difference or finite element methods.
- In contrast to traditional finite difference or finite element methods, WAMR is intrinsically verified.
- We verify the verification based on error tolerance refinement instead of grid refinement and exercise it on standard challenging test problems in non-linear wave dynamics (Sod, Shu-Osher, etc.).

# Verification and Validation

- Verification: solving the math right.
- Validation: solving the right math.
- Verification is confined to mathematical questions generally involving the comparison of a finite precision prediction against a high precision or exact solution; it is the subject of this presentation.
- Validation speaks to comparison of predictions to experimental data; it will not be considered here.
- We will consider problems with no exact solution and so obtain verification by comparing solutions at a given error tolerance against those with an extremely small error tolerance.

Roache, "Building PDE codes to be verifiable and validatable." Computing in Science & Engineering 6(5): 30-38, 2004.

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# WAMR Method

- Represents field variables by projecting them onto a multiscale basis of wavelets.
- Adaptive grid algorithm refines the grid only where it is necessary to meet the user-prescribed error tolerance.
- Collocation points with wavelet amplitudes below the error threshold are removed.
- Similar to wavelet-based JPEG-2000 image compression, the WAMR method compresses the PDE solutions.

Paolucci, Zikoski, and Wiraseat, "WAMR: An adaptive method for the simulation of compressible reacting flow. Part I. Accuracy and efficiency of algorithm," *J. Comp. Phys.*, 272(1): 814-841, 2014.

#### WAMR Method

Given the threshold parameter  $\varepsilon$ , the approximation of  $u(\mathbf{x})$  becomes



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AUTOMATIC ERROR VERIFICATION VIA THE WAMR METHOD

#### Error in WAMR

- The user-defined error threshold parameter is  $\epsilon$ .
- The error in the sparse wavelet representation is

$$||U - U_{\epsilon}^{J}||_{\infty} \le C_1 \epsilon.$$

• The number of collocation points to achieve the error tolerance is

$$N_E \le C_2 \epsilon^{-d/p}.$$

• The error of a derivative approximation is

$$\left\| \frac{\partial^{i} U}{\partial x^{i}} - D_{x}^{(i)} U_{\epsilon}^{J} \right\|_{\boldsymbol{\nu},\infty} \leq C N_{E}^{-\min((p-i),n)/2}.$$

## Navier-Stokes Model for Verification Test Problems

$$\begin{split} \frac{\partial \rho}{\partial t} &+ \frac{\partial}{\partial x} \left( \rho u \right) = 0, \\ \frac{\partial}{\partial t} \left( \rho u \right) &+ \frac{\partial}{\partial x} \left( \rho u^2 + p - \frac{4}{3} \frac{\tau}{Re} \right) = 0, \\ \frac{\partial}{\partial t} \left( \rho \left( \frac{e}{\gamma - 1} + \frac{u^2}{2} \right) \right) \\ &+ \frac{\partial}{\partial x} \left( \rho u \left( \frac{e}{\gamma - 1} + \frac{u^2}{2} \right) + \left( p - \frac{4}{3} \frac{\tau}{Re} \right) u + \frac{\gamma}{\gamma - 1} \frac{q}{RePr} \right) = 0, \\ \tau &= \frac{\partial u}{\partial x}, \qquad q = -\frac{\partial T}{\partial x}, \qquad p = \rho T, \qquad e = T. \\ Re &= \frac{\rho_0 a_0 L}{\mu} = 6.526 \times 10^5, \quad Pr = \frac{\mu c_p}{k} = 1.392. \end{split}$$

Physical diffusion has been added to the test problems to prevent our adaptive method from refining to zero.

## Error Evaluation

- A diffusion-based time step is selected so that temporal error smaller than spatial error.
- The error is computed by comparing to a very fine uniform grid solution.
- The error is evaluated for a specific variable at a specific time for all points in the grid.
- The maximum error at a specific time was compared with the prescribed error to verify the predictions.
- Each problem was run for multiple different error thresholds to verify the method for any error threshold with

$$E_U = \left\| \frac{U_n - U_a}{U_a} \right\|_{\infty}$$

# EVTS Verification Test Problems

- Three problems were chosen from the Enhanced Verification Test Suite for Physics Simulation Codes (EVTS)
  - Sod problem,
  - Modified Sod problem,
  - Shu-Osher problem,
- They are hydrodynamic shock problems commonly used for code verification.
- Physical viscosity was added as the WAMR requires continuity.
- Our solutions thus incorporate physical diffusion processes ignored in the EVTS problems.

Kamm, et al. "Enhanced verification test suite for physics simulation codes," Los Alamos National Laboratory, LA-14379, 2008.

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## Sod Problem Initial Conditions

- Models a shock tube filled with N<sub>2</sub> at two different states.
- Diffusion coefficients were assumed to be the values for N<sub>2</sub> at 300 K.
- Initial shock was modeled as tanh.
- EVTS is dimensional; we scaled equations to easier quantify the relative effects of added diffusion.
- EVTS initial conditions are non-physical!

	$ ho ~[{ m g/cm^3}]$	$u  [\mathrm{cm/s}]$	$p \; [dyne/cm^2]$
Left	1.0	0.0	1.0
Right	0.125	0.0	0.1
$0 \le x \le 1 \text{ cm}; x_i = 0.5 \text{ cm}; t_f = 0.25 \text{ s}$			



## Sod Shock Tube Solutions as Error Tolerance Varies



Automatic Error Verification via the WAMR Method

#### Error



- The achieved error is well predicted by the specified error for a wide range of errors.
- The achieved error grows slowly with time due to integration error.

## Shu-Osher Problem





## Modified Sod Problem



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10-2

269 288

10-1

- The WAMR method provides automatically verified results based on the user-prescribed error criteria.
- Traditional verification notions such as order of convergence are less relevant for this adaptive method.
- The WAMR method effectively captures the intricacies of advanced hydrodynamic problems
- The adaptive nature of the WAMR method allows one to compute a solution to a specified error in less computational time than competing non-adaptive methods.