# On the status of algebraic multigrid preconditioners

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Potential INRIA collaborators

Stéphane Lanteri Laura Grigori Luc Giraud problem: AMG designed for basic problems

problem: AMG does not scale

problem: no sense of optimality in AMG

### show the potential for AMG

highlight optimality

high-performance progress

goal: strengthen and increase applicability through the Joint Lab

### Multilevel view

Jacobi, Gauss-Seidel Chebychev ILU Kaczkmarz

attenuate high energy quickly with with relaxation attenuate low energy error through coarse-grid correction

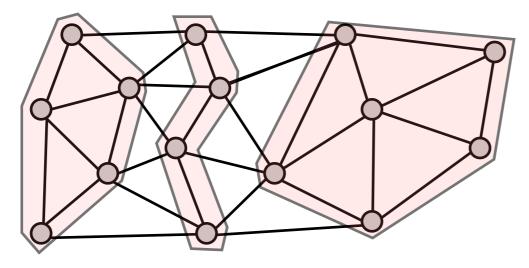
relax Ax = b

SON ICA

solve coarse problem

#### AMG Framework

• aggregation: groups of fine nodes form coarse nodes



fine: 15

coarse: 3

- an initial interpolation pattern
- ullet find an optimal interpolation operator P that contains low energy

• cycle: 
$$x \leftarrow x + P(P^TAP)^{-1}P^Tr$$
 
$$x \leftarrow x + PA_{coarse}^{-1}P^Tr$$

# AMG Components: what we need

• an idea of the low energy: physics, training, intuition

- $AB \approx 0$
- a strength measure to determine strong node couplings

 $S_{ij}$ 

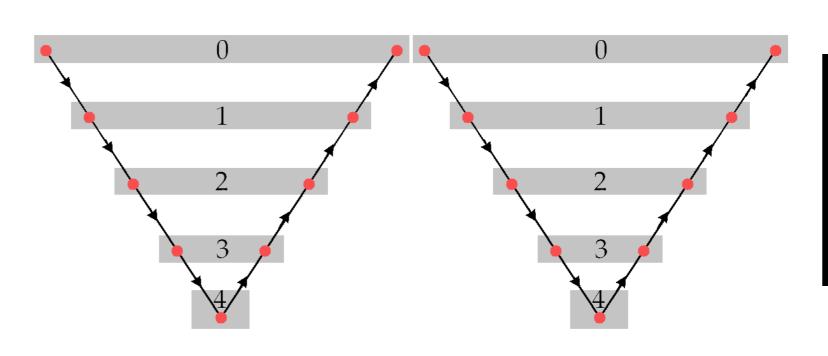
• a parallel aggregation method

Agg

• low complexity, optimal interpolation

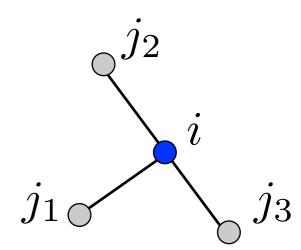
P

- better cycling
  - richer coarse grids
  - "parallel" cycling

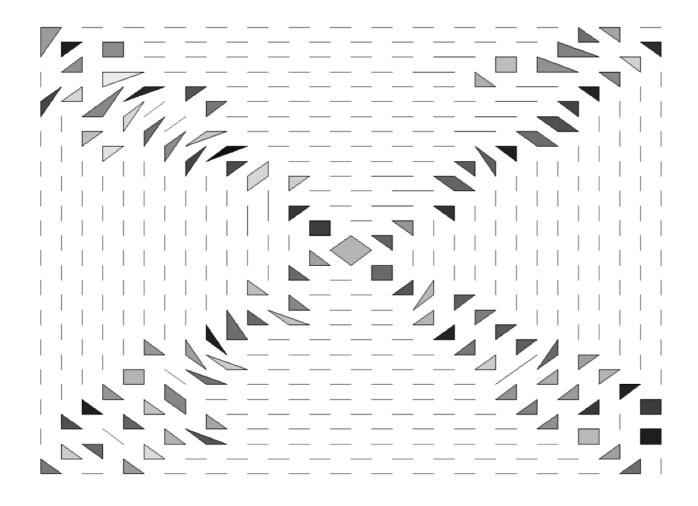


#### **Evolution Measure**

- 1. drop point source at a node
- 2. evolve/diffusion point source with  ${\cal A}$



3. evaluate diffusivity at neighbors in comparison to known low energy

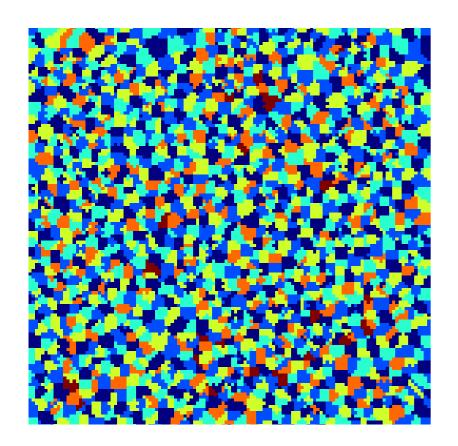


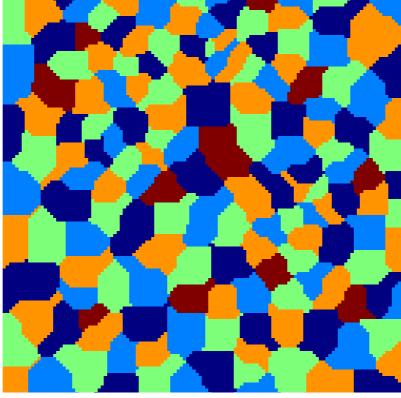
- efficient
- parameter insensitive
- Euler flow
- wave problems
- high-order
- discontinuous elements

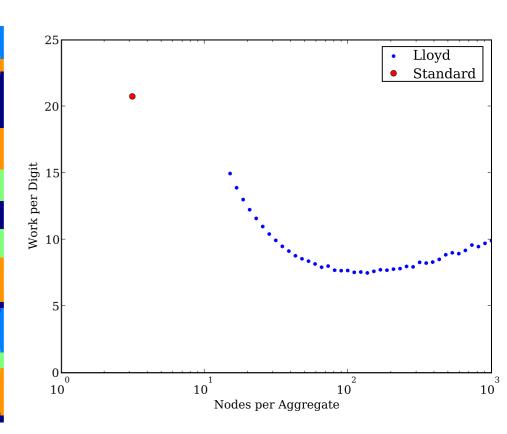
### Flexible aggregation

- we use two approaches:
  - 1. MIS(2): parallel coarse grids == serial coarse grids
  - 2. shortest-path: ability to tune bandwidth

- need to combine
- need to develop autotuning for heterogeneous archs







### optimizing energy

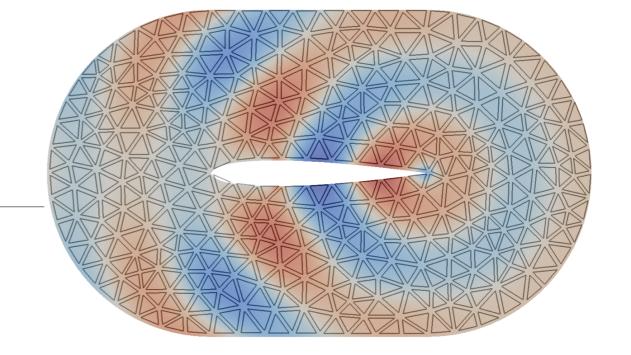
- P should have low energy (low A-norm or  $A^*A$ -norm)
  - 1. determine sparsity pattern
  - 2. minimize energy column-wise (parallel)
- need to push toward more demanding nonsymmetric applications
- need a formal nonsymmetric process

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| h     | std. | opt. |
|-------|------|------|
| 1/64  | >150 | 24   |
| 1/128 | >150 | 28   |
| 1/256 | >150 | 33   |
| 1/512 | >150 | 33   |

### Wave problems (Helmholtz)

- AMG problem: standard "low energy" modes (constant) break Nyquist rate
- answer: introduce wave modes at all levels



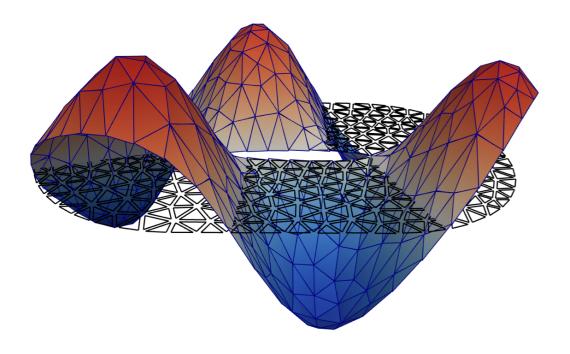
 $e^{i\omega x}$ 

multiple wave modes:  $\Longrightarrow e^{i\omega\cos(\theta)x+\sin(\theta)y}$ 

infuse wave modes:  $\Longrightarrow$  level 1:  $\theta = 0, \frac{\pi}{2}$  level 2:  $\theta = 0, \frac{\pi}{8}, \frac{3\pi}{8}, \frac{5\pi}{8}, \frac{7\pi}{8}$ 

adapt to grid through relaxation:  $\implies Ae^{i\omega \mathbf{x}} = 0$ 

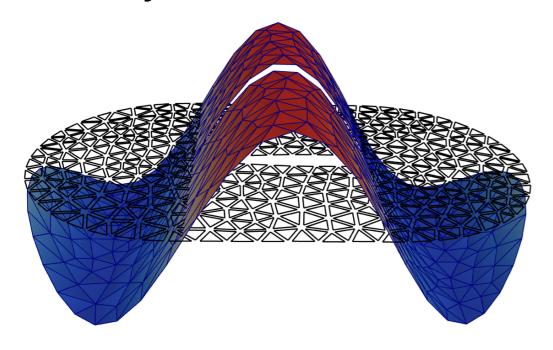
optimize interpolation:  $\Longrightarrow ||P||_{A^*A}$ 



left singular vector

- need to extend to Maxwell equations
- need to test robustness for lossy media

injected mode

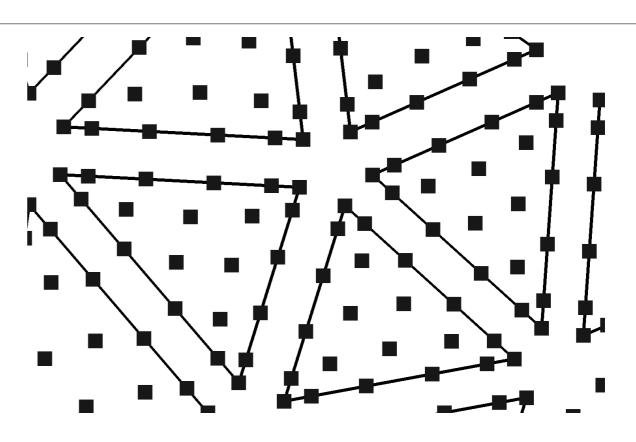


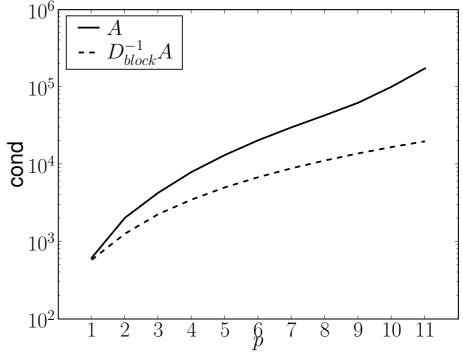
| ppw  | $\mid h \mid$ | <i>h</i> /2 | h/4 | h/8 | <i>h</i> /12 |
|------|---------------|-------------|-----|-----|--------------|
| 5.0  | 9             | 11          | 15  | 25  | 54           |
| 10.0 | 9             | 11          | 11  | 11  | 14           |
| 30.0 | 9             | 10          | 10  | 11  | 11           |
| 90.0 | 9             | 10          | 11  | 11  | 11           |
| All  | 4             | 15          | 17  | 21  | 22           |

pgmres iterations, complexity

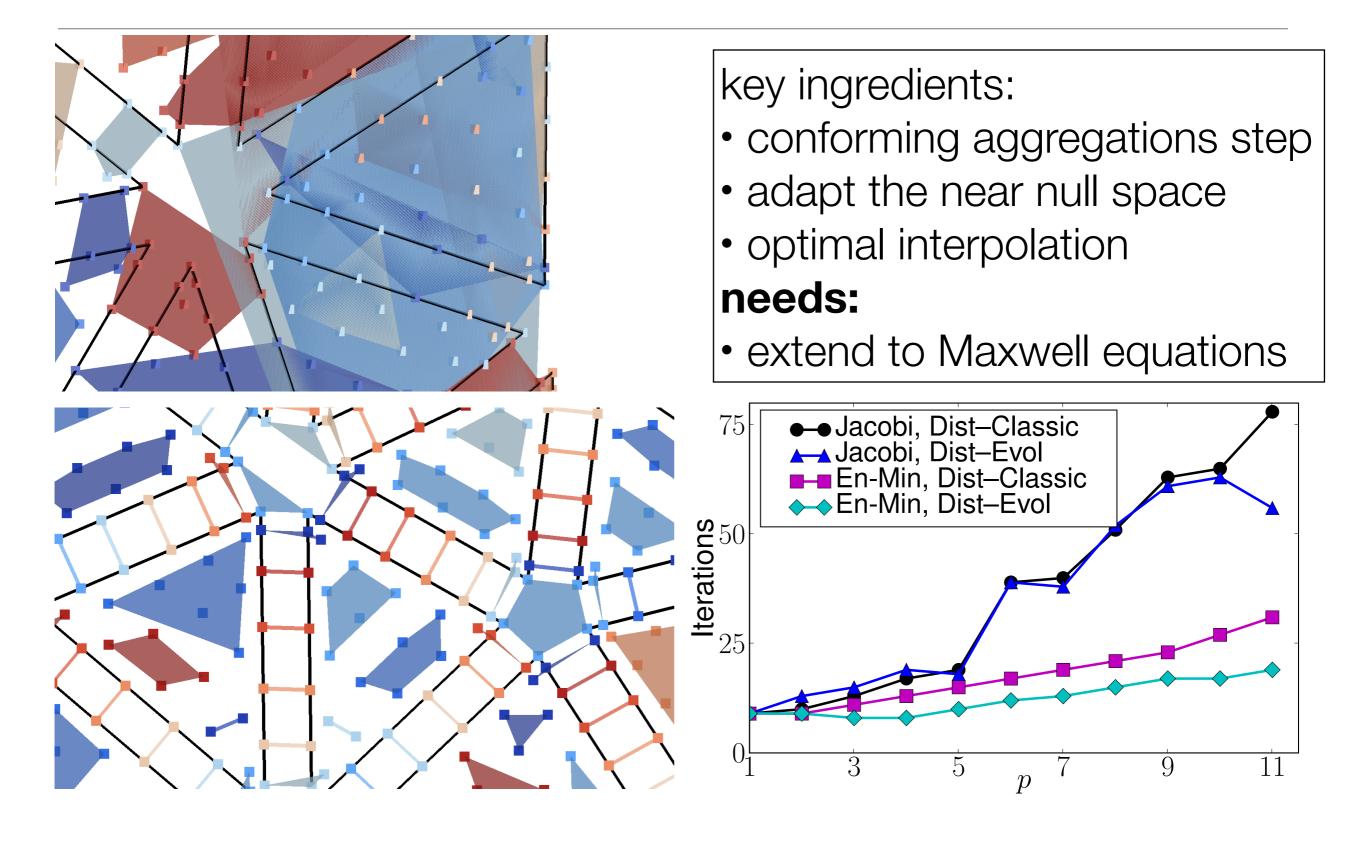
### High-order discontinuous Galerkin

- different types of d.o.f.
- loss of locality
- increase in condition number
- most heuristics in AMG break down





### High-order discontinuous Galerkin: Poisson



### AMG on the GPU

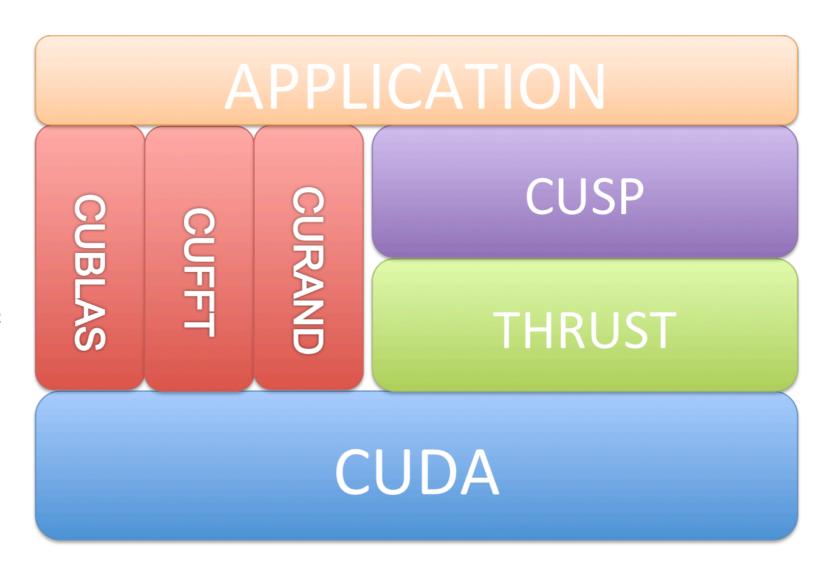
need for acceleration

multicore difficult to optimize for AMG

efficient GPU kernels: SpMV

#### AMG on the GPU

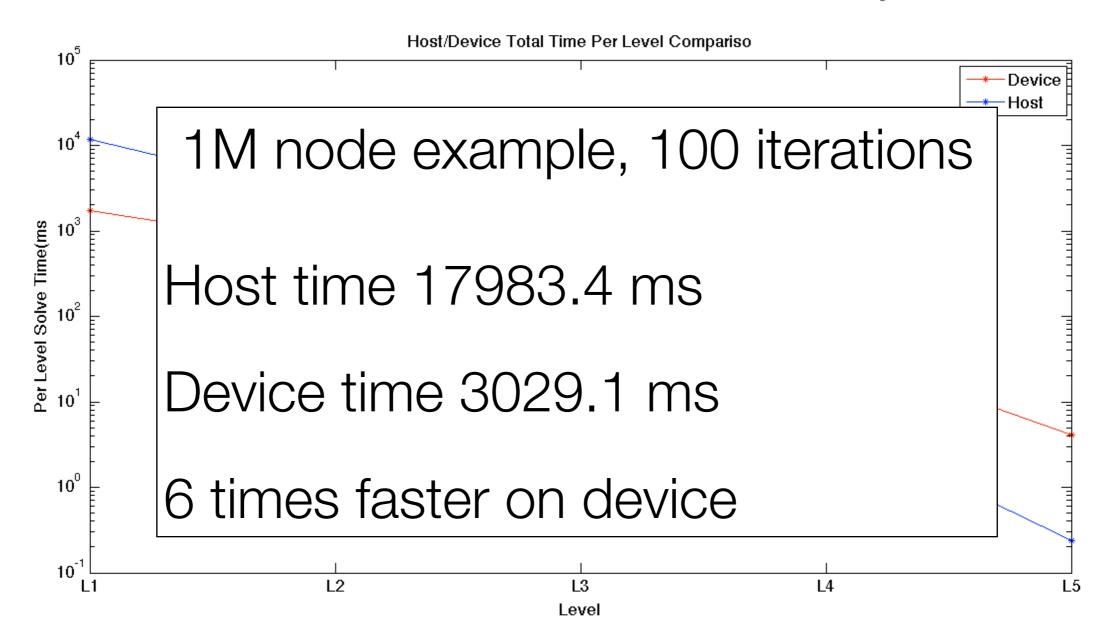
- Cusp (Cuda) framework
- have developed hooks for use with Jumpshot
- target: setup+solve < 1sec</li>1M dof problem
- host: many seconds



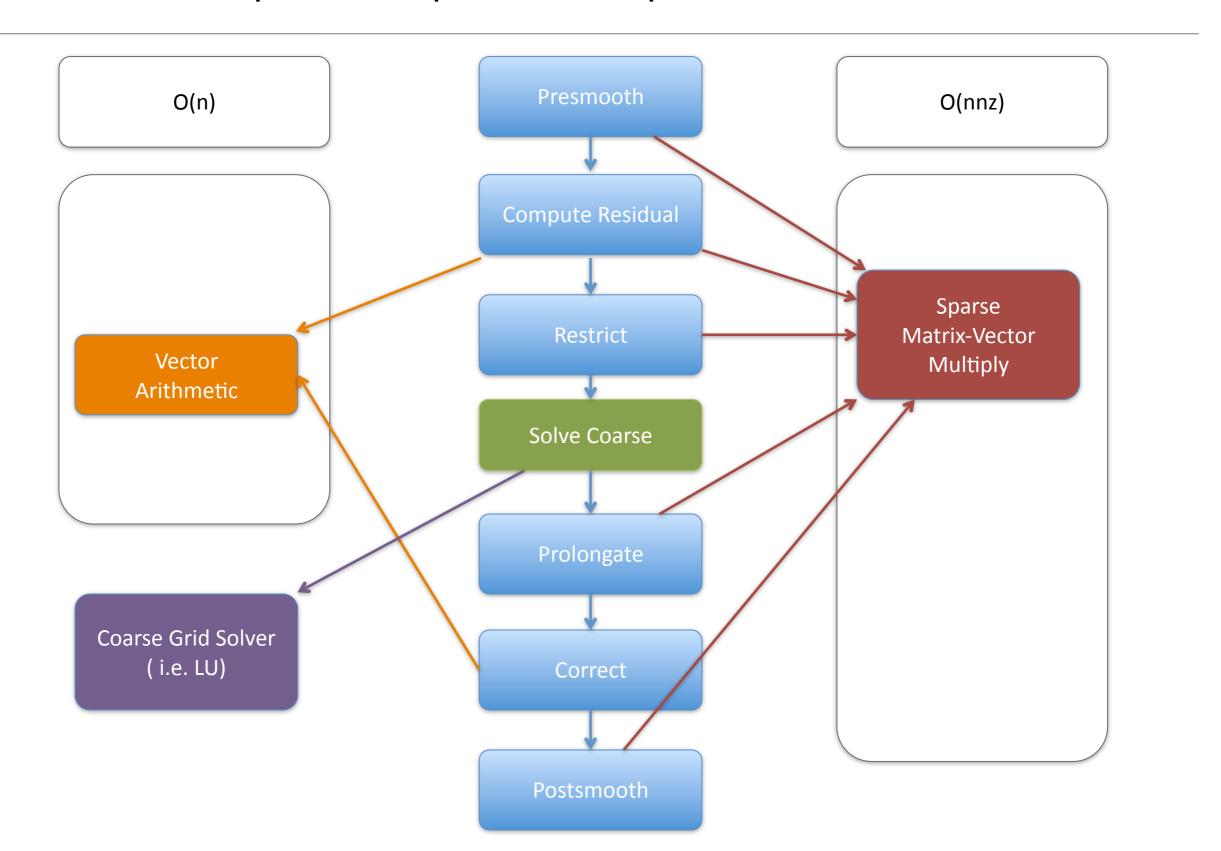
### Solve phase

- relies on fast SpMV
- performance hit: GPU kernel launches

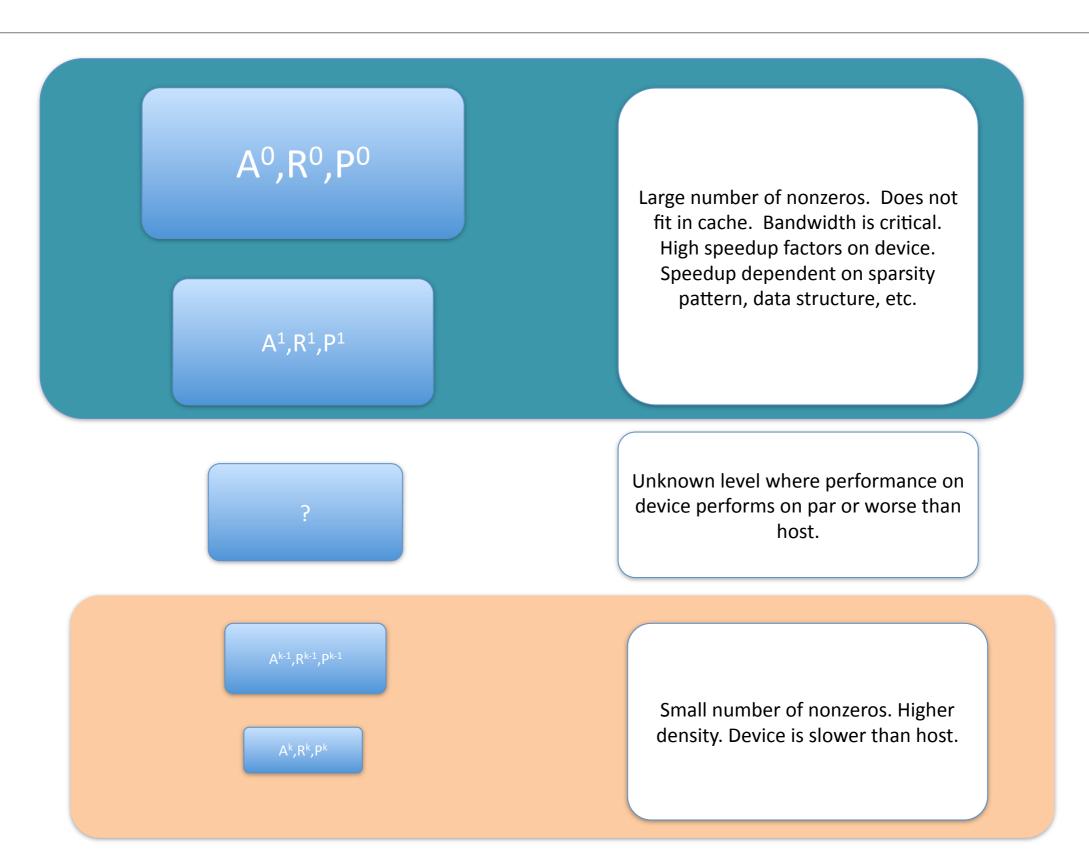
- performance hit: transfer
- Device: likes sparsity
- host: likes density



# AMG Solve phase: parallel operations



# Sparse Mat-Vec



### Setup phase

- strength of connection
- aggregation
- tentative interpolation
- smoothed interpolation
- transpose
- Galerkin triple product
- relaxation

### 1M node example

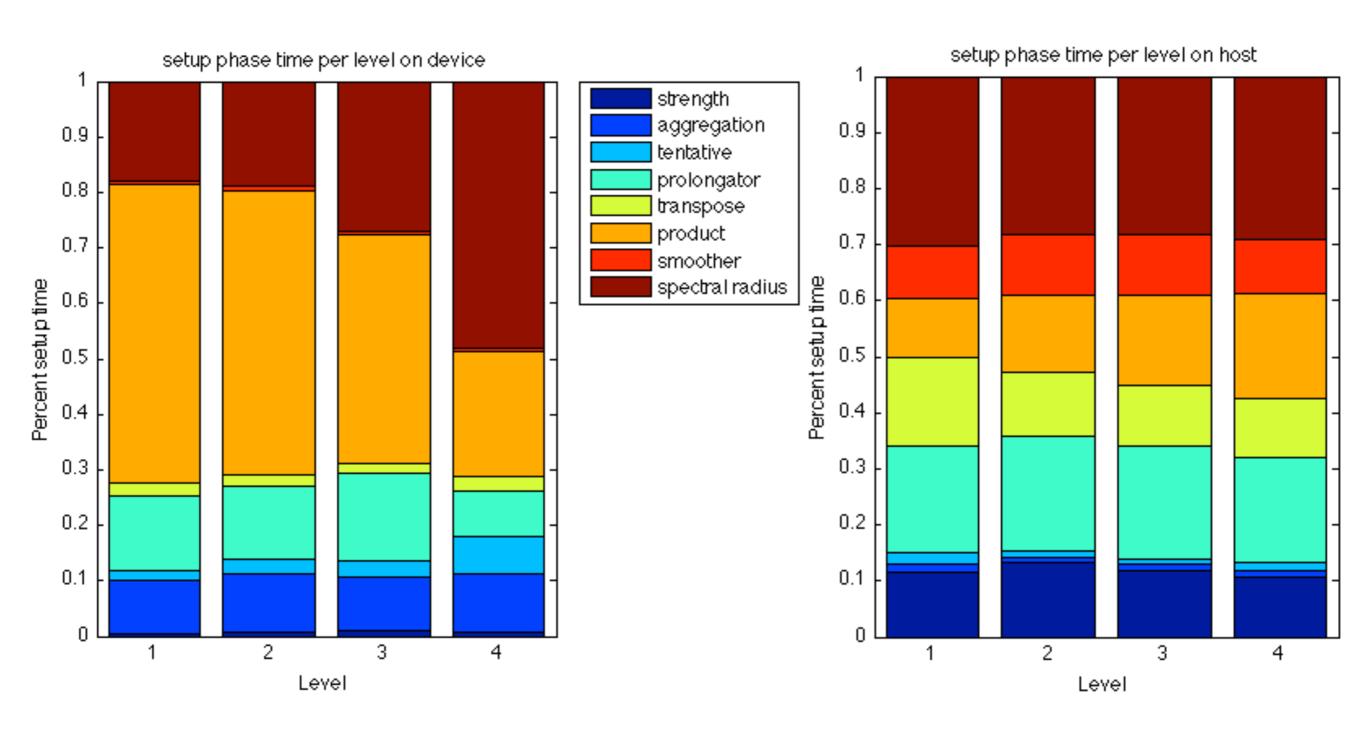
Host time 4558.97 ms

Device time 716.86 ms

6 times faster on device

| Number of levels | 5        | MIS(2)   |  |
|------------------|----------|----------|--|
| Level            | Unknowns | Nonzeros |  |
| 1                | 1048576  | 5238784  |  |
| 2                | 146193   | 1586645  |  |
| 3                | 8680     | 128908   |  |
| 4                | 363      | 5291     |  |
| 5                | 18       | 172      |  |

# Setup Phase



### collaboration: E&M

#### Scientific objectives

 Design, analysis and validation of numerical methods and high performance resolution algorithms for the computer simulation of wave propagation problems in complex domains and heterogeneous media

#### Research directions

NACHOS

- Systems of linear PDEs with variable coefficients
  - Discretization
    - Discontinuous finite element (DG) methods on unstructured meshes
    - High order polynomial interpolation
    - p-, h- and hp-adaptivity
    - Numerical treatment of complex propagation media models
  - Resolution
    - Accurate and efficient time integration strategies
    - Domain decomposition (DD) methods
  - High peformance computing
    - Algorithmic aspects (parallel resolution methods)
    - Implementation issues (mixed SIMD/MIMD programming model)

#### collaboration: E&M

#### Computational electromagnetics

- System of Maxwell equations
- Dispersive propagation media
- Applications involve the interaction of electromagnetic waves with,
  - biological tissues (biocem),
  - geological media (georadar).



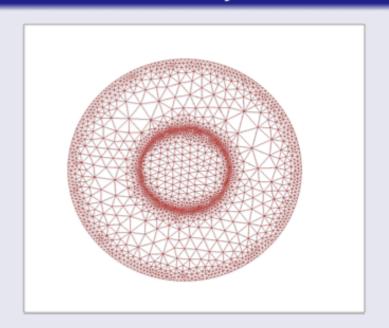
James Clerk Maxwell (1831-1879)

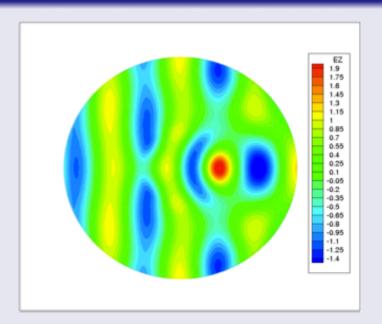
#### Computational geoseismics

- System of elastodynamic equations
- Viscoelastic propagation media
- Applications deal with the propagation of seismic waves,
  - generated by an explosive source (earthquake dynamics),
  - in the deep subsurface (resource prospection).

### Nachos team, Domain Decomposition

## Classical (non-optimized) Schwarz algorithm





| Method                    | L2 error on $E_z$ | Ns | $\#$ iter BiCGStab ( $arepsilon=10^{-6}$ ) |
|---------------------------|-------------------|----|--|
| $DGTH	ext{-}\mathbb{P}_1$ | 0.16400           | 4  | 317  |
| $DGTH	ext{-}\mathbb{P}_2$ | 0.05701           | 4  | 650  |
| DGTH-ℙ₃                   | 0.05519           | 4  | 1067                                       |
| DGTH-₽₄                   | 0.05428           | 4  | 1619                                       |
| $DGTH	ext{-}\mathbb{P}_i$ | 0.05487           | 4  | 352  |

### Nachos team, Domain Decomposition

### Optimized Schwarz algorithm (case 1)

| Method                    | L2 error on $E_z$ | Ns | $\#$ iter BiCGStab ( $arepsilon=10^{-6}$ ) |
|---------------------------|-------------------|----|--|
| $DGTH	ext{-}\mathbb{P}_1$ | 0.16457           | 4  | 52 (6.1) a                                 |
| _                         | 0.16467           | 16 | 83 (4.7)                                   |
| $DGTH	ext{-}\mathbb{P}_2$ | 0.05705           | 4  | 61 (10.7)                                  |
| _                         | 0.05706           | 16 | 109 (6.7)                                  |
| DGTH- $\mathbb{P}_3$      | 0.05519           | 4  | 71 (15.0)                                  |
| _                         | 0.05519           | 16 | 139 ( 8.2)                                 |
| DGTH-₽₄                   | 0.05427           | 4  | 83 (19.5)                                  |
| _                         | 0.05527           | 16 | 170 (10.3)                                 |
| $DGTH	ext{-}\mathbb{P}_i$ | 0.05486           | 4  | 49 ( 7.2)                                  |
| _                         | 0.05491           | 16 | 81 (5.1)                                   |

<sup>&</sup>lt;sup>a</sup># iter classical/# iter optimized

#### directions for collaboration

#### Current implementation in 2D and 3D

- At the discrete level, Schur complement type system
  - Krylov solver for the interface system
  - Sparse direct solver (MUMPS) at the subdomain level
- Message passing programming using MPI

#### Potential collaboration topics in the framework of the joint laboratory

On the methdological side

AMG method for DG discretization of the frequency domain Maxwell equations

On the computational side

AMG used as a subdomain solver in the 3D case Hybrid programming for exploiting multiple parallelism levels (e.g. multi-threaded AMG)