



Universität
Zürich^{UZH}

Numerical simulations of shock waves in multiphase mixtures

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Institute of Computational Science Seminar
16 December 2016

1. With thanks to James Glimm from Stony Brook University

Outline

- 1 Background and Overview
- 2 Mathematical model
- 3 Front Tracking Methods
- 4 Key parameters for multiphase flow problems
 - Uncertainty in Initial Conditions
 - Verification for Stochastic Convergence
- 5 Conclusion

Problem statement

Consider a flow liquid/bubbles (vapor, air, etc).

An aircraft flying at transonic speeds



Problem statement

Consider a flow liquid/bubbles (vapor, air, etc).



Multiphase flows occur in nature and industrial applications

- in high power ultrasonics
- to homogenize, or mix and break down particles
- to cavitate water purification devices
- for destruction of kidney stones via shock waves

Problem Statement

- Shock propagation in multiphase mixtures.
- Many applications : condensed phase mixtures, shock propagation in solid alloys, solid and liquid propellants as well as condensed solid explosives.
- Our problem is related to detonation problem with high explosives.
- Experimental works
 - in USA ; *Marsh : LASL Shock Hugoniot Data.*
 - in Russia ; *Bushman : Shock wave data base.*
 - This research area is closely related to the building of equations of state for condensed materials.
- Modeling efforts have been done in order to treat shock propagation in such mixtures.

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First model

$$\begin{aligned}\frac{\partial \alpha_{1,2}}{\partial t} + u_I \frac{\partial \alpha_{1,2}}{\partial x} &= 0 & + S_{1,2}^1 \\ \frac{\partial [\alpha_{1,2} \rho_{1,2}]}{\partial t} + \frac{\partial [\alpha_{1,2} \rho u_{1,2}]}{\partial x} &= 0 & + S_{1,2}^2 \\ \frac{\partial [\alpha_{1,2} \rho_{1,2} u_{1,2}]}{\partial t} + \frac{\partial [\alpha_{1,2} (\rho_{1,2} u_{1,2}^2 + p_{1,2})]}{\partial x} &= p_I \frac{\partial \alpha_{1,2}}{\partial x} & + S_{1,2}^3 \\ \frac{\partial [\alpha_{1,2} E_{1,2}]}{\partial t} + \frac{\partial [\alpha_{1,2} u_{1,2} (E_{1,2} + p_{1,2})]}{\partial x} &= u_I p_I \frac{\partial \alpha_{1,2}}{\partial x} & + S_{1,2}^4\end{aligned}$$

Problems

- How to choose u_I, p_I ? modelisation problem
- non conservative products $u_I \frac{\partial \alpha}{\partial x}$: how to handle them?

$$\begin{aligned}\frac{\partial \alpha_1}{\partial t} + u_I \frac{\partial \alpha_1}{\partial x} &= \mu \Delta p \\ \frac{\partial (\alpha \rho)_1}{\partial t} + \frac{\partial}{\partial x} ((\alpha \rho u)_1) &= 0 \\ \frac{\partial (\alpha \rho u)_1}{\partial t} + \frac{\partial}{\partial x} ((\alpha \rho u^2 + \alpha p)_1) &= \rho_I \frac{\partial \alpha_1}{\partial x} + \lambda \Delta u \\ \frac{\partial (\alpha \rho E)_1}{\partial t} + \frac{\partial}{\partial x} ((\alpha u (\rho E + p))_1) &= \rho_I u_I \frac{\partial \alpha_1}{\partial x} + \lambda \rho_I \Delta u + \mu u_I \Delta p\end{aligned}$$

$$\begin{aligned}\frac{\partial (\alpha \rho)_2}{\partial t} + \frac{\partial}{\partial x} ((\alpha \rho u)_2) &= 0 \\ \frac{\partial (\alpha \rho u)_2}{\partial t} + \frac{\partial}{\partial x} ((\alpha \rho u^2 + \alpha p)_2) &= \rho_I \frac{\partial \alpha_2}{\partial x} - \lambda \Delta u \\ \frac{\partial (\alpha \rho E)_2}{\partial t} + \frac{\partial}{\partial x} ((\alpha u (\rho E + p))_2) &= \rho_I u_I \frac{\partial \alpha_2}{\partial x} - \lambda \rho_I \Delta u - \mu u_I \Delta p\end{aligned}$$

with : interface quantities given by fluid

Extension by : R. Saurel-RA, JCP 1999 : Euler for each phase, interface terms : hyperbolic system, but not strictly hyperbolic, whatever the closure u_I, ρ_I .

The five-equation flow model for compressible two-phase problems

Equations for two-phase flows

$$\frac{\partial \alpha_1}{\partial t} + u \frac{\partial \alpha_1}{\partial x} = K(p, \rho_1, \rho_2, \alpha_1) \frac{\partial u}{\partial x}$$

$$\frac{\partial(\alpha\rho)_1}{\partial t} + \frac{\partial(\alpha\rho)_1 u}{\partial x} = 0$$

$$\frac{\partial(\alpha\rho)_2}{\partial t} + \frac{\partial(\alpha\rho)_2 u}{\partial x} = 0$$

$$\frac{\partial \rho u}{\partial t} + \frac{\partial(\rho u^2 + p)}{\partial x} = 0$$

$$\frac{\partial \rho E}{\partial t} + \frac{\partial u(\rho E + p)}{\partial x} = 0$$

where $\alpha, \rho, u, p, E(= e + \frac{1}{2}u^2)$ and e are the volume fraction, density, velocity, pressure, total energy and internal energy respectively.

$$K(p, \rho_1, \rho_2, \alpha_1) = \frac{\rho_2 c_2^2 - \rho_1 c_1^2}{\frac{\rho_1 c_1^2}{\alpha_1} + \frac{\rho_2 c_2^2}{\alpha_2}}$$

Mixture Stiffened Gas Equation of State

The pure phase's SG EOS :

$$p_k = (\gamma_k - 1)\rho_k e_k - \gamma_k p_{\infty k}$$

The mixture internal energy :

$$p e = (\alpha\rho)_1 e_1 + (\alpha\rho)_2 e_2$$

$$p e = \alpha_1 \frac{\rho_1 + \gamma_1 p_{\infty 1}}{(\gamma_1 - 1)} + \alpha_2 \frac{\rho_2 + \gamma_2 p_{\infty 2}}{(\gamma_2 - 1)}$$

Kapila A, Meniko R, Bdzil J, Son S and Stewart D 2001 Phys. Fluids **13** 3002

What about jump relations ?

Recall : A system of conservation laws, Hugoniot jump conditions

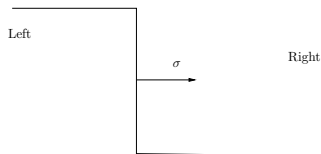
$$\frac{\partial U}{\partial t} + \nabla \cdot F = 0$$
$$F(U_L) - \sigma U_L = F(U_R) - \sigma U_R$$

Single phase : Hugoniot

Shock : Left $\rho_L, \tau_L, u_L, p_L, e_L$; Right $\rho_R, \tau_R, u_R, p_R, e_R$

$$(e_L - e_R) + \frac{p_L + p_R}{2} (\tau_L - \tau_R) = 0; \quad (\rho_L - \rho_R) (\tau_L - \tau_R) + (u_L - u_R)^2 = 0$$

$$\Delta e + \bar{p} \Delta \tau = 0; \quad \Delta p \Delta \tau + \Delta u^2 = 0$$



What about jump relations ?

Two phases, one realisation

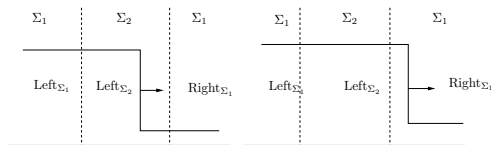
- Phase 1 Shock : Left $\rho_{L,1}, \tau_{L,1}, u_{L,1}, p_{L,1}, e_{L,1}$; Right $\rho_{R,1}, \tau_{R,1}, u_{R,1}, p_{R,1}, e_{R,1}$

$$\Delta e_1 + \bar{p}_1 \Delta \tau_1 = 0; \quad \Delta p_1 \Delta \tau_1 + \Delta u_1^2 = 0$$

- Phase 2 Shock : Left $\rho_{L,2}, \tau_{L,2}, u_{L,2}, p_{L,2}, e_{L,2}$; Right $\rho_{R,2}, \tau_{R,2}, u_{R,2}, p_{R,2}, e_{R,2}$

$$\Delta e_2 + \bar{p}_2 \Delta \tau_2 = 0; \quad \Delta p_2 \Delta \tau_2 + \Delta u_2^2 = 0$$

- impose : $p_{L,1} = p_{L,2} = p_L$ and $p_{R,1} = p_{L,2} = p_R$



- The shock propagates through materials, speed depends on materials.
- Very similar to linear acoustics in random media

$$\frac{1}{c^2} = \frac{\alpha_1}{c_1^2} + \frac{\alpha_2}{c_2^2}$$

Case Study : Two-phase flow problem

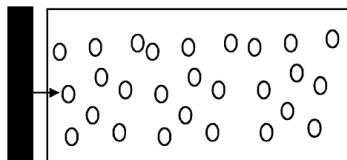
- Phase 1 corresponds to epoxy, which is the most compressible phase with the lowest speed of sound and supports a shock wave.
- Phase 2 corresponds to periclase, which is the less compressible.

Epoxy-periclase mixture initial data

Mixture	ρ_m^0 (g/cm^3) (g/cm^3)	α_1^0	ρ_1^0/ρ_2^0	Z_1^0/Z_2^0
Epoxy-periclase	2.219	0.56	0.33	0.14

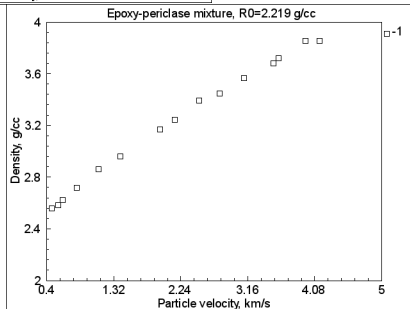
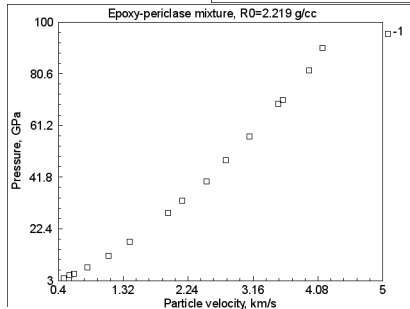
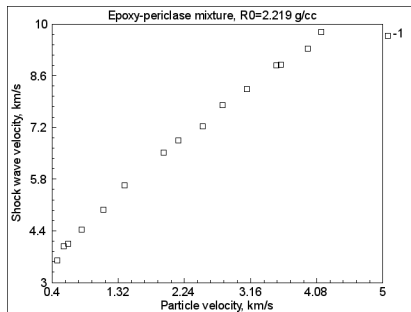
Pure material EOS parameters

	p_{∞} bar	γ	ρ_0 (g/cm^3)	c_0 (cm/ms)	s	$Z_0 = \rho_0 c_0$ $g/(cm^2 ms)$
Epoxy	53000	2.43	1.185	280	1.44	331.8
Periclase	457000	3.49	3.584	660	1.37	2365.4



Piston

Experimental Data



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Front Tracking (*FrontTier* simulation package)

- to achieve resolution of steep and sharp density gradients
- treat discontinuities as moving internal boundaries, and the jump conditions are imposed

A mature, production-quality multiphysics simulation package, supports a range of physics, each with its own validation and verification studies.

Performance of *FrontTier*

- *FrontTier* scales to the entire system on Argonne's IBM Blue Gene/P supercomputer - 62% efficiency on 163,840 cores
- Innovative and Novel Computational Impact on Theory and Experiment Awards
 - "Stochastic (w^*) Convergence for Turbulent Combustion", 2012
 - "Uncertainty Quantification for Turbulent Mixing", 2011

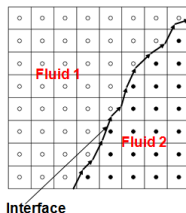
Front Tracking method

- an adaptive computational method that provides sharp resolution of a wave front by tracking the interfaces between distinct materials.
- implemented in code *FronTier*.

FronTier

solves the equations with the following main steps :

- 1 interface propagation.
- 2 interpolation reconstruction.
- 3 interior states update.



Interface propagation step

Interface states are reconstructed from the interpolation of real and ghost states.

- A Riemann problem with left, right interface states as its data is solved to determine the wave speed.
- A new position for the point is determined from the equation

$$\mathbf{x}^{\text{new}} = \mathbf{x}^{\text{old}} + V\Delta t\mathbf{n}$$

V : the wave speed

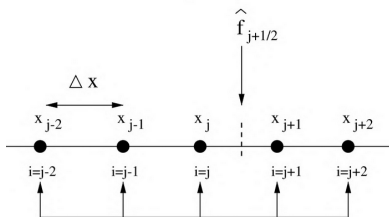
\mathbf{n} : the normal direction to the interface at the point

Δt : the time step size

In the interior state update step

Fifth Order Weighted Essentially non-oscillatory (WENO) scheme :

- achieves high order accuracy and non-oscillatory property near discontinuities
- has been widely used to solve compressible flow equations



Here we have three stencils and each stencil has three points. The approximations are :

$$f_{i+1/2}^{(0)} = \frac{1}{3}f_{i-2} - \frac{7}{6}f_{i-1} + \frac{11}{6}f_i$$

$$f_{i+1/2}^{(1)} = -\frac{1}{6}f_{i-1} + \frac{5}{6}f_i + \frac{1}{3}f_{i+1}$$

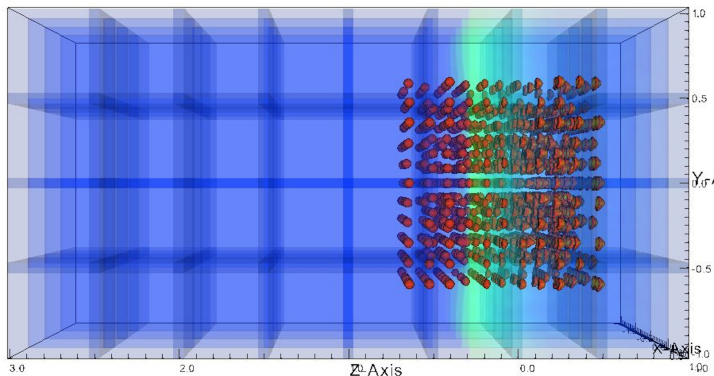
$$f_{i+1/2}^{(2)} = \frac{1}{3}f_i + \frac{5}{6}f_{i+1} - f_{i+2}$$

$$f_{i+1/2} = \gamma_0 f_{i+1/2}^{(0)} + \gamma_1 f_{i+1/2}^{(1)} + \gamma_2 f_{i+1/2}^{(2)}$$

Comparison with numerical simulation

Theoretical speed of shock

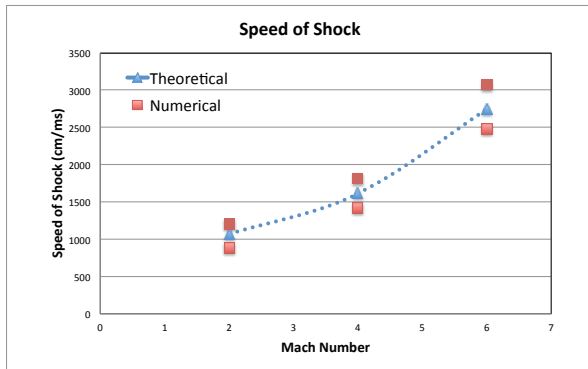
$$\sigma_{\text{theory}} = \frac{(\rho_L u_L^2 + p_L) - (\rho_R u_R^2 + p_R)}{\rho_L u_L + \rho_R u_R}$$



Comparison with numerical simulation

Theoretical speed of shock

$$\sigma_{\text{theory}} = \frac{(\rho_L u_L^2 + p_L) - (\rho_R u_R^2 + p_R)}{\rho_L u_L + \rho_R u_R}$$



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- Cloud interaction parameter :

$$\beta = \alpha_0 \left(\frac{A_0}{R_0} \right)^2$$

- Initial bubble fraction of the cloud :

$$\alpha_0 = \frac{1}{V_c} \sum_{i=1}^N \frac{4}{3} \pi R_i^3$$

- Initial radius of the cloud :

$$A_0 = \sqrt[3]{\sum_{i=1}^N R_i^3}$$

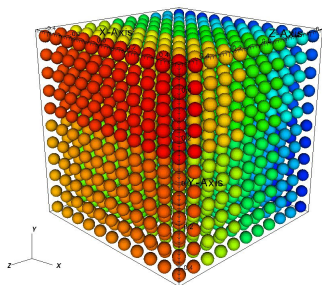
- Initial average radius of the bubbles within the cloud :

$$R_0 = \frac{1}{N} \sum_{i=1}^N R_i$$

Cloud interaction parameter

Cloud interaction parameter β for $1331 = 11^3$

DB: 3d-intfc.vtk
Cycle: 0 Time: 0



DB: 3d-intfc.vtk
Cycle: 0 Time: 0

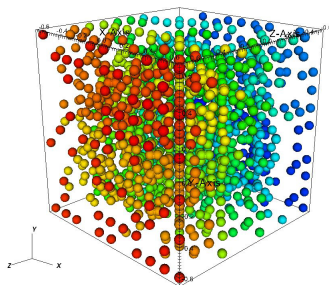
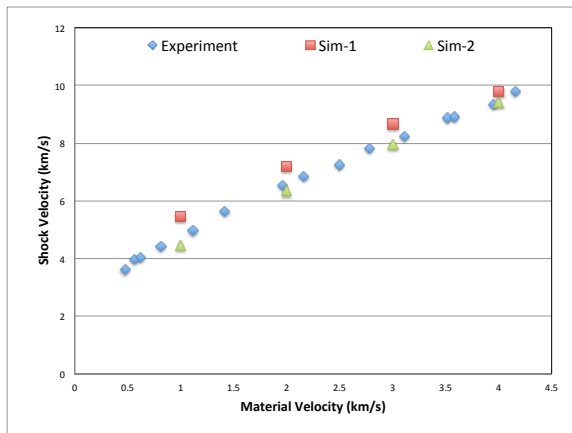
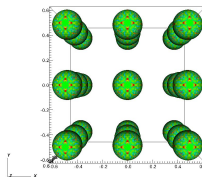
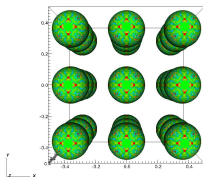
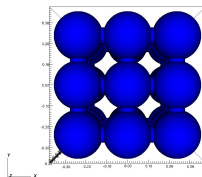
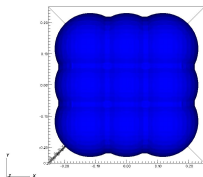


Figure: Initialization of regular/random distribution of 1331 bubbles.

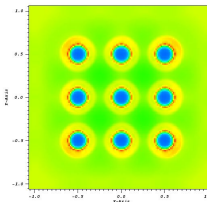
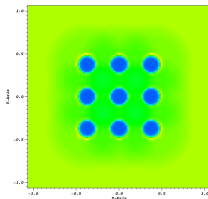
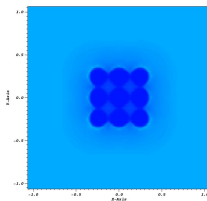
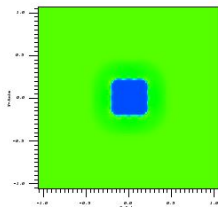
Comparison of experiment to FronTier simulations



Distance between bubbles



Pressure at time $0.4 \mu\text{s}$ for $\beta = 125, 15, 5, 1$



Uncertainty Quantification (UQ) Tools

- Scientific Discovery through Advanced Computing (SciDAC)
- **QUEST** - is a SciDAC Institute that is focused on UQ in large-scale scientific computations. (<http://www.quest-scidac.org/>)
- UQ software tools that are included in the QUEST
 - 1 UQTk (SNL) (<http://www.sandia.gov/UQToolkit>) provides routines for evaluating algebraic expressions and transcendental functions of random variables represented with Polynomial Chaos expansions.
 - 2 DAKOTA (SNL) (<http://dakota.sandia.gov>) provides a variety of non-intrusive algorithms for design optimization, model calibration, uncertainty quantification, global sensitivity analysis, solution verification, and parameter studies.
 - 3 QUESO (UT) provides statistical algorithms for Bayesian inference, model calibration, model validation, and decision making under uncertainty.
 - 4 GPMSA (LANL) allows for global sensitivity analysis, forward propagation of uncertainty, model calibration/parameter estimation, and predictions with uncertainty.

- is a lightweight C++ library, offers tools for (non)intrusive uncertainty propagation.
- The technique for forward UQ is the spectral Polynomial Chaos expansions (PCEs) : allows for
 - efficient uncertainty propagation
 - very fast global sensitivity analysis
 - cheap surrogate model construction

Generic Workflow

- 1 Generate parameter samples to run the forward model at, for PC construction
- 2 Run the black-box model (*FronTier*)
- 3 Obtain PCE for the model
- 4 Postprocessing : global sensitivity analysis

PC Type	Domain	Density $w(\xi)$	Polynomial	Free parameters
Gauss-Hermite	$(-\infty, +\infty)$	$\frac{1}{\sqrt{2\pi}} e^{-\frac{\xi^2}{2}}$	Hermite	none
Legendre-Uniform	$[-1, 1]$	$\frac{1}{2}$	Legendre	none
Gamma-Laguerre	$[0, +\infty)$	$\frac{x^\alpha e^{-x}}{\Gamma(\alpha+1)}$	Laguerre	$\alpha > -1$
Beta-Jacobi	$[-1, 1]$	$\frac{(1+\xi)^\alpha (1-\xi)^\beta}{2^{\alpha+\beta+1} B(\alpha+1, \beta+1)}$	Jacobi	$\alpha > -1, \beta > -1$

Global sensitivity analysis

- maximum pressure, velocity depend on the distance between bubbles

Convergence of pressure : PDFs & CDFs

- From a single deterministic simulation, extract a Probability Distribution Function (PDF) by binning results from a space time neighborhood of the convergence point.
- The binned state values constitute a discrete set of solution values which define an approximate PDF.
- The convergence of the associated cumulative distribution functions (CDFs) are assessed by standard function space metrics.
- Convergence is to a probability distribution indexed by space and time, also known as a Young measure.
- We study integrated convergence through an L_1 norm (relative to integration both in solution state variables and over space-time) for the CDFs.

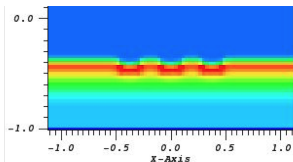
Explore the consequence of varying the definitions used for convergence.

- the mesh,
- PDF vs. CDF,
- the size of the supercell used to define the statistical PDF.

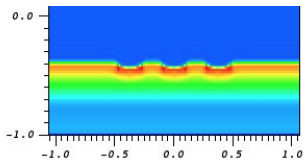
Pressure at the midplane x, z midplane

For each supercell, we bin the shock velocity values into 5 bins, and count the number of values lying in each bin, to obtain a probability.

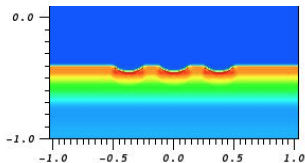
Coarse : $\Delta x = 0.03125$



Medium : $\Delta x = 0.015625$



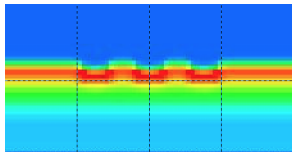
Fine : $\Delta x = 0.0078125$



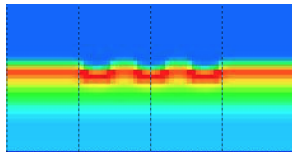
Supercell resolution

- The coarsest grid has for each supercell a resolution

a) 2×4 supercell grid ; 16×16



b) 1×4 supercell grid ; 32×16



- The supercell partition is unchanged for the medium and fine grids, the number of cells in each direction increases by factors of 2 and 4.

Norm comparison of convergence

Norm comparison of convergence for pressure PDFs and CDFs at fixed values of y, t . In each supercell, an L_1 norm is applied to the difference of the PDFs or CDFs.

coarse grid supercell size mesh comparison	a) 16×16 L_1	b) 32×16 L_1
CDFs : coarse to fine	0.0464	0.0139
CDFs : medium to fine	0.0218	0.0053
PDFs : coarse to fine	0.028	0.0217
PDFs : medium to fine	0.0176	0.0039

Observed

a coarsening of the supercell resolution (increase of the supercell size) to 32×16 coarse grid cells per supercell is needed to obtain single digit convergence errors.

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- presented a method for the approximation of a compressible, hyperbolic multiphase problem given by Kapila five equation model
- Derivation/justification of jump relations

Ongoing Work

- Take into account more complex (spherical, cylindrical) cloud
- Generate and initialize numerical simulations via Gaussian random field
- Find the mesh that gives acceptable accuracy for certain bubbles \Rightarrow statistical convergence...

CSCS-Piz Daint - 8th place in TOP500 Lists (SC November 2016)

- Cray supercomputer installed at the Swiss National Supercomputing Centre (CSCS)
- The second most energy-efficient supercomputer in the TOP500, with a rating of 7.45 gigaflops/watt
- The only system on the list equipped with the new P100 GPUs. It is a 3.3-petaflop cluster of DGX-1 servers that delivers 9.46 gigaflops/watt.

Rank	Site	System	Cores	Rmax (TFlop/s)	Rpeak (TFlop/s)	Power (kW)
1	National Supercomputing Center in Wuxi China	Sunway TaihuLight - Sunway MPP, Sunway SW26010 260C 1.45GHz, Sunway NRCPC	10,649,600	93,014.6	125,435.9	15,371
2	National Super Computer Center in Guangzhou China	Tianhe-2 (MilkyWay-2) - TH-1TB-FEP Cluster, Intel Xeon E5-2692 12C 2.200GHz, TH Express-2, Intel Xeon Phi 3151P NUDT	3,120,000	33,862.7	54,902.4	17,808
3	DOE/SC/Oak Ridge National Laboratory United States	Titan - Cray XK7, Opteron 6274 16C 2.200GHz, Cray Gemini interconnect, NVIDIA K20x Cray Inc.	560,640	17,590.0	27,112.5	8,209
4	DOE/NNSA/LLNL United States	Sequoia - BlueGene/Q, Power BOC 16C 1.60 GHz, Custom IBM	1,572,864	17,173.2	20,132.7	7,890
5	DOE/SC/LBNL/NERSC United States	Cori - Cray XC40, Intel Xeon Phi 7250 68C 1.40GHz, Aries interconnect Cray Inc.	622,336	14,014.7	27,880.7	3,939
6	Joint Center for Advanced High Performance Computing Japan	Oakforest-PACS - PRIMERGY CX1640 M1, Intel Xeon Phi 7250 68C 1.40GHz, Intel Omni-Path Fujitsu	556,104	13,554.6	24,913.5	2,719
7	RIKEN Advanced Institute for Computational Science (AICS) Japan	K computer, SPARC64 Villifx 2.0GHz, Tofu interconnect Fujitsu	705,024	10,510.0	11,280.4	12,660
8	Swiss National Supercomputing Centre (CSCS) Switzerland	Piz Daint - Cray XC50, Xeon E5-2690v3 12C 2.6GHz, Aries interconnect, NVIDIA Tesla P100 Cray Inc.	206,720	9,779.0	15,988.0	1,312