# High-Resolution Finite Volume Methods with Application to Volcano and Tsunami Modeling



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## Outline

- Volcanic flows, ash plumes, pyroclastic flow
- Tsunami modeling, shallow water equations
- Finite volume methods for hyperbolic equations
- Conservation laws and source terms
- Riemann problems and Godunov's method
- Wave propagation form
- Wave limiters and high-resolution methods
- Software: CLAWPACK

#### Some collaborators

#### Algorithms, software

Marsha Berger, NYU Donna Calhoun, UW Phil Colella, UC-Berkeley Jan Olav Langseth, Oslo Sorin Mitran, UNC James Rossmanith, Michigan Derek Bale, eV Products

Tsunamis David George, UW Harry Yeh, OSU

Volcanos Marica Pelanti, UW Roger Denlinger, USGS CVO Dick Iverson, USGS CVO Alberto Neri, Pisa T. E. Ongaro, Pisa

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#### Marica Pelanti, Donna Calhoun, Joe Dufek, and David George at Mount St. Helens



## Volcanic fbws

- Flow of magma in conduit
- Little dissolved gas  $\implies$  lava flows
- Dissolved gas expansion  $\implies$  phase transition, ash jet
- Ash plumes, Plinian columns
- Collapsing columns, pyroclastic flows or surges
- Lahars (mud flows)
- Debris flows

#### Volcanic Ash Plumes



## **Pyroclastic Flows**



I. Pyroclastic dispersion dynamics of pressure-balanced eruptions

Influence of the diameter  $D_v$  and the exit velocity  $v_v$ 



Regions of different types of eruption columns (Neri–Dobran, 1994).



Characteristic features of a collapsing column.

#### Pyroclastic dispersion dynamics

Vent conditions and physical properties [Neri–Dobran, 1994]:

$p_v$	$T_v$	$lpha_{dv}$	d	$ ho_d$
[MPa]	[K]		$[\mu { m m}]$	$[\mathrm{kg/m^3}]$
0.1	1200	0.01	10	2300

Gas and dust in thermal and mechanical equilibrium at the vent.

Test 1.  $D_v = 100 \text{ m}, v_v = 80 \text{ m/s}$ .  $\rightarrow$  Collapsing volcanic column

Test 2.  $D_v = 100 \,\mathrm{m}, v_v = 200 \,\mathrm{m/s}. \rightarrow \mathrm{Transitional/Plinian \ column}$ 

#### Numerical Experiments

Injection of a hot supersonic particle-laden gas from a volcanic vent into a cooler atmosphere.

- ★ Initially: Standard atmosphere vertically stratified in pressure and temperature all over the domain;
- ★ At the vent: Gas pressure, velocities, temperatures, volumetric fractions of gas and dust assumed to be fixed and constant;
- ★ Ground boundary: modeled as a free-slip reflector;
- ★ Other boundaries:

2D experiments: Axisymmetric configuration. Symmetry axis: free-slip reflector; Upper and right-hand edges of the domain: free flow boundaries (all the variables gradients set to zero).

Fully 3D experiments: Upper and lateral sides: free-flow boundaries.

#### $D_v = 100 \,\mathrm{m}, v_v = 80 \,\mathrm{m/s}$ . Collapsing column.



Dust density at t = 10, 30, 35, 70 s. Uniform grid,  $200 \times 100$  cells. Cell size = 10 m. CFL = 0.9.

## Physical Model

Two-phase fluid flow composed of solid particles (dust) in a gas.

Gas phase: compressible;

Dust phase: incompressible (constant microscopic mass density  $\rho_d$ ).

Dust particles are assumed to be dispersed (vol. fraction  $\alpha_d \ll 1$ ), with negligible particle-particle interaction. The solid phase is thus considered pressureless.

Model accounts for:

- Gravity;
- Interphase drag force;
- Interphase heat transfer.

Some of the neglected phenomena: viscous stress, turbulence.

#### **Model Equations**

Conservation of mass, momentum, and energy for gas and dust

 $\rho_t + \boldsymbol{\nabla} \cdot (\rho \mathbf{u}_g) = 0\,,$ 

$$(\rho \mathbf{u}_g)_t + \boldsymbol{\nabla} \cdot (\rho \mathbf{u}_g \otimes \mathbf{u}_g + p \mathbf{I}) = \rho \mathbf{g} - D(\mathbf{u}_g - \mathbf{u}_d),$$
  
$$E_t + \boldsymbol{\nabla} \cdot ((E+p)\mathbf{u}_g) = \rho \mathbf{u}_g \cdot \mathbf{g} - D(\mathbf{u}_g - \mathbf{u}_d) \cdot \mathbf{u}_d - Q(T_g - T_d),$$

$$\beta_t + \boldsymbol{\nabla} \cdot (\beta \mathbf{u}_d) = 0,$$
  

$$(\beta \mathbf{u}_d)_t + \boldsymbol{\nabla} \cdot (\beta \mathbf{u}_d \otimes \mathbf{u}_d) = \beta \mathbf{g} + D(\mathbf{u}_g - \mathbf{u}_d),$$
  

$$\Omega_t + \boldsymbol{\nabla} \cdot (\Omega \mathbf{u}_d) = \beta \mathbf{u}_d \cdot \mathbf{g} + D(\mathbf{u}_g - \mathbf{u}_d) \cdot \mathbf{u}_d + Q(T_g - T_d).$$

 $\alpha_g, \alpha_d$  = volume fractions ( $\alpha_g + \alpha_d = 1, \alpha_d \ll 1$ );  $\rho_g, \rho_d$  = material mass densities ( $\rho_d$  = const.);  $\rho = \alpha_g \rho_g, \beta = \alpha_d \rho_d$  = macroscopic densities;  $\mathbf{u}_g, \mathbf{u}_d$  = velocities;  $p_g$  = gas pressure,  $p = \alpha_g p_g$ ;  $e_g, e_d$  = specifi c total energies,  $E = \alpha_g \rho_g e_g, \Omega = \alpha_d \rho_d e_d$ ;  $e_g = \epsilon_g + \frac{1}{2} ||\mathbf{u}_g||^2, e_d = \epsilon_d + \frac{1}{2} ||\mathbf{u}_d||^2; \epsilon_g, \epsilon_d$  = specifi c internal energies;  $T_g, T_d$  = temperatures;  $\mathbf{g} = (0, 0, -g)$  = gravity acceleration (z direction),  $g = 9.8 \,\mathrm{m/s^2}$ ; D = drag function; Q = heat transfer function.

#### **Closure Relations**

Gas equation of state:

$$p_g = (\gamma - 1)\rho_g \epsilon_g$$
,  $\gamma = c_{pg}/c_{vg} = \text{const.};$ 

Dust energy relation:

$$\epsilon_d = c_{vd}T_d$$
,  $c_{vd} = \text{const.};$ 

Drag

$$D = \frac{3}{4} C_{\mathrm{d}} \frac{\beta \rho}{\rho_d d} || \mathbf{u}_g - \mathbf{u}_d ||,$$

 $d = dust particle diameter, C_d = drag coefficient,$ 

$$C_{\rm d} = \begin{cases} \frac{24}{Re} \left( 1 + 0.15 Re^{0.687} \right) & \text{if } Re < 1000 \,, \\ 0.44 & \text{if } Re \ge 1000 \,, \end{cases}$$

 $Re = \text{Reynolds number} = \frac{\rho d ||\mathbf{u}_g - \mathbf{u}_d||}{\mu}$ ,  $\mu = \text{dynamic viscosity of the gas.}$ 

Heat transfer

$$Q = \frac{N u \, 6 \kappa_g \beta}{\rho_d d^2} \,,$$

Nu = Nusselt number = 2 + 0.65 $Re^{1/2}Pr^{1/3}$ , Pr = Prandtl number =  $\frac{c_{pg}\mu}{\kappa_g}$ ,  $\kappa_g$  = gas thermal conductivity.

## Shock structure in a supersonic jet



Illustration of an overpressured jet (JANNAF, 1975).

#### Overpressured jet: Mach number and normal Mach number at t = 30 s.



Normal Mach number of the mixture (to highlight normal discontinuities)

$$\begin{split} M_{\rm m} &= \frac{\mathbf{u}_{\rm m} \cdot \mathbf{v} p_g}{c_{\rm m} || \mathbf{\nabla} p_g ||} \,, \\ c_{\rm m}^2 &= \frac{\rho_g c_g^2}{\alpha_g \rho_{\rm m}} \,, \quad c_g = \sqrt{RT_g} \,, \end{split}$$

$$\mathbf{u}_{\mathsf{m}} = rac{lpha_g 
ho_g \mathbf{u}_g + lpha_d 
ho_d \mathbf{u}_d}{
ho_{\mathsf{m}}} \, ,$$

$$\rho_{\rm m} = \alpha_g \rho_g + \alpha_d \rho_d \,.$$

#### Comparison: CLAWPACK vs. PDAC2D (Neri–Ongaro, INGV, Pisa, Italy).



Crater 30°

Dust density at at t = 10 and 20 s.

#### Mount St. Helens



#### Blast zone at Mount St. Helens



### Trees blown down by MSH blast



http://volcanoes.usgs.gov/Hazards/Effects/MSHsurge\_effects.

## Mount St. Helens



# High-pressure initial blast



## AMR computation



#### Volcanic Debris Flow



#### Volcanic Debris Flow



#### Test flume studies

## Cascade Volcano Observatory (CVO), Vancouver, Washington http://vulcan.wr.usgs.gov/



## Sand flume with topography

Recent results of Dick Iverson and Roger Denlinger, CVO

Experiments on small-scale sand flume with topography.

Compared to predictions from shallow-flow Savage-Hutter type model for granular avalanches.

Coulomb friction for shear and normal stresses on internal and bounding surfaces.

Finite-volume wave propagation method using finite element computation of stresses in Riemann solver.

Flow over steep topography.

## Sand flume with topography



## Sand on a flume with topography



## Tsunamis

#### Generated by

- Earthquakes,
- Landslides,
- Submarine landslides,
- Volcanos,
- Meteorite or asteroid impact

## Tsunamis

#### Generated by

- Earthquakes,
- Landslides,
- Submarine landslides,
- Volcanos,
- Meteorite or asteroid impact
- Small amplitude in ocean (< 1 meter) but can grow to 10s of meters at shore.
- Run-up along shore can inundate 100s of meters inland
- Long wavelength (as much as 200 km)
- Propagation speed  $\sqrt{gh}$
- Average depth of Pacific is  $4\text{km} \implies \text{average speed } 200 \text{ m/s}$

## 1993 Okushiri tsunami

#### **Disaster Recovery Operations Guidance**

Pre- and Post-Event Imagery of 12 June 1993 Okushiri Tsunami



http://www.pmel.noaa.gov/tsunami/aerial\_photo\_okushiri.html

### Catalina Workshop — June, 2004

3rd Int'l workshop on long-wave runup models

Benchmark Problem 2:



## Shallow water equations with topography B(x, y)

$$h_t + (hu)_x + (hv)_y = 0$$
  
$$(hu)_t + \left(hu^2 + \frac{1}{2}gh^2\right)_x + (huv)_y = -ghB_x(x,y)$$
  
$$(hv)_t + (huv)_x + \left(hv^2 + \frac{1}{2}gh^2\right)_y = -ghB_y(x,y)$$

Applications:

- Tsunamis
- Estuaries
- River flooding, dam breaks
- Debris flows from volocanic eruptions

















#### Channel 5



## Hyperbolic Partial Differential Equations

Model advective transport or wave propagation

Advection equation:

 $q_t + uq_x = 0, \qquad q_t + uq_x + vq_y = 0$ 

First-order system:

$$q_t + Aq_x = 0, \qquad q_t + Aq_x + Bq_y = 0$$

where  $q \in \mathbb{R}^m$  and  $A, B \in \mathbb{R}^{m \times m}$ .

#### Hyperbolic if

1D: A is diagonalizable with real eigenvalues, 2D:  $\cos(\theta)A + \sin(\theta)B$  is diagonalizable with real eigenvalues, for all angles  $\theta$ .

Eigenvalues give wave speeds, eigenvectors the wave forms.

### Nonlinear conservation laws

 $q_t + f(q)_x = 0$ , where f(q) is the flux function. Quasi-linear form:  $q_t + f'(q)q_x = 0$ .

Hyperbolic if f'(q) is diagonalizable with real eigenvalues.

Eigenvalues depend on solution

- $\implies$  characteristics may converge.
- $\implies$  Shock formation and discontinuous solutions.

#### **Finite-difference Methods**

- Pointwise values  $Q_i^n \approx q(x_i, t_n)$
- Approximate derivatives by finite differences
- Assumes smoothness

#### Finite-volume Methods

- Approximate cell averages:  $Q_i^n \approx \frac{1}{\Delta x} \int_{x_{i-1/2}}^{x_{i+1/2}} q(x, t_n) dx$
- Integral form of conservation law,

$$\frac{\partial}{\partial t} \int_{x_{i-1/2}}^{x_{i+1/2}} q(x,t) \, dx = f(q(x_{i-1/2},t)) - f(q(x_{i+1/2},t))$$

leads to conservation law  $q_t + f_x = 0$  but also directly to numerical method.

#### Finite volume method

$$Q_i^n \approx \frac{1}{\Delta x} \int_{x_{i-1/2}}^{x_{i+1/2}} q(x, t_n) \, dx$$
  
Integral form:  
$$\frac{\partial}{\partial t} \int_{x_{i-1/2}}^{x_{i+1/2}} q(x, t) \, dx = f(q(x_{i-1/2}, t)) - f(q(x_{i+1/2}, t))$$



Numerical method:  $Q_i^{n+1} = Q_i^n - \frac{\Delta t}{\Delta x} (F_{i+1/2}^n - F_{i-1/2}^n)$ 

Numerical flux:  $F_{i-1/2}^n \approx \frac{1}{\Delta t} \int_{t_n}^{t_{n+1}} f(q(x_{i-1/2}, t)) dt.$ 

The Riemann problem for  $q_t + f(q)_x = 0$  has special initial data

$$q(x,0) = \begin{cases} q_l & \text{if } x < x_{i-1/2} \\ q_r & \text{if } x > x_{i-1/2} \end{cases}$$



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#### Riemann solution for the SW equations



#### Godunov's method

 $Q_i^n$  defines a piecewise constant function

$$\tilde{q}^n(x, t_n) = Q_i^n \text{ for } x_{i-1/2} < x < x_{i+1/2}$$

Discontinuities at cell interfaces  $\implies$  Riemann problems.



$$\tilde{q}^n(x_{i-1/2}, t) \equiv q^{\psi}(Q_{i-1}, Q_i) \quad \text{for } t > t_n.$$

 $F_{i-1/2}^n = \frac{1}{\Delta t} \int_{t_n}^{t_{n+1}} f(q^{\psi}(Q_{i-1}^n, Q_i^n)) \, dt = f(q^{\psi}(Q_{i-1}^n, Q_i^n)).$ 

## Riemann solution for the SW equations



The Roe solver uses the solution to a linear system

$$q_t + \hat{A}_{i-1/2}q_x = 0, \qquad \hat{A}_{i-1/2} = f'(q_{\text{ave}}).$$

All waves are simply discontinuities.

Typically a fine approximation if jumps are approximately correct.

#### Wave decomposition for shallow water

$$q = \begin{bmatrix} h \\ hu \end{bmatrix}, \qquad f(q) = \begin{bmatrix} hu \\ hu^2 + \frac{1}{2}gh^2 \end{bmatrix}$$
  
Jacobian:  $f'(q) = \begin{bmatrix} 0 & 1 \\ gh - u^2 & 2u \end{bmatrix}$ 

Eigenvalues:  $\lambda^1 = u - \sqrt{gh}$ ,  $\lambda^2 = u + \sqrt{gh}$ ,

Eigenvectors: 
$$r^1 = \begin{bmatrix} 1 \\ u - \sqrt{gh} \end{bmatrix}$$
,  $r^2 = \begin{bmatrix} 1 \\ u + \sqrt{gh} \end{bmatrix}$ 

Wave decomposition:

$$Q_i - Q_{i-1} = \sum_{p=1}^m \alpha_{i-1/2}^p r^p \equiv \sum_{p=1}^m \mathcal{W}_{i-1/2}^p.$$

## Challenges for tsunami modeling

Want robust method with high resolution corrections that "captures" moving shoreline location

Need robust dry state Riemann solver

Modified HLLE solver that avoids negative h

Bottom bathymetry / topography

Source term incorporated into Riemann solver

f-wave formulation for  $q_t + f(q)_x = \psi(q)$ :

Split  $f(Q_i) - f(Q_{i-1}) - \Delta x \Psi_{i-1/2} = \sum_p \beta_{i-1/2}^p r_{i-1/2}^p$ 

#### Wave-propagation viewpoint

For linear system  $q_t + Aq_x = 0$ , the Riemann solution consists of waves  $\mathcal{W}^p$  propagating at constant speed  $s^p$ .



$$Q_i - Q_{i-1} = \sum_{p=1}^m \alpha_{i-1/2}^p r^p \equiv \sum_{p=1}^m \mathcal{W}_{i-1/2}^p.$$

 $Q_i^{n+1} = Q_i^n - \frac{\Delta t}{\Delta x} \left[ s^2 \mathcal{W}_{i-1/2}^2 + s^3 \mathcal{W}_{i-1/2}^3 + s^1 \mathcal{W}_{i+1/2}^1 \right].$ 

## Upwind wave-propagation algorithm

$$Q_i^{n+1} = Q_i^n - \frac{\Delta t}{\Delta x} \left[ \sum_{p=1}^m (s_{i-1/2}^p)^+ \mathcal{W}_{i-1/2}^p + \sum_{p=1}^m (s_{i+1/2}^p)^- \mathcal{W}_{i+1/2}^p \right]$$

where

$$s^+ = \max(s, 0), \qquad s^- = \min(s, 0).$$

Note: Requires only waves and speeds.

Applicable also to hyperbolic problems not in conservation form.

Conservative if waves chosen properly, e.g. using Roe-average of Jacobians.

Great for general software, but only first-order accurate (upwind).

#### Wave-propagation form of high-resolution method

$$Q_{i}^{n+1} = Q_{i}^{n} - \frac{\Delta t}{\Delta x} \left[ \sum_{p=1}^{m} (s_{i-1/2}^{p})^{+} \mathcal{W}_{i-1/2}^{p} + \sum_{p=1}^{m} (s_{i+1/2}^{p})^{-} \mathcal{W}_{i+1/2}^{p} \right] - \frac{\Delta t}{\Delta x} (\tilde{F}_{i+1/2} - \tilde{F}_{i-1/2})$$

Correction flux:

$$\tilde{F}_{i-1/2} = \frac{1}{2} \sum_{p=1}^{M_w} |s_{i-1/2}^p| \left( 1 - \frac{\Delta t}{\Delta x} |s_{i-1/2}^p| \right) \tilde{\mathcal{W}}_{i-1/2}^p$$

where  $\tilde{\mathcal{W}}_{i-1/2}^p$  is a limited version of  $\mathcal{W}_{i-1/2}^p$ .

## CLAWPACK

http://www.amath.washington.edu/~claw/

- Fortran codes with Matlab graphics routines.
- Many examples and applications to run or modify.
- 1d, 2d, and 3d.
- Adaptive mesh refinement.

User supplies:

- Riemann solver, splitting data into waves and speeds (Need not be in conservation form)
- Boundary condition routine to extend data to ghost cells Standard bc1.f routine includes many standard BC's
- Initial conditions qinit.f

## Adaptive Mesh Refi nement (AMR)

- Berger / Oliger / Colella
- Flag cells needing refi nement
- Cluster into rectangular patches
- Refi ne in time also on patches
- Software:

AMRCLAW (Berger, RJL) CHOMBO (Colella, et.al.) CHOMBO-CLAW (Calhoun) BEARCLAW (Mitran) AMROC (Deiterding)



#### Some other applications

- Acoustics, ultrasound, seismology
- Elasticity, plasticity, soil liquifaction
- Flow in porous media, groundwater contamination
- Oil reservoir simulation
- Geophysical fbw on the sphere
- Chemotaxis and pattern formation
- Multi-fluid, multi-phase fbws, bubbly fbw
- Streamfunction–vorticity form of incompressible fbw
- Projection methods for incompressible fbw
- Combustion, detonation waves
- Astrophysics: binary stars, planetary nebulae, jets
- Magnetohydrodynamics, plasmas
- Relativistic fbw, black hole accretion
- Numerical relativity gravitational waves, cosmology

## Summary and extensions

- Applications to geophysical flows
- Scientific enquiry and hazard mitigation
- General formulation of high-resolution finite volume methods
- Applies to general conservation laws and nonconservative hyperbolic problems
- F-wave formulation for spatially varying fluxes and source terms
- Multi-dimensional extensions
- Adaptive mesh refinement
- CLAWPACK Software:

http://www.amath.washington.edu/~claw