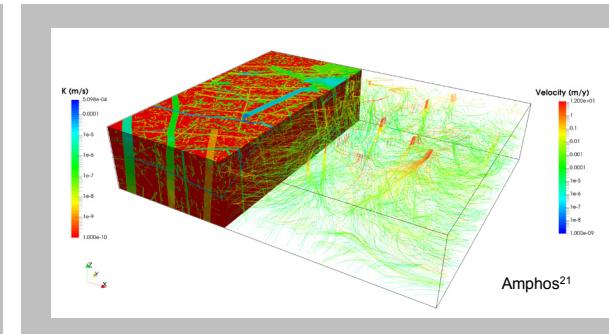
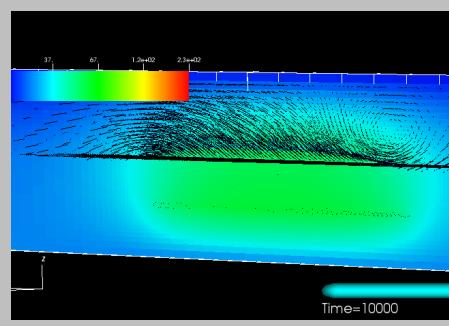


*Exceptional service in the national interest*



$$\begin{aligned}\frac{\partial m_a}{\partial t} &= -\nabla \cdot (\rho_l X_a^l \mathbf{q}_l + \rho_g X_a^g \mathbf{q}_g + \mathbf{J}_a^l + \mathbf{J}_a^g) + q_a^G, \\ \frac{\partial m_w}{\partial t} &= -\nabla \cdot (\rho_l X_w^l \mathbf{q}_l + \rho_g X_w^g \mathbf{q}_g + \mathbf{J}_w^l + \mathbf{J}_w^g) + q_w^G, \\ \frac{\partial e}{\partial t} &= -\nabla \cdot (\rho_l H_l \mathbf{q}_l + \rho_g H_g \mathbf{q}_g - \kappa_{\text{eff}} \nabla T) + q_e^G,\end{aligned}$$



# PFLOTRAN: Practical Application of High Performance Computing to Subsurface Simulation

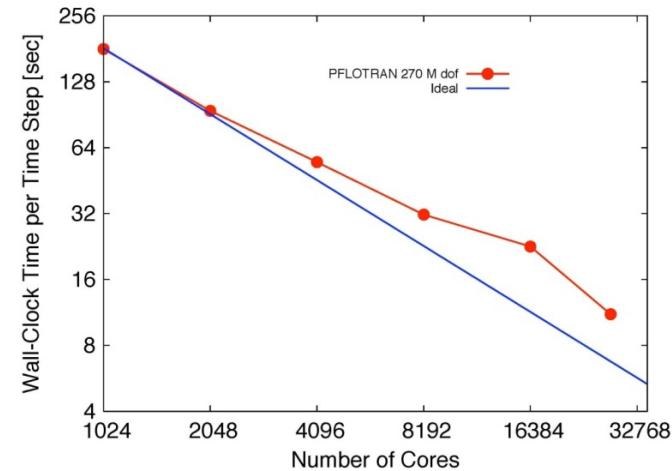
Glenn Hammond



Sandia National Laboratories is a multi-program laboratory managed and operated by Sandia Corporation, a wholly owned subsidiary of Lockheed Martin Corporation, for the U.S. Department of Energy's National Nuclear Security Administration under contract DE-AC04-94AL85000. SAND NO. 2011-XXXX

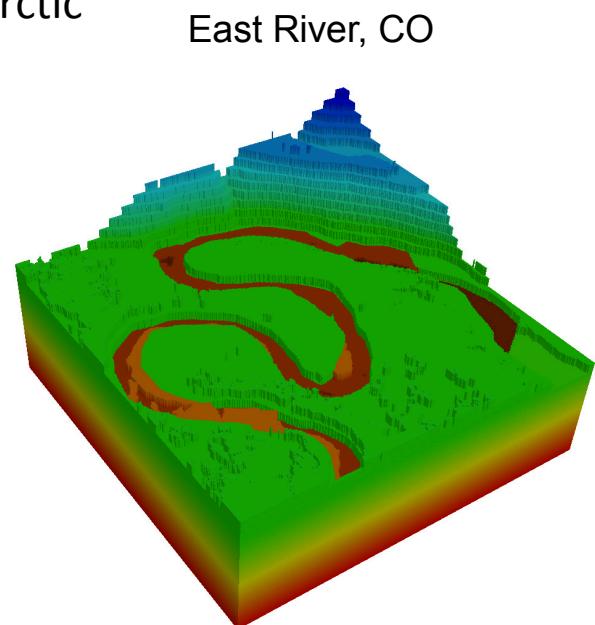
# PFLOTRAN

- Petascale reactive multiphase flow and transport code
- Open source license (GNU LGPL 2.0)
- Object-oriented Fortran 2003/2008
  - Pointers to procedures
  - Classes (extendable derived types with member procedures)
- Founded upon PETSc parallel framework
  - Parallel communication through MPI
  - Parallel I/O through binary HDF5
  - Unstructured domain decomposition through METIS/ParMETIS (Cmake)
- Demonstrated performance
  - Maximum # processor cores: 262,144 (Jaguar supercomputer)
  - Maximum problem size 3.34 billion degrees of freedom
  - Scales to over 10K cores



# Application of PFLOTRAN

- Nuclear waste disposal
  - Waste Isolation Pilot Plant (WIPP) in Carlsbad, NM
  - DOE Used Fuel Disposition Program
  - SKB Forsmark Spent Fuel Nuclear Waste Repository (Sweden, Amhos<sup>21</sup>)
- Climate: coupled overland/groundwater flow; CLM
  - Next Generation Ecosystem Experiments (NGEE) Arctic
  - DOE Earth System Modeling (ESM) Program
- Biogeochemical transport modeling
  - U(VI) fate and transport at Hanford 300 Area
  - Hyporheic zone biogeochemical cycling
    - Columbia River, WA, USA
    - East River, CO, USA
- CO<sub>2</sub> sequestration
- Enhanced geothermal energy
- Radioisotope tracers
- Colloid-facilitated transport



Dipankar Dwivedi, LBNL, 2016

# Numerical Methods

- Spatial discretization
  - Finite volume (2-point flux default)
  - Structured and unstructured grids
- Time discretization: backward Euler
- Nonlinear solver
  - Newton-Raphson
  - Line search/damping with custom convergence criteria
- Linear solver: direct (LU) or iterative (BiCGStab)
- Multi-physics coupling
  - Flow and transport/reaction: sequential
  - Transport and reaction: global implicit
  - Geomechanics and flow/transport: sequential
  - Geophysics and flow/transport: sequential

Deep Borehole  
Waste Disposal

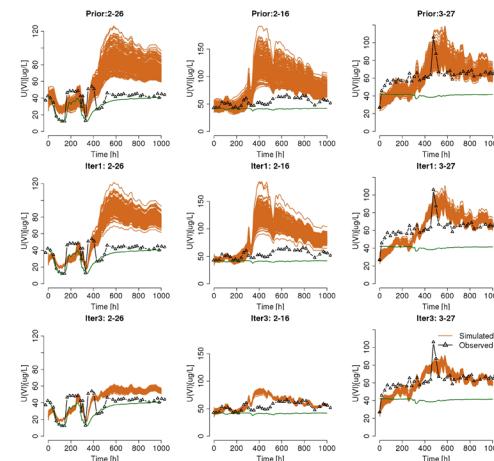


Emily Stein, SNL, 2015

# PFLOTTRAN Computing Capability

- High-Performance Computing (HPC)
  - Increasingly mechanistic process models
  - Highly-refined 3D discretizations
  - Massive probabilistic runs
- Open Source Collaboration
  - Leverages a diverse scientific community
  - Sharing among subject matter experts and stakeholders from labs/universities
- Modern Fortran (2003/2008)
  - Domain scientists remain engaged
  - Modular framework for customization
- Leverages Existing Capabilities
  - Meshing, visualization, HPC solvers, etc.
  - Configuration management, testing, and QA

## Data Assimilation



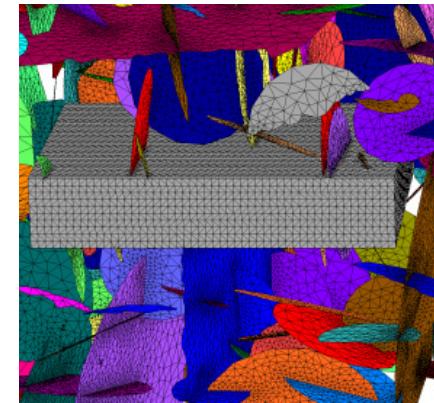
Xingyuan Chen, PNNL, 2011



# PFLOTTRAN Support Infrastructure

- **Mercurial:** distributed source control management tool
- **Bitbucket:** online PFLOTTRAN repository
  - `hg clone https://bitbucket.org/pfotran/pfotran-dev`
  - Source tree
  - Commit logs
  - Wiki
    - Installation instructions
    - Quick guide
    - FAQ (entries motivated by questions on mailing list)
  - Pull requests
  - Issue tracker
- **Buildbot:** automated building and testing (regression and unit)
- **Google Groups:** pfotran-users and pfotran-dev mailing lists
- **Google Analytics:** tracks behavior on Bitbucket

Discrete Fracture Networks



Satish Karra, LANL, 2015

# PFLOTRAN Bitbucket Wiki

Atlassian, Inc. [US] <https://bitbucket.org/pfotran/pfotran-dev/wiki/Home>

Bitbucket Dashboard Teams Repositories Create Find a repository... ?

Wiki [Clone wiki](#) [Create page](#)

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[pfotran-dev / Home](#)

# PFLOTRAN

PFLOTRAN is an open source, state-of-the-art massively parallel subsurface flow and reactive transport code. The code is developed under a GNU LGPL license allowing for third parties to interface proprietary software with the code, however any modifications to the code itself must be documented and remain open source. PFLOTRAN is written in object oriented, free formatted Fortran 2003. The choice of Fortran over C/C++ was based primarily on the need to enlist and preserve tight collaboration with experienced domain scientists, without which PFLOTRAN's sophisticated process models would not exist.

PFLOTRAN employs parallelization through domain decomposition using the MPI-based PETSc framework with pfotran-dev tracking the developer version of PETSc (i.e. [petsc-dev](#)) available through Bitbucket.

[PFLOTRAN Performance](#)

## Installation Instructions

[Windows](#)  
[Windows No METIS](#)  
[Windows Cygwin GNU](#)  
[Linux](#)  
[Legacy Build](#)

## Documentation

[Code Development](#)  
[FAQ](#)

# PFLOTTRAN Bitbucket Commits

Atlassian, Inc. [US] https://bitbucket.org/pflotran/pflotran-dev/commits/all?page=3

Bitbucket Dashboard Teams Repositories Create Find a repository... ? Find commits

## Commits

All branches

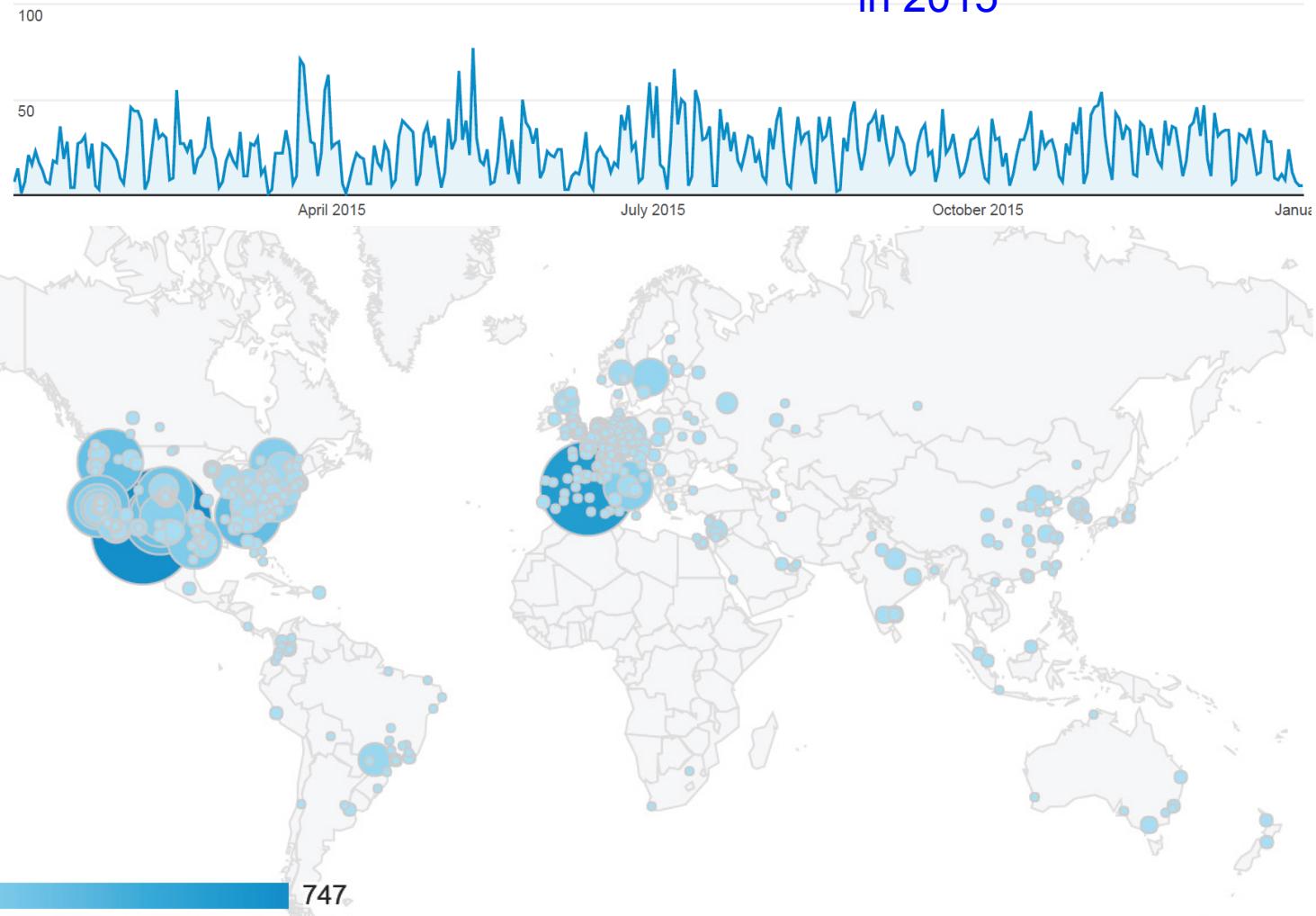
Author	Commit	Message	Date
Glenn Hammond	b3b0cd0	More refactoring of init()	2014-12-03
Peter Lichtner	3b65edb	Minor changes to user manual, updated ion exchange.	2014-12-05
Gautam Bisht	e47c7a9	lowered the min pressure value for which THInitGuessCheck() returns a	2014-12-04
Glenn Hammond	57096b1 M	Merged in iamhaho/pflotran-dev_heeho (pull request #111)	2014-12-04
Heeho Park	47315f1	added testrpf_linear_burdine	2014-12-04
Heeho Park	0780f9b	Added analytical dkr_Se solutions to gas rel perms	2014-12-04
Heeho Park	c4bc5bc5	added SF,CP,RPF for Linear and TOUGH2IRP7 functions	2014-12-04
Gautam Bisht	5f2ebce	added a function to check the guess provided to THResidual function. The	2014-12-04
Gautam Bisht	7c91ebe M	merged	2014-12-03
Gautam Bisht	69dc64c	setting quantities for gas to be zero for DALL_AMICO ice-formulation in TH	2014-12-03
Glenn Hammond	5a1614c M	Merged in iamhaho/pflotran-dev_heeho (pull request #110)	2014-12-03
Heeho Park	1e06ff2	the most important file (pflotran.F90) name was missing. it is added now.	2014-12-03
Nathan Collier	fa2d429	made output process-model identifier lines to be of uniform length (80	2014-12-03
Glenn Hammond	6972c15 M	merge	2014-12-02
Glenn Hammond	7dd36ab M	merge	2014-12-02
Glenn Hammond	3f59853	Fixed memory leaks in subsurface	2014-12-02
Glenn Hammond	18835b0 M	merge	2014-12-02
Glenn Hammond	c74bd90 M	manual merge	2014-12-02

# PFLOTRAN Buildbot

Waterfall					
last build	dev-alt-gnu-linux failed shell_2	dev-alt-gnu-mac build successful	dev-std-gnu-linux build successful	dev-std-gnu-mac build successful	waterfall help
current activity	waiting next in ~ 9 hrs 34 mins at 01:00	waiting 1 pending next in ~ 9 hrs 34 mins at 01:00	building ETA in ~ 7 mins at 15:32 next in ~ 9 hrs 34 mins at 01:00	building ETA in ~ 4 mins at 15:30 next in ~ 9 hrs 34 mins at 01:00	
PST	<a href="#">changes</a>	<a href="#">dev-alt-gnu-linux</a>	<a href="#">dev-alt-gnu-mac</a>	<a href="#">dev-std-gnu-linux</a>	<a href="#">dev-std-gnu-mac</a>
15:25:14		<a href="#">test pflotran failed stdio</a>		<a href="#">updating stdio</a>	<a href="#">testing pflotran stdio</a>
15:21:04				<a href="#">Build 292</a>	
15:20:13		<a href="#">build pflotran stdio</a>			<a href="#">build pflotran stdio</a>
15:18:37					<a href="#">petsc stdio</a>
					<a href="#">set build script path</a>
					<a href="#">property 'pflotran_dir' set stdio property changes</a>
					<a href="#">build flags : standard</a>
					<a href="#">compiler : gnu</a>
					<a href="#">update stdio</a>
15:18:17					<a href="#">Build 296</a>
15:15:37	<a href="#">Glenn Hammond</a>				
01:15:56					
01:14:29			<a href="#">test pflotran</a>		

# Google Analytics

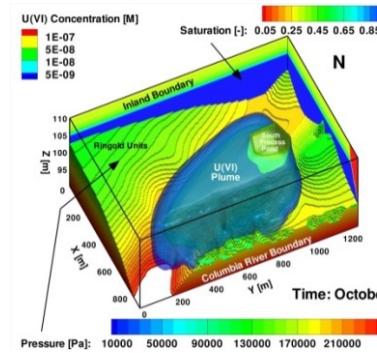
## Hits on PFLOTRAN Bitbucket site in 2015



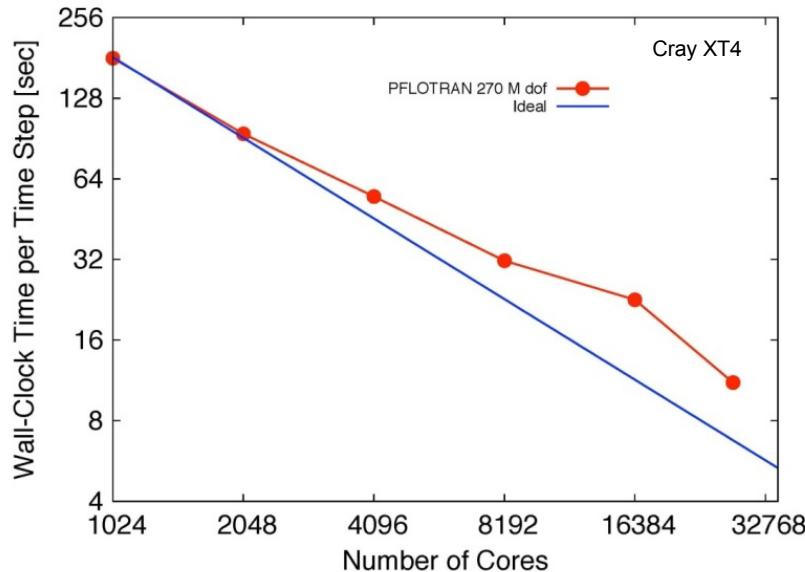
# PFLOTRAN: Parallel Performance

- Scalability is good below ~10K processes
- Above ~10K cores, parallel performance degrades in the solvers and I/O
  - Parallel solvers
    - Breakdown in parallel preconditioners within Newton-Krylov solvers
    - Increasing communication cost (i.e. global reduction)
  - Parallel I/O
    - Bottlenecks in collective parallel I/O
- Future challenges
  - Transition to parallelism through accelerators (e.g. GPUs)

# Solver Scalability

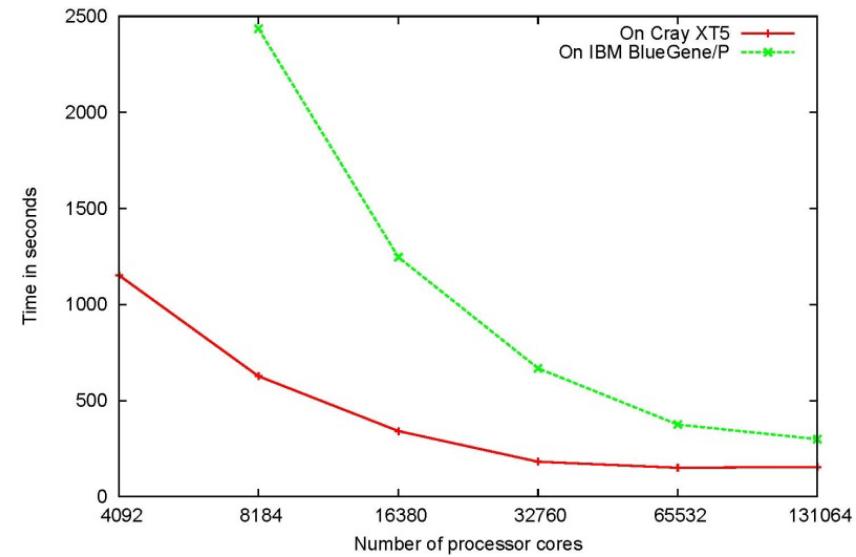


270 Million DOF Flow



BCGStab w/ block Jacobi  
R. Mills, 2008

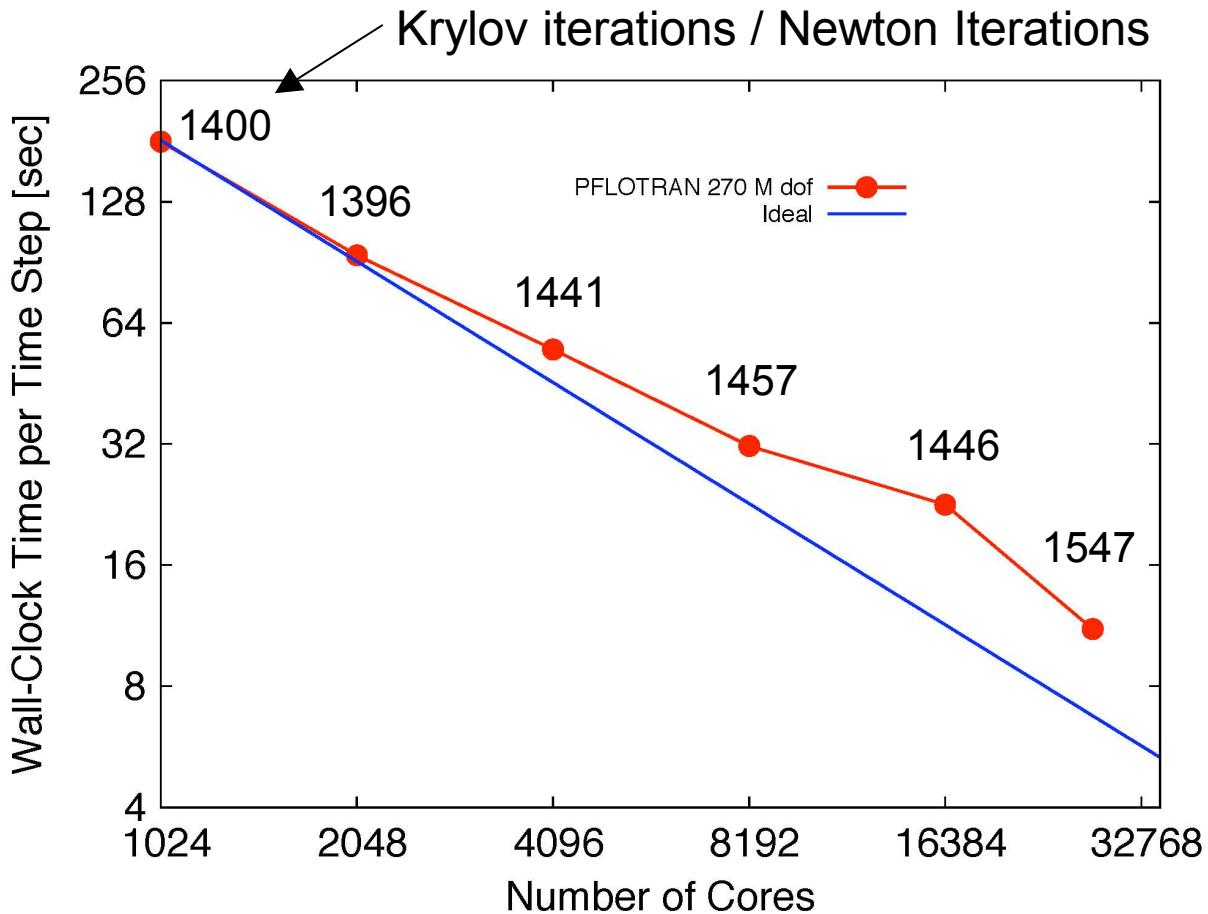
1 Billion DOF Transport



BCGStab w/ block Jacobi  
Sripathi & Mahinthakumar, 2009

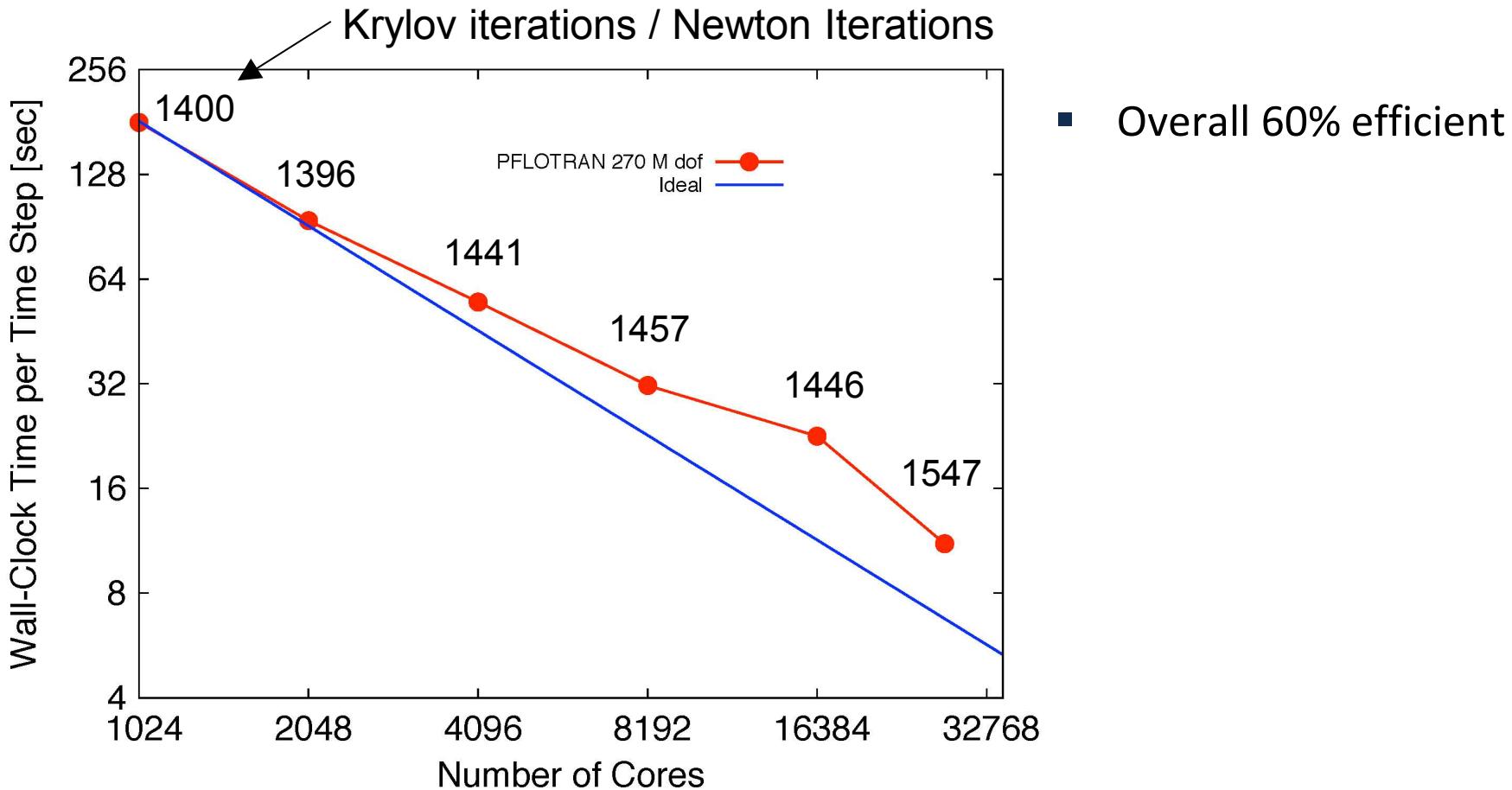
# PFLOTRAN Performance on Jaguar (XT4)

270 Million Flow DOFs



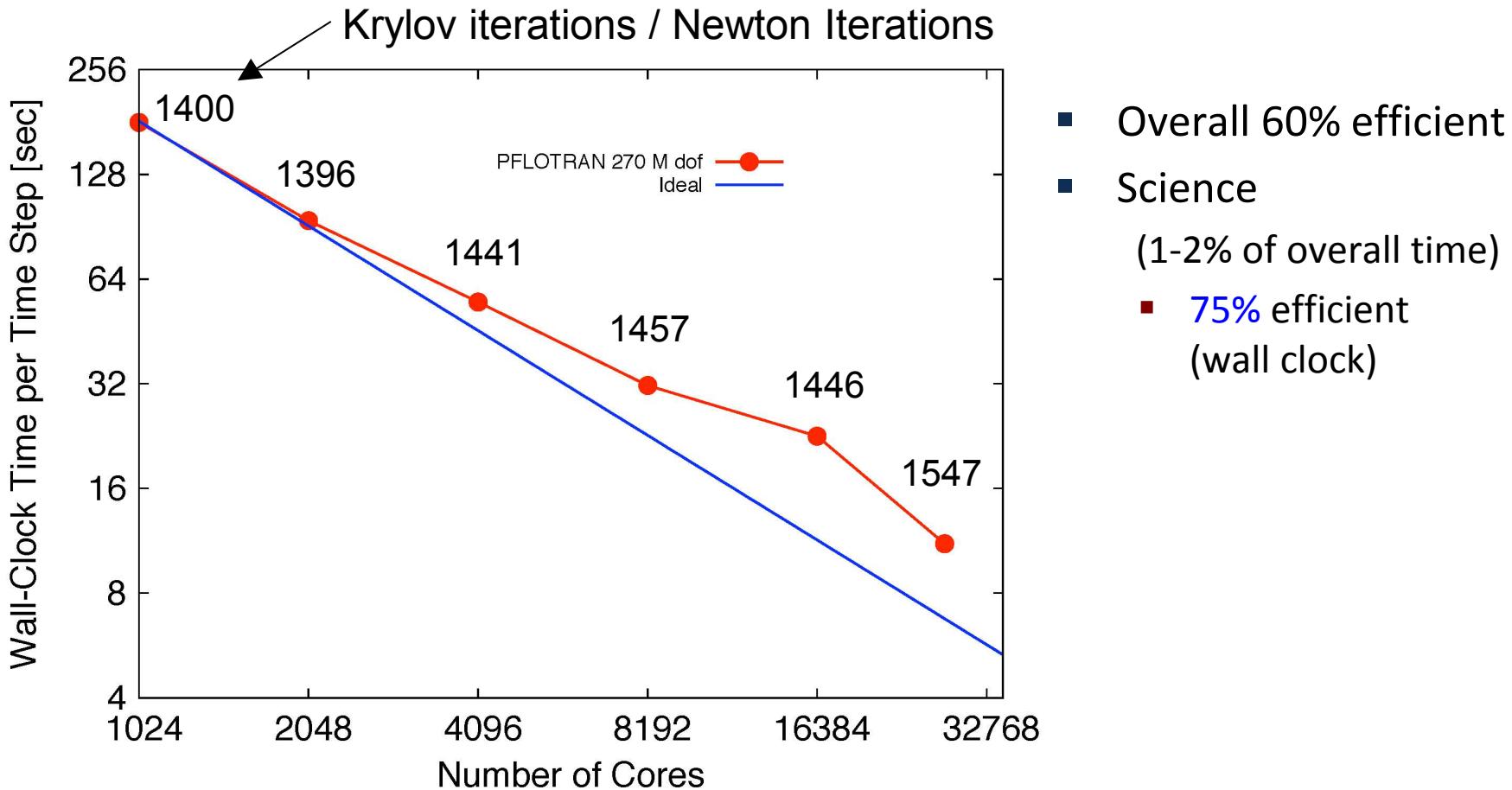
# PFLOTRAN Performance on Jaguar (XT4)

270 Million Flow DOFs



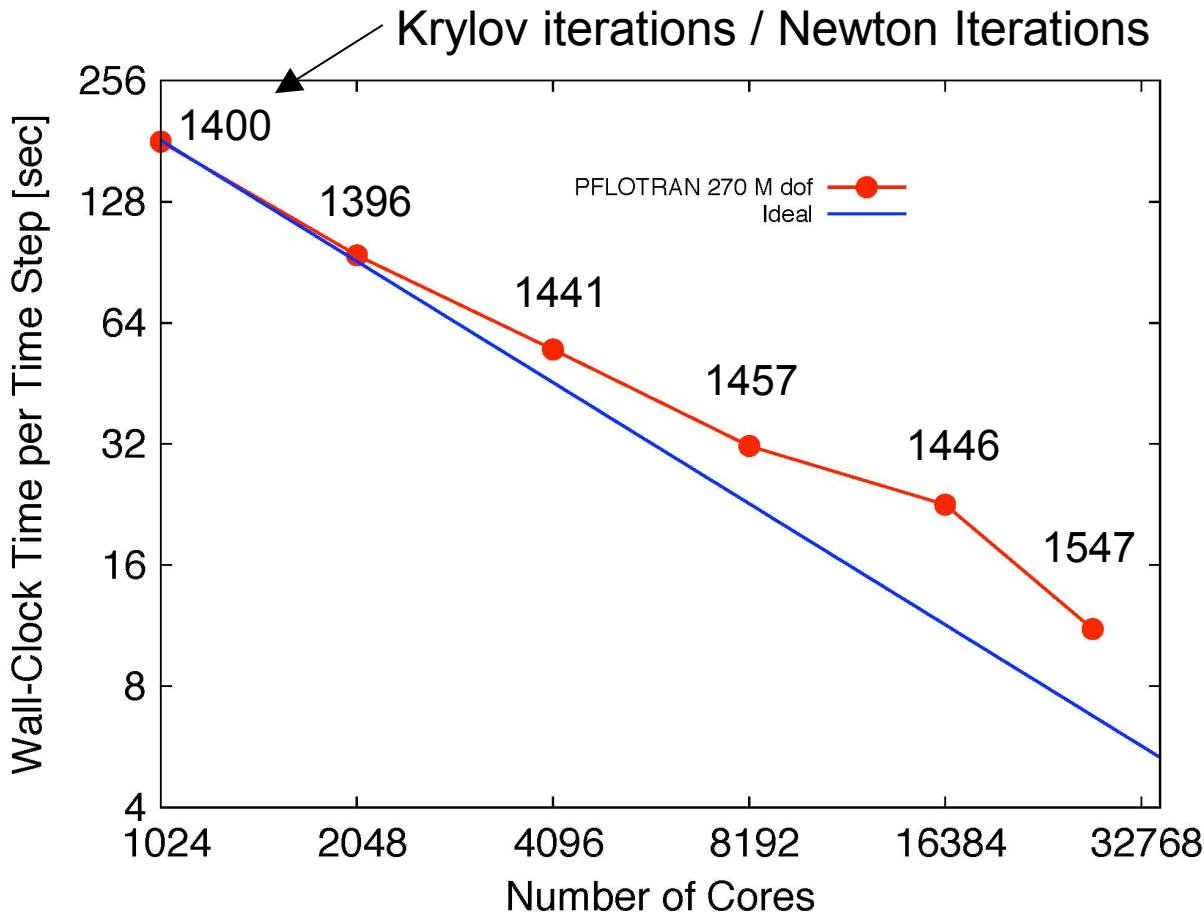
# PFLOTRAN Performance on Jaguar (XT4)

270 Million Flow DOFs



# PFLOTRAN Performance on Jaguar (XT4)

270 Million Flow DOFs



- Overall 60% efficient
- Science (1-2% of overall time)
  - 75% efficient (wall clock)
- Solvers (96% of overall time)
  - 90% efficient (iteration count)
  - 64% efficient (wall clock)

# PFLOTRAN Performance on Jaguar

Processor Cores	4000	8000
Problem Size (dofs)	64.8 million	129.6 million
Problem Size / Processor Core	16200	16204
Krylov Iterations / Newton Iterations	418.4	462.6 (10.6% difference)
Nonlinear Solver Wall Clock Time (sec)	2531	2844 (12.4% difference)

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Breakdown in “weak” scalability

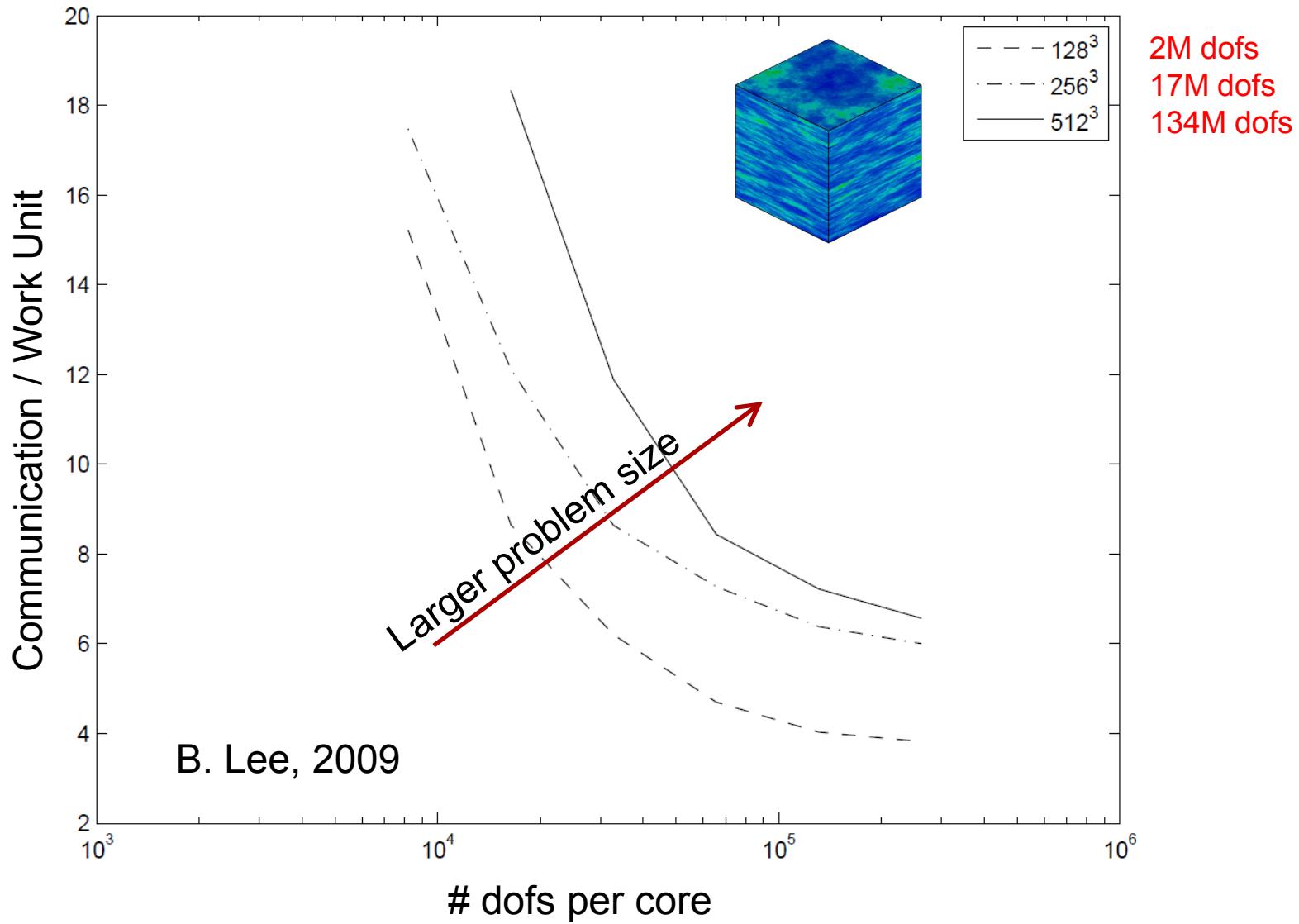
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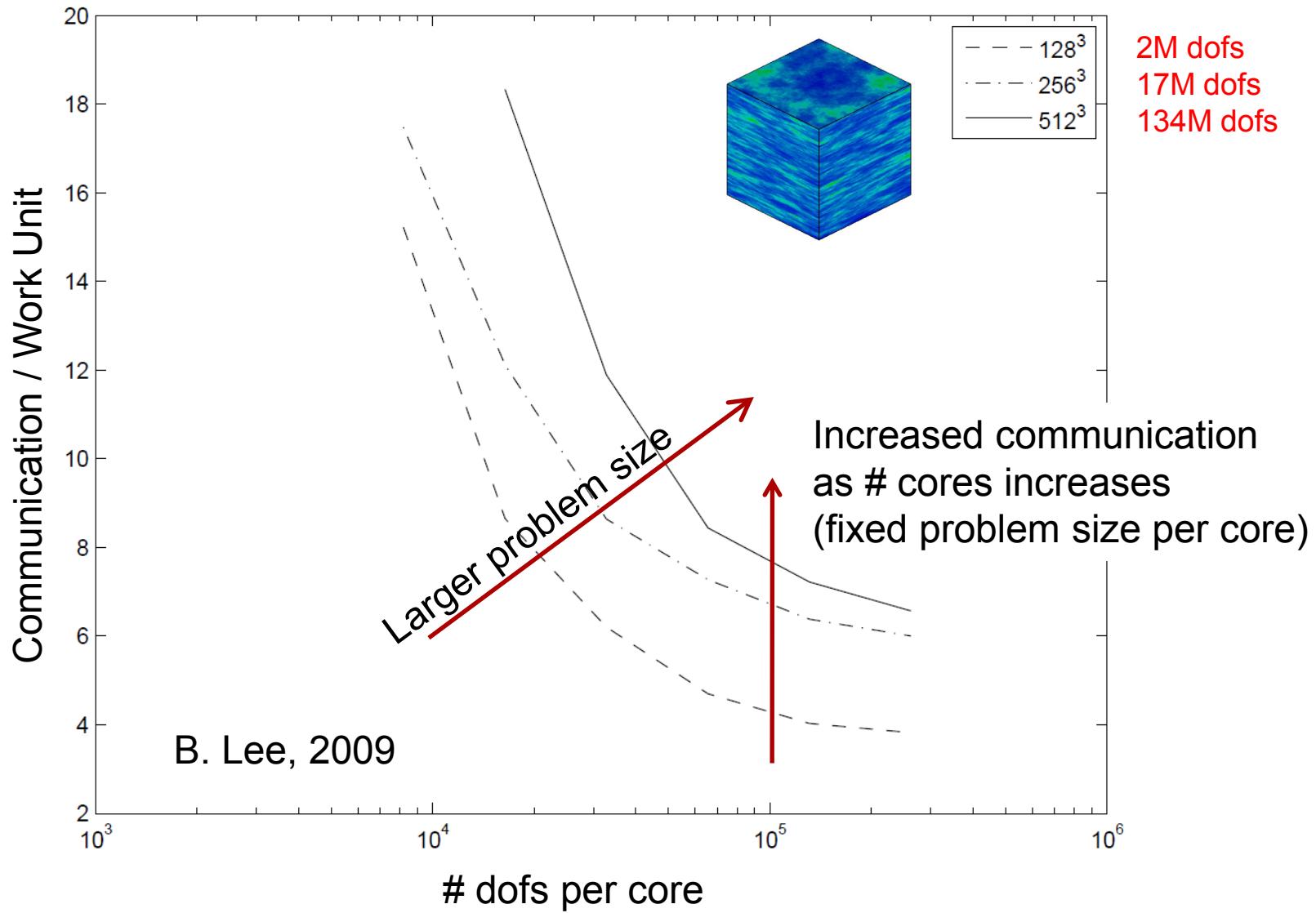
Breakdown in “weak” scalability

Global reduction communication overhead

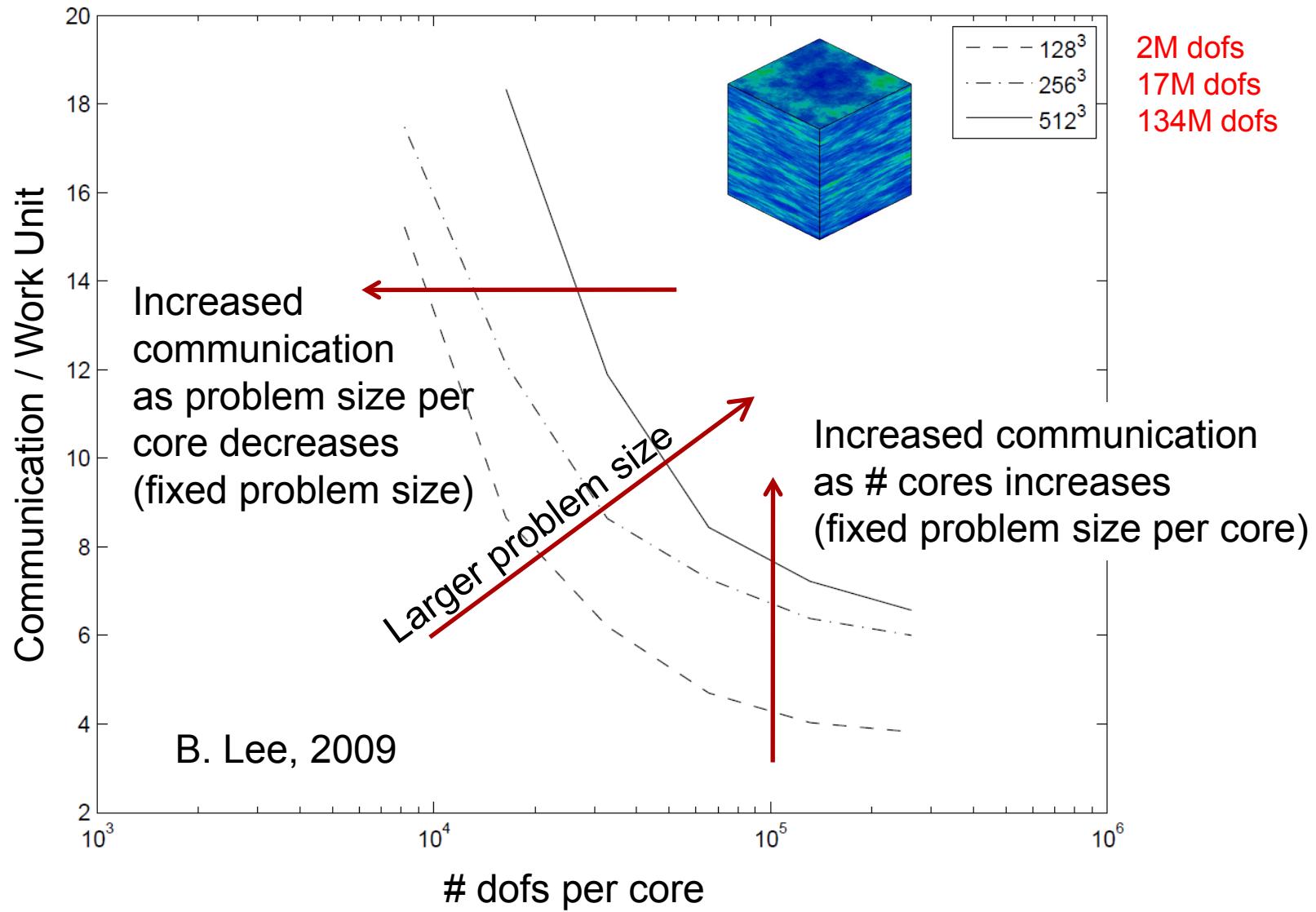
# Geometric Multigrid (hype PFMG)



# Geometric Multigrid (hype PFMG)

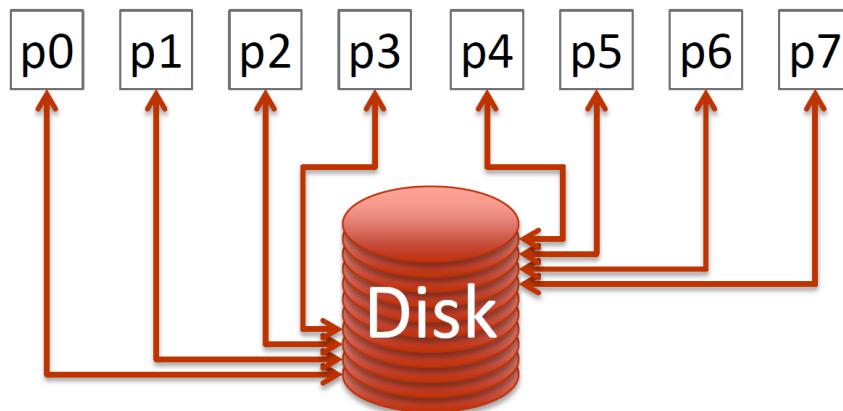


# Geometric Multigrid (hype PFMG)

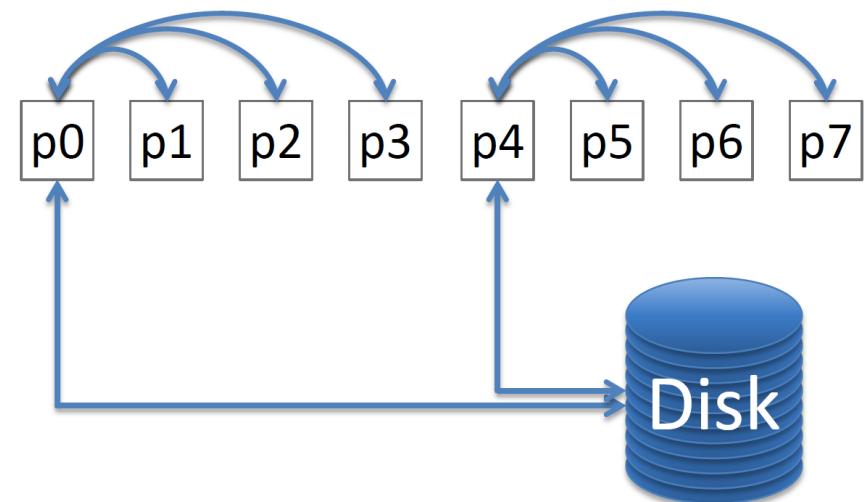


# Scalable Parallel I/O through HDF5

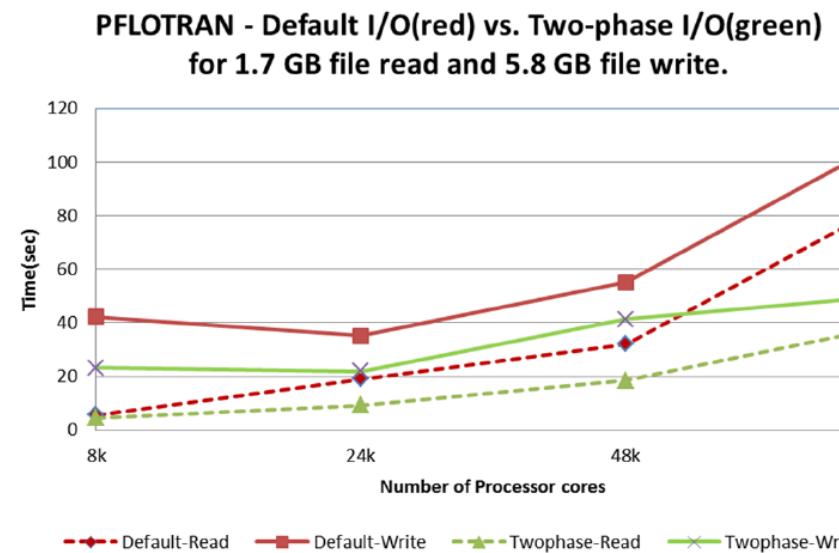
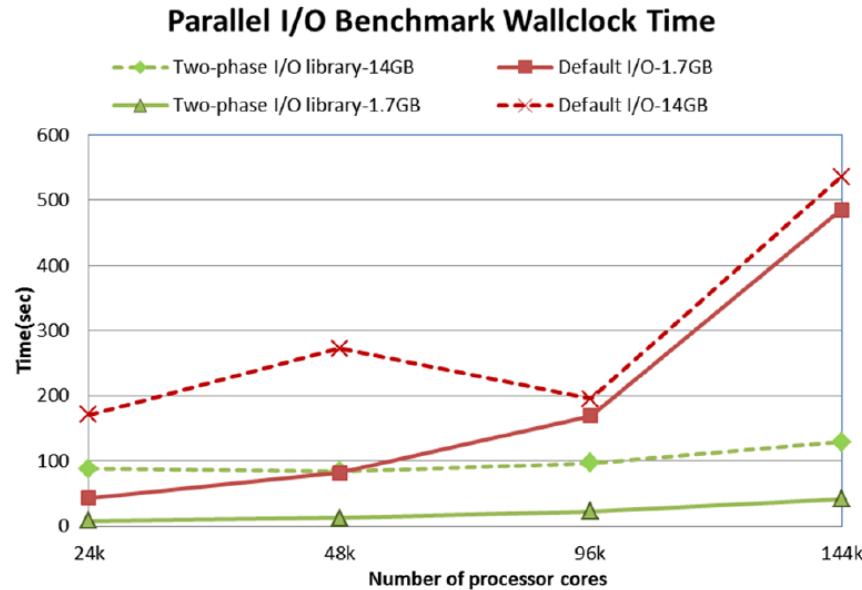
Collective parallel I/O for jobs with  
 $< \sim 10,000$  cores



Two-phase parallel I/O for jobs with  
 $> \sim 10,000$  cores



# Scalable Parallel I/O through SCORPIO



SCORPIO: A Scalable Two-Phase Parallel I/O Library With Application To A Large Scale Subsurface Simulator

# PFLOTRAN Performance: Accelerators



- In 2011 timeframe, PFLOTRAN was slated as one of six Tier 1 apps at the Oak Ridge Leadership Computing Facility to be ported from Jaguar to Titan for acceptance of Titan from Cray.
  - “The proposal is to do a **one-time modification** of Pflotran source code for the future. This would make the code high performing and flexible in supporting a variety of highly parallel processors and different accelerator programming models.” - Cray
- The plan was to begin with **point-wise kernels** and then move on to parallelize the global solves across the grid.
- The **chemical reaction** kernel within PFLOTRAN was refactored to accommodate GPUs through OpenMP/CUDA directives instrumented by Cray/NVIDIA engineers.

# PFLOTRAN Performance: Accelerators

Before:

```
allocate(auxvar%total(reaction%naqcomp,option%nphase))
```

After:

```
allocate(auxvar%total(chunk_size,num_threads, &
                      reaction%naqcomp,option%nphase))

do i = 1, ncomp
  icomp = reaction%eqcplxspecid(i,icplx)
  auxvar%total(ichunk,ithread,icomp,iphase) = &
    auxvar%total(ichunk,ithread,icomp,iphase) + &
    reaction%eqcplxstoich(i,icplx)* &
    auxvar%sec_molal(ichunk,ithread,icplx)
enddo
```

# PFLOTRAN Performance: Accelerators



- Final Speedup
  - ~14× for an exaggerated biogeochemical system composed of ~30 chemical species.
  - <4× on a more realistic biogeochemical system (10-15 species)

# PFLOTRAN Performance: Accelerators

- Final Speedup

- $\sim 14\times$  for an exaggerated biogeochemical system composed of  $\sim 30$  chemical species.
- $<4\times$  on a more realistic biogeochemical system (10-15 species)

## Amdahl's Law

$$T_p = s T_1 + \frac{(1-s)T_1}{p} \Rightarrow T_p = s T_1$$

$T_p$  = parallel time

$T_1$  = serial time

$p$  = # processes

$s$  = sequential

or **non-GPU**  
fraction

# PFLOTRAN Performance: Accelerators

- Final Speedup

- ~14× for an exaggerated biogeochemical system composed of ~30 chemical species.
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## Amdahl's Law

$$T_p = s T_1 + \frac{(1-s)T_1}{p} \Rightarrow T_p = s T_1$$

$$s = 0.2$$

$$T_p = 0.2 T_1$$

Maximum Speedup = 5x

$T_p$  = parallel time

$T_1$  = serial time

$p$  = # processes

$s$  = sequential

or non-GPU  
fraction

# Conclusion

- Presentation support provided by the IDEAS (Interoperable Design of Extreme-scale Application Software) Project funded by the United States Department of Energy Office of Science Advanced Scientific Computing Research and Biological and Environmental Research Programs



# PFLOTTRAN Multi-Physics Capability



- Flow
  - Single phase, variably-saturated
  - Multiphase gas-liquid
  - Interchangeable constitutive models and equations of state
- Energy
  - Thermal conduction and convection
- Multi-Component Transport
  - Advection
  - Hydrodynamic dispersion
- Chemical Reaction
  - Aqueous speciation
    - Ion activity models
  - Mineral precipitation-dissolution
  - Sorption
    - Isotherm-based
    - Ion exchange
    - Surface complexation
      - Equilibrium
      - Kinetic / multirate kinetic
- Microbiological
  - Biomass
  - Inhibition
- Radioactive decay with daughter products

# Governing Equations

## Multiphase Air-Water-Energy

### Mass Conservation

$$\frac{\partial}{\partial t} \phi (s_l \rho_l X_a^l + s_g \rho_g X_a^g) = -\nabla \cdot (\rho_l X_a^l \mathbf{q}_l + \rho_g X_a^g \mathbf{q}_g + \mathbf{J}_a^l + \mathbf{J}_a^g) + q_a^G$$

$$\frac{\partial}{\partial t} \phi (s_l \rho_l X_w^l + s_g \rho_g X_w^g) = -\nabla \cdot (\rho_l X_w^l \mathbf{q}_l + \rho_g X_w^g \mathbf{q}_g + \mathbf{J}_w^l + \mathbf{J}_w^g) + q_w^G$$

### Energy Conservation

$$\frac{\partial}{\partial t} (\phi [s_l \rho_l U_l + s_g \rho_g U_g] + (1 - \phi) C_p^{\text{rock}} \rho_{\text{rock}} T) = -\nabla \cdot (\rho_l H_l \mathbf{q}_l + \rho_g H_g \mathbf{q}_g - \kappa_{\text{eff}} \nabla T) + q_e^G$$

### Darcy Flux

$$\mathbf{q}_\alpha = -\frac{kk_\alpha}{\mu_\alpha} \nabla (p_\alpha - W_\alpha \rho_\alpha g z), \quad (\alpha = l, g)$$

### Aqueous Diffusion

$$\mathbf{J}_a^l = -\tau \phi s_l D_l \rho_l \nabla X_a^l$$

### Gas Diffusion

$$\mathbf{J}_a^g = -\tau \phi s_g D_g^0 \left( \frac{T}{T_K} \right)^\theta \frac{p_0}{p_g} \rho_g \nabla X_a^g$$

# Governing Equations

## Biogeochemical Transport

### Mass Conservation

$$\frac{\partial}{\partial t} (\phi s \Psi_j) + \nabla \cdot (q - \phi s D \nabla) \Psi_j = Q_j - \sum_r \nu_{jr} I_r$$

$$\Psi_j = C_j + \sum_{i=1}^{N_X} \nu_{ji} K_i \prod_{j'=1}^{N_c} C_{j'}^{\nu_{j'i}}$$