

## An implicit multigrid solver for high-order compressible flow simulations on GPUs

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### Abstract

The multigrid method has proved to be effective for a large class of numerical methods. In this study, a strategy based on Full Approximation Storage (FAS) scheme is implemented together with Full Multigrid Algorithm (FMG) to accelerate convergence of steady state solutions of the two-dimensional compressible Euler equations on Graphics Processing Unit (GPU). The Beam and Warming linearization scheme in curvilinear coordinates is used to discretize the governing equation. The second-order central and the fourth-order compact finite-difference schemes are applied for spatial discretization. A high-performance GPU-implemented block-tridiagonal solver based on Block Cyclic Reduction (BCR) algorithm is utilized. The proposed BCR solver is applied to finite-difference discretization on structured grids via Alternating Direction Implicit (ADI) scheme. Attention is directed towards the computational performance of the V-cycle and W-cycle multigrid strategies in two and three grid levels using the NVIDIA GTX480 graphics card. Speedups between 2x–6.2x are achieved in comparison to the Intel Core i7-920 2.67GHz CPU for different grid sizes.

**Keywords:** Euler Equations, high-order method, Multigrid Acceleration, GPU computing, Block-tridiagonal solver

### Introduction

Among the different schemes that are proposed to accelerate convergence rate such as local time stepping, residual smoothing, multigrid method and most recently local preconditioning, the multigrid method has received great attention. In spite of time stepping schemes that efficiently damp high-frequency error components of numerical solutions, the multigrid method can accelerate the convergence rate by damping the low-frequency error components. This method was first introduced by Fedorenko (1962) and Bakhvalov (1966) and then developed by Brandt (1977). Although the multigrid theory was first developed for elliptic problems, it has been demonstrated in later works by (Ni, 1982; Jameson, 1983) that multigrid method can also greatly affect the convergence rate of numerical schemes applied to Euler equations. Recently, there have been some studies to implement the multigrid methods on high-order numerical discretization (Gupta, Kouatchou, & Zhang 1997; Sakurai, Aoki, Lee, & Kato 2002).

The multigrid method has also been developed for the implicit schemes, which enabled the utilization of the ADI methods (Jameson and Yoon, 1986). In this matter, the computational cost of block-structure matrix inversions is expensive. Therefore,

accelerating the linear system solution is an effective approach towards the computational performance improvement.

Recent developments on Graphics Processing Units (GPU) have led to a high computing power device with a GPU-oriented programming language (CUDA), which enables the applicability of GPU devices for accelerating a variety of CFD problems.

To accelerate the solution of block tridiagonal matrices, appeared in the ADI discretization of the multigrid method, on GPUs, the parallel Cyclic Reduction (CR) algorithm is at the center of attention. This algorithm was developed for block tridiagonal systems by Heller (1976). Performance of high-rank block cyclic reduction solver on distributed memory CPU cluster was reported in work by (Hirshman, Perumalla, Lynch, & Sánchez, 2010). A recent implementation of BCR algorithm on GPUs was done by (Stone, Duque, Zhang, Car, Owens, & Davis, 2011; Baghapour, Esfahanian, Torabzadeh, Mahmoodi Darian, 2013) for different CFD applications.

In the current work, a multigrid method based on FAS scheme is implemented beside a FMG scheme (Brandt, 1981) to accelerate convergence of steady state solutions of the two-dimensional compressible Euler equations. Alternate Directional Implicit (ADI) method is used for time advancement and the second-order central and fourth-order compact finite-difference schemes are applied to spatial discretization. The computational performance of the V-cycle and W-cycle multigrid strategies in two and three grid levels is investigated by using the NVIDIA GTX480 graphics card.

## Governing Equations

The two-dimensional Euler equations for a Cartesian coordinate system are given by:

$$\frac{\partial Q}{\partial t} + \frac{\partial F}{\partial \xi} + \frac{\partial G}{\partial \eta} = 0 \quad (1)$$

where,

$$Q = J^{-1} \begin{Bmatrix} \rho \\ \rho u \\ \rho v \\ E \end{Bmatrix}, F = J^{-1} \begin{Bmatrix} \rho U \\ \rho u U + \xi_x p \\ \rho v U + \xi_y p \\ (E + p)U \end{Bmatrix}, G = J^{-1} \begin{Bmatrix} \rho V \\ \rho u V + \eta_x p \\ \rho v V + \eta_y p \\ (E + P)V \end{Bmatrix} \quad (2)$$

and

$$U = \xi_x u + \xi_y v, \quad V = \eta_x u + \eta_y v, \quad J^{-1} = \begin{pmatrix} x_\xi y_\eta - x_\eta y_\xi \end{pmatrix} \quad (3)$$

The variables  $p, \rho, T, u, v$ , and  $E$  are pressure, density, temperature, velocity components and total energy, respectively. Assuming air as an ideal gas, the equation of state is used to calculate the pressure and temperature:

$$p = (\gamma - 1) \rho \left[ E - \frac{u^2 + v^2}{2} \right], \quad T = \frac{p}{\rho R} \quad (4)$$

where  $\gamma$  is the ratio of specific heats and  $R$  is the gas constant.

## Numerical Method

### *Spatial Discretization*

For spatial discretization, the second-order central and the fourth-order compact finite difference schemes are applied. A general centered compact scheme (Lele, 1992) for the first derivative is the following:

$$\beta f'_{i-2} + \alpha f'_{i-1} + f'_i + \alpha f'_{i+1} + \beta f'_{i+2} = c \frac{f_{i+3} - f_{i-3}}{6\Delta x} + b \frac{f_{i+2} - f_{i-2}}{4\Delta x} + a \frac{f_{i+1} - f_{i-1}}{2\Delta x} \quad (5)$$

Herein,  $f$  and  $f'$  can be any flow variable and its derivative, respectively.  $\Delta x$  is the grid spacing in  $x$ -direction. Depending on the coefficients  $a$  and  $b$ , a tridiagonal or a pentadiagonal system will be produced. The compact method used in this study is as following:

$$f'_{i+1} + 4f' + f'_{i-1} = \frac{3}{\Delta x} (f_{i+1} - f_{i-1}) \quad (6)$$

### *Multigrid Method*

The FAS scheme for two grid levels with multigrid V-cycle is described as follows, where the fine grid is denoted by the  $h$  subscript.

- 1) Calculate the solution correction ( $\Delta Q_h$ ) on the fine grid and update the solution on the fine grid:  $Q_h^{n+1} = Q_h^n + \Delta Q_h$
- 2) Calculate the fine grid residual:  $R_h$
- 3) Transfer value of conservative variables to the coarse grid:  $q_{2h} = I_h^{2h} q_h$   
where  $q = JQ$  and  $I_h^{2h}$  is the restriction operator (Wesseling, 1995).
- 4) Collect the residuals on the fine grid for the coarse grid:  $R_{2h}^t = I_h^{2h} R_h$
- 5) Calculate the residuals on the coarse grid using restricted conservative variables from the fine grid to the coarse grid:  $R_{2h} (Q_{2h}^{(0)})$ . To restrict flow variable from the fine grid to the coarse grid, a full-weighted restriction is used.
- 6) The forcing function is defined by:  $P_{2h} = R_{2h}^t - R_{2h} (Q_{2h}^{(0)})$   
where,  $R_{2h}^t$  is the residual that is restricted to the coarse grid ( $2h$ ) and  $R_{2h} (Q_{2h}^{(0)})$  is the residual evaluated by restricting  $Q_{2h}^{(0)}$  to the coarse grid from the fine grid.
- 7) The residual on the coarse grid is defined as:  $R_{2h} = P_{2h} + R_{2h} (Q_{2h}^{(0)})$

- 8) After one or several iterations, the solution on the coarse grid is updated. Then, the solution correction on the coarse grid is calculated as :  $Q_{2h}^{n+1} = Q_{2h}^n + \Delta Q_{2h}$
- 9) In order to update the solution on the fine grid ( $h$ ), the solution corrections are prolonged to the fine grid as follows:  $Q_h^{n+1} = Q_h^n + I_{2h}^h (Q_{2h}^{n+1} - Q_{2h}^{(0)})$
- where,  $Q_h^n$  is the solution before the restriction to the coarse grid and  $I_{2h}^h$  is the interpolation operator.

#### *Accuracy of Transfer Operator*

Orders of prolongation and restriction operators should satisfy the following equation in order to damp the frequency error (Hemker, 1990):

$$m_{\text{Res}} + m_{\text{Pro}} > m_{\text{Eqn}} \quad (7)$$

where,  $m_{\text{Res}}$ ,  $m_{\text{Pro}}$  and  $m_{\text{Eqn}}$  denote the order of restriction, prolongation operator and the order of spatial numerical discretization for the system of equations, respectively. A full-weighting restriction and fourth-order compact interpolation (Lele, 1992) that are used in this work will satisfy Eq. (7).

### **BCR algorithm and GPU implementation**

#### *CUDA architecture and GPU memory hierarchy*

In CUDA architecture, a kernel execution is divided among a batch of concurrent threads, which are partitioned in blocks of threads. The blocks are mapped to the stream multiprocessors (SM) of the GPU device for execution. The concurrent threads access data from different memory resources when executing on the GPU. Each thread within a group of blocks has access to the large global memory (Equal to the DRAM of the GPU) with high transaction latency. All threads have low latency access to 48KB of shared memory for thread communication within a block (CUDA, 2012). The NVIDIA GTX 480, used in this research, has 1536 MB of frame buffer global memory runs through a 384-bit bus and delivers 177.4 GB/s of memory bandwidth.

#### *The parallel Block Cyclic Reduction (BCR) algorithm*

The BCR algorithm is based on divide and conquer strategy. In the first level, the primary  $N \times N$  system of equations is divided into two decoupled  $N/2 \times N/2$  sub matrices. The two smaller sub matrices are consecutively divided again in the same way until the total number of  $N/2$  sub matrices of size  $2 \times 2$  are achieved in the last level, which can be solved in parallel. In each level of the BCR algorithm, the diagonals ( $L, M, U$ ) and the right-hand-side ( $D$ ) are calculated by Eq. (8). According to this above calculations consist of many small matrix multiplication and inversion operations. The basic approach to implement the above matrix operations on the GPU is to use different streams for parallel kernel execution (CUDA, 2012). However, this approach is bounded by 16 maximum concurrently running streams in CUDA architecture and cannot lead to performance improvements in large matrices. In order to benefit from the parallel nature of BCR algorithm together with the high computational throughput of the

GPU device, single GPU kernels are developed to perform all matrix multiplication and inversion operations in parallel.

In both matrix kernels, the sub matrices are first loaded from the global memory to the shared memory, which is provided for each block of threads. Then the calculations on the sub matrices are obtained and the results are written back to the global memory. The number of offloading sub matrices to the shared memory of each block is optimized to avoid extra memory allocation than the 48KB limit and achieve the maximum performance on GPU.

$$\begin{aligned}
T_1^{level} &= L_i^{level} \left( M_{i-1}^{level} \right)^{-1}, T_2^{level} = U_i^{level} \left( M_{i+1}^{level} \right)^{-1} \\
R_i^{level+1} &= R_i^{level} - T_1^{level} R_{i-1}^{level} - T_2^{level} R_{i+1}^{level} \\
M_i^{level+1} &= M_i^{level} - T_1^{level} U_{i-1}^{level} - T_2^{level} L_{i+1}^{level} \\
U_i^{level+1} &= -T_2^{level} U_{i+1}^{level} \\
L_i^{level+1} &= -T_1^{level} L_{i-1}^{level}
\end{aligned} \tag{8}$$

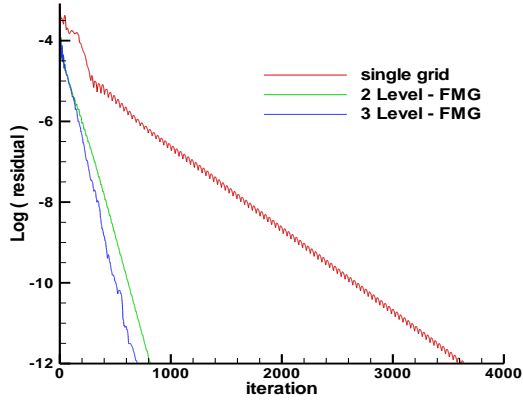
## Results

The double precision numerical results presented in this section demonstrate the accuracy and computational efficiency of the multigrid method for inviscid flows. The performance of the GPU-based multigrid solver with the implicit scheme is studied for two-dimensional circular arc bump. The thickness-to-chord ratio is 10% based on the standard test cases of the GAMM conference (Rizzi and Viviani, 1981). In the case of computations on two grid levels and three grid levels, the FMG method is applied to provide an initial solution for the fine grid. The CFL number of 0.6 is used on all grids so that larger time steps can be used on the coarse grid. Convergence is monitored using  $L_2$  norm of density residual. The performance of computations on GTX480 GPU (Core Clock rate: 700 MHz) is compared with a single core of Intel Core i7-920 2.67GHz CPU.

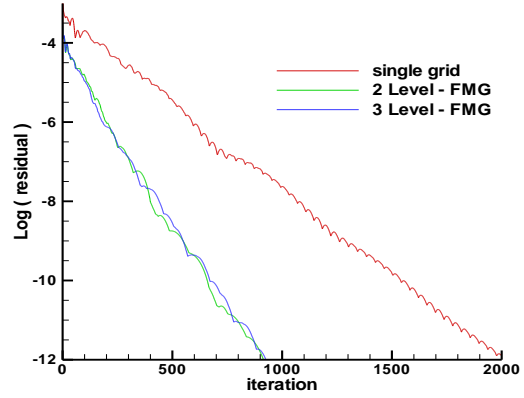
### *Multigrid performance*

In first step, the performance of multigrid method for computational grid including  $32 \times 16$  cells at free stream Mach number for subsonic and transonic flows using second-order finite difference method is presented. Figure 3(a) and Fig. 3(b) compares the convergence rates between a single grid level, two grid levels and three grid levels multigrid with FMG for subsonic and transonic flow. Computations are performed using V-cycle procedure.

In the second step, the performance of multigrid method for the fourth-order compact method on the same geometry for both subsonic and transonic flows is investigated. Figure 4(a) and Fig. 4(b) demonstrate the convergence rates between a single grid level, two grid levels and three grid levels multigrid with FMG for subsonic and transonic flow. Computations are performed using V-cycle procedure. It is worth mentioning that no significant difference between convergence rates of V-cycle and W-cycle computations is observed.

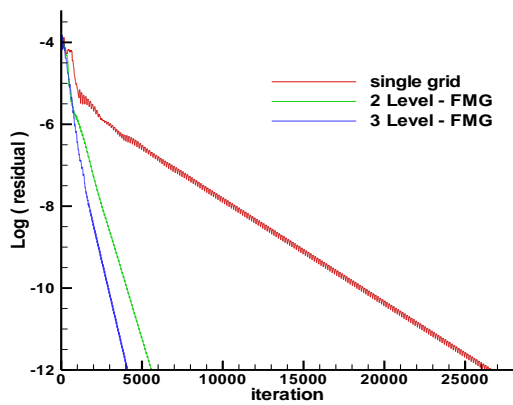


(a) Subsonic flow  $M_\infty=0.5$

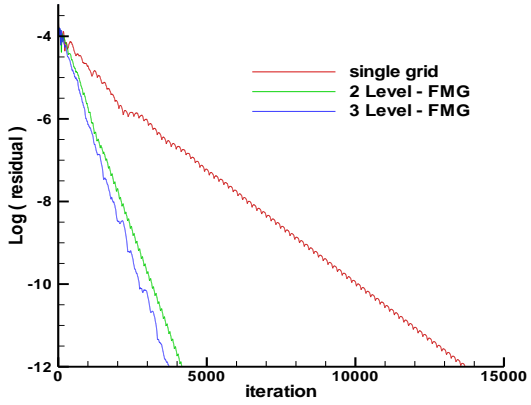


(b) Transonic flow,  $M_\infty=0.675$

Figure 3. Convergence acceleration for the second-order scheme



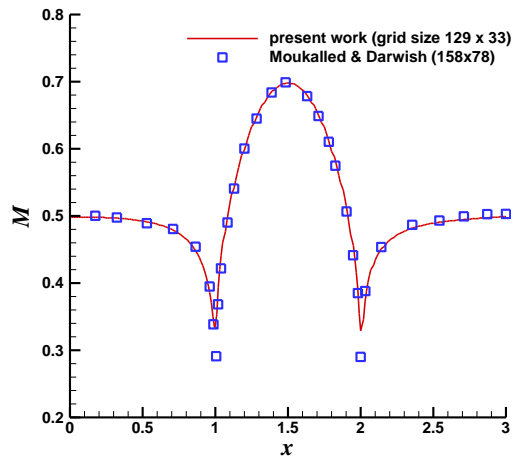
(a) Subsonic flow,  $M_\infty=0.5$



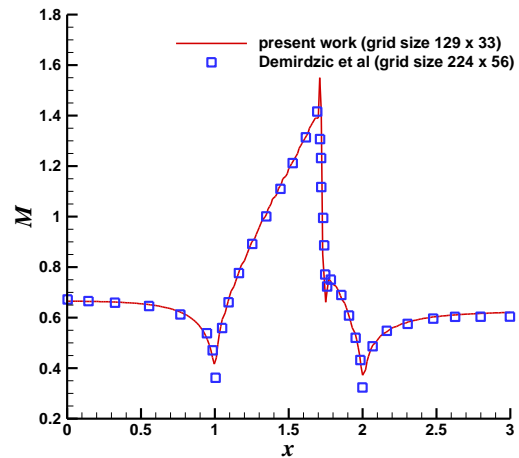
(b) Transonic flow,  $M_\infty=0.675$

Figure 4. Convergence Acceleration for the fourth-order scheme

In Fig. 5(a) and Fig. 5(b) Mach number distribution of the present study compared to (Demirdžić, Lilek, & Perić, 1993). Figure 6(a) and Fig. 6(b) demonstrate the pressure contour for subsonic and transonic flow, respectively.

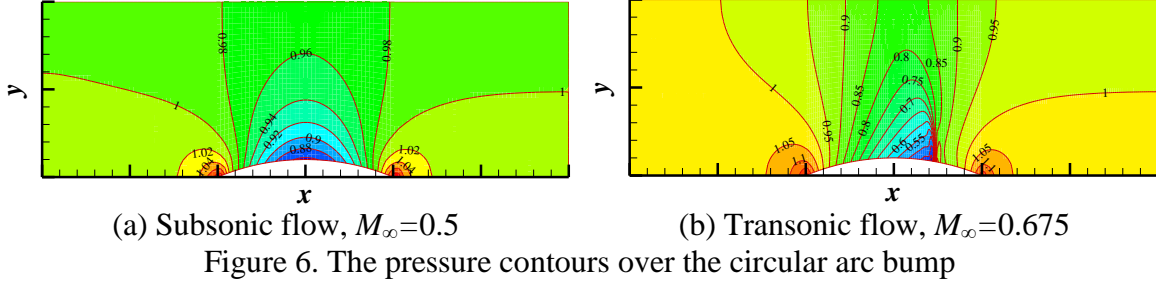


(a) Subsonic flow,  $M_\infty=0.5$



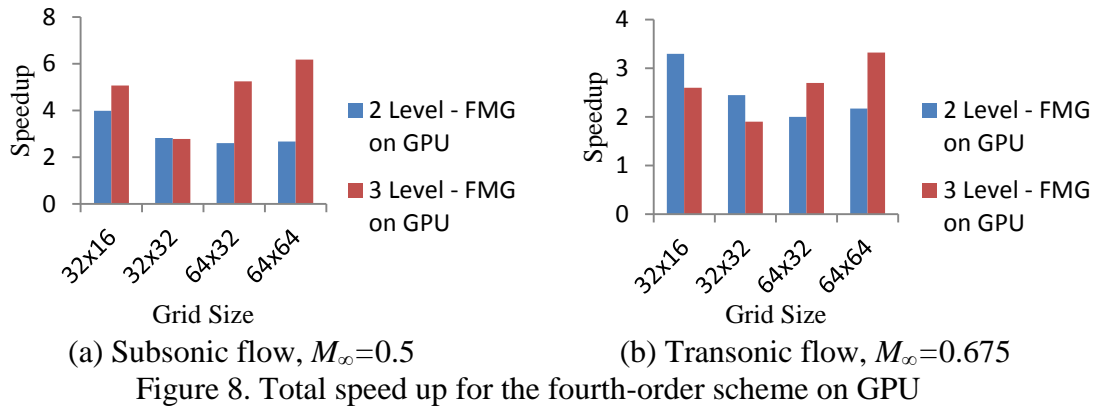
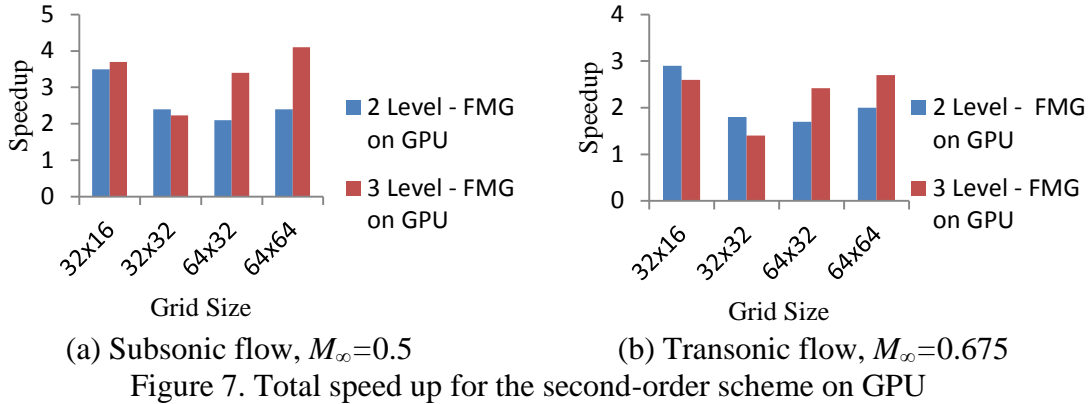
(b) Transonic flow,  $M_\infty=0.675$

Figure 5. The Mach number distribution for lower wall of the circular arc bump



### Total performance

The total performance of the CFD code on the GPU, including the multigrid kernels and the BCR linear solver, is studied. Figure 7(a) and Fig. 7(b) show the overall GPU speedup of the two-dimensional subsonic and transonic flow test cases compared to the CPU platform for the second-order finite difference method. Figure 8(a) and Fig. 8(b) compare the solver speedup for the fourth-order compact finite difference method for  $M_\infty = 0.5$  and  $M_\infty = 0.675$ , respectively. Speedup term here is defined as the run time ratio obtained by single grid CPU- solver over the multigrid GPU-solver.



## CONCLUSIONS

A multigrid scheme is implemented on a two-dimensional Euler solver in order to accelerate convergence to steady state. Subsonic and transonic inviscid flows in a channel with circular arc bump for both second-order central and fourth-order compact

finite-difference methods are investigated as the test cases. The convergence acceleration obtained for Fourth-order method is more than convergence acceleration for the second-order method. Moreover, the higher convergence rate for subsonic flow is observed in comparison to transonic flow. Total speedups between 2x–6.2x are achieved for different mesh sizes by implementing the GPU-based BCR solver in comparison to computations on the CPU platform.

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