



# Quantitative and Comparative Visualization Applied to Cosmological Simulations

James Ahrens

Katrin Heitmann, Salman Habib

Lee Ankeny, Patrick S. McCormick, Jeff Inman

Los Alamos National Laboratory

Ryan Armstrong, Kwan-Liu Ma

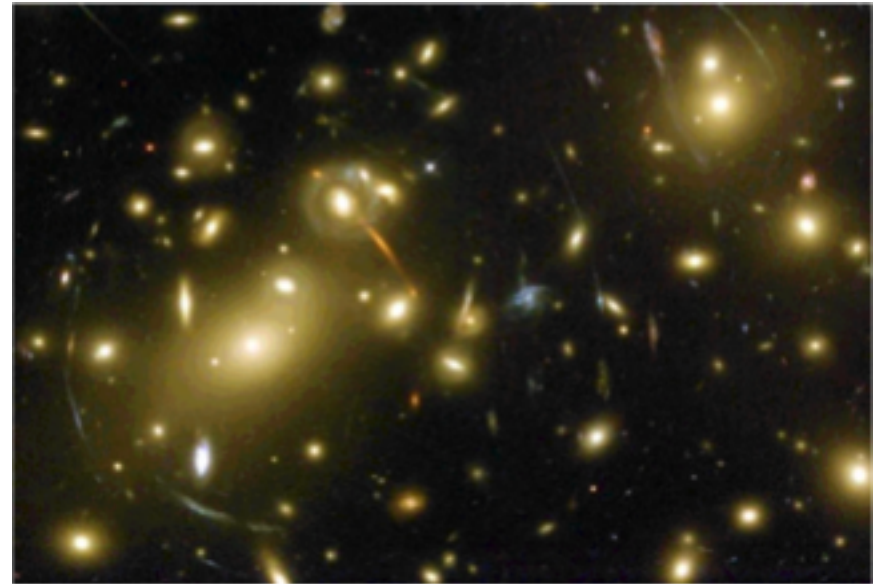
University of California at Davis

SciDAC 2006

June 25-29 Denver

# The Content of the Universe

- Standard Model of Cosmology
  - ~73% of a mysterious dark energy
  - ~23% of an unknown dark matter component
  - ~4% baryons
  - Constraints on ~20 cosmological parameters, including optical depth, spectral index, hubble constant, ...
  - Values are known to an accuracy of +/- 10%
- For comparison: the parameters of the “Standard Model for Particle Physics” are known with 0.1% accuracy



# Understanding the Universe

- Science today
  - Theory
  - Simulation
  - Observation / Experiment
- Cosmological simulations follow the formation of nonlinear structure in dark and luminous matter.
- Our goal is to understand sources of inconsistency between different cosmological simulation codes.

## Robustness of Cosmological Simulations: Large Scale Structure

- Heitmann, Ricker, Warren and Habib, ApJS, 160, 128, (2005)
- How well do different N-body codes agree on various statistics?
- Test and compare 6 different N-body codes for simulations of structure formation, dark matter only
- Every code starts from identical particle initial conditions

# Robustness of Cosmological Simulations: Large Scale Structure - Codes



- Mesh-based Cosmology Code
  - Multi-species particle mesh code (Habib et al. in prep.)



- FLASH
  - Adaptive mesh refinement
  - Hydrodynamics and dark matter code (Fryxell et al. 2000)



- Hatched-Oct Tree
  - Tree code with SPH (Warren & Salmon 1993)
- Galaxies with Dark matter and Gas intEracTions
  - Tree code with SPH (Springel et al. 2001)



- HYDRA, AP<sup>3</sup>M code with SPH (Couchman et al. 1995)
- TreePM, pure dark matter code (Xu 1995, Bode et al. 2000)





# Robustness of Cosmological Simulations: Large Scale Structure - Data

---

- For each simulation
  - 16 million particles
  - Point, velocity, mass and tag variables
- <http://t8web.lanl.gov/people/heitmann/arxiv/>



# Our Visualization and Analysis Approach

---

- Scientific method
  - 1) Form hypothesis
  - 2) Qualitative – Visualization
    - Intuitive exploration
  - 3) Quantitative – Analysis
    - Define and measure
- Tight integration
- Bottom-up or top-down focus?
  - Bottom-up application focus
    - Learn and generalize over time
- Work towards significantly improving the scientific analysis process by incorporating quantitative analysis as the driver for visualization.

# Initial Approach for Cosmology Problem

- Initially
  - Define halos
    - Particles within 1/5 of the mean distance from each other form a halo
  - Count the halos

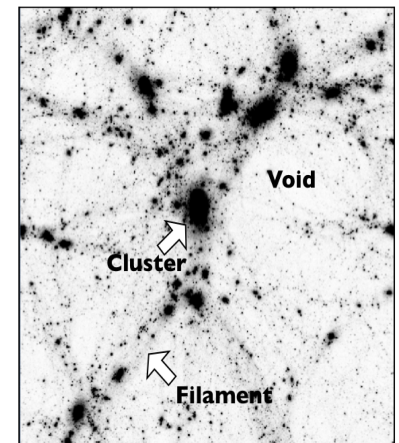
MC <sup>2</sup>	FLASH	HOT
49087	32494	54417
GADGET	TPM	HYDRA
55854	34367	54840

- Form hypothesis
  - Each simulation should generate the same number of halos

- Quantitative - Analysis
  - MC<sup>2</sup> (PM code, uniform grid) and FLASH (AMR code) have similar force resolution
  - Highest resolution (after refinement) of FLASH is the same as the MC<sup>2</sup> resolution throughout
  - FLASH is missing ~40% of the halos! - Why?

# Refined Approach for Cosmology Problem

- Form hypothesis
  - Low density regions do not form as many halos as other density regions
- Qualitative - Visualization
  - Comparative visualization
- Quantitative – Analysis
  - Science-based feature definition and manipulation
    - Define density
      - Given a grid, map the particles into the grid elements, density is particle count
    - Count halos as a function of density
    - Also, consider only halos above a certain mass





# Additional requirements

---

- High-performance
  - Reduce time to visual result or analysis
- Scalable
  - Handle massive data sets



# Application of the approach

---

- Paraview - open-source large data visualization package
  - Scalable
  - Comparative
- Scout - an analysis-language based, hardware-accelerated visualization package
  - High-performance
  - Quantitative

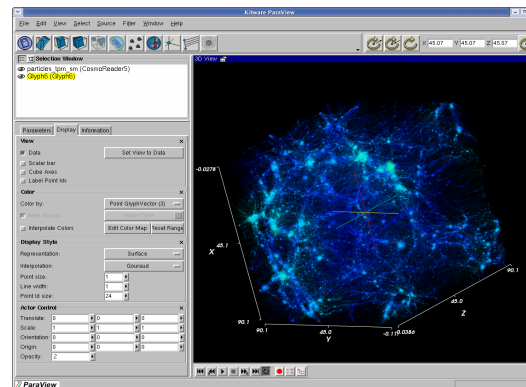
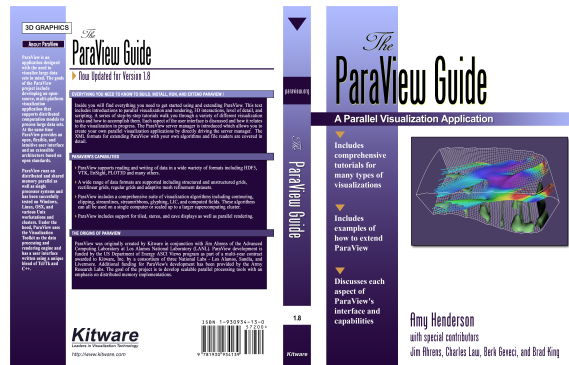
# Vtk and ParaView - An Open Source Visualization Tool Suite for Scientists

## • VTK

- An open-source object-oriented visualization toolkit
- [www.vtk.org](http://www.vtk.org)

## • ParaView

- An open-source, scalable multi-platform visualization application
- Creates an open, flexible, and intuitive user interface for VTK
- Project Lead: James Ahrens
- [www.paraview.org](http://www.paraview.org)



## • Agency funding

- NSF, NIH, DOE, DOD

## • Entities using/developing

- Laboratories
  - ANL, NCSA, EVL
  - LANL, LLNL, SNL
  - CEA, CHCH
  - ARL
- Commercial Companies
  - GE, DuPont
- Universities
  - Stanford, UNC, Utah

## • ~2000 mailing list participants





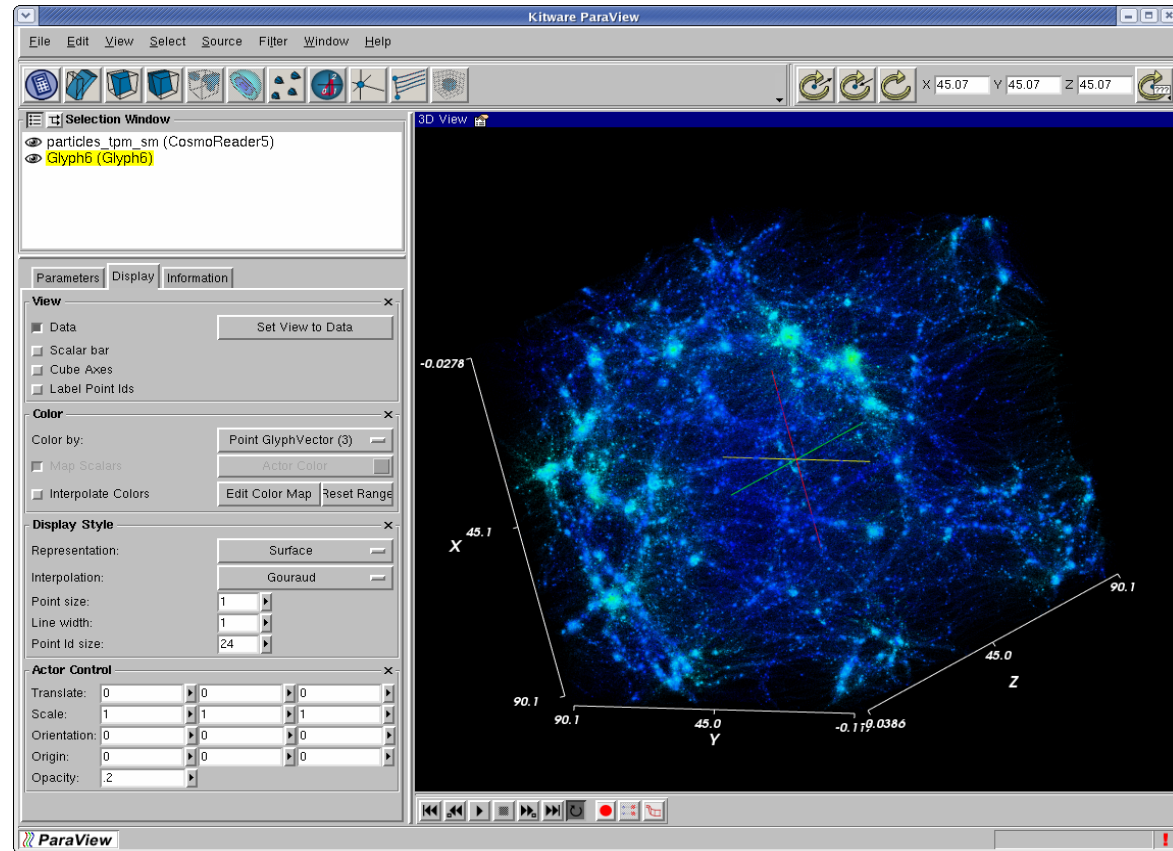
# ParaView Overview

---

- Full functionality
  - Isosurfacing, cutting, clipping, volume rendering...
- Serial and parallel portability
  - Run on most serial and parallel platforms
    - Binaries for Windows, Linux, Mac
  - Distributed-memory execution
    - Commodity clusters
- Scalability
  - Data parallelism and incremental processing
  - Visualized a petabyte-sized test problem in 2001
- Advanced displays and rendering
  - Stereo, Tiled walls, CAVE
  - Automatic level of detail rendering
  - Compression for remote data transfer
- Supercomputing services
  - Parallel data server
  - Parallel rendering server
  - Client
- Visualization research with a real-world impact...

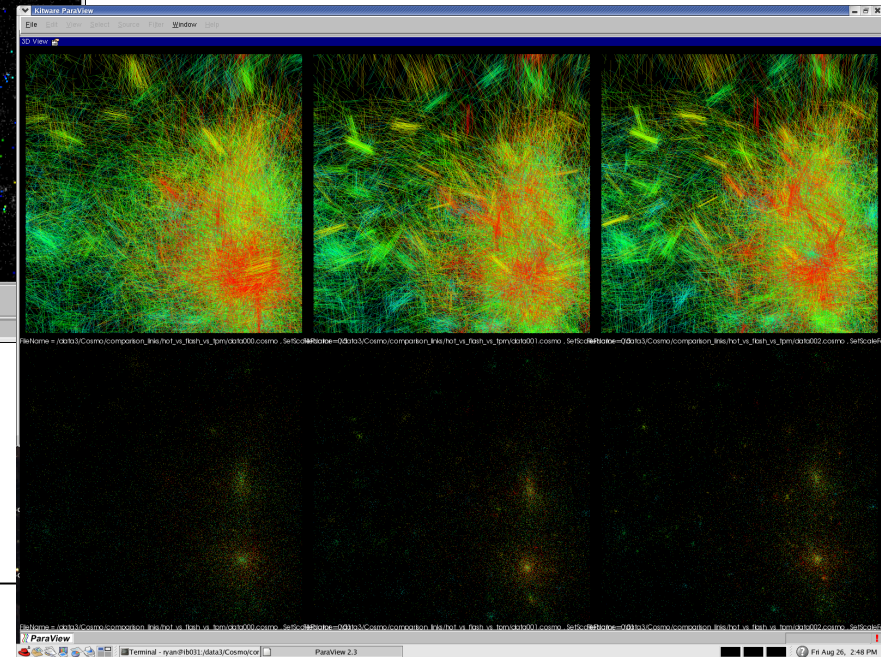
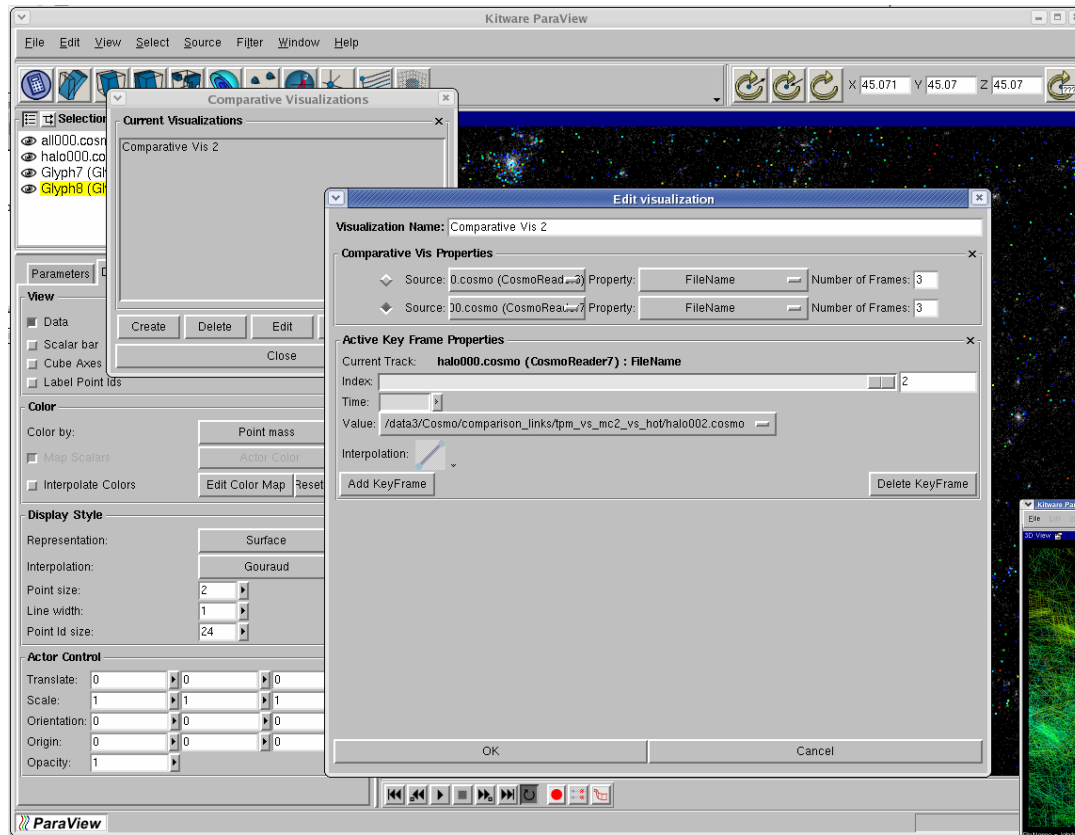
# Refined Approach Using ParaView

- Qualitative - Visualization
  - **Automated** comparative visualization
- Quantitative - Analysis
  - Create modules and interfaces in ParaView that:
    - Define density, halos
    - Count and query on halos and density

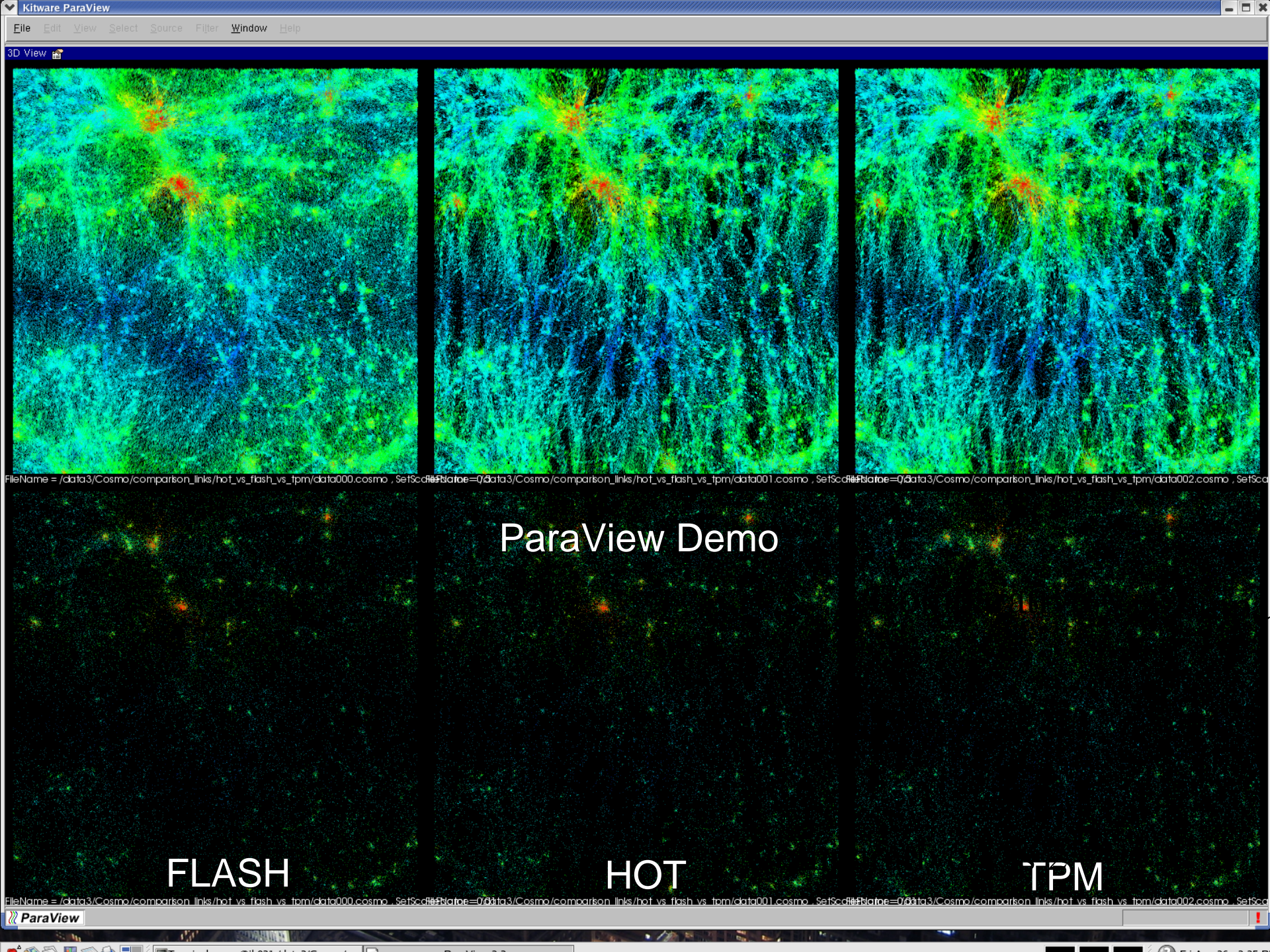


# ParaView: Automated Comparative Visualization

- Vary parameters in X and Y
- Create multiple linked visualizations
- Spreadsheet style visual presentation
- Synchronized cameras

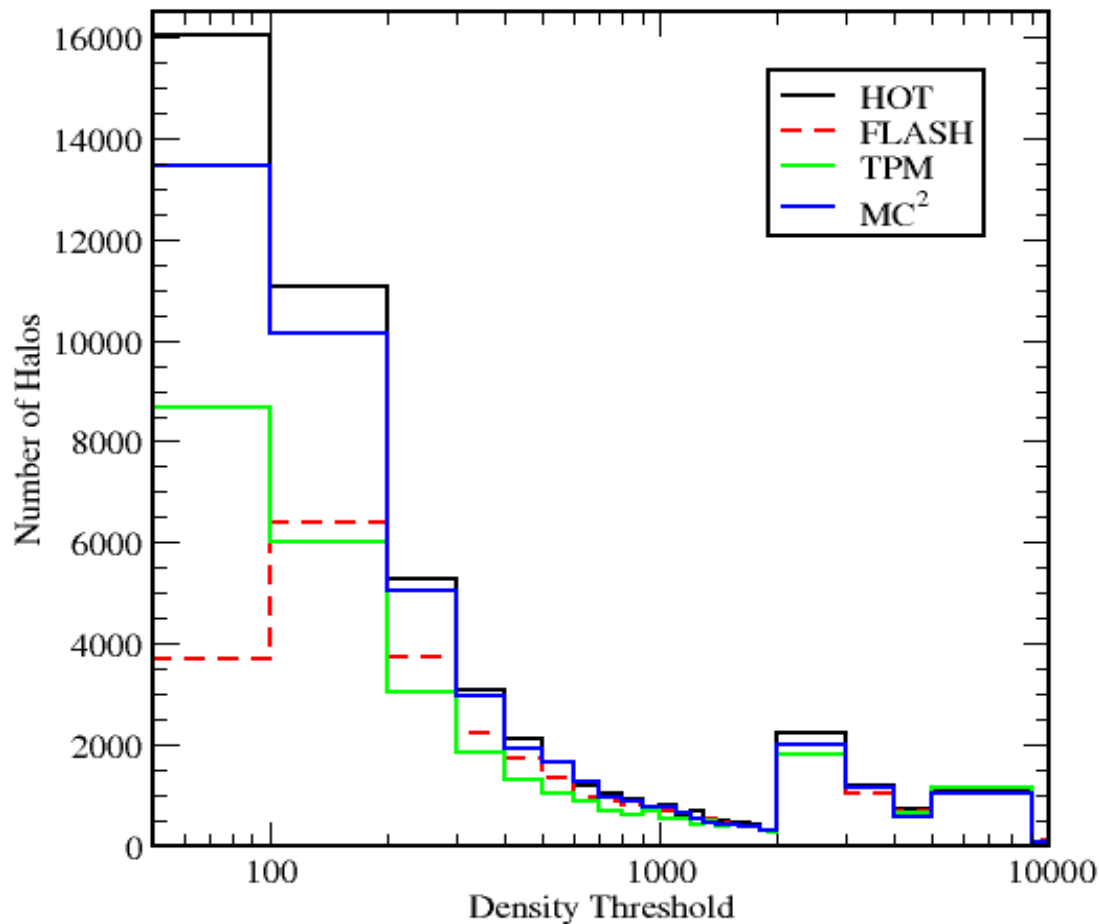






# ParaView: Quantitative Results

Halos with more than 10 particles

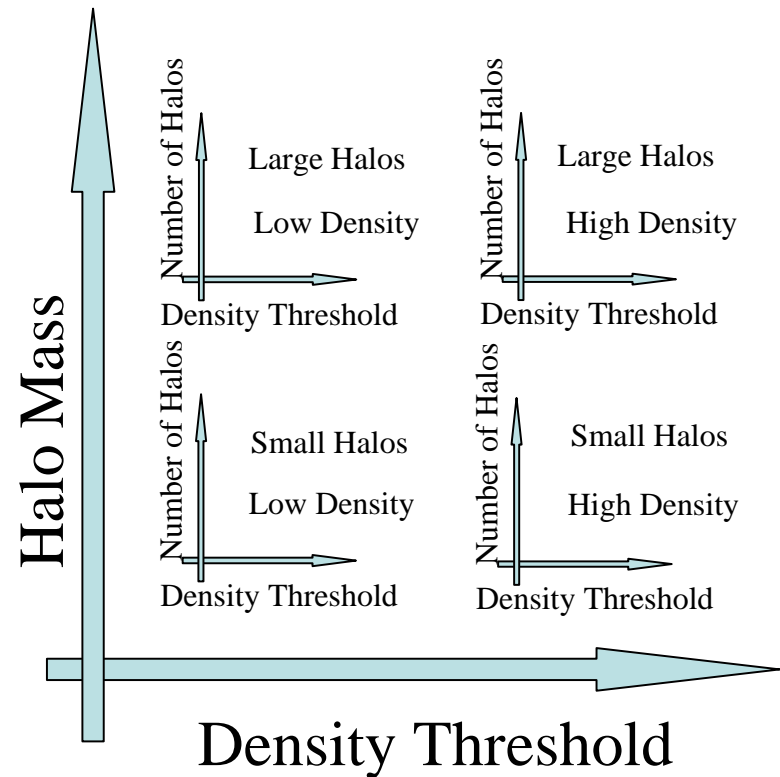


Note: Bin sizes are not the same in all density regions! This leads to “jumps”, e.g., at 2000.



# ParaView Quantitative Results Summary

- FLASH has a severe lack of halos ~40%
- Paraview allows us to identify halos and halo counts in different density regions
  - Qualitative: FLASH loses halos in low density regions
  - Quantitative: confirmed with Paraview (no need for extra analysis codes!)
- Understand the relationship between halo size and density:
  - FLASH has large deficit in low density regions, OK in very high density regions
  - Very small halos live dominantly in low density region



Future: Merging Comparative and Quantitative Visualization Together



# ParaView Quantitative Results Summary

---

- The current base grid in FLASH allows us to resolve only very large halos (which live in the high density regions)
  - To resolve all halos need a much finer base grid is required
  - Need new force resolution criteria... - refine when appropriate
- Hot topic in cosmology research
  - Study of halo properties and formation as a function of their environment (as defined by density)



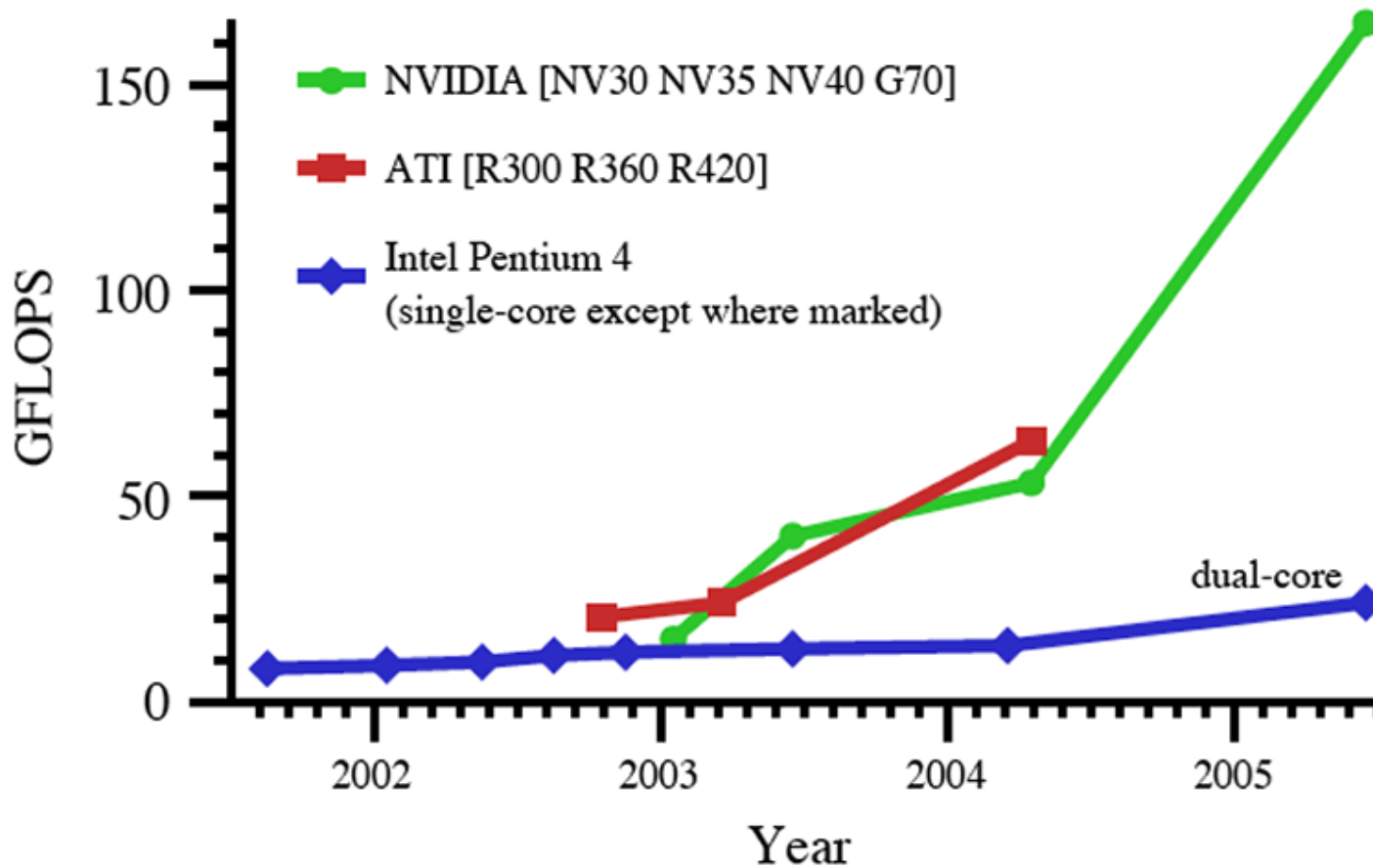


# Scout Overview

---

- Patrick McCormick - PI
- High-performance
  - Hardware-acceleration via the multi-core GPU
- Quantitative
  - Define and analyze data via programming language
- Scientist-focused programming language
  - Express both general computations and visualization results
  - Explicit data parallelism
    - Take advantage of data parallel nature of graphics hardware
  - Hide other nuances introduced by graphics API and hardware

# Scout: Hardware-acceleration on the GPU



# Refined Approach Using Scout

- Qualitative - Visualization
  - Merged as one program
- Quantitative - Analysis
  - Create a program that:
    - Define density, halos
    - Interactively query on halos and density

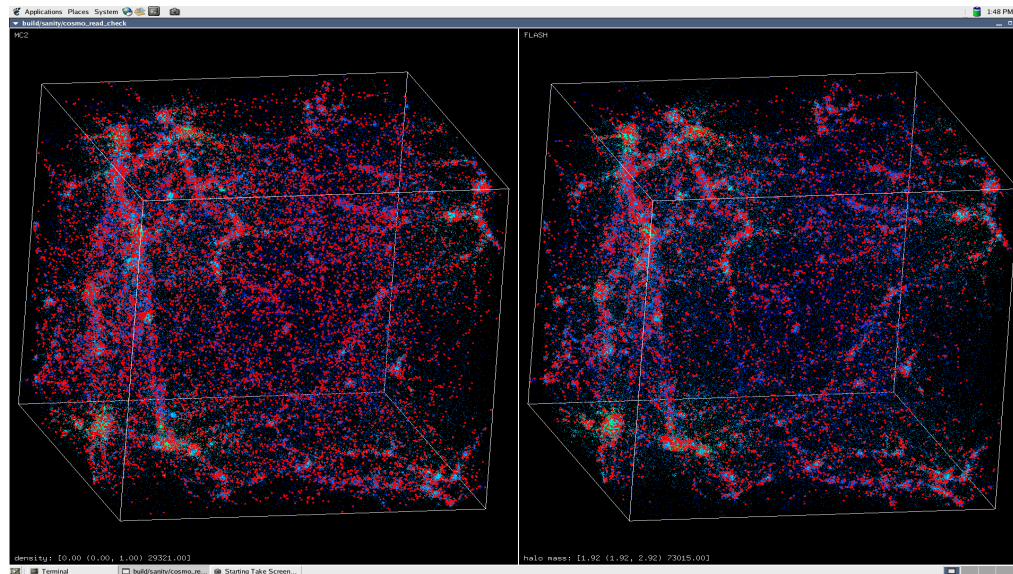
## • The Scout Program

```
viewport "MC2" (0.0, 0.0, 0.5, 0.5) {
  float mag(shapeof(mc2_velocity));
  compute with sizeof(mc2_velocity) {
    mag = magnitude(mc2_velocity);
  }
  render points with sizeof(mc2_points) {
    where(density >= ... )
    image=hsva(240*(max(mag)-mag) /
              (max(mag)-min(mag)),1,1,1);

    image = null;
  }
  render points with sizeof(mc2_halos) {
    where(mass >= ... && density >= ...)
    image = rgba(1,0,0,1);
    else
    image = null;
  }
}
```

# Scout - Demonstration

- Performance
  - ParaView – halos (~50K) using geometry \* (# of visualizations)
  - Scout – halos (~50K), particles (~2 million) using points and queries \* (# of visualizations)





# Conclusions

---

- Integrated approach to visualization and analysis
  - Qualitative and quantitative
- Solutions
  - ParaView
    - Open-source large data visualization
    - Comparative visualization
    - [www.paraview.org](http://www.paraview.org)
  - Scout
    - Hardware-accelerated language-based visualization and analysis
    - Contact us - expected binary release end of this year