Fighting HIV with GPU-Accelerated Petascale Computing

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NIH BTRC for Macromolecular Modeling and Bioinformatics http://www.ks.uiuc.edu/

Goal: A Computational Microscope

Study the molecular machines in living cells

Ribosome: target for antibiotics

Poliovirus





NAMD and VMD Use GPUs & Petascale Computing to Meet Computational Biology's Insatiable Demand for Processing Power



First Simulation of a Virus Capsid (2006)

Satellite Tobacco Mosaic Virus (STMV)



1 million atoms A huge system for 2006 First MD simulation of a complete virus capsid

STMV smallest available capsid structure

STMV simulation, visualization, and analysis pushed us toward GPU computing!

MD showed that STMV capsid collapses without its RNA core



Taking STMV From a "Hero" Simulation to a "Routine" Simulation with GPUs

- The STMV project was a turning point
 - Preparing STMV models and placing ions tremendously demanding computational task
 - Existing approaches to visualizing and analyzing the simulation began to break down
- It was already clear in 2006 that the study of viruses relevant to human health would require a long-term investment in better parallel algorithms and extensive use of acceleration technologies in NAMD and VMD
- These difficulties led us to accelerate key modeling tasks with GPUs



VMD Electrostatics: Our First Use of CUDA

- CUDA 0.7: Spring 2007
- Electrostatic potential maps evaluated on 3-D lattice:

$$V_i = \sum_j \frac{q_j}{4\pi\epsilon_0 |\mathbf{r}_j - \mathbf{r}_i|}$$



Isoleucine tRNA synthetase

- Applications include:
 - Ion placement for structure building
 - Visualization and analysis

Accelerating Molecular Modeling Applications with Graphics Processors. Stone et al., J. Computational Chemistry, 28:2618-2640, 2007.



STMV Ion Placement

Bringing NAMD to GPU Clusters



2.4 GHz Opteron + Quadro FX 5600

2008 NCSA "QP" GPU Cluster

Adapting a message-driven parallel application to GPU-accelerated clusters. Phillips et al. In SC '08: Proceedings of the 2008 ACM/IEEE Conference on Supercomputing, 2008.

Getting Past the "Chicken and the Egg"

- GPU clusters still rare circa 2009-2011, most were not quite big enough to be used for large scale production science yet ... but the potential was definitely there
- Performance and power efficiency benefits were seen for NAMD, VMD, others, on ever larger node counts
- Larger GPU accelerated systems were on the horizon

GPU Clusters for High Performance Computing. Kindratenko et al., IEEE Cluster'09, pp. 1-8, 2009. **Probing biomolecular machines with graphics processors.** Phillips et al. CACM, 52:34-41, 2009.

GPU-accelerated molecular modeling coming of age. Stone et al., J. Mol. Graphics and Modelling, 29:116-125, 2010.

Quantifying the impact of GPUs on performance and energy efficiency in HPC clusters. Enos et al., International Conference on Green Computing, pp. 317-324, 2010.

Fast analysis of molecular dynamics trajectories with graphics processing units-radial distribution function histogramming. Levine et al., J. Computational Physics, 230:3556-3569, 2011.



Blue Waters and the HIV Capsid



All-atom HIV-1 capsid structure solved Zhao et al. , *Nature* 497: 643-646 (2013)





Structural Route to the HIV-1 Capsid

1st TEM (1999)



Ganser et al. Science, 1999 Briggs et al. EMBO J, 2003 Briggs et al. Structure, 2006

1st tomography (2003)



cryo-ET (2006)

hexameric tubules



Li et al., Nature, 2000



Byeon et al., Cell 2009

Crystal structures of separated hexamer and pentamer



Pornillos et al., Cell 2009, Nature 2011

High res. EM of hexameric tubules, tomography of capsids, all-atom model of capsid by MDFF w/ NAMD & VMD, NSF/NCSA Blue Waters petascale computer at U. Illinois



Zhao et al., Nature 497: 643-646 (2013)

Blue Waters Posed Many Challenges

- Scale NAMD to 100M atoms
 - Read new .js file format
 - Distribute or compress static molecular structure data
 - Parallel atomic data input
 - Use shared memory in a node
 - Parallel load balancing
 - Parallel, asynchronous trajectory and restart file output
 - 2D decomposition of 3D FFT
 - Limit steering force messages
 - Fix minimizer stability issues
- Also build benchmarks...

- Scale NAMD to 300K cores
 - Charm++ shared memory tuning
 - IBM Power7 network layer
 - IBM BlueGene/Q network layer
 - Cray Gemini network layer
 - Cray torus topology information
 - Charm++ replica layers
 - Optimize for physical nodes
 - Adapt trees to avoid throttling
 - Optimize for torus topology
 - Optimize for parallel filesystem
- Optimize for new GPUs...



Twenty Years of NAMD Load Balancing and Communication Optimization Pay off on Blue Waters

Jim Phillips monitors NAMD performance of thousands of cores on 4K workstation



New NAMD+GPUs Will Make Petascale Routine

- 100M-atom simulations need to be commonly available
 - Commodity clusters to the rescue (again)
- GPUs are the future of supercomputing
 - GPU performance growing exponentially
 - GPUs communicate directly via InfiniBand etc.
- Future NAMD will be GPU-centric
 - Enabled by Charm++ MPI-interoperability
 - Focus on enabling ~10-100M-atom simulations
 - Benefits extend to smaller simulations
- Rack of 160 GPUs can match 5% of Blue Waters today
 - Dedicated 24/7 to a single simulation



NAMD Cray XK7 Performance August 2013

NAMD on Titan Cray XK7 (2fs timestep with PME)



240M atom Influenza Virus Scales to Entire Petascale Machines



Other Projects Using Petascale Computing

From woodchips to gasoline...

From cellular machines to the pharmacy...



ribosome 3 M atoms, multiple replicas second-generation biofuels > 10 M atoms From solar energy to cellular fuel...



VMD – "Visual Molecular Dynamics"

- Visualization and analysis of:
 - molecular dynamics simulations
 - particle systems and whole cells
 - cryoEM densities, volumetric data
 - quantum chemistry calculations
 - sequence information
- User extensible w/ scripting and plugins
- http://www.ks.uiuc.edu/Research/vmd/





Whole Cell Simulation

MD Simulations



Sequence Data

Quantum Chemistry

CUDA GPU-Accelerated Trajectory Analysis and Visualization in VMD

| VMD GPU-Accelerated Feature or Kernel | Exemplary speedup vs. multi-core CPU (e.g. 4-core CPU) |
|---------------------------------------|---|
| Molecular orbital display | 30x |
| Radial distribution function | 23x |
| Molecular surface display | 15x |
| Electrostatic field calculation | 11x |
| Ray tracing w/ shadows, AO lighting | 8x |
| Ion placement | 6x |
| MDFF density map synthesis | бх |
| Implicit ligand sampling | 6x |
| Root mean squared fluctuation | бх |
| Radius of gyration | 5x |
| Close contact determination | 5x |
| Dipole moment calculation | 4x |







VMD Supports Petascale Biology

- Where to put the data?
 - o Trajectories too large to download
 - Analyze 231 TB trajectory set in 15 min, parallel I/O @ 275 GB/sec on 8,192 nodes
- Supports GPU-accelerated Cray XK7 nodes for both visualization and analysis tasks
 - GPU electrostatics, RDF, density quality-of-fit
 - OpenGL Pbuffer off-screen rendering support
 - GPU ray tracing w/ ambient occlusion lighting
- VMD analysis calculations and movie renderings use dynamic load balancing, tested with up to 262,144 CPU cores
- Available on: NCSA Blue Waters, ORNL Titan, Indiana Big Red II



NCSA Blue Waters Cray XE6 / XK7 Supercomputer 22,640 XE6 CPU nodes

4,224 XK7 nodes w/ GPUs enable fast VMD analysis and visualization

VMD "QuickSurf" Representation

- Displays continuum of structural detail:
 - All-atom, coarse-grained, cellular models
 - Smoothly variable detail controls
- Linear-time algorithm, scales to millions of particles, as limited by memory capacity
- Uses multi-core CPUs and GPU acceleration to enable smooth interactive animation of molecular dynamics trajectories w/ up to ~1-2 million atoms
- GPU acceleration yields 10x-15x speedup vs. multi-core CPUs

Fast Visualization of Gaussian Density Surfaces for Molecular Dynamics and Particle System Trajectories. M. Krone, J. E. Stone, T. Ertl, K. Schulten. *EuroVis Short Papers*, pp. 67-71, 2012



Satellite Tobacco Mosaic Virus

QuickSurf Algorithm Improvements

- 50%-66% memory use, 1.5x-2x speedup
- Build spatial acceleration data structures, optimize data for GPU
- Compute 3-D density map, 3-D color texture map with data-parallel "gather" algorithm:

$$\rho(\vec{r}; \vec{r}_1, \vec{r}_2, \dots, \vec{r}_N) = \sum_{i=1}^N e^{\frac{-|\vec{r}-\vec{r}_i|^2}{2\alpha^2}}$$

- Normalize, quantize, and compress density, color, surface normal data while in registers, before writing out to GPU global memory
- Extract isosurface, maintaining quantized/compressed data representation



3-D density map lattice, spatial acceleration grid, and extracted surface

VMD "QuickSurf" Representation, Ray Tracing







All-atom HIV capsid simulations w/ up to 64M atoms on Blue Waters

Ray Tracing of VMD Molecular Graphics

- STMV virus capsid on a laptop GeForce GTX 560M
- Ambient occlusion lighting, shadows, reflections, transparency, and much more...





Standard OpenGL VMD w/ new GPU ray tracing engine rasterization based on CUDA + OptiX

Lighting Comparison

Two lights, no shadows

Two lights, hard shadows, 1 shadow ray per light

Ambient occlusion + two lights, 144 AO rays/hit



GPU Ray Tracing of HIV-1 on Blue Waters

- 64M atom simulation, 1079 movie frames
- Ambient occlusion lighting, shadows, transparency, antialiasing, depth cueing, 144 rays/pixel minimum
- GPU memory capacity hurdles:
 - Regen BVH every simulation timestep, when graphical representations change
 - Surface calc. and ray tracing each use over 75% of K20X 6GB on-board GPU memory, even with quantized/compressed colors, surface normals, ...
 - Evict non-RT GPU data to host prior to ray tracing



HIV-1 Parallel HD Movie Rendering on Blue Waters Cray XE6/XK7

New "TachyonL-OptiX" on XK7 vs. Tachyon on XE6: K20X GPUs yield **up to eight times** geom+ray tracing speedup

| Node Type and Count | Script Load Time | State Load Time | Geometry + Ray Tracing | Total Time |
|-------------------------|---------------------|--------------------|---------------------------|---------------|
| 256 XE6 CPUs | 7 s | 160 s | 1,374 s | 1,541 s |
| 512 XE6 CPUs | 13 s | 211 s | 808 s | 1,032 s |
| 64 XK7 Tesla K20X GPUs | 2 s | 38 s | 655 s | 695 s |
| 128 XK7 Tesla K20X GPUs | 4 s | 74 s | 331 s | 410 s |
| 256 XK7 Tesla K20X GPUs | 7 s | 110 s | 171 s | 288 s |

GPU-Accelerated Molecular Visualization on Petascale Supercomputing Platforms. Stone et al. In UltraVis'13: Eighth Workshop on Ultrascale Visualization Proceedings, 2013.



Center Facilities Enable Petascale Biology



Over the past five years our Center has assembled all necessary hardware and infrastructure to prepare and analyze petascale molecular dynamics simulations, and *makes these facilities available to visiting researchers*.

Simulation Output

10 Gigabit Network

Petascale Gateway Facility



External Resources, 90% of our Computer Power

High-End Workstations Immediate On-Demand Computation



Virtual Facilities to Enable Petascale Anywhere





Optimizing GPU Algorithms for Power Consumption

NVIDIA "Carma" and "Kayla" Tegra ARM processors, single board computers with CUDA-enabled GPUs

| Platform | Normalized performance/watt (higher is better) |
|-------------------------------|--|
| Intel Core i7-3960X | 1.00x |
| NVIDIA Kayla w/ GeForce 680 | 1.03x |
| NVIDIA Kayla w/ GeForce Titan | 1.22x |
| NVIDIA Kayla w/ Quadro K4000 | 1.76x |
| NVIDIA Kayla w/ Quadro K2000 | 2.02x |
| NVIDIA Kayla w/ GTX 640 | 2.51x |



Tegra+GPU energy efficiency measurement testbed



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 - DOE INCITE



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GPU Computing Publications

http://www.ks.uiuc.edu/Research/gpu/

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