

Parallel octree-based adaptive finite elements for large-scale geoscience applications

Carsten Burstedde, Omar Ghattas
Georg Stadler, Tiankai Tu, Lucas Wilcox

Institute for Computational Engineering and Sciences
The University of Texas at Austin

Collaboration with George Biros, Michael Gurnis, and Shijie Zhong
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October 2007

Outline

- ① Parallel octree-based dynamic adaptive mesh refinement—definitions and challenges
- ② Our scope and other approaches
- ③ Our approach to adaptive FEM based on parallel octrees
- ④ Driving application: mantle convection

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Parallel octree-based dynamic adaptive mesh refinement

Adaptive mesh refinement

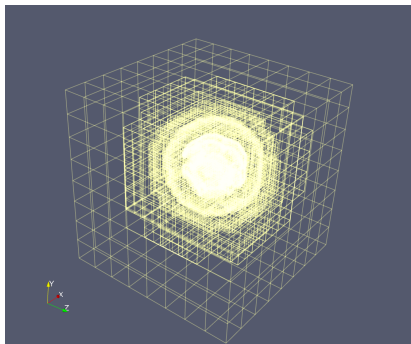
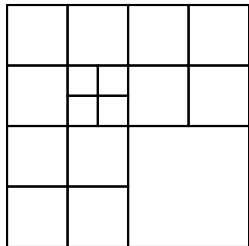
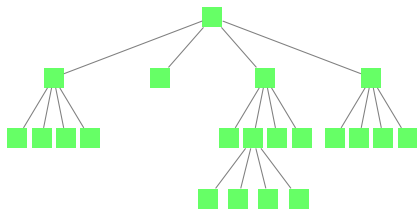


Figure: Adaptively refined mesh

- AMR essential for resolving physical phenomena that vary over a wide range of scales
- we estimate a factor of $\sim 10^2 - 10^3$ savings in the number of dofs for our application

Parallel **octree-based** dynamic adaptive mesh refinement

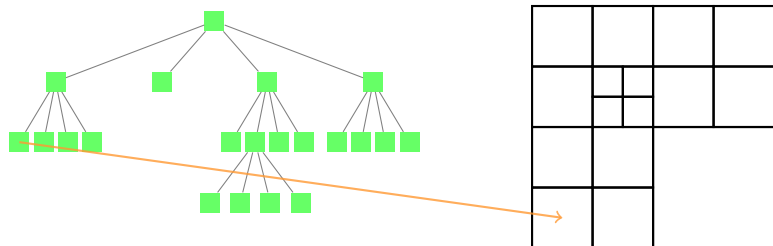
Octree-based meshing



- The mesh is based on an octree: nodes in the tree map to hexahedral elements
- Octrees allow simple treatment of connectivity information
- Octree-based meshes are a tradeoff between geometric flexibility and simplicity

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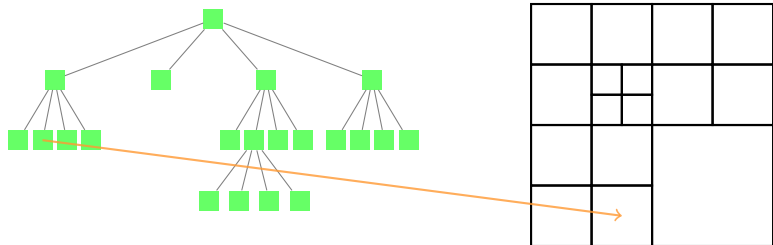
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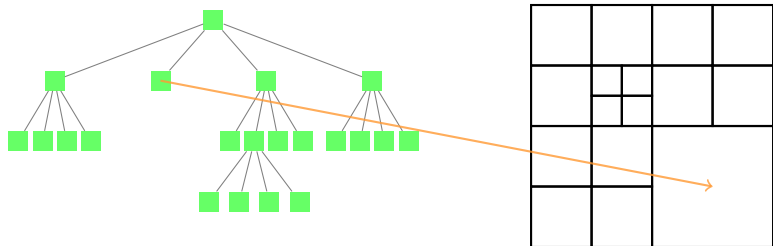
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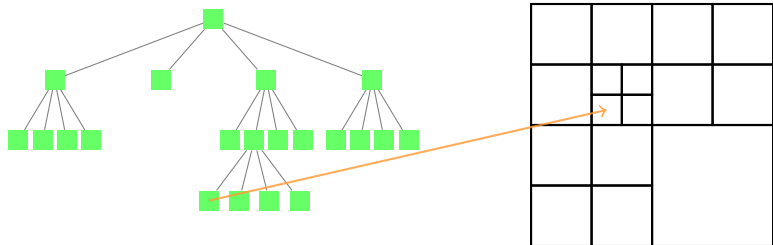
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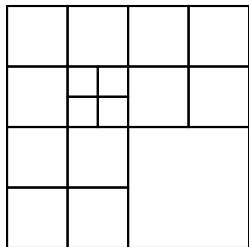
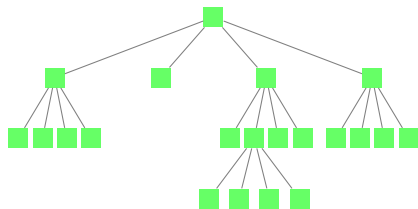
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Parallel octree-based dynamic adaptive mesh refinement

Parallel implementation

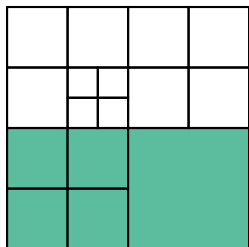
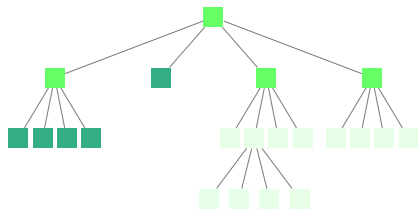


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- Underlying mesh operations parallelized according to the octree partitioning

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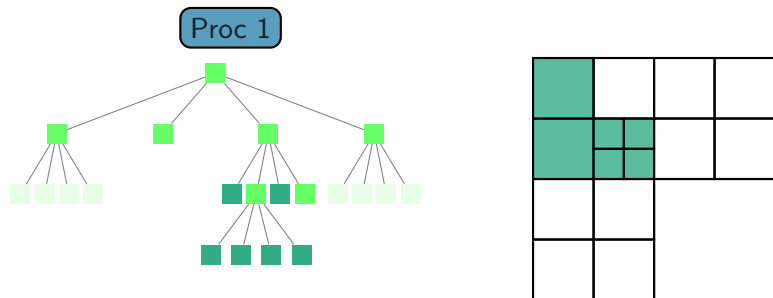
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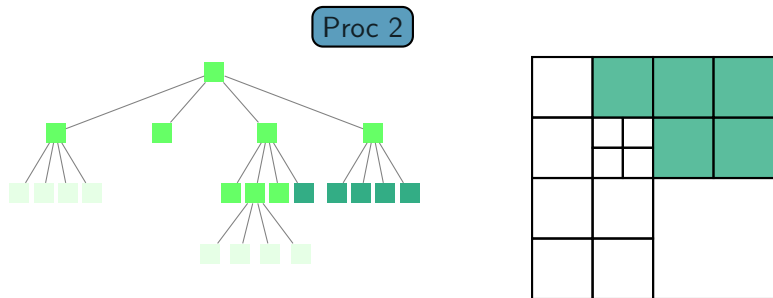
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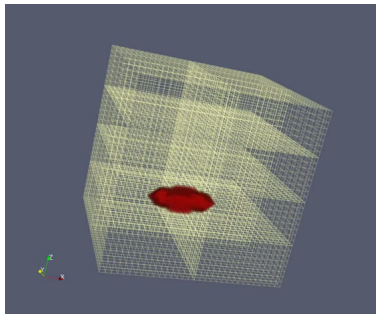


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Parallel octree-based **dynamic** adaptive mesh refinement

Dynamic mesh adaptation

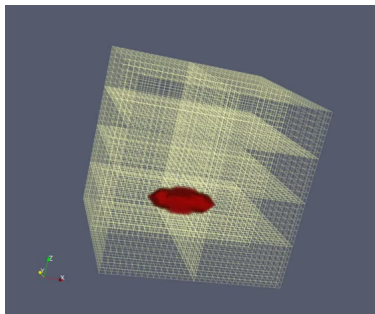
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Parallel octree-based **dynamic** adaptive mesh refinement

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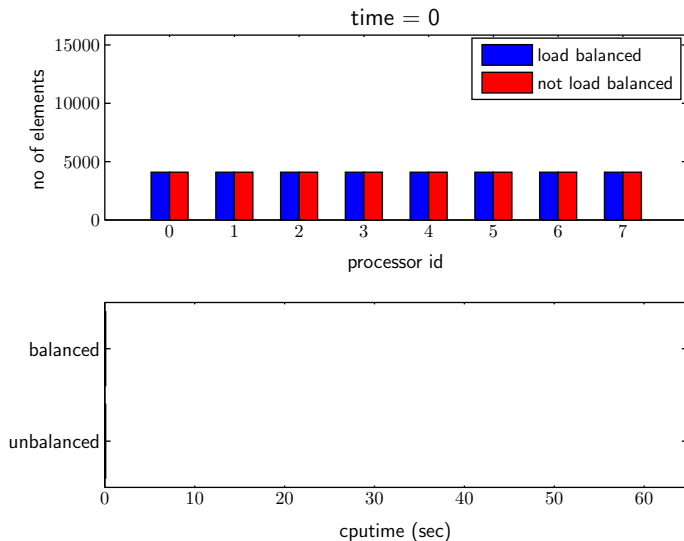
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⇒ Problem: Mesh and application data need to be redistributed among processors ⇒ **dynamic load balancing**

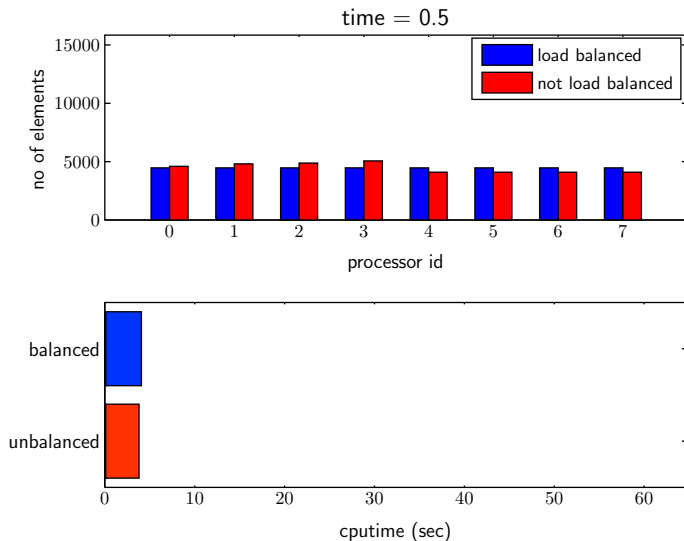
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Load balancing



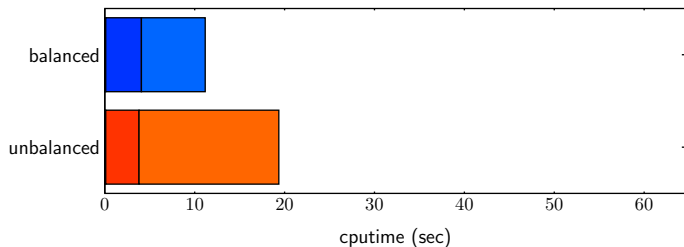
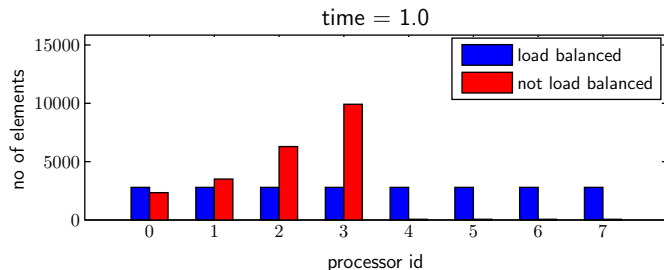
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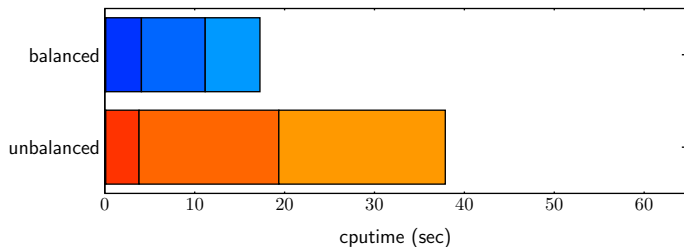
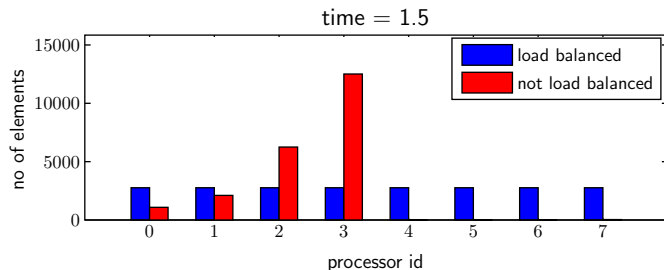
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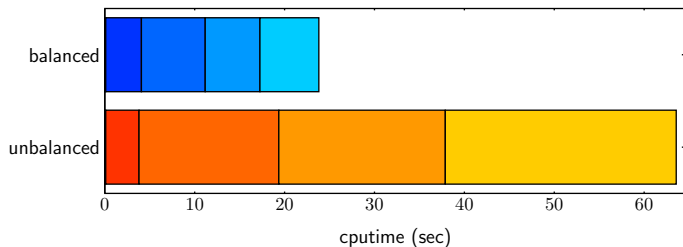
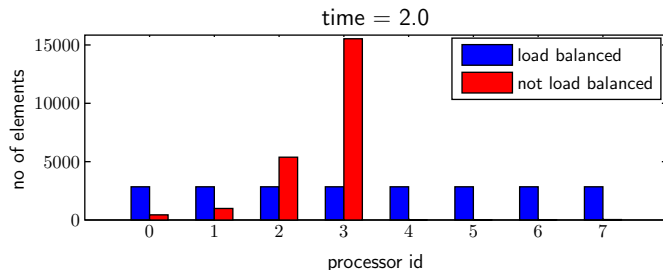
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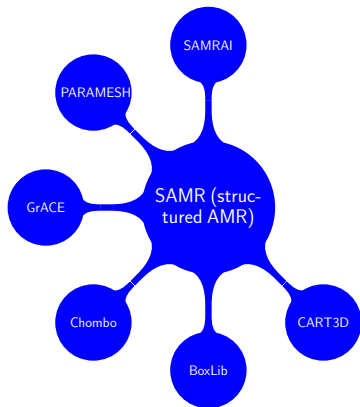
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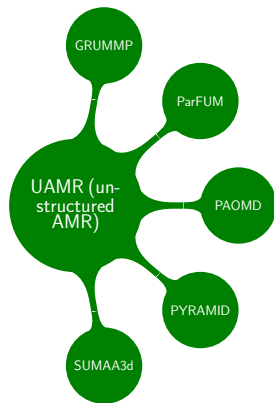
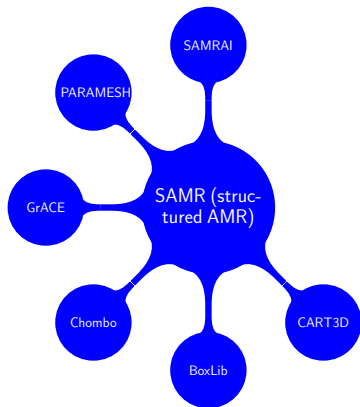
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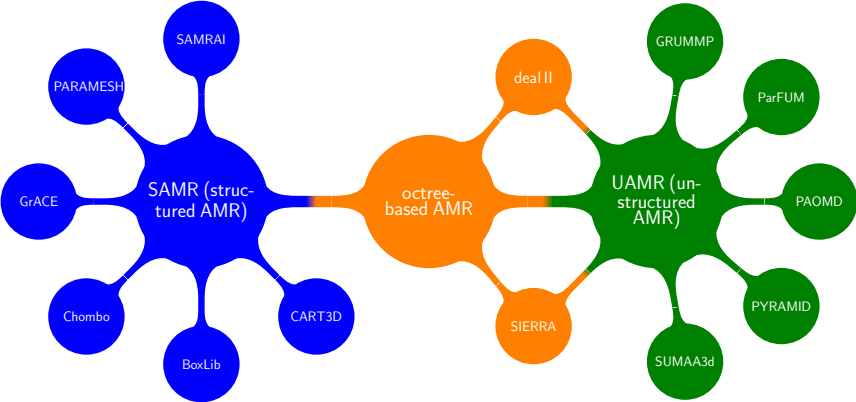
Approaches to adaptive mesh refinement in parallel



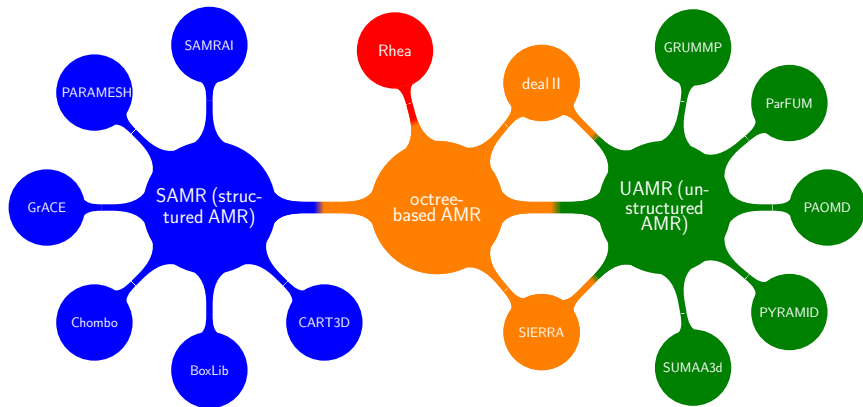
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We are interested in

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- an **end-to-end approach**, i.e., all components (meshing, solver, analysis and visualization) run in parallel and tightly coupled on the same machine
- very large **applications in geosciences**

Scalings

Weak and strong scaling

Strong scaling: Keep workload constant and increase the number of processors



cputime

Scalings

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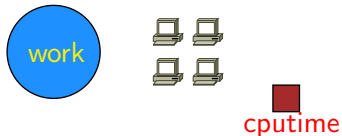
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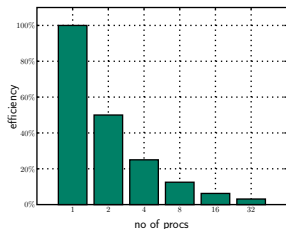
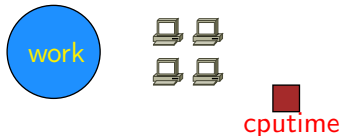
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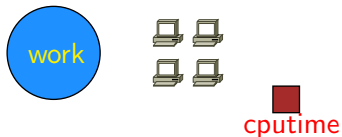
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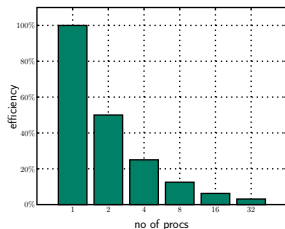
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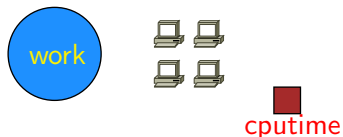
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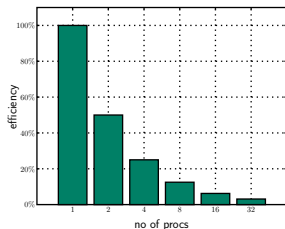
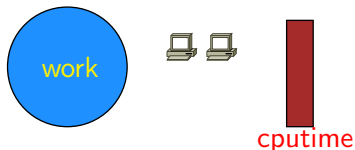
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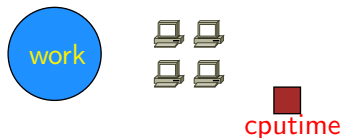
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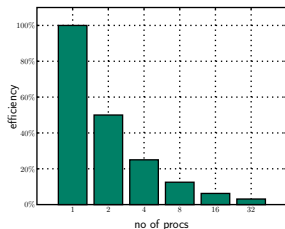
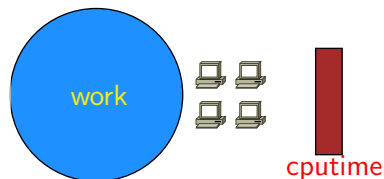
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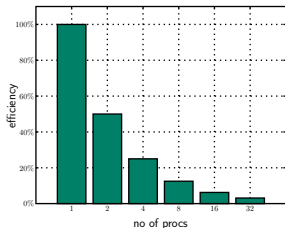
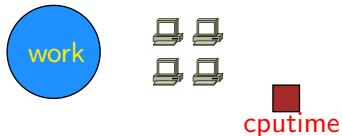
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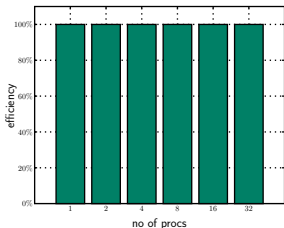
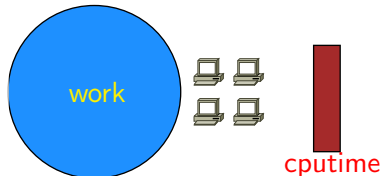
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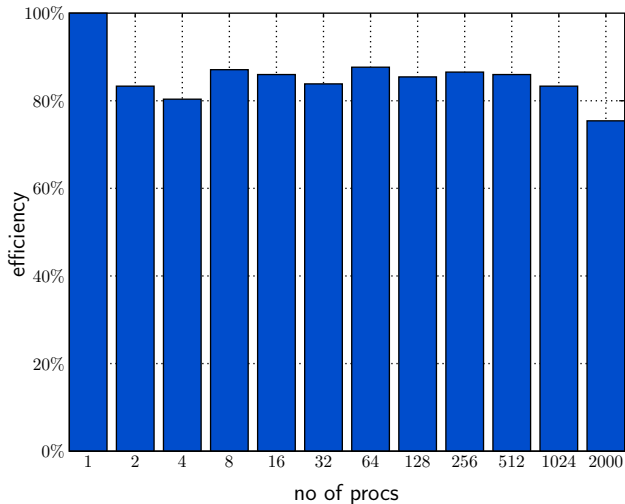


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Results for Rhea: weak scalings for advection-diffusion equation with adaptive mesh refinement/coarsening on up to 2000 processors: efficiency per time step

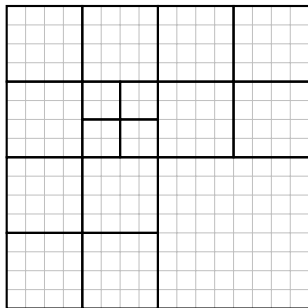
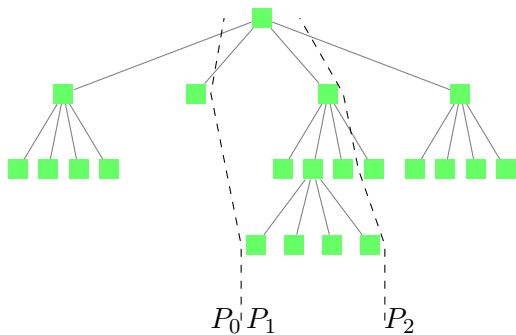


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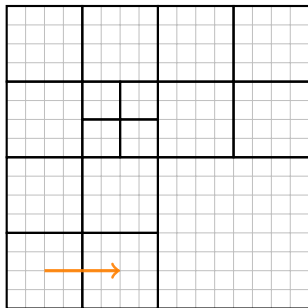
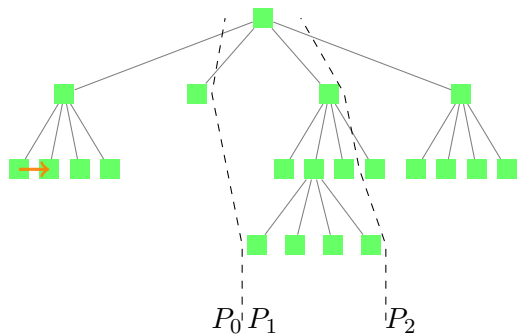
Adaptive FEM based on parallel octrees

start with initial mesh



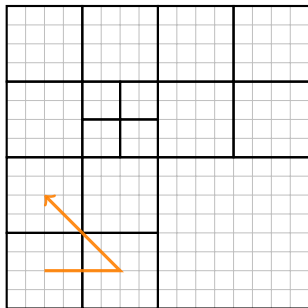
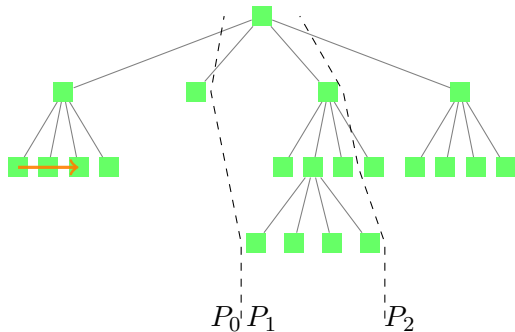
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unique global ordering using a space-filling curve



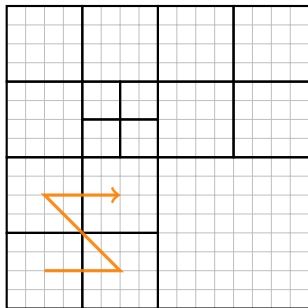
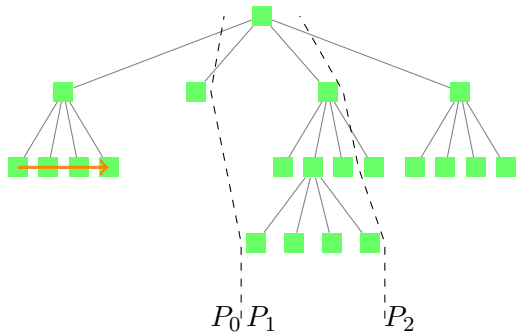
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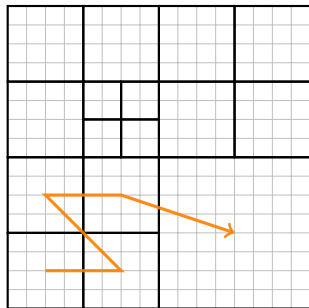
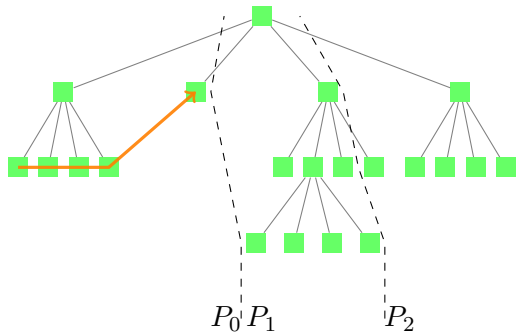
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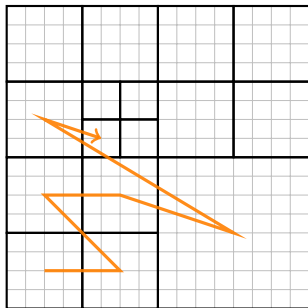
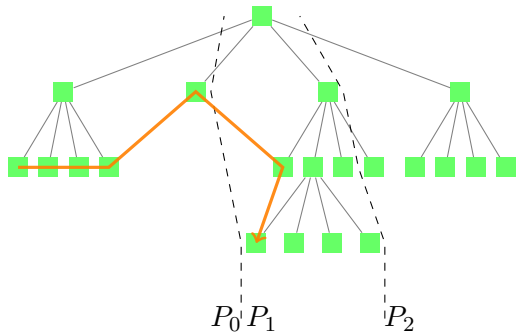
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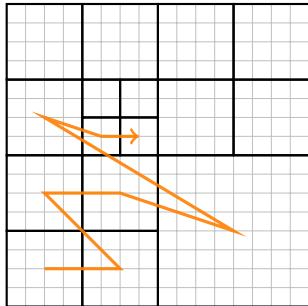
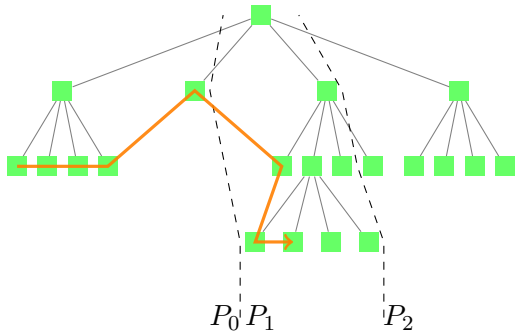
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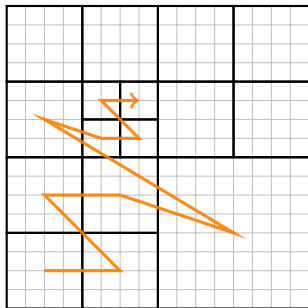
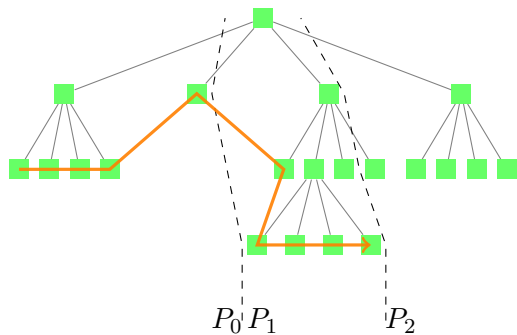
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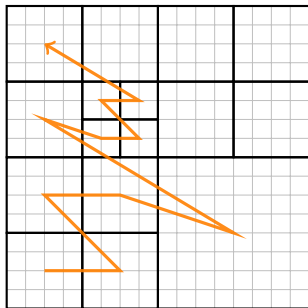
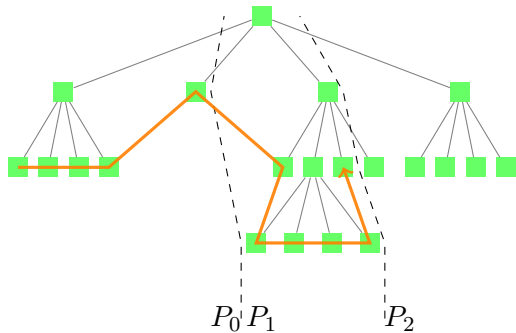
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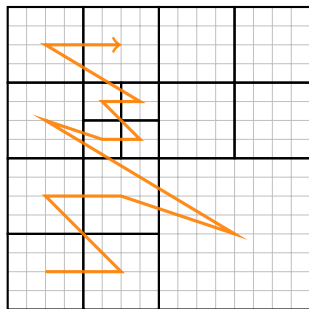
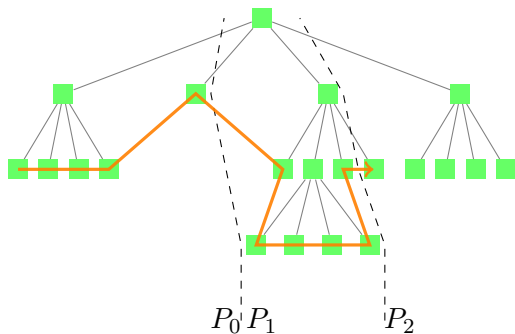
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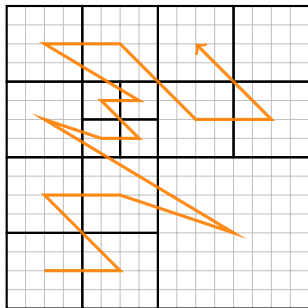
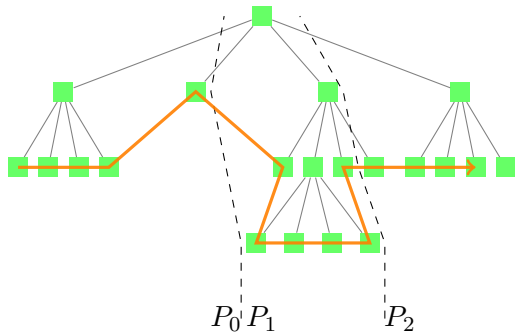
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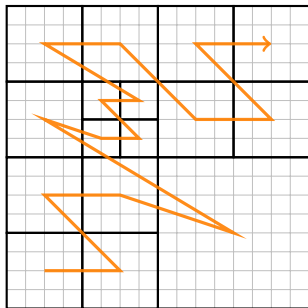
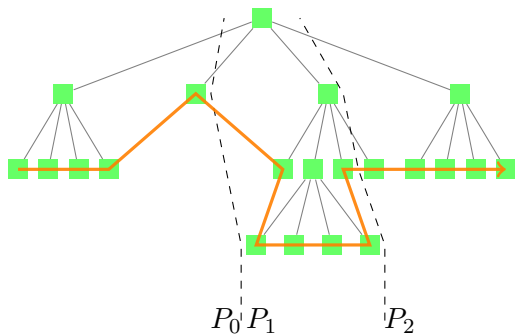
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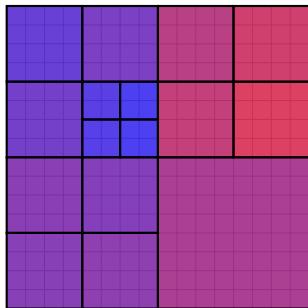
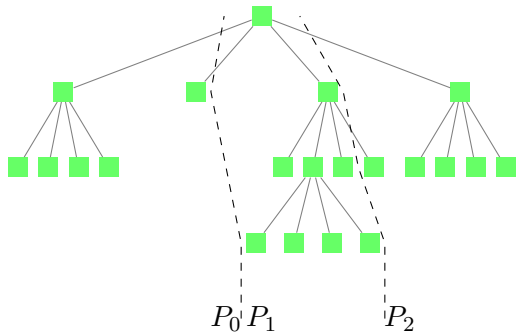
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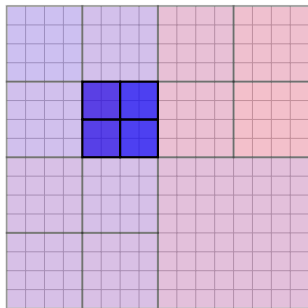
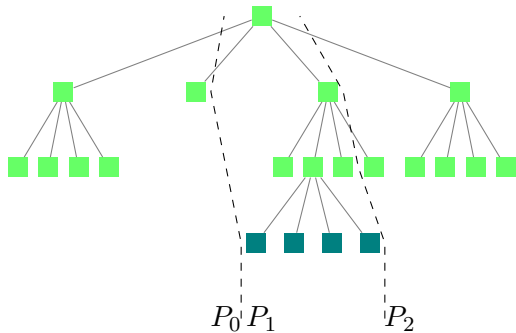
Adaptive FEM based on parallel octrees

estimate error for each element



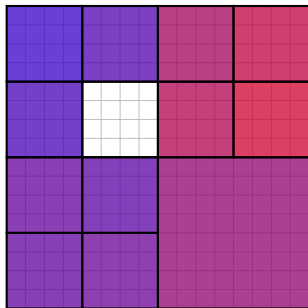
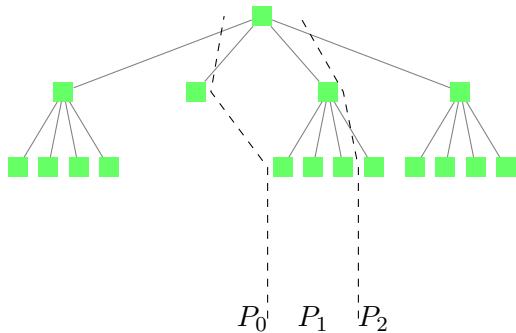
Adaptive FEM based on parallel octrees

select elements for coarsening



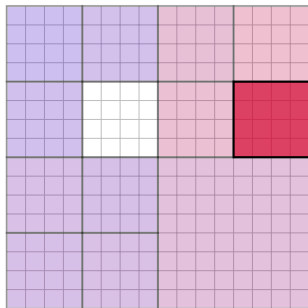
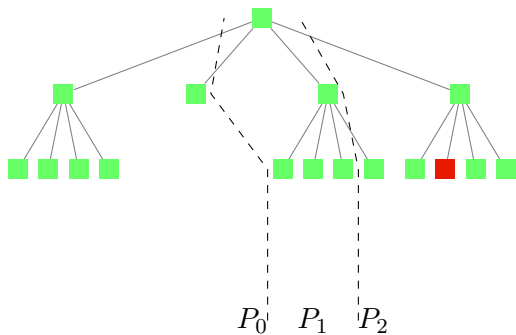
Adaptive FEM based on parallel octrees

coarsening elements



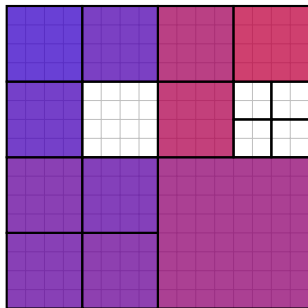
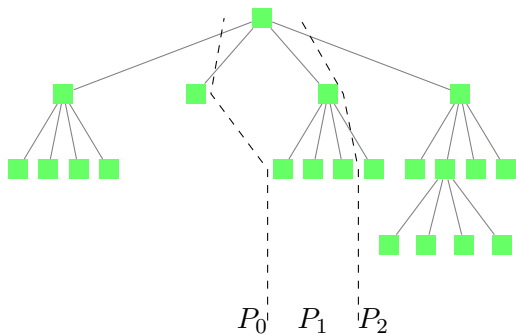
Adaptive FEM based on parallel octrees

select elements for refinement



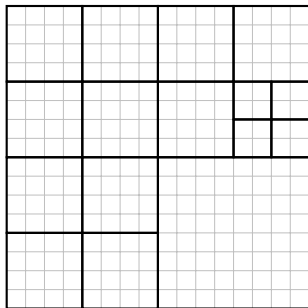
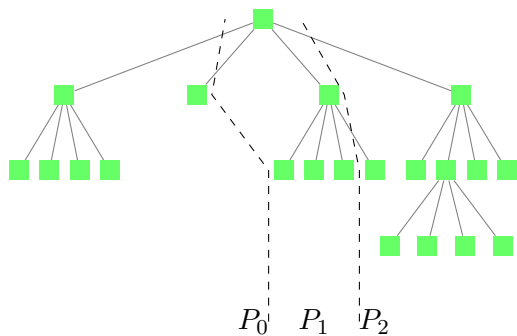
Adaptive FEM based on parallel octrees

refine elements



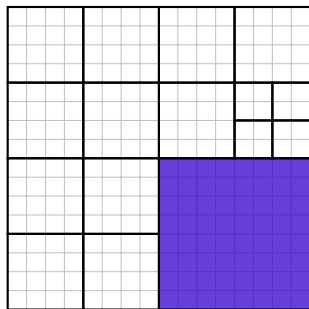
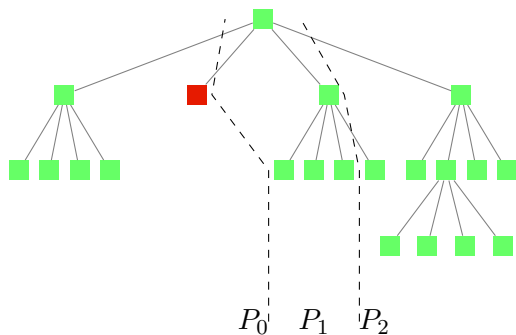
Adaptive FEM based on parallel octrees

2 to 1 balance



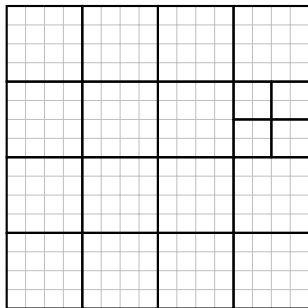
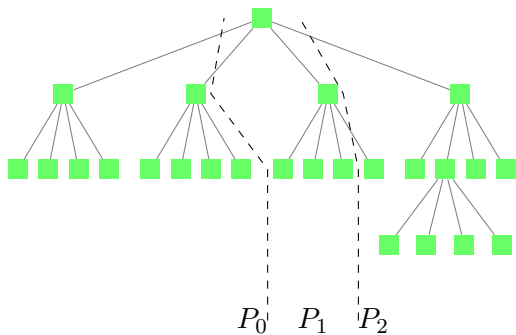
Adaptive FEM based on parallel octrees

2 to 1 balance: select elements for refinement



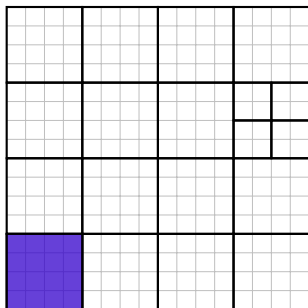
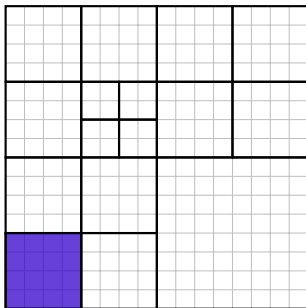
Adaptive FEM based on parallel octrees

2 to 1 balance refine



Adaptive FEM based on parallel octrees

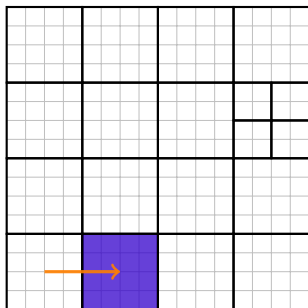
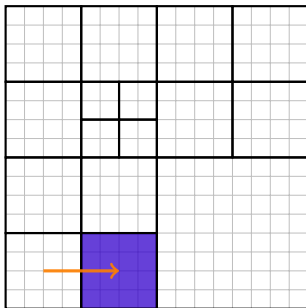
project fields



copy field values

Adaptive FEM based on parallel octrees

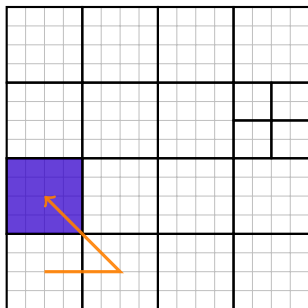
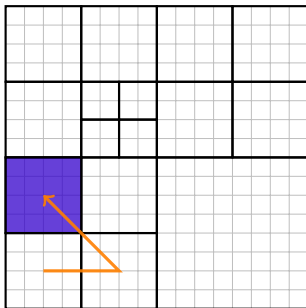
project fields



copy field values

Adaptive FEM based on parallel octrees

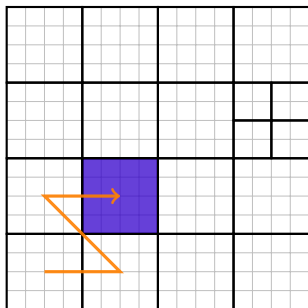
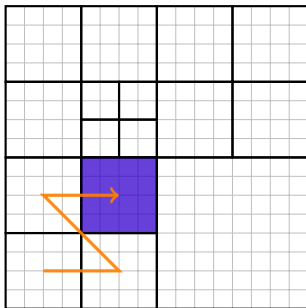
project fields



copy field values

Adaptive FEM based on parallel octrees

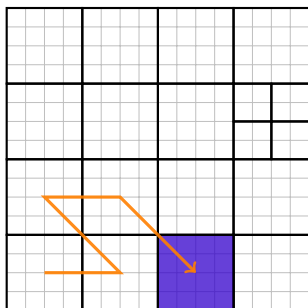
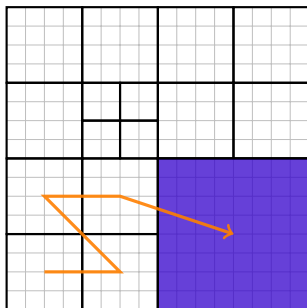
project fields



copy field values

Adaptive FEM based on parallel octrees

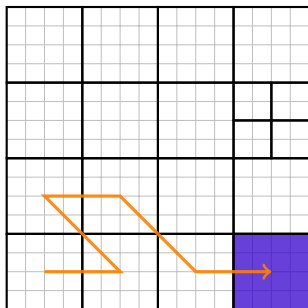
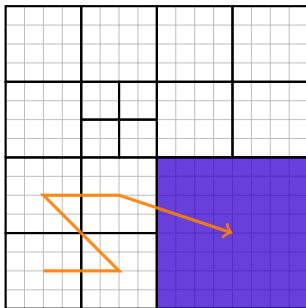
project fields



interpolate coarse → fine

Adaptive FEM based on parallel octrees

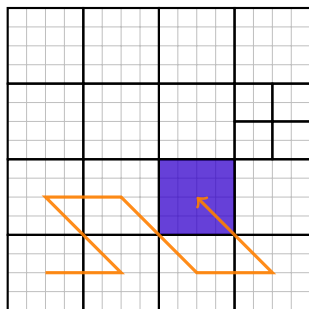
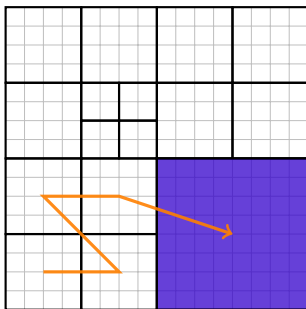
project fields



interpolate coarse \rightarrow fine

Adaptive FEM based on parallel octrees

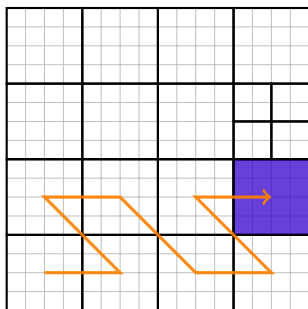
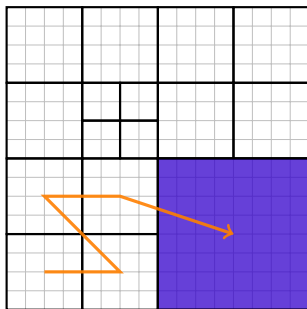
project fields



interpolate coarse \rightarrow fine

Adaptive FEM based on parallel octrees

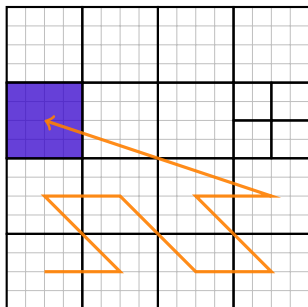
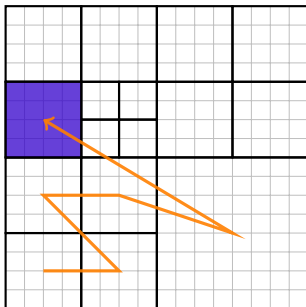
project fields



interpolate coarse \rightarrow fine

Adaptive FEM based on parallel octrees

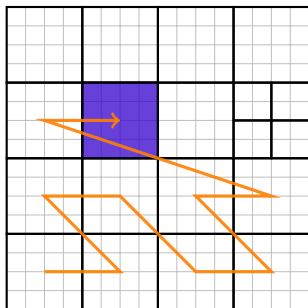
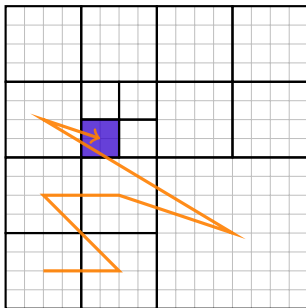
project fields



copy field values

Adaptive FEM based on parallel octrees

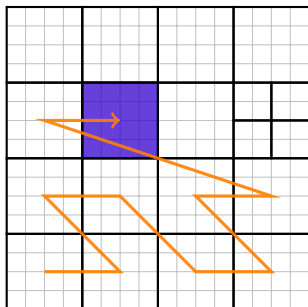
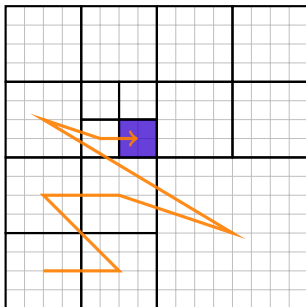
project fields



interpolate fine \rightarrow coarse

Adaptive FEM based on parallel octrees

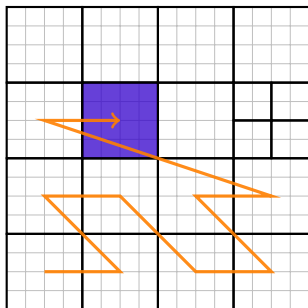
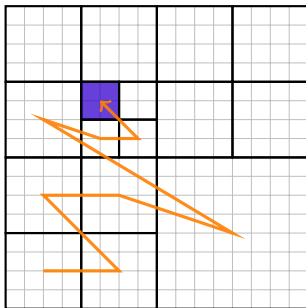
project fields



interpolate fine \rightarrow coarse

Adaptive FEM based on parallel octrees

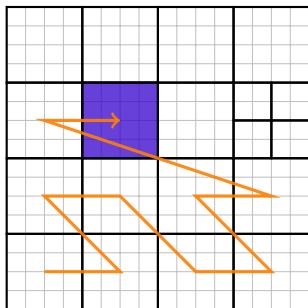
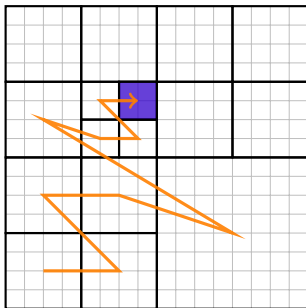
project fields



interpolate fine \rightarrow coarse

Adaptive FEM based on parallel octrees

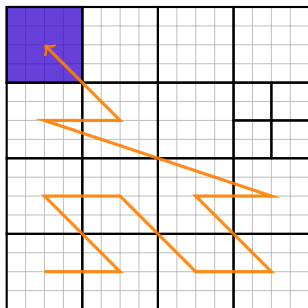
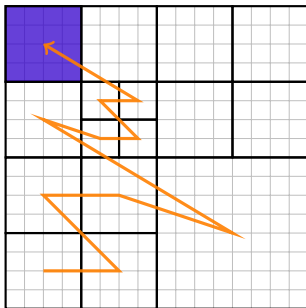
project fields



interpolate fine \rightarrow coarse

Adaptive FEM based on parallel octrees

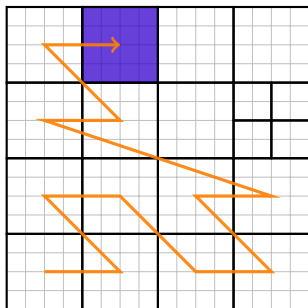
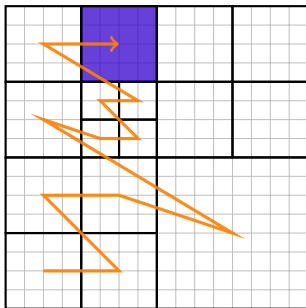
project fields



copy field values

Adaptive FEM based on parallel octrees

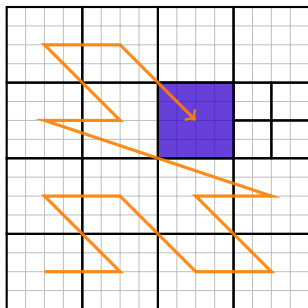
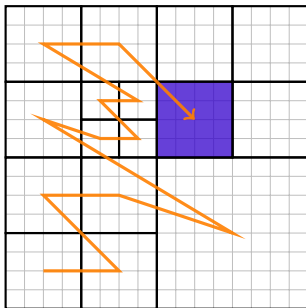
project fields



copy field values

Adaptive FEM based on parallel octrees

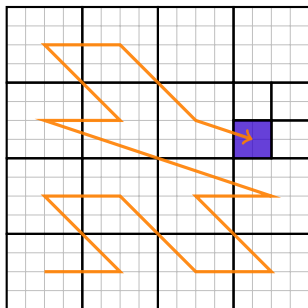
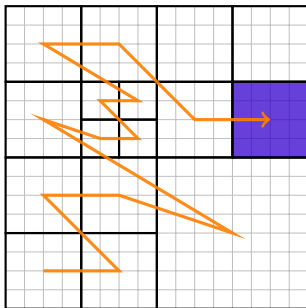
project fields



copy field values

Adaptive FEM based on parallel octrees

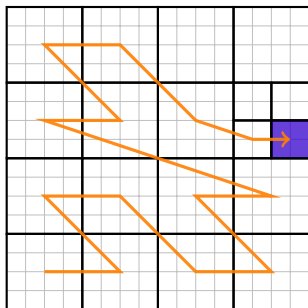
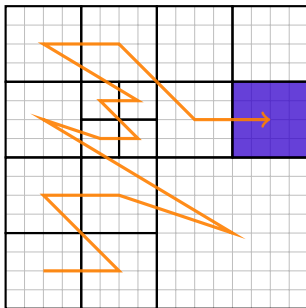
project fields



interpolate coarse \rightarrow fine

Adaptive FEM based on parallel octrees

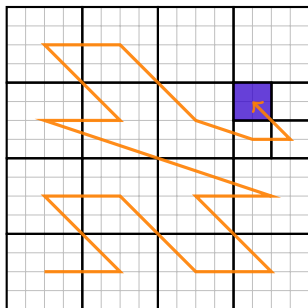
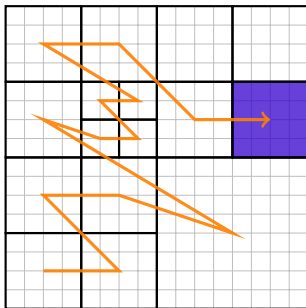
project fields



interpolate coarse \rightarrow fine

Adaptive FEM based on parallel octrees

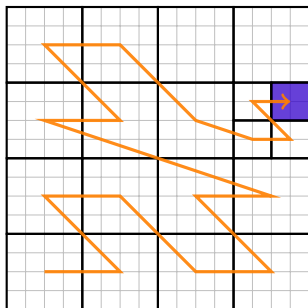
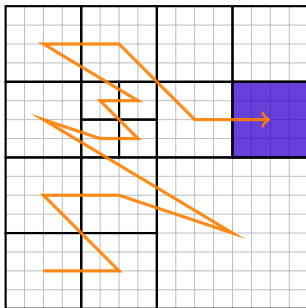
project fields



interpolate coarse \rightarrow fine

Adaptive FEM based on parallel octrees

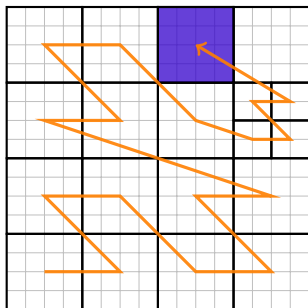
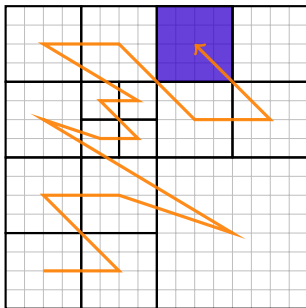
project fields



interpolate coarse \rightarrow fine

Adaptive FEM based on parallel octrees

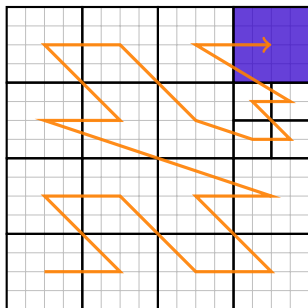
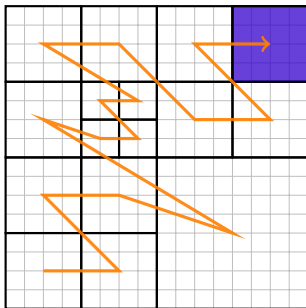
project fields



copy field values

Adaptive FEM based on parallel octrees

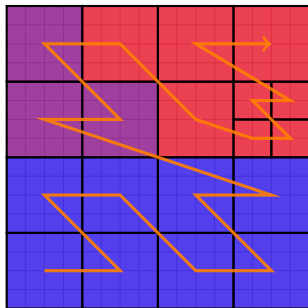
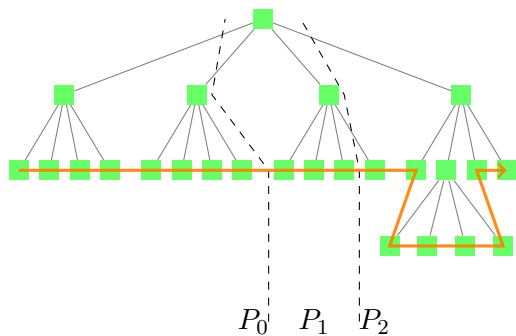
project fields



copy field values

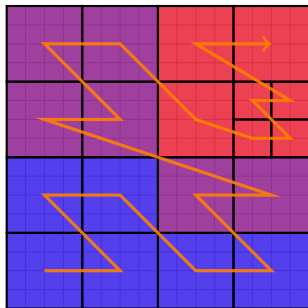
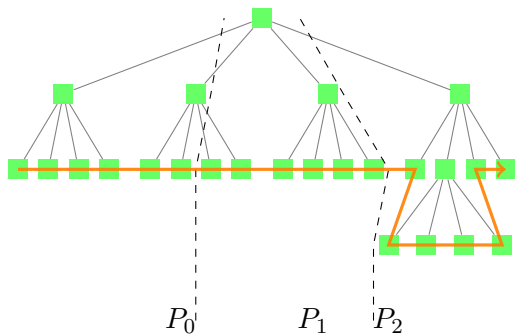
Adaptive FEM based on parallel octrees

initial partitioning



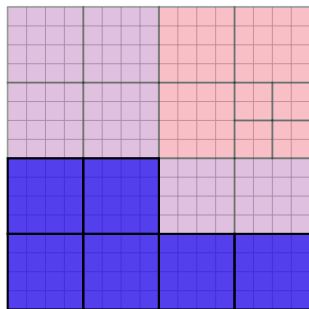
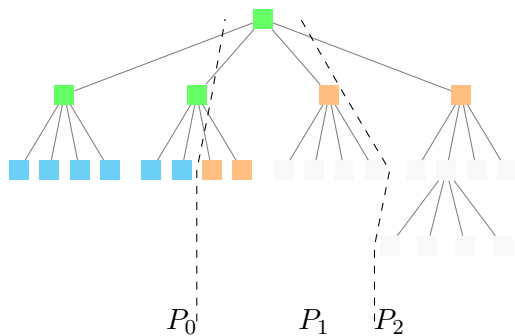
Adaptive FEM based on parallel octrees

load balanced partitioning



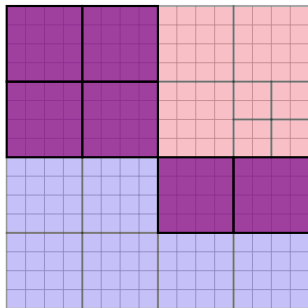
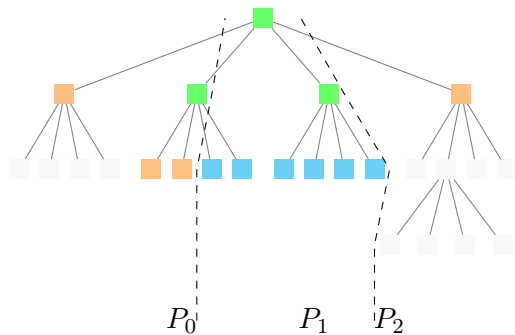
Adaptive FEM based on parallel octrees

P_0 portion of the tree



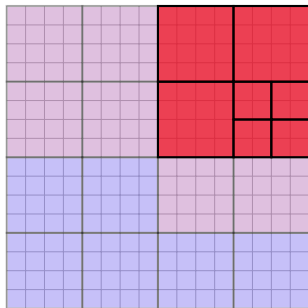
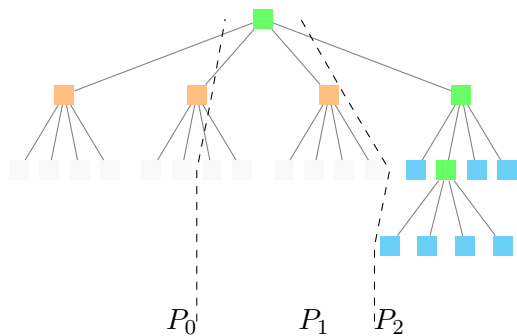
Adaptive FEM based on parallel octrees

P_1 portion of the tree



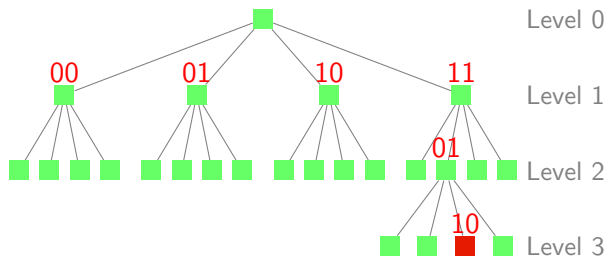
Adaptive FEM based on parallel octrees

P_2 portion of the tree



Adaptive FEM based on parallel octrees

addressing an octant



concat bit-patterns

110110



pad zeros

11011000



append the level

11011000011

Adaptive FEM based on parallel octrees

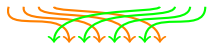
addressing an octant

get the coordinate (12,10)

use binary (0000,0000)

interleave the bits

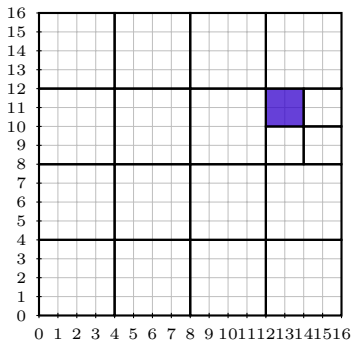
1100 1010



11011000

append the level

11011000011



Overview

- ① Parallel octree-based dynamic adaptive mesh refinement—definitions and challenges
- ② Our scope and other approaches
- ③ Our approach to adaptive FEM based on parallel octrees
- ④ **Driving application: mantle convection**

Driving application: Mantle convection

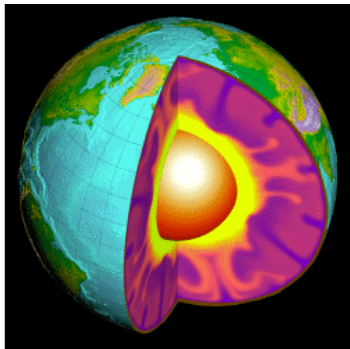


Figure: Taken from US Geological Survey <https://www.usgs.com>

- main control on **thermal** and **geological evolution**
- central for understanding
 - **plate tectonics**
 - **volcanism**
 - **dynamics of the solid earth**

Driving application: Mantle convection

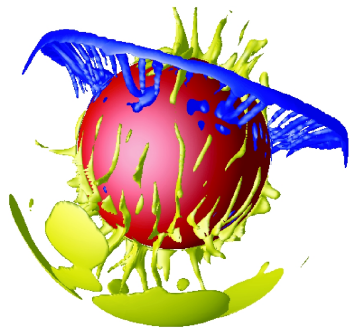


Figure: Isosurfaces of temperature field; plot courtesy of Shijie Zhong

Driving application: Mantle convection

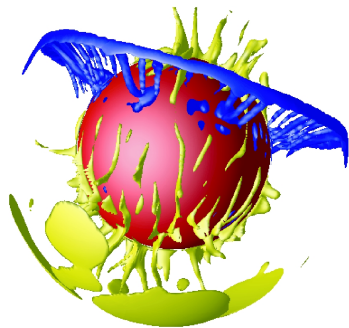


Figure: Isosurfaces of temperature field; plot courtesy of Shijie Zhong

Resolution down to $\sim 1\text{km}$ needed to resolve fine structures

$\Rightarrow \sim 10^{12}$ elements on **uniform grid**

$\Rightarrow \sim 10^9$ elements on **adaptive grid**

Driving application: Mantle convection

Nondimensional model for mantle convection

$$\frac{\partial T}{\partial t} + u \cdot \nabla T - \nabla^2 T - \gamma = 0, \quad (\text{AD})$$

$$\nabla \cdot [\eta(T) (\nabla u + \nabla^T u)] - \nabla p + \text{Ra} T e_r = 0, \quad (\text{S1})$$

$$\nabla \cdot u = 0. \quad (\text{S2})$$

Variables:

- T ... temperature
- u ... velocity
- p ... pressure

Parameters:

- $\text{Ra} \sim 10^6 - 10^9$... Rayleigh number
- γ ... heat production rate
- $\eta(T) \cong \eta_o \exp(1 - E_o T)$... viscosity
- e_r ... radial direction

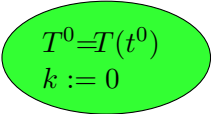
Driving application: Mantle convection

Nondimensional model for mantle convection

$$\frac{\partial T}{\partial t} + u \cdot \nabla T - \nabla^2 T - \gamma = 0, \quad (\text{AD})$$

$$\nabla \cdot [\eta(T) (\nabla u + \nabla^\top u)] - \nabla p + \text{Ra} T e_r = 0, \quad (\text{S1})$$

$$\nabla \cdot u = 0. \quad (\text{S2})$$


$$T^0 = T(t^0)$$

$$k := 0$$

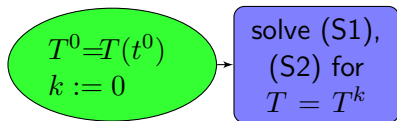
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$$\nabla \cdot u = 0. \quad (\text{S2})$$



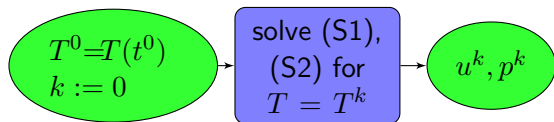
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$$\nabla \cdot u = 0. \quad (\text{S2})$$



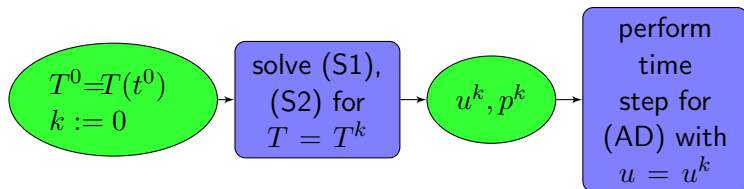
Driving application: Mantle convection

Nondimensional model for mantle convection

$$\frac{\partial T}{\partial t} + u \cdot \nabla T - \nabla^2 T - \gamma = 0, \quad (\text{AD})$$

$$\nabla \cdot [\eta(T) (\nabla u + \nabla^\top u)] - \nabla p + \text{Ra} T e_r = 0, \quad (\text{S1})$$

$$\nabla \cdot u = 0. \quad (\text{S2})$$



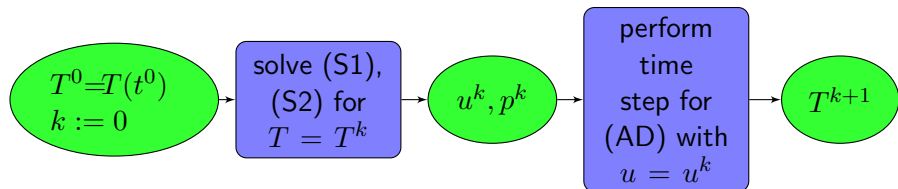
Driving application: Mantle convection

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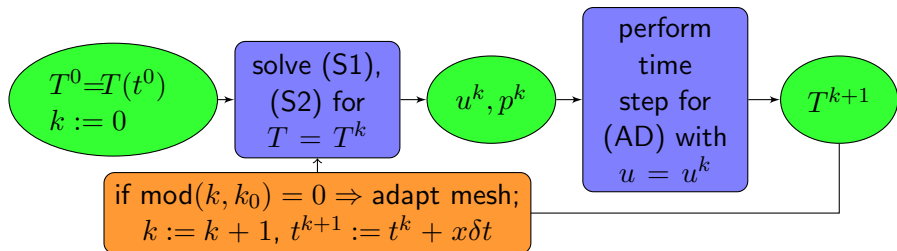
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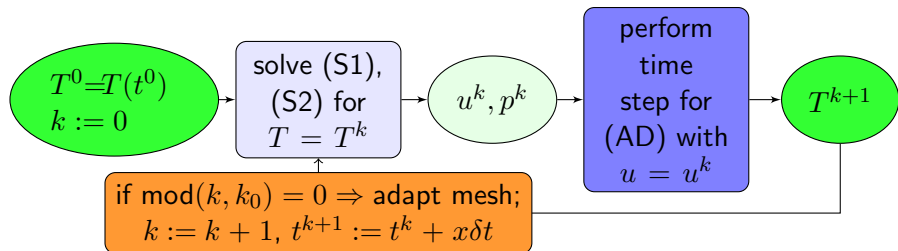
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Driving application: Mantle convection

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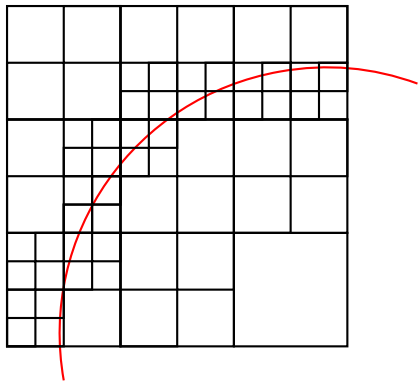
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- **α -timestepping** for advection-diffusion equation (does not require system solves)

Driving application: Mantle convection

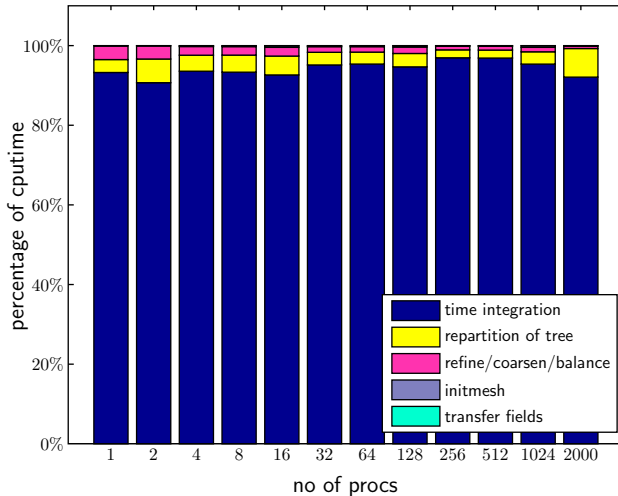
From the cube to spherical geometry



- embed mantle into octree box
- refine near the boundary
- initial approach: use a fictitious domain method to enforce boundary conditions (via penalties or Lagrange multipliers)
- explore immersed finite element method

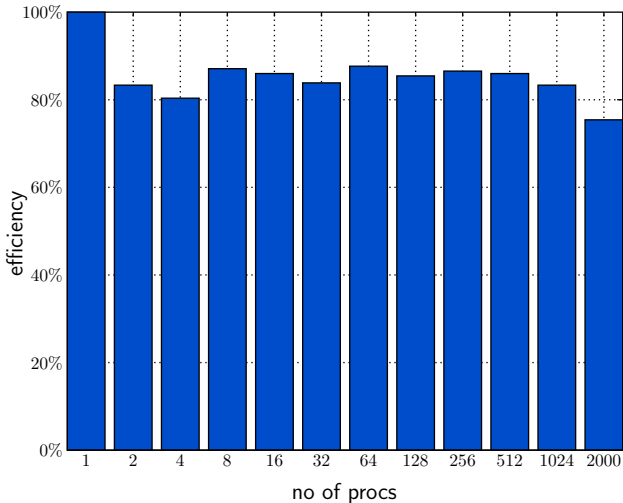
Driving application: Mantle convection

Percentage of wall clock time for Rhea components



Driving application: Mantle convection

Results for Rhea: weak scalings for advection-diffusion equation with adaptive mesh refinement/coarsening on up to 2000 processors: efficiency per time step



Future work

We intend to ...

- develop a scalable Stokes solver to attack the full mantle convection problem
- make our earth round (i.e., extend to spherical geometry)
- optimize and test the approach for $O(10^5)$ processors
- long term: inverse problem (iRhea)

Conclusions

- All AMR compents (error estimation, coarsening, refinement, balancing, repartitioning) consume less than 8% of total run time on up to 2000 processors
 - efficiency can only improve with (implicit, nonlinear) Stokes solver
- Parallel efficiency drops from 83.3% on 2 procs to 75.4% on 2000 procs
- Parallel adaptive mesh refinement/coarsening for FEM that scales up to thousands of processors is possible!
- In principle, higher-order elements and irregular boundaries are possible