Accurate and Efficient Simulation and Design Using High-Order CFD Methods

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- **1** High-Order Discontinuous Galerkin Discretizations and Implicit Schemes
- Ø Multigrid Solution Acceleration Strategies
- Adjoint-Based Mesh Adaptation and Shape Optimization
- Simulation of Turbulence Using High-Order Discontinuous Galerkin Methods

Outline (Lecture 2)



- Introduction and Basic Concepts
- Model Problem and Two-Level Multigrid Approach
- Multigrid Approach for Nonlinear Equations
- hp-Multigrid Strategy
- Numerical Examples
- Conclusions

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Introduction



- Increasing demands for simulation accuracy requires efficient computation algorithms.
 - Error decreasing rate, e^{n+1}/e^n , is $1 O(h^2)$ for classical iteration techniques like point Jacobi or Gauss-Seidel.
- Multigrid methods have been developed for convergence acceleration.
 - Originally introduced to numerically solve elliptic PDEs
 - Applied to various problems in many disciplines
 - ★ Fluid dynamics and elasticity
 - ★ Geodetics and molecular structures
 - ★ Image reconstruction and tomography
 - * Statistical mechanics and etc.
 - An efficient and versatile approach for computational problems
- Basic concept of multigrid methods is to transfer the original problem onto a coarser grid to effectively eliminate low frequency errors.
 - Involving deliberate interpolating procedures between fine and coarse meshes.
 - Similar idea can be applied to the finite element method where various approximation spaces are treated as different "grid" levels.

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• Consider a one-dimensional boundary-value problem

$$\begin{cases} u''(x) = 0 & 0 < x < 1 \\ u(0) = u(1) = 0 \end{cases}$$

- Analytical solution for the specific boundary conditions is $u_{ex}(x) = 0, x \in [0, 1]$.
- Present aim is to solve the second-order equation numerically.
- Partition the domain into N subintervals with constant width of h = 1/N



• Discretize the second-order term using a central difference scheme

$$u''(x_j) = \frac{u_{j+1} - 2u_j + u_{j-1}}{h^2} + \mathcal{O}(h^2)$$

• The discretized system becomes

$$u_{j+1} - 2u_j + u_{j-1} = 0$$
 $1 \le j \le N - 1$



• Express the system $(u_{j+1} - 2u_j + u_{j-1} = 0)$ into a matrix form as Au = b

$$A = \begin{bmatrix} -2 & 1 & & & \\ 1 & -2 & 1 & & \\ & 1 & -2 & 1 & & \\ & & & \ddots & & \\ & & & 1 & -2 & 1 \\ & & & & 1 & -2 \end{bmatrix} \quad u = \begin{bmatrix} u_1 \\ u_2 \\ \vdots \\ \vdots \\ \vdots \\ u_{n-1} \end{bmatrix} \quad b = \mathbf{0}$$

• Next we can solve the system using a weighted (or damped) Jacobi iterative method $(1 \le j \le N - 1)$

$$u_j^* = \frac{u_{j+1}^n + u_{j-1}^n}{2}$$
$$u_j^{n+1} = (1-\omega)u_j^n + \omega u_j^* = (1-\omega)u_j^n + \frac{\omega}{2}(u_{j+1}^n + u_{j-1}^n)$$

• The convergence behavior of errors can be examined by specifying an initial guess consisting of Fourier modes

$$u_j^0 = \sin\left(rac{jk\pi}{N}
ight)$$

▶ *k* is the wavenumber (or frequency) indicating the number of half sine waves.



• Note that the initial solution error for this problem is $e_j^0 = -\sin\left(\frac{jk\pi}{N}\right)$



• For any Jacobi iteration, the solution error is $e_j^n = -u_j^n$. Based on this fact, we examine the error convergence by taking 100 weighted Jacobi iterations ($\omega = 2/3$)



Higher frequency errors are damped much more rapidly than the lower frequency ones.



• Error damping behavior using the weighted Jacobi method with $\omega = \frac{2}{3}$ for initial guess consisting of k = 3 (left) and k = 16 (right).





• Examine this behavior more precisely assuming Fourier modes for the error

$$\begin{aligned} e_{j}^{n} &= V^{n} e^{i(j\theta)} \quad e_{j+1}^{n} &= V^{n} e^{i(j+1)\theta} \\ e_{j}^{n+1} &= (1-\omega) V^{n} e^{i(j\theta)} + \frac{\omega V^{n}}{2} (e^{i(j+1)\theta} + e^{i(j-1)\theta}) \end{aligned}$$

• $\theta = k\pi/N$

• The amplification of errors

$$g = \frac{e_j^{n+1}}{e_j^n} = (1 - \omega) + \frac{\omega}{2} (e^{i\theta} + e^{-i\theta})$$
$$= (1 - \omega) + \omega \cos\theta$$
$$= 1 - 2\omega \sin^2(\frac{\theta}{2})$$
$$= 1 - 2\omega \sin^2(\frac{k\pi}{2N}) \qquad 1 \le k \le N - 1$$
or $e_i^{n+1} = ge_i^n$

• Note that if |g|<1, the errors are damped, and this requires 0 $<\omega\leq 1.$



• Examine how the value of ω affects the damping of all frequencies



- All values of ω are not effective to damp low-frequency or smooth components of the error, for example wavenumbers k close to one.
- For $\omega = 1$ both the high and low-frequency components of the error are damped very slowly, but those near N/2 wavenumbers are damped rapidly.
- $\omega = 2/3$ is effective to damp high-frequency (or oscillatory) components of the error (N/2 < k < N).
- A method is in need to effectively eliminate errors of all frequencies.

- Stem from the idea of using a coarser grid to provide a better initial guess
 - Relaxation is cheaper on the coarse grid.
 - A better convergence rate can be obtained.
 - Recall the amplification of errors:

$$g_k = 1 - 2\omega \sin^2(\frac{k\pi}{2N})$$

• g_1 is associated with the smoothest mode (k = 1)

$$g_1 = 1 - 2\omega \sin^2(\frac{\pi}{2N})$$
$$= 1 - 2\omega \sin^2(\frac{\pi h}{2})$$
$$\approx 1 - \mathcal{O}(h^2)$$

- ► Error convergence rate is − log₁₀(|g₁|).
- Coarsening the grid by a factor of 2 makes g_1 go from $1 O(h^2)$ to $1 O(4h^2)$, thus resulting in a larger convergence rate.



- Low-frequency errors on the fine mesh appear as higher frequencies on a coarser mesh.
 - As an example, use a 4 mode (k = 4) wave on a N = 12 point mesh projected onto a N = 6 point mesh.



- ▶ For the same mode, the wavelength on the fine mesh is 6*h* versus 3*h* on the coarser mesh.
- The wave on the coarse grid is more oscillatory than that on the fine grid.
- The fine-grid problem should be transferred to a coarser grid to effectively damp the low-frequency errors on the fine grid.





- Basic idea of multigrid: do enough iterations on the fine grid and transfer the problem to a coarse grid.
- Obtain an equation for the errors that we can transfer to the coarser mesh \Rightarrow the residual equation.
 - Recall the system of equations

$$Au_{ex} = b$$

$$Au - b + R = 0 \qquad \text{where} \quad R = b - Au$$

$$Ae = R = b - Au \qquad (e = u_{ex} - u)$$

- ▶ Relaxation on the original equation $Au_{ex} = b$ with an arbitrary initial guess u^0 is equivalent to relaxing on the residual equation Ae = R with the specific initial guess e = 0.
- Based on the idea of relaxation on the error, we can initiate a multigrid approach.

- A two-level multigrid procedure
 - **Q** Relax v_1 times on $A_h u_h = b$ on the fine grid to obtain an approximation u_h .
 - 2 Compute the residual $R_h = b A_h u_h$ on the fine grid.
 - **③** Transfer the residual vector to the coarse grid, $R_H = I_h^H R_h$.
 - Solve the residual equation $A_H e_H = R_H$ on the coarse grid to obtain an approximation to the error e_H .
 - **(9)** Interpolate the error on the coarse grid up to the fine grid and update the solution $u_h = u_h + I_h^h e_h$.
 - Use u_h as initial guess and go back to Step 1.







Restriction Procedure



• Restriction procedure

$$R_H = I_h^H R_h$$

- R_H : residual on mesh with spacing H = 2h.
- R_h : residual on mesh with spacing h.
- I_h^H : restriction operator



Restriction Procedure



• The restriction operator can be defined in several ways.

$$R_H = I_h^H R_h$$



Prolongation Procedure

• The prolongation is typically done using linear interpolation.

$$e_h$$

 e_H
 $j-1$ j $j+1$

$$e_{h2j} = e_{Hj}$$

 $e_{h2j+1} = \frac{1}{2}(e_{Hj} + e_{Hj+1}) \quad 0 \le j \le \frac{n}{2} - 1$

$$e_h = I_H^h e_H$$





- A procedural question: What is the best way to solve the coarse-grid problem?
- In many occasions we do not have to solve the residual equation on the coarse mesh exactly.
- Alternatively we can apply the same multigrid procedure recursively.
- Replace the direct solve in the two-level multigrid scheme by an accurate solve using multiple cycles of multigrid.
- The two-level multigrid procedure is thus performed recursively.
- Typical multigrid cycles: V-Cycle, full Multigrid schemes and etc.

V-Cycle Multigrid Scheme

- h: Relax v_1 times on $A_h u_h = b$ to obtain u_h .
- 2 *h*: Compute $R_h = b A_h u_h$.
- $h \to 2h \text{ Transfer } R_{2h} = I_h^{2h} R_h.$
- 2*h*: Relax v_1 times on $A_{2h}e_{2h} = R_{2h}$ with initial guess $e_{2h} = 0$
- **5** 2*h*: Compute $R_{2h} = R_{2h} A_{2h}e_{2h}$.
- $2h \rightarrow 4h$: Transfer $R_{4h} = I_{2h}^{4h}R_{2h}$.
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- **16***h*: Solve $A_{16h}e_{16h} = R_{16h}$.
- 9 ...
- **(a)** $4h \rightarrow 2h$: Correct $e_{2h} = e_{2h} + I_{4h}^{2h} e_{4h}$.
- **4** 2*h*: Relax v_2 times on $A_{2h}e_{2h} = R_{2h}$ with initial guess e_{2h} .
- $2h \to h: \text{ Correct } u_h = u_h + I_{2h}^h e_h.$
- 2h: Relax v₂ times on A_hu_h = R_h with initial guess u_h.





Full Multigrid (FMG)



- Start from the relaxation problem at the coarsest grid.
- Each V-cycle is preceded by a coarse-grid V-cycle to obtain a good initial solution.
- Interpolate this initial guess on the current grid.
- Perform a V-cycle to improve the solution.





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Multigrid Approach for Nonlinear Equations

- Full Approximation Storage (FAS) Scheme
 - A system of nonlinear algebraic equations

R(u) = b

- u, b are vectors with dimension N.
- The notation R(u) denotes a nonlinear operator.
- The nonlinear residual equation on the fine grid can be derived

$$R_h(u_h) = b_h$$

$$r_h(v_h) = b_h - R_h(v_h)$$

- v_h is an approximation to u_h and $e_h = u_h v_h$.
- Subtracting the above two equations from one to the other yields

$$R_h(u_h) - R_h(v_h) = r_h(v_h)$$

• If the high-frequency errors have been previously smoothed, then this equation can be approximated on a coarser mesh as

$$R_H(u_H) = \tilde{I}_h^H r_h + R_H(I_h^H v_h)$$



Multigrid Approach for Nonlinear Equations



$$R_H(u_H) = \tilde{I}_h^H r_h + R_H(I_h^H v_h)$$

- \tilde{I}_h^H and I_h^H denote restriction operators for the residual and the solution variables.
- $I_h^H v_h$ serves as an initial approximation to the solution on the coarse mesh.
- u_H is the exact solution on mesh H.
- $\bullet\,$ Full solution is computed and stored on the coarse mesh \Rightarrow referred to as full approximation storage.
- With the residual equation we can next use a two-level FAS scheme.

Two-Level Full Approximation Storage



- **Q** Relax on the fine grid to obtain an approximation v_h for $R_h(u_h) = b_h$.
- **(a)** Compute the residual on the fine grid $r_h(v_h) = b_h R_h(v_h)$.
- **(a)** Restrict the residual and the fine-grid approximation to the coarse grid as $\tilde{l}_h^H r_h$ and $l_h^H v_h$, respectively.
- Solve the residual equation on the coarse grid $R_H(u_H) = \tilde{l}_h^H r_h + R_H(l_h^H v_h)$.
- Sompute the coarse grid correction $c_H = u_H l_h^H v_h$.
- **•** Transfer the correction (i.e. error) to the fine grid, $I_H^h c_H$.
- Correct v_h on the fine grid using the prolongated correction as $v_h = v_h + l_H^h c_H$ and go to Step 1.

Restriction and Prolongation



- Solution variables are conserved variables, such as $\rho, \rho \mathbf{u}$ and ρE
- To preserve conservativity we use a volume weighted restriction operator for the solution variables.

$$I_h^H v_h = \frac{\sum_k \Omega_k v_{h_k}}{\sum_k \Omega_k}$$

> The summation takes over all the fine grid cells which make up the coarse grid cell.

• Restriction operator of the residual is just a summation as

$$\tilde{I}_h^H R_h = \sum_k R_{hk}$$

• Prolongation operator of the correction is linear interpolation.



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- Combination of spectral and geometric multigrid schemes (*hp*-Multigrid)
- The spectral multigrid (*p*-Multigrid) approach makes use of lower-order *p*-levels as coarser grids.
 - Alleviate the need to generate a sequence of agglomerated grids.
 - Simplify the interpolation and prolongation procedures with hierarchical functions.
 - Often more suitable for unsteady problems.





• The same procedure in the traditional multigrid approach is applied: fine grid problem is accelerated by means of coarser grid corrections.

Fine : $R_{\rho}(u_{\rho}) = b_{\rho}$ Coarse : $R_{\rho-1}(u_{\rho-1}) = \tilde{l}_{\rho}^{\rho-1}r_{\rho} + R_{\rho-1}(l_{\rho}^{\rho-1}v_{\rho})$

• The use of the hierarchical basis functions greatly facilitates the processes of restriction and prolongation in the *p*-multigrid scheme.

▶ Approximation spaces are nested, i.e. $\mathcal{V}_h^{p-1} \subset \mathcal{V}_h^p$

$$\phi_i^{p-1} = \sum_j \alpha_{ij}^{p-1} \phi_j^p$$

$$\begin{bmatrix} \phi_1 \\ \phi_2 \\ \phi_3 \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} \phi_1 \\ \phi_2 \\ \phi_3 \\ \phi_4 \\ \phi_5 \\ \phi_6 \end{bmatrix}$$



- Levels between p and p-1 (p-1>0) $\phi_i^{p-1} = \sum_j \alpha_{ij}^{p-1} \phi_j^p$
- Weighted residual restriction $\tilde{I}_{\rho}^{p-1}r_{\rho}$ and state variable restriction $I_{\rho}^{p-1}v_{\rho}$

$$\begin{split} \tilde{l}_{p}^{p-1}r_{p} &= R(\phi_{i}^{p-1}, v_{p}) = R\left(\sum_{j} \alpha_{ij}^{p-1} \phi_{j}^{p}, v_{p}\right) = \sum_{j} \alpha_{ij}^{p-1} R(\phi_{j}^{p}, v_{p})\\ l_{p}^{p-1} v_{p} &= \alpha_{ij}^{p-1} v_{p} \end{split}$$

- Obtained by disregarding the higher order modes and transferring the values of the low order modes exactly.
- State variable prolongation $c_p = I_{p-1}^p c_{p-1}$

 $I_{p-1}^{p} = \left(\alpha_{ij}^{p-1}\right)^{T} \qquad \qquad \begin{bmatrix} c_{1} \\ c_{2} \\ c_{3} \\ c_{4} \\ c_{5} \\ c_{6} \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} c_{1} \\ c_{2} \\ c_{3} \end{bmatrix}$

 Obtained by setting the high order modes to zero and injecting the values of the low order coefficients exactly.



- Restriction and prolongation between p_1 and p_0 levels
 - Basis function is constant for p = 0, $\phi^{p_0} = 1$.
 - Underlying grid is the same.
 - Triangular mesh as an example:

$$egin{aligned} I_{
ho_1}^{
ho_0} v_{
ho_1} &= rac{1}{3} \sum_{i=1}^3 v_{
ho_1,i} \ I_{
ho_0}^{
ho_1} c_{
ho_0} &= c_{
ho_0} \ ec{I}_{
ho_1}^{
ho_0} R_{
ho_1} &= \sum_{i=1}^3 R_{
ho_1,i} \end{aligned}$$

• Restriction and prolongation between *h*-levels operate the same manners as those for the traditional multigrid schemes.

$$I_{h}^{H}v_{h} = \frac{\sum_{k}\Omega_{k}v_{hk}}{\sum_{k}\Omega_{k}} \qquad \tilde{I}_{h}^{H}R_{h} = \sum_{k}R_{hk} \qquad I_{H}^{h}c_{H} = c_{H}$$

Relaxation Methods at Each Level



$$\left[\frac{\partial R}{\partial u}\right]^n \Delta u^{n+1} = S - R(u^n)$$

$$u^{n+1} = u^n + \omega \Delta u^{n+1}$$

- Decompose the Jacobian matrix as $\left[\frac{\partial R}{\partial u}\right]^n = [D^n] + [O^n]$
- Various relaxation/smoothing solvers
 - Nonlinear element Jacobi

$$\Delta u^{n+1} = [\mathbf{D}^n]^{-1} \left(S - R(u^n) \right)$$

 Quasi nonlinear element Jacobi (runs with sub-iterations, k)

$$\Delta u^{k+1} = [\mathbf{D}^n]^{-1} \left(S - R(u^k) \right)$$

Linearized element Jacobi

$$\Delta u^{k+1} = [\mathbf{D}^n]^{-1} \left(S - R(u^n) - [\mathbf{O}^n] \Delta u^k \right)$$

Linearized element Gauss-Seidel [Oⁿ] = [Lⁿ] + [Uⁿ]

$$\Delta u^{k+1} = [(\mathbf{D} + \mathbf{L})^n]^{-1} (S - R(u^n) - [\mathbf{U}^n] \Delta u^k)$$







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- Compressible channel flow over a Gaussian bump
- Convection of an isentropic vortex



- $M_{\infty} = 0.2$ (steady-state problem)
- Inflow/Outflow boundary conditions and wall boundary conditions enforced on the top and bottom



• Agglomerated coarser grids





- Comparison of convergence of non-linear element Jacobi (NEJ), *quasi*-nonlinear element Jacobi (qNEJ), linearized element Jacobi (LEJ) and linearized Gauss-Seidel (LGS) smoothers
- Mesh size N = 1248, DG p = 4 (i.e. fifth-order) scheme, 5 sub-iterations





- Effect of various discretization orders on the solution convergence
- Single level method versus *hp*-multigrid approach
- Discretization orders vary from p = 1 to p = 4





- Effect of mesh resolution on the solution convergence
- Single level method versus *hp*-multigrid approach
- Variation of mesh sizes N = 573, N = 1248, N = 2522 and N = 5088 (fixed p = 4)



Convection of An Isentropic Vortex



- Effects of mesh sizes and time-step sizes on the solution convergence
- Uniform flow perturbed by an isentropic vortex

$$\delta u = -\frac{\sigma}{2\pi} (y - y_0) e^{\vartheta (1 - r^2)}$$
$$\delta v = \frac{\sigma}{2\pi} (x - x_0) e^{\vartheta (1 - r^2)}$$
$$\delta T = -\frac{\sigma^2 (\gamma - 1)}{16 \vartheta \gamma \pi^2} e^{2\vartheta (1 - r^2)}$$



Convection of An Isentropic Vortex



- Effect of mesh sizes on the solution convergence
- Single level versus *p*-multigrid solvers
- DG p = 4 scheme and the BDF2 temporal scheme (fixed time-step size $\Delta t = 1.0$)
- Various mesh sizes N = 3136, N = 7056 and N = 14400



Convection of An Isentropic Vortex



- Effect of time-step sizes on the solution convergence
- Single level versus *p*-multigrid solvers
- DG p = 4 scheme, the BDF2 temporal scheme and fixed mesh size N = 14400
- Various time-step sizes $\Delta t = 0.5, 1.0$ and 5.0



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Conclusions



- The multigrid method is designed to eliminate low-frequency errors on the fine mesh by transferring the fine-grid residual to a coarse grid.
- Purely spectral (*p*-) multigrid approach operates on the approximation spaces of different orders.
- The coupling of spectral and agglomerated (*hp*-) multigrid procedures increases the overall efficiency for steady-state problems, while the purely *p*-multigrid approach is more appropriate for implicit time-integration problems.
- Compared to the nonlinear Jacobi smoother, the linearized smoothers require additional storage, but generally more efficient than the former nonlinear smoother.
- The *hp*-multigrid schemes demonstrates both *h* and *p*-independent convergence rates, thus the efficiency benefits become more significant for finer meshes.
- For implicit time-integration problems, the *p*-multigrid strategy exhibits *h*-independent convergence rates while retaining slight dependence on time-step sizes.

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