

# Experiments with Linear Algebra Operations

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- Autotuning
- May work well for certain computations, but

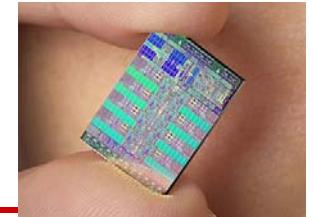
# *“What role will accelerators will play in the future HPC systems?”*

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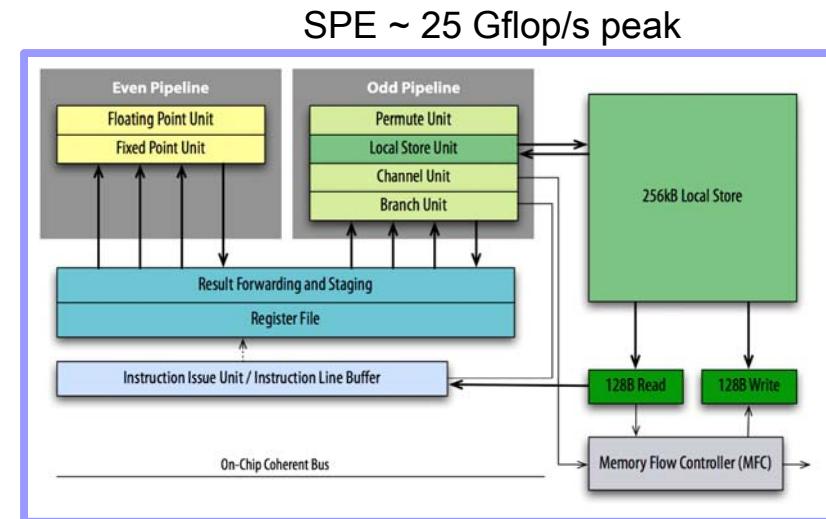
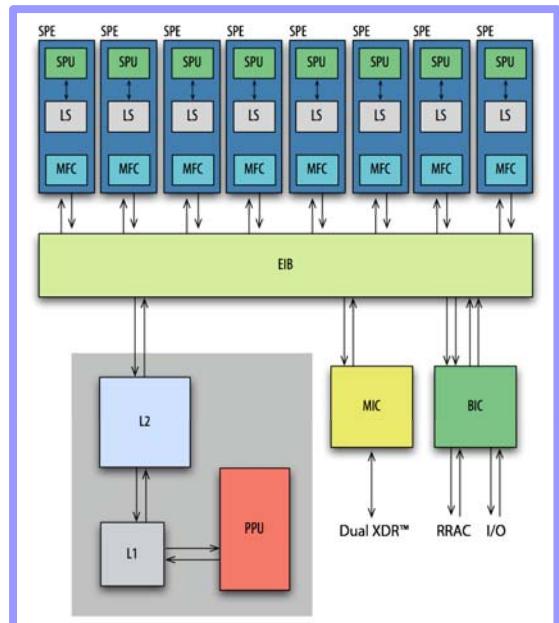
- Conventional parallel processing vs. accelerator technologies: challenges and opportunities
- Can (and under what circumstances) systems based on other than CPU processing elements (such as FPGA, Cell, GPU) deliver performance above what is achievable on modern multiprocessors?
- The challenge of software development and programming models for effective use of accelerator technologies
- What vendors can/should do to satisfy the needs of computational scientists interested in using these architectures?



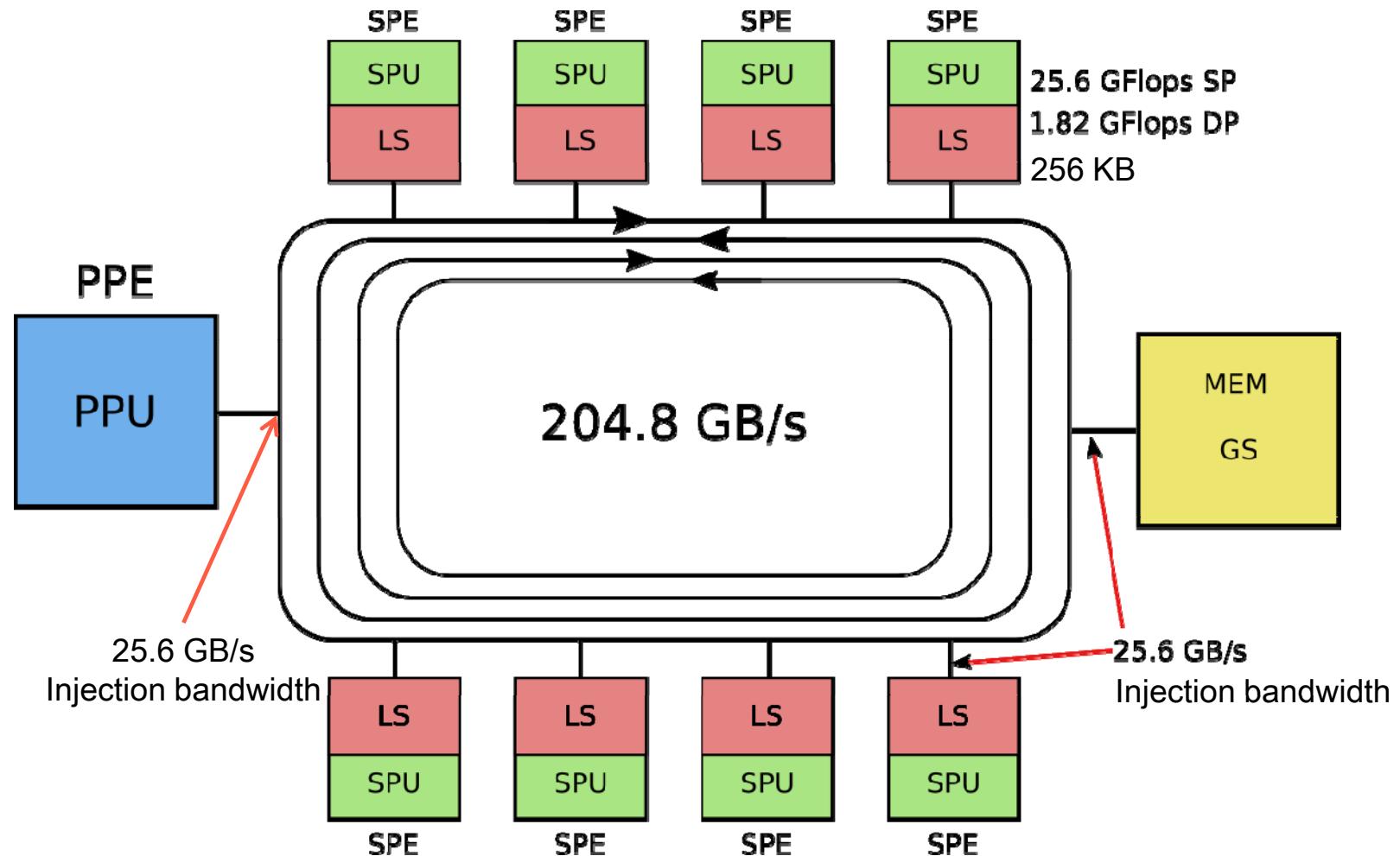
# Exploiting Mixed Precision



- Current Version of the Cell has > a factor of 10 between single precision and double precision performance (204 GFlop/s to 14 GFlop/s)!
  - Next version this will narrow to a factor of 2 (as in most common processors today)
- We became interested in looking for ways to exploit the speed of SP but still retain the accuracy of DP.



# Moving Data Around on the Cell



Worst case memory bound operations (no reuse of data)

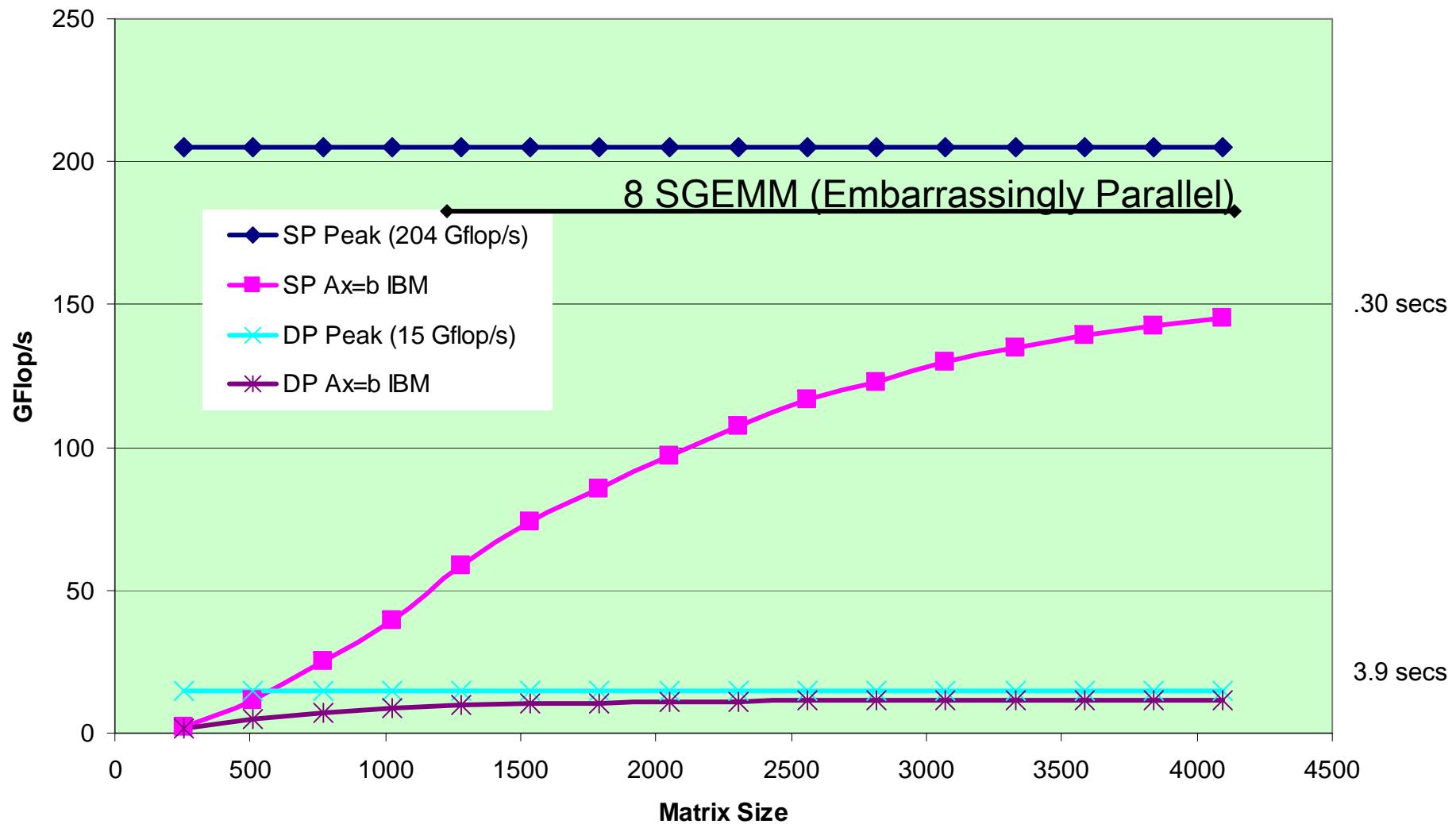
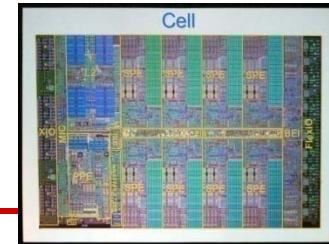
3 data movements (2 in and 1 out) with 2 ops (SAXPY)

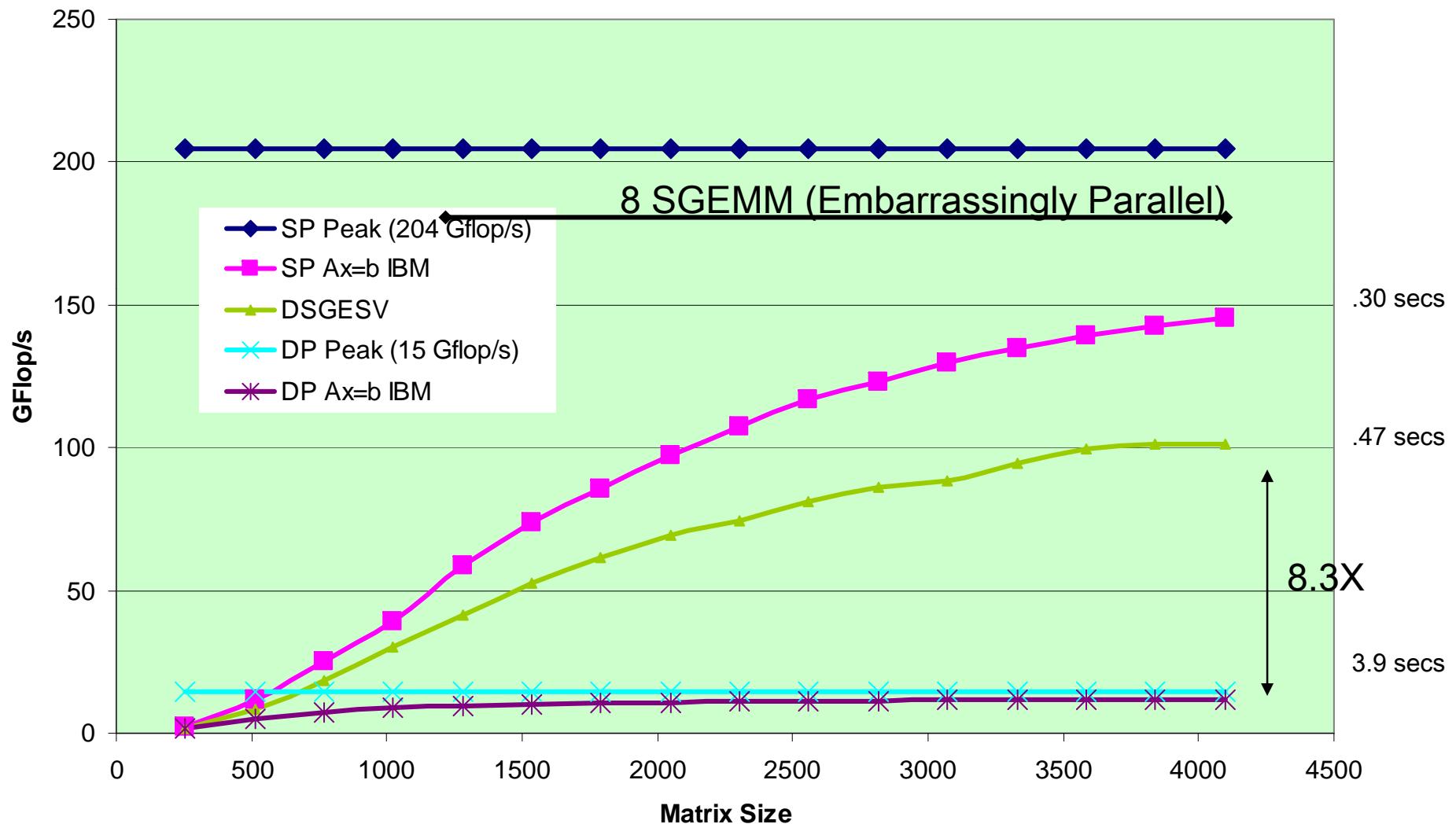
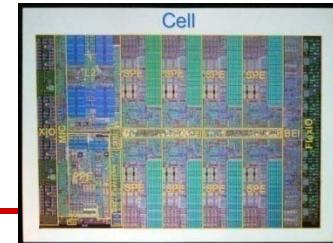
For the cell would be 4.6 Gflop/s ( $25.6 \text{ GB/s} * 2 \text{ ops} / 12 \text{ B}$ ) in SP.

# Linear Algebra Iterative Refinement

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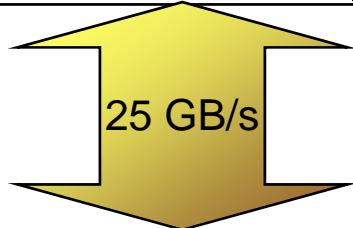
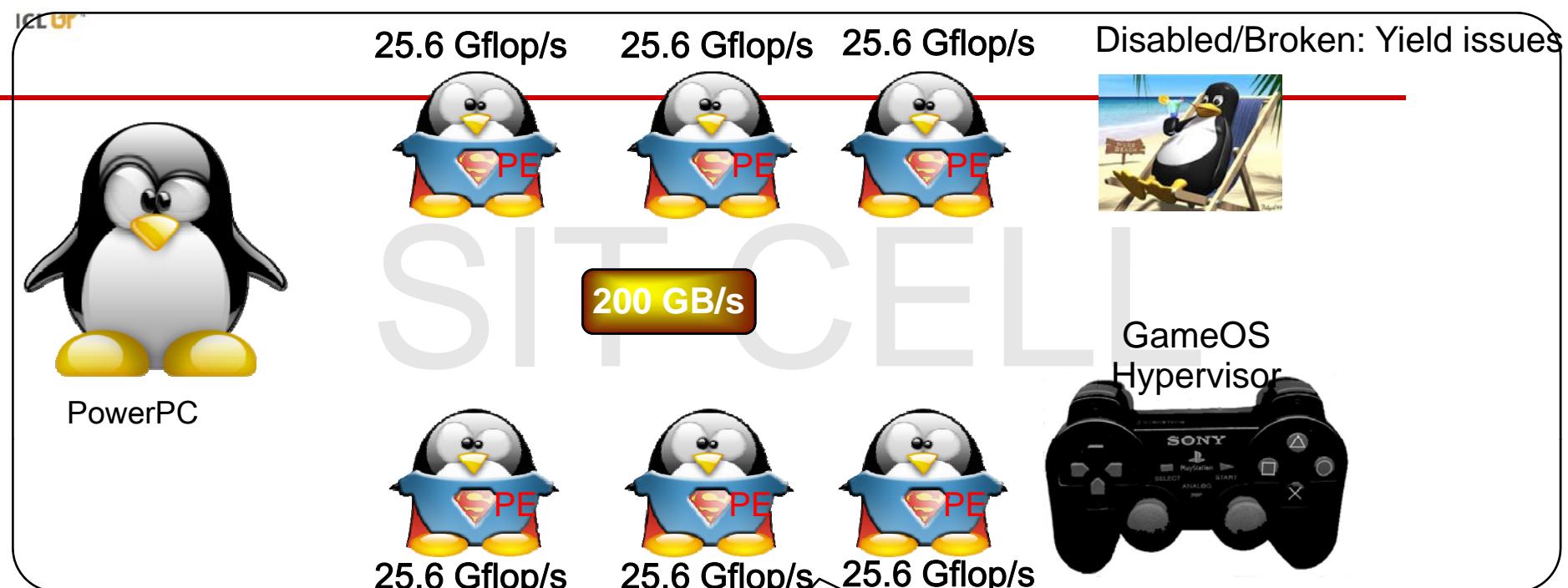
- Exploit 32 bit floating point as much as possible.
  - Especially for the bulk of the computation
- Correct or update the solution with selective use of 64 bit floating point to provide a refined results
- Intuitively:
  - Compute a 32 bit result,
  - Calculate a correction to 32 bit result using selected higher precision and,
  - Perform the update of the 32 bit results with the correction using high precision.

IBM Cell 3.2 GHz,  $Ax = b$ 

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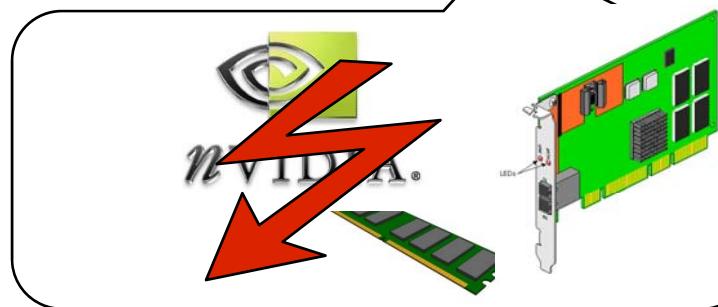


# PS3 Hardware Overview

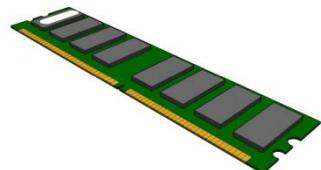


25 GB/s

256 MiB



3.2 GHz  
25 GB/s injection bandwidth  
200 GB/s between SPEs  
32 bit peak perf  $6 \times 25.6 \text{ Gflop/s}$   
153.6 Gflop/s peak  
64 bit peak perf  $6 \times 1.8 \text{ Gflop/s}$   
10.8 Gflop/s peak  
1 Gb/s NIC  
256 MiB memory



# Matrix Multiple on a 4 Node PlayStation3 Cluster

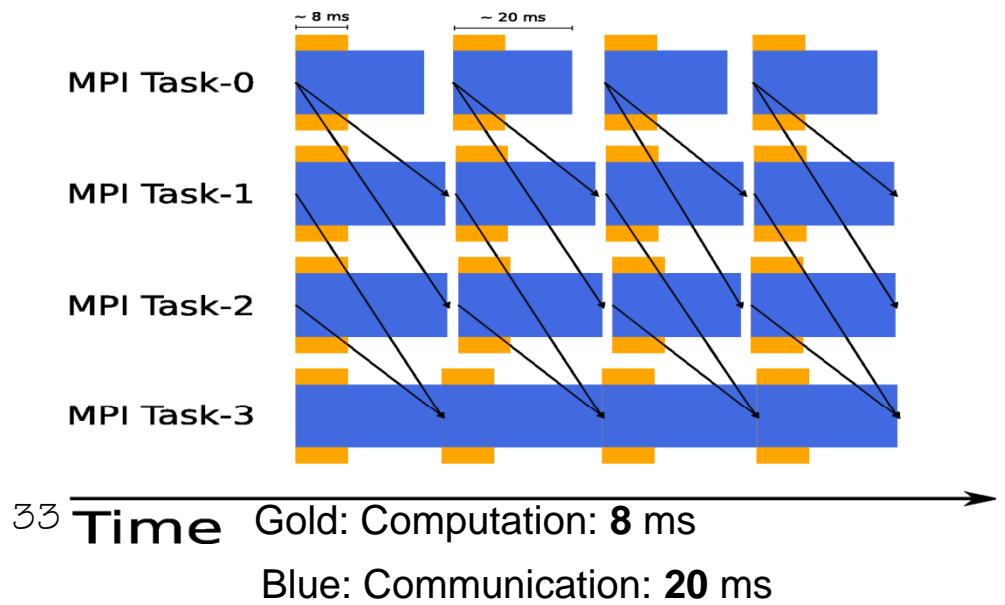
## What's good

- Very cheap: ~4\$ per Gflop/s (with 32 bit fl pt theoretical peak)
- Fast local computations between SPEs
- Perfect overlap between communications and computations is possible (Open-MPI running):
  - PPE does communication via MPI
  - SPEs do computation via SGEMMs



## What's bad

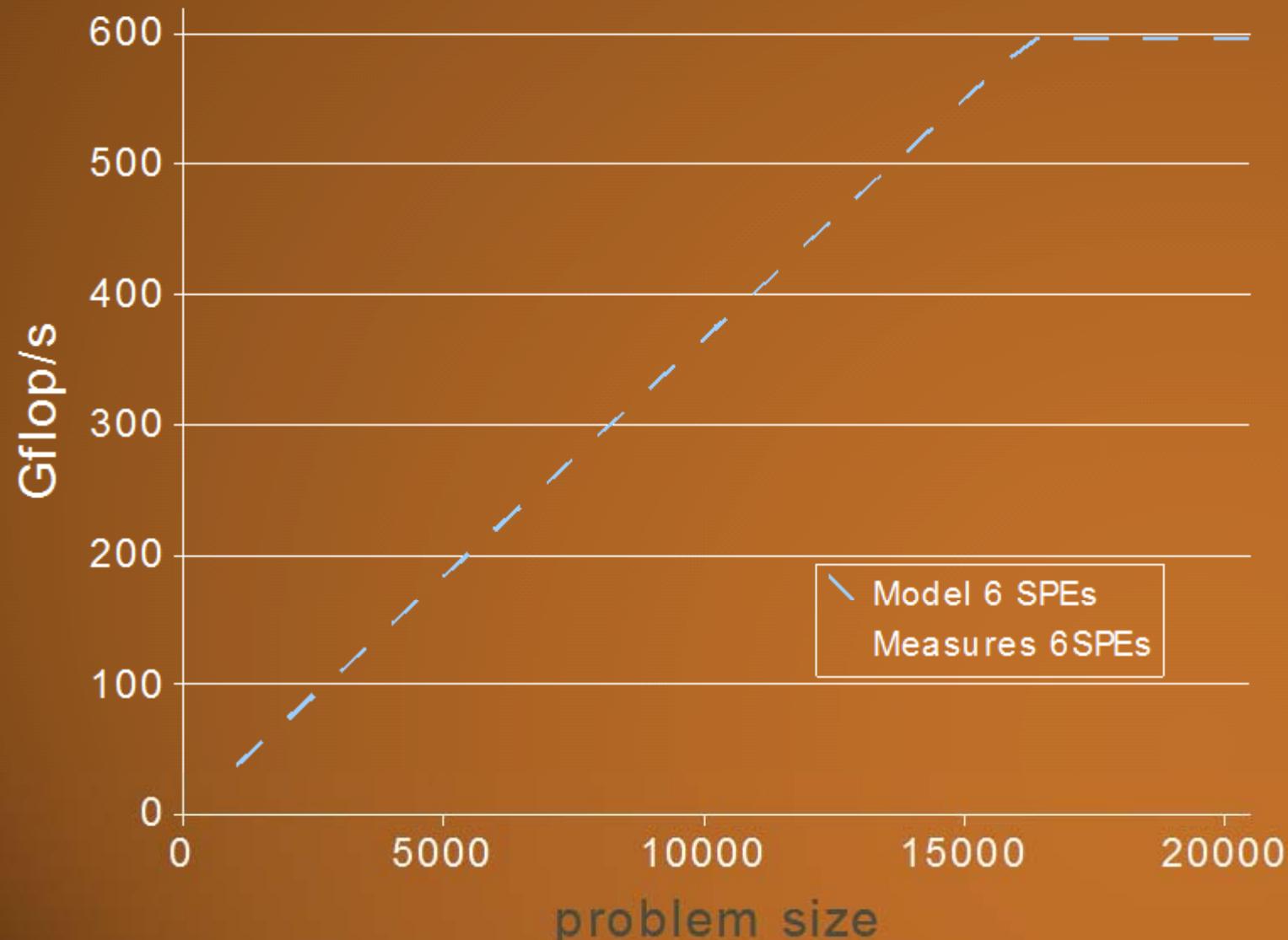
- Gigabit network card. 1 Gb/s is too little for such computational power (150 Gflop/s per node)
- Linux can only run on top of GameOS (hypervisor)
  - Extremely high network access latencies (120 usec)
  - Low bandwidth (600 Mb/s)
- Only 256 MB local memory
- Only 6 SPEs



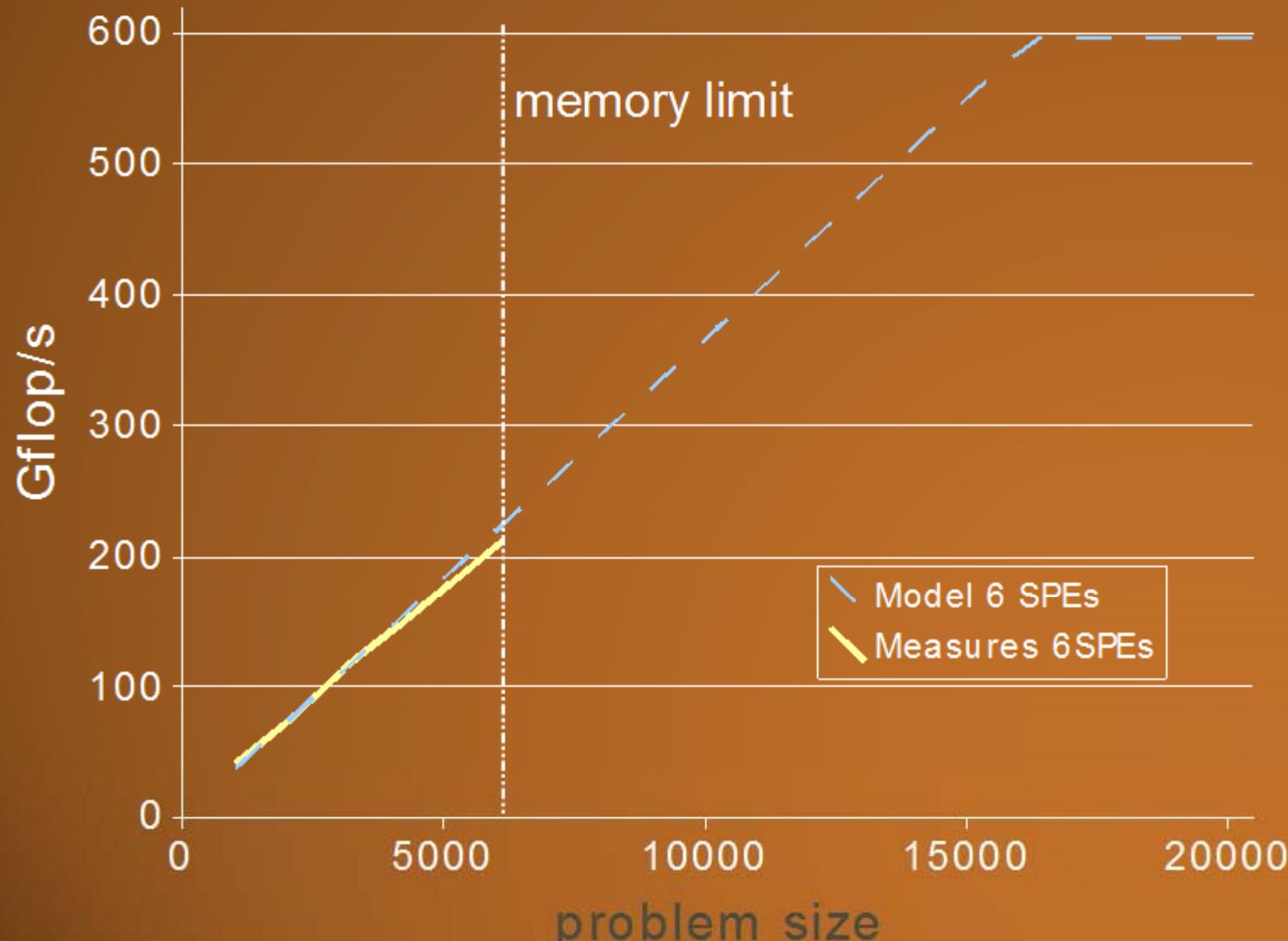
# SUMMA on a 2x2 PlayStation3 cluster

ICL OR

## SUMMA -- Model vs Measured 6 SPEs



## SUMMA -- Model vs Measured 6 SPEs



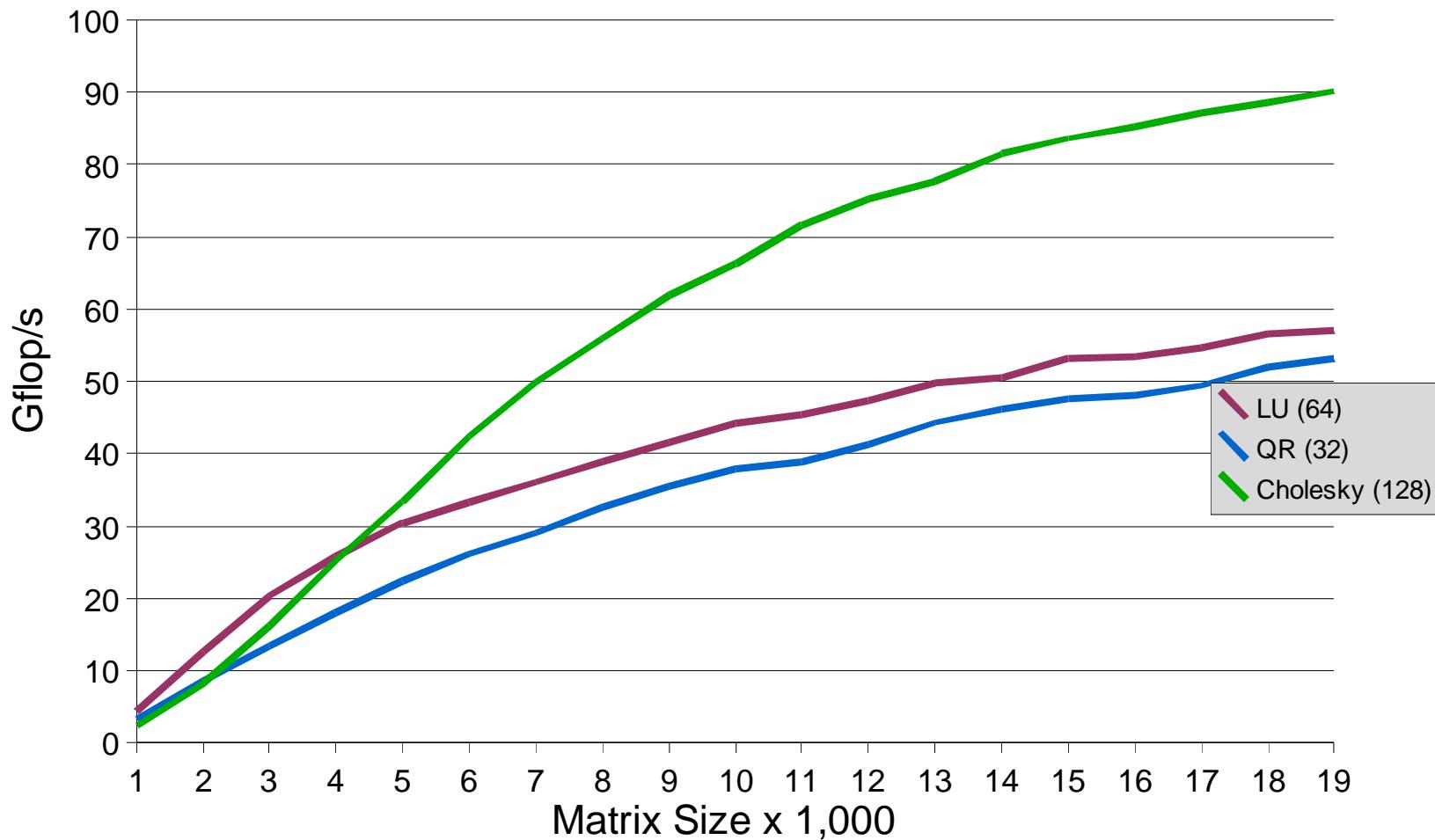
# GPU Experiments

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- LAPACK is running on the CPU, making calls to CUDA BLAS which are running on the GPU.
  - AMD Opteron 1.8 GHz
  - NVIDIA Quadro FX 5600
    - processors: 128 (total)
    - max performance: 346 GFlop/s SP

# Performance of LAPACK LU, QR, and Cholesky with CUBLAS

AMD Opteron 1.8 GHz & NVIDIA Quadro FX 5600



# Collaborators / Support

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Alfredo Buttari, UTK

Julien Langou,  
UColorado

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Piotr Luszczek,  
MathWorks

Jakub Kurzak, UTK

Stan Tomov, UTK



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