The CWENO reconstruction procedure

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1 Motivation: high order FV schemes

2 Essentially Non-Oscillatory reconstructions

3 CWENO reconstructions

4 Why doesn't it oscillate?

5 Conclusions and perspectives



Finite volume schemes

• Method of lines

$$\frac{\mathrm{d}}{\mathrm{d}t}\overline{u}^{n+1}(t) = -\frac{\Delta t}{\Delta x_j} \left(F_{j+1/2}(t) - F_{j-1/2}(t)\right)$$

• (Approximate) Riemann solver

$$F_{j+1/2}(t) = \mathcal{F}\left(u_{j+1/2}^{-}(t), u_{j+1/2}^{+}(t)\right)$$

• Reconstruction procedure

$$u_{j+1/2}^{-}(t) = \mathcal{R}^{-}(\overline{u}_{j-r}(t), \dots, \overline{u}_{j+r}(t))$$
$$u_{j+1/2}^{+}(t) = \mathcal{R}^{-}(\overline{u}_{j-r+1}(t), \dots, \overline{u}_{j+r+1}(t))$$



Requirements for a reconstruction procedure on h-adaptive meshes

Must be:

- high-order accurate
- non-oscillatory

For the ADER-DG predictor:

• point values are not enough, but we really need a polynomial defined in the whole cell Ω_{j}

For high order finite volume methods, it should also be efficient at:

- reconstructing point values at many locations on $\partial \Omega_j$ Mesh topology (\Rightarrow quadrature nodes) is changing in time
- reconstructing point values at locations inside Ω_j for SWE or for entropy indicator
- computing sub-cell averages in refinement

For fluxes	For source quadrature		
For refinement	For wb quadrature in 1D		

















2 Essentially Non-Oscillatory reconstructions









Essentially non-oscillatory reconstructions

Given the cell averages $\overline{u}_{j-r}, \ldots, \overline{u}_{j+r}$ of a bounded function u(x),



$$P_{\text{opt}} \text{ s.t. } \forall i = -r, \dots, r : \qquad \frac{1}{|\Omega_{j+i}|} \int_{\Omega_{j+i}} P_{\text{opt}}(x) \mathrm{d}x = \overline{u}_{j+i}$$

- has accuracy $\mathcal{O}(\Delta x^{2r+1})$ in smooth regions
- 2 is however oscillatory if a discontinuity is present in its stencil
- is best replaced by a (lower accuracy) non-oscillatory alternative, e.g. one of the P_k's

(Jiang-Shu) smoothness indicators

Given $P \in \mathbb{P}_N$,

Definition

$$\mathcal{I}[P] = \sum_{\ell=1}^{N} |\Omega_j|^{2\ell-1} \int_{\Omega_j} \left[\frac{\mathrm{d}^{\ell}}{\mathrm{d}x^{\ell}} P \right]^2 \mathrm{d}x$$

Properties

$$\begin{split} \mathcal{I}[P] &= \mathcal{O}(1) & (\text{in general}) \\ \mathcal{I}[P] &\asymp 1 & (\text{on discontinous data}) \\ \mathcal{I}[P] &= u' \left|\Omega_j\right|^2 + \mathcal{O}(\left|\Omega_j\right|^4), & (\text{on regular data}) \end{split}$$





WENO: the linear coefficients

The WENO construction is based on the following fact:

$$P_{\text{opt}}(x_{j+1/2}) = \sum_{k=1}^{r+1} d_k P_k(x_{j+1/2})$$

For example:

- WENO3: $d_1 = 1/3, d_2 = 2/3$
- WENO5: $d_1 = 1/10, d_2 = 3/5, d_3 = 3/10$
- up to order 9: tabulated in the literature
- general formula: published in 2012

Note: the coefficients for $x_{j-1/2}$ are different!



Arandiga et al. SINUM (2012)

WENO3: the linear coefficients on a nonuniform mesh

For $x_{i+1/2}^{-}$: $d_1 = \frac{n_{j+1}}{h_{i-1} + h_j + h_{i+1}}$ $d_2 = \frac{h_{j-1} + h_j}{h_{j-1} + h_j + h_{j+1}}$ For $x_{i-1/2}^+$: $d_1 = \frac{h_j + h_{j+1}}{h_{j-1} + h_j + h_{j+1}}$ $d_2 = \frac{h_{j-1}}{h_{i-1} + h_i + h_{i+1}}$

They must be recomputed after each mesh adaption!



WENO5: the linear coefficients on a nonuniform mesh

For
$$x_{0-1/2}^+$$
:

$$d_1 = \frac{h_1(h_1 + h_2)}{(h_{-2} + \ldots + h_2)(h_{-2} + \ldots + h_1)} \in [0, 1]$$

$$d_2 = \frac{(h_{-2} + h_{-1} + h_0)(h_1 + h_2)(h_{-2} + 2h_{-1} + 2h_0 + 2h_1 + h_2)}{(h_{-2} + \ldots + h_2)(h_{-1} + \ldots + h_2)(h_{-2} + \ldots + h_1)} \in [0, 1]$$

$$d_3 = \frac{(h_{-2} + h_{-1} + h_0)(h_{-1} + h_0)}{(h_{-2} + \ldots + h_2)(h_{-1} + \ldots + h_2)} \in [0, 1]$$

... and an alogous set for $x_{0+1/2}^-$...



WENO reconstructions

Given a point $\hat{x} \in \Omega_j$: The WENO reconstruction operator is $P_{\text{rec},j}(\hat{x}) = \text{WENO}(P_1, \dots, P_{r+1}; P_{\text{opt}}, \hat{x}) \in \mathbb{R}$

and is computed as follows:

- Find optimal coefficients $d_1(\hat{x}), \dots, d_{r+1}(\hat{x})$ such that $\sum_{k=1}^{r+1} d_k(\hat{x}) P_k(\hat{x}) = P_{\text{opt}}(\hat{x}) \text{ and } \sum_{k=1}^{r+1} d_k(\hat{x}) = 1.$
- **2** Compute nonlinear coefficients ω_k as

$$\alpha_k(\hat{x}) = \frac{d_k(\hat{x})}{(I_{P_k} + \epsilon)^t} \qquad \omega_k(\hat{x}) = \frac{\alpha_k(\hat{x})}{\sum_{j=1}^{r+1} \alpha_j(\hat{x})}, \qquad (1)$$

where $\mathcal{I}[P_k]$ denotes a suitable regularity indicator (later) evaluated on P_k , ϵ is a small positive quantity and $t \ge 2$. Similarly

$$P_{\text{rec},j}(\hat{x}) = \sum_{k=1}^{r+1} \omega_k(\hat{x}) P_k(\hat{x})$$
(2)

WENO: smooth data

Goal: show that
$$u(\hat{x}) - P_{rec}(\hat{x}) = \mathcal{O}(h^{2r+1})$$
.





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reconstruction

$$\underbrace{u(\hat{x}) - P_{\text{rec}}(\hat{x})}_{\mathcal{O}(h^{2r+1})} = \underbrace{u(\hat{x}) - P_{\text{opt}}(\hat{x})}_{\mathcal{O}(h^{2r+1})} + \underbrace{P_{\text{opt}}(\hat{x}) - P_{\text{rec}}(\hat{x})}_{\mathcal{O}(h^{2r+1})}$$

$$= \mathcal{O}(h^{2r+1})) + \sum_{k} (d_{k} - \omega_{k}) P_{k}(\hat{x})$$



Goal: show that
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reconstruction

$$\underbrace{u(\hat{x}) - P_{\text{rec}}(\hat{x})}_{erc} = \underbrace{u(\hat{x}) - P_{\text{opt}}(\hat{x})}_{\mathcal{O}(h^{2r+1})} + P_{\text{opt}}(\hat{x}) - P_{\text{rec}}(\hat{x})$$

$$= \mathcal{O}(h^{2r+1})) + \sum_{k} (d_{k} - \omega_{k})P_{k}(\hat{x}) + \underbrace{\sum_{k} d_{k}}_{erc} u(\hat{x}) - \underbrace{\sum_{k} \omega_{k}}_{erc} u(\hat{x})$$



Goal: show that $u(\hat{x}) - P_{\text{rec}}(\hat{x}) = \mathcal{O}(h^{2r+1}).$

reconstruction

$$\underbrace{u(\hat{x}) - P_{\text{rec}}(\hat{x})}_{U(\hat{x}) - P_{\text{rec}}(\hat{x})} = \underbrace{u(\hat{x}) - P_{\text{opt}}(\hat{x})}_{\mathcal{O}(h^{2r+1})} + P_{\text{opt}}(\hat{x}) - P_{\text{rec}}(\hat{x})$$

$$= \mathcal{O}(h^{2r+1})) + \sum_{k} (d_{k} - \omega_{k})P_{k}(\hat{x}) + \sum_{\substack{k \\ =1}} d_{k} u(\hat{x}) - \sum_{\substack{k \\ =1}} \omega_{k} u(\hat{x})$$

$$= \mathcal{O}(h^{2r+1}) + \sum_{k} \underbrace{(d_{k} - \omega_{k})}_{\mathcal{O}(h')?} \underbrace{(P_{k}(\hat{x}) - u(\hat{x}))}_{\mathcal{O}(h'+1)}$$

WENO: smooth data (cont.)

Arandiga et al: compare each I_k with some fixed $I_{\hat{k}}$

$$\omega_{k} = d_{k} \left[1 - d_{k} \frac{I_{k} - I_{\hat{k}}}{\epsilon + I_{\hat{k}}} \sum_{s=0}^{t-1} \left(\frac{\epsilon + I_{k}}{\epsilon + I_{\hat{k}}} \right)^{s} + o\left(\frac{I_{k} - I_{\hat{k}}}{\epsilon + I_{\hat{k}}} \right) \right]$$

$$I_P = u'^2 h^2 + c_1 u' u'' h^3 + (c_2 u' u''' + c_3 u''^2) h^4 + \dots$$

Obstructions to $d_k - \omega_k = \mathcal{O}(h^r)$ come from

- differences between the indicators of two candidate polynomials
- ϵ too small







WENO: discontinuous data



Note!

It is crucial that at least one of $I_{P_1}, \ldots, I_{P_{r+1}}$ be $\mathcal{O}(h^2)!$



WENO: discontinuity in the central cell



• all candidate polynomials contain a discontinuity

•
$$\Rightarrow \forall k : \mathcal{I}[P_k] \asymp 1$$

- in the case of finite differences, all candidate polynomials are monotone in the cell¹ ⇒ monotone reconstructed values
- in the case of finite volumes, very small over/undershoots can be created ⇒ TVB reconstructed values

¹Harten, Osher, Engquist, and Chachravarty. *Uniformly high order accurate* essentially non-oscillatory schemes III, NASA ICASE report 86-22 (1986).



2 Essentially Non-Oscillatory reconstructions









Linear coefficients for cell center



WENO5

 d_0, d_1, d_2 exist but are not in [0, 1]. (See \square for a partial fix reducing the order to 4)

G. Puppo, M.S. Well-balanced high order 1D schemes on non-uniform grids and entropy residuals J Sci Comp (2016)

An extra candidate polynomial: P_0

Motivated from central schemes^a,

$$P_{opt}(\hat{x}) = d_1(\hat{x})P_1(\hat{x}) + d_2(\hat{x})P_2(\hat{x})$$
 (WENO3)
was replaced by

 $\forall x : P_{opt}(x) = d_0 P_0(x) + d_1 P_1(x) + d_2 P_2(x)$ (CWENO3)

where

$$P_0(x) := \frac{1}{d_0} \left(P_{\text{opt}}(x) - d_1 P_1(x) - d_2 P_2(x) \right)$$





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$$P_0(x) := \frac{1}{d_0} \left(P_{\text{opt}}(x) - d_1 P_1(x) - d_2 P_2(x) \right)$$

has only the following interpolation property:

$$\frac{1}{|\Omega_j|}\int_{\Omega_j}P_0(x)\mathrm{d}x=\overline{u}_j$$



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has only the following interpolation property:

$$\frac{1}{|\Omega_j|}\int_{\Omega_j}P_0(x)\mathrm{d}x=\overline{u}_j$$

Note that d_k do not depend on the reconstruction point,

Levy, Puppo, Russo M2AN (1999)



$$\mathsf{CWENO}(P_{\mathsf{opt}}(x), P_1(x), \dots, P_n(x)) \longrightarrow P_{\mathsf{rec}}(x)$$

Given any
$$d_0, d_1, d_n \in (0,1)$$
 such that $\sum_{\xi=0}^n d_\xi = 1$:

$$P_0(x) := \frac{1}{d_0} \left(P_{\text{opt}}(x) - \sum_{\xi=1}^n d_\xi P_\xi(x) \right)$$

- **2** Compute smoothness indicators I_0, I_1, \ldots, I_n
- Ompute nonlinear weights

0

$$\alpha_{\xi} = \frac{d_{\xi}}{(I_{\xi} + \epsilon)^t}, \qquad \omega_{\xi} = \frac{\alpha_{\xi}}{\sum_{\lambda} \alpha_{\lambda}}$$

Reconstruction polynomial (unif. accurate in the cell!)

$$\forall x \in \mathsf{cell} \qquad P_{\mathsf{rec}}(x) = \sum_{\xi=0}^{n} \omega_{\xi} P_{\xi}(x)$$

Levy, Puppo, Russo M2AN (1999)

G. Puppo, M.S. J. Sci. Comput. (2015, electronic)



WENO

d_k depend on reconstruction point

CWENO

• d_k arbitrary (e.g. $d_0 = \frac{1}{2}, d_k = \frac{1}{2r}$)



WENO

- *d_k* depend on reconstruction point
- for each reconstruction point *x̂*, need to compute ω_k(*x̂*) from d_k(*x̂*)

CWENO

- d_k arbitrary (e.g. $d_0 = \frac{1}{2}, d_k = \frac{1}{2r}$)
- compute ω_k from d_k only once per cell



WENO

- *d_k* depend on reconstruction point
- for each reconstruction point ^ˆx, need to compute ω_k(^ˆx) from d_k(^ˆx)

CWENO

- d_k arbitrary (e.g. $d_0 = \frac{1}{2}, d_k = \frac{1}{2r}$)
- compute ω_k from d_k only once per cell
- one extra regularity indicator to compute $\mathcal{I}[P_0]$



WENO

- *d_k* depend on reconstruction point
- for each reconstruction point x̂, need to compute ω_k(x̂) from d_k(x̂)
- wonderful for conservation laws on structured cartesian meshes

CWENO

- d_k arbitrary (e.g. $d_0 = \frac{1}{2}, d_k = \frac{1}{2r}$)
- compute ω_k from d_k only once per cell
- one extra regularity indicator to compute $\mathcal{I}[P_0]$
- more suitable for balance laws, AMR, unstructured meshes, ...

- Levy, Puppo, Russo order 3, uniform mesh M2AN (1999)
- Capdeville order 5, non uniform mesh JCP (2008)
- Zaharan WENO-Z nonlinear weights Appl. Math. Comp. (2009)
- **Kolb** Analysis of CWENO3 on uniform meshes (choice of ϵ) SINUM (2015)
- I. Cravero, M.S. Analysis of CWENO3 on non-uniform meshes (choice of ϵ) J Sci Comput (2016)
- I. Cravero, G. Puppo, M.S., G. Visconti CWENO5, CWENO7, Hierarchic CWENO, ... In preparation



- Levy, Puppo, Russo order 3, 2D, cartesian mesh SIAM J Sci Comput (2000)
- Levy, Puppo, Russo order 4, 2D, cartesian mesh SIAM J Sci Comput (2002)
- Lahooti, Pishevar order 4, 3D, cartesian mesh Appl. Math. and Comput (2012)
- M.S., Coco, Russo order 3, 2D, quad-tree mesh J Sci Comput (2016)
- M. Dumbser, M.S. CWENO3 on triangular and tetrahedral meshes In preparation



Shallow water equations using CWENO3

Exploiting the reconstruction at cell center, we can build a well-balanced scheme with third order accuracy:



	$\ \Delta(h+z)\ _{\infty}$			$\ q\ _{\infty}$				
Q-regular	100	200	400	800	100	200	400	800
<i>p</i> = 3	0	4.44e-16	4.44e-16	6.66e-16	6.87e-16	1.47e-15	1.67e-15	2.47e-15
Random								
<i>p</i> = 3	2.22e-16	6.66e-16	6.66e-16	6.66e-16	5.63e-16	8.47e-16	9.94e-16	1.28e-15

Shallow water equations using CWENO5

Exploiting the reconstruction at $x_{j-1/4}, x_j, x_{j+1/4}$, we can build a well-balanced scheme with fifth order accuracy:



	$\ \Delta(h+z)\ _{\infty}$			q ∞				
	100	200	400	800	100	200	400	800
<i>p</i> = 5	2.22e-16	8.88e-16	1.33e-15	1.11e-16	6.10e-16	8.21e-16	9.69e-16	1.24e-15

2D Euler equations with AMR on quad-tree grids



M.S., Coco, Russo order 3, 2D, guad-tree mesh J Sci Comput (2016)

CWENO on triangular unstructured meshes



Thanks to M. Dumbser!



CWENO on triangular unstructured meshes



Thanks to M. Dumbser!

\mathbb{P}_2		\mathbb{P}_3	
9.78E-02		4.95E-02	
1.96E-02	2.33	1.73E-03	4.03
2.88E-03	2.80	1.13E-04	3.86
3.71E-04	2.97	6.82E-06	4.11
P		Pr	

\mathbb{P}_4		\mathbb{P}_5	
6.12E-02		5.87E-02	
1.55E-03	4.92	9.25E-04	6.56
6.13E-05	4.77	5.46E-06	6.96
1.93E-06	5.03	FR 4703	





2 Essentially Non-Oscillatory reconstructions

3 CWENO reconstructions







WENO argument

For k = 1, ..., r:

- at least one of P_k 's iterpolates smooth data, so $\mathcal{I}[P_k]\mathcal{O}(h^2)$
- all P_k 's interpolationg across the jump will have $\mathcal{I}[P_k] \asymp 1$
- reconstruction (essentially uses) only information from the smooth part



WENO argument

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CWENO argument?

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- all P_k 's interpolationg across the jump will have $\mathcal{I}[P_k] \asymp 1$
- reconstruction (essentially uses) only information from the smooth part, only if also $\mathcal{I}[P_0] \asymp 1!$

Property A

Property A If $\mathcal{I}[P_{opt}] \asymp 1$, then $\mathcal{I}[P_0] \asymp 1$

- sufficient to prove "ENO" property of CWENO
- it looks trivial, but

$$P_{0} := \frac{1}{d_{0}} \left(P_{\mathsf{opt}} - \sum_{k=1}^{r} d_{k} P_{k} \right)$$
$$\mathcal{I}[P_{0}] := \sum_{\ell=1}^{N} h^{2\ell-1} \int_{\Omega_{j}} \left[\frac{\mathrm{d}^{\ell}}{\mathrm{d}x^{\ell}} P_{0} \right]^{2} \mathrm{d}x$$
$$= \frac{1}{d_{0}} \mathcal{I}[P_{\mathsf{opt}}] + \sum_{k=1}^{r} \frac{d_{k}}{d_{0}} \mathcal{I}[P_{\mathsf{opt}}] + \mathrm{cross \ terms}$$

and the cross terms do not have a definite sign

Proofs of Property A

Proposition (CWENO3)

For any choice of weights, explicit computation yields $\frac{\mathcal{I}[P_0]}{\mathcal{I}[P_{opt}]} = \frac{3d_0^2 - 6d_0 + 16}{16d_0^2} > \frac{13}{16}$

Proposition (CWENO5)

For any (symmetric) choice of weights, then $\frac{\mathcal{I}[P_0]}{\mathcal{I}[P_{opt}]}$ attains its minimum for $d_0 = 1$ and $\mathcal{I}[P_0]$

$$\left. \frac{\mathcal{I}[P_0]}{\mathcal{I}[P_{\text{opt}}]} \right|_{d_0=1} > 0.6$$

Proposition (CWENO7)

A similar result holds true...





Conclusions and perspectives

- CWENO is much more flexible than WENO and can be applied in more general situations
- Accuracy on smooth data can be proven similarly as for WENO and depends on ϵ (best: $\epsilon = h^2$)
- Non-oscillatory properties depend on a new idea *Property A* that we could prove for each "reasonable" 1D CWENO's
- CWENO of aerbitrary order on triangular and tetrahedral meshes has been implemented this week
- A new hierarchic construction CWENOH tailored to data with smooth high frequencies and discontinuities will come soon...



Conclusions and perspectives

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Thanks for the attention!