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# A COMPUTATIONAL STUDY OF THE EFFECT OF UNSTRUCTURED MESH QUALITY ON SOLUTION **EFFICIENCY**

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# Abstract

It is well known that mesh quality affects both efficiency and accuracy of CFD solutions. Meshes with distorted elements make solutions both more difficult to compute and less accurate. We review a recently proposed technique for improving mesh quality as measured by element angle (dihedral angle in three dimensions) using a combination of optimization-based smoothing techniques and local reconnection schemes. Typical results that quantify mesh improvement for a number of application meshes are presented. We then examine effects of mesh quality as measured by the maximum angle in the mesh on the convergence rates of two commonly used CFD solution techniques. Numerical experiments are performed that quantify the cost and benefit of using mesh optimization schemes for incompressible flow over a cylinder and weakly compressible flow over a cylinder.

Keywords. Mesh Improvement, Mesh Smoothing, Convergence, Efficient Solution

#### 1 Introduction

Finite element and finite volume techniques in computational fluid dynamics require that the computational domain be decomposed into simple geometric elements, typically triangles and quadrilaterals in two dimensions and tetrahedra and hexahedra in three dimensions. This decomposition can often be achieved automatically using available mesh generation tools. Unfortunately, meshes generated in

this way can contain poorly shaped or distorted elements, which cause numerical difficulties during the solution process. For example, we know that as element angles become too large, the discretization error in the finite element solution increases<sup>3</sup>; and as angles become too small, the condition number of the element matrix increases<sup>17</sup>. Thus, for meshes with highly distorted elements, the solution is both less accurate and more difficult to compute.

We recently introduced a two-pronged approach for effectively improving the quality of triangular and tetrahedral meshes based on local reconnection schemes and a new optimization-based mesh smoothing technique<sup>16, 14</sup>. In this paper we briefly review these mesh optimization procedures and present typical results for a number of application meshes. In the course of those numerical experiments, we identified particular combinations of techniques that resulted in the greatest improvement to mesh quality, and in this paper we summarize several recommendations offered in Freitag and Ollivier-Gooch<sup>15</sup>.

The goal of our current research is to quantify the effects of poor mesh quality on solution efficiency for CFD applications. In this paper, we perform a detailed examination of two test problems; incompressible and weakly compressible flow over a cylinder. For the first case, we analyze a number of numerical experiments that quantify the convergence rate of the solution technique for high quality meshes, show how this rate is adversely affected by poor element quality, and finally show that time required to improve the mesh is often less than the time required to find an accurate solution on a poor quality mesh. For the second test case, we start with a random mesh for which the solution technique does not converge and show that combined swapping and smoothing improves the mesh enough to obtain a convergent solution.

The remainder of the article is organized as follows. In Section 2, we will briefly review the mesh smoothing and local reconnection techniques used for mesh improvement. We then present results that



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Portions of this document may be illegible electronic image products. Images are produced from the best available original document. show the improvement of several application meshes using a combination of swapping and smoothing and review the recommendations for mesh improvement given in Freitag and Ollivier-Gooch<sup>15</sup>. In Section 3, we describe the test cases and solution techniques followed by several numerical experiments that quantify the effects of mesh quality on convergence behaviour.

# 2 Mesh Improvement Techniques

Much research has been done in the area of improving mesh quality through a variety of techniques including

- 1. point insertion/deletion to refine or coarsen a mesh<sup>5, 24, 26</sup>,
- 2. local reconnection to change mesh topology for a given set of vertices<sup>12, 18, 20</sup>, and
- 3. mesh smoothing to relocate grid points without changing mesh topology.<sup>2, 10, 25</sup>

We recently introduced a two-pronged approach for effectively improving the quality of tetrahedral meshes based on local reconnection schemes and a new optimization-based mesh smoothing technique.<sup>14</sup> We now briefly review these procedures.

#### 2.1 Mesh Smoothing

Local mesh smoothing techniques are formulated in terms of the grid point to be adjusted, the *free vertex*, v, and that grid point's adjacent vertices, V. The location of the free vertex is changed according to some rule or heuristic procedure based on information available at the adjacent grid points. Suppose x is the position of the free vertex; then the general form of the smoothing algorithms is given by

$$\mathbf{x}_{new} = \texttt{Smooth}(\mathbf{x}, V, |V|, \operatorname{conn}(V)),$$

where  $\mathbf{x}_{new}$  is the proposed new position of v, |V| is the number of adjacent vertices, and  $\operatorname{conn}(V)$  is the adjacent vertex connectivity information. Ideally, the new location of the free vertex will improve the mesh according to some measure of mesh quality such as dihedral angle or element aspect ratio.

To evaluate the mesh quality for the mesh elements, let  $f_i(\mathbf{x})$ , i = 1, ..., n, be the values of mesh quality affected by a change in  $\mathbf{x}$ . For example, if we use dihedral angles as a mesh quality measure in a three-dimensional mesh, each tetrahedron would have six function values, one for each edge of the tetrahedron. Thus, the total number of function values affected by a change in  $\mathbf{x}$  would be the number of tetrahedra containing the vertex v multiplied by six. Let the minimum of the function values obtained at  $\mathbf{x}$  be called the *active value*, and the set of function values that obtain that value, the *active set*, be denoted by  $\mathcal{A}(\mathbf{x})$ .

The action of the function Smooth is determined by the particular algorithm chosen, and in this section we briefly describe several different methods; more details can be found in Freitag et al.<sup>16</sup>, Freitag and Ollivier-Gooch<sup>14</sup>, and Freitag<sup>13</sup>.

#### 2.1.1 "Smart" Laplacian Smoothing

The first smoothing algorithm is a variant of Laplacian smoothing that relocates the mesh grid point to the geometric center of the adjacent grid points only if the quality of the local mesh is improved according to some mesh quality measure. Computing  $\mathbf{x}_{new}$ is quite inexpensive, and the total time required by this method is dominated by the two function evaluations needed to determine the initial quality of the mesh and the resulting quality of the mesh.

#### 2.1.2 Optimization-based Smoothing

In Freitag et al.<sup>16</sup> and Freitag and Ollivier-Gooch<sup>14</sup>, a low-cost, optimization-based alternative to Laplacian smoothing was proposed. This optimization technique uses function and gradient evaluations to find the minimum (or maximum) value that a mesh quality measure obtains in the solution space. The goal of the optimization approach is to determine the position  $\mathbf{x}^*$  that maximizes the composite function

$$\phi(\mathbf{x}) = \min_{1 \le i \le n} f_i(\mathbf{x}). \tag{1}$$

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For most quality measures of interest, the functions  $f_i(\mathbf{x})$  are differentiable. However, the composite function  $\phi(\mathbf{x})$  has discontinuous derivatives wherever a change occurs in the active set.

We solve this nonsmooth optimization problem using an analogue of the steepest descent method for smooth functions. The search direction s at each step is computed by solving a quadratic programming problem that gives the direction of steepest descent from all possible convex linear combinations of the gradients in the active set at x. The line search subproblem along s is solved by predicting the points at which the set of active functions will change based on the first-order Taylor series approximations of the  $f_i(\mathbf{x})$ . The distance from the current position to the point at which the active sets are predicted to change gives the initial step length  $\alpha$ . Standard step acceptance and termination criteria are used to ensure a robust implementation.

It has be shown that this technique is equivalent to generalized linear programming techniques by Amenta et al.<sup>1</sup> and thus the convex level set criterion can be used to determine whether there is a unique solution  $\mathbf{x}^*$ . Amenta et al.<sup>1</sup> describe the level sets for several mesh quality criteria and found that many of them meet the convexity requirement for unique solutions.

We note that other optimization-based smoothing techniques have been developed by researchers in the mesh generation and computational geometry communities. These methods differ primarily in the optimization procedure used or in the quantity that is optimized. For example, Bank<sup>7</sup> and Shephard and Georges<sup>27</sup> propose similar techniques for triangles and tetrahedra, respectively. In these methods, an element shape quality measure, q(t), is defined based on a ratio of element area (volume) to side lengths (face areas). In each case, q(t) is equal to one for equilateral elements and is small for distorted elements. The free vertex is moved along the line that connects its current position to the position that makes q(t) equal to one for the worst element in the local submesh. The line search in this direction is terminated when two elements have equal shape measure. We note that this does not necessarily guarantee that the optimal local solution has been found.

All the techniques mentioned above optimize the mesh according to element geometry. In contrast, Bank and Smith<sup>6</sup> propose two smoothing techniques to minimize the error in finite element solutions computed with triangular elements with linear basis functions. Both methods use a damped Newton's method to minimize the interpolation error or the a posteriori error estimates for an elliptic partial differential equation. The quantity minimized in both of these cases requires the computation of approximate second derivatives for the finite element solution as well as the shape function q(t) for triangular elements mentioned above.

#### 2.1.3 Combined Approaches

Experiments in Freitag<sup>13</sup> and Freitag and Ollivier-Gooch<sup>15</sup> showed that the most effective and efficient smoothing approach combined the smart Laplacian smoother with the optimization-based algorithm. Four related combination approaches which used Laplacian smoothing as a first step followed by optimization-based smoothing for the worst quality elements were compared to results obtained with smart Laplacian and optimization-based smoothing used alone. Test meshes for several application geometries in both two and three dimensions were obtained using a variety of meshing techniques ranging from Delaunay triangulation<sup>28, 19</sup> to octree-based<sup>29</sup> advancing front<sup>8</sup>, and point insertion algorithms<sup>21</sup>. In all cases, the mesh quality function used to determine the active value was the minimum sine of the angles (dihedral angles in three dimensions) in the incident elements. Because the sine function is small near the angles of 0° and 180°, this mesh quality measure has the effect of eliminating both large and small angles in the mesh. Effectiveness of the smoothing technique was measured by examining the global minimum and maximum angles/dihedral angles in two/three dimensions.

In those experiments we found that the optimization-based method vielded a greater increase in the minimum angle than the Laplacian smoother did. In fact the Laplacian smoother often failed to eliminate extremal angles in the mesh. The Laplacian smoother yields a greater number of near equilateral triangles and tetrahedra due to the averaging effect of the operator. The increase in computational cost associated with the optimization-based smoother compared to the Laplacian smoother was approximately a factor of four in two dimensions and a factor of ten in three dimensions. For all but one case, the combined approaches were able to obtain the same minimum angle as optimizationbased smoothing used alone at a fraction of the cost. In addition, the combined approaches created more equilateral elements than optimization-based smoothing used alone. We concluded that the combined techniques generally generate higher-quality meshes than either Laplacian or optimization-based smoothing used alone. The cost the combined approaches varied depending on the number of optimization steps performed. We note that more than three sweeps of the mesh offer minimal improvements for the meshes and methods tested.

All the mesh smoothing results presented in this paper use three to five passes of a combined approach in which smart Laplacian smoothing is used a first step to improve all elements. This step followed by optimization-based smoothing for the worst quality elements (those with angles less than 30 degrees in 2D and 15 degrees in 3D). This combined approach has a computational cost of roughly two times the cost of smart Laplacian smoothing. The quality criterion used is maxmin sine.

# 2.2 Local Mesh Reconfiguration Techniques

Local mesh reconfiguration techniques change the connectivity of part of a simplicial mesh to improve mesh quality. For triangles, these techniques are based on edge swapping, and for tetrahedra, these techniques can be divided into two classes: face swapping and edge swapping.

Face swapping reconnects the tetrahedra separated by a single interior face. Each interior face in a tetrahedral mesh separates two tetrahedra made up of a total of five points. A large number of nonoverlapping tetrahedral configurations are possible with these five points, but only two can be legally reconnected. These two cases are shown in Figure 1. On the left is a case in which either two or three tetrahedra can be used to fill the convex hull of a set of five points. Switching from two to three tetrahedra requires the addition of an edge interior to the convex hull. On the right of the figure is a configuration in which two tetrahedra can be exchanged for two different ones. The shaded faces in the figure are coplanar, and swapping exchanges the diagonal of the coplanar quadrilateral. The two coplanar faces must either be boundary faces or be backed by another pair of tetrahedra that can be swapped two for two. Otherwise, the new edge created by the two for two swap will not be conformal.

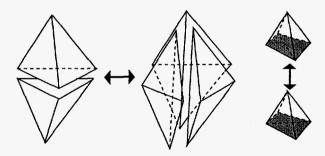


Figure 1: Swappable configurations of five points in three dimensions

Because each reconfigurable case has only two valid configurations, a quick comparison to find the one with the higher quality is possible. If the higherquality configuration is not already present, reconnection is performed to obtain it. In the case of configurations of equal quality, we select the two-tet configuration when choosing between two and three tet configurations, and we choose not to swap in the two-for-two reconfiguration case.

Edge swapping reconfigures N tetrahedra incident on an edge of the mesh by removing that edge and replacing the original N tetrahedra by 2N - 4 tetrahedra. The reconfiguration is performed only if every new tetrahedron has better quality than the worst of the N original tetrahedra. In principal, edge swapping could be used to replace, for example, 12 tetrahedra with 20, but in practice we have found that the number of transformations that improve the mesh declines dramatically with increasing N. In particular, for practical cases 7-for-10 transformations are rare, and consequently we have not investigated these techniques for N > 7. Edge swapping is used in two ways: first, as a supplement to face swapping, and second as a separate procedure specifically designed to remove poor quality tetrahedra. More details can be found in Freitag and Olliver-Gooch<sup>15</sup>.

We use two geometric quality measures to determine whether to locally reconnect a tetrahedral mesh: the minmax sine of the angle criterion and the in-sphere criterion. The minmax sine criterion chooses the configuration that minimizes the maximum sine of the dihedral angle of the tetrahedra formed by the five points in the two tets incident on a face. The in-sphere criterion selects the configuration in which no tetrahedron formed by four of the five points contains the other point in its circumsphere. This leads to a locally Delaunay tetrahedralization in the sense that there is no face in the mesh with incident cells violating the in-sphere criterion that are reconfigurable. For either criterion, however, the optimum reached by this face-swapping algorithm will probably be local rather than global. Recent work by Joe 20 describes a more advanced technique for improving mesh quality by local transformations. This approach notwithstanding, however, it is not known whether the global optimum can be reached by any series of local transformations.

### 2.3 Mesh Improvement Results

In Freitag and Ollivier-Gooch<sup>14</sup>, we presented results for mesh improvement using in-sphere and minmax dihedral angle face swapping and Laplacian and optimization-based smoothing techniques for threedimensional tetrahedral meshes. For two random meshes and three application meshes, we showed that neither swapping nor smoothing were able to make significant improvements in mesh quality when used alone. The face swapping techniques fail to remove very small and very large angles and the smoothing techniques fail to improve the overall distribution of angles because they cannot change local mesh connectivity. However, we showed for these test cases that the cumulative improvement obtained

	Min	Max	% dihe	dral ang	les <	% dih	edral ang	gles >
Case	Dihed	Dihed	6°	12°	18°	162°	168°	174°
T-fire boiler before	0.26°	179.63°	0.13	0.45	0.92	0.21	0.10	0.026
T-fire boiler after	1.59°	176.59°	0.019	0.065	0.11	0.034	0.018	0.0018
Tire incinerator before	0.66°	178.88°	0.11	0.54	1.27	0.072	0.035	0.0075
Tire incinerator after	4.34°	174.28°	0.0045	0.014	0.10	0.0060	0.0030	0.0015
ONERA M6 wing before	0.0066°	179.984°	0.78	1.63	2.85	0.57	0.41	0.23
ONERA M6 wing after	0.035°	179.929°	0.28	0.79	1.69	0.25	0.13	0.048

Table 1: Mesh improvement for three application meshes

when combining in-sphere and minmax swapping followed by the combined smoothing technique results in very high quality meshes.

Two of the application meshes were generated in the interior of a tangentially-fired (t-fired) industrial boiler and a tire incinerator, respectively. The third application mesh was generated around the ONERA M6 wing attached to a flat wall. Each mesh was generated using point insertion techniques combined with face swapping<sup>14</sup>.

The improvement in mesh quality achieved for each of the three application meshes is shown in Table 1. For each case we show the minimum and maximum angle in the mesh before and after mesh improvement as well as the percentage of angles in the lower and upper three 6° bins. For all three cases, mesh quality is improved significantly. The final mesh quality differs dramatically among the three cases, because of the initial topology and point distribution of the meshes. For example, the M6 wing mesh began with a very large number of poor dihedral angles in adjacent tetrahedra. Clustering of bad tetrahedra was fairly common in our initial meshes, with the worst cells often sharing vertices, edges, or even faces. While smoothing improved many tetrahedra, some could not be improved without making a neighboring cell worse, and so no improvement was made.

These experiments led to several general recommendations for the improvement of tetrahedral meshes which we list here.

- Never use the in-sphere criterion during the final pass of face swapping. The in-sphere criterion performs poorly in practice with respect to extremal angles. Edge swapping is a beneficial supplement to face swapping and should be used.
- Meshes whose connectivity has not been improved during generation should be reconnected using in-sphere face swapping, followed by face and edge swapping using the maxmin sine of

dihedral angle criterion. For meshes that have initially reasonable connectivity, only the second pass need be performed.

• The local reconnection schemes should be followed by two passes of a combined Laplacian/optimization-based smoothing technique followed by an edge swapping procedure to remove the worst tetrahedra from the mesh and finishing with two more passes of smoothing. Quality criteria that tend to eliminate small angles in the mesh are more effective than criteria that tend to eliminate large angles.

# 3 Numerical Experiments

We now examine the effect of mesh quality on the convergence rates of commonly used solution techniques for incompressible and weakly compressible, two-dimensional flow applications. We consider two test cases; the first is incompressible flow in a channel around a cylinder, and the second is weakly compressible flow over a cylinder at Mach 0.3. The solution for the first test case is obtained using linear finite element techniques with four point Gaussian quadrature. The linear systems are solved by using the GMRES solvers in the PETSc toolkit for scientific computation<sup>4</sup> with a relative convergence tolerance of  $1^{-12}$ . The solution for the second test case is computed using an edge-based, vertex-centered finite volume solver for which second-order accuracy is attained using least-squares reconstruction. Results for both cases show that element quality has a significant effect on the convergence rate of the solution procedure and that the cost of the mesh optimization procedures described in the previous section is less than the cost to obtain comparable accuracy on poor quality meshes.

# 3.1 Case Study 1: Incompressible Flow Over a Cylinder

Our first case study is incompressible flow over a cylinder centered in a channel. The computational domain is four cylinder diameters long and two wide with a symmetry condition imposed on the upper and lower surfaces. For our test problem we choose the radius of the cylinder to be .25 and the uniform flow to be U = 1 in the *x*-direction. The computational domain is triangulated with the delaunay mesh generation package Triangle<sup>28</sup>. We show the geometry and a typical mesh with N = 800 grid points in Figure 2.

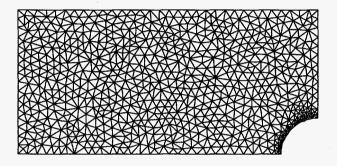


Figure 2: Delaunay mesh for flow over a cylinder (N=800)

Experiment 1: Convergence of GMRES. Our first experiment examines the effect of grid spacing on the convergence rate of the GMRES solvers. It is well known that the number of iterations for the ILU preconditioned Conjugate Gradient (ILUPCG) algorithm increases as the grid spacing, h, decreases. In particular, for elliptic operators with periodic boundary conditions on the unit square, several authors have shown that the number of iterations required by ILUPCG is proportional to  $h^{-\frac{1}{2}}$  when 2nd order central finite differences is used on natural ordering of grid points<sup>11</sup>. To empirically obtain the convergence behavior of GMRES on this domain we ran a series of numerical experiments with N = 200, 400, 800, 1600, 3200, 6400, and 12800grid points. Each of these meshes has a minimum angle of approximately 30° and a maximum angle between 110° and 120°. We consider three different solvers; GMRES with no preconditioning (GM-RES), GMRES with Jacobi preconditioning (GM-RES/Jac), and GMRES with no-fill ILU preconditioning (GMRES/ILU). All are restarted using the PETSc default value of 30 iterations. Table 2 gives the number of grid points used and the number of iterations required for each of the three solution techniques.

Table 2: Number of iterations as a function the number of grid points in the mesh

	Number of Iterations						
Ν	GMRES	GMRES/Jac	GMRES/ILU				
200	199	172	41				
400	316	217	79				
800	670	567	143				
1600	1176	949	218				
3200	2093	1571	303				
6400	4205	3128	690				
12800	8571	5605	1263				

The number of iterations for each of the solution techniques is also given graphically in Figure 3 as a log-log plot. It is clear that in each case the number of iterations is growing as a function of N and that ILU requires considerably fewer iterations than the other two techniques. Linear least squares analysis gives the slopes of these curves to be s = .907, .866, and .792 for GMRES, GM-RES/Jac, and GMRES/ILU respectively. Thus, as N increases, the number of iterations grows as  $N^s$ . We further note that the work required for each iteration is dominated by a matrix/vector multiplication which is  $\mathcal{O}(N)$  operations for the sparse linear systems generated by the finite element technique. Therefore, the total work required to solve the system is approximately  $\mathcal{O}(N^{1+s})$  for each of the iterative techniques.



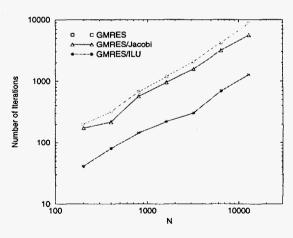


Figure 3: The number of iterations as a function of the number of grid points in the mesh

**Experiment 2:** The effect of element quality on convergence. We use the iteration counts given in

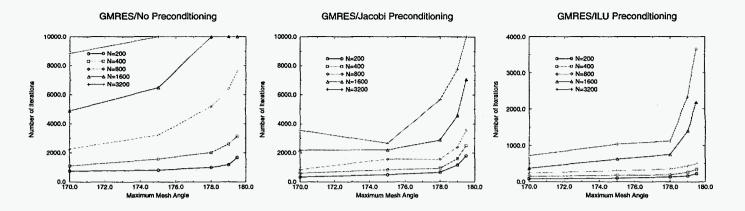


Figure 5: The effect of element quality on the convergence rate of the three solution techniques elements

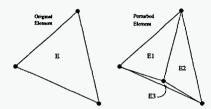


Figure 4: An example of perturbing an element to create poor quality elements

Table 2 as a baseline to examine the effect on the convergence rates of element quality as measured by the maximum angle. To control the maximum angle in the mesh, we start with the original meshes created with Triangle and insert a new grid point a distance  $\epsilon$  from and perpendicular to the midpoint of an edge of ten percent of the elements. The distance  $\epsilon$  is chosen to result in an element with the desired maximum angle. For each point inserted two new elements are created so that the final mesh has N + .1N grid points and 2N + .2Nelements. An example this point insertion technique is shown in Figure 4. Using this technique we created a series of meshes for each original mesh with N = 200, 400, 800, 1600, and 3200 grid points. Each series consists of five meshes with poor quality elements whose maximum angles are 170°, 175°, 178°, 179°, and 179.5°, respectively.

In Figure 5 we show the number of iterations required to reach an accuracy comparable to that obtained on the original meshes verses the maximum angle in the mesh for each of the three solution techniques. For each iterative technique, large maximum angles significantly affect the convergence rate, particularly if the maximum angle is  $178^{\circ}$  or greater. In fact, for the largest values of N and for maximum angles greater than  $175^{\circ}$  and  $179^{\circ}$ , GMRES and GM- RES/Jac failed to converge to the desired tolerance in less than the maximum number of iterations allowed (10,000). GMRES/ILU performs significantly better and has severely degraded performance only when maximum angles are greater than 178°.

For each N and a maximum angle of 170°, the number of iterations for GMRES is roughly tripled compared to GMRES on the original mesh, more than doubled for GMRES/Jac, and almost doubled for GMRES/ILU. We note that the amount of work required to smooth each mesh is an  $\mathcal{O}(N)$  operation, and the following question arises: "For what values of N and maximum angle in the mesh is the extra work associated with smoothing the mesh less than the extra work required to obtain an accurate solution on a poor quality mesh?".

**Experiment 3:** Determination of smoothing benefits on solution time. We address the question given above by comparing computing the difference in solution times on the poor quality mesh and on an improved mesh (including the time to improve the mesh). For this experiment, we improve each mesh with three passes of the combined approach described in Section 2.1.3 and element quality typically improves to greater than 15° for the minimum angles and less than 140° for the maximum angle. From our first and second experiments, we expect that the benefits of smoothing will be more pronounced as both N and the maximum angle increase, and we include the original meshes and their smoothed counterparts as well so that the maximum angles considered in this experiment range from 110° to 179.5°. In Figure 6, we show the difference solution times for the value of N which contained the point at which the cost of mesh optimization procedures was less than the time required to solve the problem on the poor quality mesh. For GMRES, this N is 800, and for GMRES/Jac and GMRES/ILU

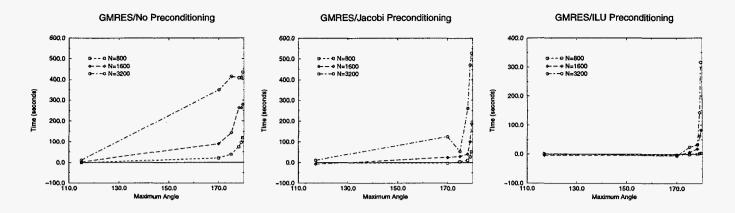


Figure 6: The solution times for convergence of the three iterative techniques for poor quality meshes and the same meshes after smoothing

this N is 1600. The time to smooth these meshes was approximately 3.8 seconds for N = 800 and 7.9 seconds for N = 1600. We note that for GMRES, N=800, only the original mesh has a smaller solution time than the smoothed counterpart. For GM-RES/Jac the cross-over point is quite close to the original mesh and significant improvements are seen as the maximum angle in the mesh increases. For GMRES/ILU, the benefits are not as pronounced for N = 1600, but we note that for N = 3200 performing mesh smoothing resulted in a lower total computational cost on the original and perturbed meshes for all iterative techniques.

# 3.2 Case Study 2: Compressible Flow Over a Cylinder

Our second case study examines the effect of mesh quality on convergence behavior for weakly compressible flow over a cylinder at Mach 0.3. The computational domain is nine cylinder diameters long and three diameters wide, with a symmetry condition imposed on the upper surface. For this experiment, we generated three meshes each beginning with the same random point set with point density falling exponentially with distance from the surface. This distribution corresponds to a constant stretching ratio for structured meshes. The point set contains 2500 interior points and 190 boundary points, which are evenly spaced on the cylinder, inflow, outflow, and upper symmetry plane and exponentially stretched along the lower symmetry plane. The first mesh, shown in Figure 7, was generated by simply inserting the random points into the mesh and swapping using the Delaunay criterion. The smallest angle in this mesh is  $0.56^{\circ}$  and the largest is  $178.86^{\circ}$ . The second mesh (see Figure 8) was obtained by performing five passes of optimization-based smoothing on the vertices of the first mesh; this improves the extremal angles to  $12.3^{\circ}$  and  $145.6^{\circ}$ . The third mesh, shown in Figure 9, was obtained from the first mesh by performing five passes of smoothing alternating with passes of swapping using the Delaunay criterion; this mesh has extremal angles of  $23.2^{\circ}$  and  $131.9^{\circ}$ . Figure 10 compares the overall angle distribution for the three meshes. Clearly, smoothing alone is very successful in improving the angle distribution, dramatically reducing the number of both small and large angles. When combined with swapping, the improvement is even greater.

Flow around the cylinder was computed using an edge-based, vertex-centered finite volume Second-order accuracy was attained ussolver. ing least-squares reconstruction<sup>9, 22, 23</sup>. Following reconstruction, fluxes were computed using Roe's flux formula and integrated for each control volume. Time advance was performed using an explicit multi-stage scheme with multigrid convergence acceleration<sup>24</sup>. In each case, the same three coarse meshes were used to eliminate the effects of coarse mesh convergence behavior on the results. Figure 11 shows the convergence rates for each of the fine meshes. The random mesh fails to converge, falling into a limit cycle with large variations in flow parameters. The smoothed mesh and the smoothed and swapped mesh cases both converge, with the asymptotic rate being about 25% faster for the latter case. In both cases, the mesh optimization procedures required less time than a single cycle of the multigrid solver. In both cases, convergence is limited by behavior near the rear separation point on the cylinder, where local time step is limited by acoustic modes while the solution is changing due to convective modes with a propagation speed of M = 0.01 or

less.

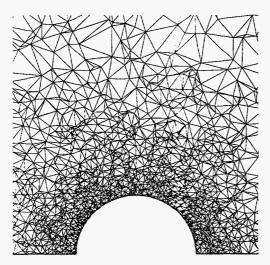


Figure 7: Random mesh

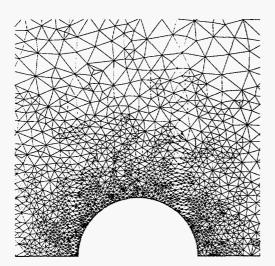


Figure 8: Smoothed mesh

# 3.3 Summary and Conclusions

In this paper we examined the costs and benefits of using mesh optimization procedures to improve mesh quality for computational fluid dynamics applications. We briefly reviewed several mesh improvement techniques and strategies for triangular and tetrahedral meshes and presented typical results for the improvement of application meshes. We then examined two CFD applications involving flow over a cylinder solved with finite element and finite volume solution techniques.

In both cases, we showed that mesh improvement is critical to the efficient solution of the application,

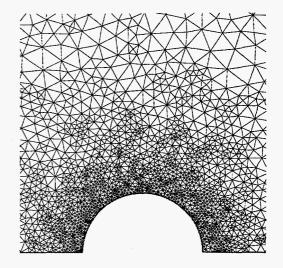


Figure 9: Smoothed and swapped mesh

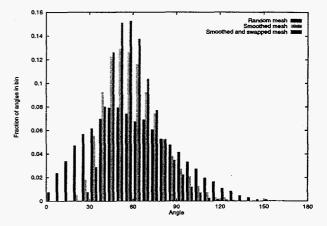


Figure 10: Angle distribution for cylinder meshes

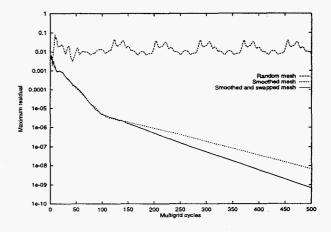


Figure 11: Convergence histories for subsonic cylinder flow

and that the cost of mesh improvement techniques is less than the cost of solution time on a poor quality mesh.

In future work we will extend our study of the ramifications of mesh quality on solution techniques to include more difficult three-dimensional CFD applications and an in-depth analysis of solution accuracy.

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