

Monte Carlo Markov Chain Parameter Estimation in Semi- Analytic Models

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Croton et al. 2006

De Lucia & Blaizot

2007

**Cooling
Flows**

Cold Gas

Hot Gas

**SuperNovae
+ AGN**

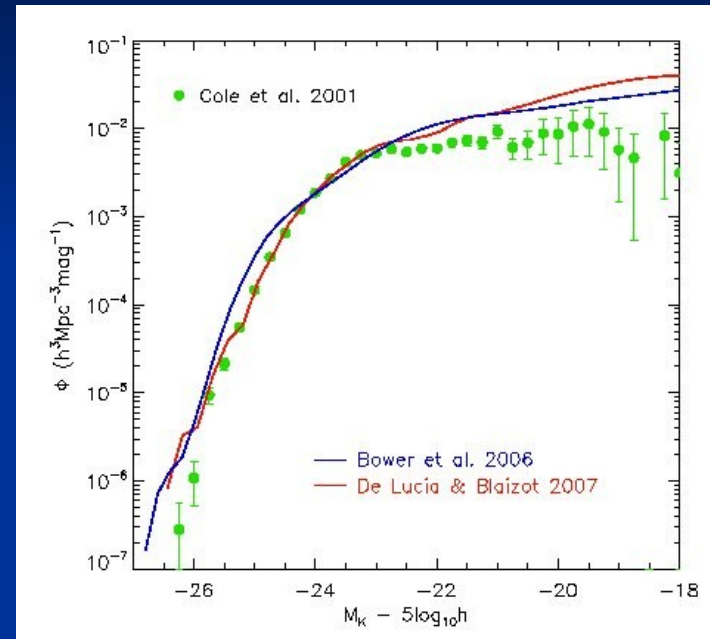
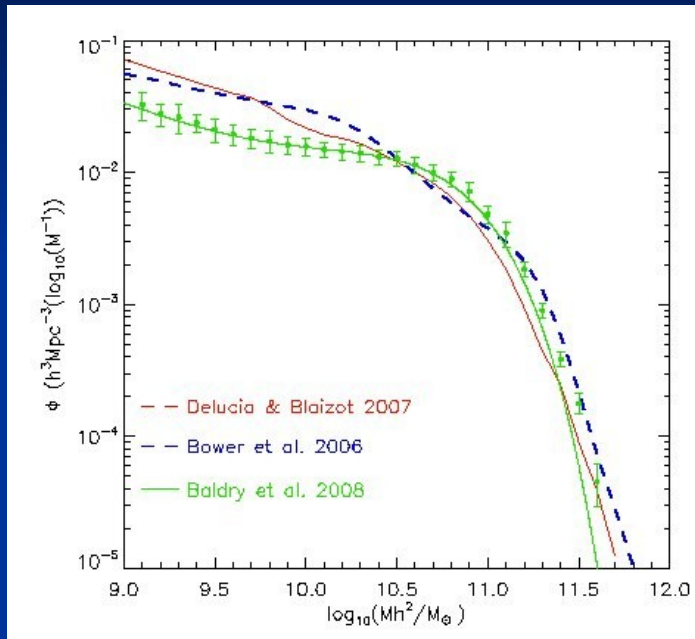
**Star
Formation**

Recycling

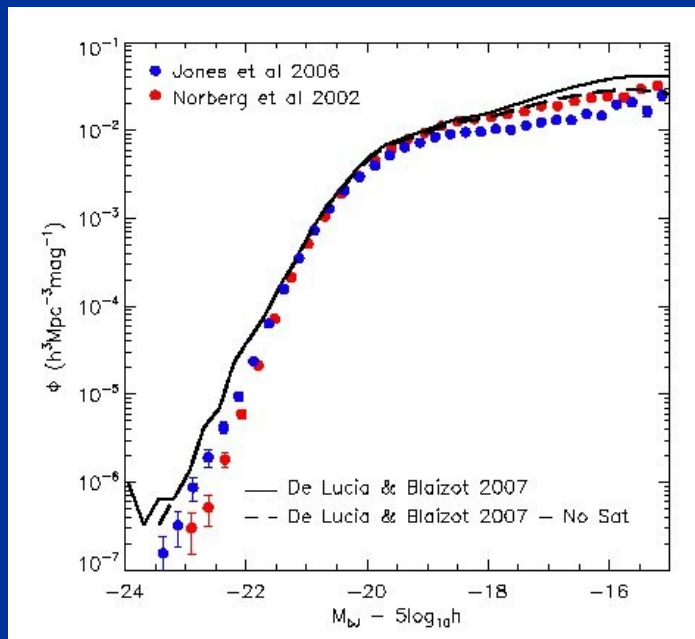
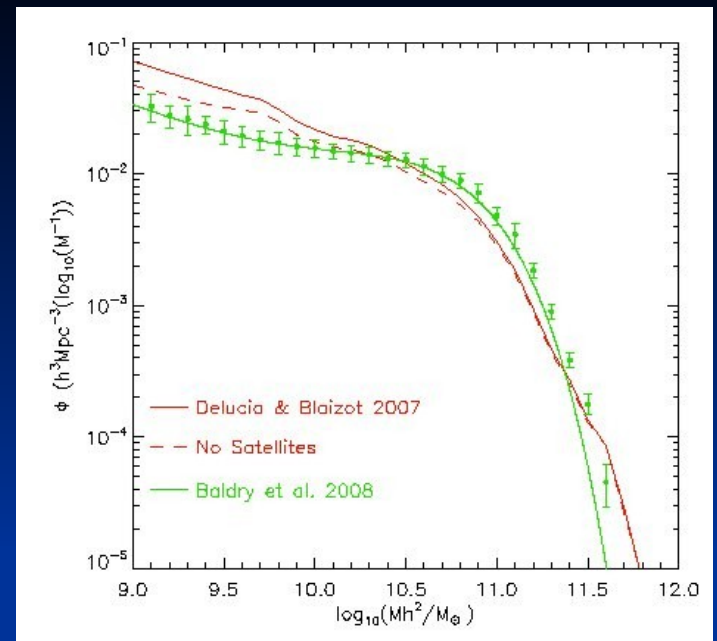
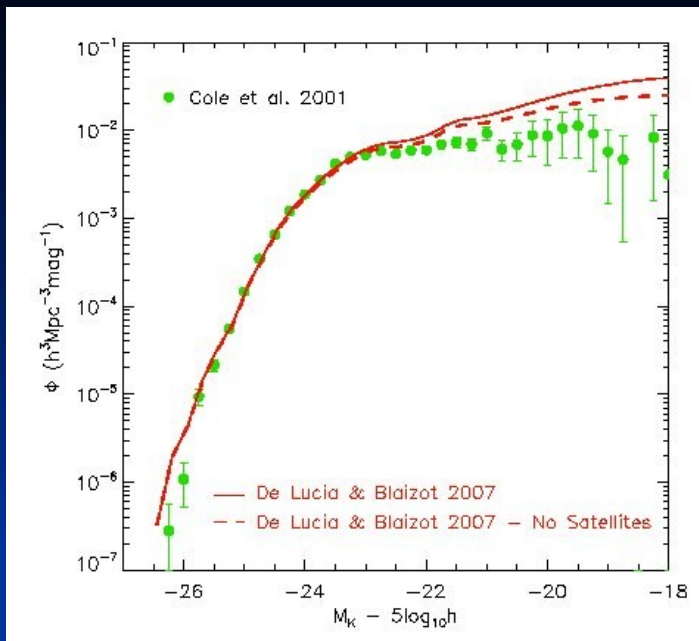
Stars

Hot Gas

Cold
Gas
+ Stars



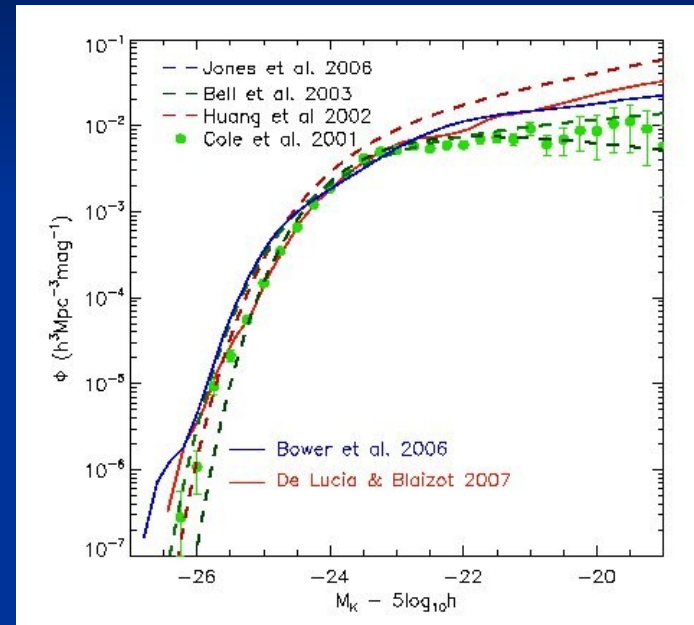
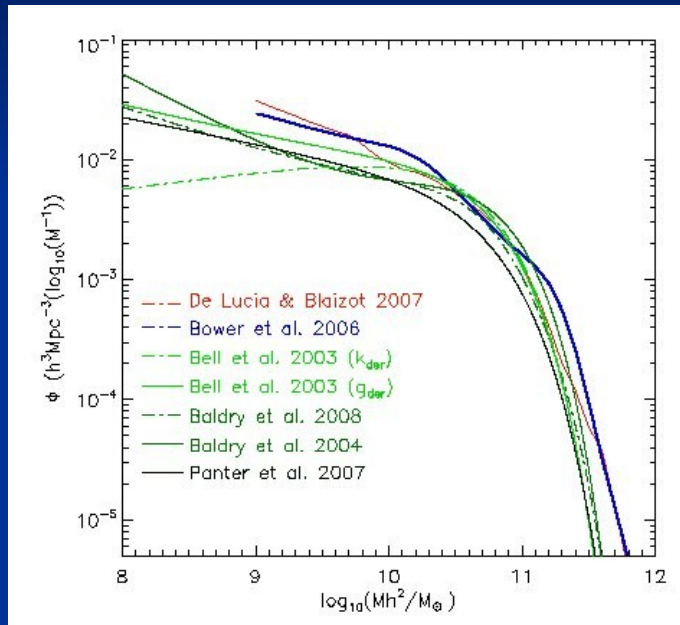
Both luminosities and stellar masses show an excess of dwarf galaxies in semi-analytic models built upon the millennium run - De Lucia & Blaizot 2007 and Bower et al. 2006.



The disruption of satellite galaxies that already lost their dark matter halos is one possible way to decrease the excess of dwarf galaxies in semi-analytic models.

How significant is this excess?
Can we improve the models by correctly tuning the free parameters?

Observations - Are we kidding ourselves?



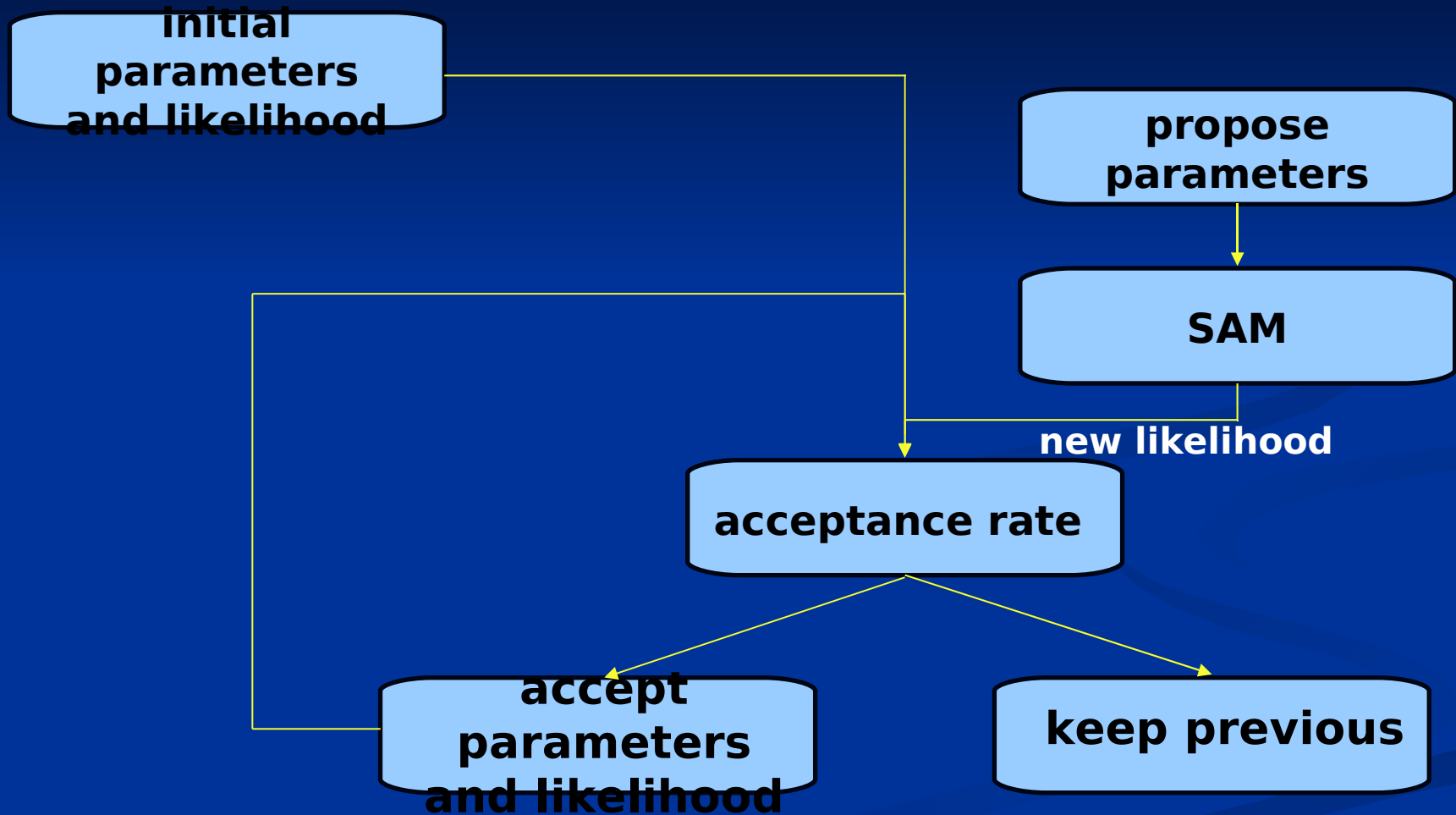
Different large galaxy surveys and different methods to determine galaxy masses produce stellar mass and luminosity functions incompatible with each other.

What is the real difference between models and observations?
What level of agreement should we require?

Monte Carlo Markov Chain Methods

- ➔ **Model with parameters that can be changed**
 - ➔ **Semi-Analytic Model of Galaxy formation - De Lucia & Blaizot 2007**
- ➔ **A distribution of properties that the model should reproduce**
 - ➔ **Galaxy Stellar Mass Function**
- ➔ **Compare the output of the model for different sets of parameters with the expected distribution**
 - ➔ **Chi-Square Test (χ^2)**

Monte Carlo Markov Chain Methods



Star Formation

$$\dot{m}_* = \alpha_{SF} \frac{(m_{cold} - m_{crit})}{t_{dyn,disk}}$$

Star Formation Efficiency ($\alpha_{SF} = 0.03$) 3% of gas converted into stars in $t_{dyn,disk}$

AGN FeedBack

→ Quascent Black Hole Accretion Rate - Radio (k_{AGN})

Amount of hot gas accreted by the central supermassive black hole during the normal life of the galaxy (once a static hot halo has formed around the host galaxy)

$$\dot{m}_{BH,R} = k_{AGN} \left(\frac{m_{BH}}{10^8 M_{\oplus}} \right) \left(\frac{f_{HOT}}{0.1} \right) \left(\frac{V_{vir}}{200 km s^{-1}} \right)^3$$

$k_{AGN} = 7.5 \times 10^{-6}$ → To reproduce the turn over at the bright end side of

→ Black Hole Growth During Mergers - Quasar (f_{BH})

Growth of black hole mass during galaxy mergers both by merging with each other and by accretion of cold disk gas

$$\dot{m}_{BH,Q} = f_{BH} \frac{(m_{sat} / m_{central}) m_{cold}}{1 + (280 km s^{-1} / V_{vir})^2}$$

$f_{BH} = 0.03$ → To reproduce the local (m_{BH} - m_{BULGE}) relation



Supernovae Feedback

→ Cold Gas Reheating

$$\epsilon_{\text{DISK}} = 3.5$$

$$\Delta m_{\text{reheated}} = \epsilon_{\text{disk}} \Delta m_*$$

→ Energy Released by a Supernova

$$\epsilon_{\text{HALO}} = 0.35$$

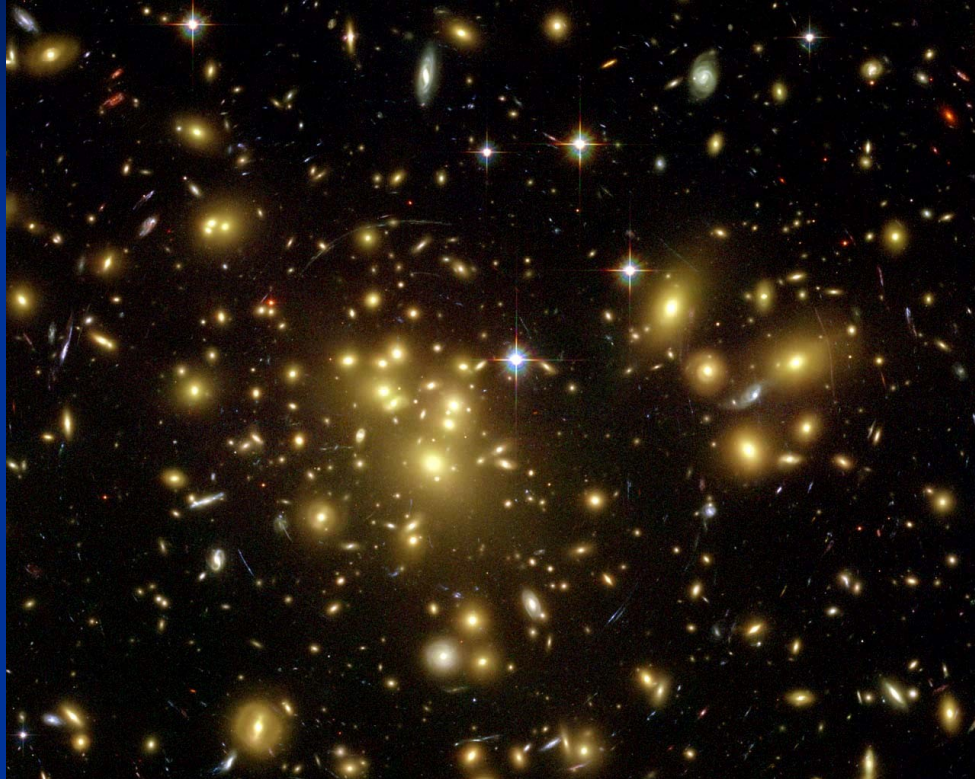
$$\Delta E_{\text{SN}} = 1.0 \epsilon_{\text{HALO}} \Delta m_* V_{\text{SN}}^2$$

→ Gas Reincorporation

$$\gamma_{\text{ej}} = 0.5$$

$$\dot{m}_{\text{ejected}} = - \frac{\gamma_{\text{ej}} m_{\text{ejected}}}{t_{\text{dyn}}}$$

Comparison with Observational Clusters

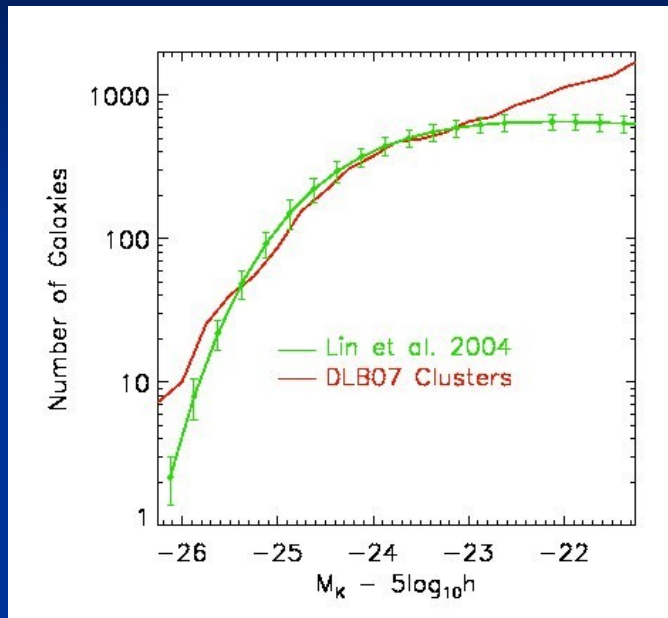


Only requires to run the SA in a few trees (relatively fast)

Clusters are free of dust (avoid “weak” assumptions on dust corrections)

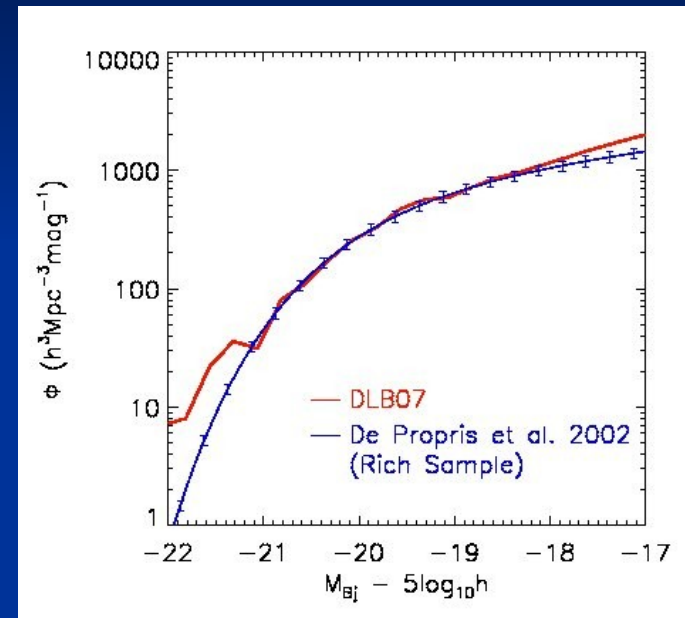
It is not affected by volume corrections

Lin et al. (2004) - 25 Clusters



derived using 2-MASS,
with X-ray
identified clusters

De Propriis et al. (2003) - 22 Clusters



cross-matched galaxies from
the 2dFGRS with published
clusters catalogues (Abell, APM
and EDCC).

Star Formation

Efficiency

→ Very well constrained at a value corresponding to 3% of cold gas being converted into stars in

SN Feedback

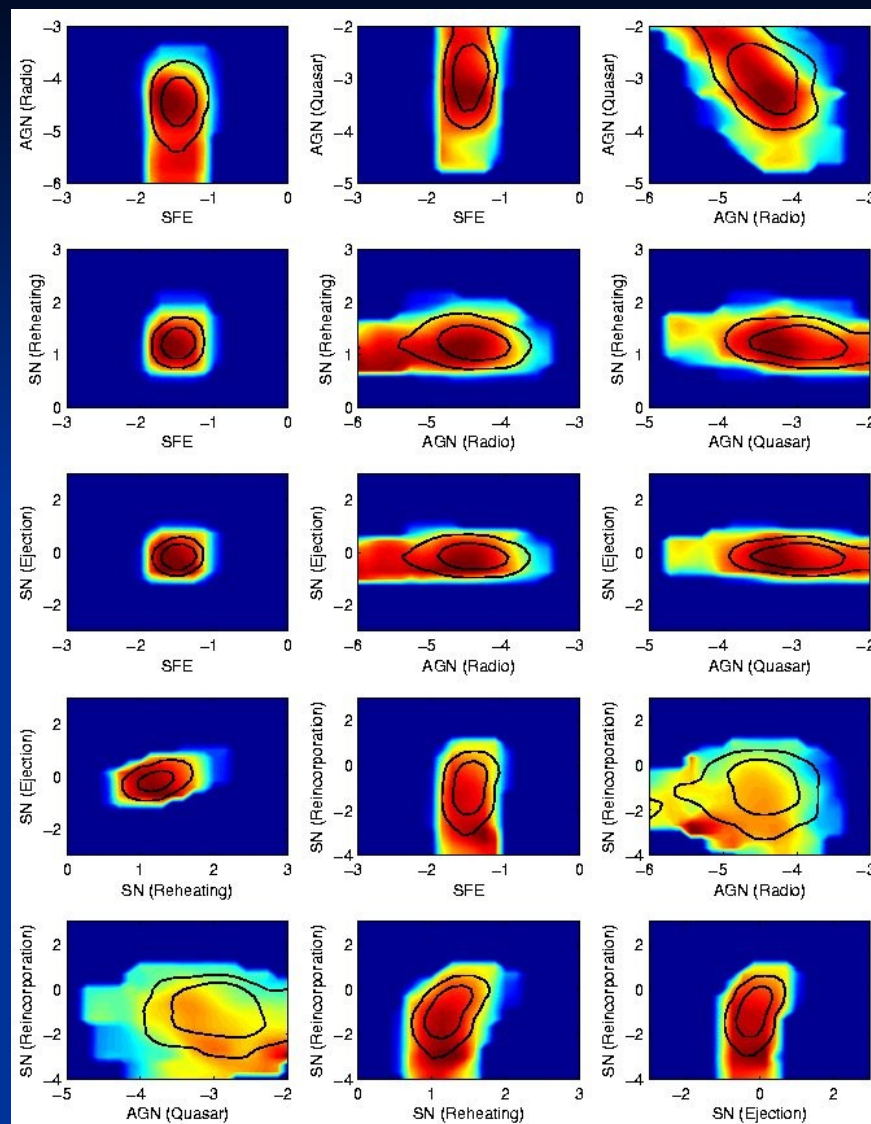
→ Very well constrained at a value higher than DLB07 to reduce the number of faint galaxies.

AGN Feedback

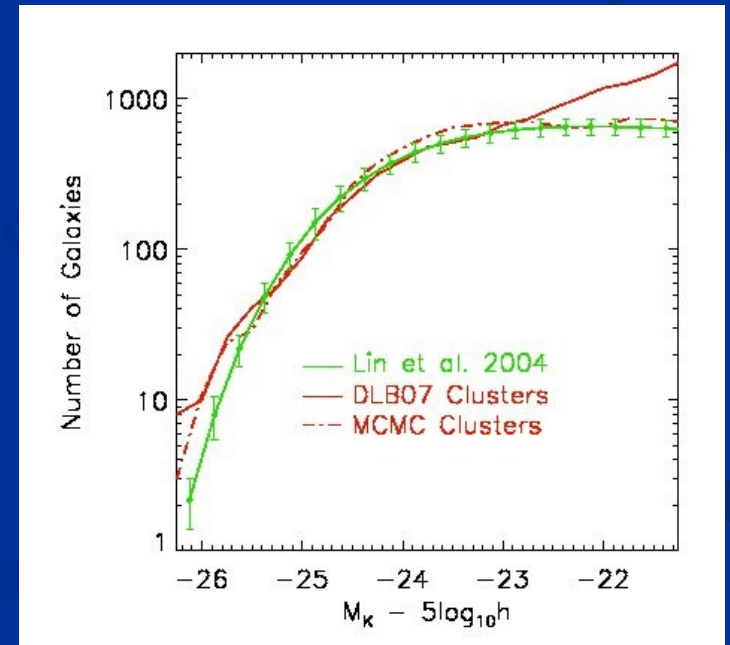
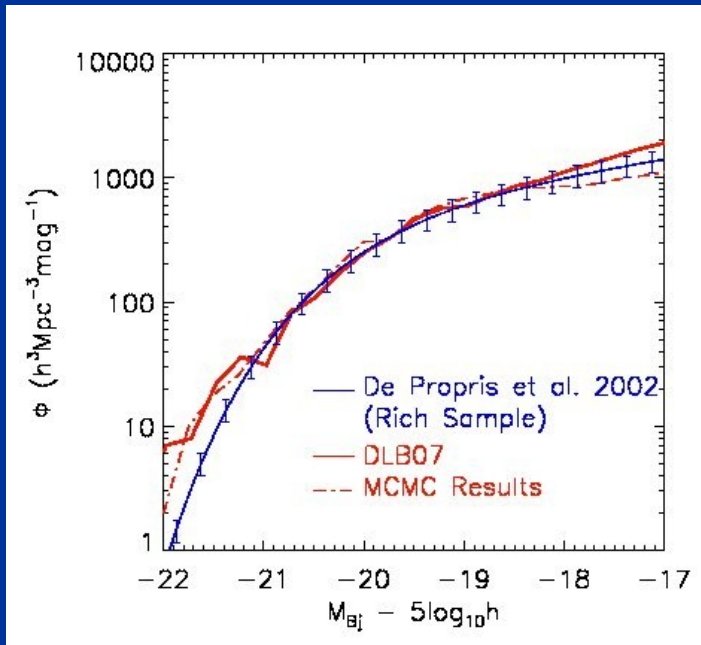
→ Strong correlation between two modes.

Gas

→ Strong correlation with AGN feedback parameters.



Parameter	DLB07	Best Fit
SFE ^S	0.03	0.033
AGN (radio)	7.5×10^{-6}	3.0×10^{-5}
AGN	3.0×10^{-2}	1.3×10^{-3}
(quasar)	3.5	16.70
SN (reheating)	0.35	0.70
SN (ejection)	0.35	0.70
Reincorporat ion	0.5	0.018



MCMC With a Full Galaxy Catalogue

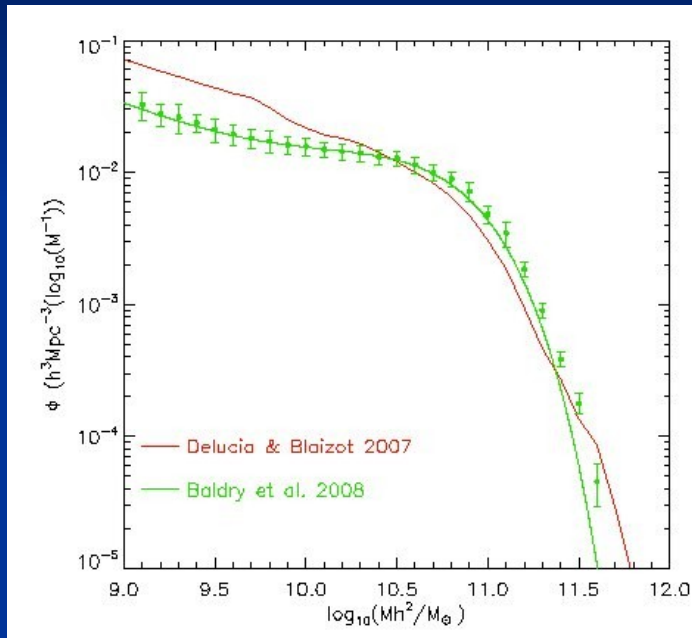


- Chose a file with mean density the similar to that of the full millennium volume.
- The luminosity function for the galaxies in this file should agree with the total LF.

Full semi-analytic model in one day
(1/512 of the Millennium volume)
30 000 steps in 100 processors



Observational Stellar Mass Function



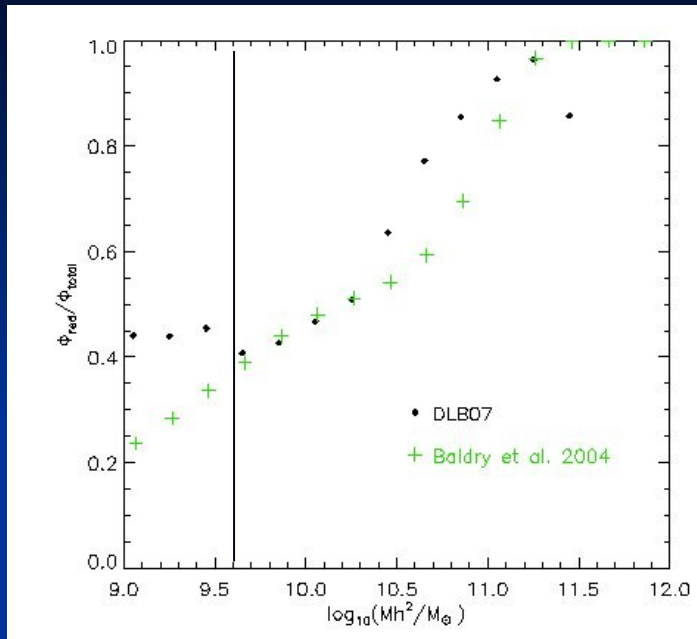
Choose a set of observables
that uniquely define all galaxy
properties

→ Stellar Mass

→ Star Formation Rate

Observational stellar mass from the NYU-VAGC low redshift galaxy sample.

Colour

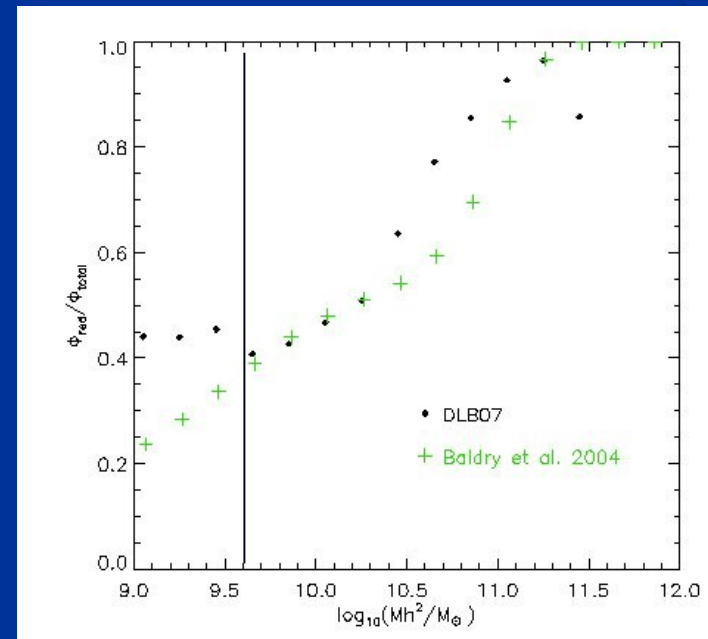


use galaxy colours to
constrain the star formation
history of model galaxies

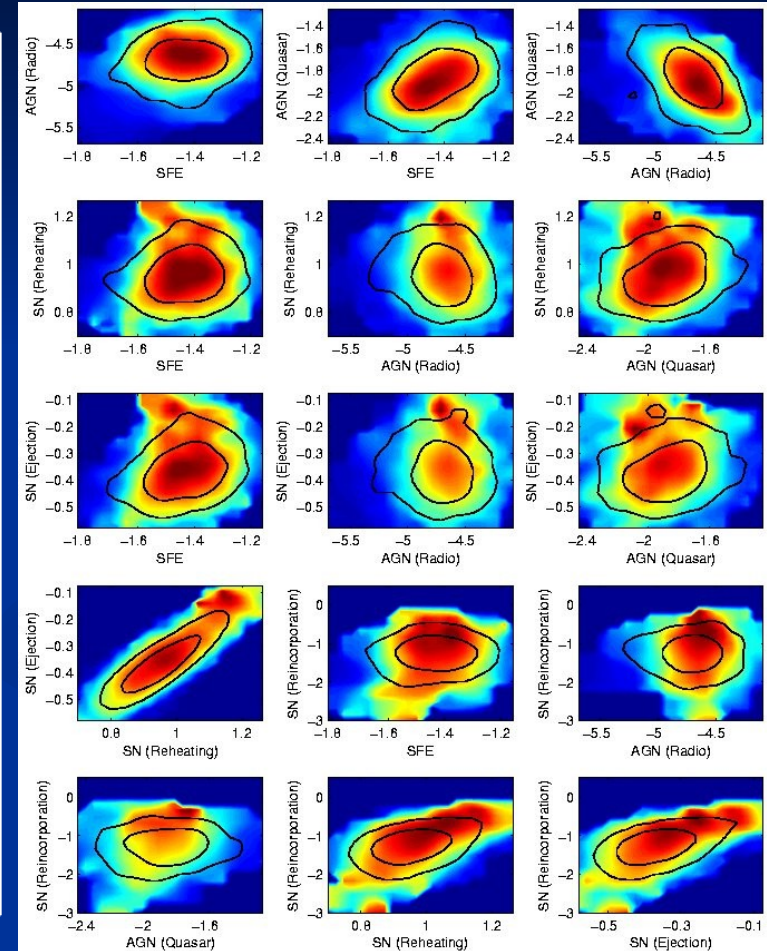
Bulge - Black Hole Mass

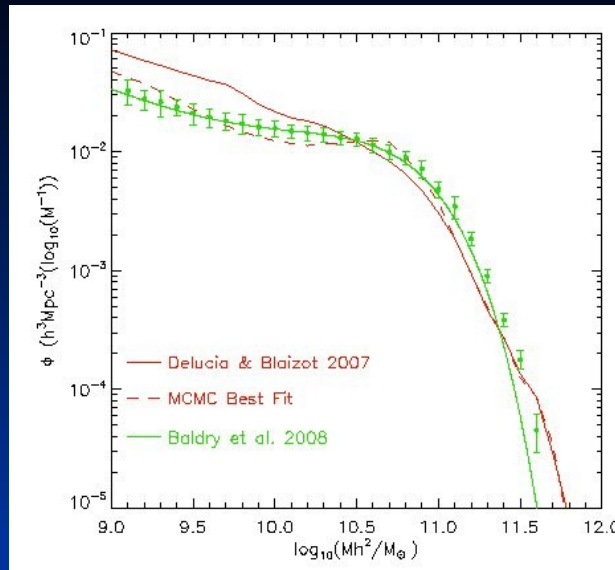


use bulge - black hole
mass relation to constrain
the AGN feedback



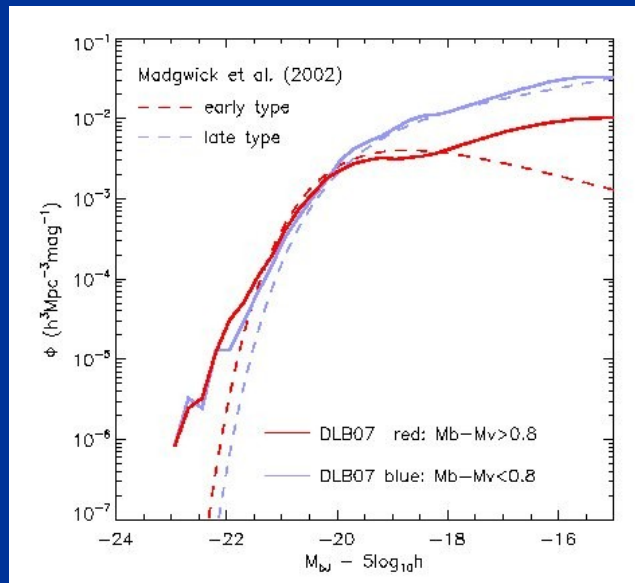
Parameters	DLB07	Best Fit Clusters	Best Fit Field
SFE	0.03	0.033	0.037
AGN (radio)	7.5×10^{-6}	3.0×10^{-5}	2.3×10^{-5}
AGN (quasar)	3.0×10^{-2}	1.3×10^{-3}	1.2×10^{-2}
SN (reheating)	3.5	16.70	8.55
SN (ejection)	0.35	0.70	0.42
Reincorporation	0.5	0.018	0.07



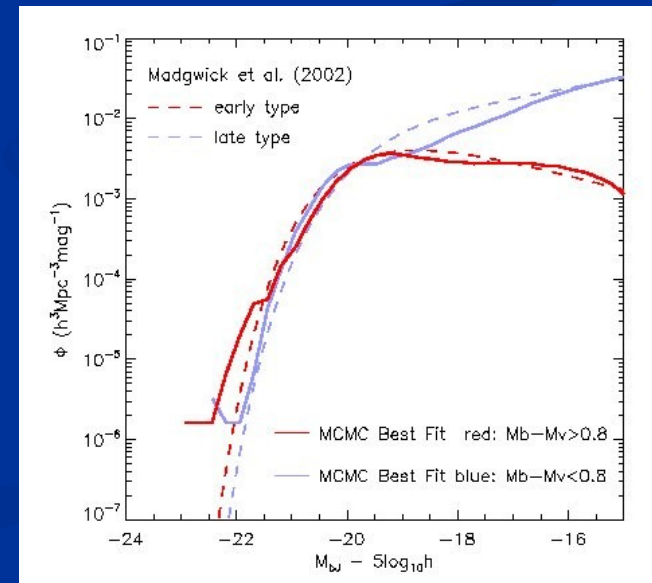


Stellar Mass Function

Original Colours



Best Fit Colours

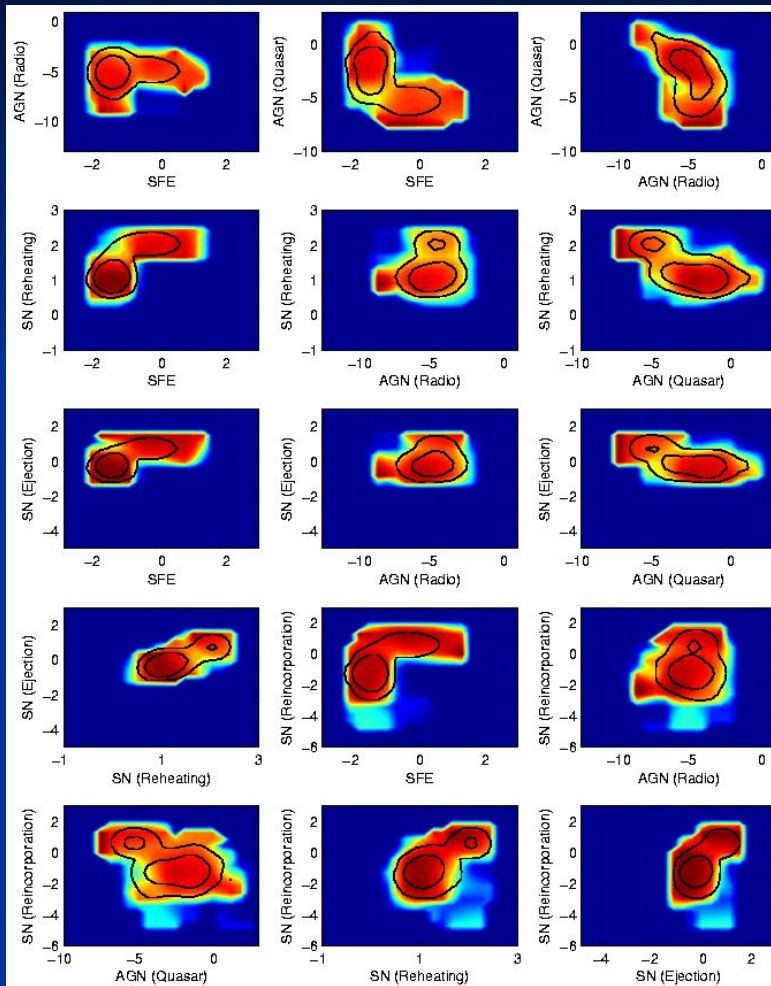


Future Work

- ➡ **Increase the number of observational constrains.**
- ➡ **Use best fits to predict high redshift observations.**
- ➡ **Use a similar approach to chose between different SA models, with different parameters and physics.**

**Kampakoglou et al.
2007**

The End



A model with instantaneous star formation is not ruled out.

At each time step all the available gas is converted into stars.

Considering the high star formation efficiency this model requires strong SN feedback, so that for most of the time steps the available gas is below the critical limit. Ruled out by star formation time scales observations.