Fully Threaded Tree for Adaptive Refinement Fluid Dynamics Simulations

A. M. Khoklov

Laboratory for Computational Physics and Fluid Dynamics

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A. M. Khokhlov

Naval Research Laboratory
Washington, DC 20375-5320

NSF, 4201 Wilson Blvd., Arlington, VA 22230
NASA, Washington, DC 20546-0001
DARPA, 3701 North Fairfax Dr., Arlington, VA 22203
ONR, 800 North Quincy Street, Arlington, VA 22217-5660

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A fully threaded tree (FTT) for adaptive refinement of regular meshes is described. By using a tree threaded at all levels, tree traversals for finding nearest neighbors are avoided. All operations on a tree including tree modifications are $O(N)$, where $N$ is a number of cells, and are performed in parallel. An efficient implementation of the tree is described that requires $2N$ words of memory. A filtering algorithm for removing high-frequency noise during mesh refinement is described.

A FTT can be used in various numerical applications. In this paper, it is applied to the integration of the Euler equations of fluid dynamics. An adaptive-mesh time stepping algorithm is described in which different time steps are used at different levels of the tree. Time stepping and mesh refinement are interleaved to avoid extensive buffer layers of fine mesh which were otherwise required ahead of moving shocks. Test examples are presented, and the FTT performance is evaluated. The three-dimensional simulation of the interaction of a shock wave and a spherical bubble is carried out that shows the development of azimuthal perturbations on the bubble surface.
FULLY THREADED TREE FOR ADAPTIVE REFINEMENT FLUID DYNAMICS SIMULATIONS

1. Introduction

Adaptive mesh refinement (AMR) is used to increase spatial and temporal resolution of numerical simulations beyond the limits imposed by the available hardware. In fluid dynamics, AMR is used in simulations of both steady and unsteady flows on structured and unstructured meshes [1-23]. A mesh is \textit{structured} if it is composed of cells of rectangular shape, otherwise it is called unstructured. Integration of the equations of fluid dynamics is easier and the overhead in computer time and memory per computational cell are minimal for structured meshes. The corresponding overhead is usually high for unstructured meshes. However, an unstructured mesh has the advantage that it can conform well to a complex boundary. Whether to use a structured or unstructured approach depends on the specific problem, code availability, and general preferences. This paper deals with structured meshes, and specifically with a structured-mesh AMR.

There are two different approaches to structured-mesh AMR. In one standard approach, cells are organized as two-dimensional or three-dimensional arrays (grids). A coarse base grid represents the entire computational domain. Finer, nested grids are layed over coarser grids where more resolution is required. A grid hierarchy may be organized as a tree [1–12]. One advantage of this approach is that any single-grid fluid flow solver can be used without modifications for AMR. However, grids themselves are inflexible structures. It is difficult to cover complex features of a flow with a few grids. Many grids are typically required, and a substantial number of computational cells can be wasted on a smooth flow. Several grids of the same level of refinement may overlap which leads to duplication of cells. Periodic rebuilding of the entire grid hierarchy is required when the flow evolves with time.

In an alternative approach, individual computational cells are organized directly in a tree [13]. Each cell can be refined or unrefined separately from the others, as needed. At every level of the tree, the mesh may have an arbitrary shape, as opposed to grids. Duplication of cells is avoided. To date, this approach has been used mainly in steady-state fluid flow simulations [13–20]. It has been applied to unsteady flows in two dimensions [21–23]. The main advantages of the tree approach are the flexibility in refinement and unrefinement, and the efficiency in using cells. However, there are certain problems with the tree approach: (1) Access to neighboring cells is more difficult in a tree than in an array. Tree traversals to access nearest neighbors are difficult to vectorize and parallelize. (2) The memory overhead to maintain a tree, though less than for unstructured meshes, is still substantial [21-23]. Thus, an efficient parallel access to information on a tree, and reduction of the memory overhead are the two problems that need to be solved.

Another problem, (3), arises in unsteady flow simulations with many levels of tree refinement. In unsteady simulations, buffer layers of finely refined cells must be created in advance and ahead

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of shocks to prevent them from running out of the fine mesh. Let the maximum and minimum levels of mesh refinement be $l_{\text{max}}$ and $l_{\text{min}}$, respectively, and the cell refinement ratio be a factor of two. If refinement is done between time steps [21-23], the thickness of the buffer layers should be at least $2^{l_{\text{max}}-l_{\text{min}}}$ finest cells. The number of required cells then increases exponentially when $l_{\text{min}} - l_{\text{max}}$ increases, and becomes prohibitively large, especially in three dimensions, if $l_{\text{max}} - l_{\text{min}}$ is large.

This paper addresses the problems outlined above. To alleviate problems (1) and (2), a new structure, a fully threaded tree (FTT), is designed. In an ordinary tree, each cell has pointers to its children, if any. The memory for keeping these pointers is not used in leaves (cells which do not have children). In a threaded tree, this free memory is used to organize "threads" along which the tree can be quickly traversed during various search operations. A discussion of a binary threaded tree in which threads are used for left-to-right and right-to-left search can be found in [24]. A binary-, quad-, or an oct-tree is required to organize a one-, two-, or three-dimensional regular mesh, respectively. An implementation of an oct-tree would require at least 8 words of memory per cell. Some of this memory can then be used to make threads through leaves in order to facilitate finding the nearest neighbors. However, this scheme cannot find neighbors of split cells, and cannot be parallelized (Section 4). In the FTT described in this paper, every cell, whether a leaf or not, has an easy access to its children, neighbors and parents. One may say that an FTT is a tree threaded in all possible directions. At the same time, the memory overhead for supporting an FTT is significantly reduced. The maintenance of an octal FTT requires two words of memory per computational cell only. Another important property of a FTT is that all operations on it, including modifications of the tree structure itself, can be performed in parallel. This then allows vectorization and parallelization of tree-based AMR algorithms.

In this paper, the FTT is used for the integration of the Euler equations of fluid dynamics. To alleviate the third problem outlined above, the integration in time and tree refinement have been coupled together, and time stepping at different levels of the tree and tree refinements of these levels have been interleaved. As a result, excessive buffer layers of refinement ahead of moving shocks are no longer needed.

The following sections describe the equations solved (Section 2), tree structure and discretization of the equations on the tree (Section 3), tree implementation (Section 4), integration of the Euler equations (Section 5), refinement and unrefinement (Section 6), numerical tests (Section 7), and FTT performance (Section 8).
2. Equations

In this paper, the FTT is used to solve the Euler equations for an inviscid flow

\[
\frac{\partial \rho}{\partial t} + \nabla \cdot (\rho \mathbf{U}) = 0 ,
\]

\[
\frac{\partial \rho \mathbf{U}}{\partial t} + \nabla \cdot (\rho \mathbf{U} \mathbf{U}) + \nabla P = \rho \mathbf{g} ,
\]

\[
\frac{\partial E}{\partial t} + \nabla \cdot ((E + P) \mathbf{U}) = \rho \mathbf{U} \cdot \mathbf{g} ,
\]

where \( \rho \) is the mass density, \( \mathbf{U} \) is the fluid velocity, \( E \) is the total energy density, \( P = P(E_i, \rho) \) is the pressure, \( E_i = E - \rho u^2/2 \) is the internal energy density, and \( \mathbf{g} \) is an external acceleration.

Numerical integration of (1) requires evaluating of numerical fluxes of mass, momenta, and energy at cell interfaces. We use a second order accurate Godunov-type method based on the solution of a Riemann problem to evaluate the fluxes [26-28]. This is one of the monotone methods known to provide good results for both flows with strong shocks, and for moderately subsonic and turbulent flows [32-34]. However, the algorithms described in this paper are general, and can be used in conjunction with other high-order monotone methods such as the Flux-Corrected-Transport [35], for example.

3. FTT structure and discretization

A computational domain is a cube of size \( L \). It is subdivided to a number of cubic cells of various sizes 1/2, 1/4, 1/8, ... of \( L \). Cells are organized in an oct-tree with the entire computational domain being the root. For the integration and refinement algorithms to be effective, the following information must be easily accessible for every cell \( i \):

- \( iLv(i) \) - level of the cell in the tree
- \( iKy(i) \) - TRUE/FALSE if cell is split/unsplit
- \( iP(i) \) - pointer to a parent cell
- \( iCh(i,j) \) - pointers to children, \( j = 1 \div 8 \)
- \( iN(i,j) \) - pointers to neighbors, \( j = 1 \div 6 \).

The cell size is related to \( iLv(i) \) by \( \Delta_i = 2^{-iLv(i)} L \).

Cells in the tree are either split (have children) or leaves (do not have children). Relations between cells in the tree, and the directions of various pointers are illustrated in Figure 1 for a one-dimensional binary tree. Relations for a quad- or an oct-tree are similar. In Figure 1, the root (cell 1) represents the entire computational domain. It has two children (cells 2 and 3), each representing half of the domain. There will be four or eight children in 2-D or 3-D, respectively.
Cell 2 is further subdivided on two cells (cells 4 and 5). Neighboring leaves are not allowed to differ in size by more than a factor of two. The neighbor-neighbor relation is not reciprocal for leaves of different size that face each other. In Figure 1, cell 5 has cell 3 as its neighbor, but cell 3 has cell 2 as its neighbor, and not cell 5. A j-th neighbor of a cell i either has the same size as the cell itself, \( \Delta_{iNM(i,j)} = \Delta_i \), or it is two times larger, \( \Delta_{iNM(i,j)} = 2\Delta_i \). In the former case, the neighbor may be a leaf or a split cell. In the latter case, it can only be a leaf.

Physical state information \( \mathcal{U}_i = \{\rho_i, E_i, (\rho U)_i\} \) is kept in both split and unsplit cells. Information kept in split cells is needed to evaluate mass, momenta and energy fluxes across interfaces between leaves of different size (Section 5), and to make decisions about refinement and unrefinement (Section 6). The physical state vectors for split cells are updated by averaging over children, when required. The memory overhead for keeping state vectors of split cells is

\[
\text{Overhead} = \frac{\text{Number of splits}}{\text{Number of leaves}} = \frac{1}{2^{\dim}} + \frac{1}{2^{2\dim}} + \frac{1}{2^{3\dim}} + \cdots \approx \frac{1}{2^{\dim} - 1},
\]

where \( \dim = 1 \div 3 \) is a number of spatial dimensions. The overhead is \( \approx 100\% \) in 1-D, \( \approx 33\% \) in 2-D, and \( \approx 14\% \) in 3-D.

Coordinates \( \mathbf{r}_i = \{x_i, y_i, z_i\} \) of cell centers are associated with every cell. It is assumed that neighbors 1 to 6 of a cell are left X, right X, left Y, right Y, left Z, and right Z neighbors, respectively, and that coordinates increase from left to right: \( x_{iNM(i,1)} < x_i < x_{iNM(i,2)}, y_{iNM(i,3)} < y_i < y_{iNM(i,4)}, z_{iNM(i,5)} < z_i < z_{iNM(i,6)} \). Keeping coordinates is not necessary for finite-difference operations. They are useful, however, for evaluating long-range forces (e.g., gravity) by direct summation or multipole expansion algorithms.

4. Implementation of FTT

The FTT, as described above, can be implemented by storing all pointers, coordinates and flags in computer memory, and then modifying them when the tree is refined or unrefined. However, such a direct implementation requires \( 20N \) words of memory, where \( N \) is the number of cells in the tree. This memory overhead is too large. In addition, such a tree cannot be modified in parallel. Because neighbors of a cell keep pointers to that cell, cell removal requires retargeting these pointers. Removing one cell thus affects others. A conflict appears if a cell and its neighbors are to be removed simultaneously. Similar problems arise if neighboring cells are created simultaneously.

An improved parallel version of the tree is based on the following three observations: (i) When a cell is split, its eight children are created simultaneously. Thus, they may be stored in memory contiguously [13], so that only one pointer is needed to find all eight children. (ii) Since all eight children (siblings) are kept in memory together, neighbor-neighbor relations between them are
known automatically. There is no need for pointers between the siblings. (iii) Neighbors of any cell are either its siblings or they are children of a neighboring parent. There is a small fixed number of neighbor-neighbor relations between siblings of neighboring parents. Thus, a child's neighbor that belongs to a different parent can be determined without search if parents keep pointers to their own neighbors.

The FTT structure implemented is illustrated in Figure 2. All cells are organized in groups called octs. Each oct contains eight cells. Each cell has a physical state vector \( \mathcal{U} \) associated with it, and a pointer to an oct which contains its children, if any, or a nil pointer. Each oct knows its level, \( \text{OctLv} \), which is equal to the level of the oct's cells. Each oct has a pointer \( \text{OctPr} \) to a parent cell. Each oct has six pointers \( \text{OctNh(6)} \) to parent cells of neighboring octs. This information is enough to find neighbors, children and parents of every cell without searching. The memory requirement is 16 words per oct or 2 words per cell. The memory overhead is thus significantly reduced. The price for this is the computer-time overhead associated with computing cell pointers from oct pointers and oct pointers from cell pointers, but this overhead is relatively small (Section 8).

If needed, octs may also contain coordinates \( \text{OctPos} \) of their centers. These coordinates are equal to coordinates of the corresponding parent cells. Coordinates of cells that belong to an oct can be found by adding or subtracting \( \Delta_i/2 \) from the corresponding oct's coordinates. Memory requirement for coordinates is thus 3 words per oct or \( \frac{3}{8} \) words per cell, which increases the total memory requirement to \( 2\frac{5}{8} \) words per cell.

Figure 2 shows that FTT allows parallel modifications at any given tree level. To unrefine a cell, the associated oct pointed to by \( \text{OctCh} \) must be destroyed, and \( \text{OctCh} \) must be set to nil. No other changes are required in neighboring octs or cells located at the same tree level. This is because neighboring octs are accessed by parent cells located at a different level of the tree. To refine a cell, a new oct must be created with all necessary pointers, and the corresponding \( \text{OctCh} \) pointer of the refined cell must be set to a new oct. Again, no other changes in any other octs or cells located at the same tree level are required.

All operations on the tree can thus be expressed as a sequence of parallel operations on large groups of cells that belong to the same tree level. Therefore, it is possible to introduce a general iterator for performing operations on these cells, and to hide the details of parallelization inside it. This greatly reduces the amount of code, and simplifies coding. To perform a parallel operation, each processor first gathers all required information in work arrays using indirect addressing. Then, the CPU-intensive work is done by looping over contiguous blocks of memory. After that, the result is scattered back. In this way, the code performance is virtually unaffected by the distribution of cells in a physical space.
5. Integration procedure

Equations (1) are integrated in time with different time steps \( \Delta t(l) \) at different levels of the tree \( l; \ l_{\text{min}} \leq l \leq l_{\text{max}}, \) where \( l_{\text{min}} \) and \( l_{\text{max}} \) is the minimum and maximum levels of leaves. A global time step \( \Delta t = \Delta t(l_{\text{min}}) \) is determined from the CFL condition,

\[
\Delta t = c f l \frac{2^{-l_{\text{min}}} L}{\max_j \{\max_i (a_i + |U_{i,j}|)\}},
\]

where \( a \) is the sound speed, \( c f l < 1 \) is a constant, and maximum in (2) is taken over all three directions \( j = x, y, z \) and over all leaves \( i. \) Time steps at various levels are

\[
\Delta t(l) = 2^{l_{\text{min}} - l} \Delta t.
\]

Integration at different levels of the tree is interleaved with tree refinement. Let us designate the procedure of advancing level \( l \) one step \( \Delta t(l) \) in time as \( \mathcal{A}(l) \), and the procedure of tree refinement at level \( l \) as \( \mathcal{R}(l) \). The \( \mathcal{A} \) procedure is described later in this section. The \( \mathcal{R} \) procedure consists of refining leaves of level \( l \) and unrefining split cells of level \( l \) according to certain refinement criteria. This procedure is described in Section 6.

A global time step of integration can be expressed as a recursion,

\[
\text{Global Time Step} = S(l_{\text{min}}),
\]

where the procedure \( S(l) \) is a combination of advancing and refinement procedures

\[
S(l) = \mathcal{R}(l) \begin{cases} 
S(l + 1); \mathcal{A}(l); S(l + 1); \mathcal{A}^\dagger(l); & \text{if } l < l_{\text{max}}; \\
\mathcal{A}(l); \mathcal{A}^\dagger(l); & \text{if } l = l_{\text{max}}. 
\end{cases}
\]

All procedures in (5) are performed from left to right. The procedures \( S(l+1) \) and \( \mathcal{A}(l) \) are repeated twice when directional time-step splitting is used in \( \mathcal{A} \) (see below). After every \( \mathcal{A} \) procedure, the sequence of XYZ one-dimensional sweeps is recursively reversed. This is indicated by the \( \dagger \) superscript. Note that \( \mathcal{R} \) can change both \( l_{\text{max}} \) and \( l_{\text{min}} \), recursively. Therefore, the sequence of advances and refinements generated changes dynamically, and generally cannot be predicted from starting values of \( l_{\text{min}} \) and \( l_{\text{max}} \). The sequence can be determined in advance only if \( l_{\text{min}} \) and \( l_{\text{max}} \) are fixed during a global time step. For example, for \( l_{\text{min}} = 6 \) and \( l_{\text{max}} = 8 \) fixed, the sequence generated would be \([\mathcal{R}(6); [\mathcal{R}(7); [\mathcal{R}(8); \mathcal{A}(8); \mathcal{A}^\dagger(8)]; \mathcal{A}(7); [\mathcal{R}(8); \mathcal{A}(8); \mathcal{A}^\dagger(8)]; \mathcal{A}^\dagger(7)]; \mathcal{A}(6); [\mathcal{R}(7]; [\mathcal{R}(8); \mathcal{A}(8); \mathcal{A}^\dagger(8)]; \mathcal{A}(7); [\mathcal{R}(8); \mathcal{A}(8); \mathcal{A}^\dagger(8)]; \mathcal{A}^\dagger(7)]; \mathcal{A}^\dagger(6)].\) Square brackets separate different levels of recursion.
Now we describe the advance procedure, $A(l)$. The solution at every level $l$ is advanced in time using direction splitting. Equations for the X-sweep can be written as

$$\frac{\partial U}{\partial t} = \frac{\partial F(U)}{\partial x} + S,$$

where the flux vector is $F = (\rho U_x, (E + P)U_x, \rho U_x^2, \rho U_x U_y, \rho U_x U_z)$, and the source term is $S = (0, \rho U_x g_x, \rho g_x, 0, 0)$. The equations for the Y- and Z-sweeps are similar.

Let $U^0$ and $U^n$ be a state vector at the beginning and at the end of a global time step, respectively. Let us designate right and left neighbors of cell $i$ in the direction of a sweep as $i+$ and $i-$, respectively, and let us introduce the following quantities

$$\alpha = 2^{l_{\min}} \frac{\Delta t}{L}, \quad \beta = 2^{-\text{dim}} \alpha, \quad \text{and} \quad \gamma(i,l) = \begin{cases} \alpha, & \text{if } iLv(i+) = l; \\ \beta, & \text{if } iLv(i+) = l-1, \end{cases}$$

where $\text{dim} = 1 \div 3$ is the number of spatial dimensions. The $A(l)$ procedure can then be described in a form of the following pseudocode:

```plaintext
for (leaves $i$ of level $l-1$) { if (i has split neighbors) $U^n_i := U^0_i; \}$
for (X, Y, Z directions) {
    for (leaves $i$ of level $l$) {
        if (i+ is a leaf or boundary) {
            Compute fluxes $F_{i,i+}$ at the $(i,i+)$ interface;
            $U^n_{i+} := U^n_i - \alpha F_{i,i+} + \Delta t(l) S_i;$
            $U^n_{i,-} := U^n_{i,+} + \gamma F_{i,i+};$
        }
        if (i- is a leaf of level $l-1$ or boundary) {
            Compute fluxes $F_{i-,i}$ at the $(i-,i)$ interface;
            $U^n_{i,-} := U^n_i + \alpha F_{i-,i};$
            $U^n_{i,-} := U^n_{i,-} - \beta F_{i-,i};$
        }
    }
    for (leaves $i$ of level $l$) { if (i has no neighbors at level $l-1$) $U^0_i := U^n_i; \}$
}
for (split cells $i$ of level $l$) { $U^0_i := 2^{-\text{dim}} \sum_{j=1}^{2^{\text{dim}}} U^0_{i,C^j(h(i,j))}; \}$
for (leaves $i$ of level $l$) { if (i has split neighbors) $U^n_i := U^n_i; \}$
\}.
```
The factor $2^{-\text{dim}}$ in $\beta$, $\gamma$, and in (7) takes into account the difference in volumes of neighboring cells of different sizes.

The algorithm (4)-(7) is schematically illustrated in Figure 3 for the two-dimensional case. In this particular example, the tree has only two levels occupied by leaves, $l_{\text{max}} = l_{\text{min}} + 1$. Cells 1, 2, 3 and 4 belong to level $l_{\text{max}}$, and cells 5 and 6 belong to level $l_{\text{min}}$. During a time step at level $l = l_{\text{max}}$, fluxes across interfaces (1,3), (2,4), (3,5), and (4,5) are evaluated, new state vectors $U^n$ for cells 1, 2, 3 and 4 are computed, and old state vectors $U^o$ in these cells are updated. For cell 5, $U^o_5$ is changed due to fluxes $F_{3,5}$ and $F_{4,5}$. However, state vector $U^o_5$ is not updated yet. During the second time step $\Delta t(l)$, this procedure is repeated: States $U^o_1$, $U^o_2$, $U^o_3$, $U^o_4$ are updated, $U^o_5$ is changed again due to fluxes $F_{3,5}$ and $F_{4,5}$, but state vector $U^o_5$ is still not updated. After two time steps at level $l$, one time step at level $l - 1$ is performed. Fluxes at interface (5,6) are computed, $U^o_5$ is changed due to these fluxes, and the state vector $U^o_5$ is finally updated.

For leaves that have neighbors at the same tree level, the procedure is that of usual conservative finite differencing

$$U^o_i = U^o_{i-1} + \frac{\Delta t(l)}{\Delta x_i} (F_{i,i-1} - F_{i,i+1})$$

with left and right fluxes evaluated at the same time $t = t^o + \Delta t(l)/2$. For leaves that have split neighbors, flux contributions from more than two neighbors at two different moments of time, $t = t^o + \Delta t(l)/2$ and $t = t^o + 3\Delta t(l)/2$, are taken into account, again in a conservative fashion.

Fluxes are obtained by solving a Riemann problem at every interface according to [26]. Left and right states for the Riemann problems are obtained by a piecewise linear reconstruction [27] from $U^o$ state vectors. A small amount of dissipation is introduced into the code as an artificial diffusion added to the numerical fluxes [28]. For cells that have neighbors at the same tree level, the entire integration procedure is formally second order accurate both in space and in time. For cells that have neighboring leaves at different levels, the accuracy reduces to first order.

If necessary, accelerations $g$ are computed in the beginning of every advance procedure. To maintain the second order accuracy in time for the source term $S$, the state $U^o$ is corrected after every advance procedure as

$$\tilde{U} := U + \frac{g^{t+\Delta t} - g^t}{2} \Delta t ; \quad E := E + \rho \frac{\tilde{U}^2 - U^2}{4} ; \quad U := \tilde{U}.$$  \hfill (9)

6. Mesh refinement

The most difficult part of an AMR simulation is to decide where and when to refine or unrefine a mesh. It is also the most problem-dependent part. Different problems may require different
criteria for refinement and unrefinement. The refinement procedure currently implemented consists of four steps:

1. For every cell, a refinement indicator, $0 \leq \xi \leq 1$ is computed. Large $\xi > \xi_{\text{split}}$ indicates that a leaf must be refined, and small $\xi < \xi_{\text{join}}$ indicates that a split cell can be unrefined; $\xi_{\text{split}}$ and $\xi_{\text{join}}$ are some predefined constant values.
2. $\xi$ is smoothed in order to prevent cells from being falsely refined (mesh trashing) in places where $\xi$ fluctuates around critical values $\xi_{\text{split}}$ and $\xi_{\text{join}}$.
3. Leaves are refined if $\xi > \xi_{\text{split}}$.
4. Split cells are unrefined if $\xi < \xi_{\text{join}}$ and if they are not just split.

There are two approaches to computing $\xi$. First, it may be computed to measure the convergence of a solution [2]. This allows to control the accuracy of the solution "on flight," but requires that the solutions on the fine and coarse meshes be generated simultaneously. Another approach is to use an indicator proportional to gradients in the solution. Such an indicator shows where to expect a large error in the solution [16,19,20]. The convergence of the solution must be checked afterwards with a different resolution. We adopt the second approach, but note that the tree structure allows both approaches to be implemented.

The indicator $\xi$ is constructed as a maximum of several indicators,

$$\xi = \max(\xi^1, \xi^2, \ldots) \quad (10)$$

each of which is either a shock indicator, contact discontinuity indicator, or a gradient indicator, all normalized to unity, $0 \leq \xi^k \leq 1$.

As a shock indicator, the following quantity is used [28]

$$\xi^s_i = \max_{j=1,2,3,4,5,6} \xi^s_{i,j} ,$$

$$\xi^s_{i,j} = \begin{cases} 1, & \text{if } \frac{|P_{i,NB(i,j)} - P_i|}{\min(P_{i,NB(i,j)}, P_i)} > \epsilon_s \text{ and } \delta \cdot (U_{i,NB(i,j),k} - U_{i,k}) > 0; \\ 0, & \text{otherwise}; \end{cases} \quad (11)$$

where $\delta = 1 - 2 \cdot \text{mod}(j, 2)$, $k = \text{int}(j/2)$, and $\epsilon_s = 0.2$ determines the minimum shock strength to be detected.

A discontinuity indicator is defined as follows:

$$\xi^c_i = \max_{j=1,2,3,4,5,6} \xi^c_{i,j} ,$$

$$\xi^c_{i,j} = \begin{cases} 1, & \text{if } \frac{|P_{i,NB(i,j)} - P_i|}{\min(P_{i,NB(i,j)}, P_i)} < \epsilon_c \text{ and } \frac{|\rho_{i,NB(i,j)} - \rho_i|}{\min(\rho_{i,NB(i,j)}, \rho_i)} > \epsilon_c; \\ 0, & \text{otherwise}; \end{cases} \quad (12)$$
where $\epsilon_c = 0.2$.

A gradient indicator for a variable $a$ is constructed as

$$
\xi_{ij}^\gamma = \max_{j=1+6} \left( \frac{||a_{i+N^4(i,j)}| - |a_i||}{\max(|a_{i+N^4(i,j)}|, |a_i|)} \right),
$$

(13)

where $a$ may be a mass density, energy density, pressure, velocity, vorticity, etc.

As explained in the beginning of this section, the indicator $\xi$ computed according to (10) – (13) must be smoothed before it is used for refinement. Smoothing is based on the analogy with the propagation of a reaction-diffusion front. Let us consider $\xi$ as a concentration of a reactant obeying a reaction–diffusion equation

$$
\frac{\partial \xi}{\partial \tilde{t}} = K \nabla^2 \xi + Q,
$$

(14)

where $\tilde{t}$ is a fiducial time, $K = 2^{-2l}L^2$ is a constant diffusion coefficient, and

$$
Q = \begin{cases} 
1, & \text{if } 1 > \xi > \xi_{\text{split}}; \\
0, & \text{otherwise}; 
\end{cases}
$$

(15)

is a reaction rate. A steady-state form of (14),

$$
S_{\xi} \frac{\partial \xi}{\partial x} = \frac{\partial^2 \xi}{\partial x^2} + Q,
$$

(16)

describes a reaction front which moves with a constant speed

$$
S_{\xi} = 2^{-l}L\sqrt{\xi_{\text{split}}},
$$

(17)

and has a thickness

$$
\delta_{\xi} \simeq 2^{-l}L/\sqrt{\xi_{\text{split}}}. 
$$

(18)

As the front moves, it leaves behind cells marked with $\xi = 1$.

The values of $\xi$ from (10) are used as the initial condition for (14). The equation (14) then describes a reaction front which starts at places where $\xi > \xi_{\text{split}}$, and propagates outwards normal to itself with the speed $S_{\xi}$. By integrating (14), this front is advanced approximately $2 - 3$ computational cells. According to the Huygens principle, the front curvature tends to decrease with time, so that boundaries of regions marked for refinement become smoother. Diffusion prevails over reaction in isolated areas with $\xi > \xi_{\text{split}}$ if these areas have a size less than $\simeq \delta_{\xi}$. These small regions do not trigger a reaction front, and disappear under the refinement threshold ("extinguish"). This reduces the numerical noise in selecting cells for refinement and unrefinement. To further reduce mesh trashing, split cells are not joined if this produces an isolated leaf.
7. Numerical examples

Many numerical tests including advection, shock propagation and interaction in one, two and three dimensions were used to validate the algorithms. Here we show some test examples which illustrate adaptive mesh refinement aspects of the algorithm’s performance.

7.1 Isolated shock wave passing through a coarse-to-fine interface

Figure 4 shows a computation of an isolated $M = 10$ strong shock in an ideal gas with $\gamma = 1.4$. In all three panels, the shock is moving from left to right. The upper panel shows the shock profile at one time during the shock propagation through a uniform mesh. The shock profile is two cells wide, and oscillations free. When the shock passes from a fine to a coarse mesh (middle panel), the amplitude of disturbances generated is less than 1%. When passing from a coarse to a fine mesh (low panel), two types of disturbances, acoustic and entropy waves, are generated at the $\simeq 5\%$ amplitude.

A generation of spurious disturbances by a shock passing from a coarse to a fine mesh is a known problem [2,4,16]. An illustrative example for a $M = 10$ shock in an ideal gas with $\gamma = 1.4$ is presented by Berger and Colella [2]. Berger and Colella argue that the disturbances are caused by the $O(1)$ errors always present in the numerical fluxes in the vicinity of a strong shock. The errors do not cancel each other if mesh spacing is changing. Formally, Berger and Colella’s integration was second-order accurate at interfaces. In our case, the formal order of integration at interfaces is first order. However, our example shows smaller disturbances, which could be attributed to the smaller refinement ratio (2:1 instead of 4:1). The main conclusion from this test is that care must be taken not to let a strong shock enter a more refined mesh. Strong shocks should be either refined all of the time, or not refined at all.

7.2 Density discontinuity passing through a coarse-to-fine interface

Figure 5 shows the advection of a slab of high density, cold gas surrounded by a hot gas of lower density. Initial conditions for this problem are $P = 0.01$ and $U = 2$ everywhere, $\rho_{\text{cold}} = 3$, $\rho_{\text{hot}} = 1$. Initially, the slab is 20 cells wide. The equation of state is that of an ideal gas with $\gamma = 1.4$ constant. Integration is done with $cfl = 0.7$. The only result of passing a slab through coarse-to-fine interfaces is changes in a number of cells representing contact discontinuities. The pressure and velocity field (not shown) both remain constant to machine accuracy. The test shows that passing a discontinuity through coarse-to-fine interfaces does not generate any disturbances. However, if a discontinuity exits a refined area, the resolution is lost. If it enters a refined area, its width does not decrease, and no gain in resolution is obtained.
7.3 Planar strong point explosion

Figures 6 and 7 shows a one-dimensional (planar) strong point explosion in an ideal gas with \( \gamma = 1.4 \). Initial conditions are \( \rho_0 = 1, P_0 = 10^{-3} \) everywhere. The explosion energy \( E = 2.5 \times 10^9 \) is put in a single cell by increasing the pressure in that cell to \( P = P_0 + (\gamma - 1)E/\Delta \), where \( \Delta \) is the cell size. Figure 6 shows the explosion computed on a uniform mesh with \( \Delta = \frac{1}{64} \). The exact solution to the problem is shown for comparison [29]. The solutions agree near the center. The difficulty is to reproduce the solution near the shock.

Figure 7 shows the same explosion computed with eight levels of refinement, \( l = 5 \div 12 \). Two refinement indicators were used, one for shocks (11) and another one for the pressure gradient (13). The refinement criteria were \( \xi_{\text{split}} = 0.5 \) and \( \xi_{\text{join}} = 0.01 \). In this case, the flow behind the shock has been resolved. The number of cells used in the simulation was \( \approx 250 \), and only a few (\( < 20 \)) located at the highest level \( l = 12 \). A uniform 4096 mesh would be required to get the same resolution. Small disturbances at fine-coarse interfaces are seen at the pressure and velocity plots. Since the gradients in the solution are large everywhere, these disturbances may be caused by the same inexact cancelling of numerical errors in fluxes at the fine-coarse interfaces discussed in [2] and in Section 7.1 above, or they may be the result of decreasing the order of the accuracy of integration at interfaces, or both. Which effect is important, and whether it is worthwhile to maintain formal second-order accuracy at interfaces, requires further study.

7.4 Cylindrical strong point explosion in a box

Figures 8 and 9 show a cylindrical strong point explosion in a square box, and illustrate how the adaptive mesh algorithm treats a very complicated, rapidly evolving flow with multiple shocks, contact discontinuities, and vortices. Initial conditions in the box are \( \rho_0 = P_0 = 1 \). The equation of state is that of an ideal gas with \( \gamma = 1.4 \). The explosion energy \( E = 10^6 \) is put in a single cell of size \( \frac{1}{1024} \) located at \( x = 0.35, y = 0.2 \). The computation was done with six levels of refinement, \( l = 5 \div 10 \), using shock and pressure gradient refinement criteria with \( \xi_{\text{split}} = 0.5 \) and \( \xi_{\text{join}} = 0.05 \). The Courant number, \( cfl \), is 0.7. The equivalent uniform resolution would require a \( 1024 \times 1024 \) grid or \( 2^{20} = 1,048,576 \) cells.

A cylindrical blast wave propagates from the explosion point, and first hits the lower, then the left, right and upper walls of the box. Reflections of the primary shock begin as regular reflections, but later transform into Mach reflections. The sound speed is very high in the material behind the primary shock. As a result, reflected shocks quickly engulf the inside of the hot bubble created by the initial blast, catch up with the primary shock, and interact with walls and with each other. Figures 8a (step 200) and 8b (step 300) show the interaction of the primary shock with the lower
wall. In Figure 8c (step 400) this interaction continues, but the shock is also reflecting off the left wall. Reflections of the primary shock off the walls are irregular. In the next Figure 8d (step 500), a part of the primary shock is still interacting with the upper and right walls. In Figure 8e (step 600), the primary shock disappeared, and the collision of the two reflected shocks just occurred near the upper right corner of the box. Figure 8f shows the pressure contours for step 600. The mesh for the two time steps, 400 and 600, is shown in Figure 9. Figures 8 and 9 show a complicated pattern of secondary shocks resolved by the mesh refinement algorithm.

7.5 Shock – bubble interaction in three dimensions

The interaction of shock waves with fluid inhomogeneities is an important mechanism of vorticity generation [30,31]. The interaction of a planar shock with a low-density spherical bubble of gas is one of the four representative cases studied theoretically in [31]. It is assumed in [31] that the gas in the bubble is in pressure equilibrium with the ambient gas, but has higher temperature. This is different from the conditions of the experiments [30] where the density contrast was created by using gases with different molecular weight. Formulation of the problem in [31] is highly relevant to the shock-generated vorticity in flames.

The computational setting for the shock – bubble problem is shown in Figure 10. A spherical bubble of hot, low density gas is located inside a rectangular, solid wall tube of length 1 and cross-section \( \frac{1}{2} \times \frac{1}{2} \). The computational domain of size \( L_x \times L_y \times L_z = 1 \times \frac{1}{4} \times \frac{1}{4} \) represents a quarter of the tube cross-section assuming symmetry with respect to the middle planes \( y = \frac{1}{4} \) and \( z = \frac{1}{4} \). The radius of the bubble is \( R_b = \frac{1}{8} \). The bubble is centered at a distance \( x_b = \frac{1}{4} \) from the tube entrance. The bubble and the background gas are in the pressure equilibrium at a common pressure \( P_0 = 1 \). The background density is \( \rho_0 = 1 \) and the bubble density is \( \rho_b = 0.166 \). The equation of state is that of an ideal gas with constant \( \gamma = 1.4 \). A shock wave with the Mach number \( M = 1.25 \) hits the bubble from the left. Boundary conditions are inflow on the tube entrance, and outflow on the tube exit. Simulations are performed using five levels of refinement \( l = 5 \div 9 \). The maximum equivalent uniform resolution would correspond to a \( 512 \times 128 \times 128 \) grid, and would require \( 2^{23} = 8,388,608 \) cells of size \( \frac{1}{512} \). The three-dimensional resolution in this test case is 20% higher than that used in two-dimensional simulations [31]. Four refinement indicators were used: for shocks (15), for contact discontinuities (16) and for density and pressure gradients (17). The refinement criteria are \( \xi_{\text{split}} = 0.5 \) and \( \xi_{\text{join}} = 0.05 \). The Courant number \( cfl = 0.7 \) was used.

Figure 11 shows the density contours and the mesh in the XY plane \( z = \frac{1}{4} \) after 20 and 70 global time steps of integration. Figure 12 shows the density contour and the mesh for the same time steps in the perpendicular YZ-planes \( x = 0.35 \) and \( x = 0.6 \), respectively. The shock compresses the bubble, and vorticity is generated due to misalignment of the pressure and density gradients during
the interaction. Vorticity is generated mainly at the bubble surface where transmitted shocks are refracted. Rotational motions generated as a result of shock refraction further deform the bubble, and eventually transform it into the rotating ring. The results of the simulation presented here are in a good general agreement with the results of two-dimensional axially-symmetric simulations [31]. Three-dimensional simulations, however, allow assumption of axial symmetry to be relaxed. Figure 12 shows the development of azimuthal perturbations on the surface of the bubble as time progresses. These perturbations are initially caused by the the Rayleigh-Taylor instability driven by the deceleration of material between the bubble and the spherical transmitted shock. These perturbations are further subjected to the Kelvin-Helmholtz instability which develops due to the presence of the velocity component tangent to the bubble surface. The tangential component has been generated during the shock refraction at the bubble surface. A discussion of instabilities developing during the shock-bubble interaction is out of scope of this paper, and will be presented elsewhere.

8. Algorithm performance

The algorithm consists of four parts: (1) FTT subroutines for tree modifications, dumping, performing global parallel operations, finding neighbors, parents and children, etc.; (2) Fluid dynamics subroutines; (3) Refinement subroutines; (4) Service subroutines: driver, print, plot, etc. The code is written entirely in Fortran 77. The line count for each part is given in Table 1 (comments included). The critical FTT part on which the rest of the algorithm is built contains less than 800 lines.

Fourth column of Table 1 shows the breakdown of computer time for different parts of the algorithm compiled using a Sun f77 compiler with -O5 optimization, and run on a Sun workstation under Solaris operating system. The figures show that the FTT part of the code consumes a relatively small fraction of time. The fifth column gives the time breakdown for the same code compiled using Cray cf77 compiler with -Zu parallel option enabled, and run on a single Cray J90 processor. On a vector machine, the relative overhead for the FTT is noticeably larger, and comprises about 1/3 of the total time. This is because FTT uses indirect addressing which slows vector operations. In the fluid dynamics part of the code, work is done by looping over contiguous blocks of memory, and all loops are effectively vectorized. The J90 computers lack hardware gather/scatter capabilities, have only two paths between the vector processor unit and the memory, and have a rather long memory latency. The FTT part will run more effectively on Cray C90 or T90 computers. On a single processor of Cray J90, the computer time to advance one cell one sub-step is 30 μsec per dimension. In a multi-processor mode, the code used up to 10 processors of a 16 processor J90 in a batch environment.
Table 1

<table>
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<th>lines</th>
<th>time, % (SUN)</th>
<th>time, % (J90)</th>
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<tr>
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</tr>
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</tr>
<tr>
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<td>3512</td>
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<td>100</td>
</tr>
</tbody>
</table>

For the cylindrical strong point explosion, and for the shock-bubble interaction tests, Figures 13 and 14 show the ratio of the number of computational cells actually used in the simulation to the number of cells required to achieve an equivalent uniform resolution. The ratio varies with time. For the cylindrical shock test, for example, it is almost zero in the beginning, when the shocked material occupies only a small fraction of the computational domain. Then the ratio grows with time almost linearly because fine cells tend to concentrate around the surface of the shock only. At the end of the simulation, the ratio reaches its highest value $\approx 0.1$. At this time the entire computational domain is filled with shocks, and the regions of constant flow have disappeared. On average, the ratios for both simulations are $\approx 0.05 - 0.07$ which represents a factor of $\approx 15$ savings in memory and computer time compared to a brute force uniform grid computations. Here we have taken into account that the FTT overhead would be absent in grid-based computations.

9. Conclusions

A fully threaded tree structure (FTT) for adaptive refinement of regular meshes has been described. The FTT allows all operations and modifications of the tree to be performed in parallel, which makes this structure well suited for the use on vector and parallel computers. A filtering algorithm has been described for removing high-frequency noise in mesh refinement.

The FTT has been applied to the integration of the Euler equations of fluid dynamics. Time stepping, and mesh refinement algorithms specific to the integration of the Euler equations were described. The integration in time is done using different time steps at different tree levels. The integration and mesh refinement are interleaved to avoid creation of buffer layers of fine mesh ahead of moving shocks and other discontinuities. The time stepping algorithm described can utilize any method of evaluating numerical fluxes which is at least second order accurate in space and time on a uniform mesh.

The FTT performance on a Sun workstation, and on a shared memory Cray J90 computer is reported. The FTT has low memory and computer time overheads. 2 words and $\leq 10 - 40\%$ of computer time per computational cell, respectively. A factor $\approx 15$ savings in memory and
computer time compared to equivalent uniform-grid computations have been achieved in two- and three-dimensional test simulations presented in the paper. Three-dimensional simulations of a shock wave interacting with a spherical bubble of light gas have been performed that shown the development of azimuthal instabilities at the bubble surface.

There are many uses of FTT other than the integration of the Euler equations, such as the solution of parabolic and elliptical partial differential equations, pattern recognition, computer graphics, particle dynamics, etc. An application of the adaptive refinement tree to dark matter cosmological simulations has been recently described in [25]. An application of FTT to reaction-diffusion equations will be described elsewhere.

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Literature

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Fig. 1 – Relationship between cells for a one-dimensional, binary, fully threaded tree. Each cell is represented by a horizontal barred line. The length of a line corresponds to the geometrical size of a cell. Cell 1 is the root of the tree, representing the entire computational domain. Cells 1 and 2 are split cells. Cells 3, 4 and 5 are leaves. Pointers to children and parents are indicated by straight lines without arrows. Pointers to neighbors are indicated by arrows.
Fig. 2 – Relationship between the cells and octs in a fully threaded tree. Pointers from octs to cells and from cells to octs are indicated by arrows.
Fig. 3 – An illustration of flux evaluation at two different levels of the tree. Fluxes at interfaces between fine cells (1–3 and 2–4), and fluxes between fine and coarse cells (3–5 and 4–5) are evaluated twice as often as fluxes between coarse cells (5–6). Four fluxes from the fine side (3–5 and 4–5 computed at two different times), and one flux (5–6) from the coarse side contribute to changes of the state vector of cell 5 during a coarse time step.
Fig. 4 – An isolated shock wave with a Mach number $M = 10$ in an ideal gas with $\gamma = 1.4$; computed with $cfl = 0.7$. Density is shown by dots whose position corresponds to centers of computation cells. In all panels, the shock is moving from left to right. Top panel – shock on a uniform mesh. Middle panel – shock after passing from fine to coarse mesh. Bottom panel – shock after passing from coarse to fine mesh. Coarse-to-fine interface is located near $x \simeq 0.11$. Two disturbances generated during the passage of the coarse-to-fine interface are seen on the bottom panel.
Fig. 5 – Advection of a high density, cold slab of gas with $\rho_{\text{high}} = 3$ surrounded by a low density hot gas with $\rho_{\text{low}} = 1$. Pressure is $P = 0.01$, and velocity is $U = 2$ everywhere. An ideal gas EOS with $\gamma = 1.4$; computed with $cfl = 0.7$. Advection is taking place from left to right. A coarse-to-fine interface is located at $x \simeq 0.38$ (dashed line). Density is shown by dots whose position corresponds to centers of computation cells. Time-step number is indicated at the top of each density profile.
Fig. 6 – Strong point explosion in an ideal gas $\gamma = 1.4$ in planar geometry. The initial pressure is $P_0 = 10^{-3}$, initial density is $\rho_0 = 1$, and the explosion energy is $E = 2.5 \times 10^6$. Computed on a uniform mesh using $cfl = 0.7$. Plots of density, pressure, velocity, and cell level in the tree are shown for three different moments of time (1) $1.57 \times 10^{-6}$, (2) $3.49 \times 10^{-6}$, and (3) $5.82 \times 10^{-6}$. The variables are shown by dashed lines and by dots whose position corresponds to centers of computation cells. Solid lines – the exact solution.
Fig. 7 - Strong point explosion in an ideal gas $\gamma = 1.4$ in planar geometry. The initial pressure is $P_0 = 10^{-3}$, initial density is $\rho_0 = 1$, and the explosion energy is $E = 2.5 \times 10^8$. Computed using $cfft = 0.7$ and eight levels of mesh refinement. Plots of density, pressure, velocity, and cell level in the tree are shown for three different moments of time (1) $1.15 \times 10^{-6}$, (2) $3.02 \times 10^{-6}$, and (3) $6.07 \times 10^{-6}$. The variables are shown by dots whose position corresponds to centers of computation cells. Solid lines – the exact solution.
Fig. 8(a) — Cylindrical strong point explosion in a square box with solid walls. Computed with levels of refinement \( l = 5 \div 10 \). Density is shown for time steps: (a) — 200, (b) — 300, (c) — 400, (d) — 500, and (e) — 600; (f) — pressure for time step 600. Density contours are \( \Delta \rho = 0.1 \) beginning with \( \rho_{\text{min}} = 0.05 \). Pressure contours are \( \Delta P = 10^3 \) beginning with \( P_0 = 0 \). Coordinates are in units of the finest cell size \( \Delta(10) = \frac{1}{1024} \).
Fig. 8(e) — (Continued)
Fig. 9(a) — Same as Fig. 8 but shows the computational mesh: (a) — step 400 and (b) — step 600.
Fig. 9(b) — Same as Fig. 8 but shows the computational mesh: (a) — step 400 and (b) — step 600.
Fig. 10 – Computational setting of the shock wave – spherical bubble interaction problem. Depicts a square tube of size $1 \times \frac{1}{2} \times \frac{1}{2}$. The computational domain is a quarter of the tube cross-section shown by thick lines and marked by the numbers 1 to 8, assuming symmetry with respect to the XZ plane $y = \frac{1}{4}$ and XY plane $z = \frac{1}{4}$. 
Fig. 11 – Shock wave – spherical bubble interaction. Density contours $\Delta \rho = 0.05$ and the mesh in the XY plane 1-2-5-6 (see Fig. 10) for time steps 20 and 70.
Fig. 12 - Shock wave - spherical bubble interaction. Density contours $\Delta \rho = 0.05$ and the mesh in the YZ plane for time steps 20 and 70. The plane coordinates are $x = 0.35$ (step 20) and $x = 0.6$ (step 70).
Fig. 13 – The ratio of actually used computational cells to the number of uniform grid cells for various time steps of the cylindrical strong point explosion problem (Section 7.4).
Fig. 14 – The ratio of actually used computational cells to the number of uniform grid cells for various time steps of the shock – spherical bubble interaction problem (Section 7.5).