Running 3D Finite-difference or Spectral-element Wave Propagation Codes Faster Using a GPU Cluster

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# Outlines

- Why we are involved in HPC
- Porting on GPU a scientific code based upon :
  - The Spectral Element Method
  - Finite Differences





#### "Mainshocks and Aftershocks"



# **Spectral-Element Method**

- Developed in Computational Fluid Dynamics (Patera 1984)
- Accuracy of a pseudospectral method, flexibility of a finiteelement method
- Extended by Komatitsch and Tromp, Chaljub et al., Capdeville et al.
- Large curved "spectral" finiteelements with high-degree polynomial interpolation
  - Mesh honors the main discontinuities (velocity, density) and topography
- Very efficient on parallel computers, no linear system to





# **Our SPECFEM3D software package**



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Goal: modeling seismic wave propagation in the full Earth or in densely populated regions following large earthquakes

The SPECFEM3D source code is open (GNU GPL v2)

Mostly developed by Dimitri Komatitsch and Jeroen Tromp at Harvard University, Caltech and Princeton (USA) and University of Pau (France) since 1996.

Improved with the Barcelona Supercomputing Center, Spain (Jesús Labarta et al.) and David Michéa (INRIA, Pau, HPC-Europa program, 2007),

# Results for load balancing: cache misses (J. Labarta, BSC)



#### **Graphics cards**

#### **NVIDIA GeForce 8800 GTX**





#### **GRUJ GRUJ GRUJ GRUJ GRUJ GRUJ GRUJ GRUJ GRUJ**

#### Minimize CPU ↔ GPU data transfers

- CPU  $\leftrightarrow$  GPU memory bandwidth much lower than GPU memory bandwidth
  - Use page-locked host memory (cudaMallocHost()) for maximum CPU  $\leftrightarrow$  GPU bandwidth
- Minimize CPU ↔ GPU data transfers by moving more code from CPU to GPU
  - Even if that means running kernels with low parallelism computations
  - Intermediate data structures can be allocated, operated on, and deallocated without ever copying them to CPU memory
- Group data transfers
  - One large transfer much better than many small ones
- Fit all the arrays on the GPU card to avoid costly CPU ↔ GPU data transfers

But of course the MPI buffers must remain on the CPU, therefore we can not avoid a small number of transfers (of 2D cut planes)

#### **Porting SPECFEM3D on CUDA**

- At each iteration of the serial time loop, three main types of operations are performed:
  - update (with no dependency) of some global arrays composed of the unique points of the mesh
  - purely local calculations of the product of predefined derivative matrices with a local copy of the displacement vector along cut planes in the three directions (i, j and k) of a 3D spectral element

update (with no dependency) of other global arrays composed of the unique points of the mesh

#### **Porting SPECFEM3D on CUDA: global numbering versus local numbering**

- In 3D and for NGLL = 5, for a regular hexahedral mesh there are:
  - 125 GLL integration points in each element
  - 27 belong only to this element
  - 98 belong to several elements





=> one thread per grid point (i.e., 125 threads per finite element)

#### Porting SPECFEM3D on CUDA: mesh coloring

- Key challenge: ensure that contributions from two local nodes never update the same global value from different warps
- Use of mesh coloring: suppress dependencies between mesh points inside a given kernel





#### **Porting SPECFEM3D on CUDA: adding MPI**

Non blocking MPI: update done in communication buffers (for outer mesh elements first)



MPI communications cost on GPU version ~ 5%,

> We need to use non-blocking MPI communications.

> MPI communications are very well overlapped by computations on the GPU.

### **Use non-blocking MPI**

**Classical overlapping, see e.g. Danielson and Namburu (1998)** 







Collaboration with Roland Martin and Nicolas Le Goff (Univ of Pau, France)

#### **Porting SPECFEM3D on CUDA: validation**

Validation and single precision efficiency:



#### Multi-GPU weak scaling (up to 192

![](_page_15_Figure_1.jpeg)

It is difficult to define speedup: versus what?

For us, on the CEA/CCRT/GENCI GPU/Nehalem cluster, about 20x for one GPU versus one CPU core.

#### The S\_GPU library

- Implemented by Matthieu Ospici, Jérôme Reybert, Jean-François Méhaut (INRIA Grenôble – MESCAL)
- Virtualization : 1 GPU visible per CPU core
- Instructions scheduling done by S\_GPU, not by CUDA
- Memory transfers / computations overlapping
- Written in C++ and CUDA, binding Fortran
- Limited intrusion in the source code

![](_page_16_Picture_7.jpeg)

#### **S\_GPU : running traces**

![](_page_17_Figure_1.jpeg)

Memory transfer CPU - GPU

So far, up to 20 % faster than CUDA (CUDA 3.1, Tesla T10)

Porting the FD code ONDES3D to CUDA (done with David Michéa from BRGM, France).

**Implementing Finite-Difference code on GPU :** 

> Computation stencil leads to high reading redundancy

> Necessity to massively use shared memory

> Reduce the ratio halo\_points / block\_points to reduce redundancy

> Intuitive approach : 3D blocks that minimize the ratio halo/points

> problem: not enough shared memory to have 3D blocks big enough to get a good ratio.

![](_page_18_Figure_7.jpeg)

=> 13 global memory accesses / thread for each iteration

#### Porting the FD code ONDES3D to CUDA

The approach of P. Micikevicius from NVIDIA (2009): a sliding window algorithm

> use 2D tile instead of 3D blocks and loop along z axis

> in 2D, the amount of shared memory is sufficient to have tiles big enough to obtain a good ratio between halo points and computed points.

> data along z axis are shifted in registers at each iteration in a pipeline way => except for halos, only one global memory data need to be loaded at each iteration for a point.

#### Porting the FD code ONDE3D to CUDA

![](_page_20_Picture_1.jpeg)

We use one thread per point in the *xy* plane and we tile it with blocks of 16x8 threads.

For a block : 4\*16 + 4\*8 + 16\*8 data loaded by 16\*8 threads

=> 1.75 global memory accesses / thread for each iteration (compared to 13 accesses before, i.e., 7.5 times fewer)

#### Porting the FD code ONDE3D to CUDA

![](_page_21_Figure_1.jpeg)

- Scaling along Z is almost linear.
- Despite the coalesced memory accesses, scaling along X is not regular and suffers from pathological cases

## **Conclusions and future work**

Dimitri Komatitsch, David Michéa and Gordon Erlebacher, Porting a high-order finite-element earthquake modeling application to NVIDIA graphics cards using CUDA, Journal of Parallel and Distributed Computing, vol. 69(5), p. 451-460, doi: 10.1016/j.jpdc.2009.01.006 (2009).

David Michéa and Dimitri Komatitsch, Accelerating a 3D finite-difference wave propagation code using GPU graphics cards, Geophysical Journal International, vol. 182(1), p. 389-402, doi: 10.1111/j.1365-246X.2010.04616.x, (2010).

- We get a speedup of 20x on a cluster of GPUs for spectral elements with non-blocking MPI, and 20x to 60x in the case of finite differences
- It is crucial to use larger domains to compensate for the very high speedup
- In future work, we could use OpenCL (to support other hardware)
- Need for some kind of OpenMP for GPUs: CAPS HMPP, StarSs, StarPU...

# Thank you for your attention

# SLIDES

FOR

# QUESTIONS

# methods

Seismic wave equation : tremendous increase of computational power ⇒ development of numerical methods for accurate calculation of synthetic seismograms in complex 3D geological models has been a continuous effort in last 30 years.

**Finite-difference methods** : Yee 1966, Chorin 1968, Alterman and Karal 1968, Madariaga 1976, Virieux 1986, Moczo et al, Olsen et al..., difficult for boundary conditions, surface waves, topography, full Earth

**Boundary-element or boundary-integral methods** (Kawase 1988, Sanchez-Sesma et al. 1991) : homogeneous layers, expensive in 3D

**Spectral and pseudo-spectral methods (Carcione 1990) : smooth media, difficult for boundary conditions, difficult on parallel computers** 

Classical finite-element methods (Lysmer and Drake 1972, Marfurt 1984, Bielak et al 1998) : linear systems, large amount of numerical dispersion Let us combine the advantages of the last two techniques.

# Final mesh of the Earth

![](_page_26_Picture_1.jpeg)

![](_page_26_Picture_2.jpeg)

- "Gnomonic" mapping (Sadourny 1972).
- Ronchi et al. (1996), Chaljub (2000)
- Analytical mapping from six faces of cube to unit sphere

#### BLAS 3 (Basic Linear Algebra Subroutines)

![](_page_27_Figure_1.jpeg)

![](_page_27_Figure_2.jpeg)

Can we use highly optimized BLAS matrix/matrix products (90% of computations)?

- For one element: matrices (5x25, 25x5, 5 x matrices of (5x5)), BLAS is not efficient: overhead is too expensive for matrices smaller than 20 to 30 square.
- If we build big matrices by appending several elements, we have to build 3 matrices, each having a main direction (x,y,z), which causes a lot of cache misses due to the global access because the elements are taken in different orders, thus destroying spatial locality.

Since all arrays are static, the compiler already produces a very well optimized code.

=> No need to, and cannot easily use BLAS

=> Compiler already does an excellent job for small static loops

![](_page_28_Picture_0.jpeg)

### **Global Simulations: SPECFEM3D\_GLOBE**

#### **Open source:** geodynamics.org

- **On-demand TeraGrid applications:**
- Automated, near real-time simulations of all M>6 earthquakes
- Analysis of past events (more than 20,000 event)
- Seismology Web Portal (geodynamics.org) Petascale simulations:
- Global simulations at 1-2 Hz
- Reached 1.15 s period on 149,784 cores at ORNL
- Moving towards global 'adjoint tomography' SPECFEM3D\_GLOBE Users Map

#### **Princeton**<sup>®</sup>University +

![](_page_28_Figure_11.jpeg)

COMPUTATIONAL INFRASTRUCTURE FOR GEODYNAMICS (CIG CALIFORNIA INSTITUTE OF TECHNOLOGY (U.S.) UNIVERSITY OF PAU (FRANCE)

![](_page_28_Figure_13.jpeg)

![](_page_29_Picture_0.jpeg)

![](_page_29_Figure_1.jpeg)

# **Finite elements**

High-degree pseudospectral finite elements
N = 4 to 12 usually *Exactly* Diagonal mass matrix

No linear system to invert

![](_page_30_Figure_3.jpeg)

![](_page_30_Figure_4.jpeg)

![](_page_30_Figure_5.jpeg)

# Equations of motion (solid)

Differential or strong form (e.g., finite differences):

#### We solve the integral or weak form:

 $\rho \mathbf{w} \cdot \partial_t^2 \mathbf{s} \mathbf{d}^2 \mathbf{r} = - \nabla \mathbf{w} : \mathbf{T} \mathbf{d}^2 \mathbf{r}$ 

+ attenuation (memory variables) if needed for viscoelasticity.