

*Julian Merten*

*Supercomputing Techniques in Lensing*

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Lensing in HD



# Outline

## 1 Motivation

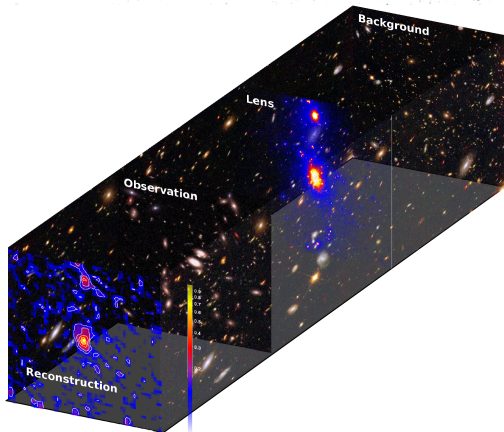
- HPC Basics
- Cluster riddles
- Careful analysis

## 2 Our pipeline

- Cluster extraction
- Lensing simulations
- Cluster reconstructions

## 3 GPU implementation

- Basic concept
- CUDA
- Machines and performance



"I am not paid by NVIDIA"

# *Supercomputing today*

Rapidly increased transistor density

# Supercomputing today

## Special Hardware

- e.g. GRAPE, FPGAs
- Extremely fast
- Extremely expensive, difficult to operate

## Massive Parallelisation

- e.g. Infiniband compute clusters
- Fast and relatively cheap
- Extremely flexible

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# Supercomputing today

## GPU Computing

- On-chip parallelisation
- Relatively flexible
- Extremely cheap

## Special Hardware

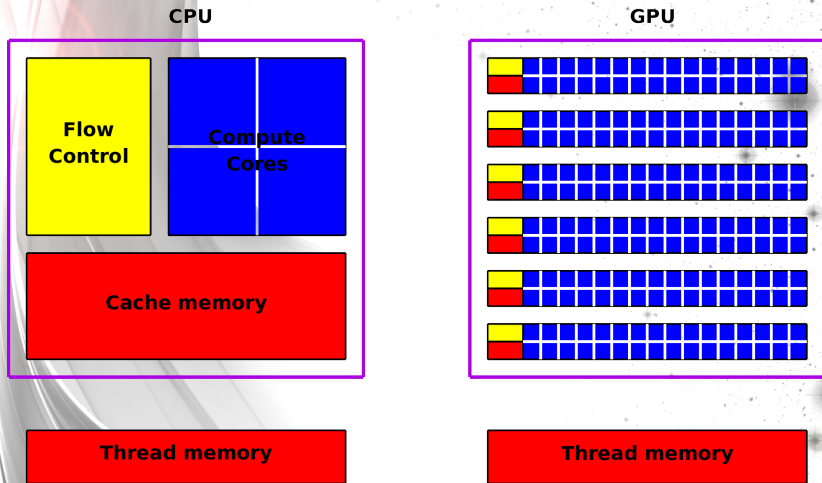
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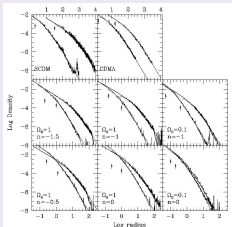
## Single node CPU/GPU Parallelisation



- One single GPU allows for massive parallelisation at  $\sim 1/1000$  of the cost, if problem is suited for  $\Rightarrow$  **Data-parallel**.

# Clusters of puzzles

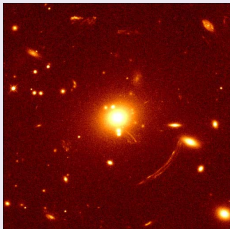
## Density profile



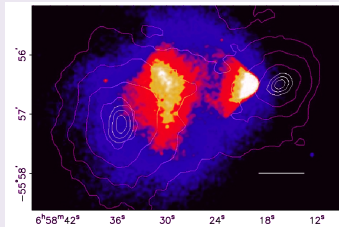
## Cool cores



## Strong lensing



## Extreme dynamics



# Are those puzzles at all?

## Simulations

- State-of-the-art N-body hydro-sims
- As much physics as possible
  - Cooling
  - Star formation
  - AGN/SN feedback
  - Chemical enrichment
  - ...
- Detailed sims of individual objects
- Cluster populations from cosmological volumes



## Observations

- State-of-the-art data
- Joint reconstruction method: lensing, X-ray, dynamics, SZ (JM09+, Bradač05+, Puchwein06+)
- reliable error bars
- large cluster sample

Both sides have to be analysed with the **same** tools.



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# CLASH: An HST/MCT Programme

- PI: M. Postman  
(Co-PIs including Matthias, Arjen, T. Broadhurst, O. Lahav, A. Riess, P. Rosati,...)
- Target: 25 well-chosen X-ray clusters
- Goal: Density profile of clusters, high-z Universe

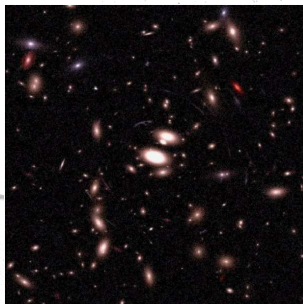
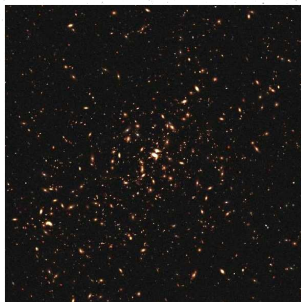
## CLASH Facts

- 524 orbits
- ACS + WFC3 obs.
- 14 wave bands
- wide follow-ups with SUBARU



# Our pipeline I: SkyLens (M. Meneghetti, P. Melchior, JM)

Name	Description
$D$	aperture diameter
$g$	detector gain
$A_{\text{pix}}$	pixel area
$F(\lambda)$	used filter
$M(\lambda)$	mirror filter curve
$O(\lambda)$	optics filter curve
$C(\lambda)$	CCD filter curve
FoV	total field-of-view
RON	detector readout-noise
$f$	flat-field accuracy
$a$	residual flat-field error
PSF	PSF model
$t_{\text{exp}}$	exposure time
$A(\lambda)$	atmospheric extinction
$m_a$	airmass
SED <sub>sky</sub>	sky-background emission
SED <sub>gal</sub>	background population
$\alpha$	deflection angle map



**Parallelisation strategy:**  
**Ray-tracing**



## Our pipeline II: Cluster extraction

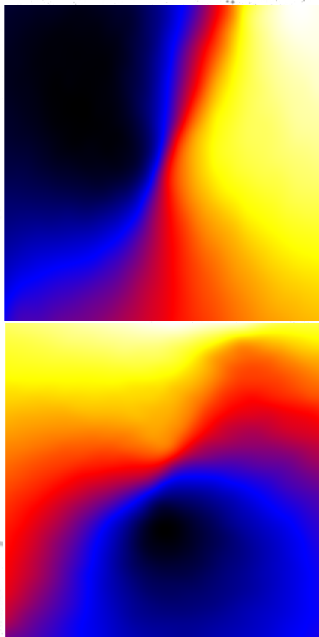
- From snapshots to lensing:

*Deflection angle*

$$\hat{\alpha}(\xi) = \frac{4G}{c^2} \int d^2\xi' \Sigma(\xi') \frac{\xi - \xi'}{|\xi - \xi'|^2}.$$

- Calculated on a pixelised grid
- Usual approach: Barnes-Hut tree codes
- Better approach: direct N-Body summation

**Parallelisation strategy:**  
**Ray-tracing**



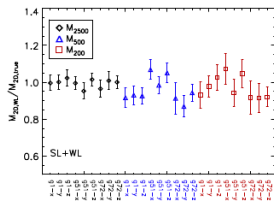
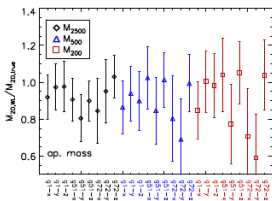
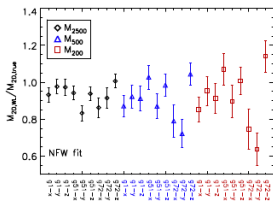
# Our pipeline III: SaWLens (JM09/10)

## Features

- Fully nonparametric
- Stat. grid-based approach
- AMR implementation
- Computationally rather demanding

## Possible input

- Shear/Flexion
- Multiple images + Critical curve estimators
- (Cluster dynamics)
- (ICM-tracers)



**Parallelisation strategy:**

**Independence of grid cells, matrix summation schemes**

# Programming GPUs: C for CUDA

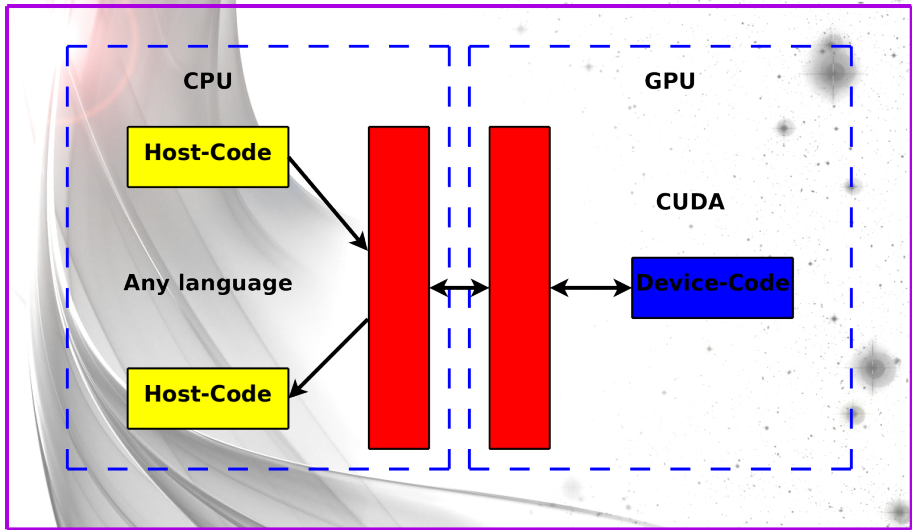
## Basic workflow

- Host-code: “Any language”
- Device-code: C for CUDA or CUDA driver API.
- Host-code calls the device if necessary
- MPI + CUDA possible
- Several GPUs in a code also possible
- Wide range of tools in the CUDA SDK.

## C for CUDA

- High-level language
- C++ syntax with C functionality
- Several levels of memory addressing, including on-chip memory
- Easy thread-indexing
- Device-code objects created with `nvcc` compiler
- Some libraries: FFTW, BLAS, basic math functions

# GPU workflow



# GPU-Systems Jabba the Hutt (BO) & Kolob (MA)

## NVIDIA Tesla C1060

- 240 streaming cores
- 4 GB DDR3 GPU memory
- 933 GFLOPS peak performance
- Upcoming Fermi cards



## First results

- The toy problem:
  - ▶ Simulate a typical SaWLens problem
  - ▶ Calculate a typical coefficient matrix

$$B_{lk} = a_i b_j c_{ij} d_{ik} e_{jl},$$

while using Albert's sum convention.

- ▶ Dimensions:

$$l, k \in [0, \dots, 2499], \quad i, j \in [0, \dots, 15]$$

- Competitors:
  - ① Jabba's CPU: Intel XEON quadcore @ 2.5 GHz, one core used
  - ② Jabba's GPU: NVIDIA Tesla C1060 @ 1.2 GHz, 240 cores used
- The runtime:
  - ① CPU: 82.3 s
  - ② GPU: 1.03 s

SaWLens runtime will be reduced to  $\mathcal{O}(\min)$ .