

SIMs and SAMs

Toni Sagristà  
Sellés

Introduction

SAMs

Philosophy  
Cosmological SAMs

SIMs

N-body  
SPH  
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Some Simulations

Conclusions

# Galaxy Formation and Evolution through simulations and SAMs

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8 June 2011

# Outline

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# Cosmological Introduction

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Let's gain some perspective

- ▶ Theoretical framework: the  $\Lambda$ CDM model
- ▶ Flat geometry
- ▶  $\Lambda$  → Accounts for accelerating expansion
- ▶ CDM → Accounts for gravitational evolution
- ▶ Bottom-up hierarchical scenario
- ▶ Collision and accretion process → halos from small to large

# Simulations and SAMs

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Two approaches: Simulations and Semi-analytic models

**SA Models** Physical assumptions, good resolution and dynamic range

- ▶ Good to understand underlying processes driving evolution
- ▶ Computationally inexpensive (compared to simulations)

**Simulations** Direct numerical integration, light wick and step aside

- ▶ Gravitational component very accurate
- ▶ Lack resolution
- ▶ Computationally **horrible**

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# Semi-analytic models I

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## Main features

- ▶ Made of recipes based on physical models of reality
- ▶ Fine-tuning iterative process → Test assumptions to see which best fits observables
- ▶ Pre-calculate a merger tree
  - ▶ Using a formalism (EPS, ST)
  - ▶ Using simulations (latest tendency)
- ▶ Run model into merger tree

# Recipe

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**Cosmology**  $h, \Omega_\Lambda, \Omega_m, \Omega_k$ , etc. WMAP  $\rightarrow$  great time saver

**Dark haloes** How to describe clustering of dark matter?  
Press-Schechter, N-body?

**Gas cooling** Decrease of internal energy of gas due to radiative processes. Also, conservation of angular momentum to form disc, etc.

**Star formation** Population-III stars, Star formation efficiency, IMF...

**Feedback** Energy and matter feedback from SNs and AGNs.  
Heating, winds IGM chemical enrichment...



# SAMs pros and cons I

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## Cool!

- ▶ Good at reproducing statistical observed properties
- ▶ Large dynamic range of scales
- ▶ Effectively no resolution limit
- ▶ Not very resource-consuming

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## Not so cool

- ▶ Assumptions and simplifications in treatment of gas to obtain simple analytic solutions to complex hydrodynamical processes
- ▶ Arguably, too many free parameters
- ▶ Compensate inadequately modeled process by tuning competing one → wrong physics!
- ▶ Does not provide info on actual spatial distribution

# Cosmological SAM works I

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**AMIGA** Fully analytic, focused on cosmological evolution of IGM at high redshifts

**Santa Cruz** By Primack and Somerville

- ▶ Uses Monte-Carlo to build the merger tree (EPS)
- ▶ Cosmology fitted COBE data, probably updated by now
- ▶ Article with detailed description of recipes

# Cosmological SAM works II

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### GALFORM Durham group

- ▶ Monte-Carlo, again
- ▶ Good with density profiles of DM haloes and gas

### Galacticus By A. Benson (Caltech)

- ▶ Free, open source
- ▶ Very modular
- ▶ Provides parameter sets with versioning, ongoing search
- ▶ Youtube Channel, Facebook page, very academic!

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# N-Body Simulations

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Simulations of particles under influence of physical forces

**Force routine** Computes forces acting on each particle

**Integrator** Solves equations of motion to determine positions, velocities. . .

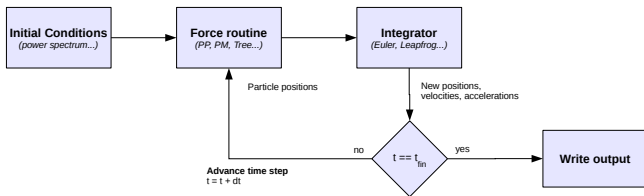


Figure: Flow chart for an N-body code

# Force calculators

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**PP** Particle-Particle, direct method,  $O(n^2)$

**PM** Particle-Mesh, particles interact with mesh  
 $O(n + n_g \log(n_g))$

**Tree** Space divided incrementally depending on density  
 $O(n \log(n))$

**$P^3M$**  Hybrid method, PM for larg-scales and PP for  
small-scales

# Integrators

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**Euler** 1st order, calculate all values at each time step

**Leapfrog** 2d order, calculate velocities and positions  
interleaved in time steps

**Symplectic** Based on canonical transformations

**Runge Kutta** Iterative approach



Used to simulate fluid flows, such as gas

- ▶ Fluid divided into discrete elements, referred to as particles, from which continuous properties are derived
- ▶ Particles have a *smoothing length*,  $h$ , over which physical properties are smoothed by a kernel function,  $W$
- ▶ Contribution of particle to a property weighted according to distance and density

$$F(r_i) = \sum_{j=1}^n F_j \frac{m_j}{\rho_j} W(|r_{ij}|, h_j)$$

$W$ : Gaussian function, cubic spline, etc.

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## Cool!

- ▶ Few guessing, based on elemental physical principles
- ▶ Due to previous point, more reliable
- ▶ Accurate description of evolution in highly non-linear regime
- ▶ Fluid dynamics treated more realistically through SPH
- ▶ They are nice to watch!

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## Not so cool

- ▶ Discrete model to represent rather continuous world (time step, particles, etc.)
- ▶ Resolution → Difficult to model large volumes
- ▶ Sub resolution? Recipes = Free parameters to adjust
- ▶ Dynamic range limitations
- ▶ Computationally expensive in terms of memory and CPU time

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**Virgo Consortium** Founded in 1994, formed by scientists in the UK, Germany, Netherlands, Canada, USA and Japan.

**GADGET-2** Free, open source code. Tree+SPH. Starting point of many sims

**Millenium** 10 billion particles, cube of 2 billion light-years per side, based on GADGET-2

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- ▶ Presented two methods to study galaxy formation and evolution
- ▶ Both approaches display pros and cons
- ▶ Models lack understanding of physics to better adjust parameters
- ▶ Simulations lack computer power and must go into sub-resolution
- ▶ SIMs and SAMs should be complementary!

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J.S. Bagla.

Cosmological n-body simulation: Techniques, scope and status.  
*Current Science*, 88:1088–1100, April 2005.



A. J. Benson.

Galacticus: A semi-analytic model of galaxy formation.  
*New Astronomy*, page 35, 2010.



J.S. Bagla and T. Padmanabhan.

Cosmological n-body simulations.  
*Pramana*, 49:161–142, 1997.



A.J. Benson, F.R. Pearce, C.S. Frenk, C.M. Baugh, and A. Jenkins.

A comparison of semi-analytic and smoothed particle hydrodynamics galaxy formation.  
*MNRAS*, 320:261–280, January 2001.



S. Cole, C.G. Lacey, C.M. Baugh, and C.S. Frenk.

Hierarchical galaxy formation.  
*MNRAS*, 319:168–204, November 2000.



G. Efstathiou, M. Davis, S.D.M. White, and C.S. Frenk.

Numerical techniques for large cosmological N-body simulations.  
*Astrophysical Journal Supplement Series*, 57:241–260, February 1985.



J.C. Helly, S. Cole, C.S. Frenk, C.M. Baugh, A. Benson, C. Lacey, and F.R. Pearce.

A comparison of gas dynamics in smooth particle hydrodynamics and semi-analytic models of galaxy formation.  
*"MNRAS"*, 338:913–925, February 2003.

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M. Hirschmann, T. Naab, R. Somerville, A. Burkert, and L. Oser.

Galaxy formation in semi-analytic models and cosmological hydrodynamic zoom simulations.  
*MNRAS*, 000:1–23, 2002.



E. Ricciardelli and A. Franceschini.

Geco: Galaxy evolution code - a new semi-analytical model of galaxy formation.  
*Astronomy and Astrophysics*, 518:A14+, July 2010.



R.S. Somerville and J.R. Primack.

Semi-analytic modelling of galaxy formation: the local universe.  
*MNRAS*, 310:1087–1110, December 1999.



V. Springel, S. D. M. White, A. Jenkins, C. S. Frenk, N. Yoshida, L. Gao, J. Navarro, D. Thacker, R. Croton, J. Helly, J. A. Peacock, Thomas P. Cole, S., H. Couchman, A. Evrard, J. Colberg, and F. Pearce.  
Simulating the joint evolution of quasars, galaxies and their large-scale distribution.  
*Nature*, 435(astro-ph/0504097):629–636. 42 p, Apr 2005.



S. D. M. White and C. S. Frenk.

Galaxy formation through hierarchical clustering.  
*Astrophysical Journal*, 379:52–79, September 1991.



S.D.M. White and M.J. Rees.

Core condensation in heavy halos - A two-stage theory for galaxy formation and clustering.  
*MNRAS*, 183:341–358, May 1978.