

# Highly scalable adaptive mesh refinement for natural hazards modeling

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# Natural Hazards Modeling

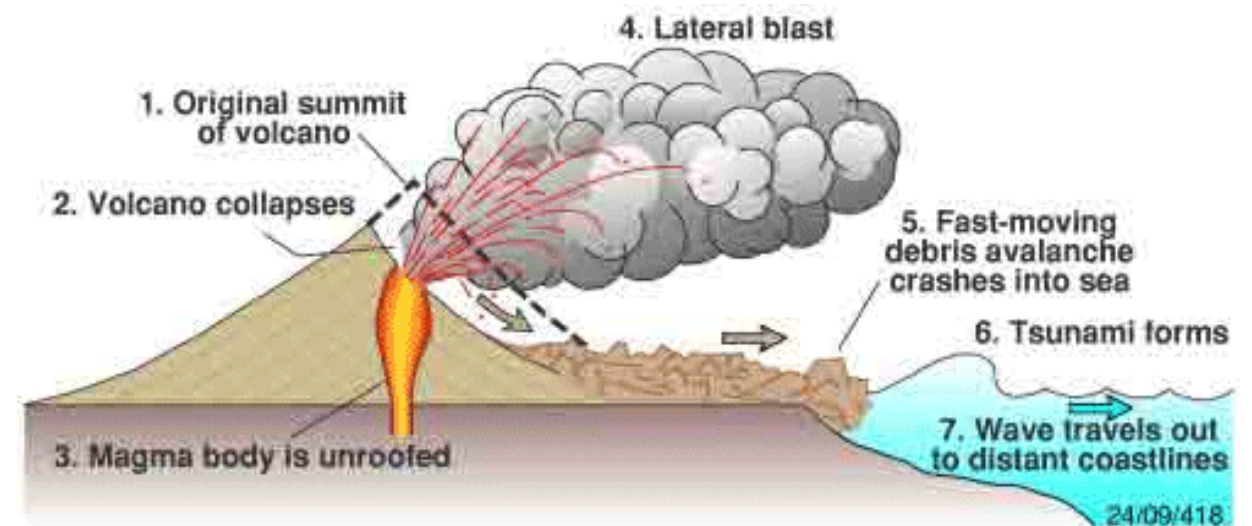
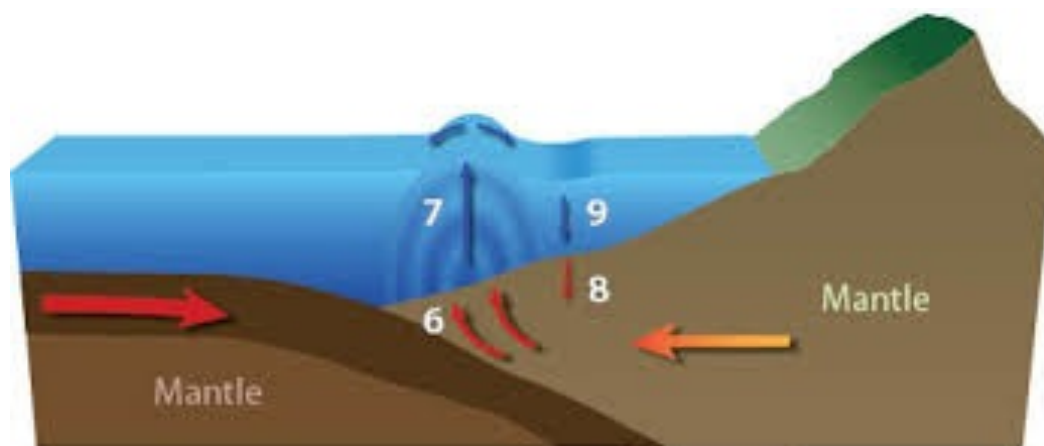
Many natural hazards are well suited to numerical modeling and simulation

- Tsunamis
- Volcanic ash plumes
- Earthquakes
- Wildfires
- Storm surges
- Debris flows and landslides
- Flooding

*Mathematical models are now routinely used to understand these phenomena and predict their behavior*

# Challenges

- Unknown initial conditions
- Complicated geometry that is not well known or understood.
- Coupled events requiring several different models
- Many temporal and spatial scales are involved
- Simulations should be done in real time to be most useful



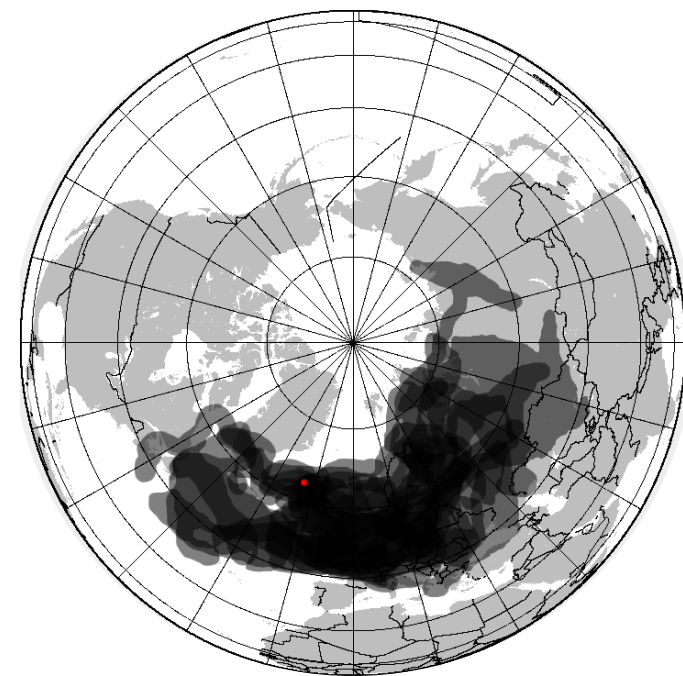
# 2010 Eyjafjallajökull

The April 15-21, 2010 Eyjafjallajökull eruption in Iceland caused unprecedented disruption to civil European airspace.

- 25 countries and over 4 million passengers were affected
- Cost to the airlines were measured in the billions of Euros (Oxford-Economics, 2010)

On April 20th, the previous “zero-ash-tolerance” policy were substituted for policies allowing for low level concentrations of ash in commercial airspace.

*Numerical models must now be able to report ash concentration levels accurately.*

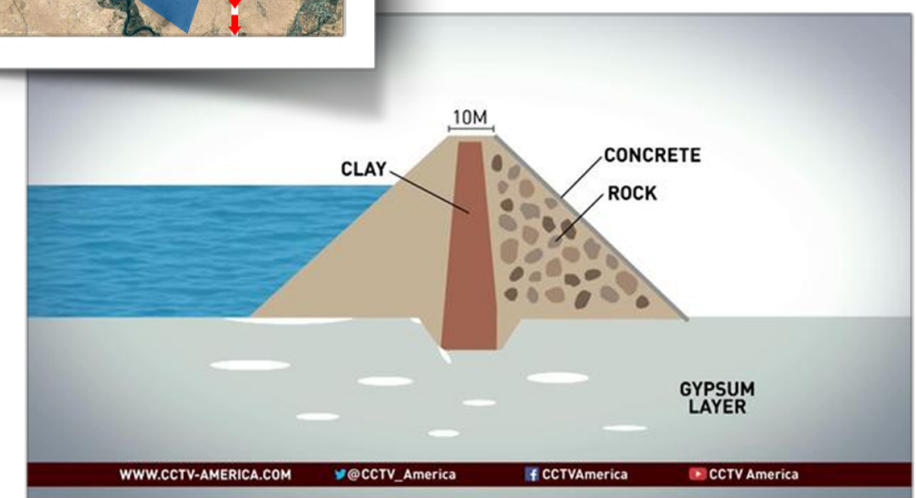
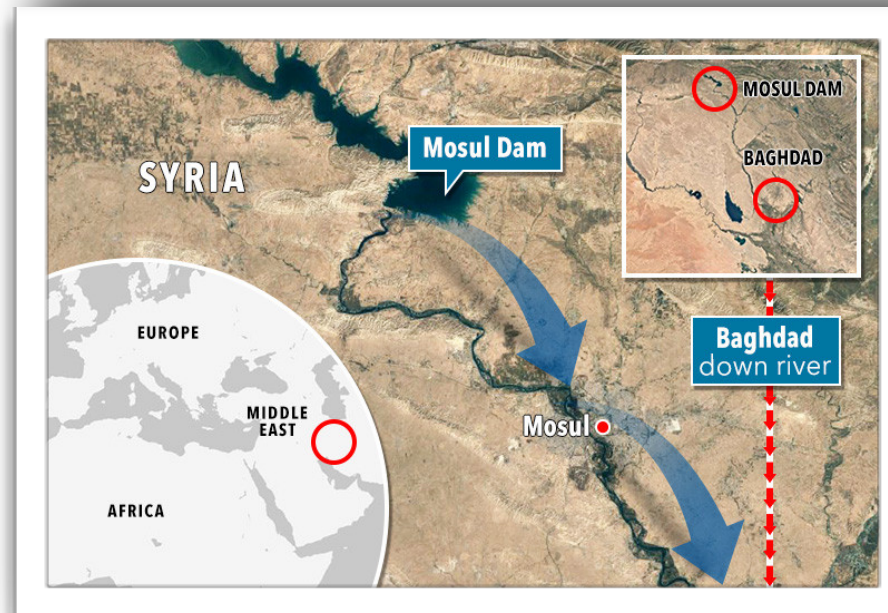




# Threats from dam failures

- According to a U.S. Army Corps of Engineers assessment, “Mosul Dam is the most dangerous dam in the world.” (New Yorker, 1/2/2017)
- Failure could results in million and half people losing their lives or becoming homeless.

If the dam ruptured, it would likely cause a catastrophe of Biblical proportions, loosing **a wave as high as a hundred feet** that would roll down the Tigris, swallowing everything in its path for more than a **hundred miles**. Large parts of Mosul would be **submerged in less than three hours**. Along the river banks, towns and cities containing the heart of Iraq’s population would be flooded; **in four days, a way as high as sixteen feet would crash into Baghdad**, a city of six million people. “If there is a breach in the dam, there will be no warning,” Awash [American-Iraqi civil engineer, advisor on the dam]. “**It’s a nuclear bomb with an predictable fuse**”. -- New Yorker article.



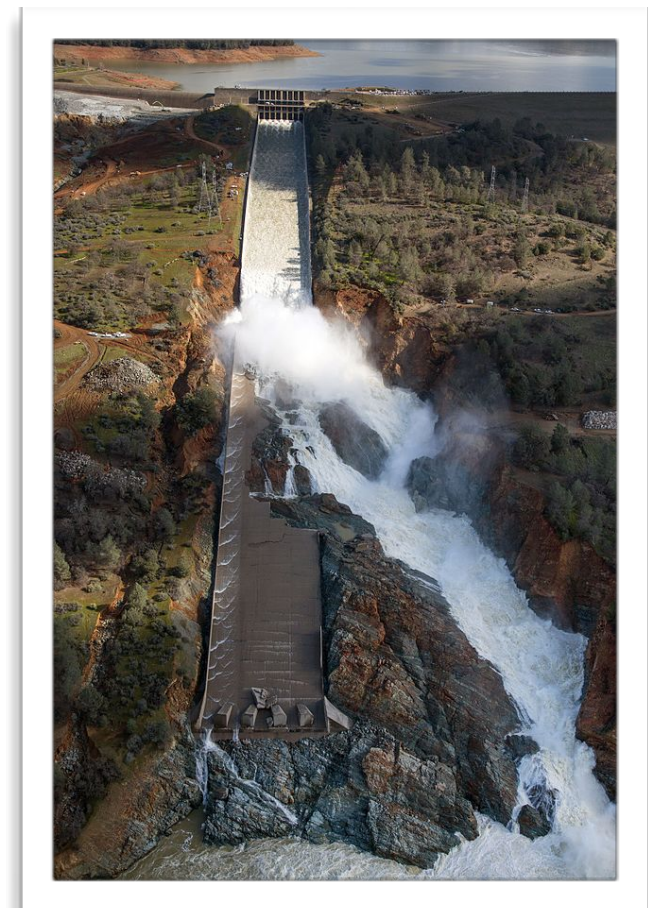


# Dam Failures - US

- American Society of Civil Engineers gives the US a grade D for infrastructure -- nearly 20% of US dams have high hazard potential.



***Oroville Dam, Oroville, CA. in  
February 2017, 188,000  
Residents were evacuated downstream***



***Damage in the Oroville Dam Spillway  
(Dale Kolke / California Department of  
Water Resources - California Department  
of Water Resources)***

# ForestClaw Project

A parallel, adaptive library for logically Cartesian, mapped, multi-block domains

Features of **ForestClaw** include :

- **Block-based** AMR - Each leaf of the quadtree contains a fixed-size grid,
- Uses the **highly scalable p4est** dynamic grid management library (C. Burstedde, Univ. of Bonn, Germany)
- Has **mapped, multi-block** capabilities, (cubed-sphere, for example) to allow for flexibility in physical domains,
- **Extensible** with custom solvers
- Optional **adaptive** time stepping strategy,
- Uses essentially the same algorithmic components as patch-based AMR

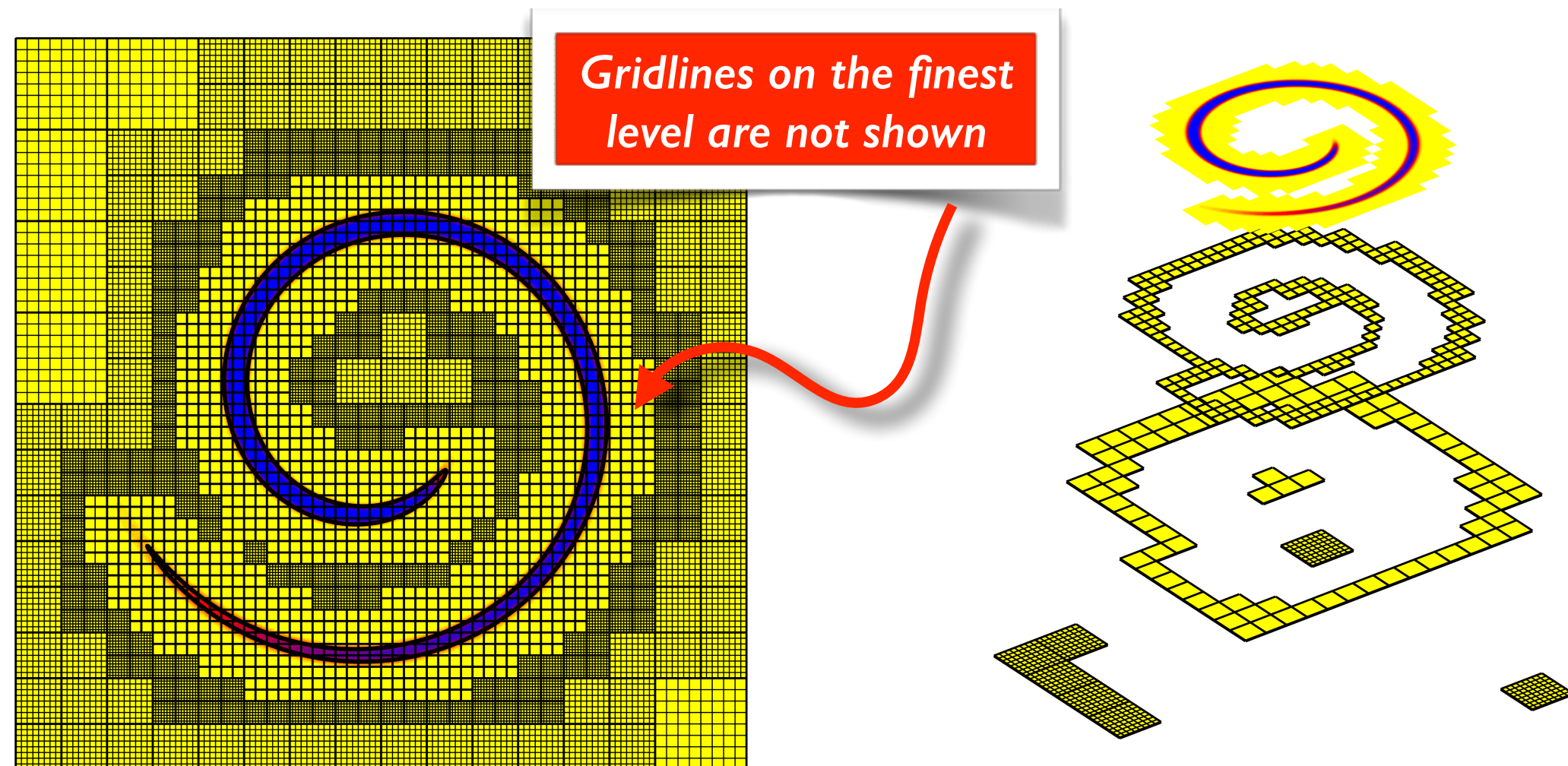
*ForestClaw development supported by the National Science Foundation*

[www.forestclaw.org](http://www.forestclaw.org)

[www.github.com/ForestClaw](https://www.github.com/ForestClaw)

# Adaptive Mesh Refinement (AMR)

**Block-based AMR** (regular sized, non-overlapping blocks in a quadtree/octree)



ForestClaw - [www.forestclaw.org](http://www.forestclaw.org)



# Numerical methods

**Hyperbolic problems in conservative form** (gas dynamics, shallow water wave equations, Burgers equation, ...)

$$\mathbf{q}_t + \nabla \cdot \mathbf{f}(\mathbf{q}) = 0$$

and **non-conservative form** (“color” equation, acoustics, seismic, ...)

$$\mathbf{q}_t + \mathbf{A}(\mathbf{q}, \mathbf{x}, \dots) \nabla \mathbf{q} = 0$$

**Spatially varying** flux functions (tracer transport, ...)

$$\mathbf{q}_t + \nabla \cdot \mathbf{f}(\mathbf{x}, \mathbf{q}) = 0$$

- All forms handled in a general way using **wave propagation algorithms** (R. J. LeVeque) available in Clawpack
- **Second order finite volume** methods for logically Cartesian meshes; **Riemann problems** used to determine strength and speed of waves moving in and out of finite volume cells; **High resolution limiters** to suppress spurious oscillations



# Volcanic ash transport models

Eruptions lasting several days or weeks can place heavy demands on computational resources.

- Observational evidence supports the idea that there is considerable variation in concentration levels in tracers in the atmosphere, not just large diffuse clouds of ash.
- Important to track small scale structures in smooth, even coarse-resolution wind fields (Behrens, MWR 2000)



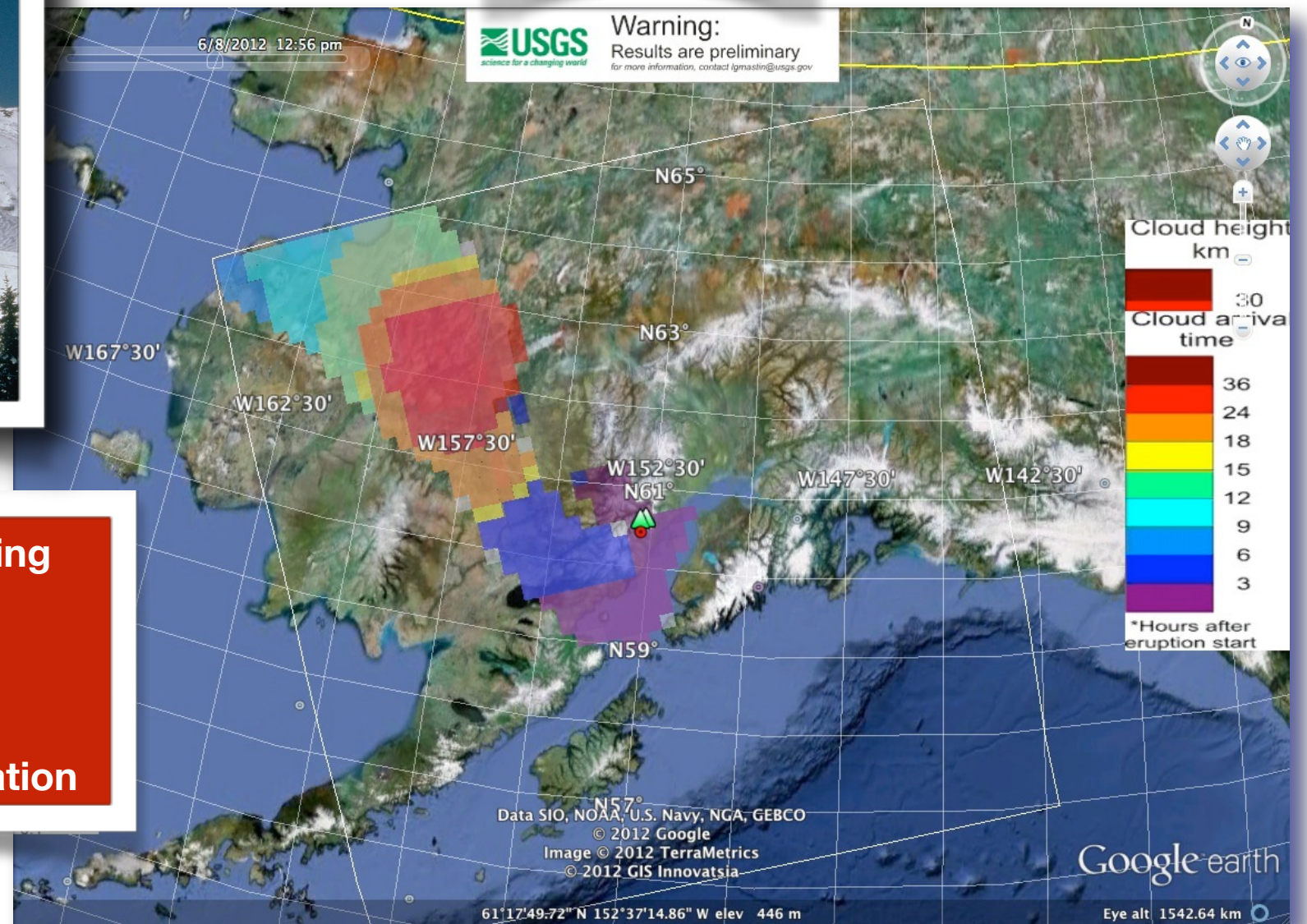
*Ash plume drifting downwind from Cleveland Volcano, Alaska on May 3, 2006. Public photo taken from the [International Space Station](#).*



# USGS Ash3d : Volcanic ash transport



**Ash3d**



- Split horizontal, vertical time stepping
- Fully conservative,
- Eulerian, finite volume
- Algorithms based on wave propagation

Ash3d : A finite-volume, conservative numerical model for ash transport and tephra deposition,  
Schwaiger, Denlinger, Mastin, JGR (2012)

# Ash3d Model

$$\mathbf{q}_t + \nabla \cdot ((\mathbf{u} + v_s)\mathbf{q}) = Q(\mathbf{x}, t)$$

$$\mathbf{f}(\mathbf{x}, \mathbf{q}) \equiv (\mathbf{u}(\mathbf{x}, t) + v_s)\mathbf{q}$$

Spatially varying flux function

Particle vertical (fall) velocity

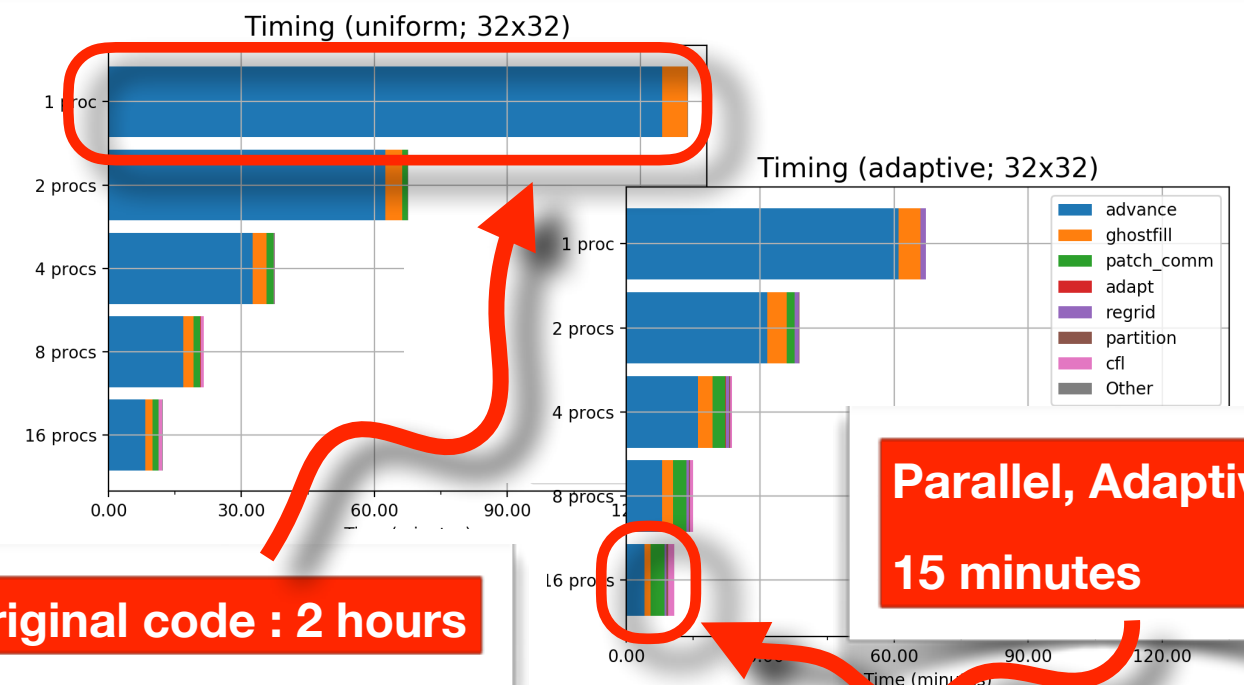
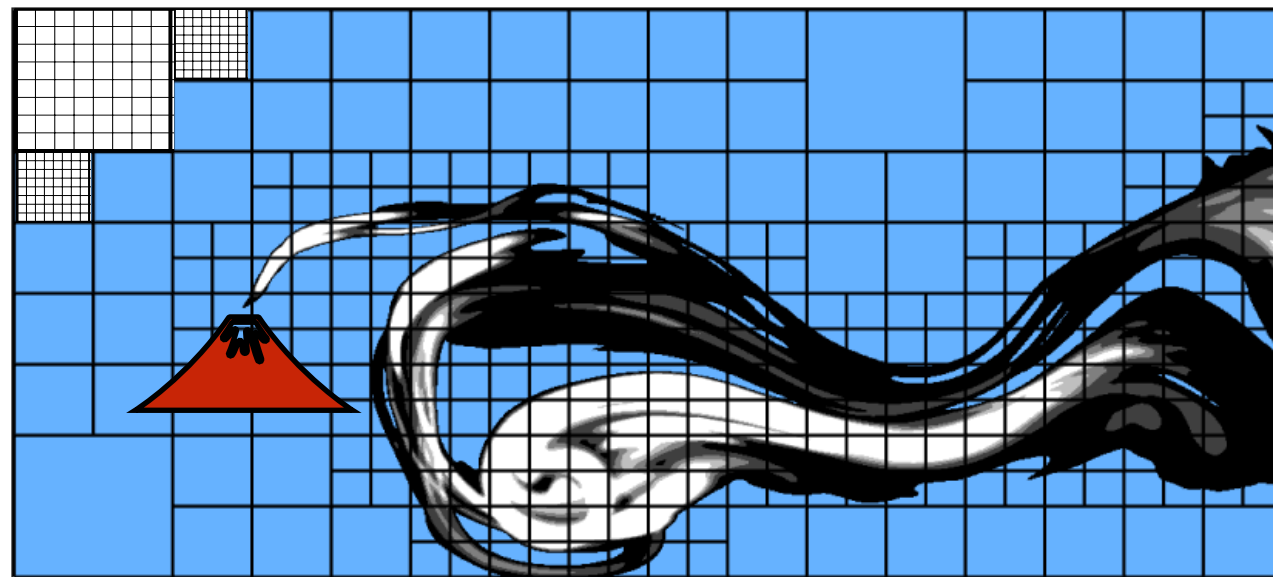
Horizontal velocity from wind data

## Ash3d Model

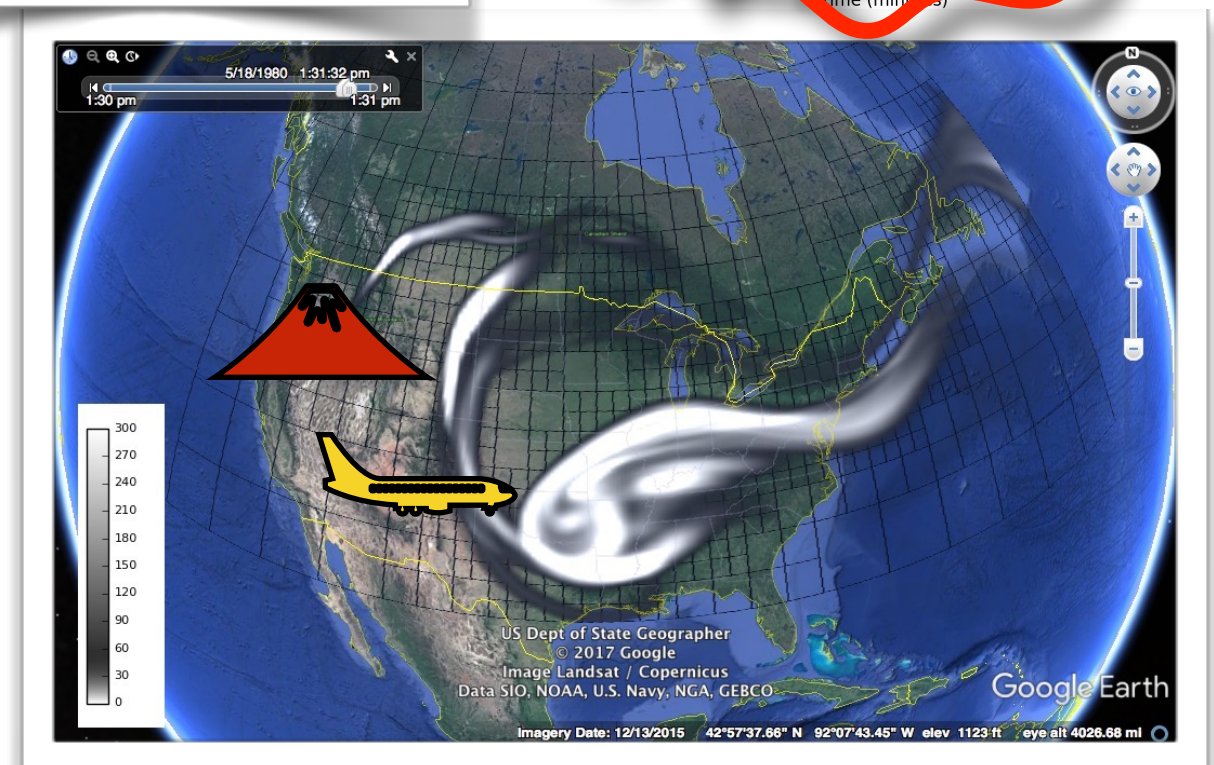
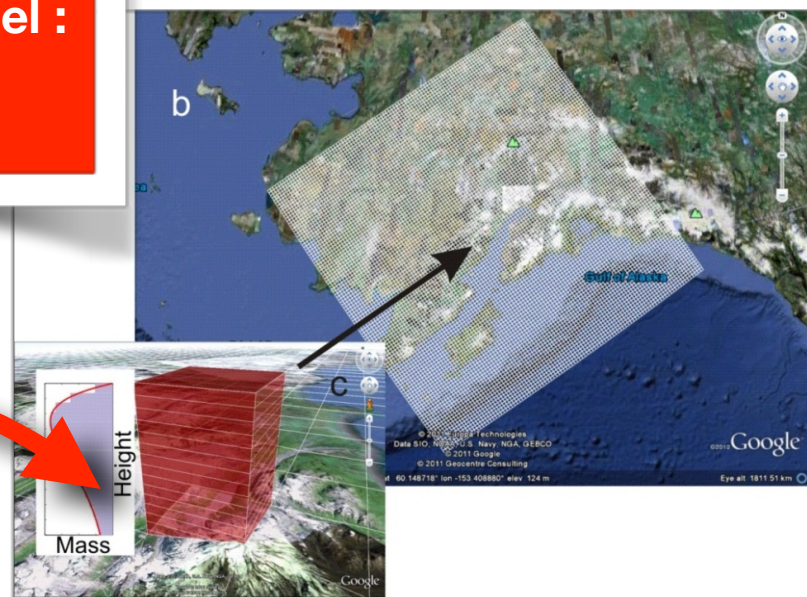
- **Wind fields** interpolated in space and time from re-analysis data available from various weather services.
- **Source term** modeled with a Suzuki distribution (Suzuki, 1983).
- **Multiple grain sizes** tracked
- **Fall velocity** and **deposition** modeled
- Extensive library for reading **meteorological data** in many re-analysis formats



# Volcanic ash transport

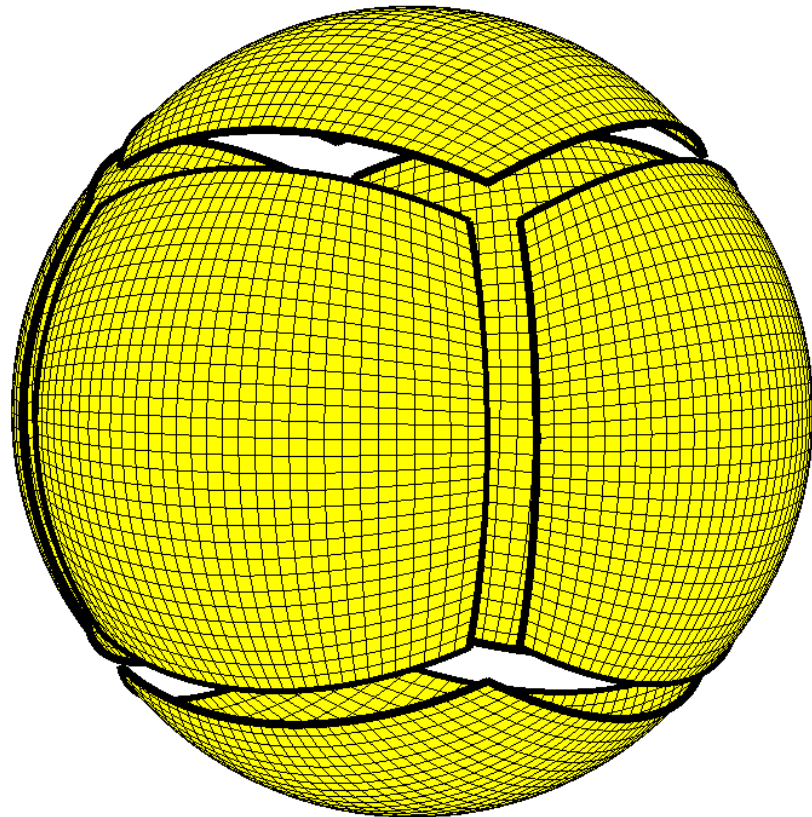


Source term model :  
Ash initialized in  
single column

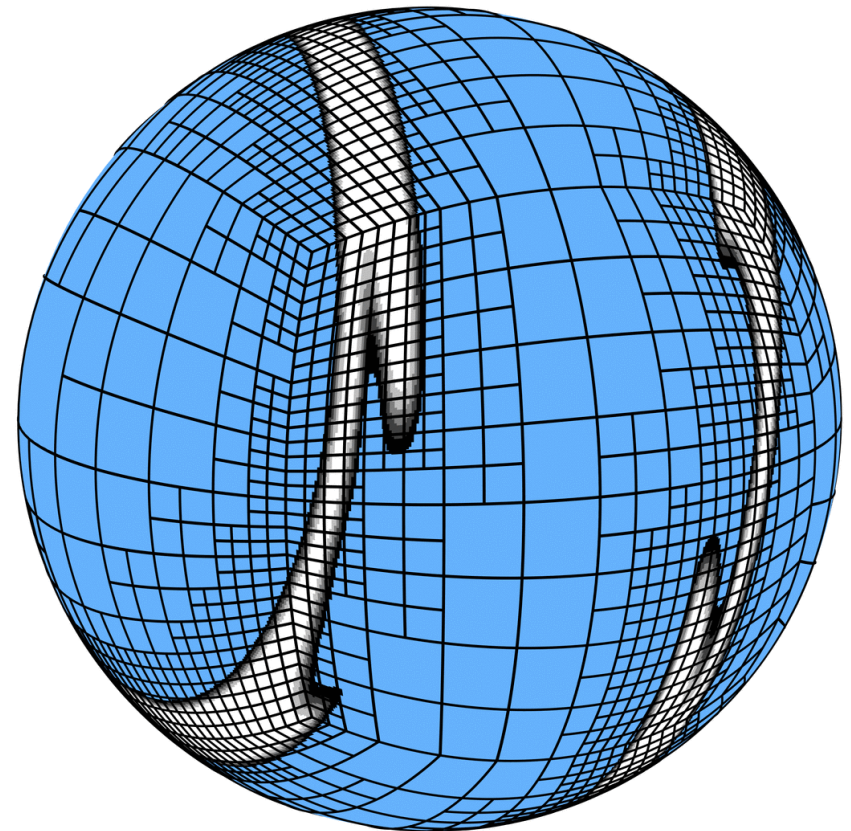


Volcanic ash transport using Ash3d (H. Schwaiger, USGS) extension of ForestClaw

# Volcanic ash transport at global scale



*Cubed sphere grid*



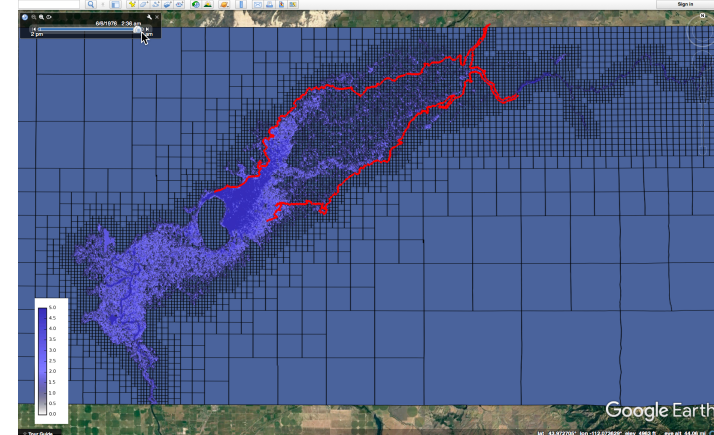
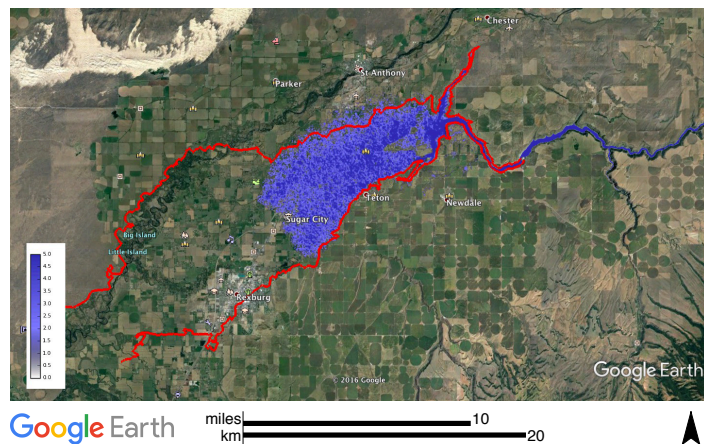
*Tracer transport on the cubed sphere*

Future plans : Implement Ash3d on full cubed-sphere



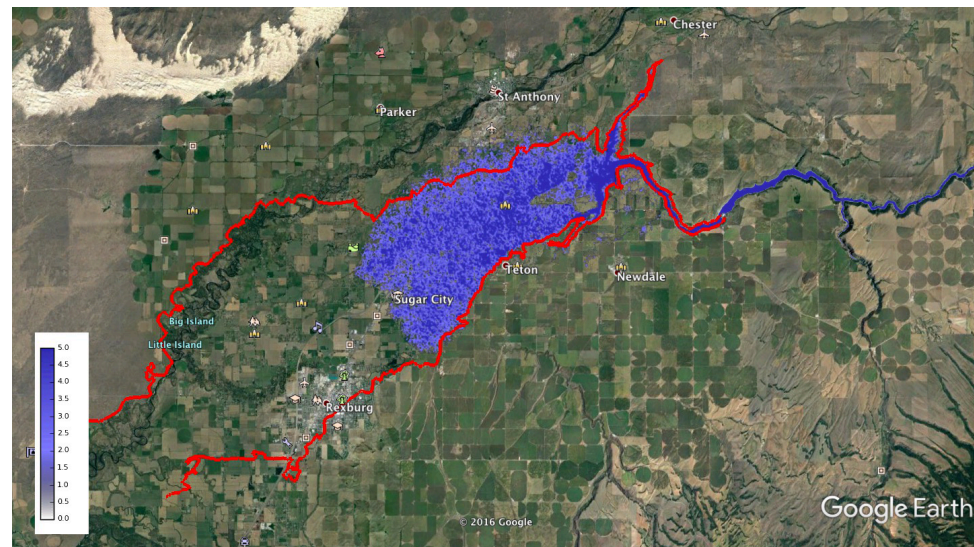
# Other ForestClaw extensions

- **Clawpack** (R. J. LeVeque, Univ. Washington) extensions for gas dynamics, acoustics, wave equation, ... *This extension provides Clawpack with distributed, parallel (MPI) capabilities*
- **GeoClaw** for shallow water wave equations (D. George, M. Berger, R. J. LeVeque, K. Mandli, ...). *This provides MPI capabilities to GeoClaw*
- **CUDA implementation** - 5x-10x speed-up in preliminary tests (S. Aiton, M. Shih, X. Qin)



*Teton Dam failure (1976, Eastern Idaho) using GeoClaw (D. George, R. J. LeVeque, K. Mandli, M. Berger) extension of ForestClaw*

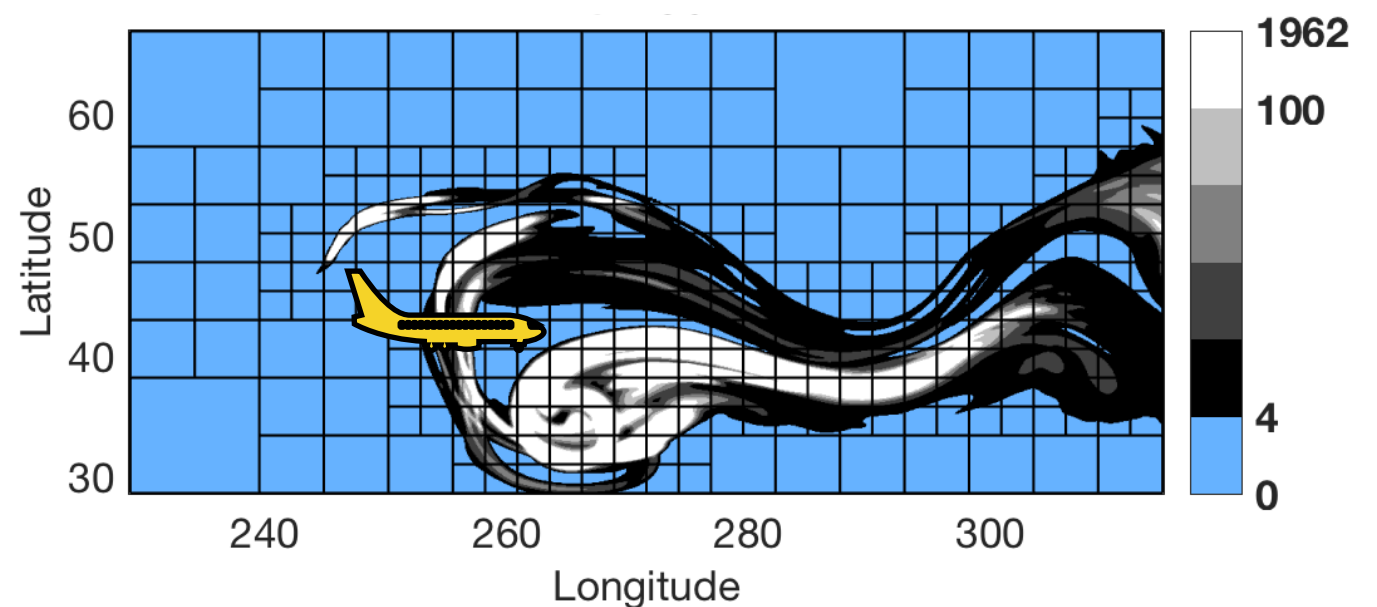
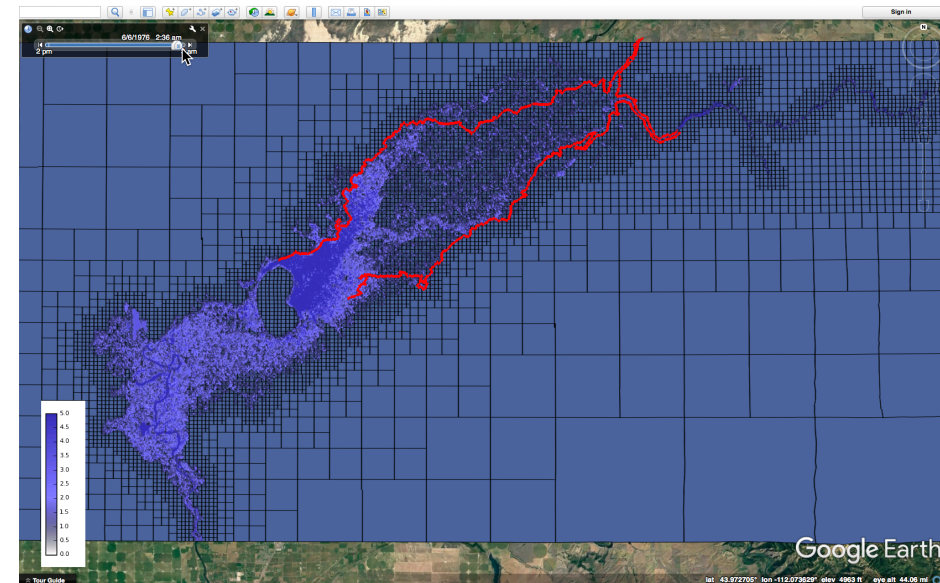
# Natural Hazards Modeling



Google Earth miles 10 km 20



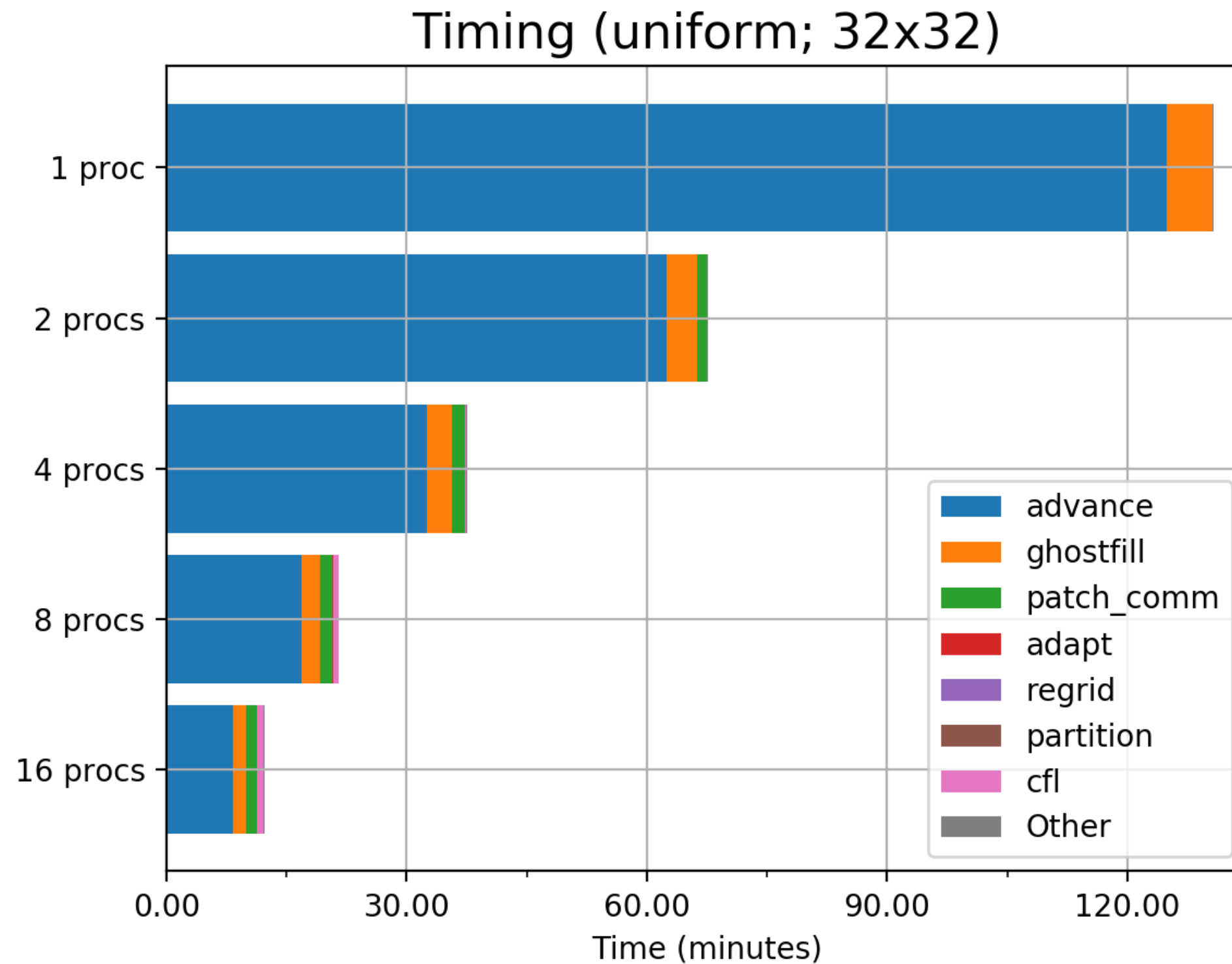
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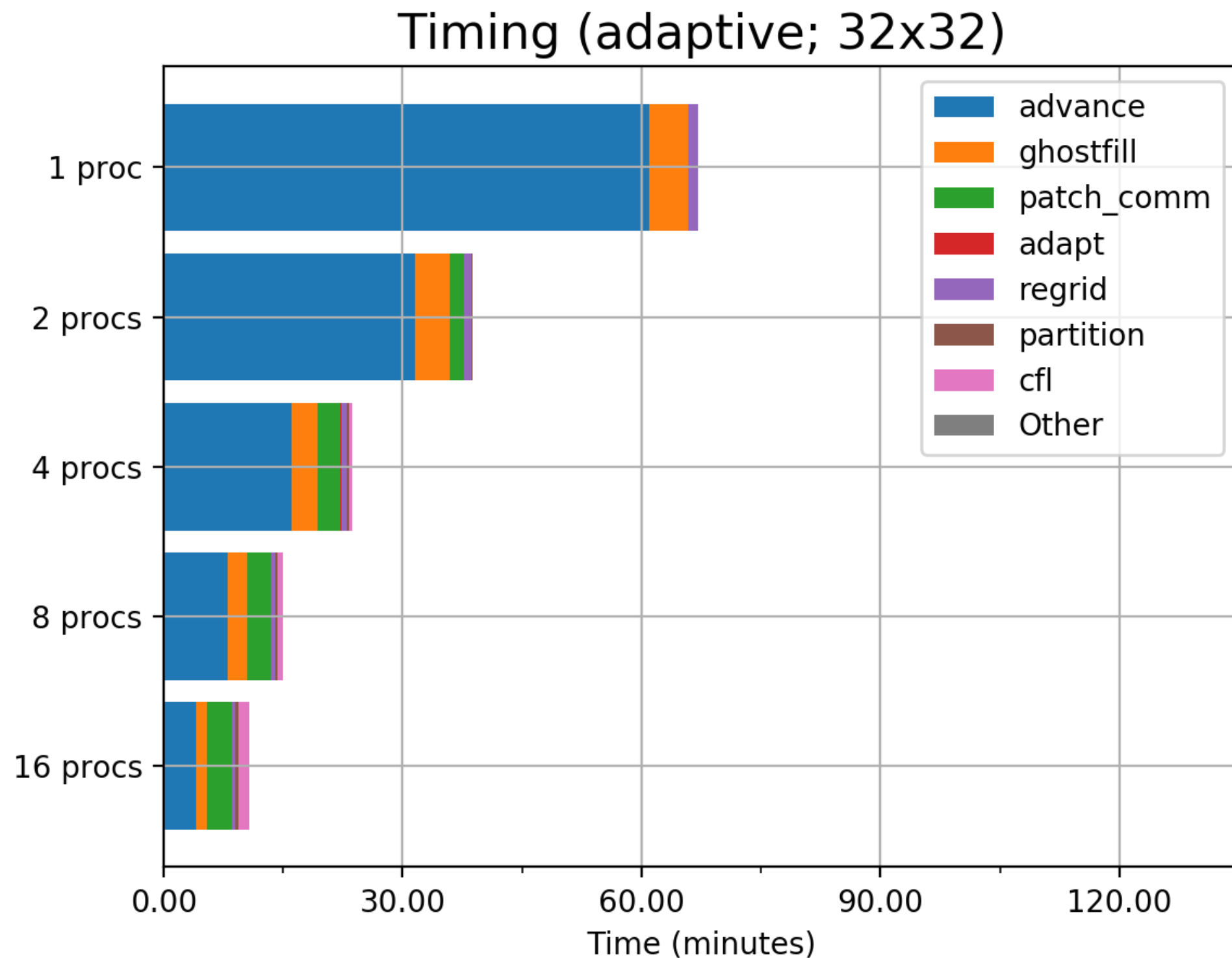
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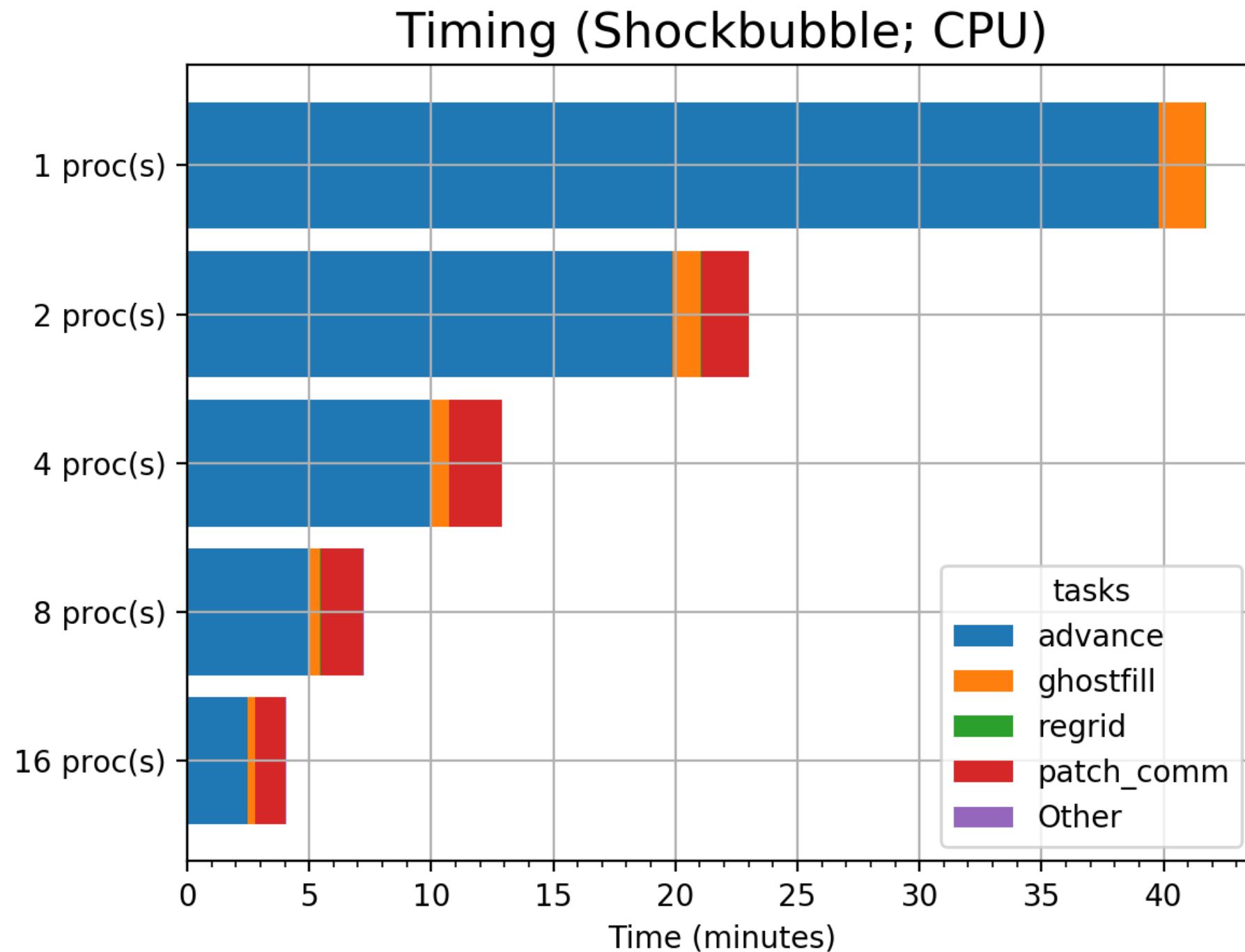
# Ash3d efficiency



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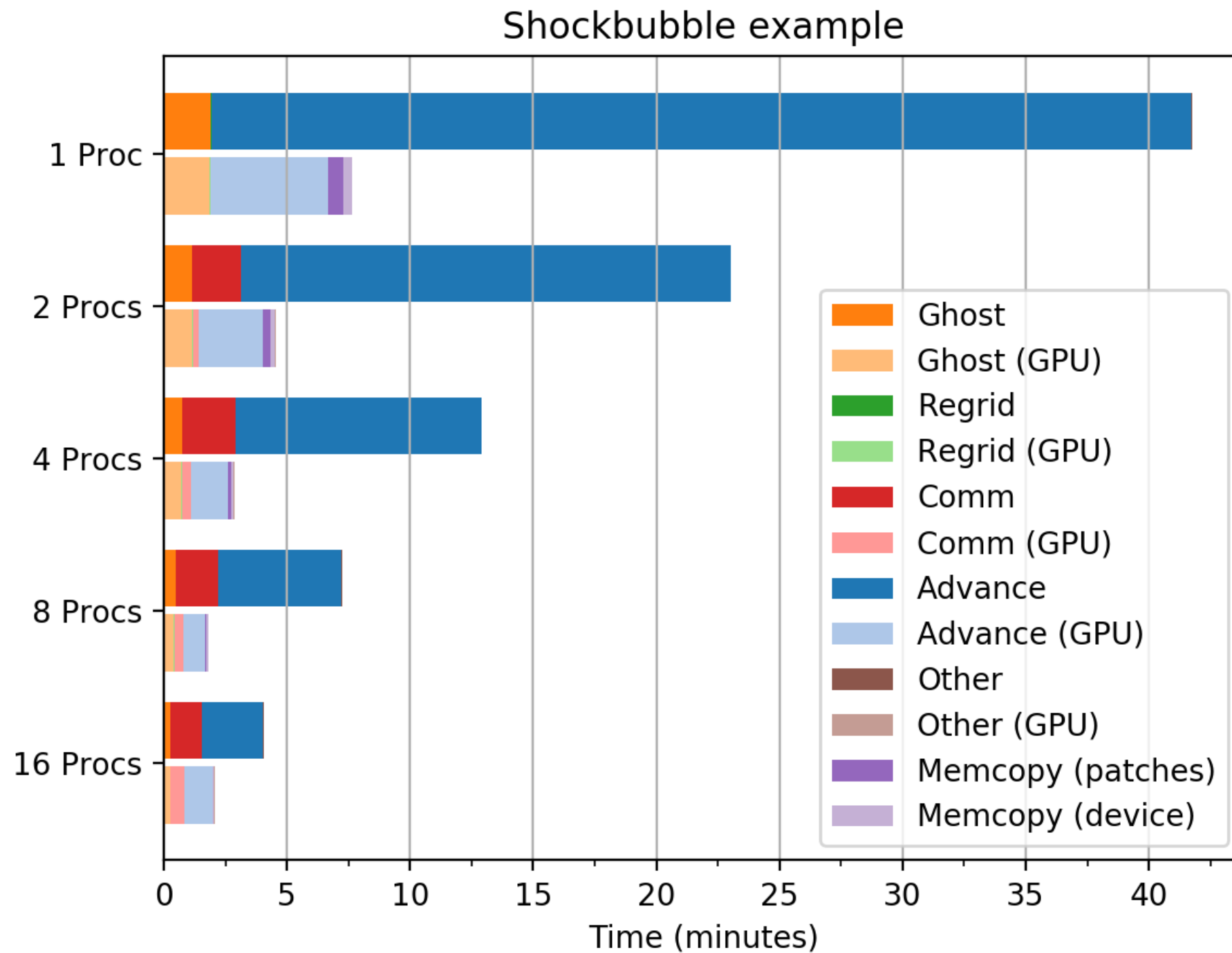


# ForestClaw + GPUs

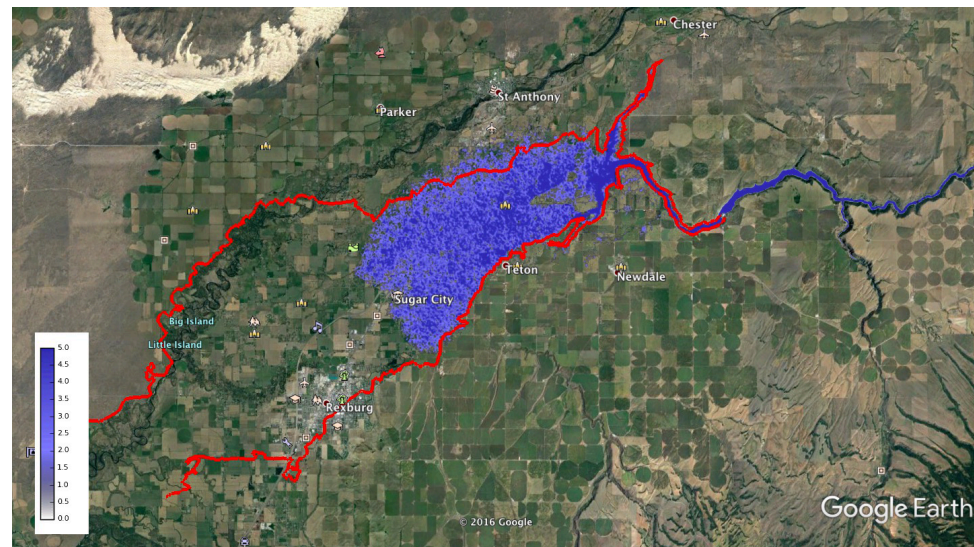




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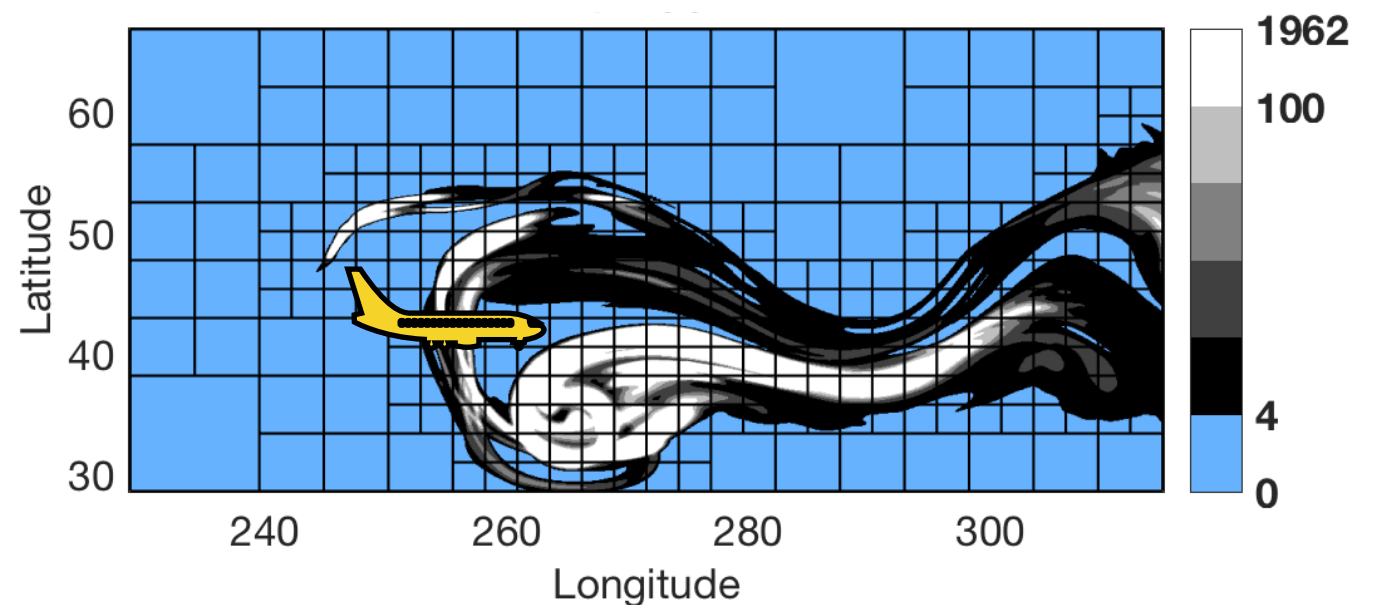
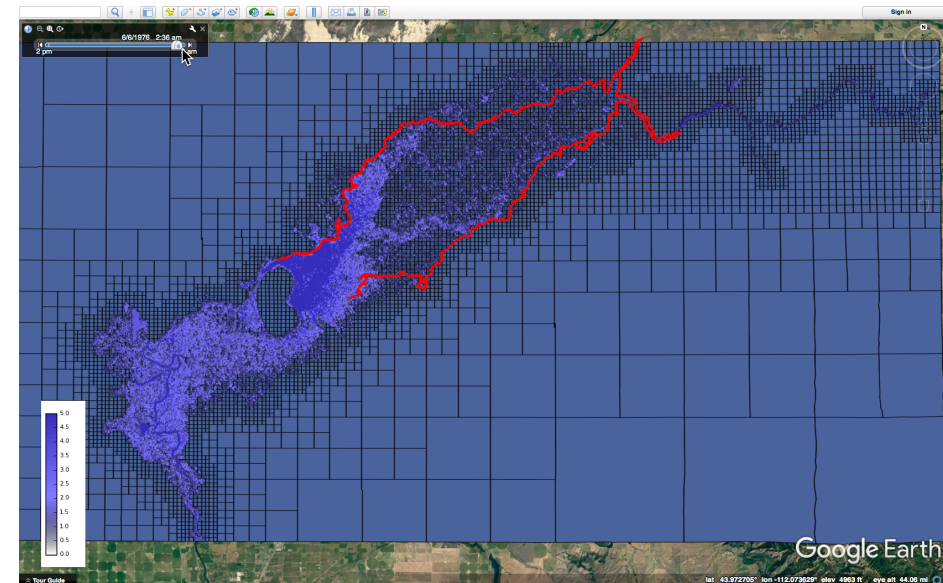
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