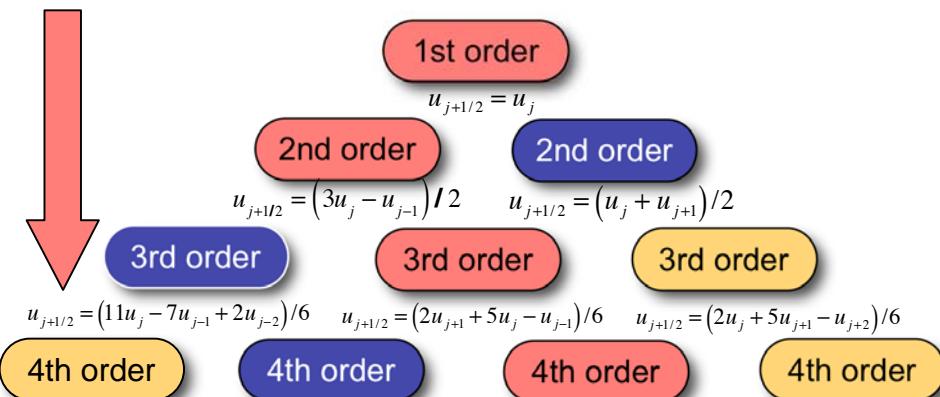
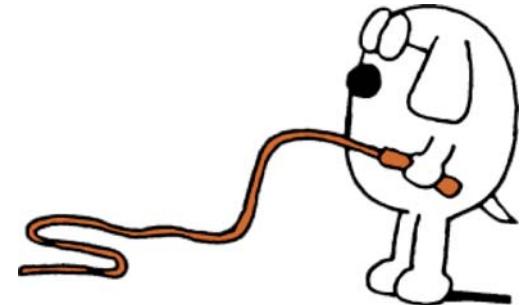




New Concepts for Developing Non-Oscillatory Methods



$$\text{TV}\left(\mathcal{R}\left(u^n\right)\right) \leq \text{TV}\left(u^n\right) + O\left(h^r\right)$$



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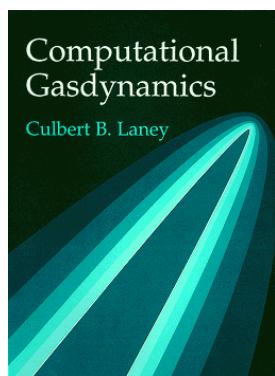
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MS54, Computational Methods for Compressible Flow

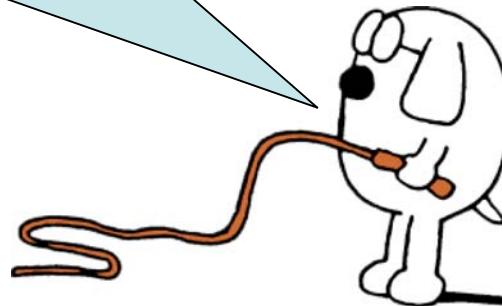


Things should be made as simple as possible, but not any simpler.”
- Albert Einstein

“Logically all things are created by a combination of simpler, less capable components”



— Scott Adams (as Dogbert in the Dilbert Comic Strip), noted by Culbert Laney in *Computational Gasdynamics*





Talk Outline

- **Introduction: high-resolution methods**
- **Revisiting design concepts: what is the real total variation behavior in non-oscillatory schemes.**
- **Consequences**
- **New concepts**



What is a high-resolution method? Or the role of method nonlinearity

- The need for method nonlinearity is a consequence of Godunov's theorem:
 - No *linear* method can be second-order and monotone...
but a *nonlinear* method can be second-order and monotone (TVD, FCT, PLM, PPM,...)!*
- These methods hybridized the (classical) linear schemes (**capitalizing on the best of each!**)
 - To achieve **higher order** and **physically relevant** solutions e.g. **LxW** and **upwind**
 - This is where Dogbert's quote comes in: “*Logically all things are created by a combination of simpler, less capable components*”





A Brief Introduction to ENO Methods

- The starting point for modern methods are 1st order monotone methods.
 - These were extended to 2nd order with TVD methods.
 - TVD methods degenerate to 1st order at extrema.
- ENO was introduced to “fix” this problem
 - UNO methods moved the TVD methods to uniform 2nd order accuracy.
 - ENO methods moved the UNO methods to arbitrarily high order.
 - WENO methods moved ENO methods toward practicality (getting rid of some of ENO’s issues).



ENO Design Principles



- Divide the methods into three main steps:
 - Reconstruction or spatial differencing.
 - Evolution (solution in the small) or Riemann solution.
 - Integration or time advance.
- The evolution step and integration are TVD (analytically at least), but the reconstruction might not be,...
- *... thus a focus on the reconstruction step.*
- In monotone and TVD methods, the reconstruction is TVD, ENO methods allow variation to potentially increase, although in a controlled bounded manner.
 - Keeping the variation controlled can lead to convergent methods (compactness).



Total variation is used to define methods

- Define $\mathbf{TV}=\mathbf{total\ variation}$ $\mathbf{TV} = \sum |u_{j+1} - u_j|$
- **TVD** means the *total variation diminishing*

$$\mathbf{TV}(u^{n+1}) \leq \mathbf{TV}(u^n) \text{ or } \mathbf{TV}(\mathbf{R}(u^n)) \leq \mathbf{TV}(u^n)$$

- Here $\mathbf{R}(u)$ is a reconstruction (interpolation) of u
- TVD is a manner of making nonlinear schemes monotone
- ENO is closely related conceptually

$$\mathbf{TV}(\mathbf{R}(u^n)) \leq \mathbf{TV}(u^n) + O(h^r)$$

- Thus ENO is almost monotone, but allows oscillations of a size $O(h^r)$

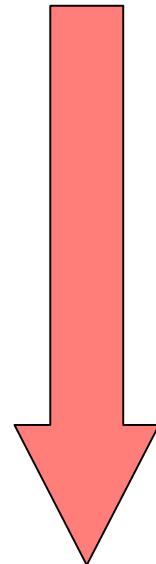


The Non-Oscillatory Concept

- The problem with TVD methods is that they reduce to 1st order at extrema (i.e. infinity norm),
 - this removes “all” oscillation creation.
$$\frac{\partial u}{\partial t} = -C_{j-1/2} (u_j - u_{j-1}) - C_{j+1/2} (u_{j+1} - u_j); C_{j\pm 1/2} \geq 0$$
- ENO methods were developed to improve the accuracy to high-order in all norms.
- WENO was developed to fix problems observed with ENO’s adaptive stencil, and allow higher order methods that more fully use the stencils.
 - Downwinding, loss of accuracy, unstable selection
 - The problem is that these methods are still plagued by a number of issues limiting their utility.



ENO Methods use smoothness to adaptively choose a stencil.



1st order

$$u_{j+1/2} = u_j$$

2nd order

$$u_{j+1/2} = (3u_j - u_{j-1})/2$$

2nd order

$$u_{j+1/2} = (u_j + u_{j+1})/2$$

3rd order

$$u_{j+1/2} = (11u_j - 7u_{j-1} + 2u_{j-2})/6$$

3rd order

$$u_{j+1/2} = (2u_{j+1} + 5u_j - u_{j-1})/6$$

3rd order

$$u_{j+1/2} = (2u_j + 5u_{j+1} - u_{j+2})/6$$

4th order

4th order

4th order

4th order

- ENO selects stencils *adaptively* by choosing the one that is closest to the next lower order. It is hierarchical.



These stencils can be displayed in physical space.

1st	○	○	○	●	○	○	○
2nd 1	○	○	●	●	○	○	○
2nd 2	○	○	○	●	●	○	○
3rd 1	○	●	●	●	○	○	○
3rd 2	○	○	●	●	●	○	○
3rd 3	○	○	○	●	●	●	○
4th 1	●	●	●	●	○	○	○
4th 2	○	●	●	●	●	○	○
4th 3	○	○	●	●	●	●	○
4th 4	○	○	○	●	●	●	●
Index	j-3	j-2	j-1	j	j+1	j+2	j+3



The same differencing may be arrived at through a different path.

1st order

$$u_{j+1/2} = u_j$$

2nd order

$$u_{j+1/2} = (3u_j - u_{j-1})/2$$

2nd order

$$u_{j+1/2} = (u_j + u_{j+1})/2$$

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4th order

4th order

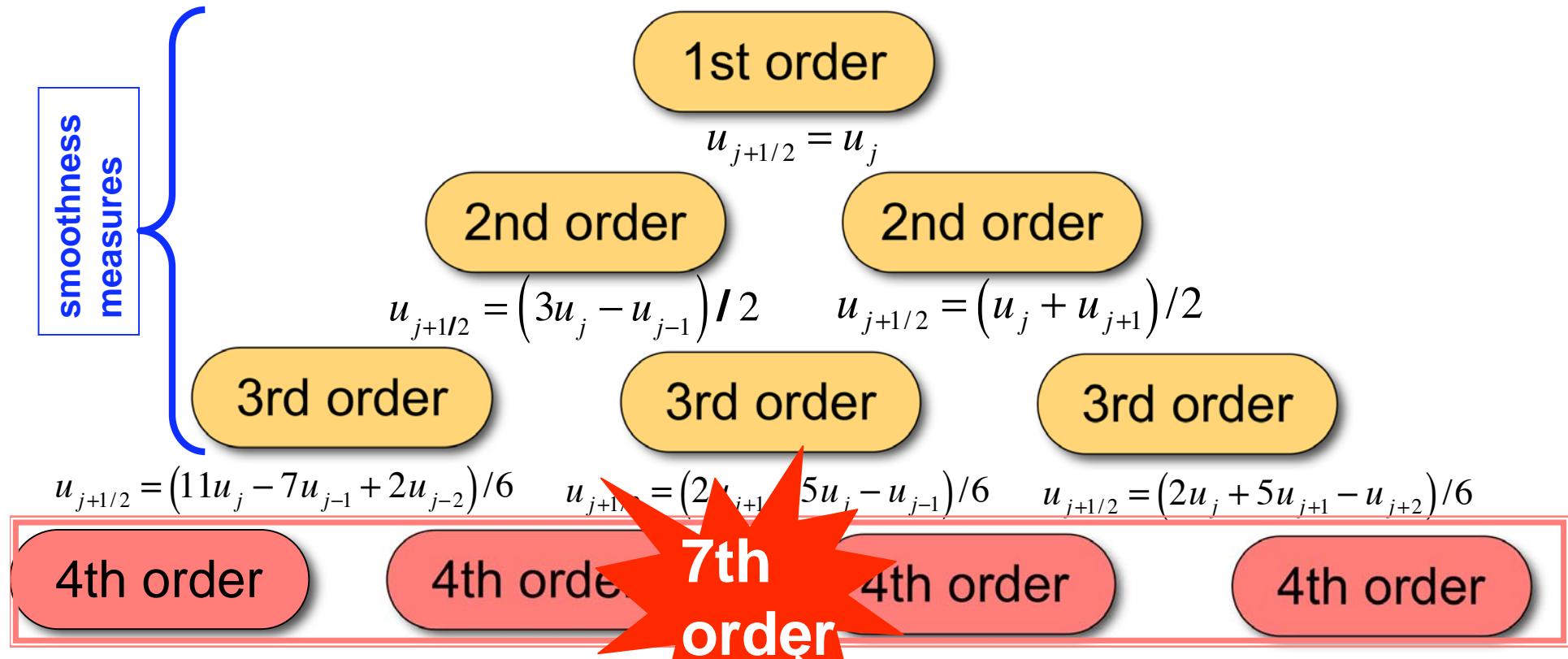
4th order

4th order

- The high-order stencils are evaluated pair-wise. This characteristic also hints at one of ENO's pathologies.



Weighted ENO methods are different in their approach, but the result is similar.

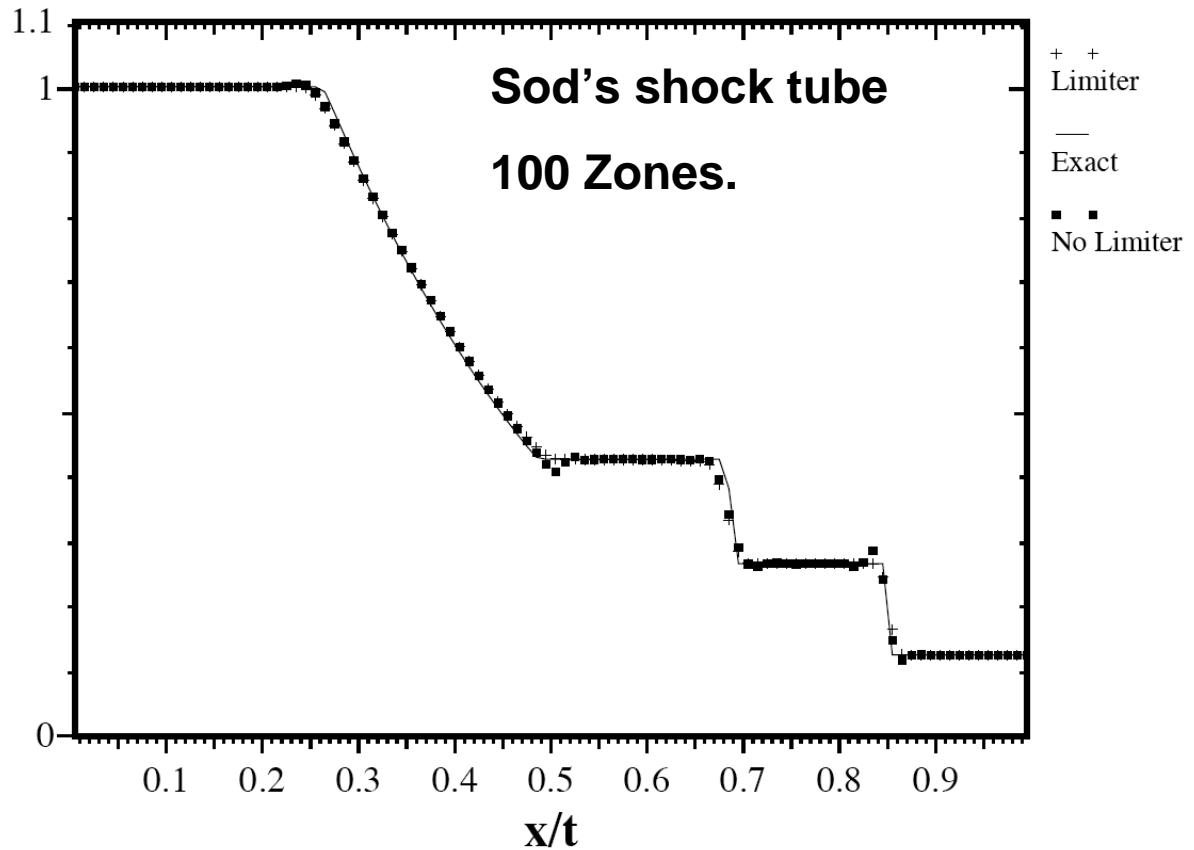
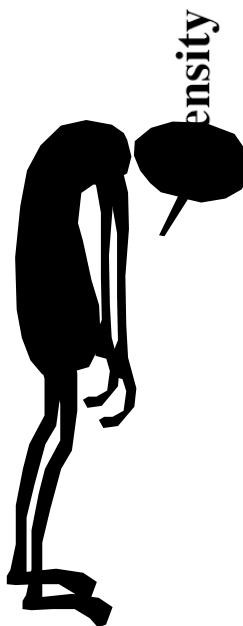


- These methods evaluate **all** the high-order stencils and compare them (and combine them) algebraically.
- Weights can be chosen to achieve $2m-1$ order schemes.



Issues with Results - oscillations or limiters?

- **Sod's shock tube and 11th order WENO**
 - **Oscillations w/o limiter!**
 - **The limiter destroys the “elegance” of the method!**





A new approach to building ENO: The Comparison Principle

- The current ENO (and WENO) algorithms are based on the adaptive stencil approach that *recursively* finds the “smootherest” stencil.
- I’m proposing using a different principle than the smootherest stencil - Using a comparison with TVD schemes to choose the high-order stencil.
$$\text{TV}\left(\mathbf{R}\left(u^n\right)\right) \leq \text{TV}\left(u^n\right) + O\left(h^r\right)$$
- In other words, one would begin with a TVD stencil and choose the higher-order stencil that is closest to that TVD stencil in some sense (to be defined) .
- This leads to schemes similar to existing ENO and WENO schemes, *but with somewhat better properties.*





Applying the Comparison Principle

- The basis of the approach is the following definition for the ENO schemes,

$$\text{TV}\left(\mathbf{R}\left(u^n\right)\right) \leq \text{TV}\left(u^n\right) + O\left(h^r\right)$$

- Thus, the proposition is that choosing the stencil that is closest to the TVD method (or the comparison scheme) will satisfy this condition.
 - No proof (yet), but the results are very similar to existing ENO & WENO method in terms of accuracy (better), and total variation behavior (nearly identical)
- *The procedure resulting from the principle is flexible allowing freedom in choosing for the method's properties.*



One Might Use a Median function to accomplish the task.

- The $\text{median}(a,b,c)$ function chooses the function bounded by the other two and preserves accuracy
$$\text{median}(a,b,c) = a + \text{minmod}(b - a, c - a)$$
 - If two arguments are $O(h^m)$ then the median is $O(h^m)$
- An algorithm for a 4th order comparison-ENO method would look like the following (using 4-4th order fluxes as building blocks):

$$f_a = \text{median}(f_1, f_2, f_{TVD})$$

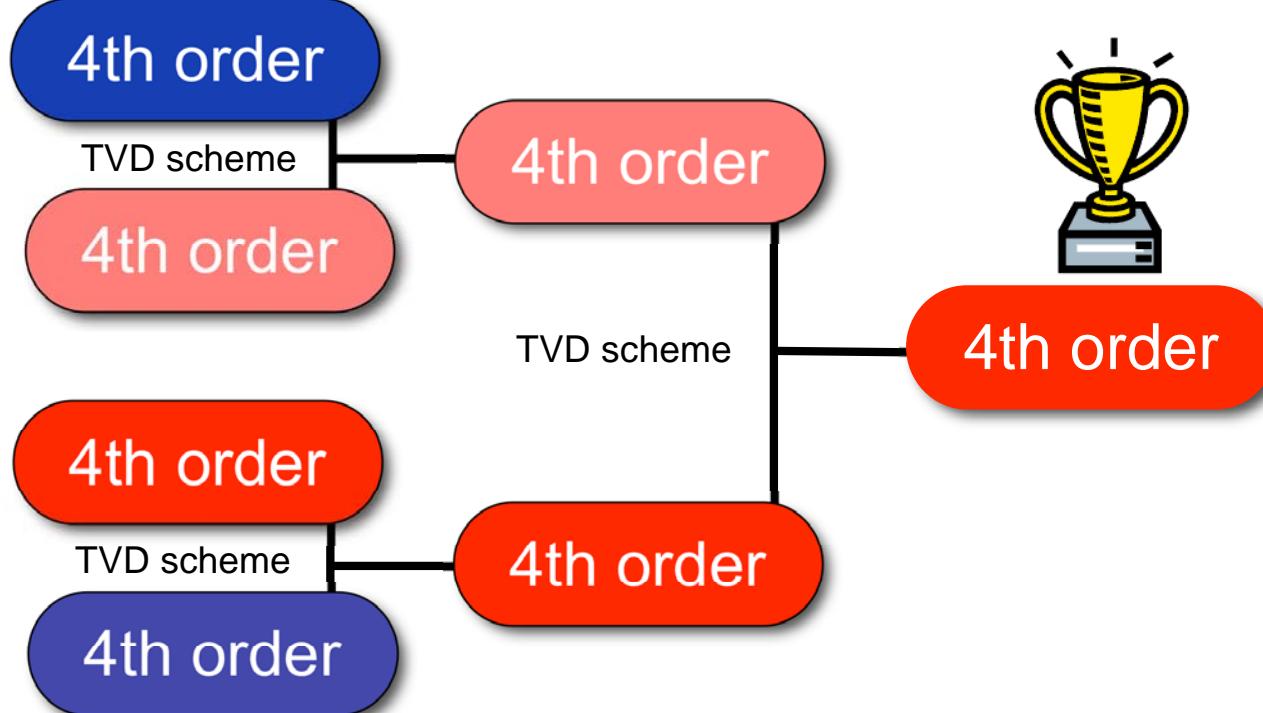
$$f_b = \text{median}(f_3, f_4, f_{TVD})$$

$$f_{ENO} = \text{median}(f_a, f_b, f_{TVD})$$



The comparison algorithm can be arranged more like “playoff”

- The TVD scheme chosen for comparison is used to test the “fitness” of each stencil.





The median function bounds the different approximations.

Value of the approximation

High-Order, ENO

High-Order

High-Order

TVD, But a high-order,
linear combination of HO

TVD

High-Order, ENO

The median(a,b,c) returns the value bounded by the other two values. Preserves the accuracy given by at least two arguments.



The median function has some key properties.

- One can use a median, or bounding function, $\text{median}(a,b,c)$ that returns the middle argument of the three.
 - The one that is **bounded** by the other two
 - *Theorem (Huynh):* If two arguments are $O(h^n)$ the median is too!
 - If one argument is $O(h^n)$ and a second is $O(h^m)$ with $m < n$, the median is $O(h^m)$
 - *Conjecture:* If two arguments produce a linearly stable method, the median will as well.



One can emulate ENO procedures with the XMEDIAN function.

- The median function uses the minmod function (returns the minimum magnitude argument if they have the same sign).
$$\text{median}(a, b, c) = a + \text{minmod}(b - a, c - a)$$
- The ENO selection procedure uses a function that returns the minimum magnitude function, mineno.
- The xmedian(a,b,c) would return “b” or “c” depending on which is closer to “a”
$$\text{xmedian}(a, b, c) = a + \text{mineno}(b - a, c - a)$$
- In this way one could make sure only the formally fourth order fluxes are chosen.



Analysis: Accuracy is unaffected.

- The previous method would produce a formally 4th order flux. Each step produces a 4th order flux.
- The non-oscillatory nature comes from relation of the result to the TVD comparison method.
 - Each step will choose either the TVD scheme, or the 4th order flux closest to it . $TV(R(u^n)) \leq TV(u^n) + O(h^r)$
 - Results indicate that this is true.
 - *The problem is that the median function does not contain two non-oscillatory fluxes to compare. This is a concern for nonlinear stability of the results, but no problems observed so far.*



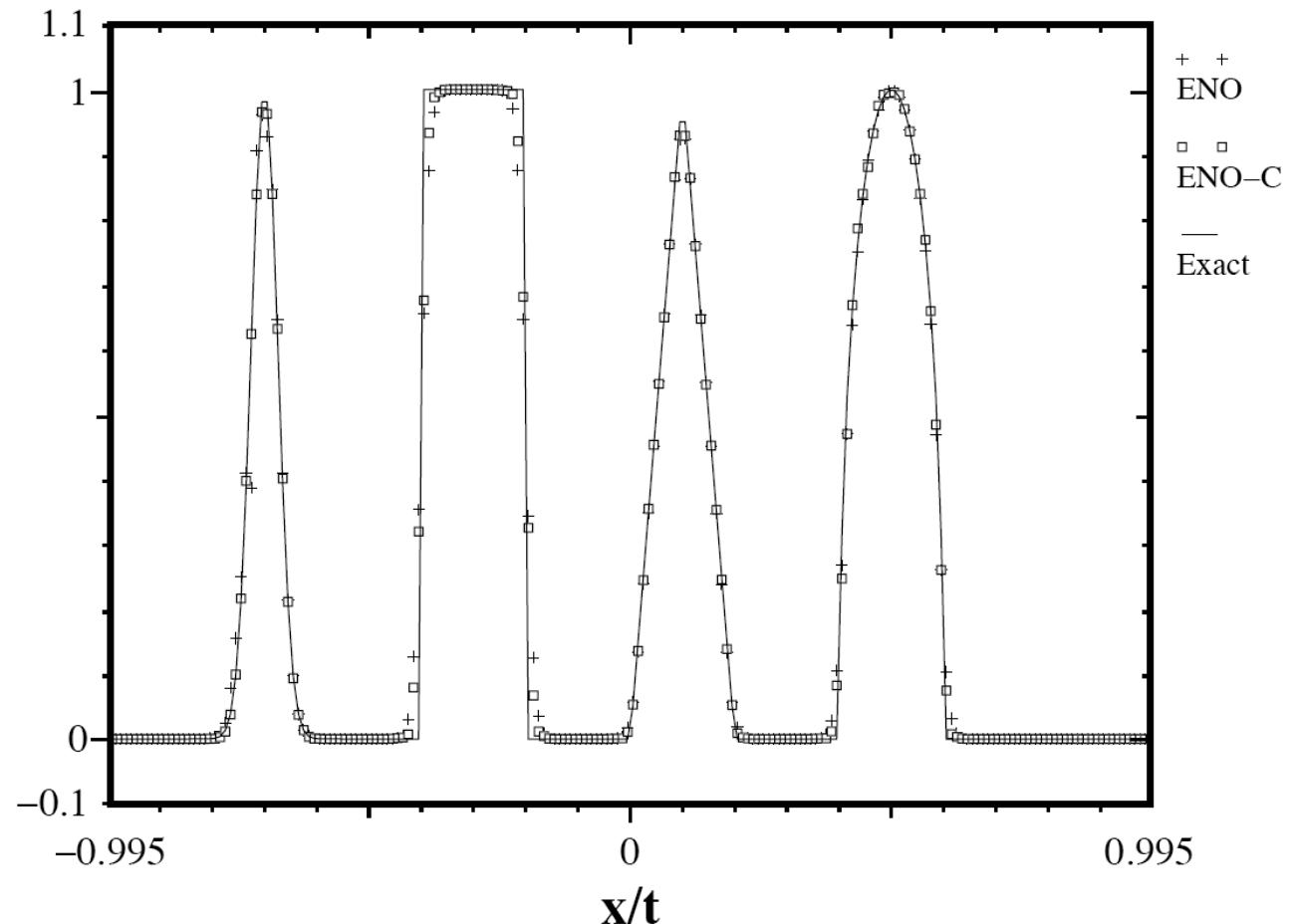
Results: Accuracy on Scalar Waves

- Compare usual ENO with a comparison ENO

L1 Errors

ENO = 1.74e-02

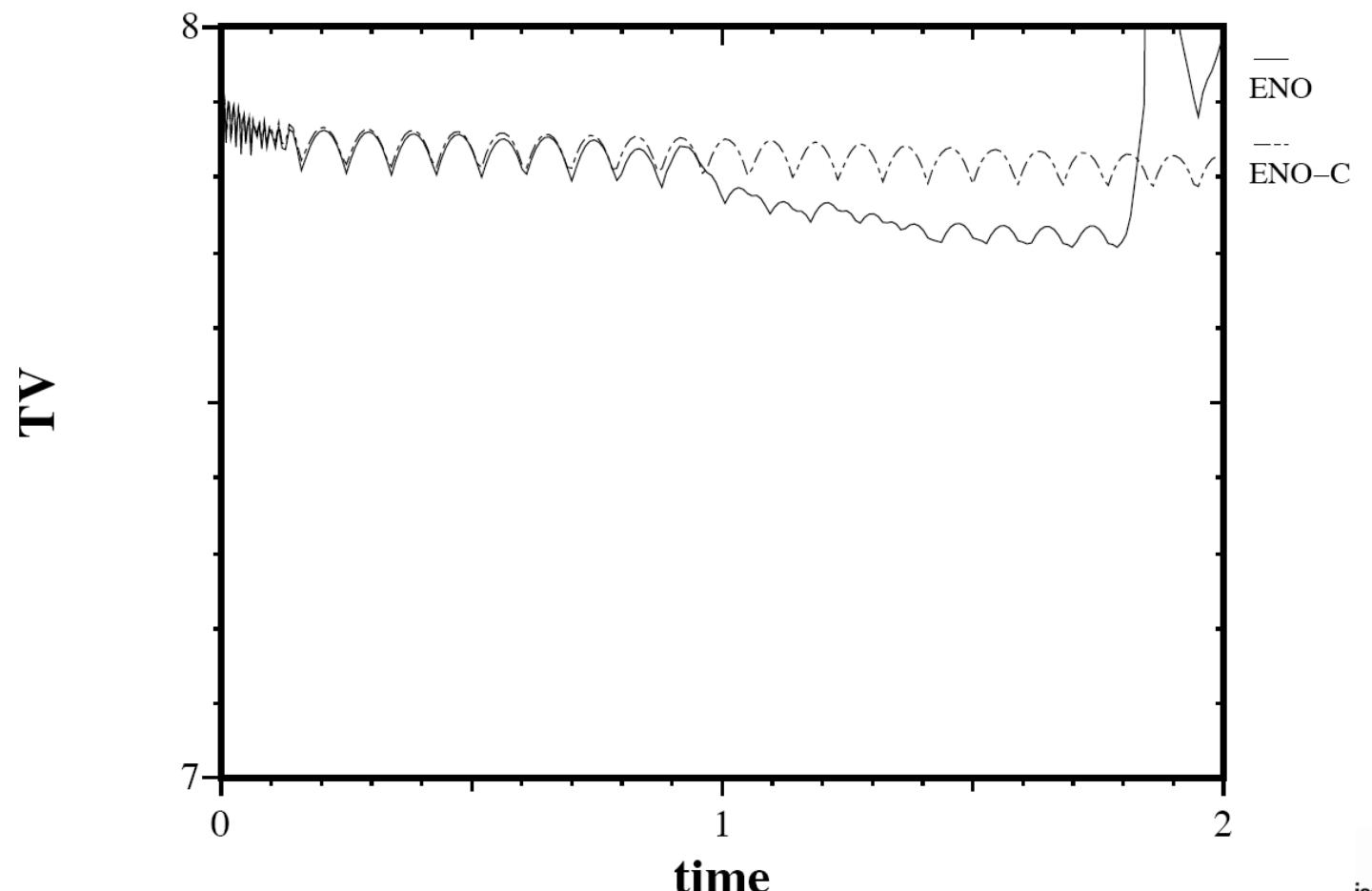
ENO-C = 1.20e-02





Results: Total Variation Behavior

- Look experimentally at the Total variation as a function of time.





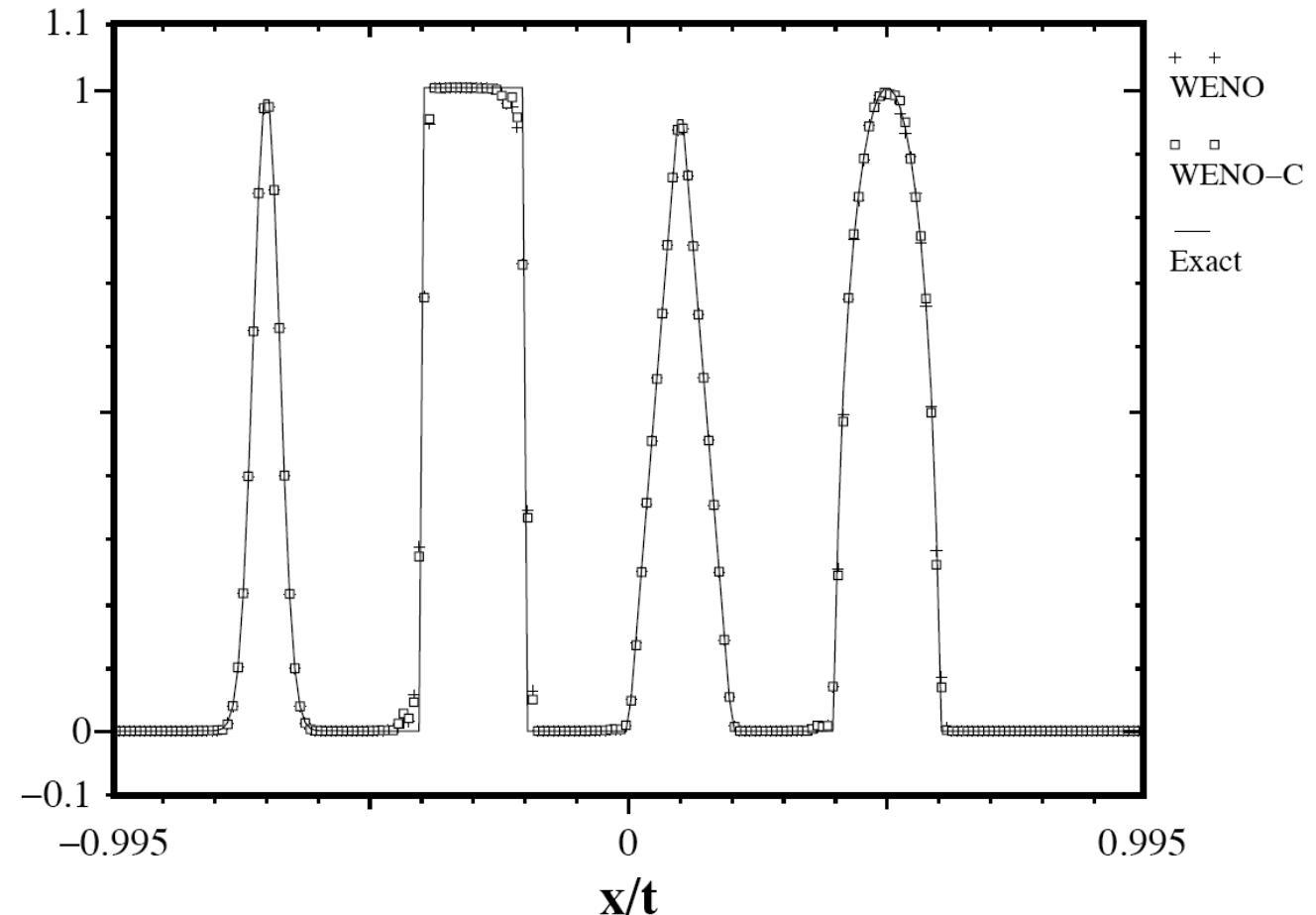
Results: Accuracy on Scalar Waves, 11th order WENO

- Compare usual WENO with a comparison WENO

L1 Errors

WENO = $1.09\text{e-}02$

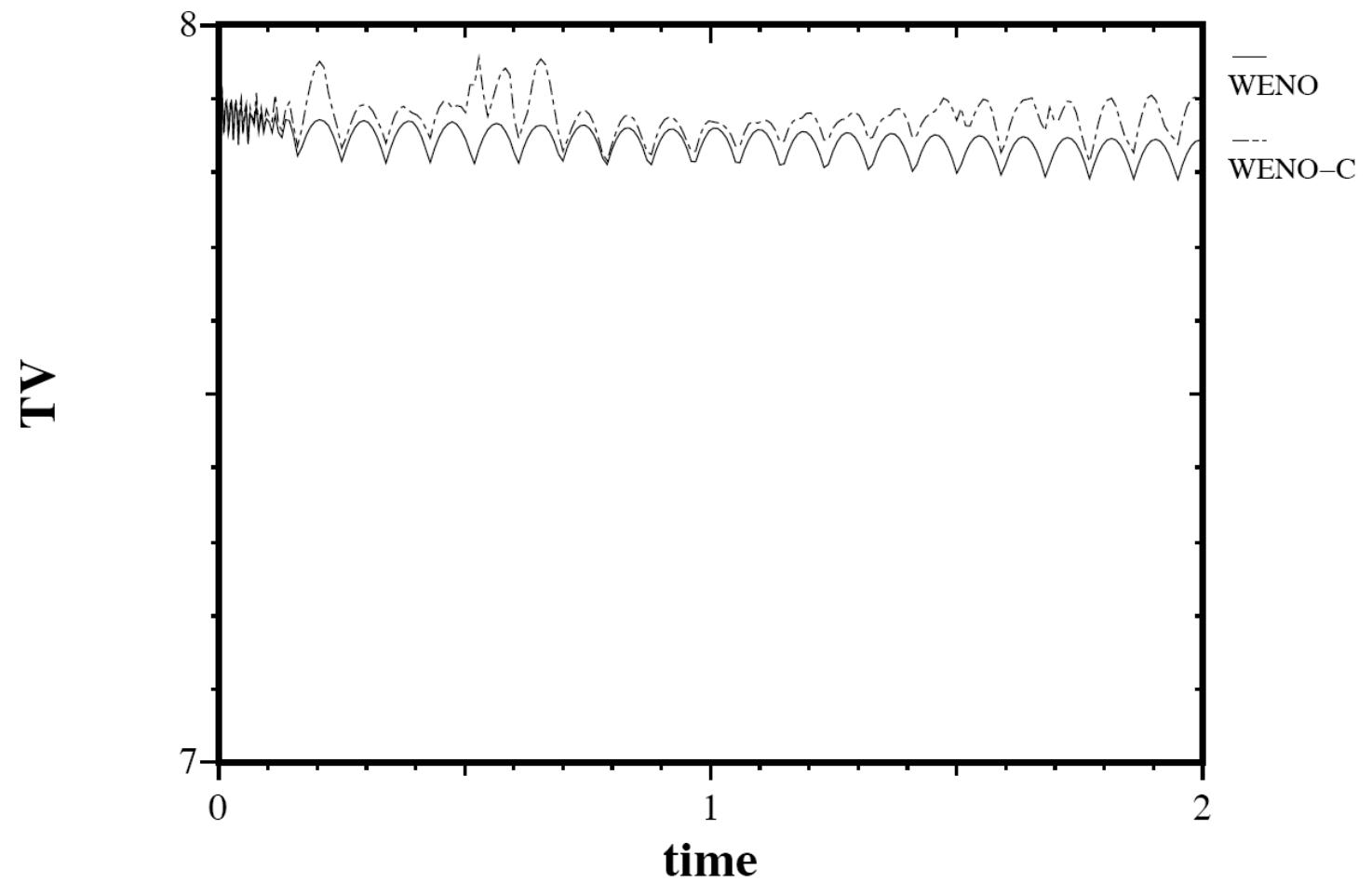
WENO-C = $1.10\text{e-}02$





Results: Total Variation Behavior

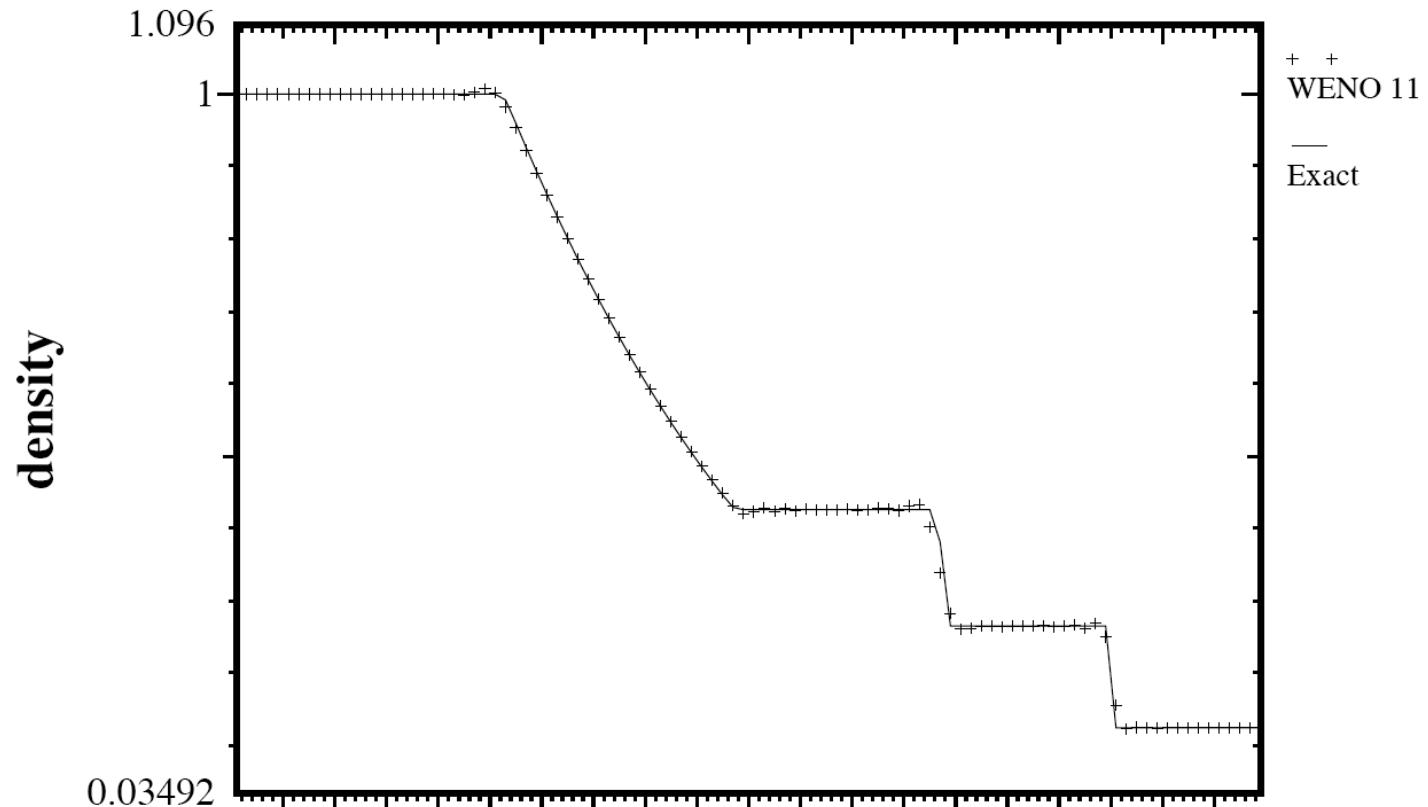
- Look experimentally at the Total variation as a function of time.





Accuracy for Coupled Systems

- Look at Sod's Shock tube again w/11th order WENO-C (comparison scheme)
 - about the same as the regular WENO, and with about 25% lower CPU cost.





What would a proof of the ENO property look like?

- Now it comes down to proving the properties of the “ Q ” function. Note that the truncation error of the first order method is well defined in terms of the total variation.
- The scheme can definitely be high-order and deviations in total variation will be proportional to the high-order truncation error, $O(h^r)$
- Q: What should the “ Q ” function look like?
 - A: the minmod function, just as TVD methods.
- Putting this together with the original method returns us to the median function as serving the necessary role.
 - Note: The second-order version of this method is TVD. A proof based on a 2nd order TVD comparison method follows the same path. Same for WENO version.



Summary and Conclusions

- The concept of total variation is central to many high resolution schemes.
- TV converges at $O(h^2)$ for either TVD or ENO schemes, not $O(h^n)$ as originally intended.
- Thus a rigorous proof of the ENO concept is not forthcoming (they seem to be more properly TVB)
- A new means of developing ENO and WENO methods has been proposed.
 - The new methods are simpler and faster (less hierarchical, simpler to code, fewer operations).
 - The new methods produce similar (or smaller) errors.