

# Introduction to Block-Structured Adaptive Mesh Refinement (AMR)

Ann S. Almgren

Center for Computational Sciences and Engineering  
(Building 50A)

Lawrence Berkeley National Laboratory

[asalmgren@lbl.gov](mailto:asalmgren@lbl.gov)

# Types of Refinement

---



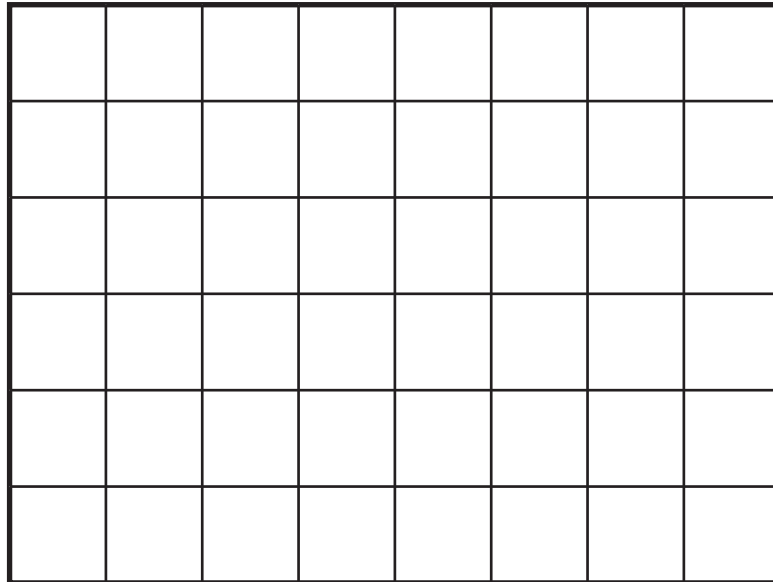
## AMR approaches

- Unstructured
- 
- 
-

# Types of Refinement

## AMR approaches

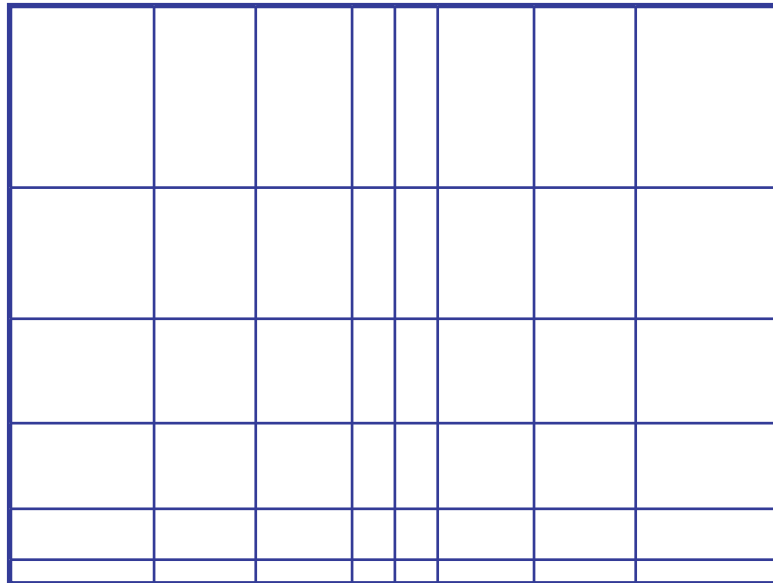
- Unstructured
- Mesh distortion
- 
- 



# Types of Refinement

## AMR approaches

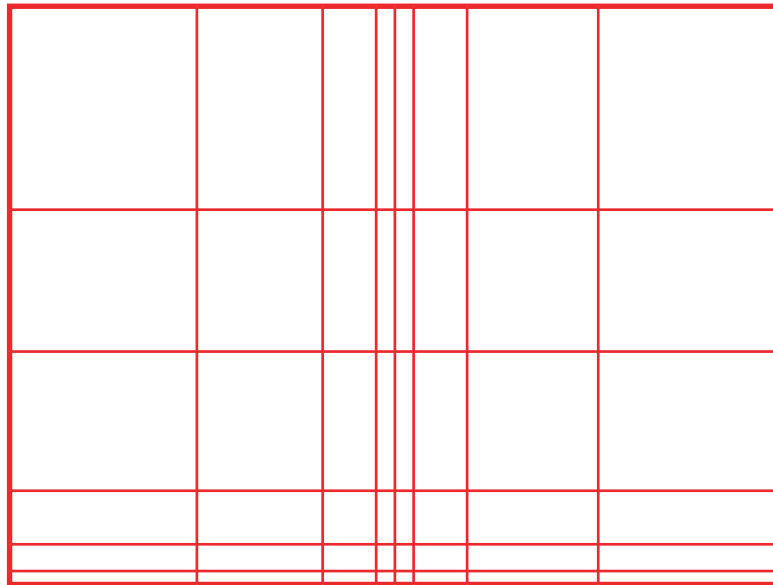
- Unstructured
- Mesh distortion
- 
- 



# Types of Refinement

## AMR approaches

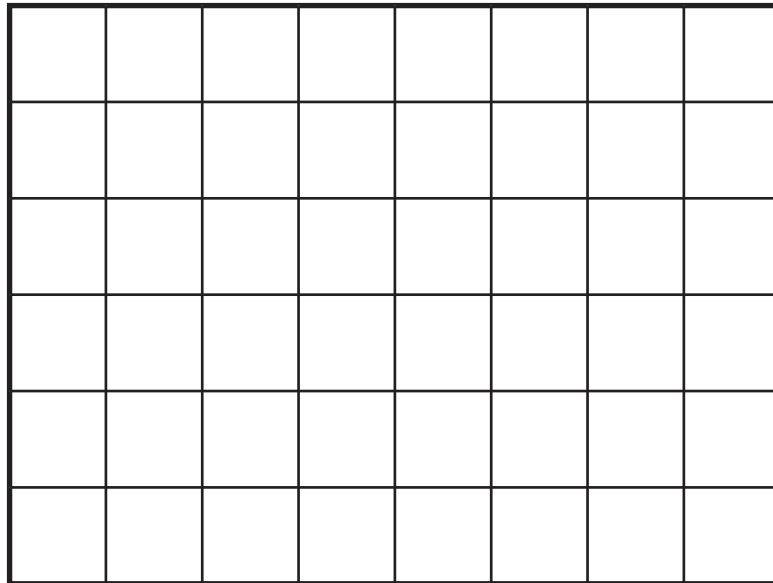
- Unstructured
- Mesh distortion
- 
- 



# Types of Refinement

## AMR approaches

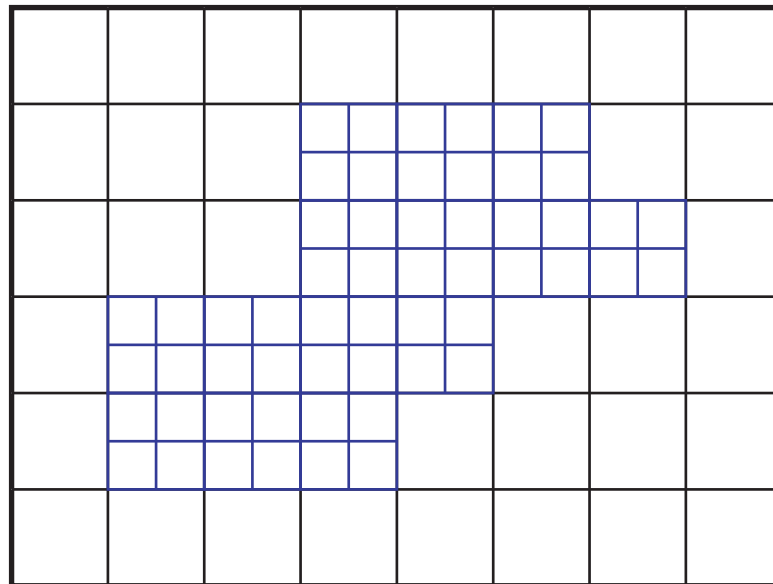
- Unstructured
- Mesh distortion
- Point-wise structured refinement
- 



# Types of Refinement

## AMR approaches

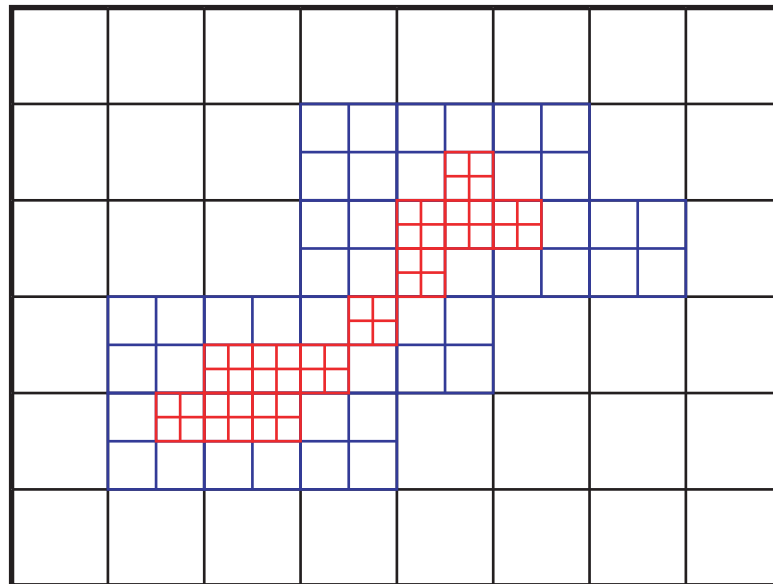
- Unstructured
- Mesh distortion
- Point-wise structured refinement
- 



# Types of Refinement

## AMR approaches

- Unstructured
- Mesh distortion
- Point-wise structured refinement
- 

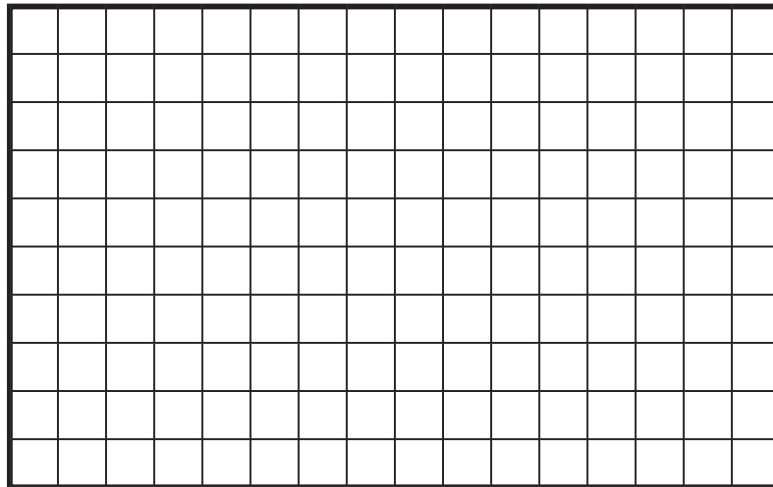




# Types of Refinement

## AMR approaches

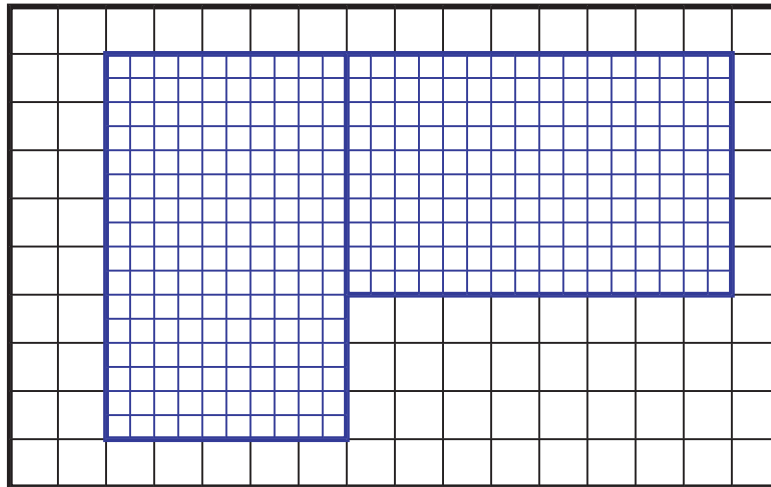
- Unstructured
- Mesh distortion
- Point-wise structured refinement
- **Block structured**



# Types of Refinement

## AMR approaches

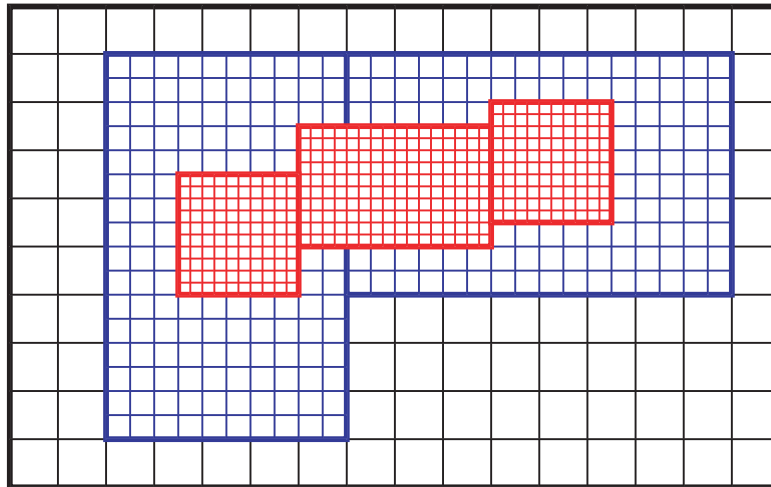
- Unstructured
- Mesh distortion
- Point-wise structured refinement
- **Block structured**



# Types of Refinement

## AMR approaches

- Unstructured
- Mesh distortion
- Point-wise structured refinement
- **Block structured**



# AMR for Conservation Laws

Consider the 2-D hyperbolic conservation law

$$U_t + \mathbf{F}_x + \mathbf{G}_y = 0$$

where

$$\mathbf{F} = \mathbf{F}(U), \mathbf{G} = \mathbf{G}(U)$$

Basic discretization:

- Finite volume approach with cell-centered data
- Flux-based representation of conservation law
- Explicit in time update

$$\frac{U^{n+1} - U^n}{\Delta t} = \frac{\mathbf{F}_{i-1/2,j}^{n+1/2} - \mathbf{F}_{i+1/2,j}^{n+1/2}}{\Delta x} + \frac{\mathbf{G}_{i,j-1/2}^{n+1/2} - \mathbf{G}_{i,j+1/2}^{n+1/2}}{\Delta y}$$

Numerical fluxes computed from data at  $t^n$  in neighborhood of edge

# Basic Structured Grid AMR Ideas



- Cover regions requiring high resolution with finer grids
- Use (higher-order upwind) methodology for regular grids to integrate solution

## Need to know

- how to generate the grid hierarchy
  - initially
  - every time you regrid
- how to integrate the solution forward in time
  - Integration of data on a patch
  - Synchronization of levels

## Original references:

- 2-D: Berger and Colella, JCP 1989
- 3-D: Bell, Berger, Saltzman and Welcome, JCP 1994

# AMR: To Subcycle or Not To Subcycle?



Should we refine in time as well as space?

- Yes – subcycle in time (CASTRO, Enzo)
  - $\Delta t_c = r \Delta t_f$
  - Maintain CFL (accuracy of advection scheme) across levels
  - Reduce total number of cells advanced
  
- No – don't subcycle (FLASH, RAGE)
  - $\Delta t_c = \Delta t_f$
  - Compute time step every fine grid time
  - Simpler synchronization algorithm
  - Simpler software framework

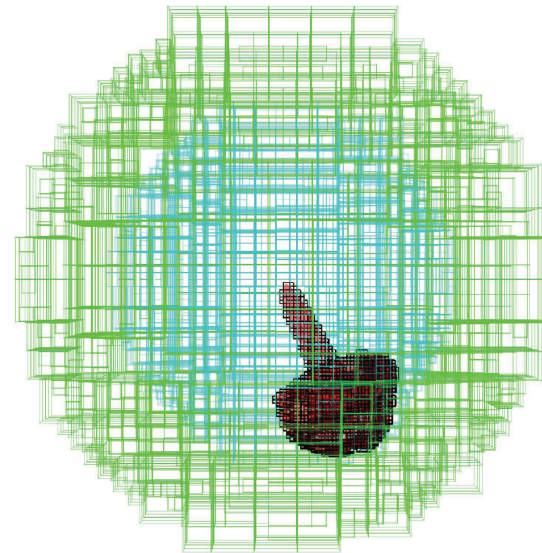
# AMR: Subcycling in Time?

Suppose we have  $N$  cells at each level and  $L$  levels with factor 2 refinement. To reach time  $T$ :

With  $L = 4$ :

- Subcycling: must advance  
 $N + 2N + 4N + 8N = 15N$  cell-steps
- No subcycling: must advance  
 $4 \cdot 8N = 32N$  cell-steps

Type Ia Supernova



With 2 total levels there is a factor of  $4/3$  more work with no subcycling.

With 3 total levels there is a factor of  $12/7$  more work with no subcycling.

With 4 levels ...  $32/15$  ...

With  $L$  levels ... ??

(Note that answer changes if  $N$  not constant over levels.)

# Building the initial grid hierarchy

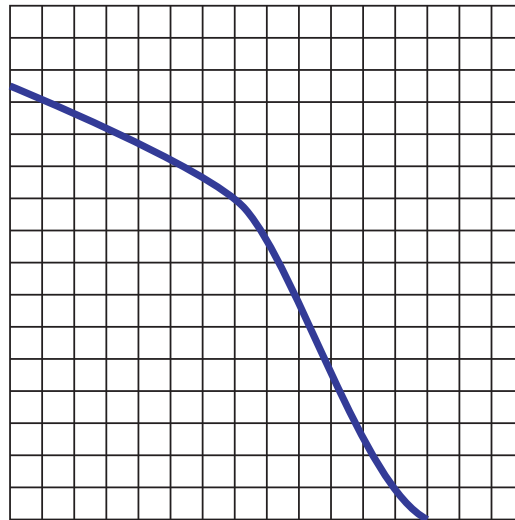


- Fill data at level 0
- Estimate where refinement is needed and buffer
- Group cells into patches according to a prescribed “grid efficiency” and refine  $\Rightarrow B_1, \dots, B_n$  (Berger and Rigoustos, 1991)
- Repeat for next level and adjust for proper nesting



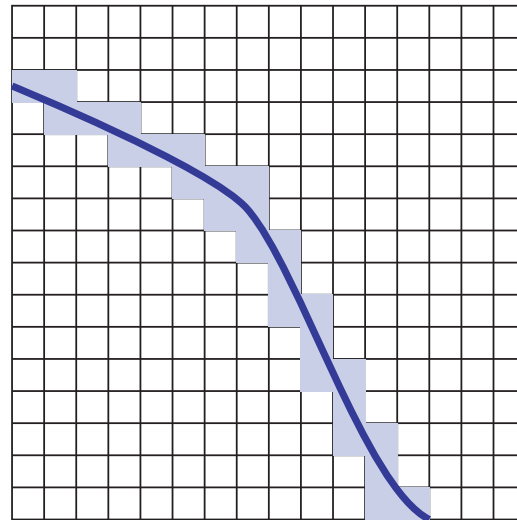
# Building the initial grid hierarchy

- Fill data at level 0
- Estimate where refinement is needed and buffer
- Group cells into patches according to a prescribed “grid efficiency” and refine  $\Rightarrow B_1, \dots, B_n$  (Berger and Rigoustos, 1991)
- Repeat for next level and adjust for proper nesting



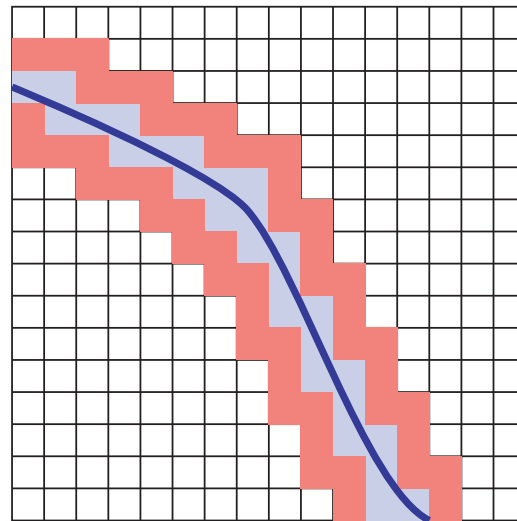
# Building the initial grid hierarchy

- Fill data at level 0
- Estimate where refinement is needed and buffer
- Group cells into patches according to a prescribed “grid efficiency” and refine  $\Rightarrow B_1, \dots, B_n$  (Berger and Rigoustos, 1991)
- Repeat for next level and adjust for proper nesting



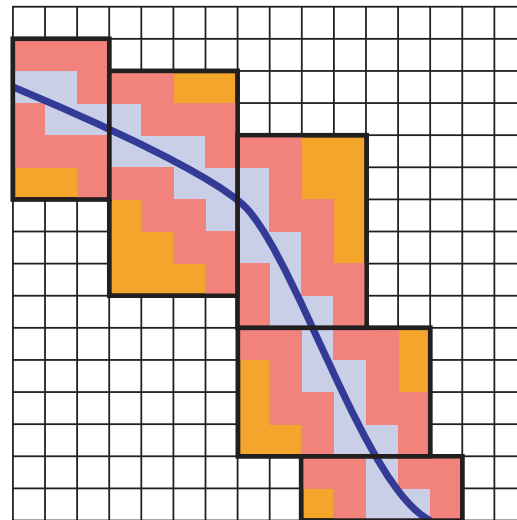
# Building the initial grid hierarchy

- Fill data at level 0
- Estimate where refinement is needed and buffer
- Group cells into patches according to a prescribed “grid efficiency” and refine  $\Rightarrow B_1, \dots, B_n$  (Berger and Rigoustos, 1991)
- Repeat for next level and adjust for proper nesting



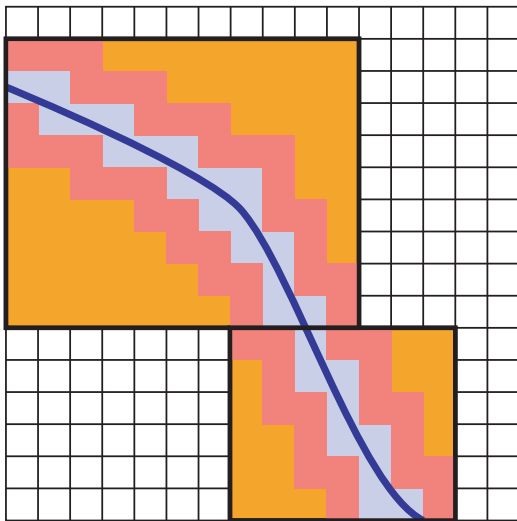
# Building the initial grid hierarchy

- Fill data at level 0
- Estimate where refinement is needed and buffer
- Group cells into patches according to a prescribed “grid efficiency” and refine  $\Rightarrow B_1, \dots, B_n$  (Berger and Rigoustos, 1991)
- Repeat for next level and adjust for proper nesting

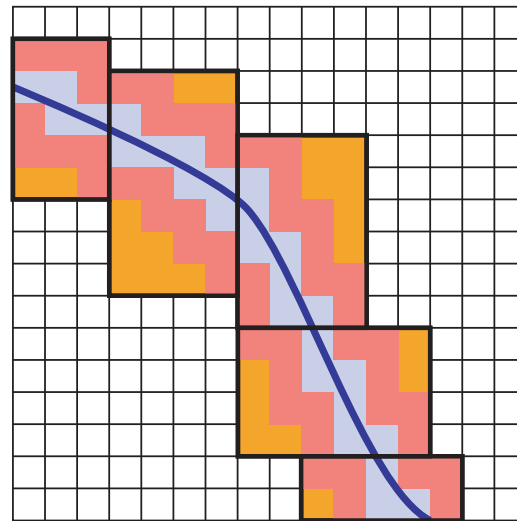


# Building the initial grid hierarchy

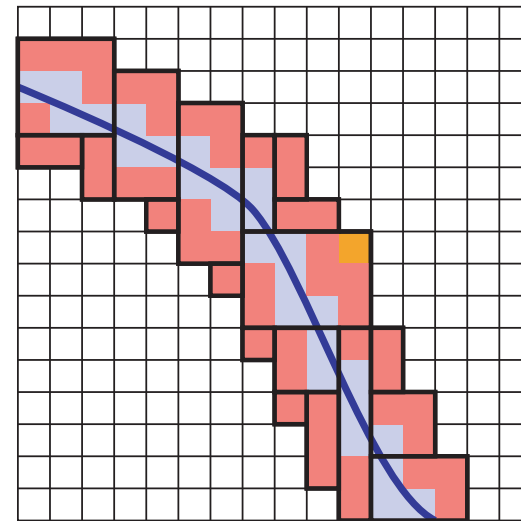
- Fill data at level 0
- Estimate where refinement is needed and buffer
- Group cells into patches according to a prescribed “grid efficiency” and refine  $\Rightarrow B_1, \dots, B_n$  (Berger and Rigoustos, 1991)
- Repeat for next level and adjust for proper nesting



Efficiency = 0.5



Efficiency = 0.7



Efficiency = 0.9

# Adaptive integration algorithm



Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.

# Adaptive integration algorithm

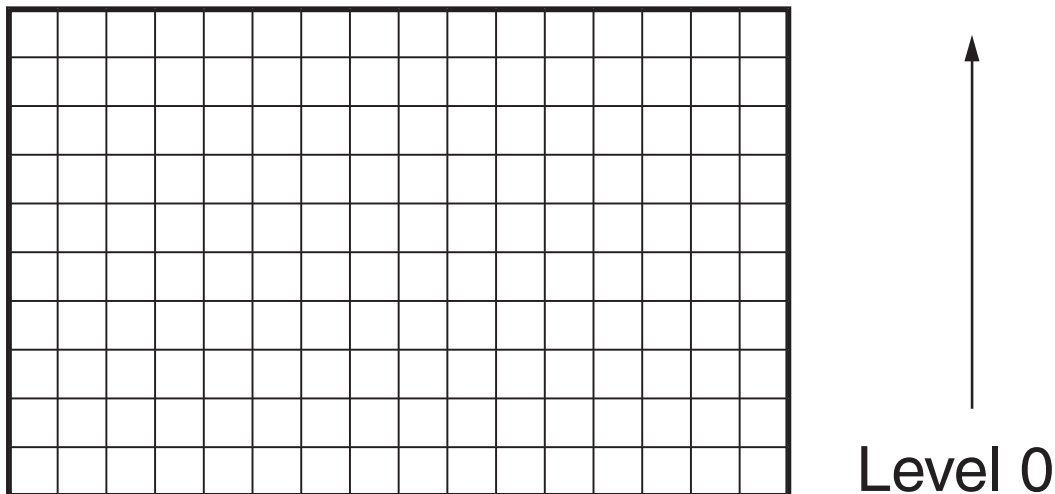
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.



# Adaptive integration algorithm

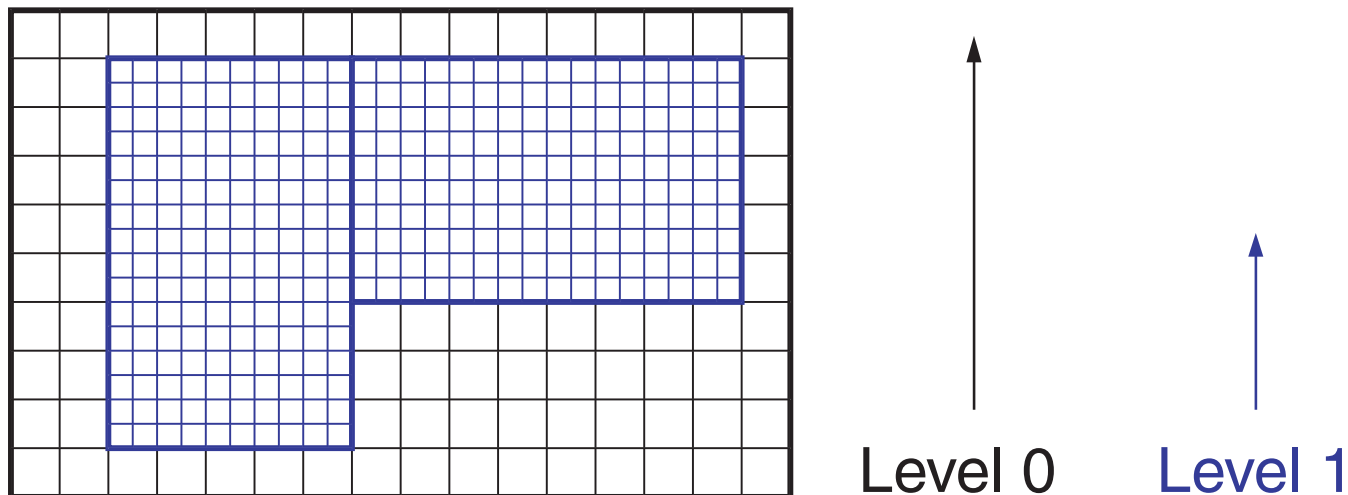
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.





# Adaptive integration algorithm

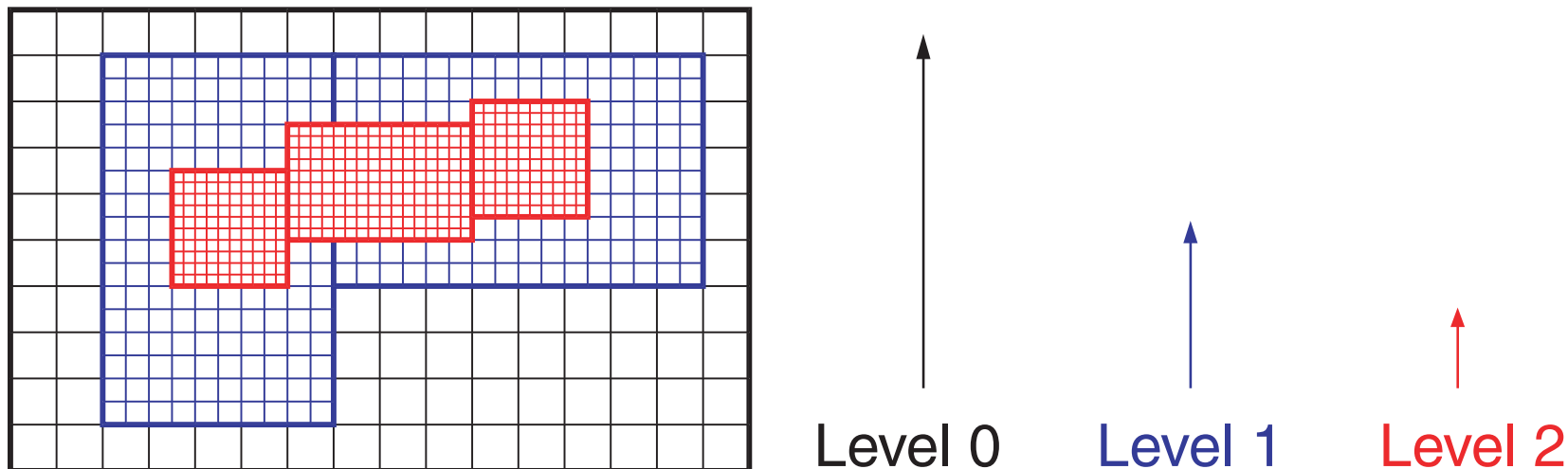
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.



# Adaptive integration algorithm

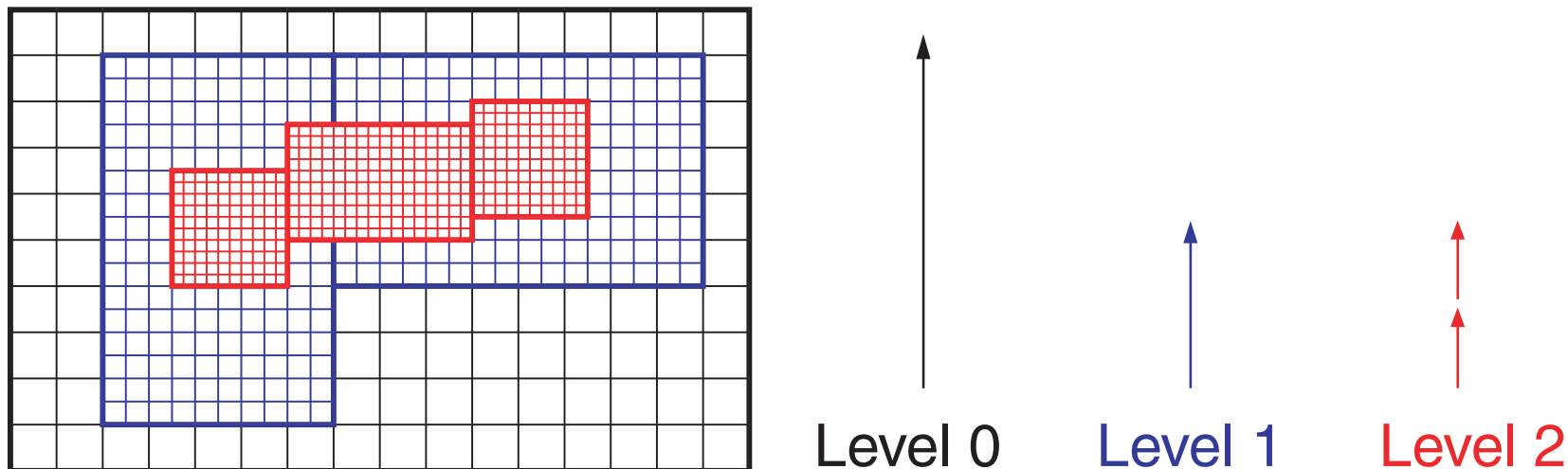
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.



# Adaptive integration algorithm

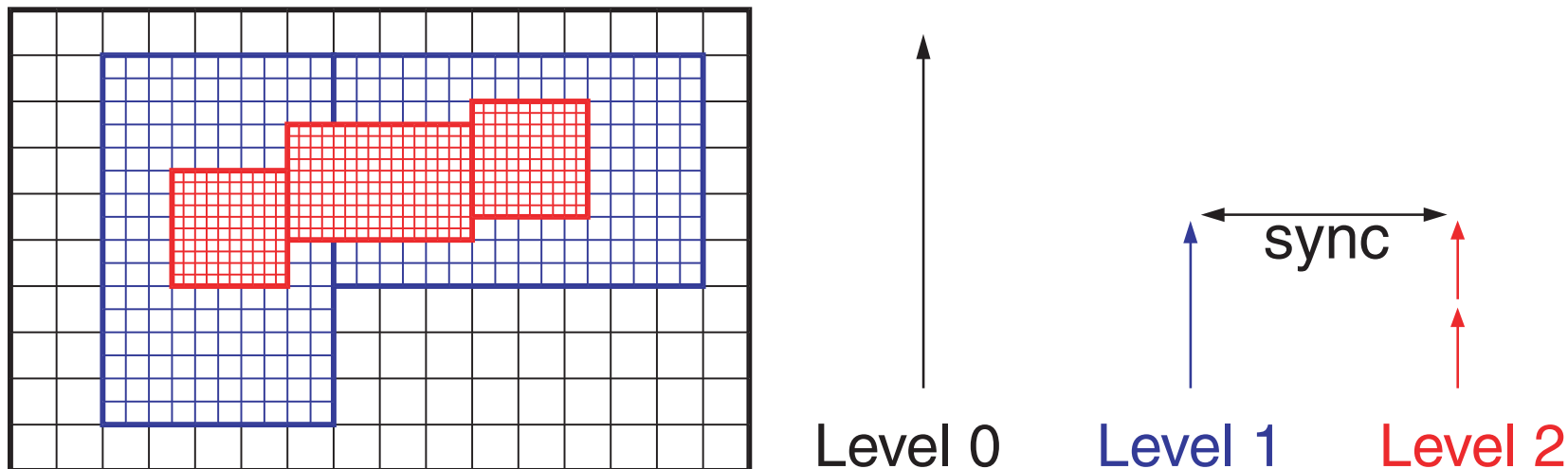
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.



# Adaptive integration algorithm

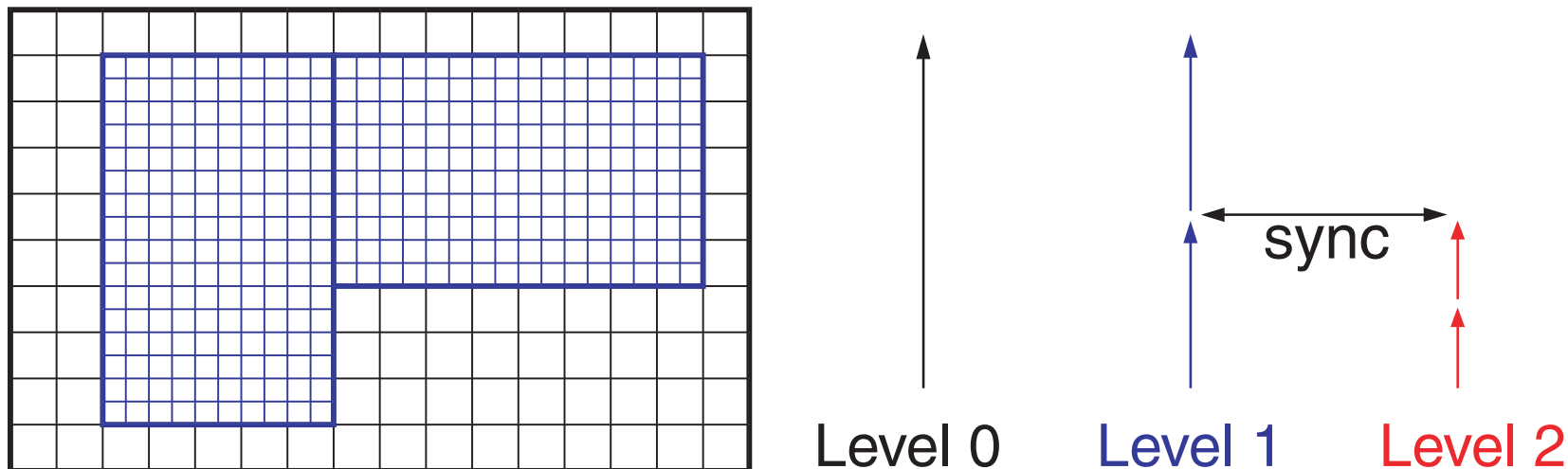
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.



# Adaptive integration algorithm

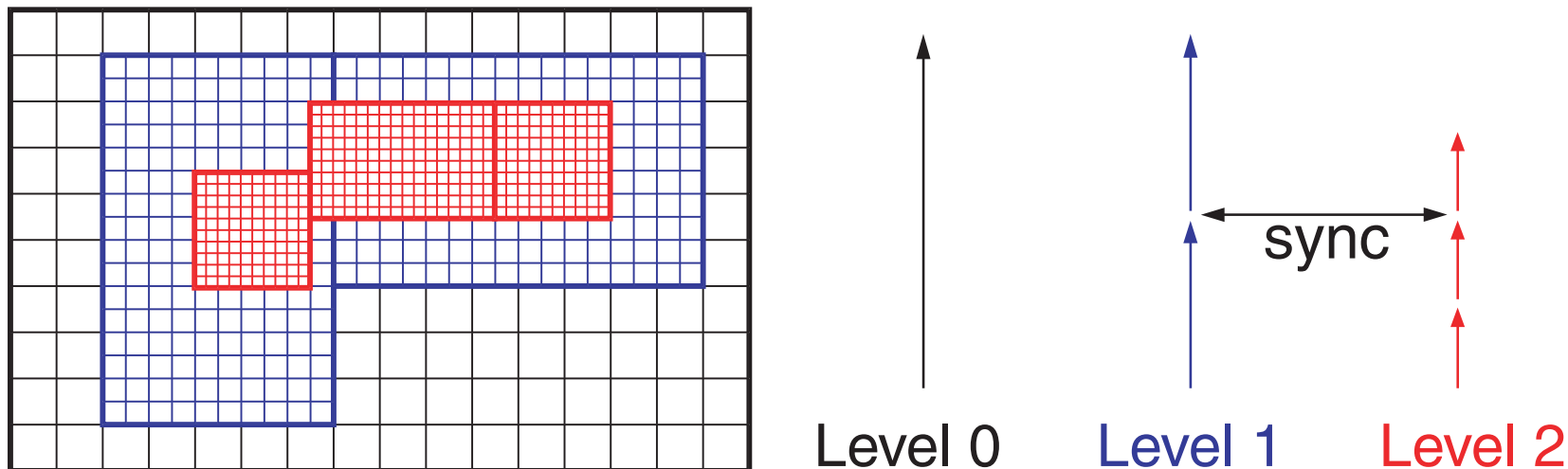
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.



# Adaptive integration algorithm

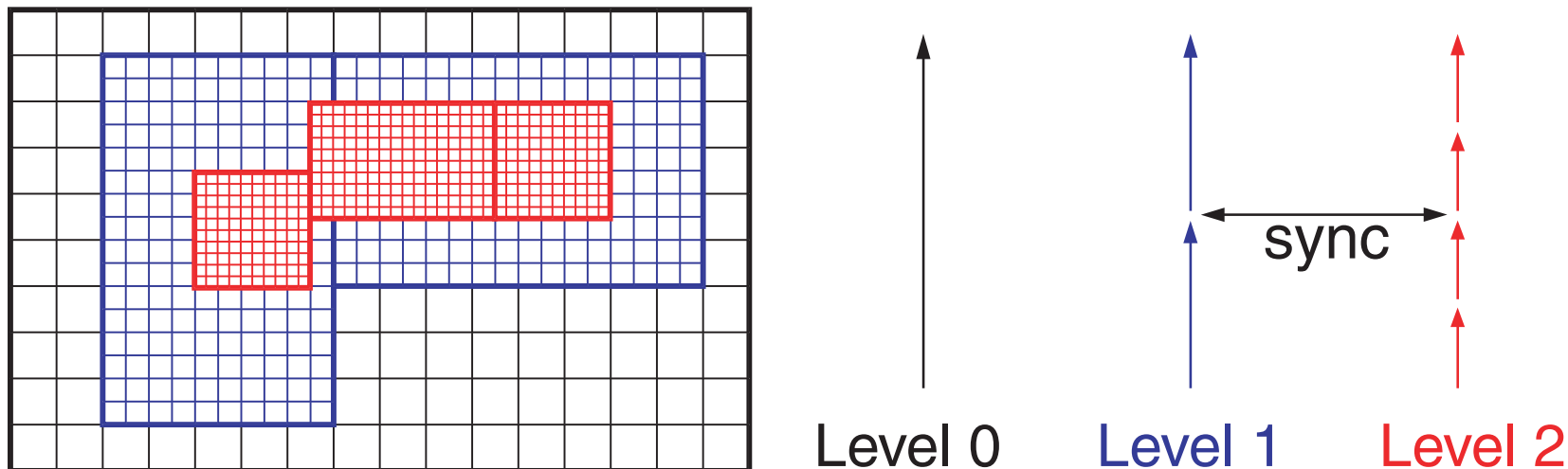
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.



# Adaptive integration algorithm

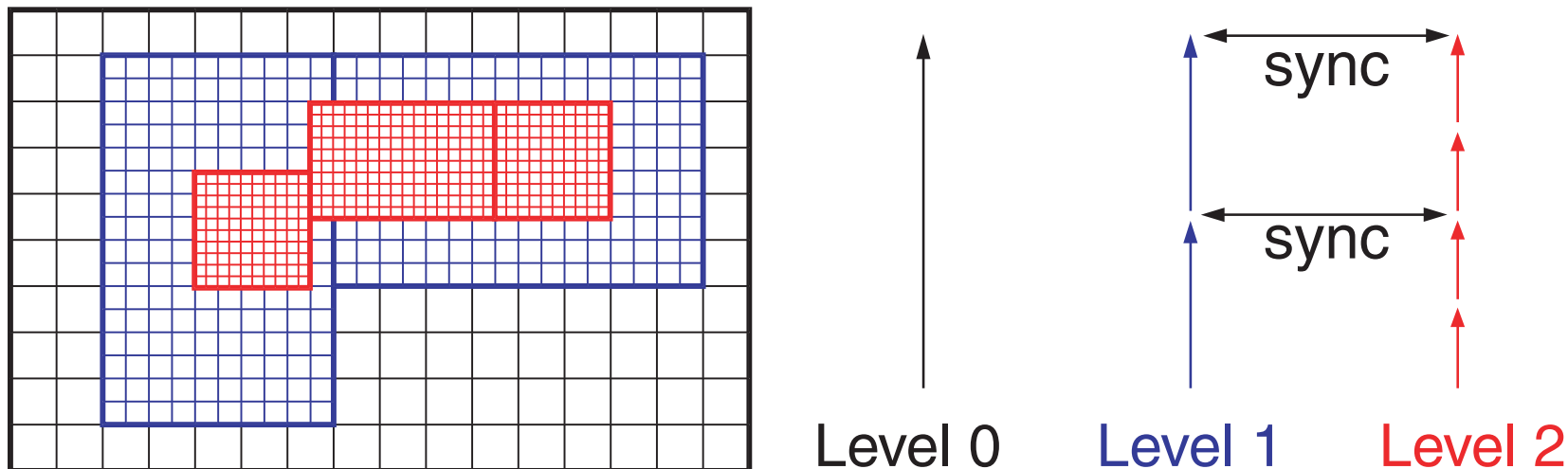
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.



# Adaptive integration algorithm

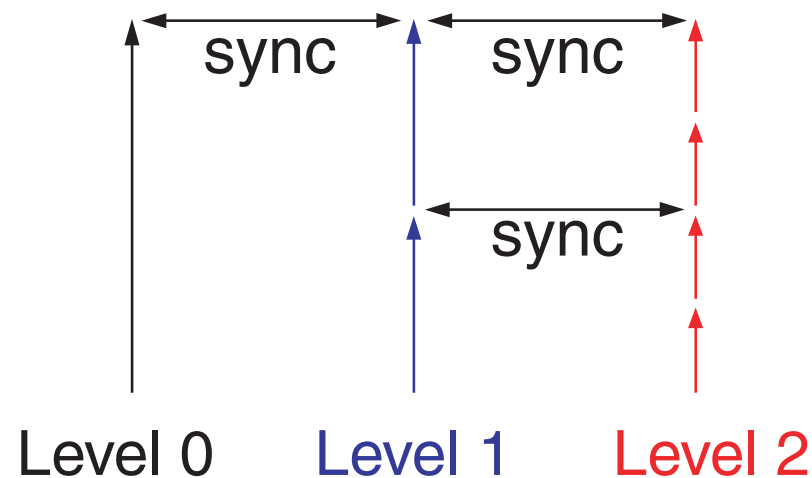
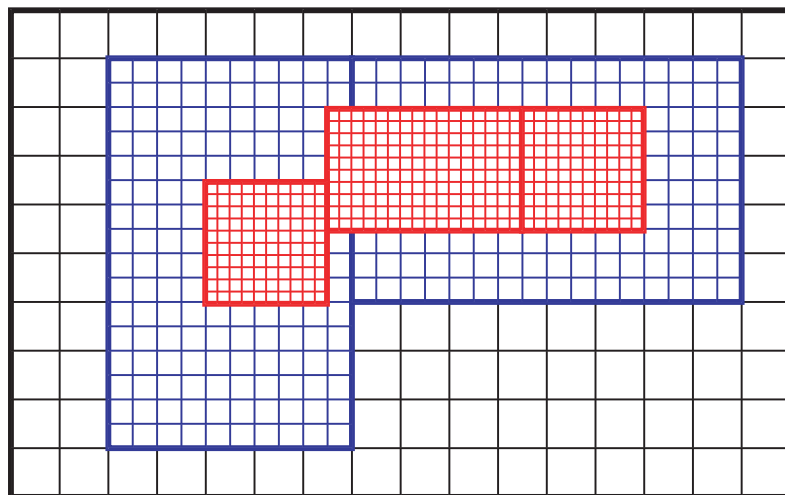
Consider two levels, coarse and fine, with refinement ratio  $r$

$$\Delta x_f = \Delta x_c / r \quad , \quad \Delta t_f = \Delta t_c / r,$$

To integrate

- Advance coarse grids in time  $t_c \rightarrow t_c + \Delta t_c$
- Advance fine grids in time  $r$  times
- Synchronize coarse and fine data

Extend recursively to arbitrary number of refinement levels.





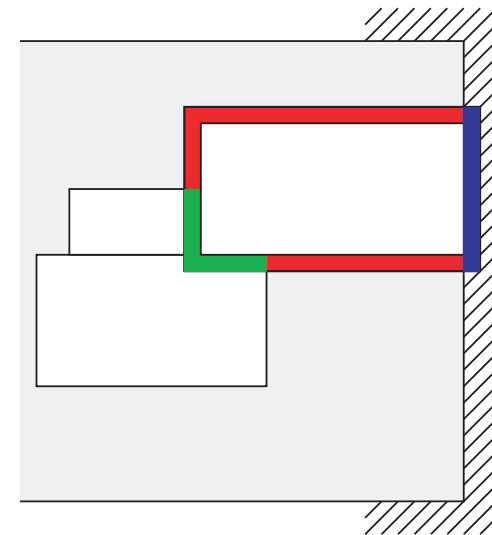
# Integrating on grid patch

How do you integrate a patch of data at level  $\ell$ ?

Obtain boundary data needed to call integrator on uniform grid of data.

- Assume explicit scheme with stencil width  $s_d$
- Enlarge patch by  $s_d$  cells in each direction and fill with data using
  - Physical boundary conditions
  - Other patches at the same level
  - Coarse grid data (fillpatch)
- Advance grid in time  $t \rightarrow t + \Delta t$

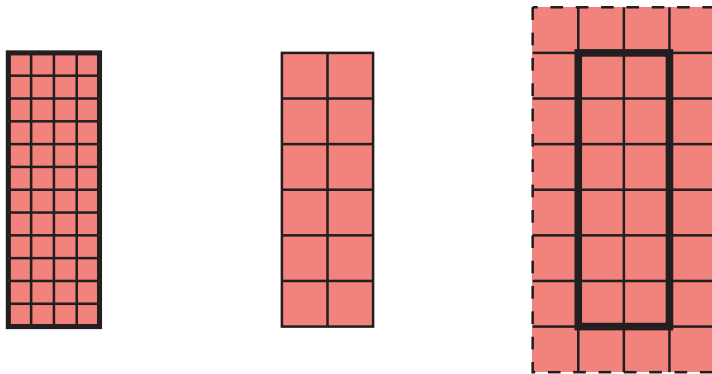
- Fine-Fine
- Physical BC
- Coarse-Fine



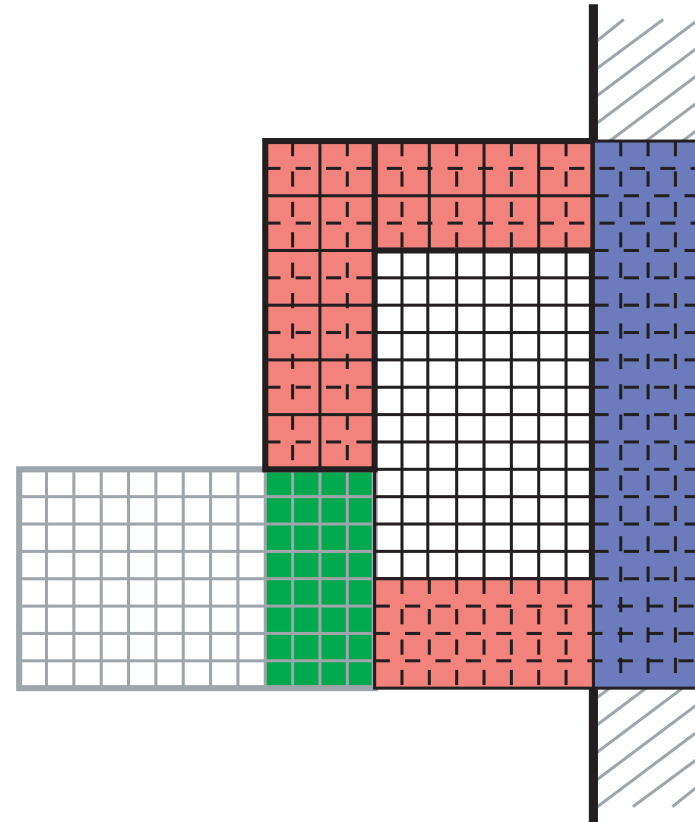
# FillPatch Operation

To fill fine grid “ghost cells” at  $t+k\Delta t_f$ ,  
 $k = 0, \dots, r-1$ , using coarse grid data

- Define coarse patch needed for interpolation



- Fill coarse patch at time  $t$  and  $t + \Delta t_c$
- Time-interpolate data on coarse patch to time  $t+k\Delta t_f$
- Interpolate coarse data to fine patch



# Synchronization



After coarse grid time step and the subcycled advance of fine data, we have

- $U^c$  at  $t_c^{n+1}$
- $U^f$  at  $t_c^{n+1}$

However,  $U^c$  and  $U^f$  are not consistent

- Coarse data is not necessarily equal to the average of the fine grid data “over” it.
- Scheme violates conservation because of inconsistent fluxes at coarse-fine interface

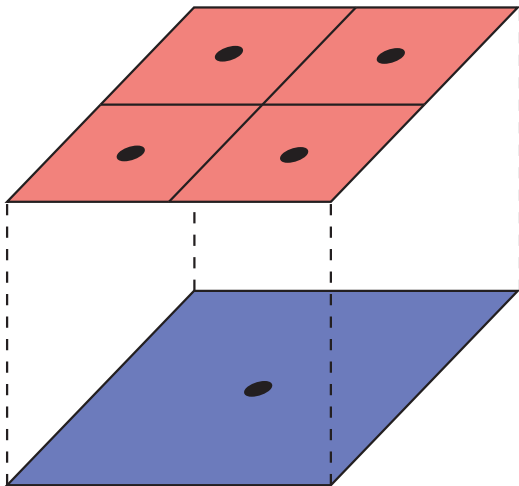
# Synchronization

After coarse grid time step and the subcycled advance of fine data, we have

- $U^c$  at  $t_c^{n+1}$
- $U^f$  at  $t_c^{n+1}$

However,  $U^c$  and  $U^f$  are not consistent

- Coarse data is not necessarily equal to the average of the fine grid data “over” it.
- Scheme violates conservation because of inconsistent fluxes at coarse-fine interface



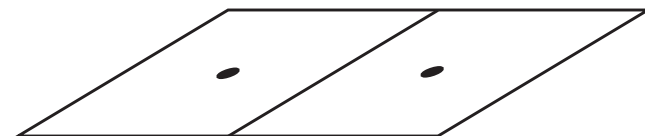
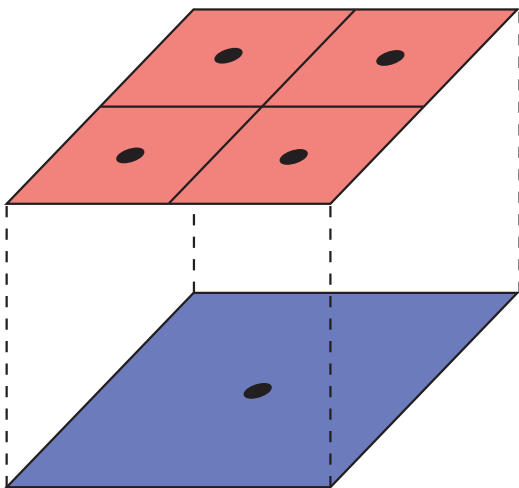
# Synchronization

After coarse grid time step and the subcycled advance of fine data, we have

- $U^c$  at  $t_c^{n+1}$
- $U^f$  at  $t_c^{n+1}$

However,  $U^c$  and  $U^f$  are not consistent

- Coarse data is not necessarily equal to the average of the fine grid data “over” it.
- Scheme violates conservation because of inconsistent fluxes at coarse-fine interface



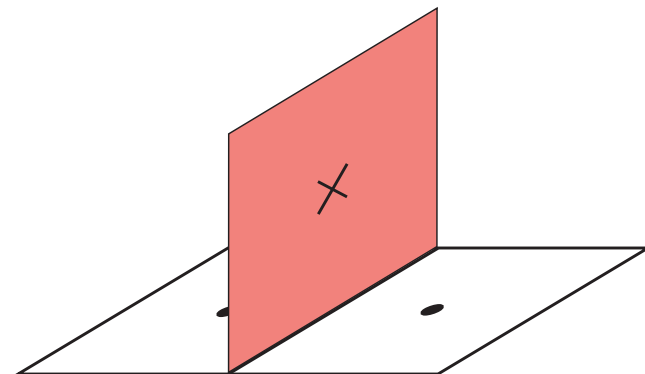
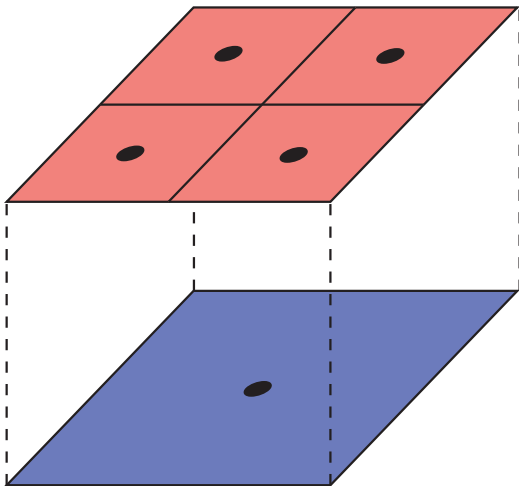
# Synchronization

After coarse grid time step and the subcycled advance of fine data, we have

- $U^c$  at  $t_c^{n+1}$
- $U^f$  at  $t_c^{n+1}$

However,  $U^c$  and  $U^f$  are not consistent

- Coarse data is not necessarily equal to the average of the fine grid data “over” it.
- Scheme violates conservation because of inconsistent fluxes at coarse-fine interface



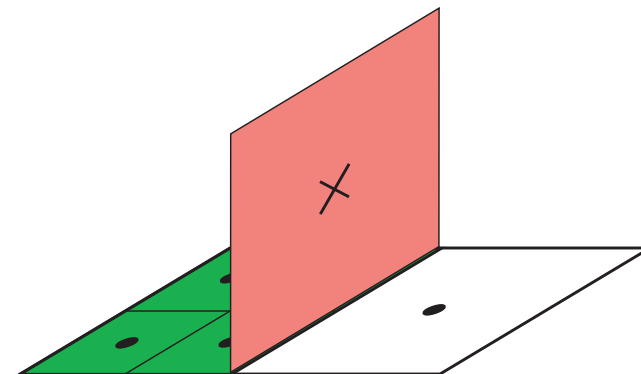
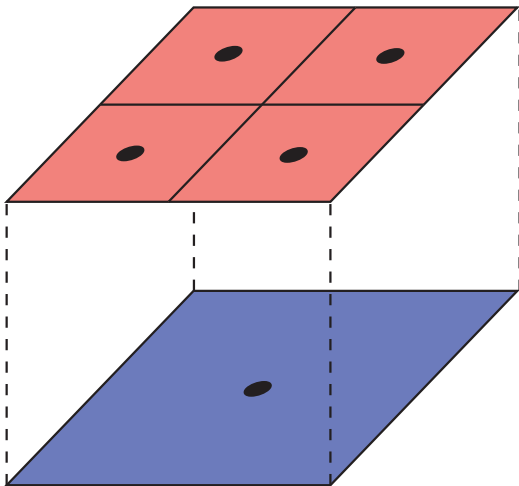
# Synchronization

After coarse grid time step and the subcycled advance of fine data, we have

- $U^c$  at  $t_c^{n+1}$
- $U^f$  at  $t_c^{n+1}$

However,  $U^c$  and  $U^f$  are not consistent

- Coarse data is not necessarily equal to the average of the fine grid data “over” it.
- Scheme violates conservation because of inconsistent fluxes at coarse-fine interface



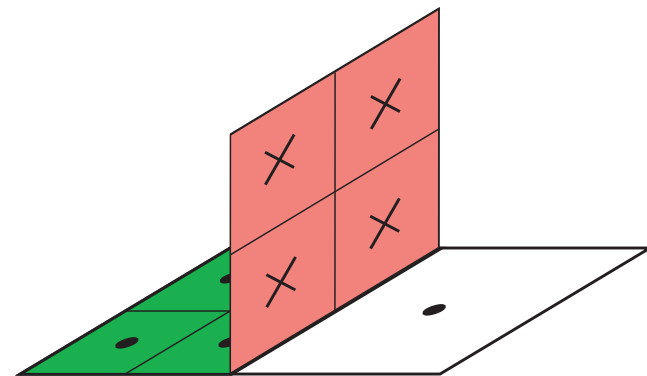
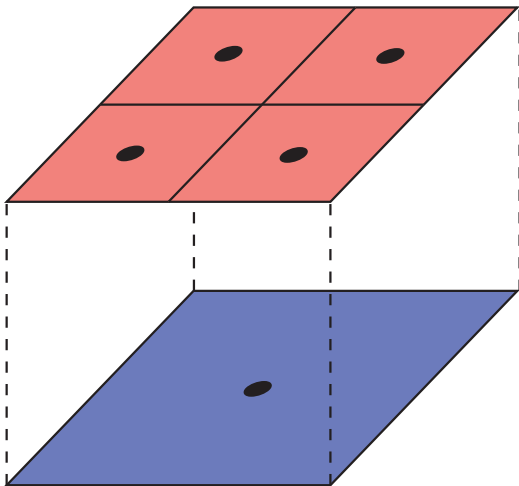
# Synchronization

After coarse grid time step and the subcycled advance of fine data, we have

- $U^c$  at  $t_c^{n+1}$
- $U^f$  at  $t_c^{n+1}$

However,  $U^c$  and  $U^f$  are not consistent

- Coarse data is not necessarily equal to the average of the fine grid data “over” it.
- Scheme violates conservation because of inconsistent fluxes at coarse-fine interface





# Synchronization (p2)

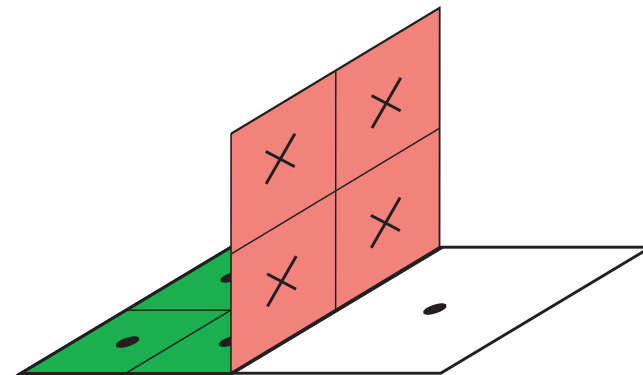
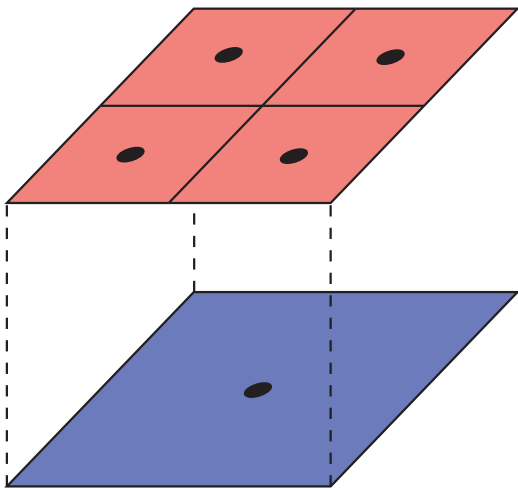
How do we address these problems with the solution?

- Average down the fine grid data onto all underlying coarse cells

$$U^c = \frac{1}{r^d} \sum U^f$$

- Reflux at coarse-fine interfaces

$$\Delta x_c \Delta y_c U^c = \Delta x_c \Delta y_c U^c - \Delta t^c A^c \mathbf{F}^c + \sum \Delta t^f A^f \mathbf{F}^f$$



# Regridding

Compute “error” at each cell : if “too big” then flag cell for refinement

- Richardson extrapolation
  - Coarsen data on a patch at  $t^{n-1}$  and advance by  $2\Delta t$
  - Advance data at  $t^n$  by  $\Delta t$  and coarsen
  - Difference of these two solutions is proportional to error
- Functions of solution (e.g., vorticity)
- Geometric considerations

Compute refined patches as initially

Fill newly refined regions using conservative interpolation from coarse grid

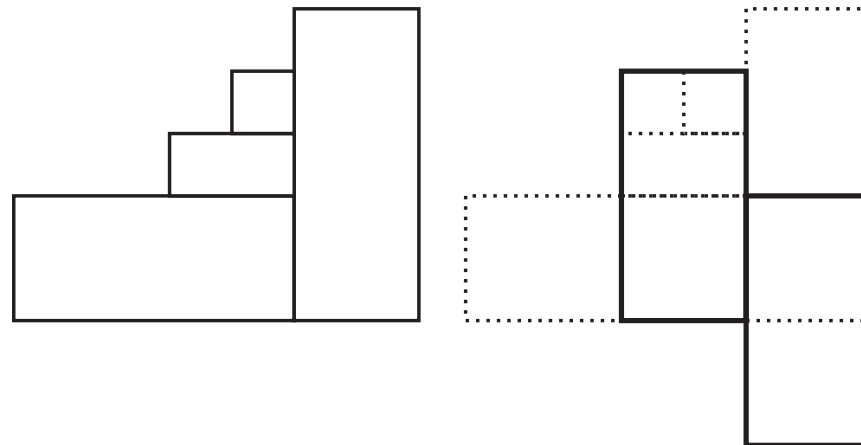
# Regridding

Compute “error” at each cell : if “too big” then flag cell for refinement

- Richardson extrapolation
  - Coarsen data on a patch at  $t^{n-1}$  and advance by  $2\Delta t$
  - Advance data at  $t^n$  by  $\Delta t$  and coarsen
  - Difference of these two solutions is proportional to error
- Functions of solution (e.g., vorticity)
- Geometric considerations

Compute refined patches as initially

Fill newly refined regions using conservative interpolation from coarse grid



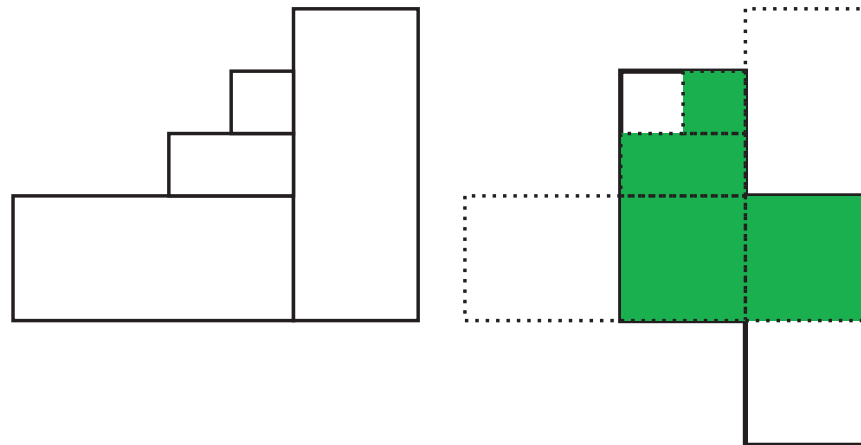
# Regridding

Compute “error” at each cell : if “too big” then flag cell for refinement

- Richardson extrapolation
  - Coarsen data on a patch at  $t^{n-1}$  and advance by  $2\Delta t$
  - Advance data at  $t^n$  by  $\Delta t$  and coarsen
  - Difference of these two solutions is proportional to error
- Functions of solution (e.g., vorticity)
- Geometric considerations

Compute refined patches as initially

Fill newly refined regions using conservative interpolation from coarse grid



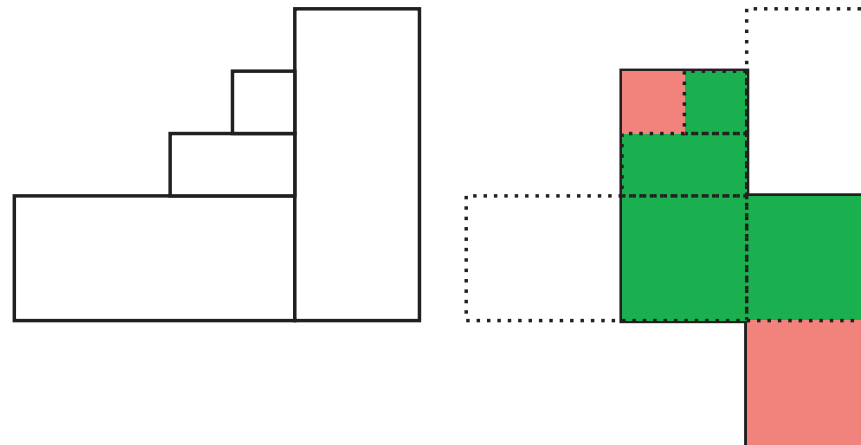
# Regridding

Compute “error” at each cell : if “too big” then flag cell for refinement

- Richardson extrapolation
  - Coarsen data on a patch at  $t^{n-1}$  and advance by  $2\Delta t$
  - Advance data at  $t^n$  by  $\Delta t$  and coarsen
  - Difference of these two solutions is proportional to error
- Functions of solution (e.g., vorticity)
- Geometric considerations

Compute refined patches as initially

Fill newly refined regions using conservative interpolation from coarse grid



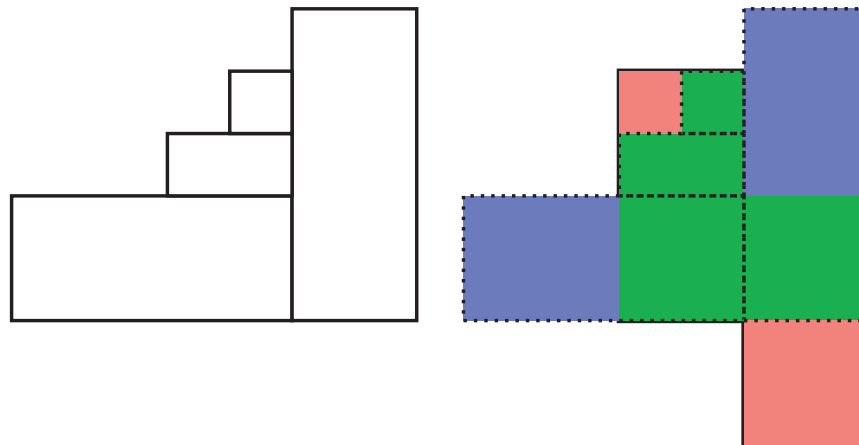
# Regridding

Compute “error” at each cell : if “too big” then flag cell for refinement

- Richardson extrapolation
  - Coarsen data on a patch at  $t^{n-1}$  and advance by  $2\Delta t$
  - Advance data at  $t^n$  by  $\Delta t$  and coarsen
  - Difference of these two solutions is proportional to error
- Functions of solution (e.g., vorticity)
- Geometric considerations

Compute refined patches as initially

Fill newly refined regions using conservative interpolation from coarse grid



# Summary of Algorithm



## Hyperbolic AMR

For  $n = 1, \dots, N_{final}$   
Advance( $0, t_0^n$ )

### Advance ( $\ell, t$ )

If (time to regrid) then

Regrid( $\ell$ )

FillPatch( $\ell, t$ )

Integrate( $\ell, t, \Delta t_\ell$ )

If ( $\ell < \ell_{finest}$ ) then

For  $i_{sub} = 1, \dots, r_\ell$

Advance( $\ell+1, t + (i_{sub} - 1)\Delta t_{\ell+1}$ )

Average down( $\ell, t + \Delta t_\ell$ )

Reflux( $\ell, t + \Delta t_\ell$ )

End If

**Regrid( $\ell$ ):** generate new grids at levels  $\ell+1$  and higher

**FillPatch( $\ell, t$ ):** fill patch of data at level  $\ell$  and time  $t$

**Integrate( $\ell, t, \Delta t$ ):** Advance data at level  $\ell$  from  $t$  to  $t + \Delta t$ , averaging and storing fluxes at boundaries of level  $\ell$  grids if  $\ell > 0$  and level  $\ell$  cells at boundary of  $\ell + 1$

**Average down( $\ell, t$ ):** average (in space) level  $\ell+1$  data at time  $t$  to level  $\ell$

**Reflux( $\ell, t$ ):** Add (time- and space-averaged) refluxing corrections to level  $\ell$  cells at time  $t$  adjacent to level  $\ell+1$  grids

# Review of Data Operations



## Single-level operations

- Fill a patch with data from same-level grids
- Fill data using physical boundary conditions
- Interpolate data in time
- Add corrections from stored fluxes at same resolution
- Integrate patch of data in time
- Find union of rectangles that contain a set of tagged points

## Multi-level operations

- Map regions between different levels of refinement
- Interpolate : coarse  $\rightarrow$  fine
- Average : fine  $\rightarrow$  coarse
- Store fluxes from fine grid boundaries at coarse resolution



# Parallel Issues for AMR



Issues are primarily

- Data distribution – obvious idea is distributing grids to processors
  - Gridding strategy depends on approach to parallelization
    - Pure MPI
    - Hybrid: MPI + OpenMP
  - Size of grids depends on memory usage, parallelization strategy and additional physics (e.g. Poisson solve for self-gravity)
  
- Dynamic load balancing
  - Need good work estimate
  - Data locality
  
- Parallel in space, serial in time ...

We will talk more about these next week