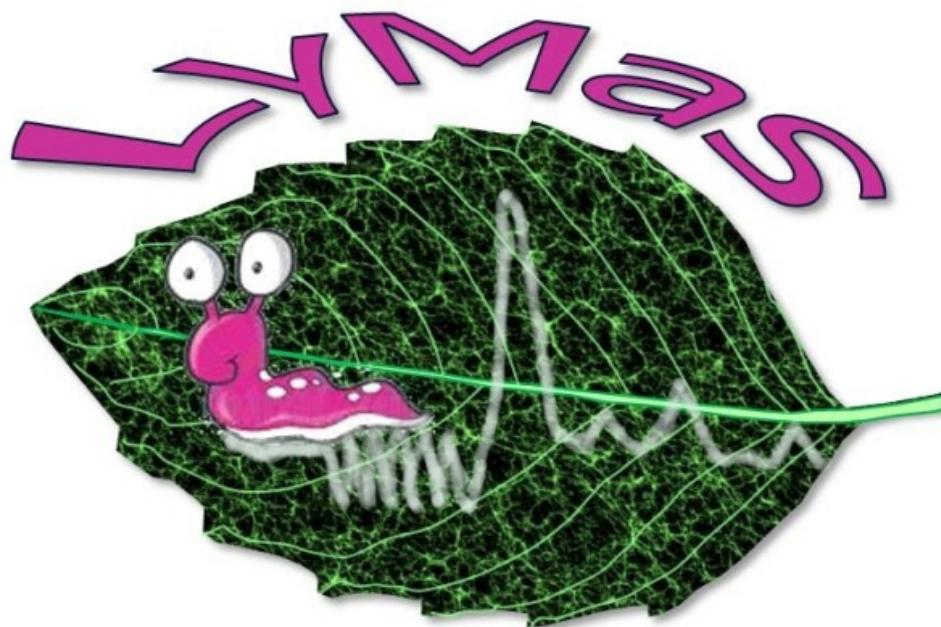


Predicting Large-Scale Lyman- α Forest Statistics from the Dark Matter Density Field

Sébastien Peirani (IAP)

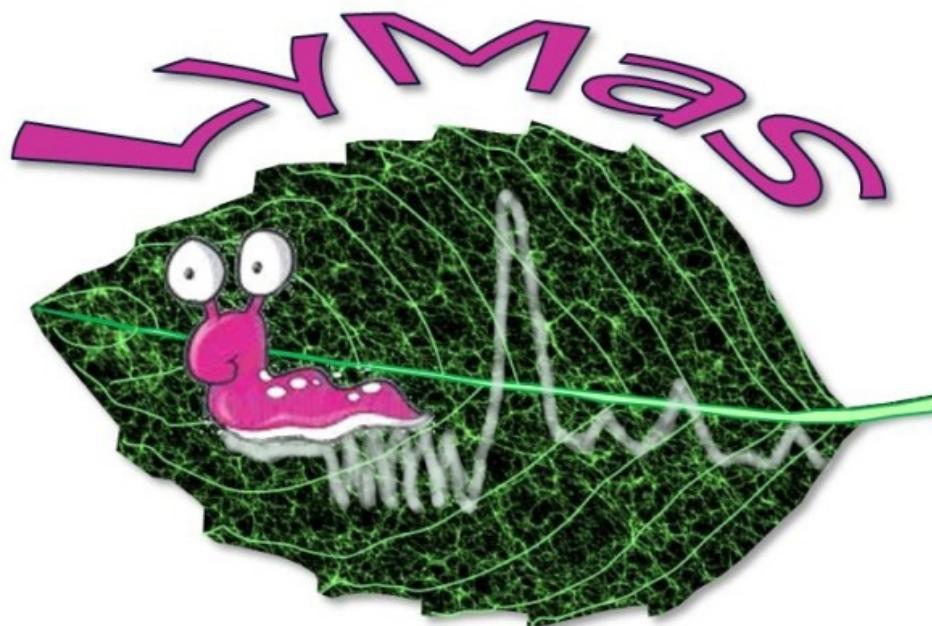


Lyman- α Mass Association Scheme

Peirani, Weinberg, Colombi, Blaizot et al., 2014, ApJ, 784, 11

Predicting Large-Scale Lyman- α Forest Statistics from the Dark Matter Density Field

Sébastien Peirani (IAP)



LyMAS



Limace



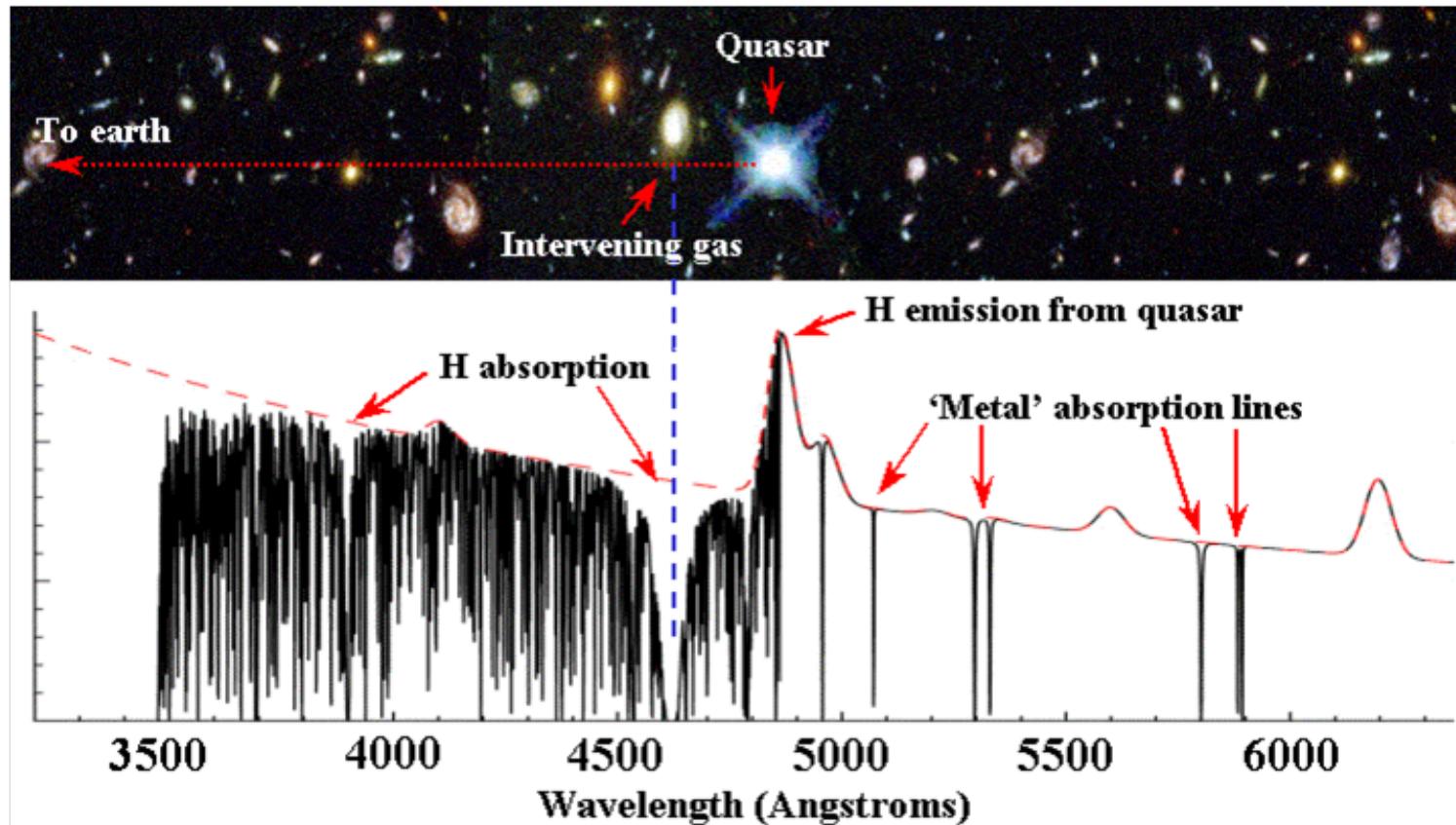
なめくじ



Lyman- α Mass Association Scheme

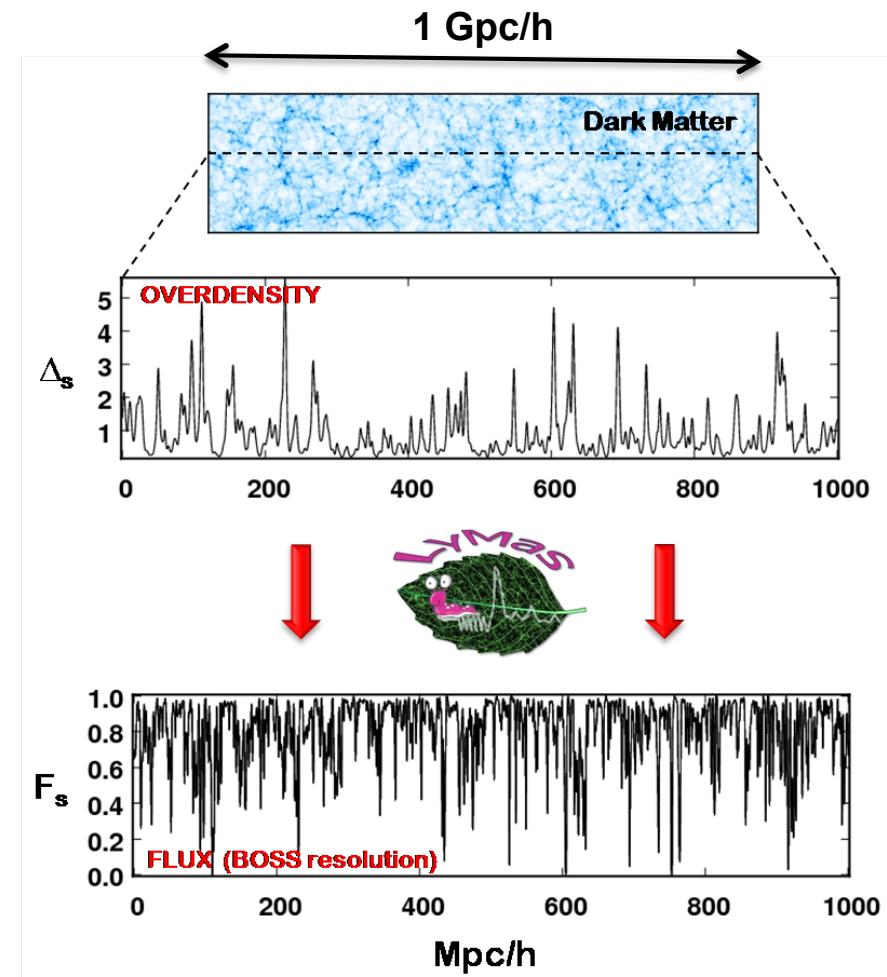
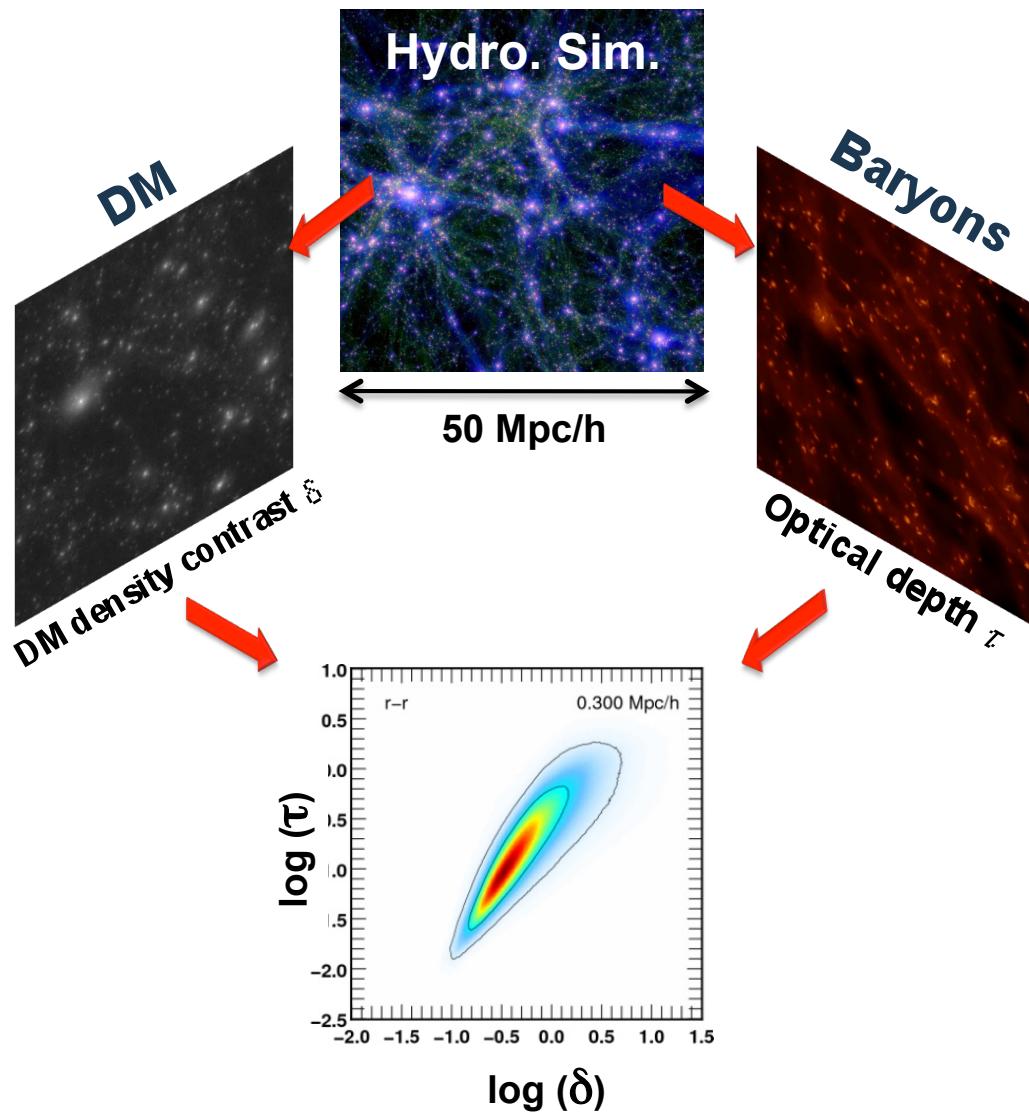
Peirani, Weinberg, Colombi, Blaizot et al., 2014, ApJ, 784, 11

Quasar spectrum

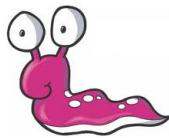


Light from distant quasars is partially absorbed as it passes through clouds of hydrogen gas

LyMAS: Ly α Mass Association Scheme



Plan



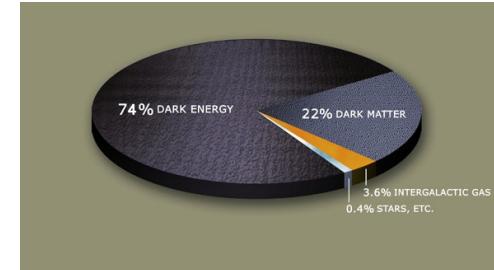
- 1. Introduction**
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How to probe dark energy?

Equation of state:

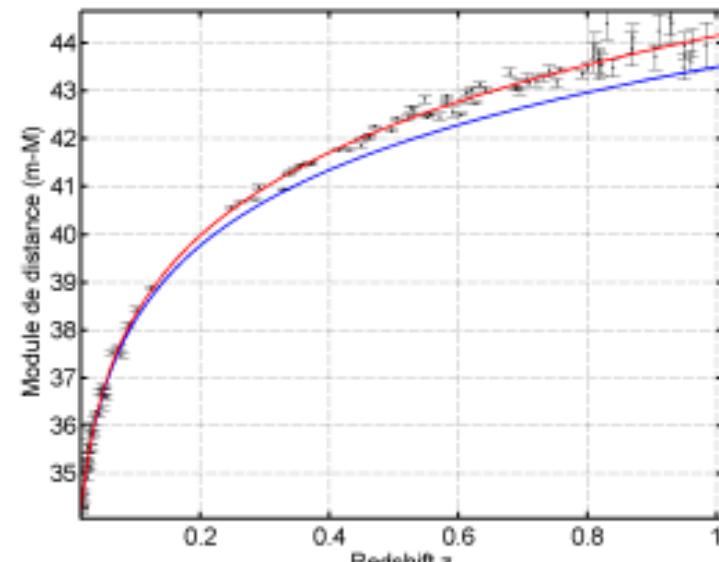
$$w = \frac{P}{\rho}$$

$$w(z) = w_0 + \frac{z}{1+z} w_a$$



Main observational methods to probe dark energy and its redshift evolution:

- Type Ia supernovae
- Galaxy clusters
- Weak gravitational lensing
- BAO



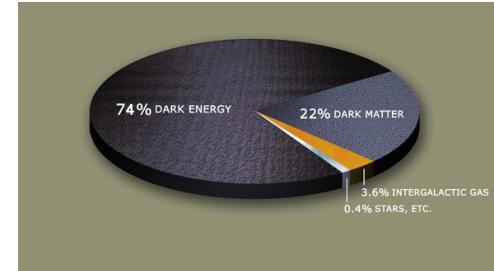
(SNLS 1st year) Astier et al. 2006

How to probe dark energy?

Equation of state:

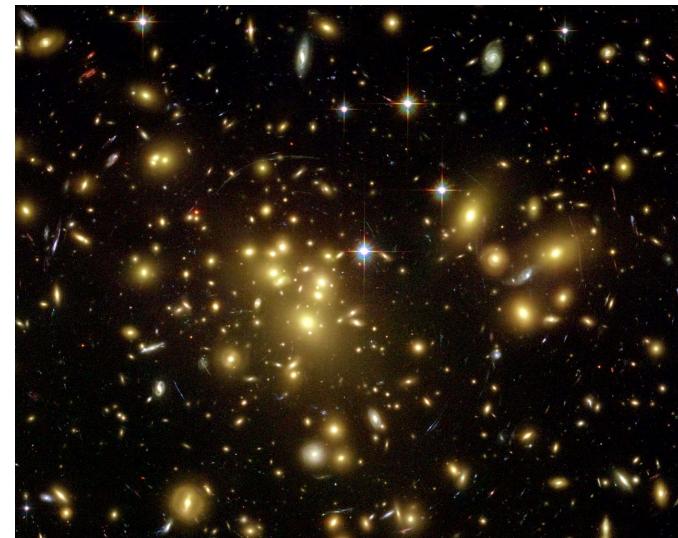
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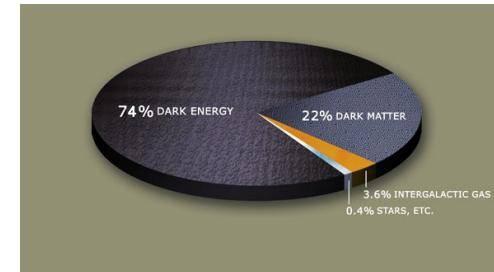
(Abell1689)

How to probe dark energy?

Equation of state:

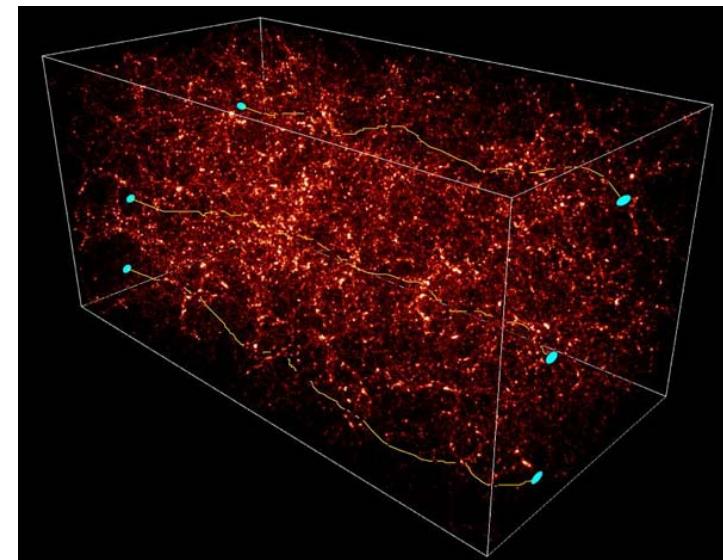
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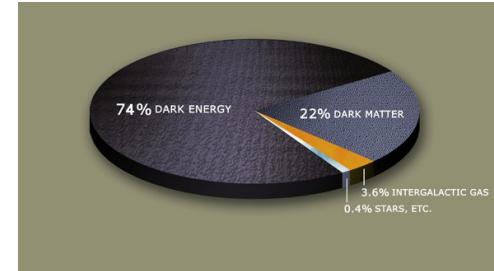
(courtesy of S. Colombi and CFHT team)

How to probe dark energy?

Equation of state:

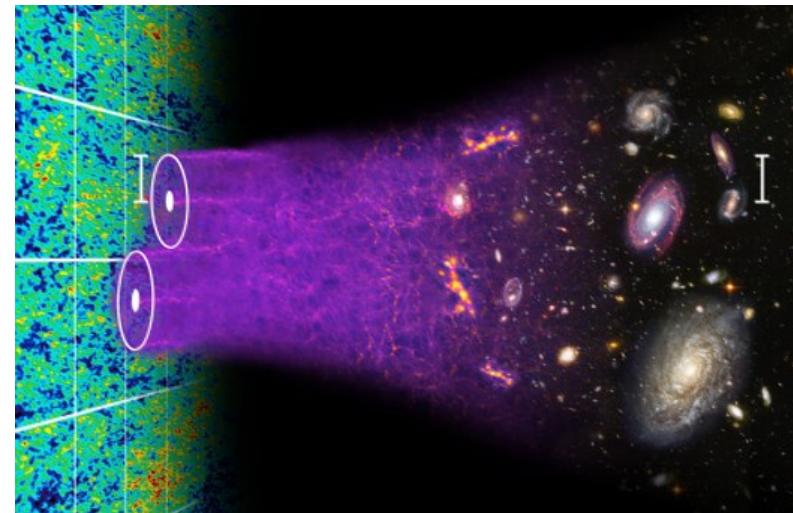
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Main observational methods to probe dark energy and its redshift evolution:

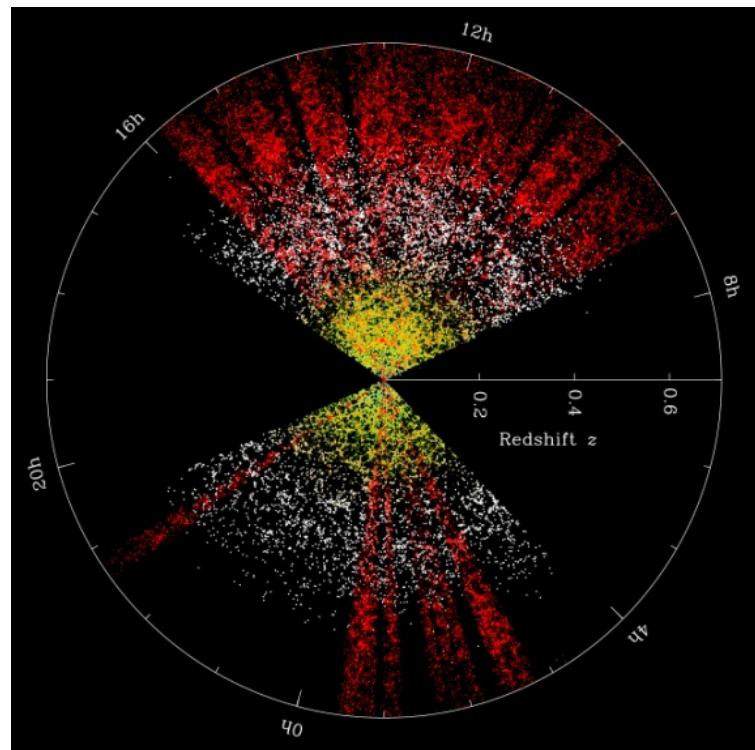
- Type Ia supernovae
- Galaxy clusters
- Weak gravitational lensing
- BAO



(courtesy of C. Blake and S. Moorfield)

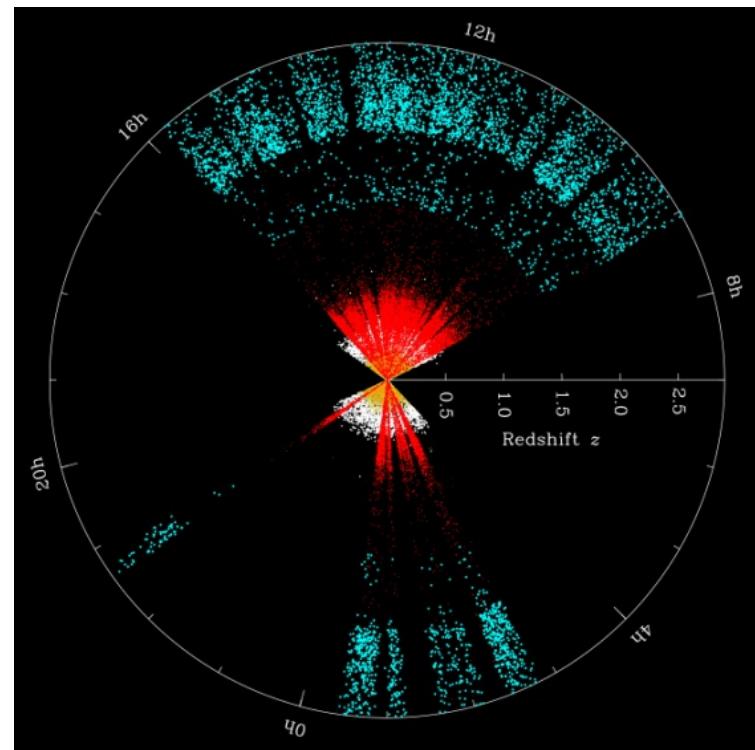
BAO probes

Luminous Red galaxies (LRGs)



(see Eisenstein et al. (2005) using SDSS DR3)

Ly α Forest

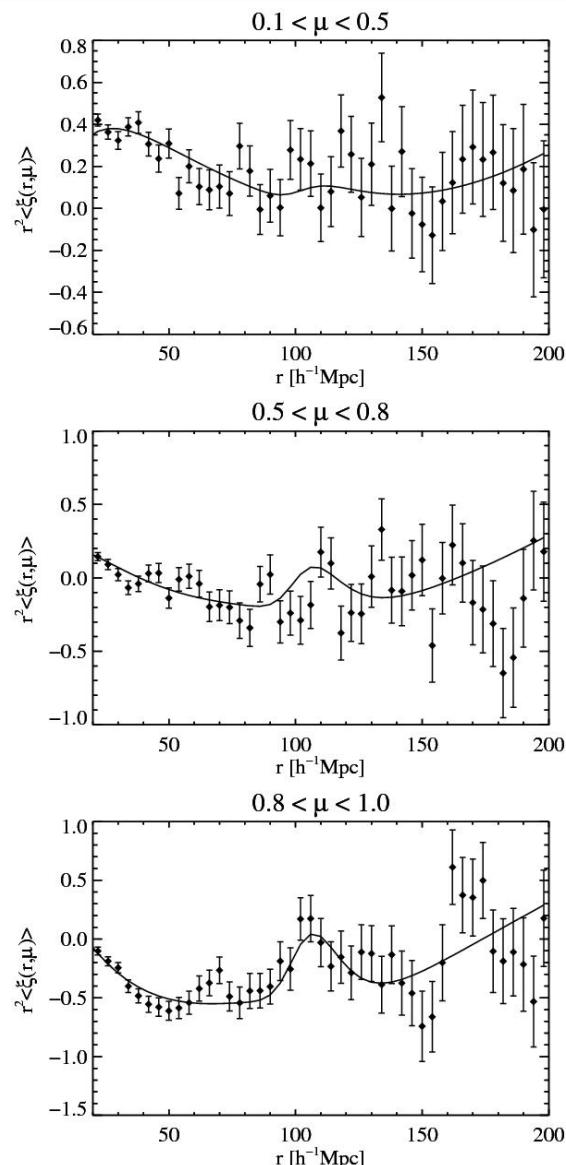
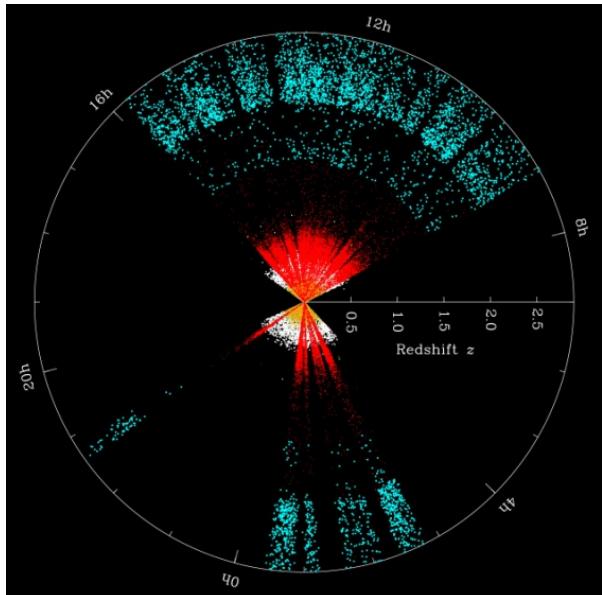


(courtesy of M. Blanton – SDSS-III)

First detection of BAO through Ly- α forest analysis

Busca et al. (2013)
Slosar et al. (2013)

Using ~ 50000 quasars in the redshift range $2.1 \leq z \leq 3.5$ from BOSS DR9



Construction of Mock Ly- α spectra for large surveys

Existence of a tight correlation between density and temperature

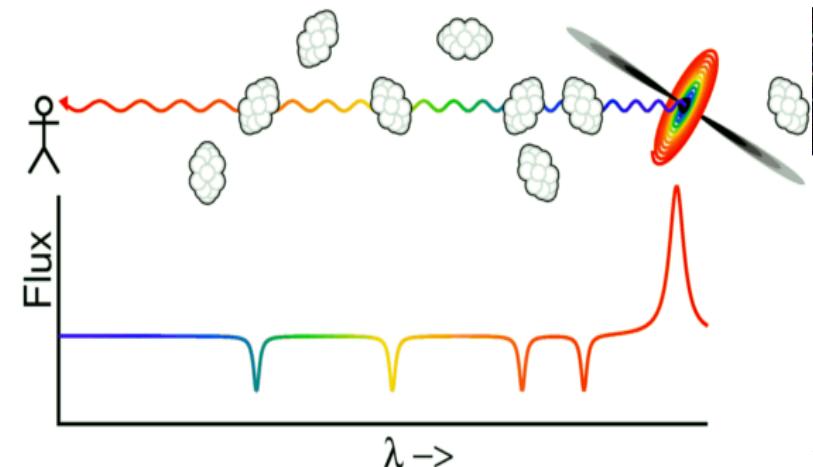
(Katz, Weinberg & Hernquist 1996; Hui & Gnedin 1997)



“Fluctuating Gunn-Peterson Approximation”

Ly α Optical depth τ \longleftrightarrow DM overdensity Δ

(FGPA, Katz, Weinberg & Hernquist 1998; Croft et al. 1998)

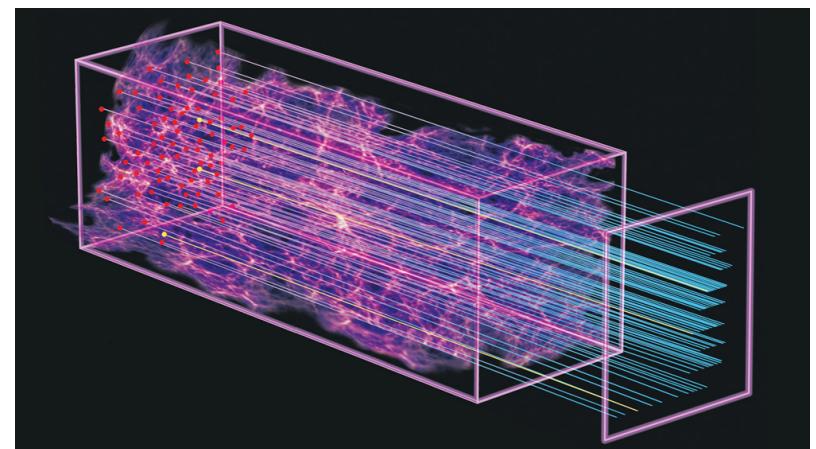


Mock Ly- α : log-normal density field + FGPA

Log-normal density field

Gaussian initial conditions

DM density field from N-body simulation



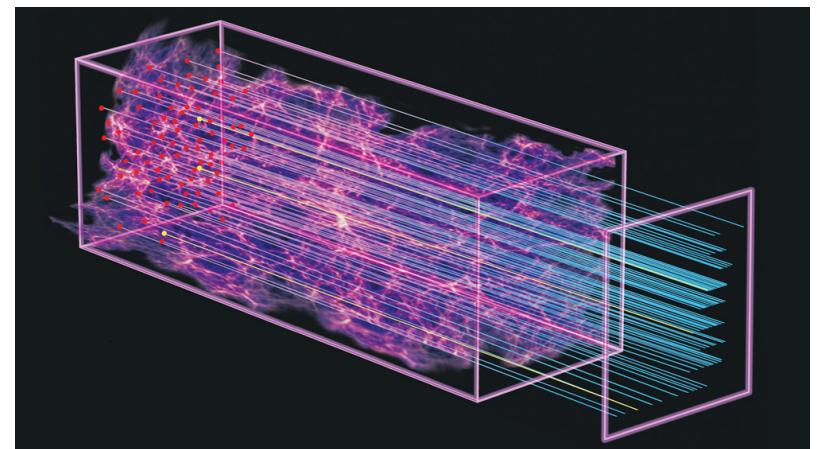
Construction of Mock Ly- α spectra for large surveys

Mock Ly- α : log-normal density field + FGPA

Log-normal density field

Gaussian initial conditions

DM density field from N-body simulation



Problems of this approach:

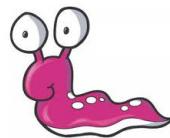
- Model Gpc³ volume while retaining good resolution on the gas Jeans scale
- The choice of the smoothing scale for DM produces ambiguity in the predictions
- The FGPA assumes a deterministic relation between ρ and $F=e^{-\tau}$

$$F = e^{-A \left(\frac{\rho}{\bar{\rho}} \right)^{2-0.6(\gamma-1)}}$$

$\gamma-1$: index of the gas temperature-density relation

A : normalization constant

Plan



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MareNostrum (2006)

■ Horizon-MareNsotrum simulation

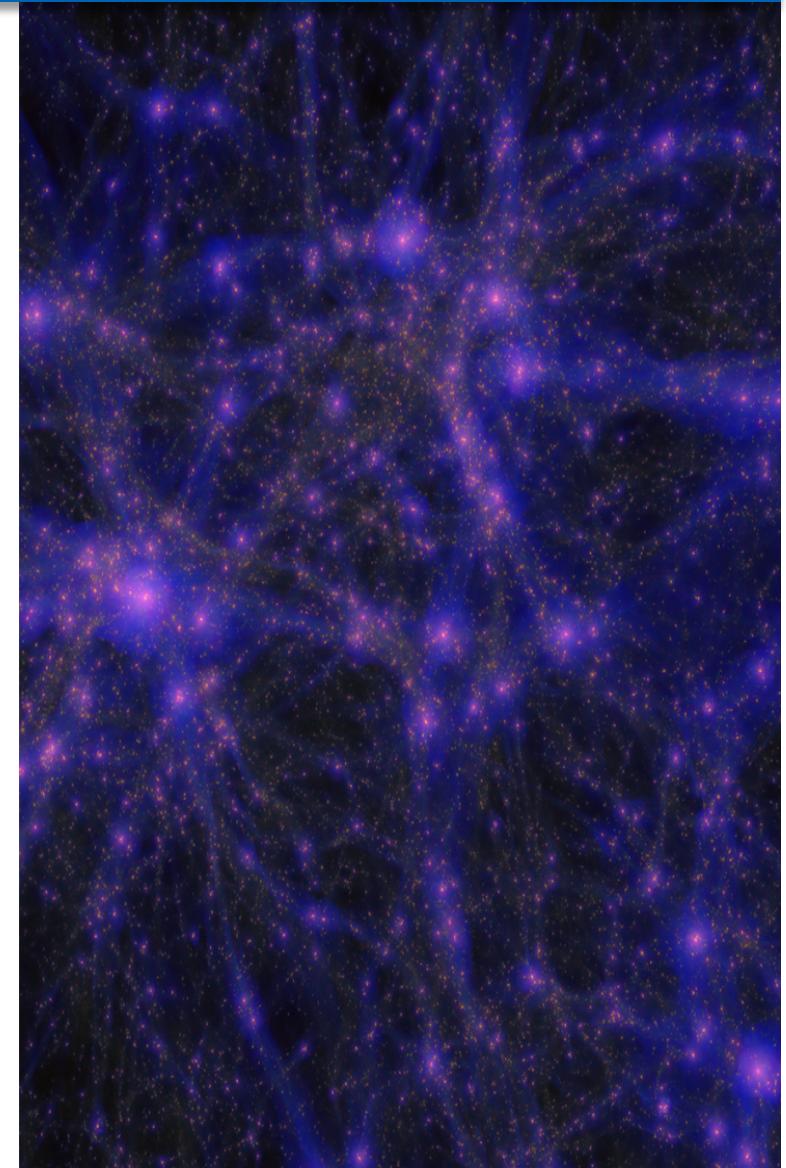
(PI J. Devriendt, R. Teyssier, G. Yepes)

- $L_{\text{box}} = 50 \text{ Mpc}/h$
- $1024^3 \text{ DM particles } M_{\text{DM,res}} = 8 \times 10^6 M_{\text{sun}}$
- Finest cell resolution $dx = 1 \text{ kpc}$ (-1 level of refin.)
- Gas cooling & UV background heating
- Low efficiency star formation
- Stellar winds + SNII + SNIa
- O, Fe, C, N, Si, Mg, H metals w/ solar composition
- AGN feedback radio/quasar

■ Outputs

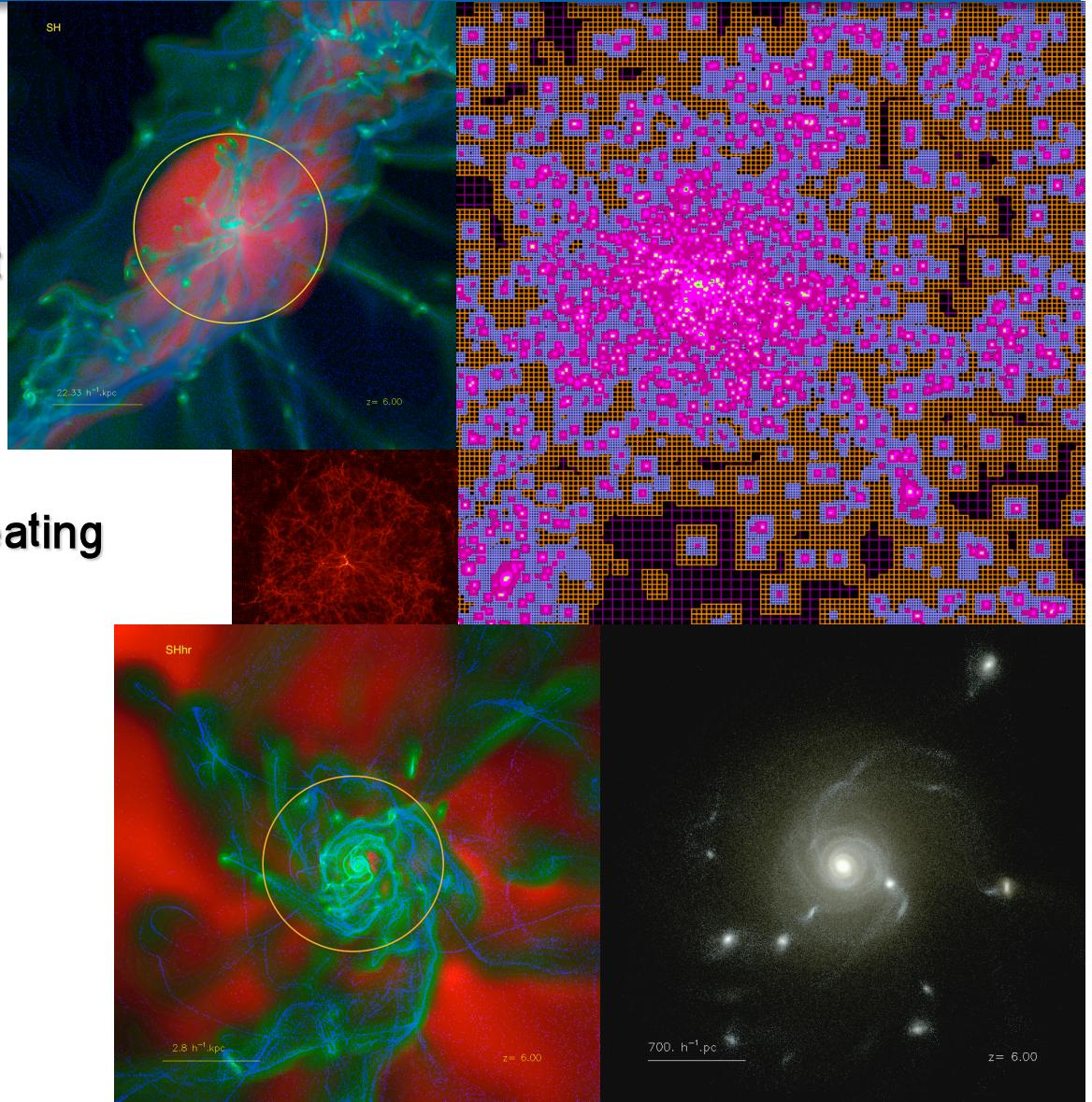
- Simulation outputs
- Lightcones ($1^\circ \times 1^\circ$) performed on-the-fly
 - Dark Matter (position, velocity)
 - Gas (position, density, velocity, pressure, chemistry)
 - Stars (position, mass, velocity, age, chemistry)
 - Black holes (position, mass, velocity, accretion rate)

■ $z=1.5$ using 1.3 Mhours using 2048 cores



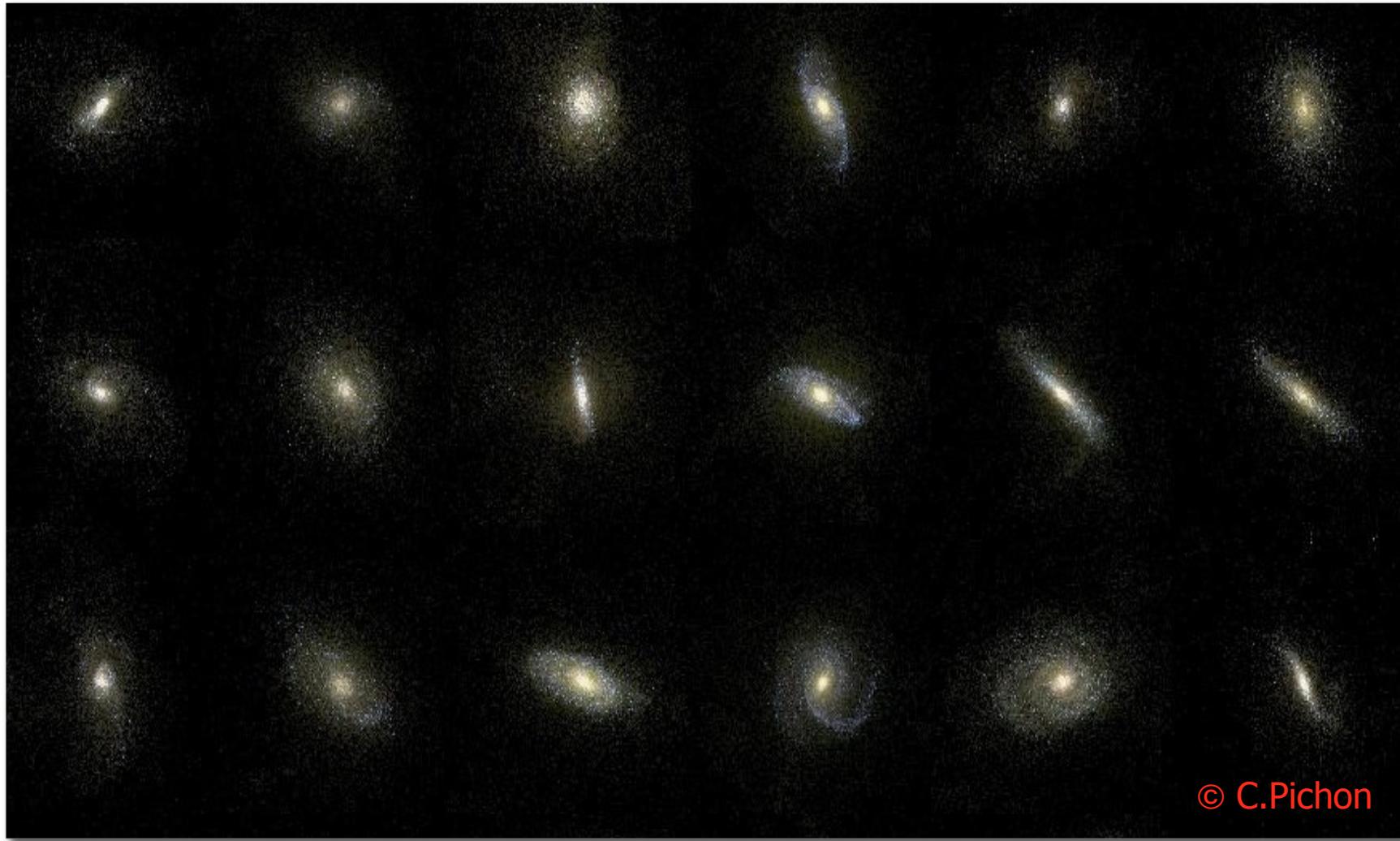
RAMSES: an adaptive Mesh Refinement (AMR) code

- Language :
 - Fortran 90
 - MPI parallel
- Method : adaptive grid refinement
- Equations :
 - Hydrodynamics
 - Gravity
 - Atomic/Metal cooling + UV-heating
 - (Magneto-hydrodynamics)
 - (Radiative transfer)
- Sub-grid physics :
 - Star formation
 - Supernovae & Stellar Winds
 - Active Galactic Nuclei (AGN)
- Cosmology



See Teyssier, 2002

The MareNostrum Galaxy Gallery



© C.Pichon

Stars are shown in true observed colors (I K and IRAC @ 8 microns)

<http://www.projet-horizon.fr>

Horizon-AGN

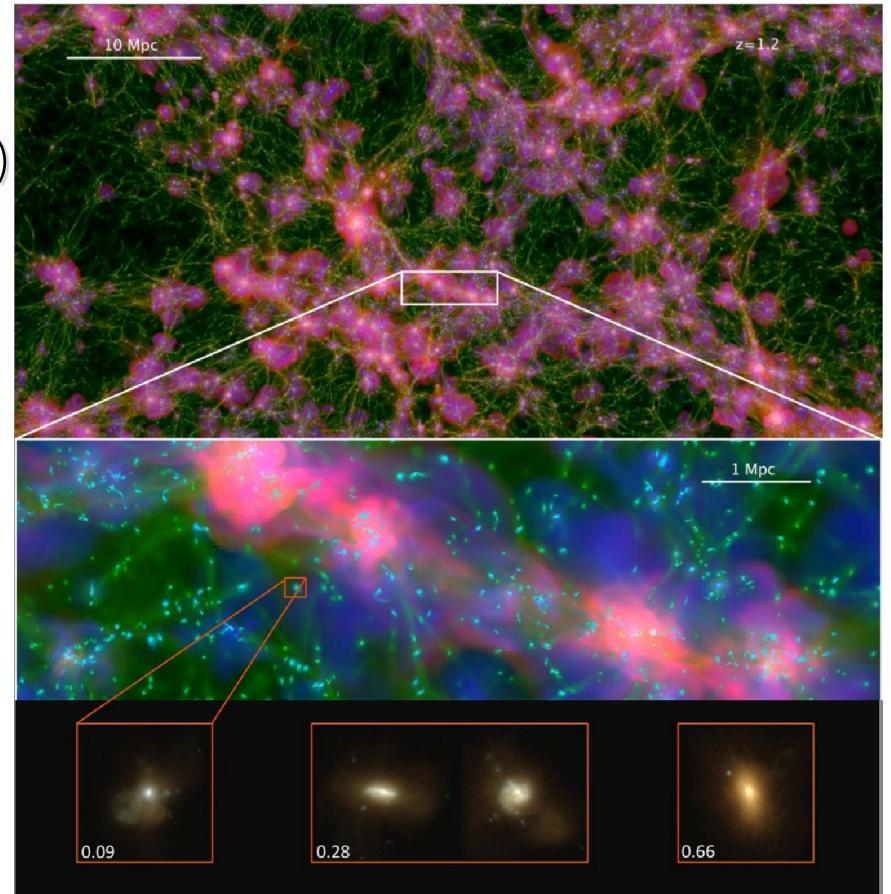
■ Horizon-AGN simulation

- $L_{\text{box}} = 100 \text{ Mpc}/h$
- 1024^3 DM particles $M_{\text{DM,res}} = 8 \times 10^7 M_{\text{sun}}$
- Finest cell resolution $dx = 1 \text{ kpc}$ (-1 level of refin.)
- Gas cooling & UV background heating
- Low efficiency star formation
- Stellar winds + SNII + SNIa
- O, Fe, C, N, Si, Mg, H
- AGN feedback radio/quasar

■ Outputs

- Simulation outputs
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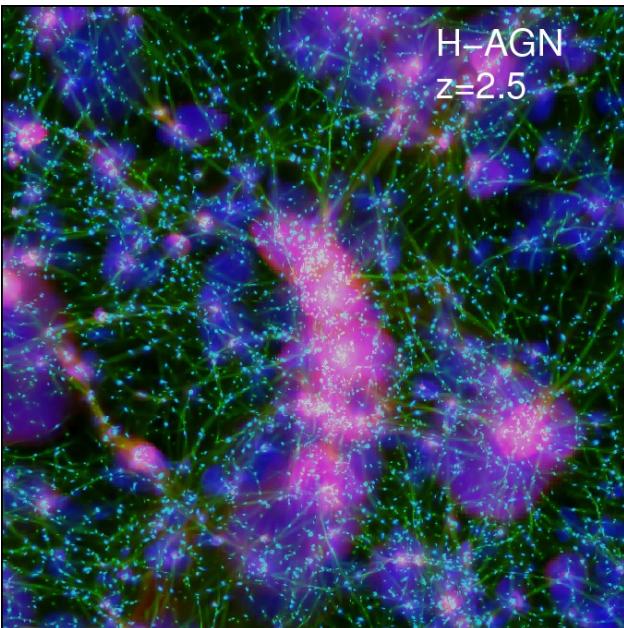
■ $z=0.05$ using 10 Mhours using 4096 cores



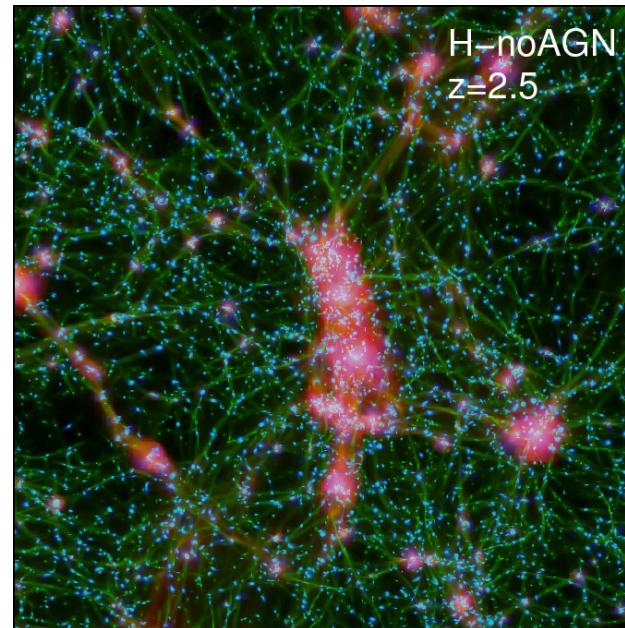
Dubois et al. (2014)

Horizon-AGN – Horizon-noAGN (2014)

Horizon-AGN (Dubois)



Horizon-noAGN (Peirani)



Gas density

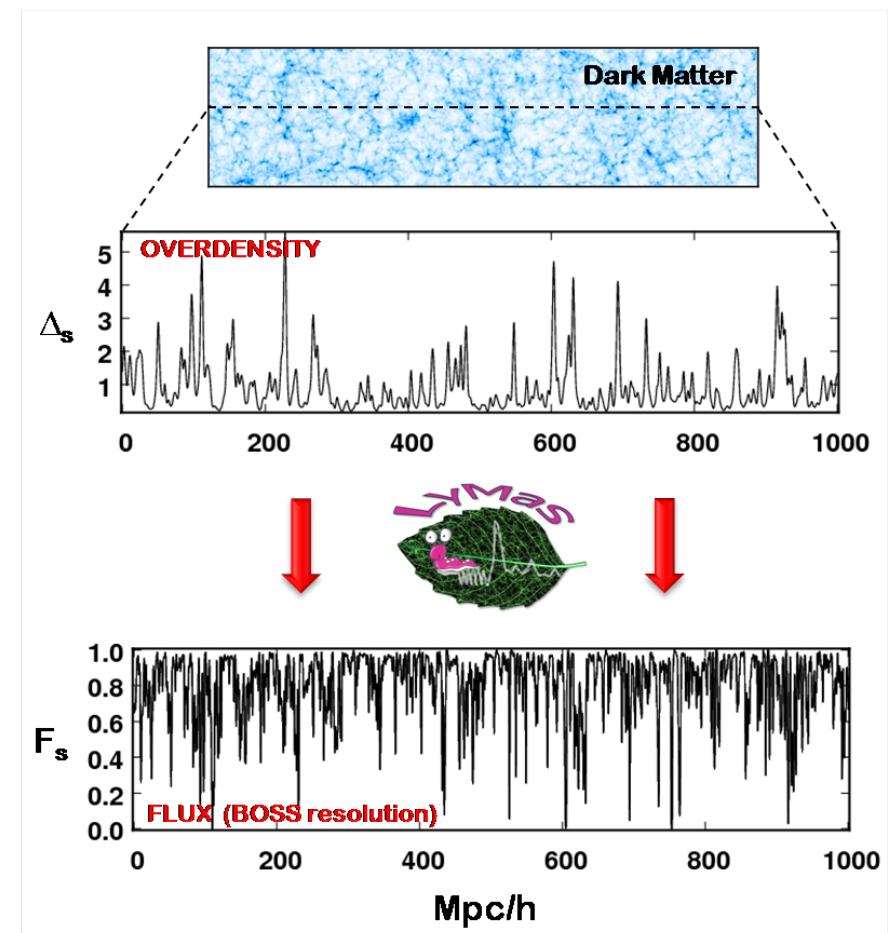
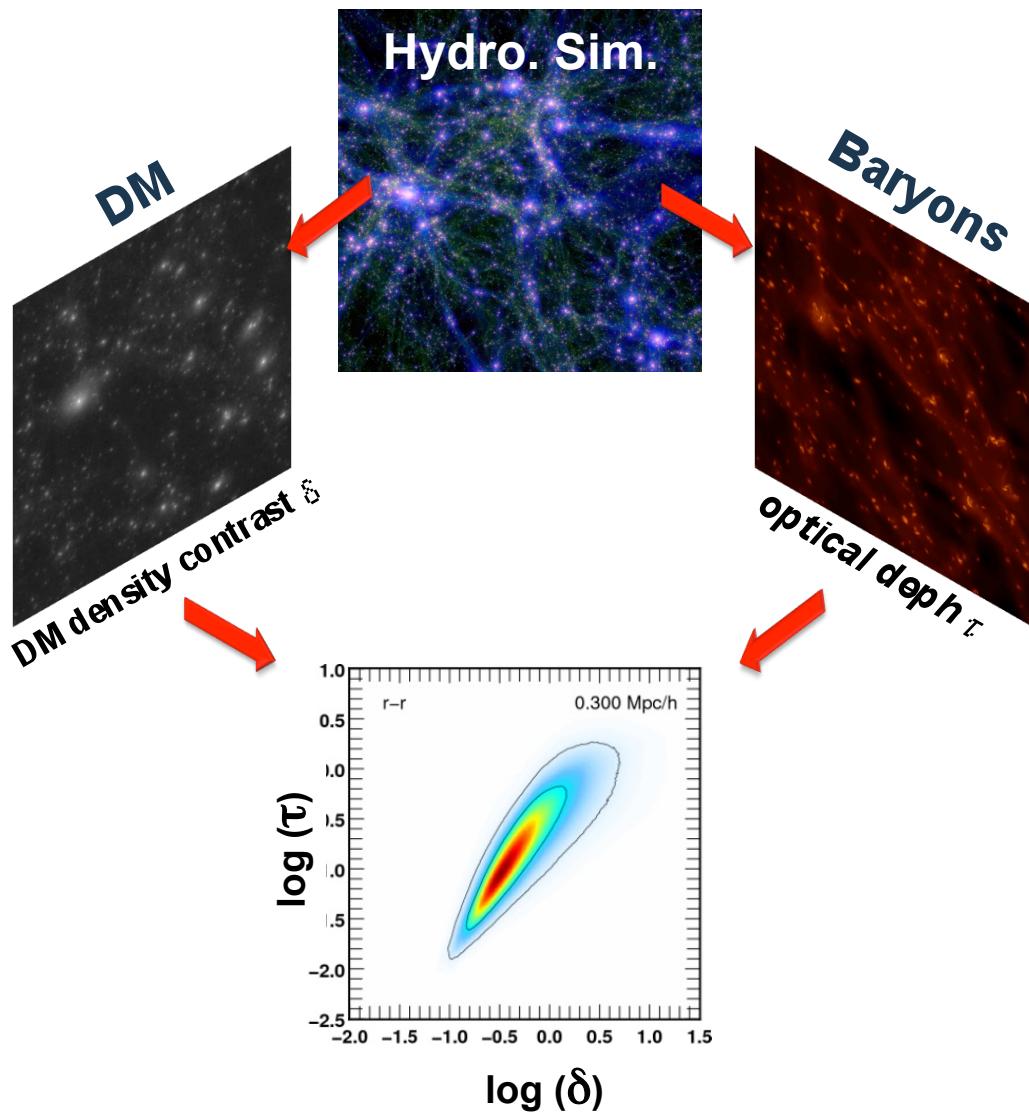
Gas temperature

Gas metallicity

- $L_{\text{box}} = 100 \text{ Mpc}/h$
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- Finest cell resolution $dx = 1 \text{ kpc}$ (-1 level of refin.)
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LyMAS: Ly α Mass Association Scheme



Extracting Ly α spectra

For a given los, the opacity at observer-frame frequency ν_{obs} :

$$\tau(\nu_{\text{obs}}) = \sum_{\text{cells}} n_{\text{HI}} \sigma(\nu_{\text{obs}}) dl$$

n_{HI} : numerical density of neutral H atoms in each cell

dl : physical cell size

$\sigma(\nu_{\text{obs}})$: the cross section of Hydrogen to Ly α photons

$$\sigma(\nu_{\text{obs}}) = f_{12} \frac{\pi e^2}{m_e c} \times \frac{H(a, x)}{\sqrt{\pi} \Delta \nu_D}$$

$f_{12} = 0.4162$: Ly α oscillator strength

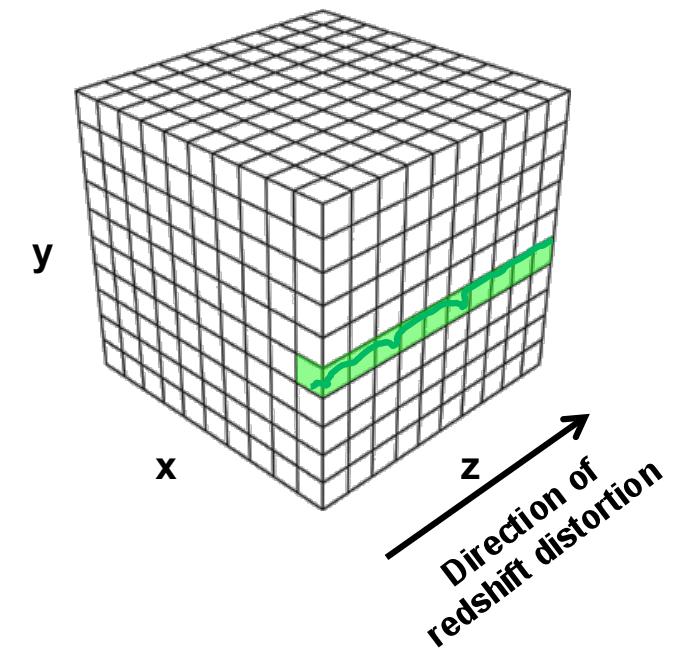
$$\Delta \nu_D = (2k_B T / m_H)^{1/2} \times \nu_\alpha / c$$

$$a = \Delta \nu_L / (2 \Delta \nu_D) \quad \Delta \nu_L \approx 9.9 \times 10^7 \text{ s}^{-1}$$

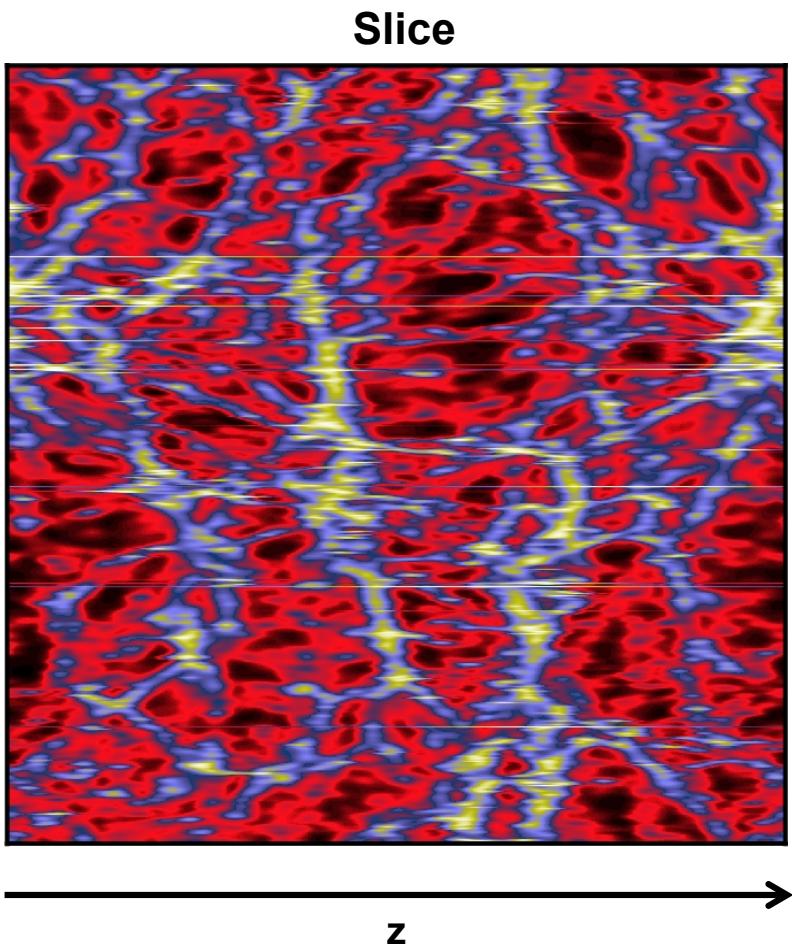
$$H(a, x) = \frac{a}{\pi} \int_{-1}^1 \frac{e^{-y^2}}{a^2 + (x - y)^2} dy \quad : \text{the Hjerting function}$$



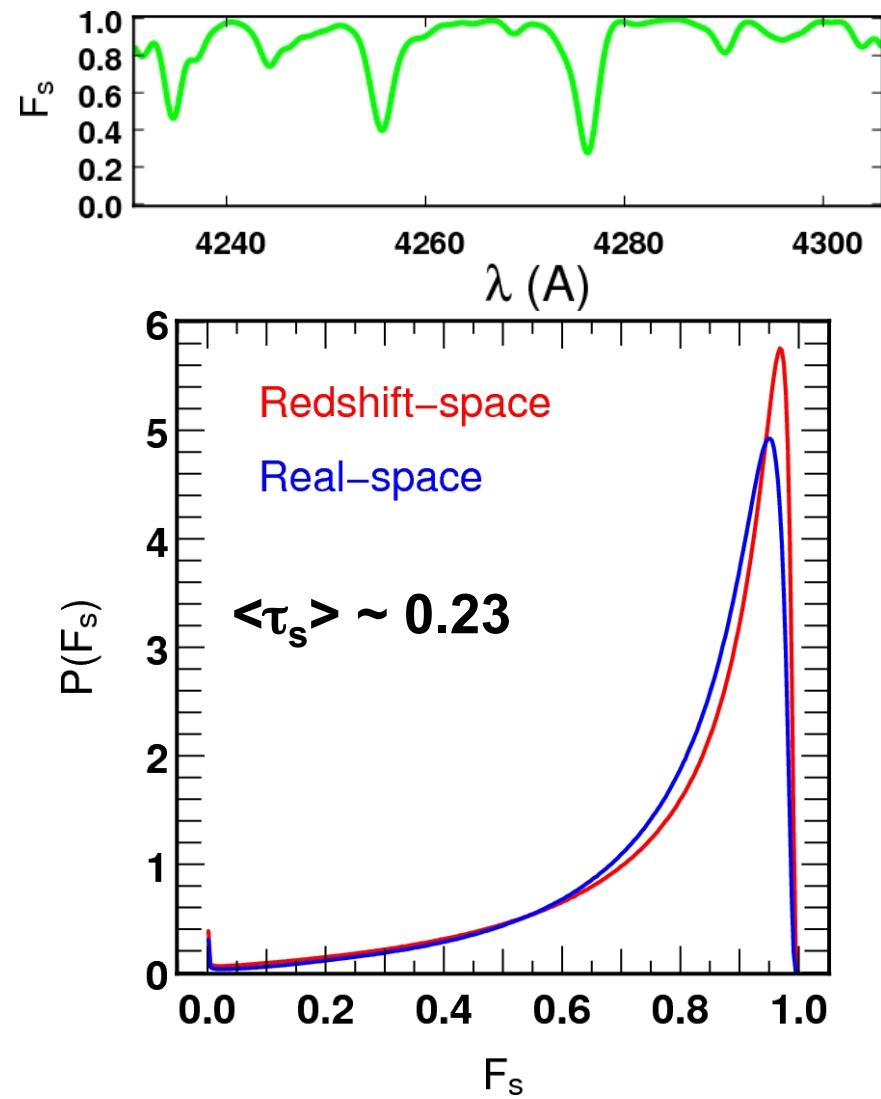
Grid of density transmitted Flux (1024^3 pixels)



Extracting Ly α spectra

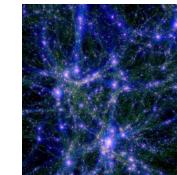


1-d smoothed at the BOSS resolution



Extracting Dark matter skewers

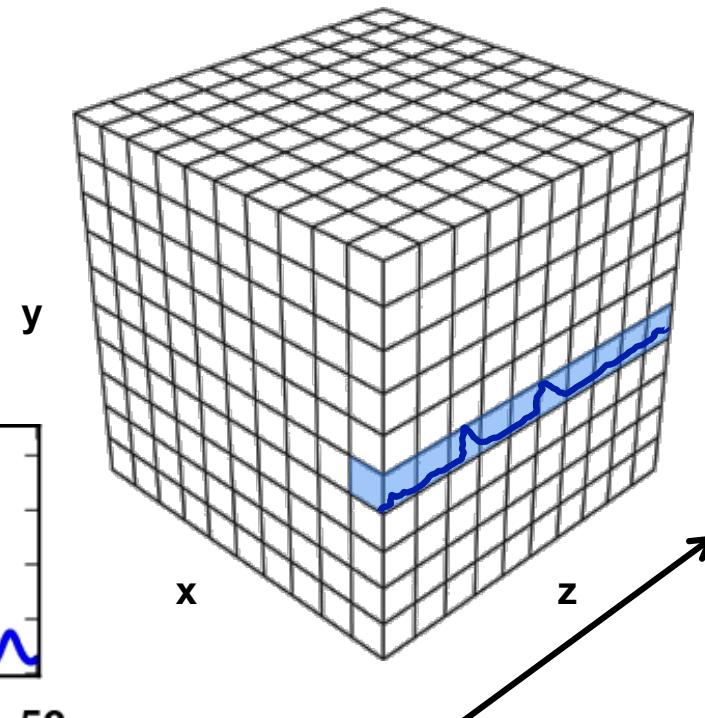
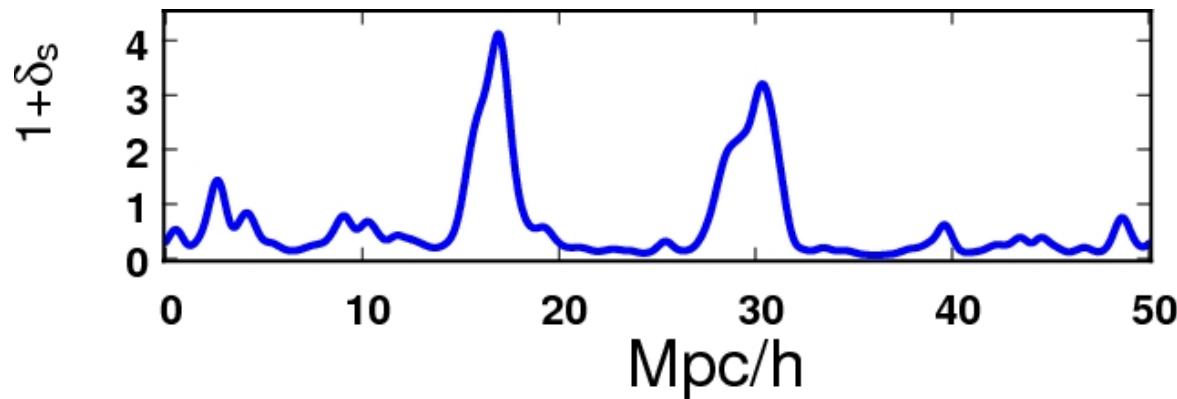
1. Adaptive interpolation of the DM particle distribution on a high resolution grid.



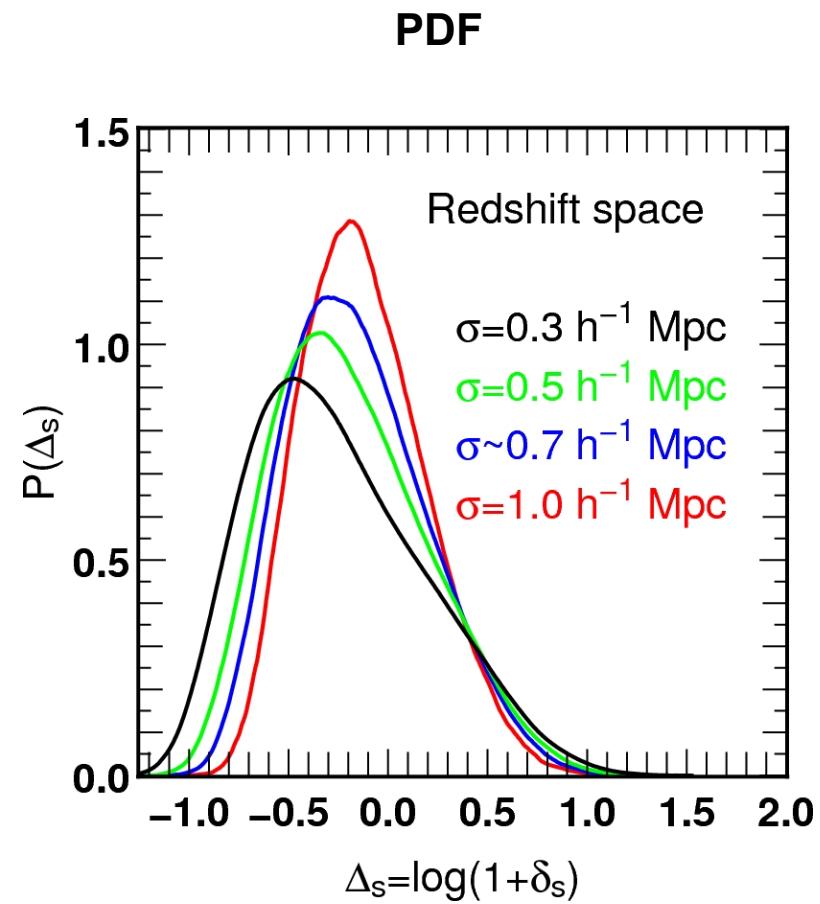
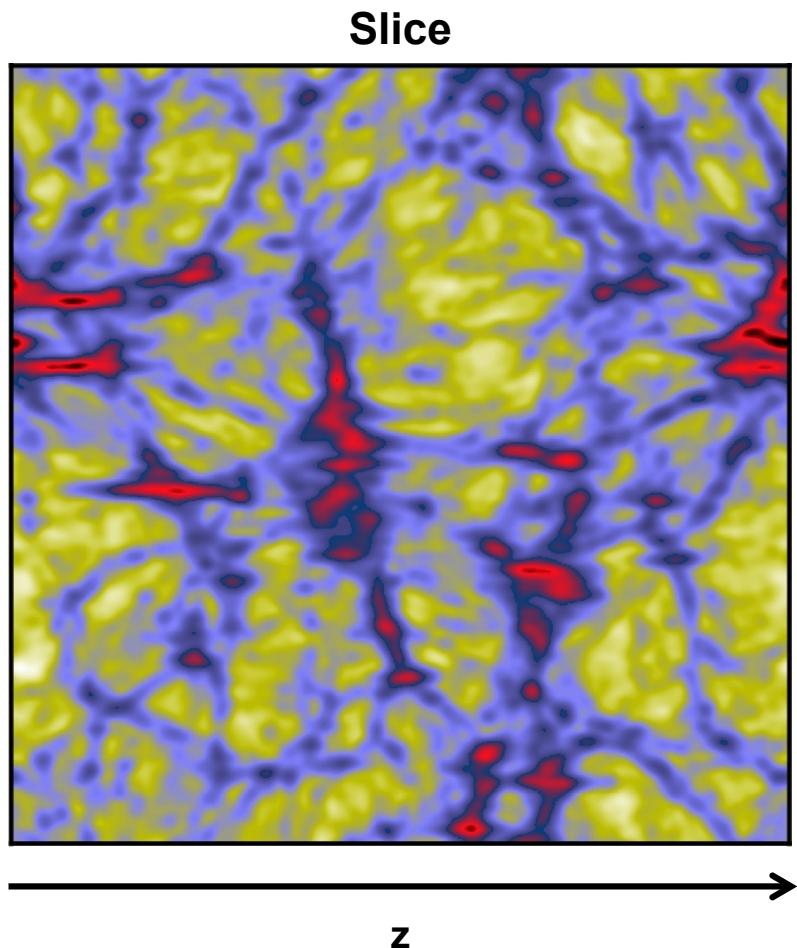
2. Smoothing with a Gaussian window in Fourier space

3. Extraction of the skewers from a grid of lines of sight aligned along the z axis

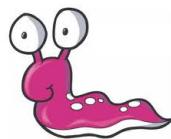
Grid of density field $1+\delta$ (1024^3 pixels)



Extracting Dark matter skewers



Plan



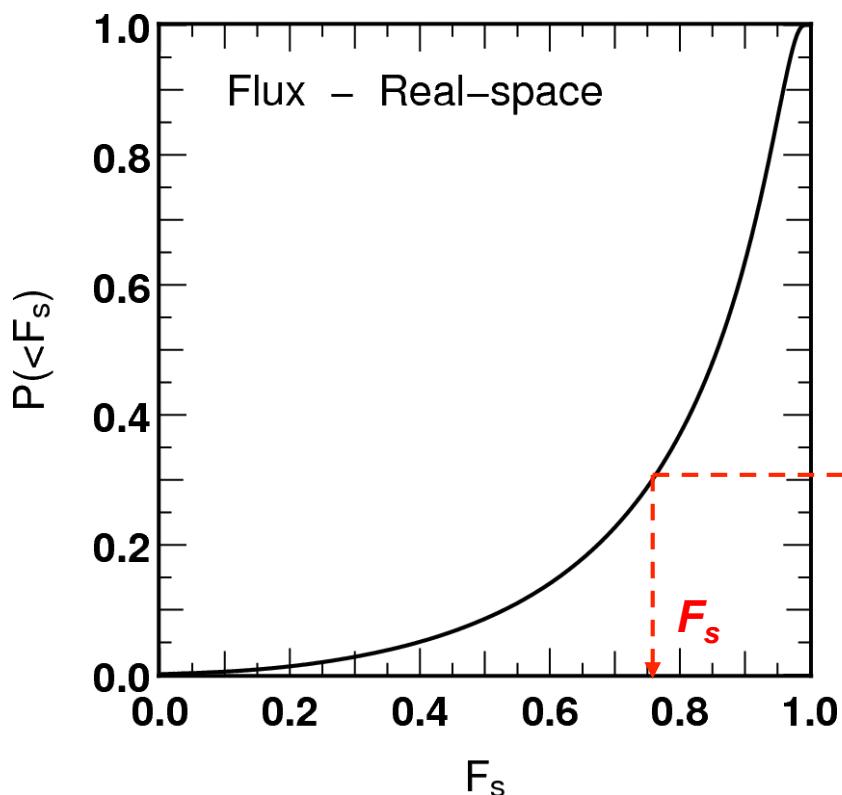
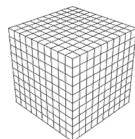
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Deterministic mapping

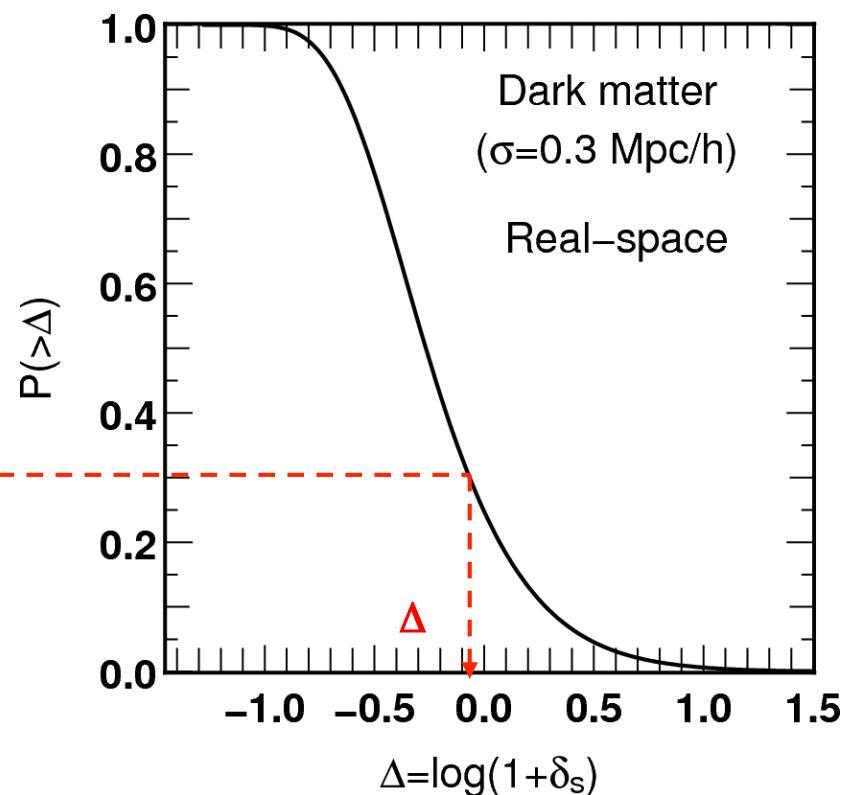
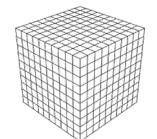
1. Construction of an “optimal” deterministic relation: $F_s = f(1+\delta_s)$

$$\int_0^{F_s} P(F'_s) dF'_s = \int_{\delta_s}^{\infty} P(\delta'_s) d\delta'_s$$

Grid of transmitted flux F_s

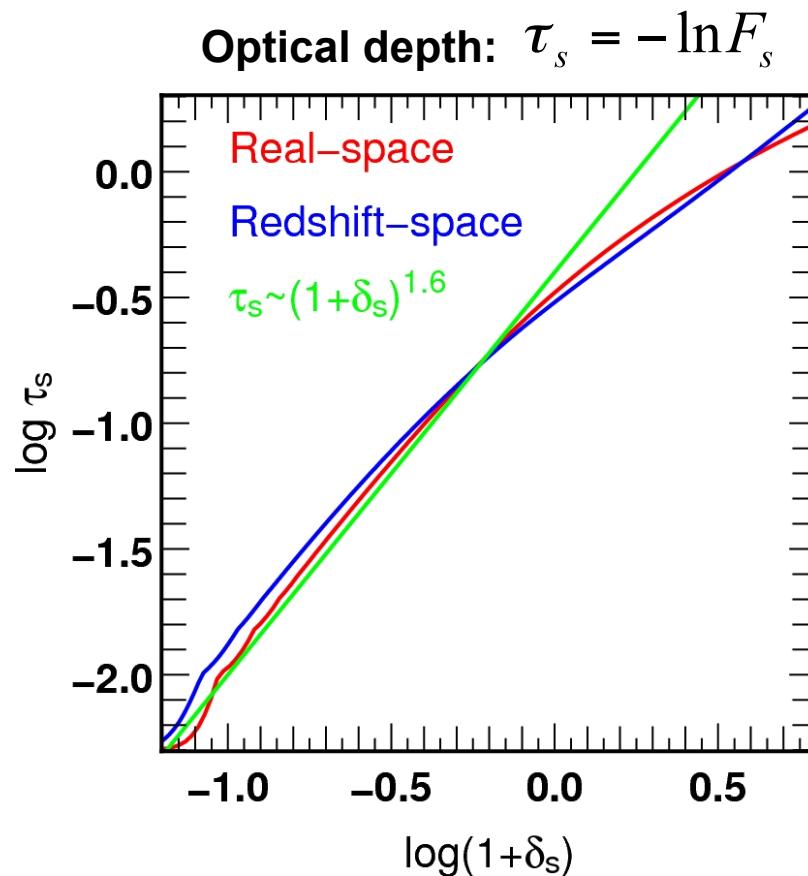
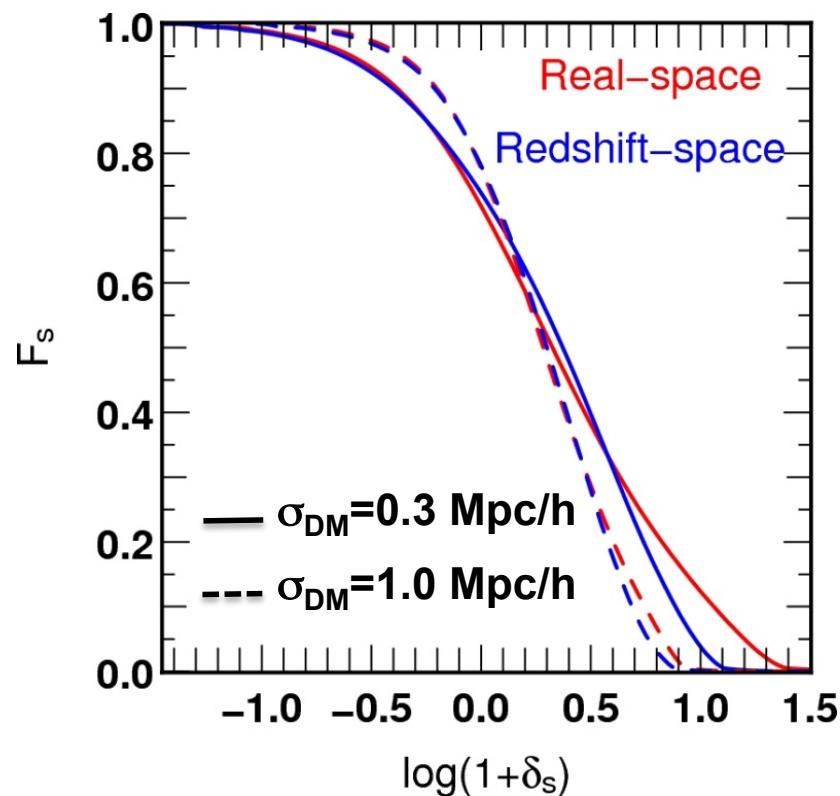


Grid of DM density contrast
 $1 + \delta_s$



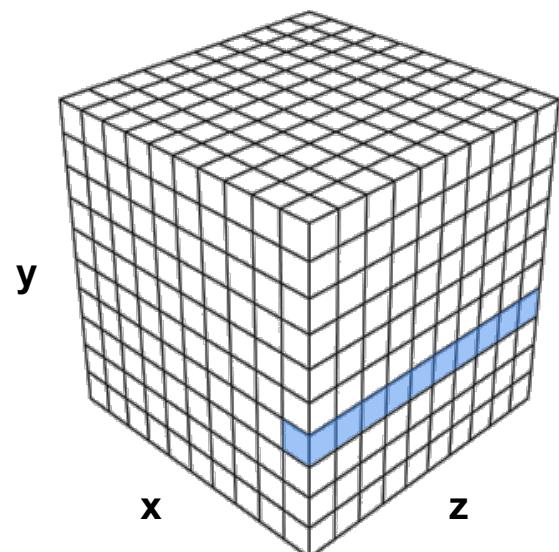
Deterministic mapping

1. Construction of a deterministic relation: $F_s = f(1 + \delta_s)$

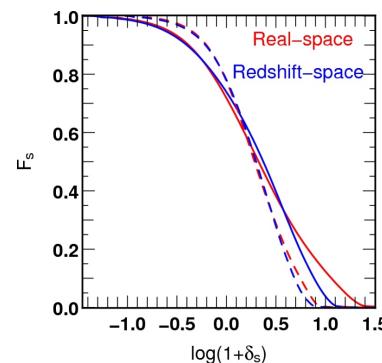
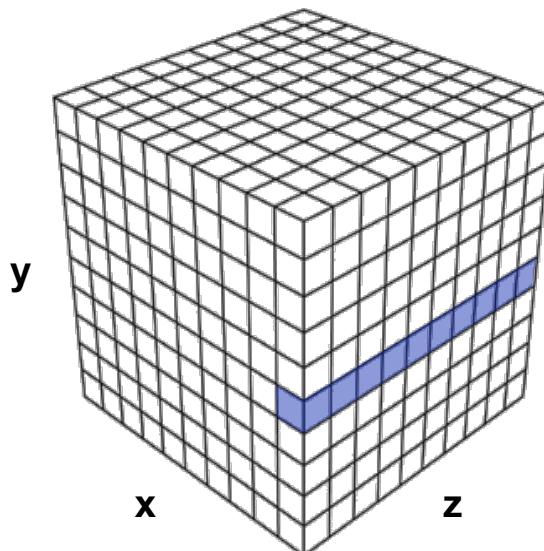


Deterministic mapping

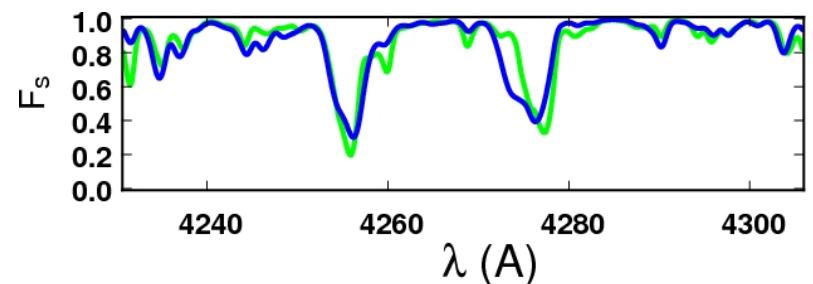
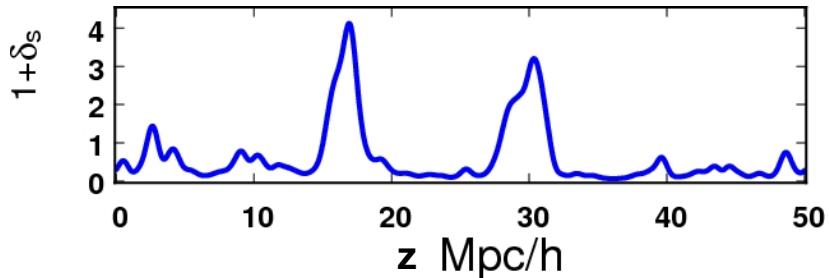
Grid of density contrast $1 + \delta_s$
 1024^3 pixels



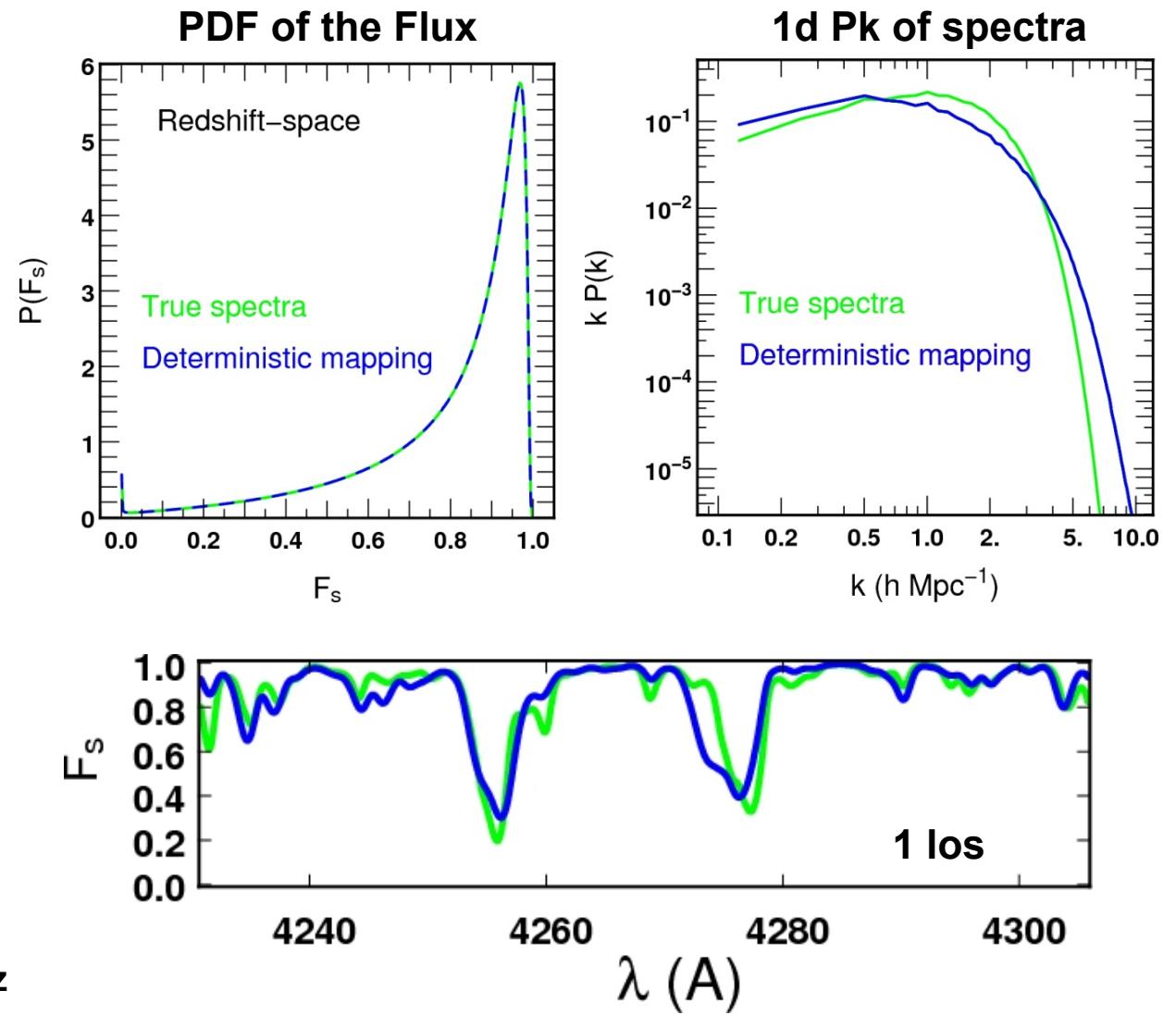
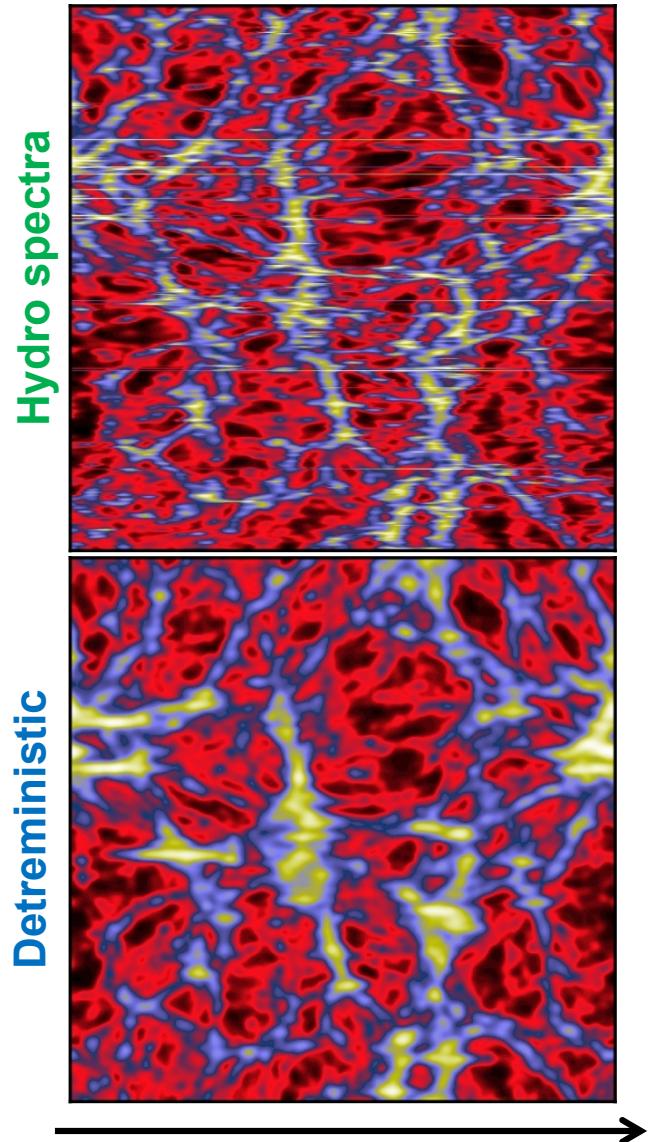
Grid of predicted transmitted flux F_s
 1024^3 pixels



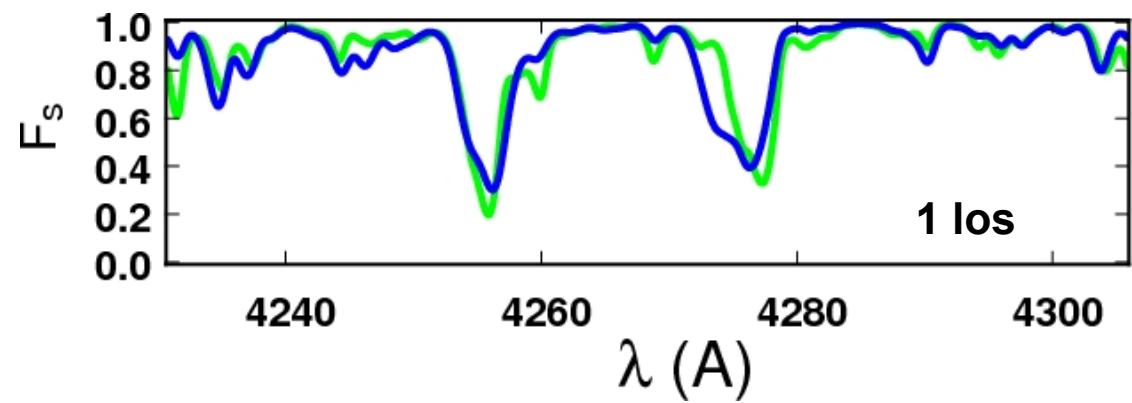
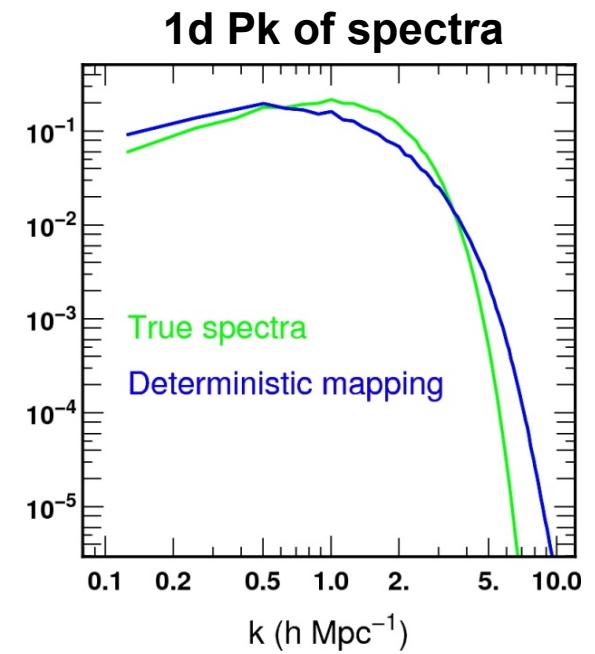
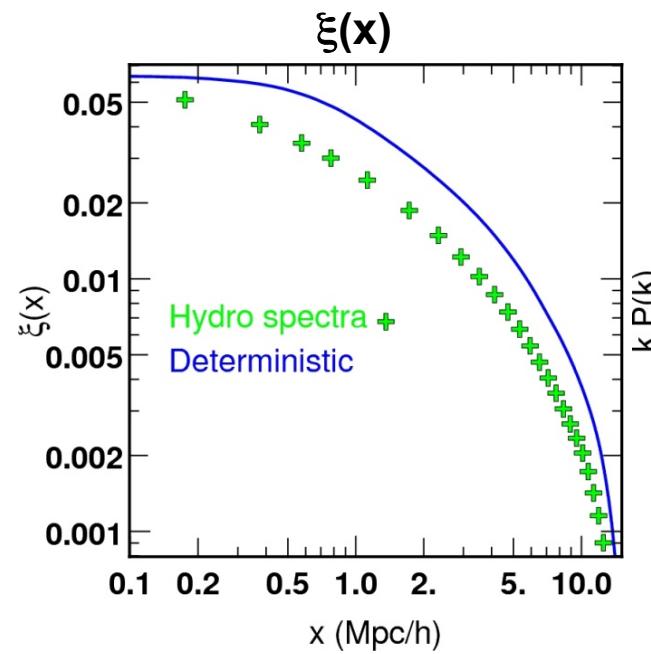
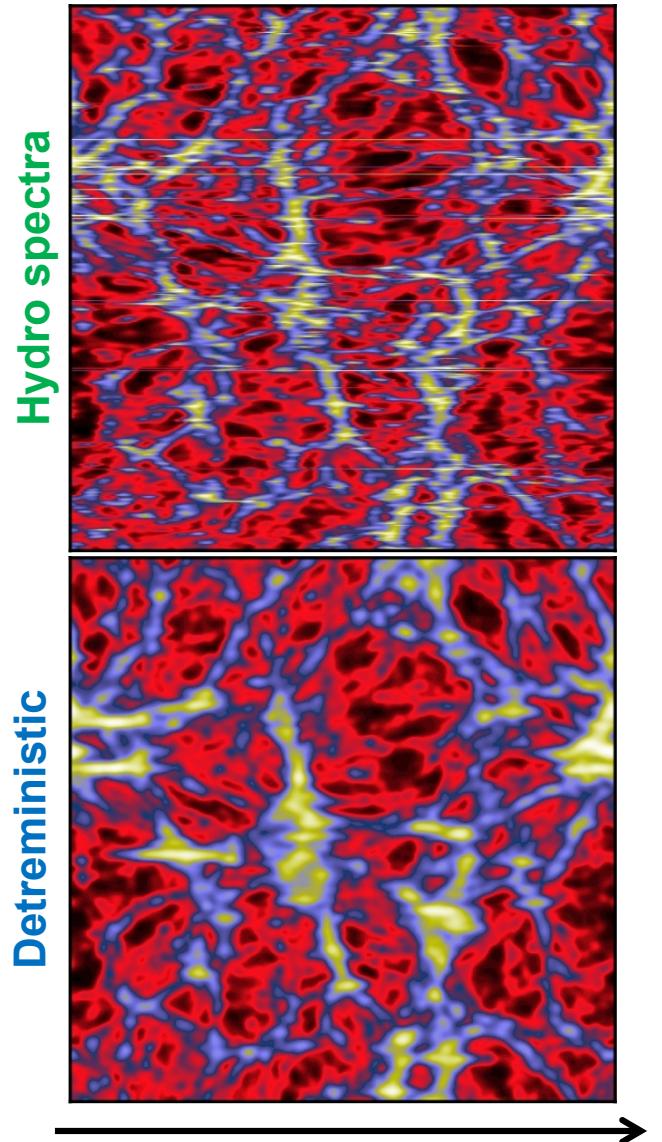
$$F_s = f(1 + \delta_s)$$



Deterministic mapping

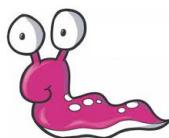


Deterministic mapping



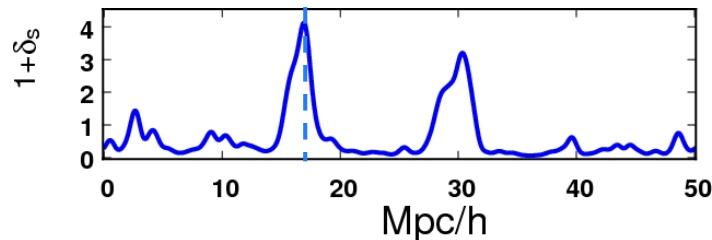
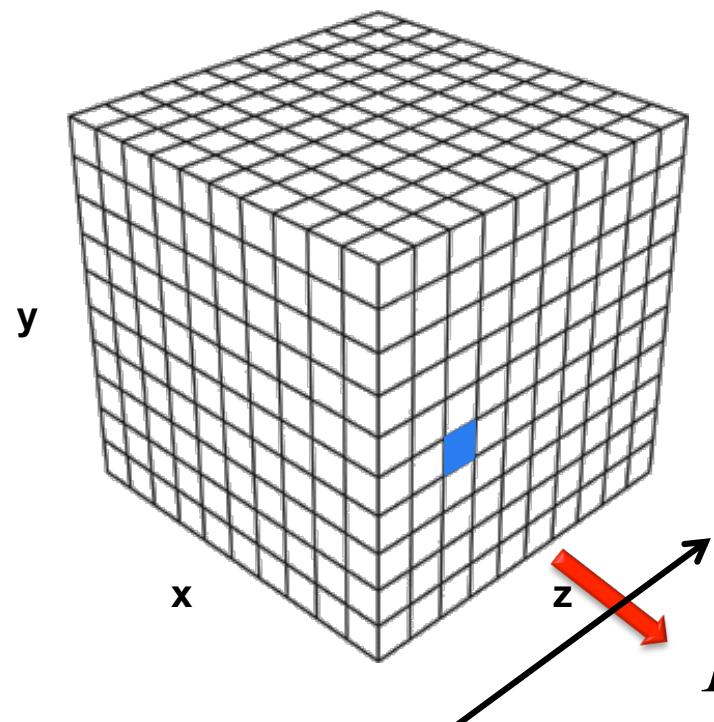
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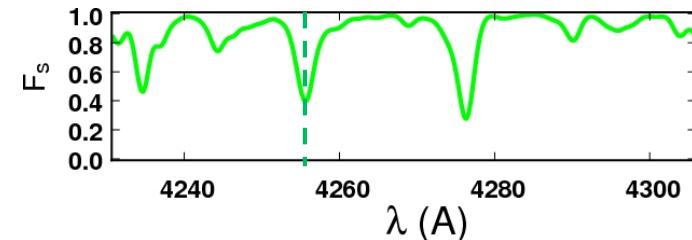
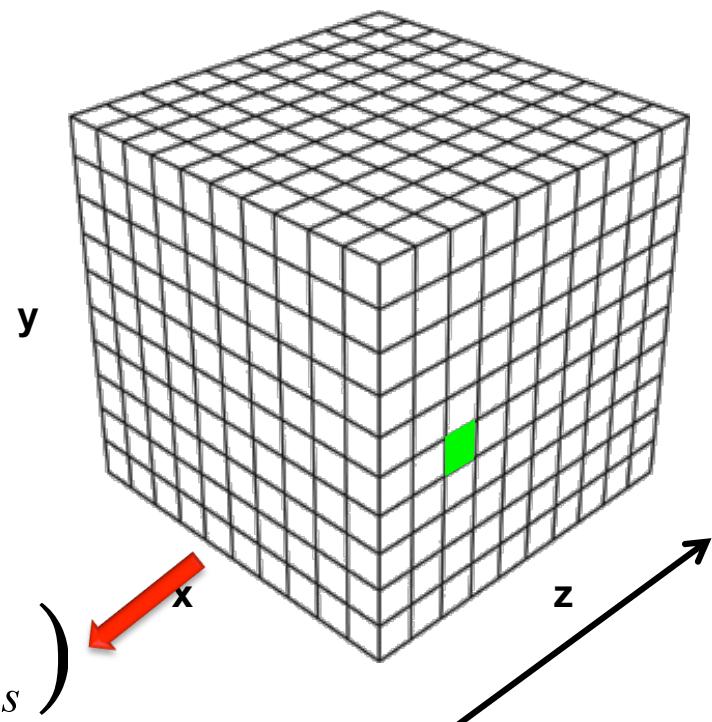


Predicting conditional Flux distributions

Grid of density contrast $1 + \delta_s$
 1024^3 pixels



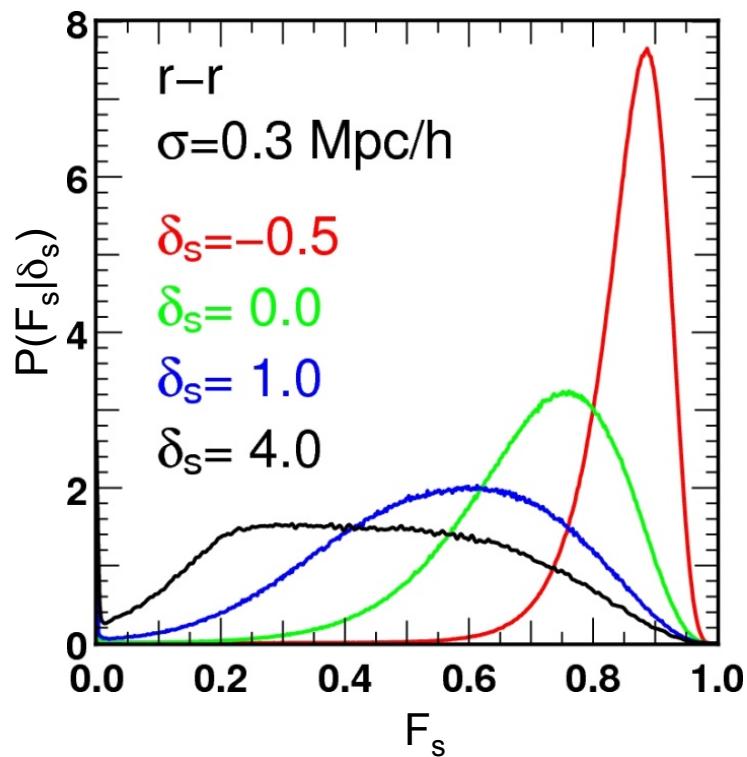
Grid of transmitted flux F_s
 1024^3 pixels



Predicting conditional Flux distributions

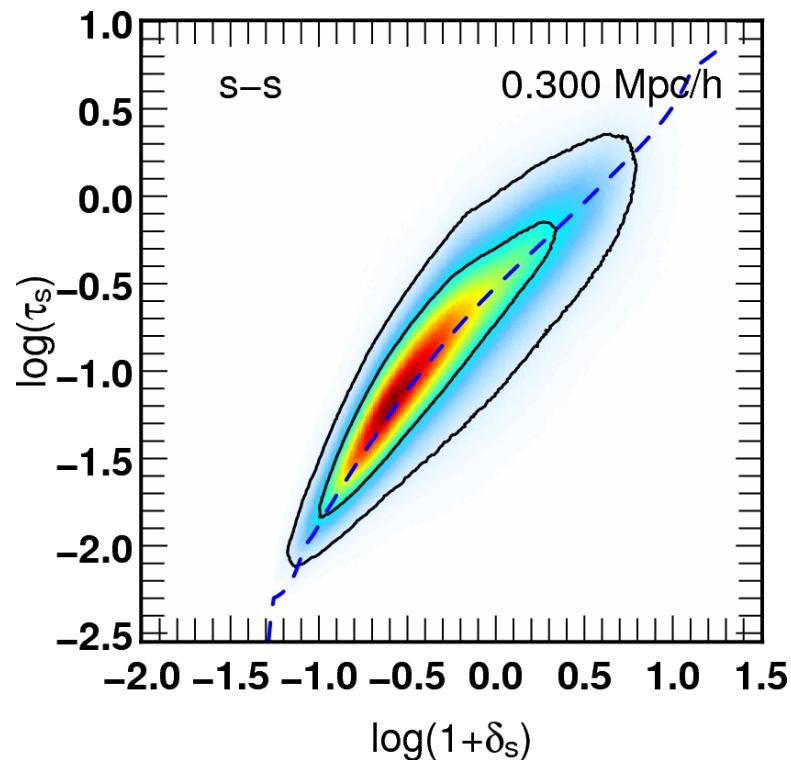
$$P(F_s | 1 + \delta_s)$$

Ex:



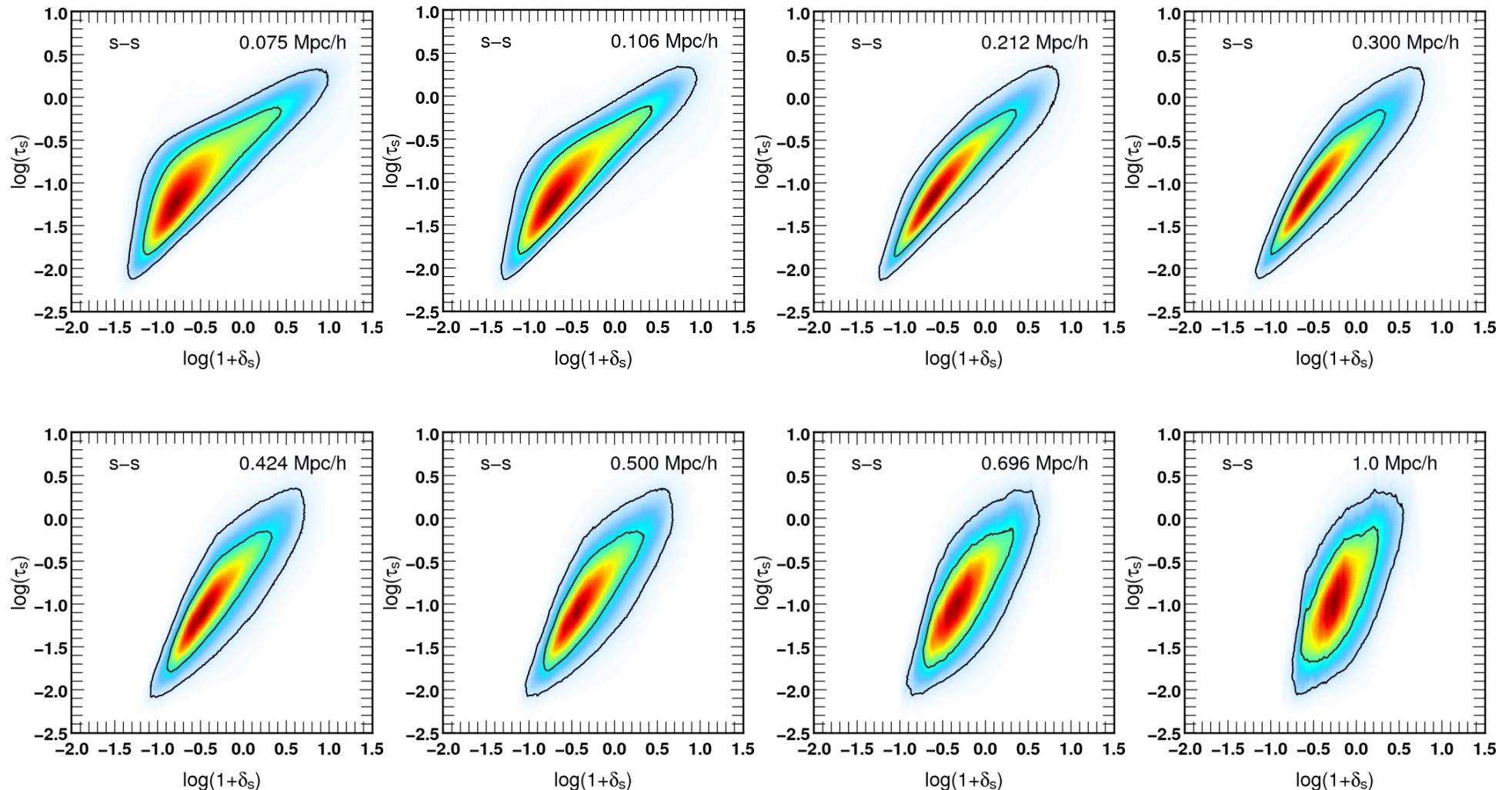
Optical depth: $\tau_s = -\ln F_s$

$$P(\tau_s | 1 + \delta_s)$$



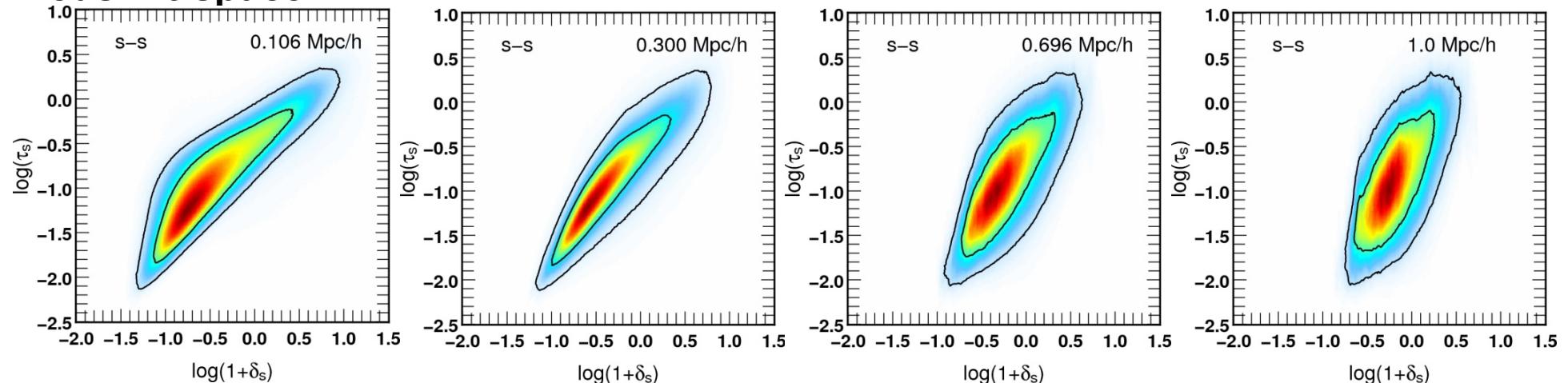
Predicting conditional Flux distributions

Redshift-space

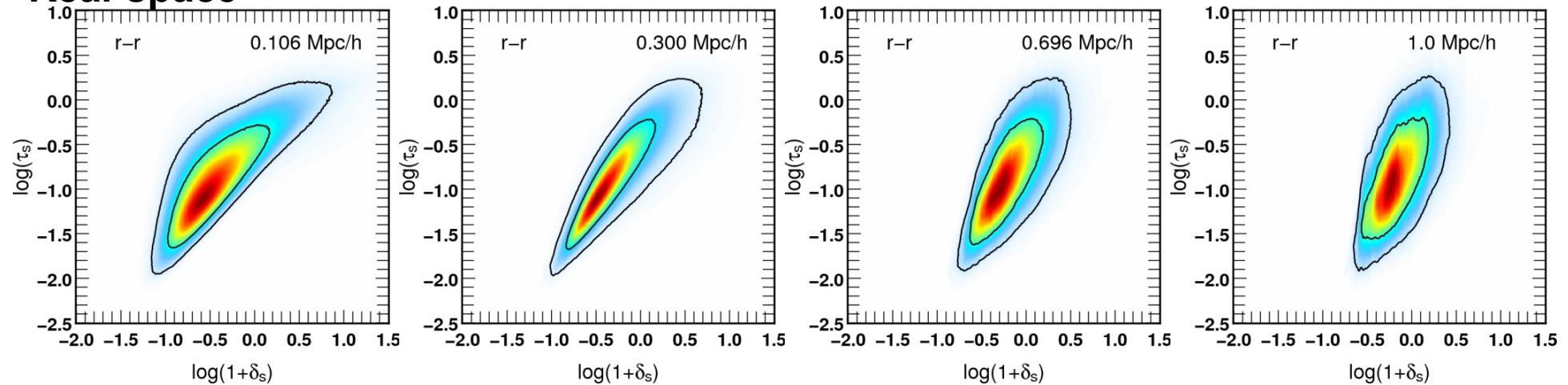


Predicting conditional Flux distributions

Redshift-space

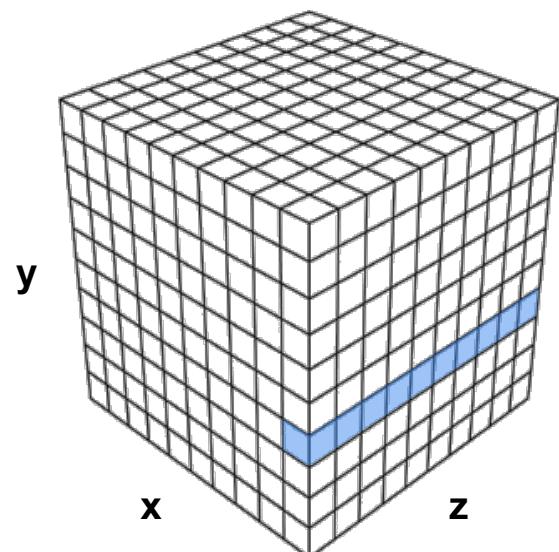


Real-space

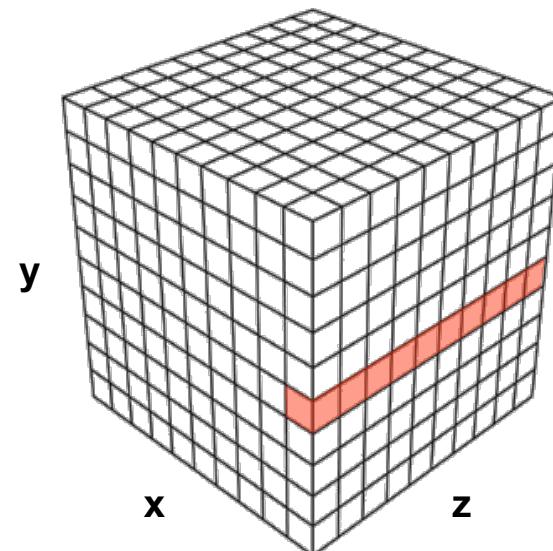


Probabilistic mapping

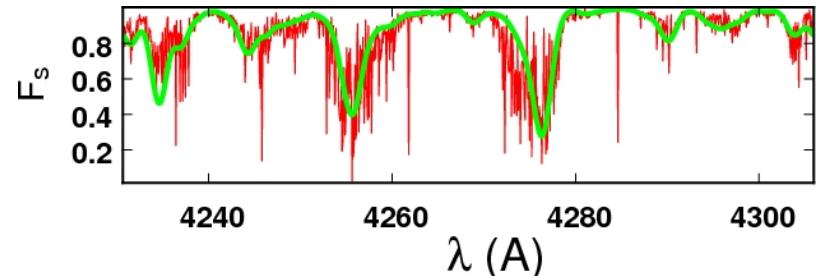
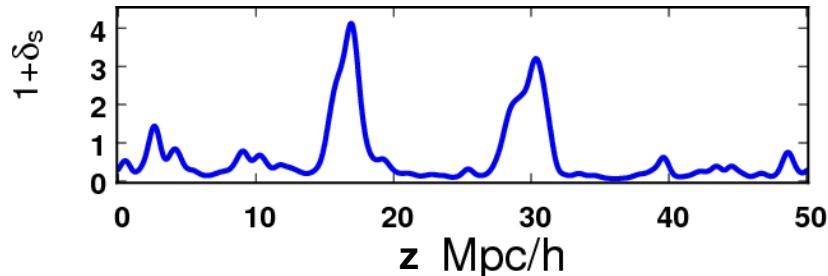
Grid of DM density contrast $1 + \delta_s$
 1024^3 pixels



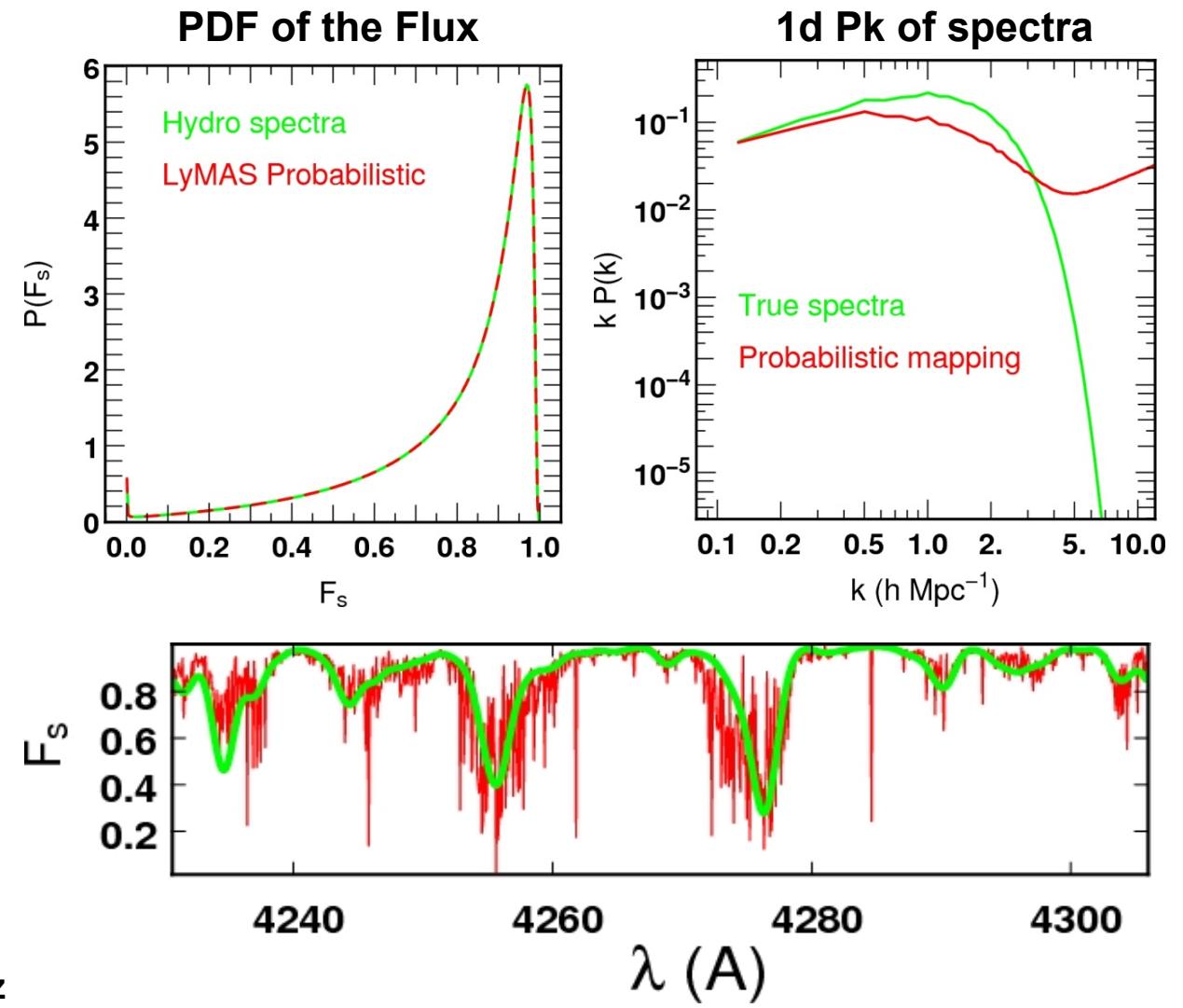
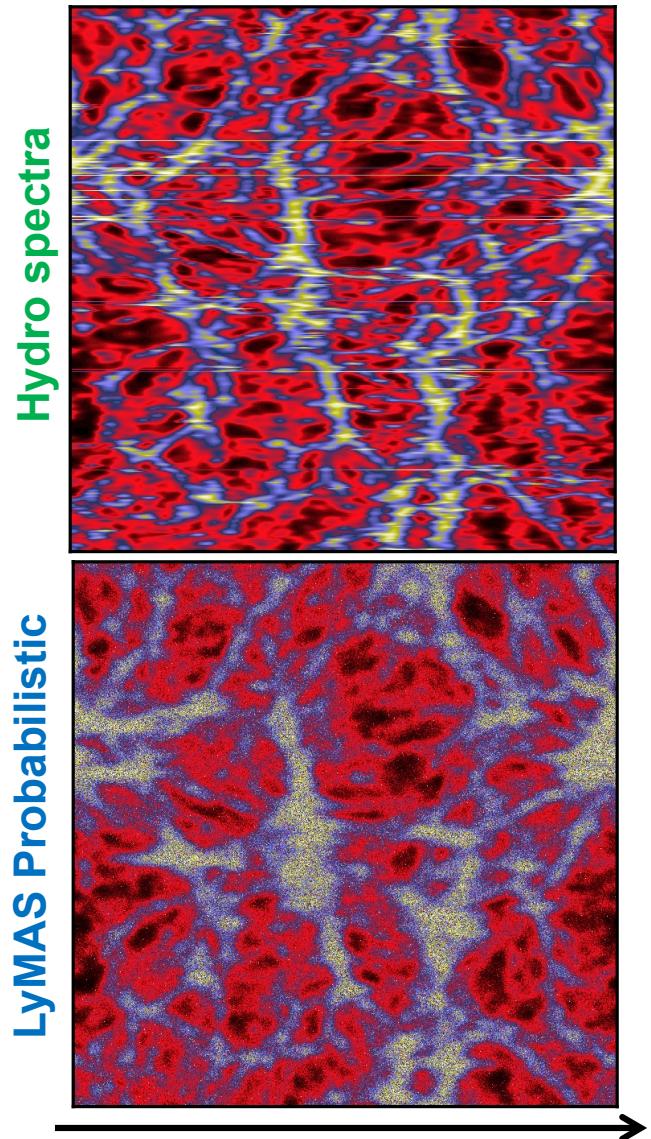
Grid of predicted transmitted flux F_s
 1024^3 pixels



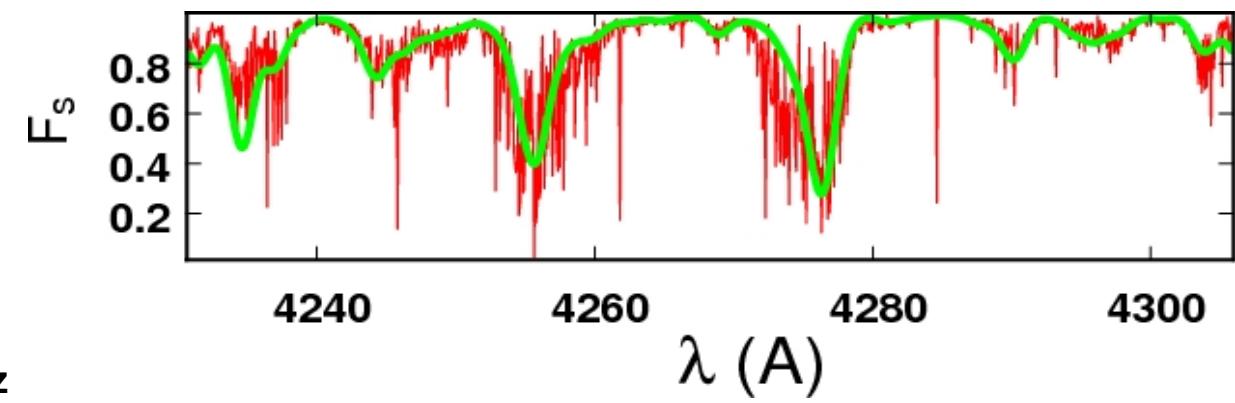
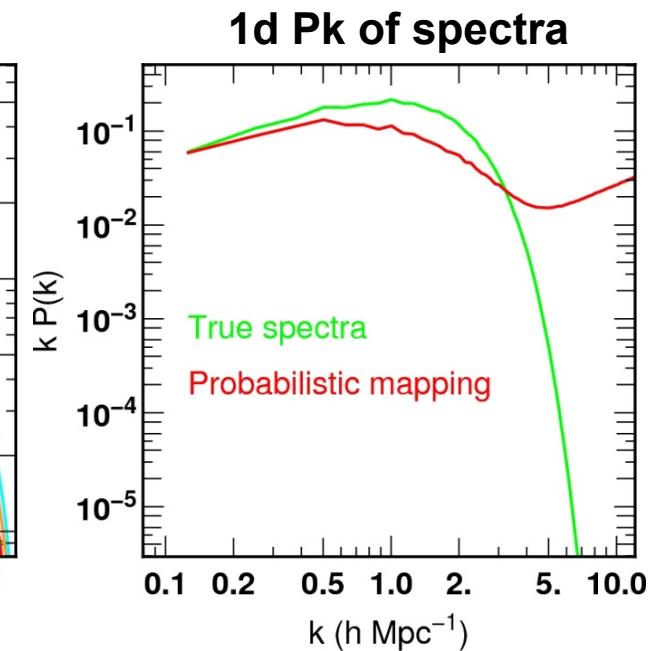
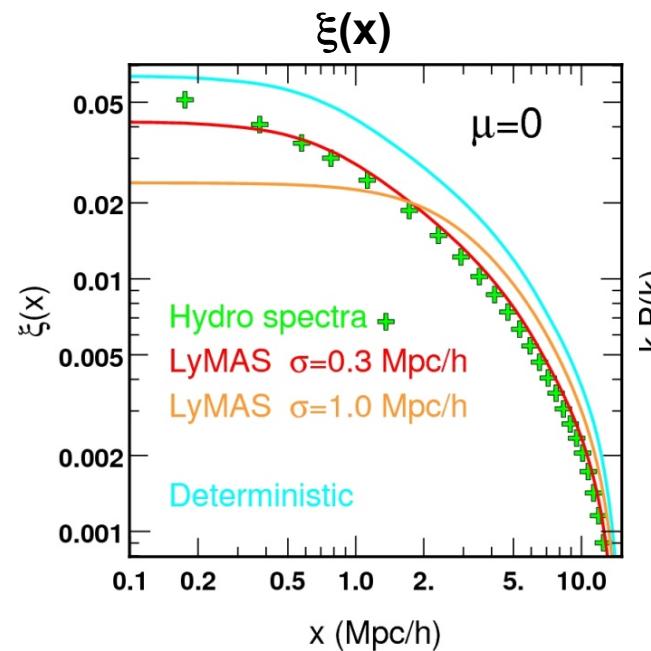
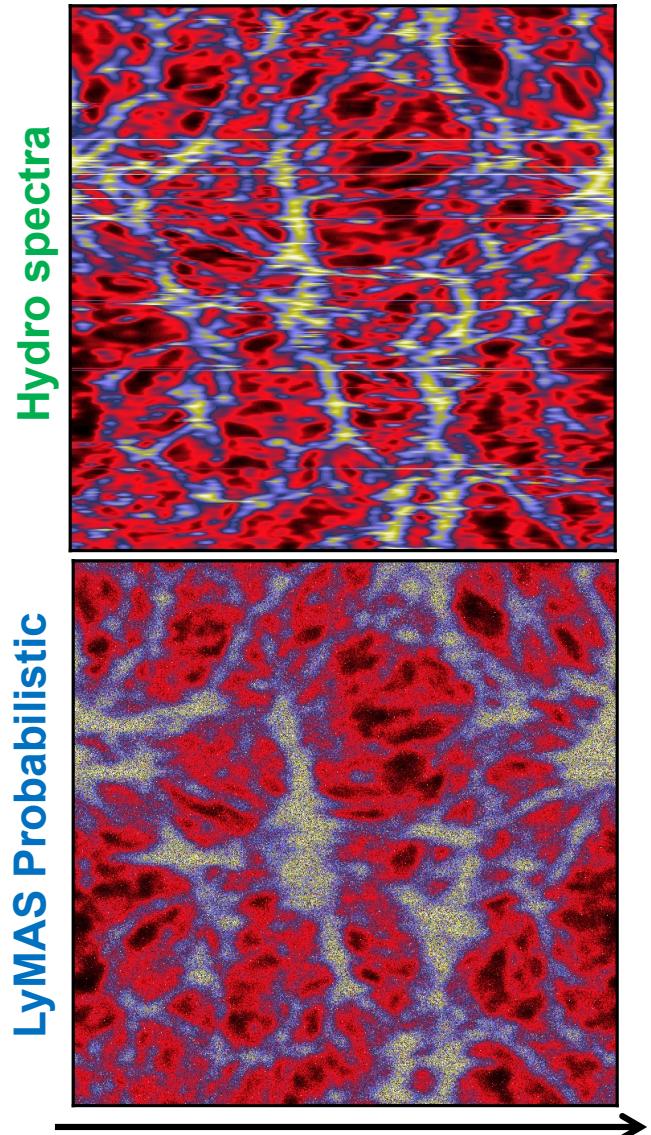
$$P(F_s | 1 + \delta_s)$$



Probabilistic mapping

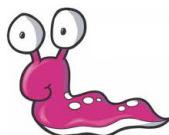


Probabilistic mapping



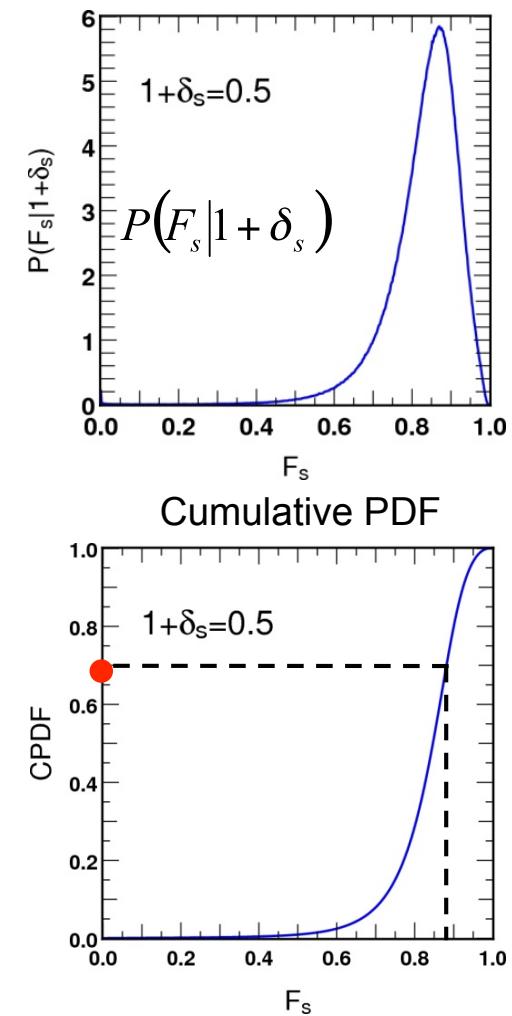
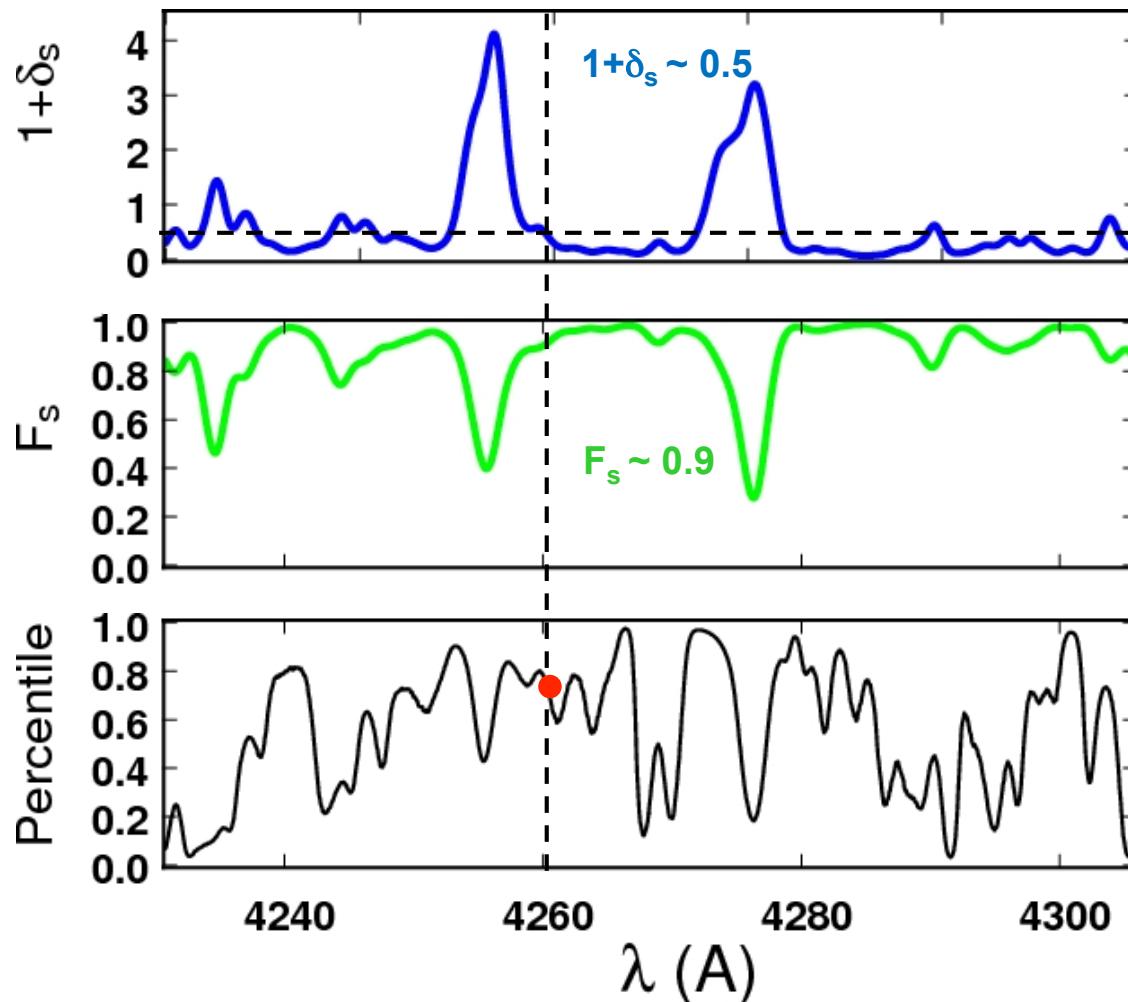
Plan

- 1. Introduction**
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- 5. LyMAS Coherent mapping**
- 6. Application to large N-body simulations**
- 7. Next**



Coherent mapping

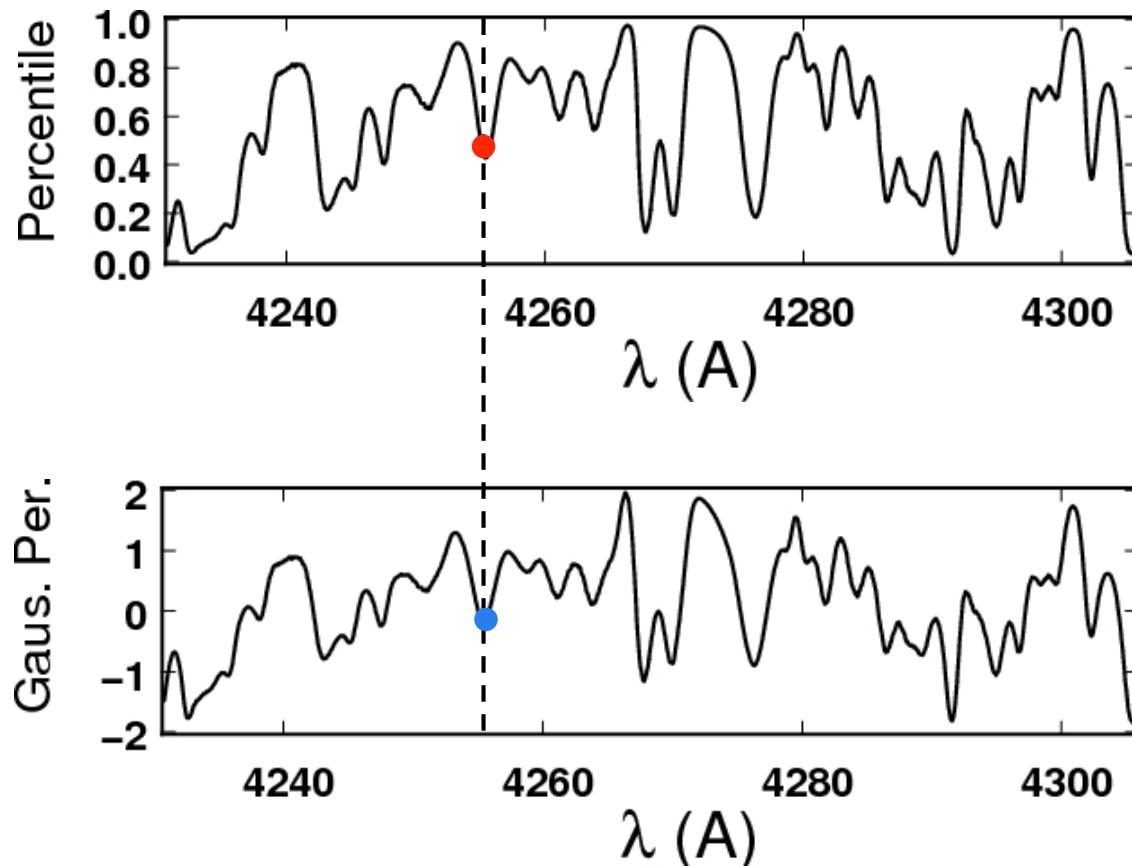
1. Construction of “percentile spectra”: $Per(F_s, \delta_s) = \int_0^{F_s} P(F_s' | \delta_s) dF_s'$



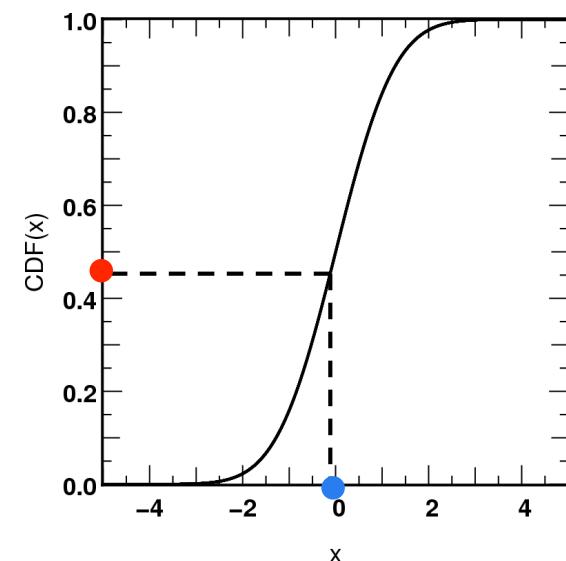
Coherent mapping

2. Construction of “Gaussianized” percentile spectra:

$$G_{Per}(x) = y \quad (2\pi)^{-1/2} \int_{-\infty}^y e^{-\frac{z^2}{2}} dz = Per(x)$$



Cumulative PDF of Gaussian function



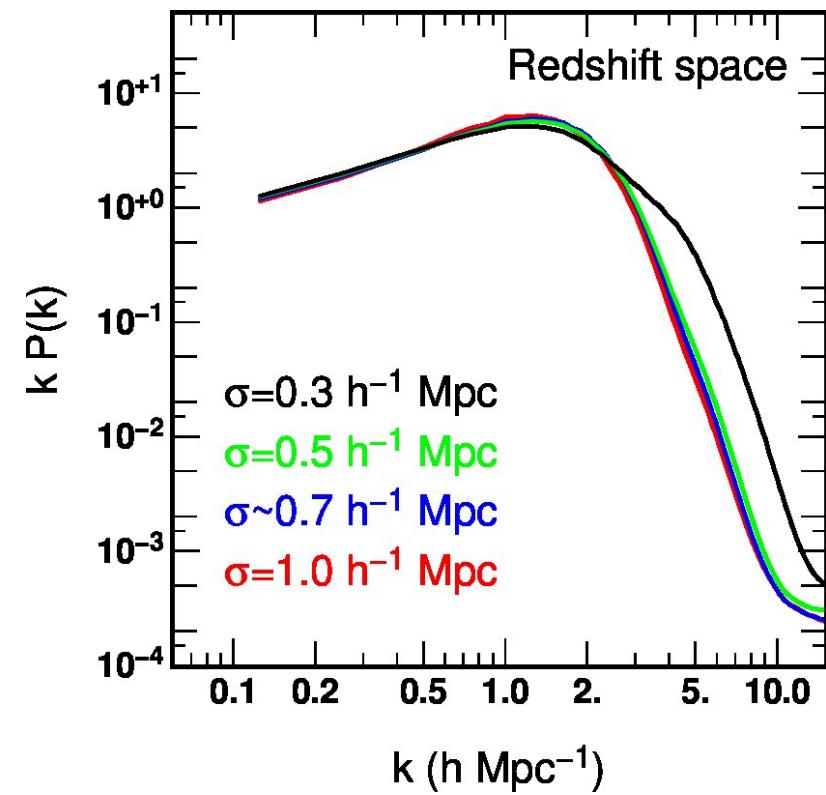
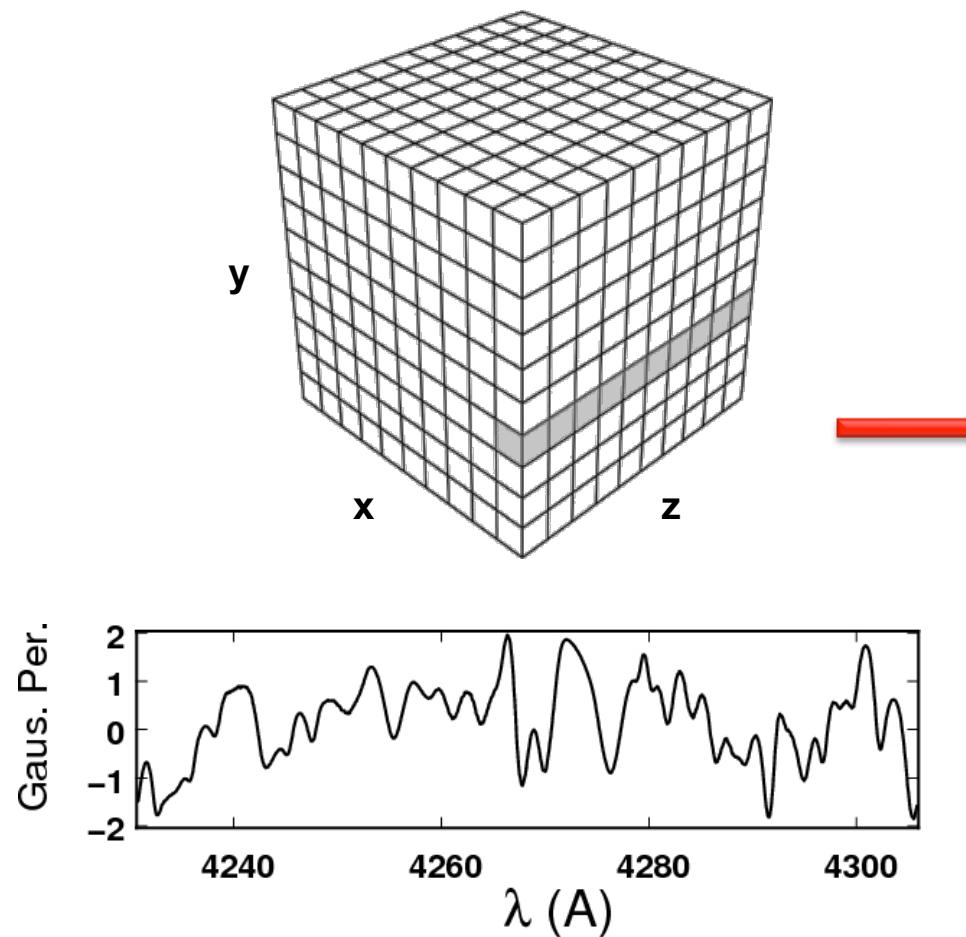
$$CDM(x) = \frac{1}{2} \left[1 + erf \left(\frac{x - \mu}{\sqrt{2\sigma^2}} \right) \right]$$

$$\mu = 0$$

$$\sigma^2 = 1$$

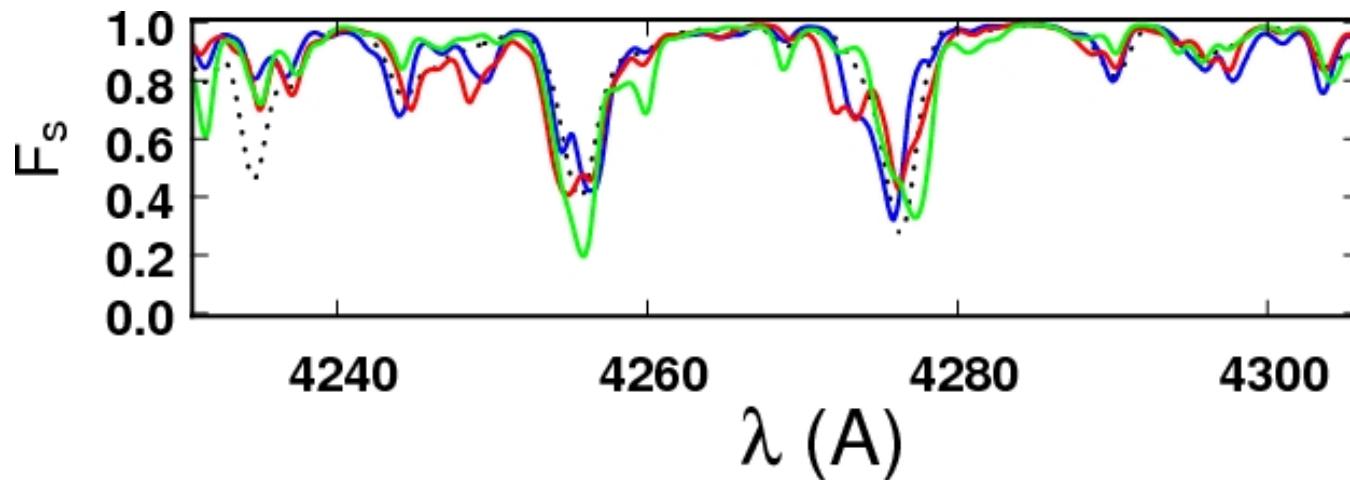
Coherent mapping

3. Derive the 1d power spectrum of the “Gaussianized percentile spectra”:



Coherent mapping

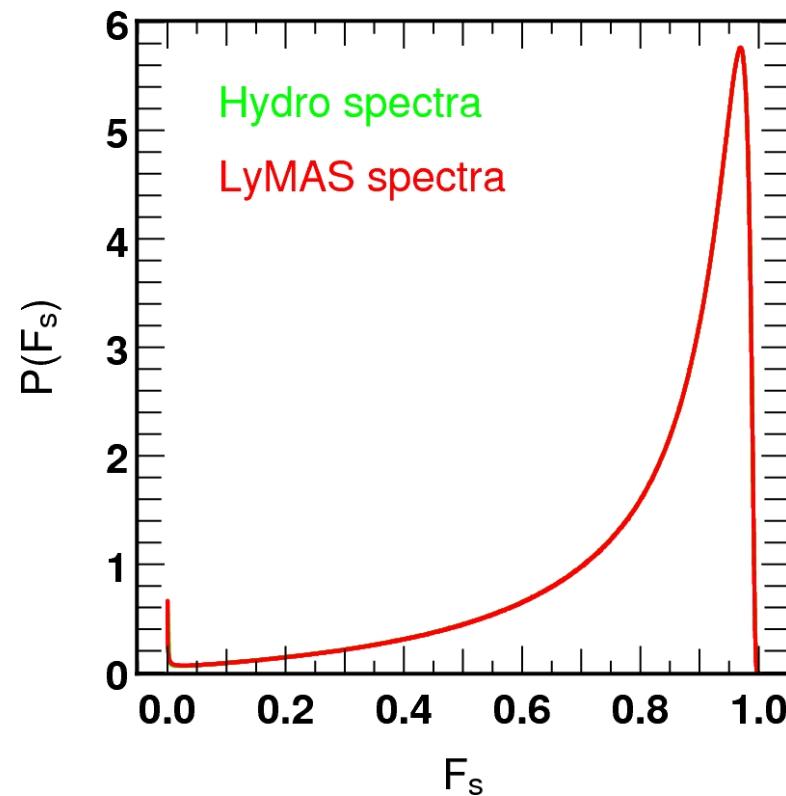
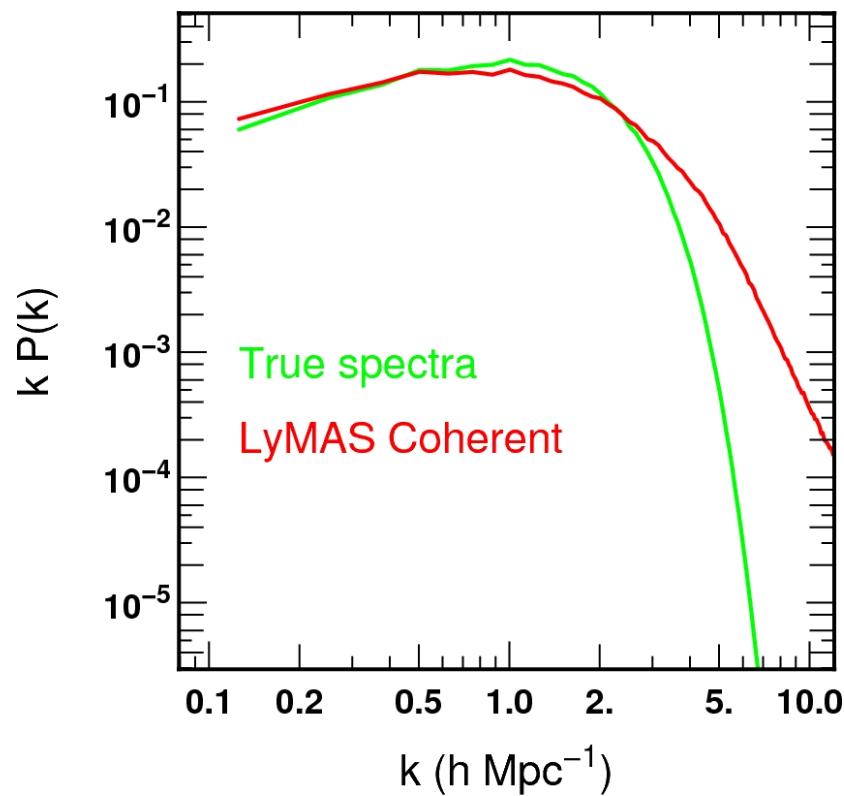
1. For each DM skewer, create a realization of $G \cdot \text{Per}(x)$ of the 1-d gaussian field
2. Get a realization of $\text{Per}(F)$ by “degaussianization”
3. Get the flux field by drawing the flux at each pixel from the location of in $P(F_s|1+\delta_s)$ implied by the value of $\text{Per}(F)$



4. One iteration:

- **P_k rescaling:** multiply each Fourier components by the ratio $[P_F(k)/P_{PS}(k)]^2$
- **Flux rescaling**

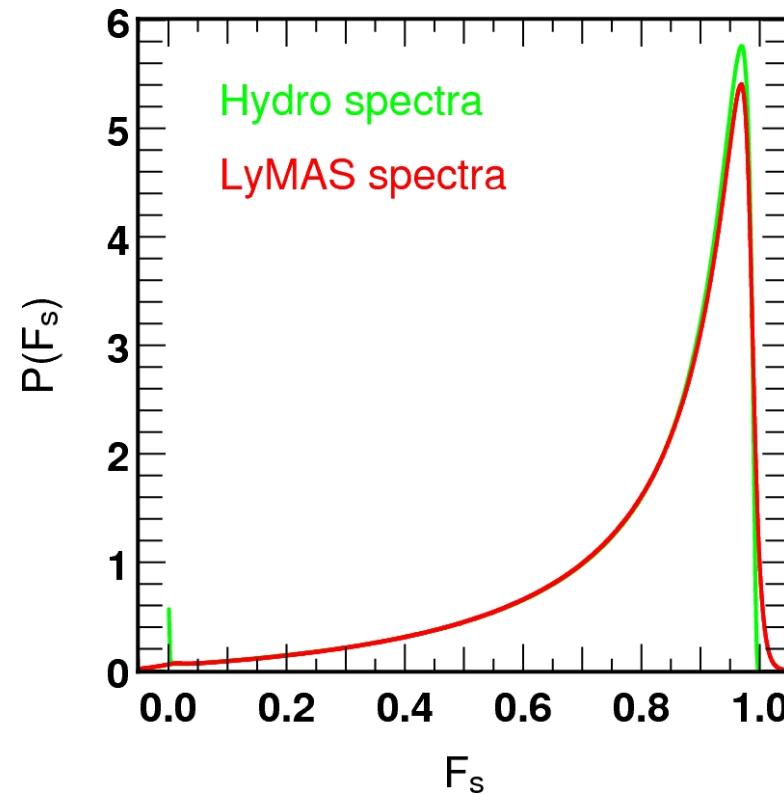
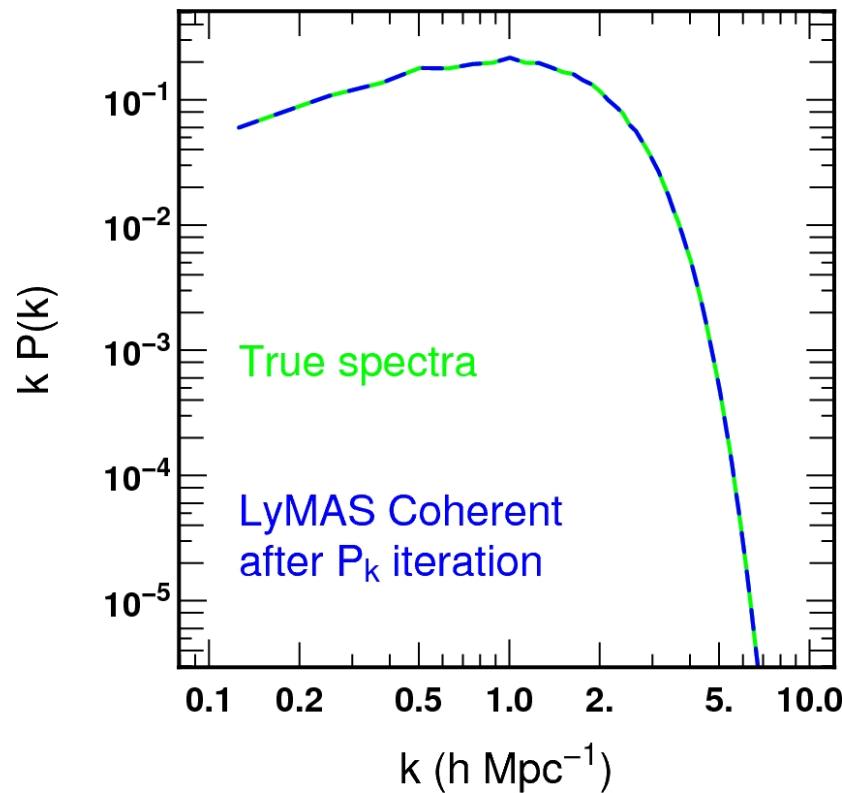
Coherent mapping



Coherent mapping

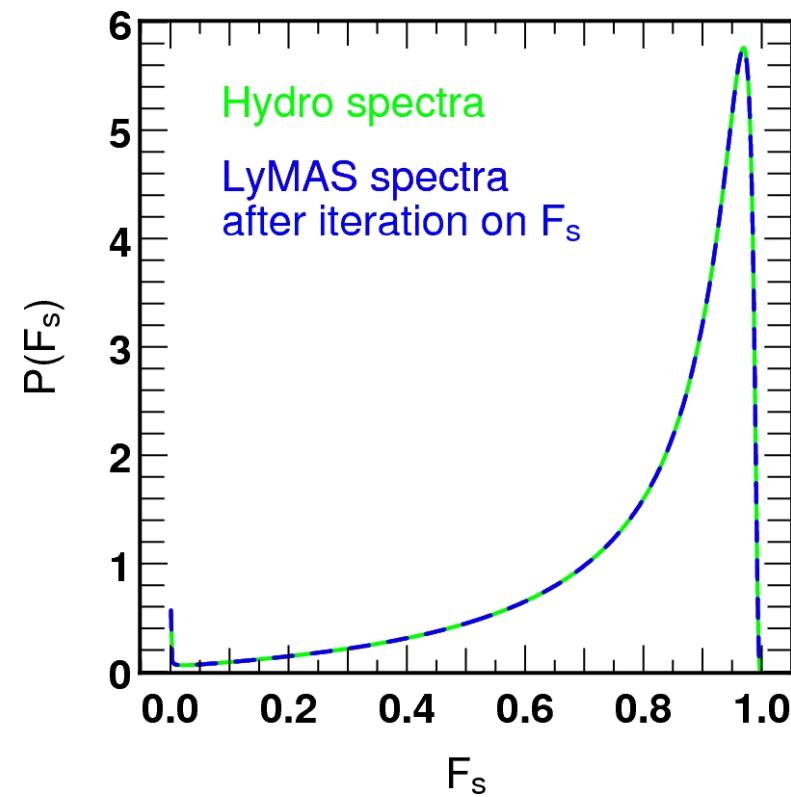
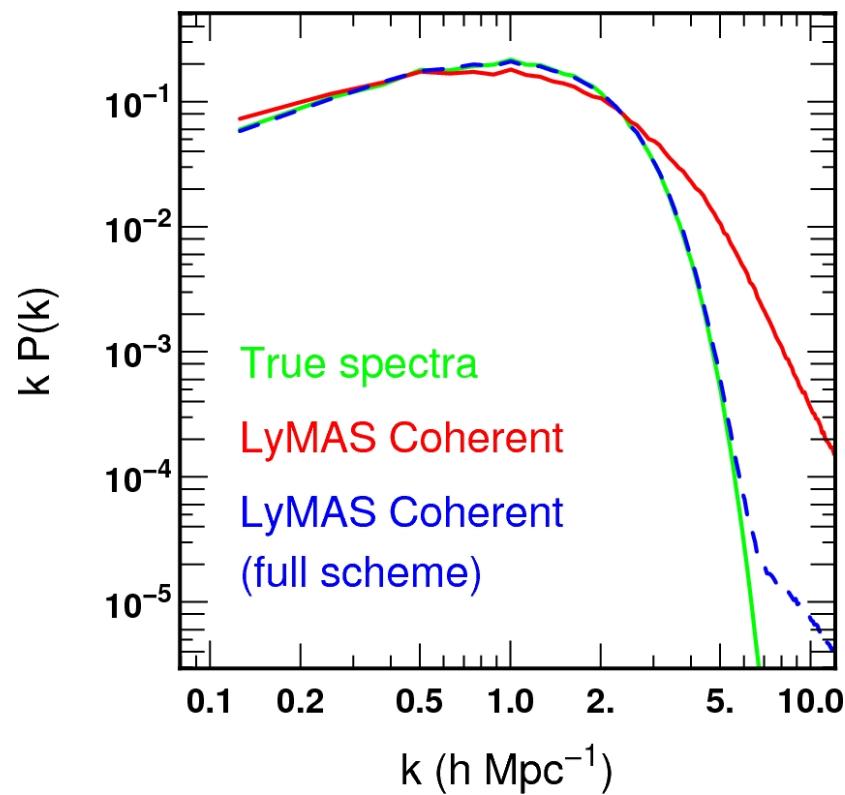
4. Iteration on P_k :

(multiply each Fourier components by the ratio $[P_F(k)/P_{PS}(k)]^2$)



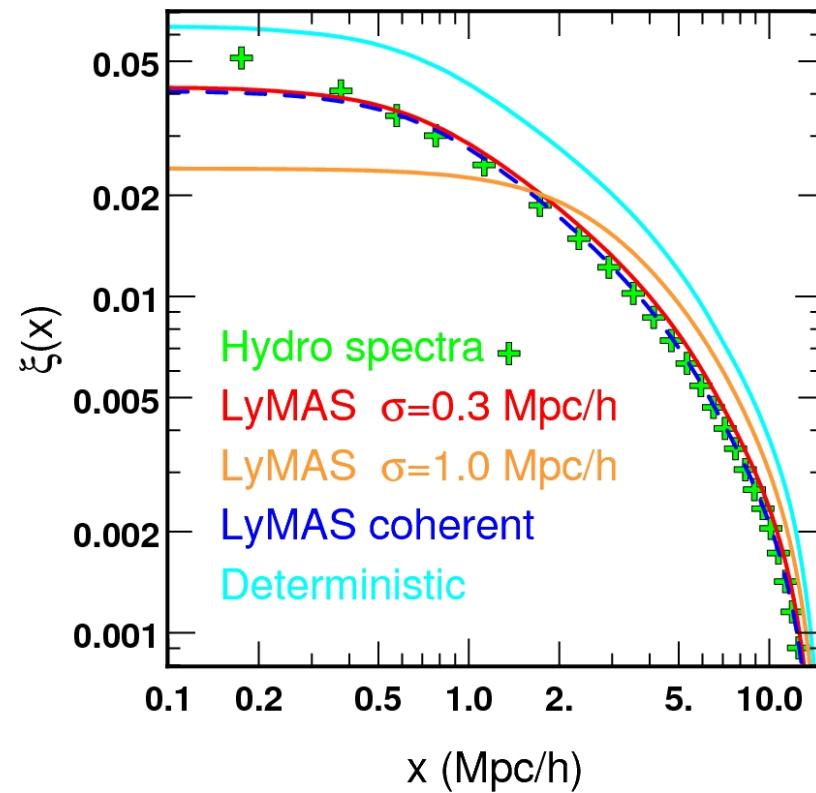
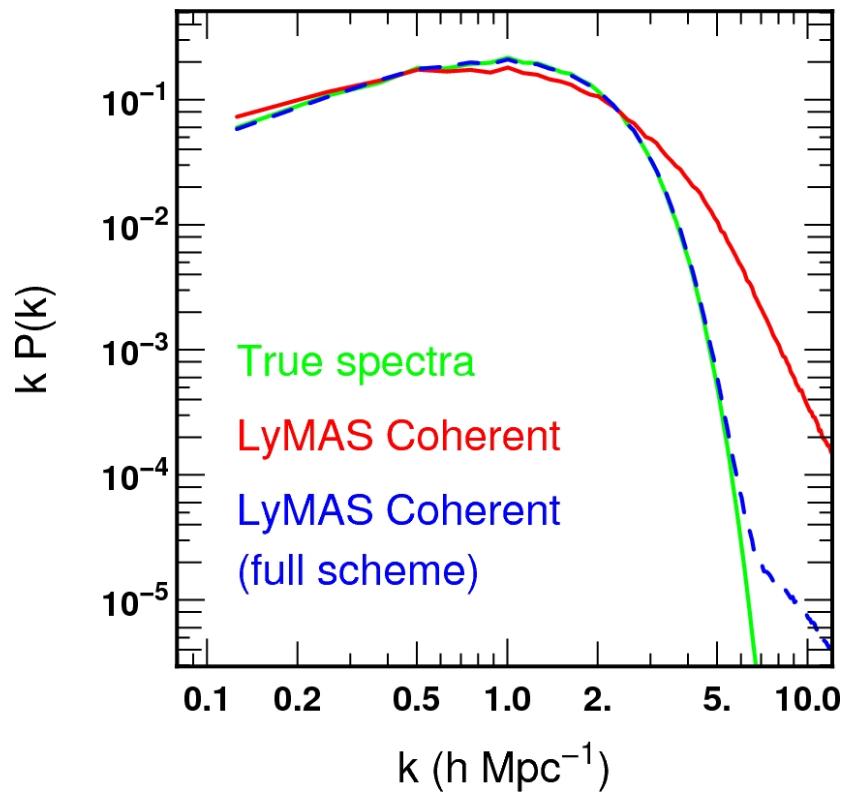
Coherent mapping

4. Iteration on F_s :



Coherent mapping

4. Iteration on F_s :



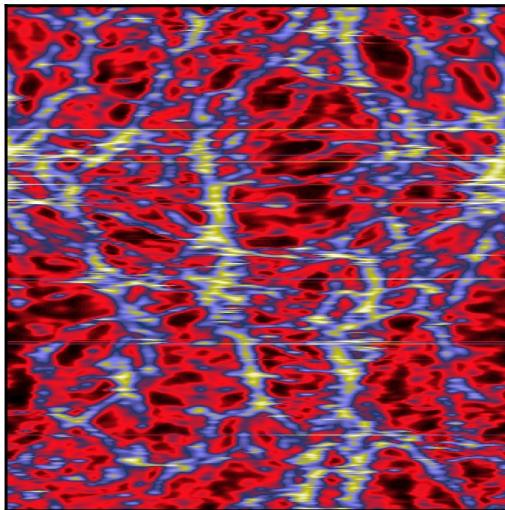
Mapping

Hydro Spectra F_s

$1d P_k$

$PDF(F_s)$

$\xi(x)$



Deterministic
mapping

~~$1d P_k$~~

~~$PDF(F_s)$~~

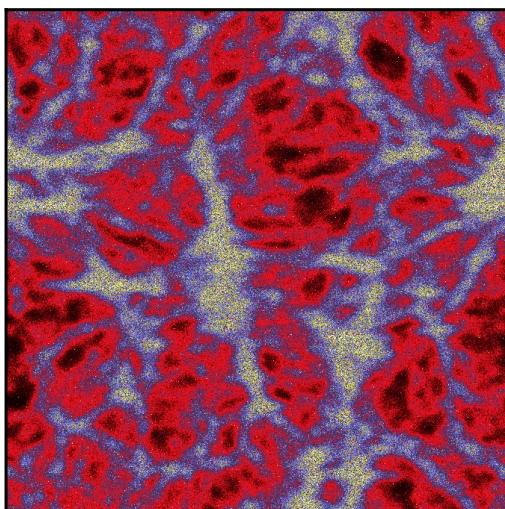
~~$\xi(x)$~~

LyMAS
probabilistics

~~$1d P_k$~~

$PDF(F_s)$

$\xi(x)$



LyMAS coherent

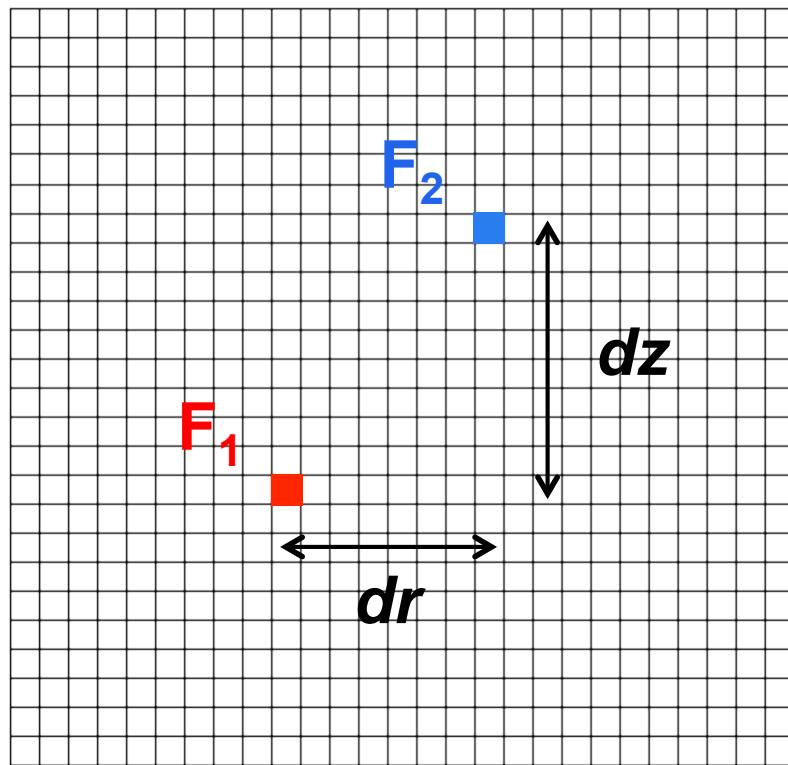
$1d P_k$

$PDF(F_s)$

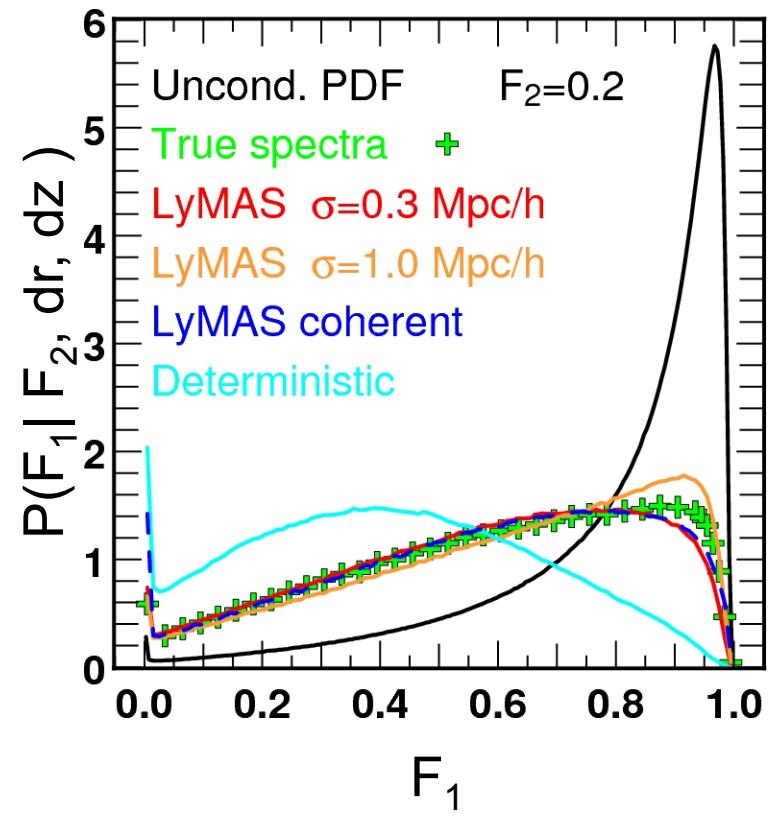
$\xi(x)$

Two-point conditional flux PDF

$$P(F_1 | F_2, dr, dz)$$

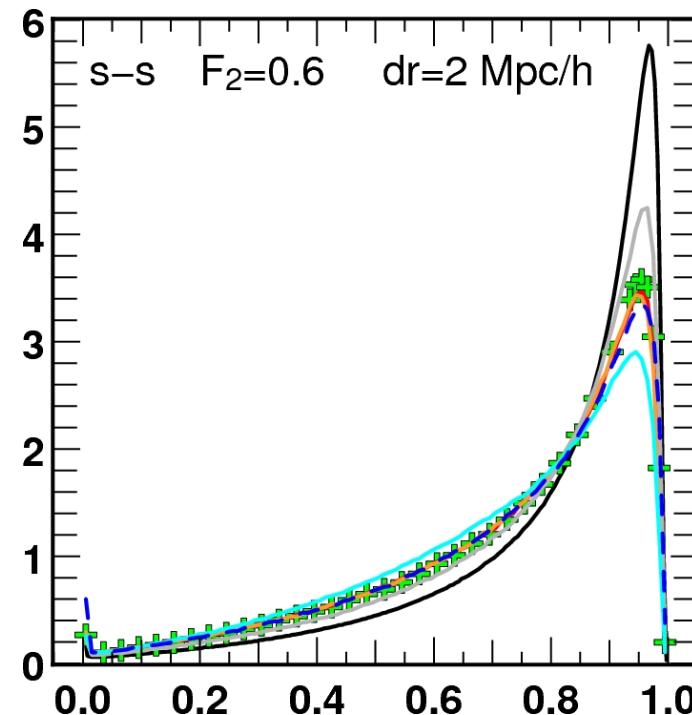
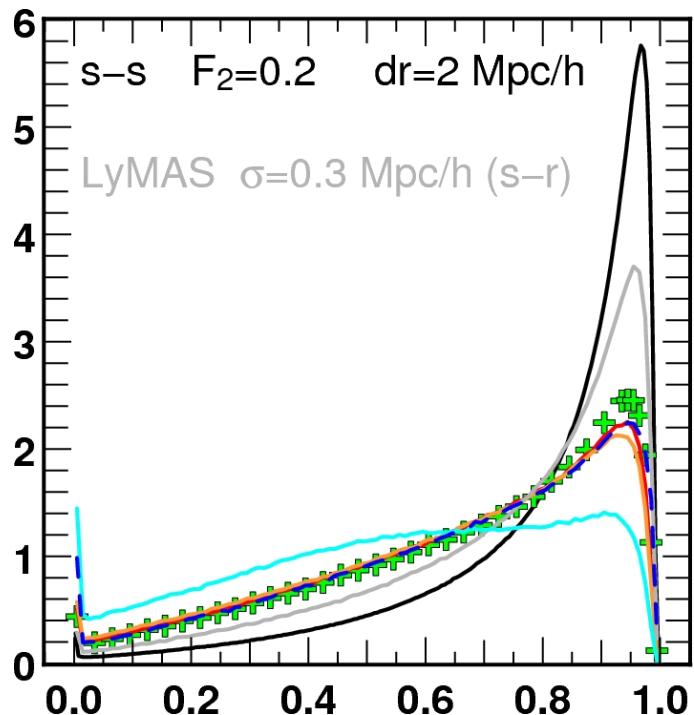


Ex: $F_2 = 0.2$
 $dr = 1 \text{ Mpc/h}$
 $dz = 0 \text{ Mpc}$

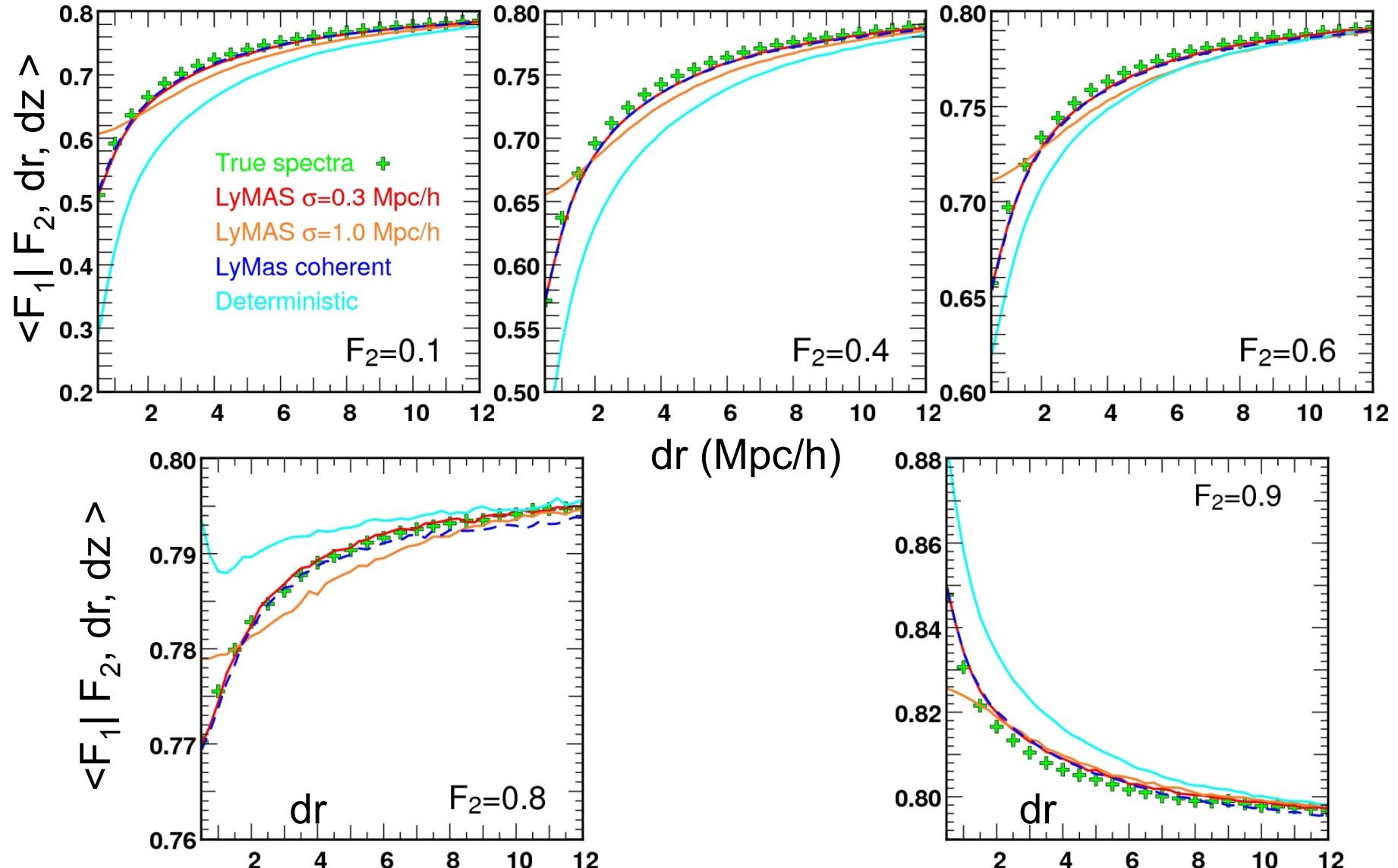


Two-point conditional flux PDF

$$P(F_1 | F_2, dr, dz)$$

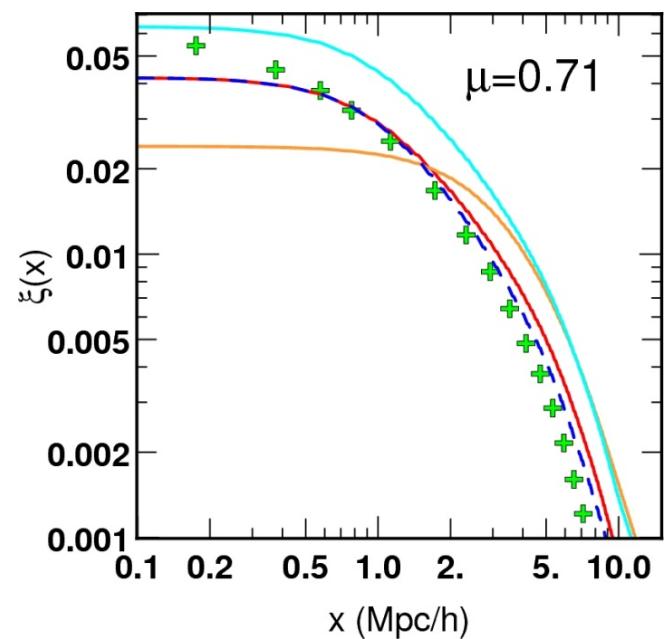
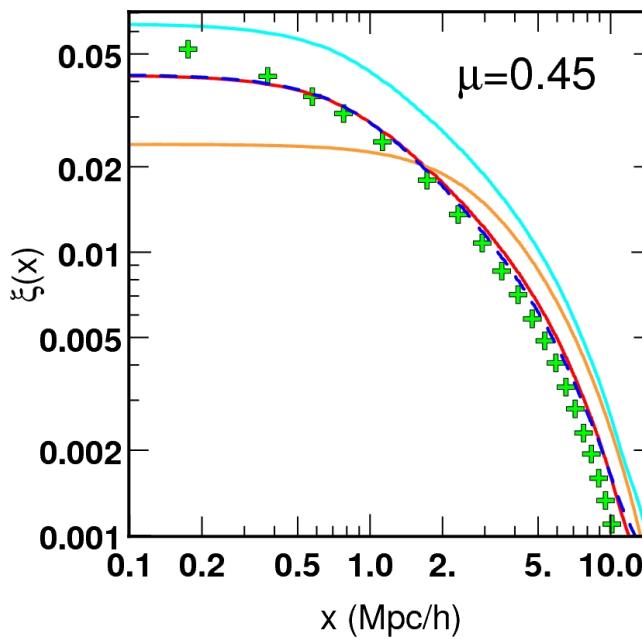
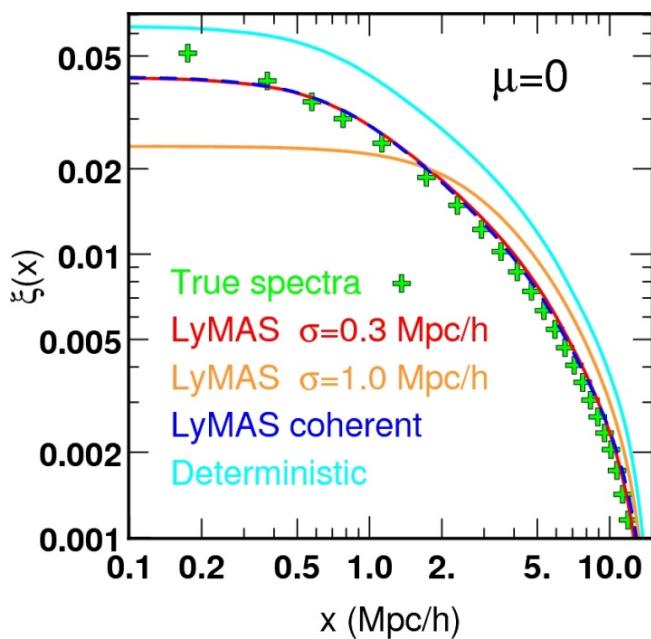
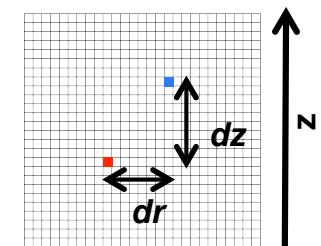


Conditional mean flux $\langle F_1 | F_2, dr, dz \rangle$



Correlation function

$$\xi = \frac{\langle F_1(r, z) F_2(r + dr, z + dz) \rangle}{\langle F \rangle^2} - 1$$



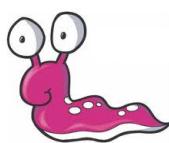
$$dz = 0$$

$$dr = 0.5dz$$

$$dr = dz$$

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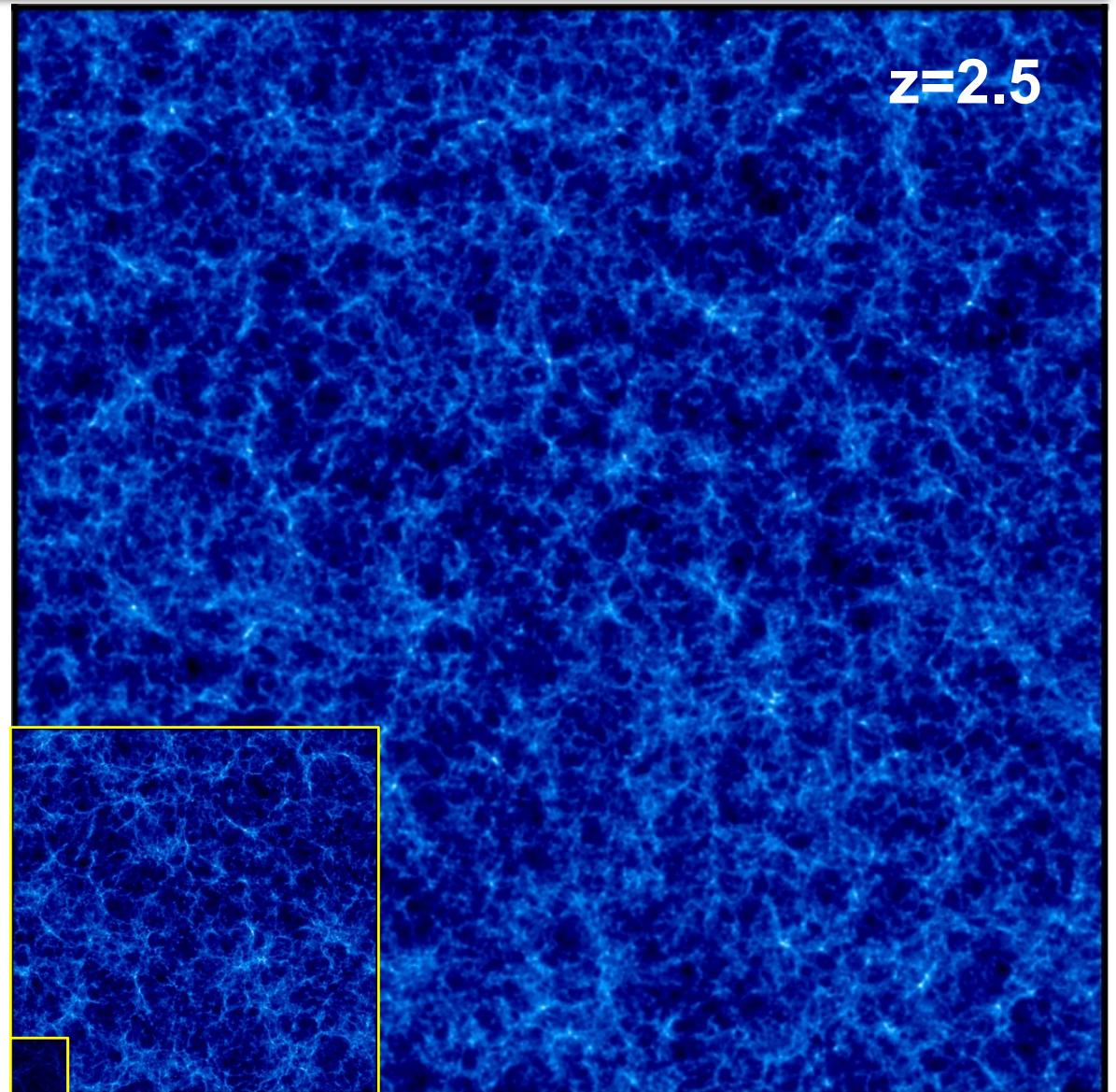
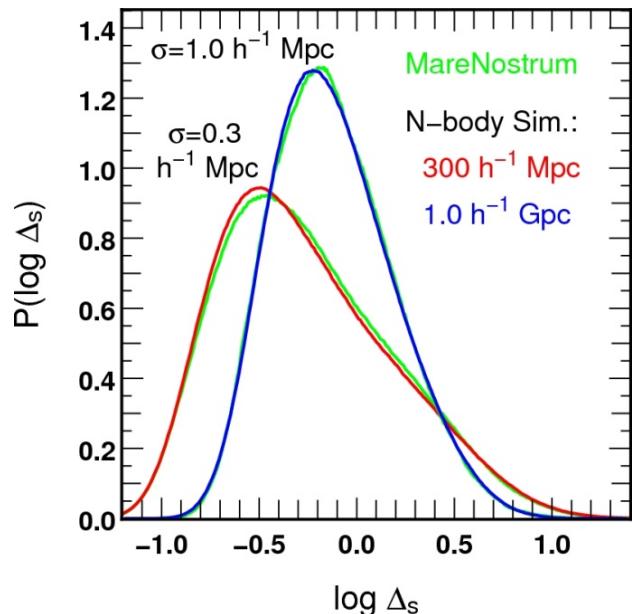


Application to large cosmological DM simulations

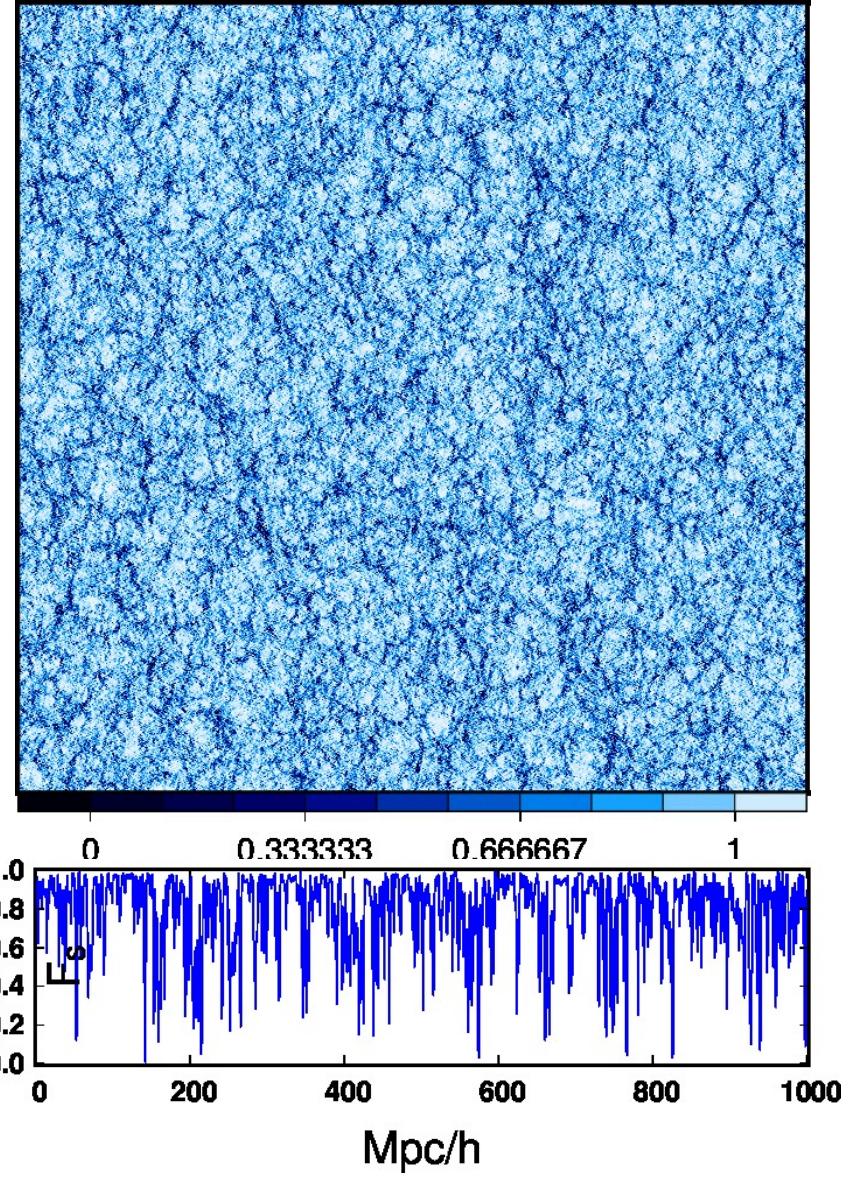
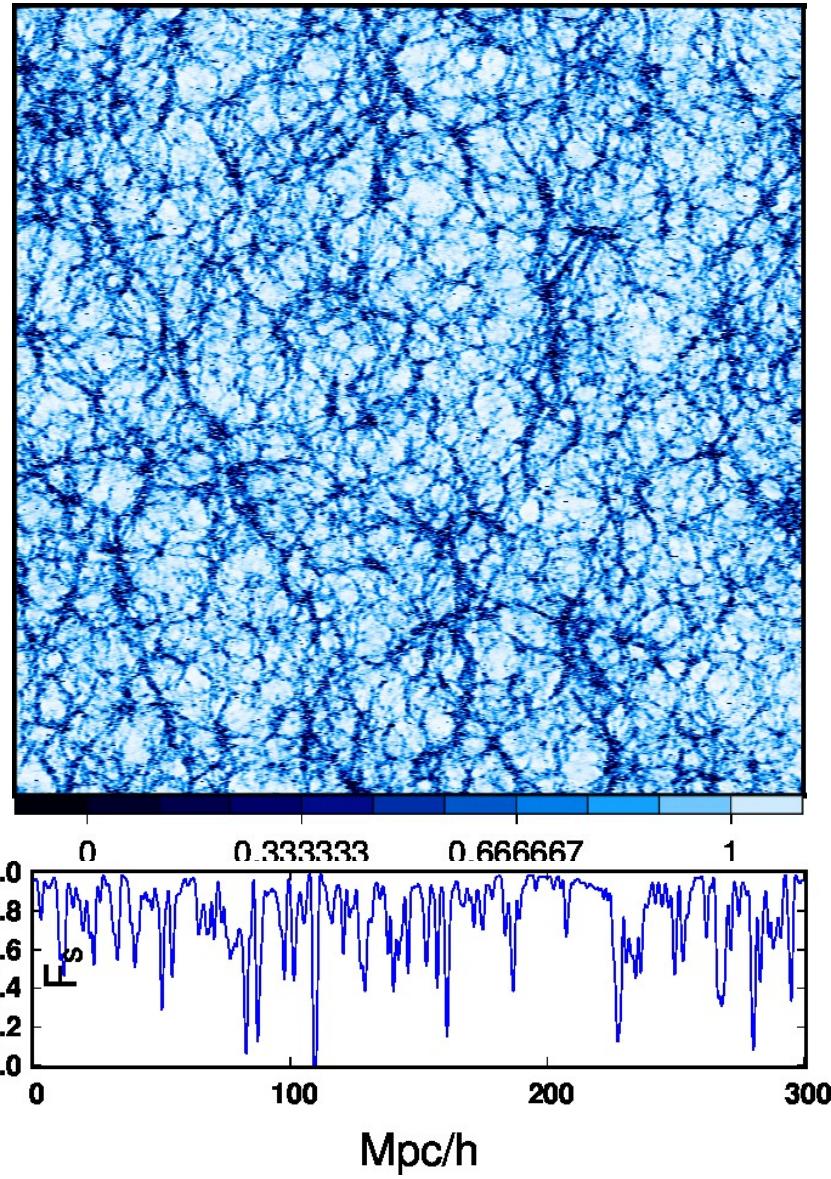
Gadget2 (Springel 2005)

300 Mpc/h - 1024^3 particles -
WMAP1 cosmology $\sigma_{\text{DM}}=0.3$
Mpc/h

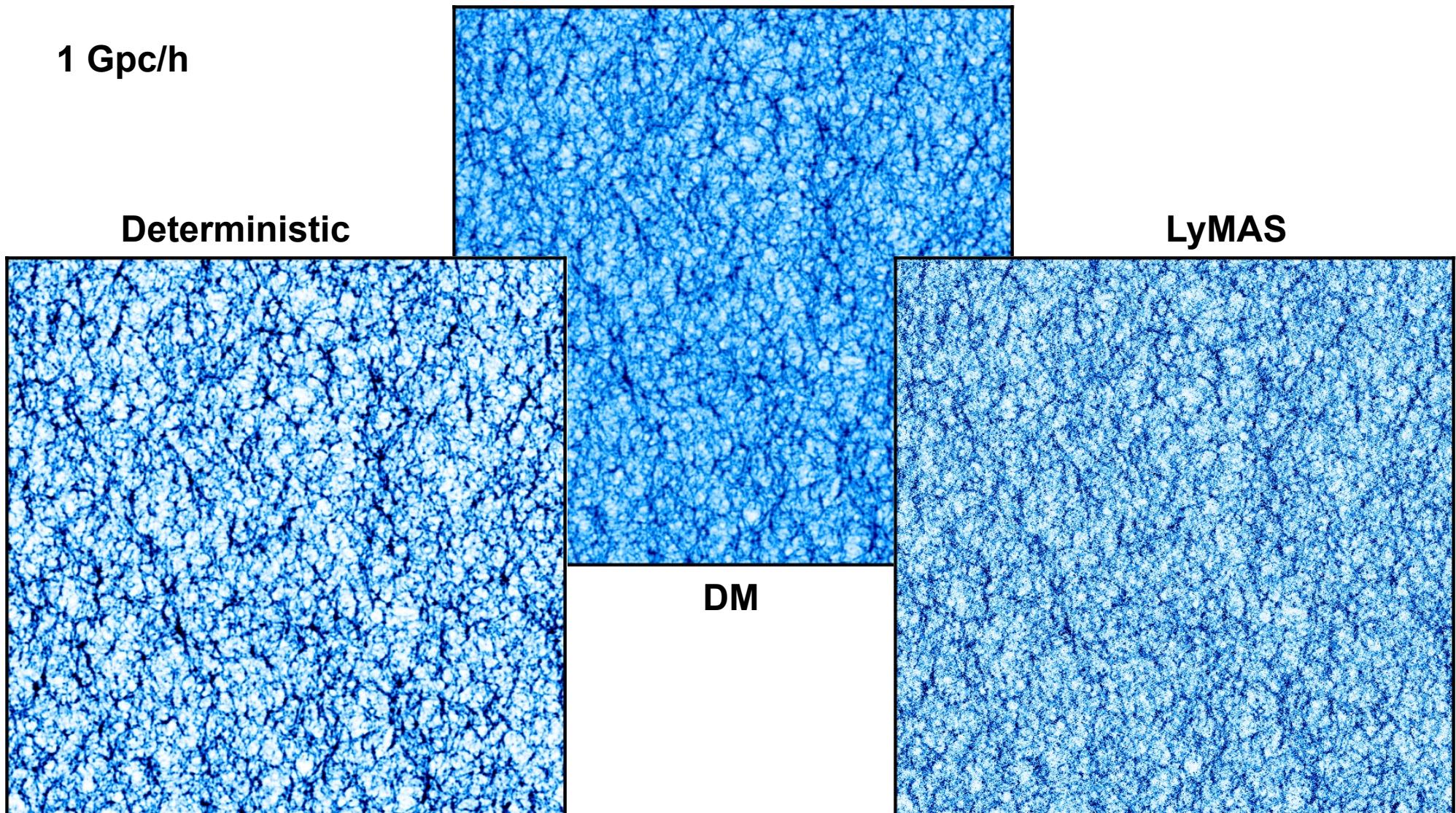
1.0 Gpc/h - 1024^3 particles -
WMAP1 cosmology $\sigma_{\text{DM}}=1.0$
Mpc/h



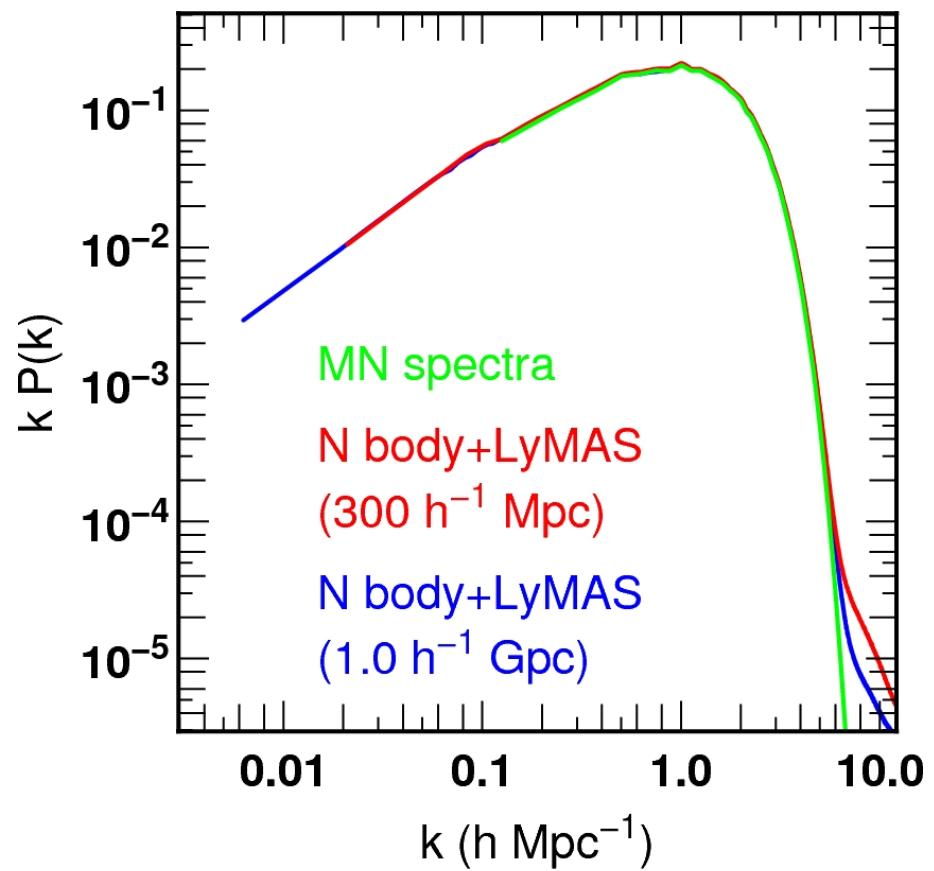
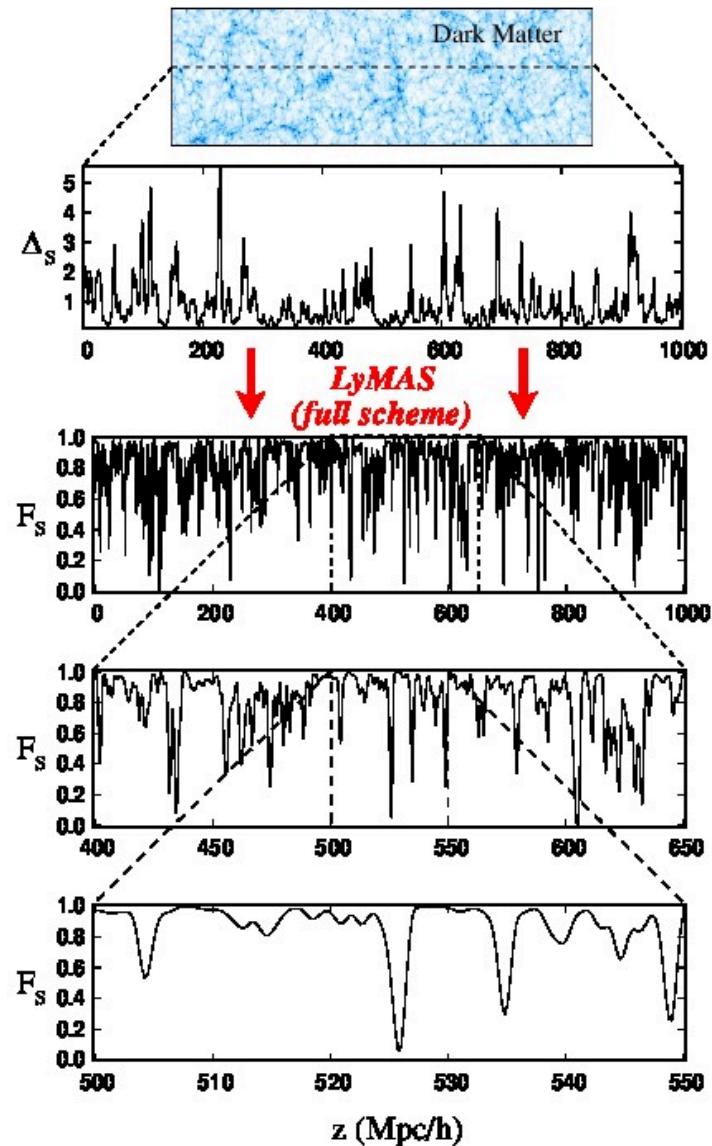
Application to large cosmological DM simulations



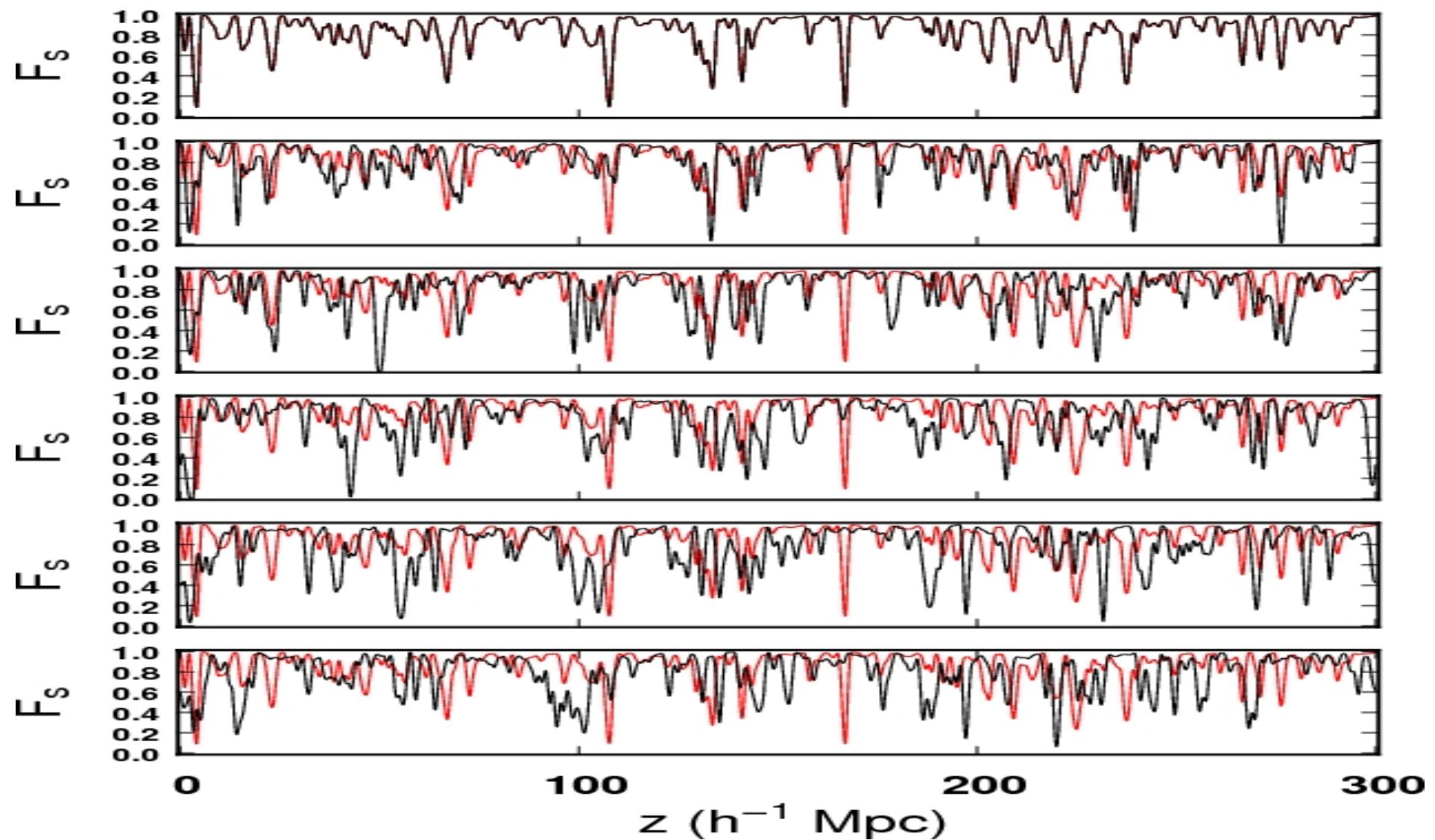
Application to large cosmological DM simulations



Application to large cosmological DM simulations

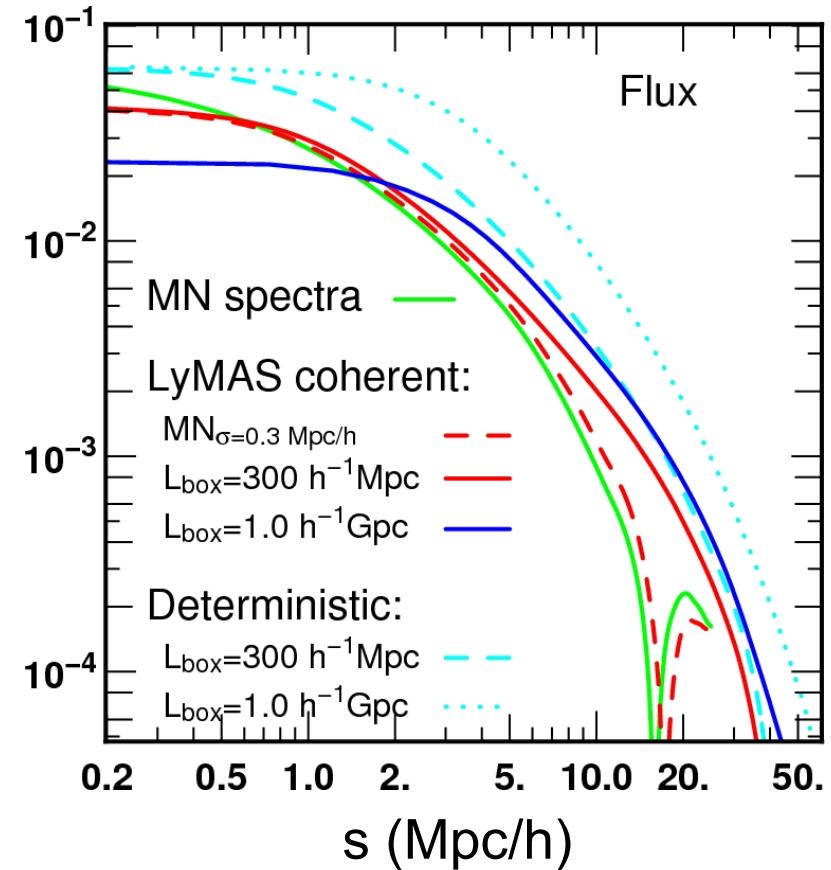
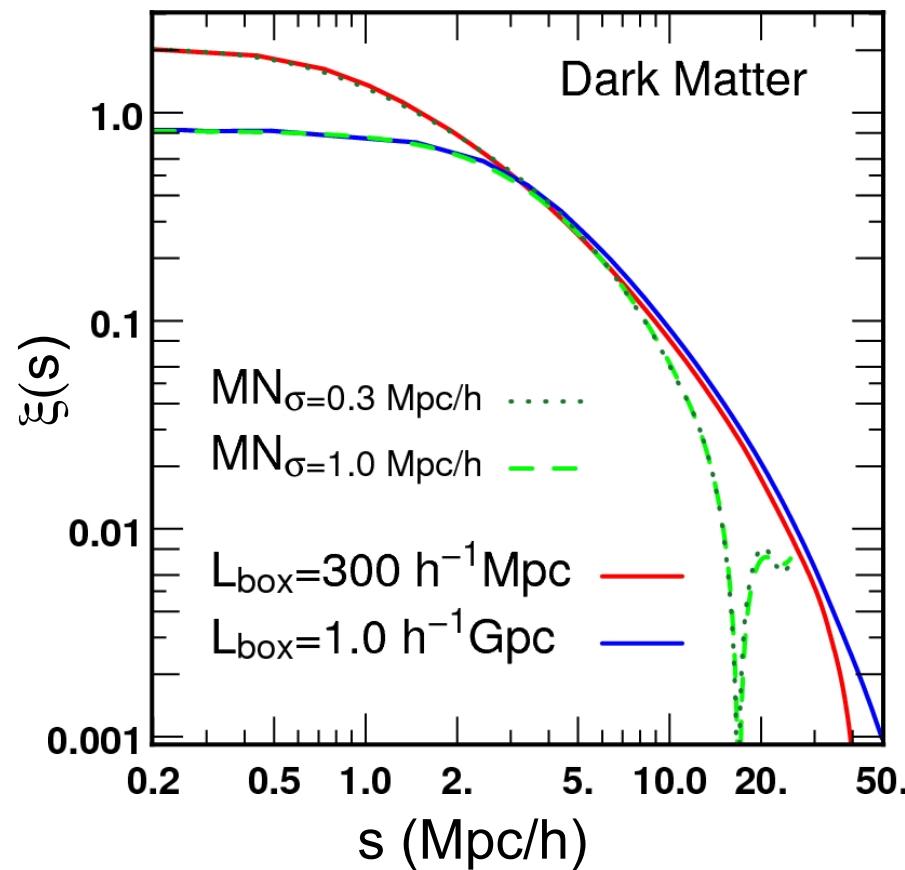


Application to large cosmological DM simulations



Application to large cosmological DM simulations

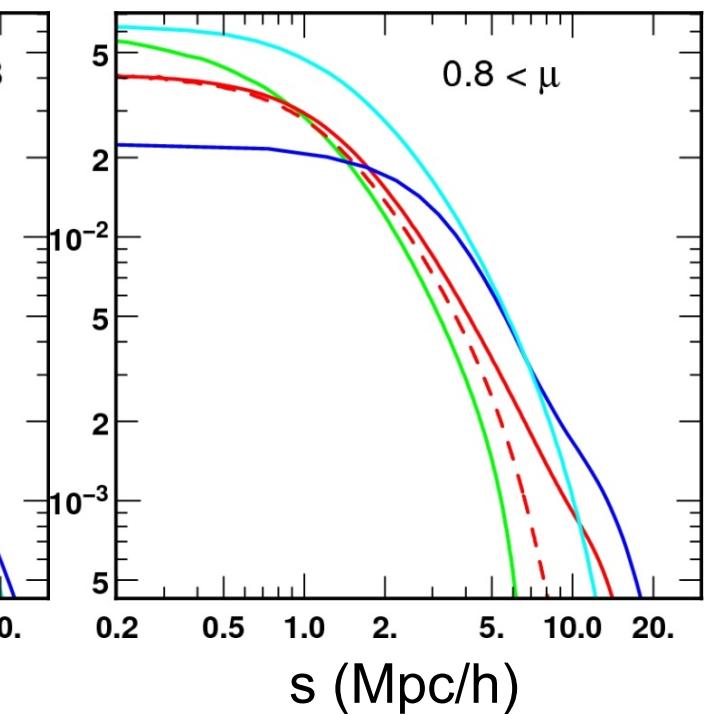
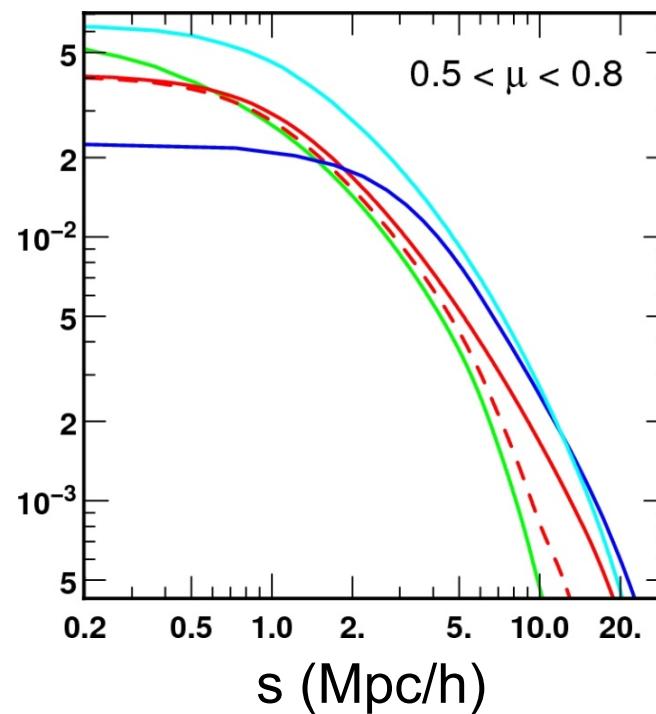
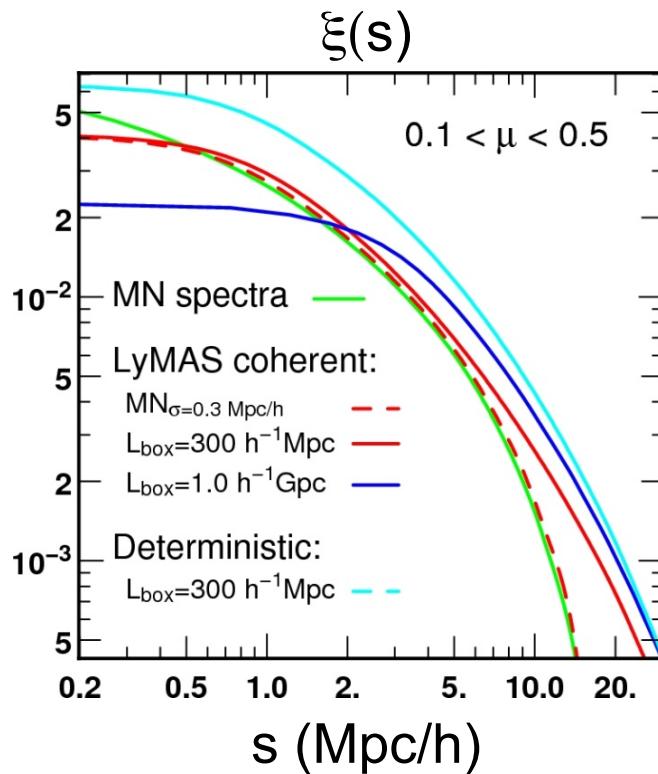
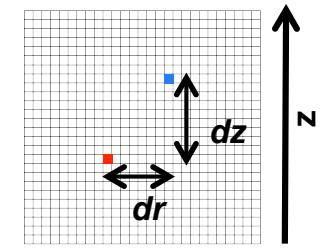
Correlation function:



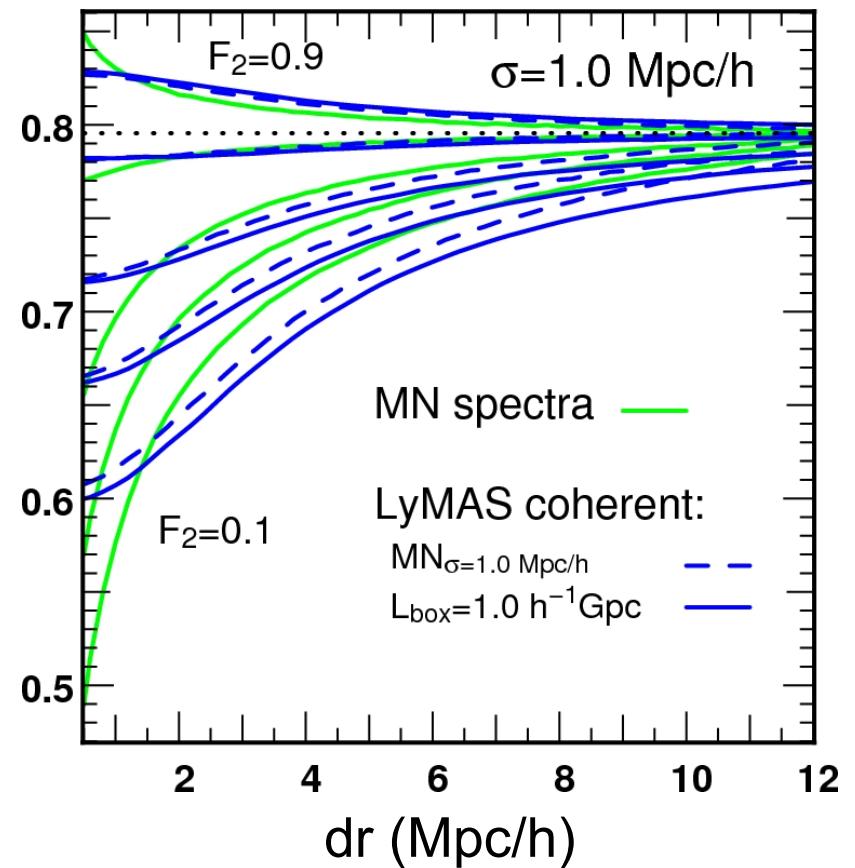
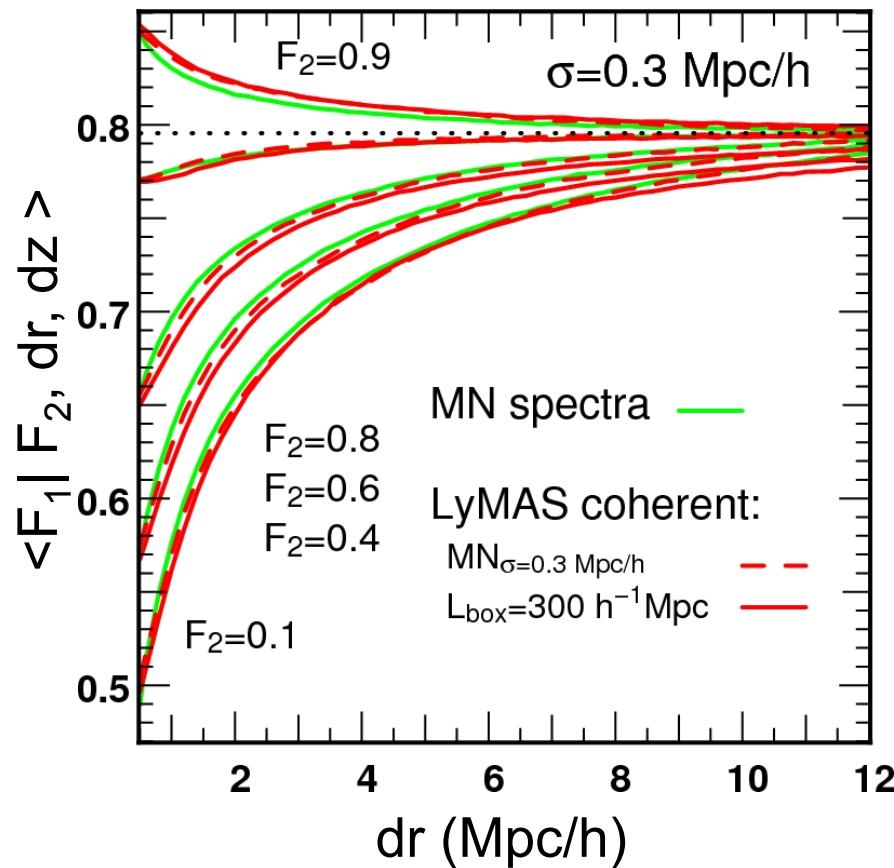
Application to large cosmological DM simulations

Correlation function:

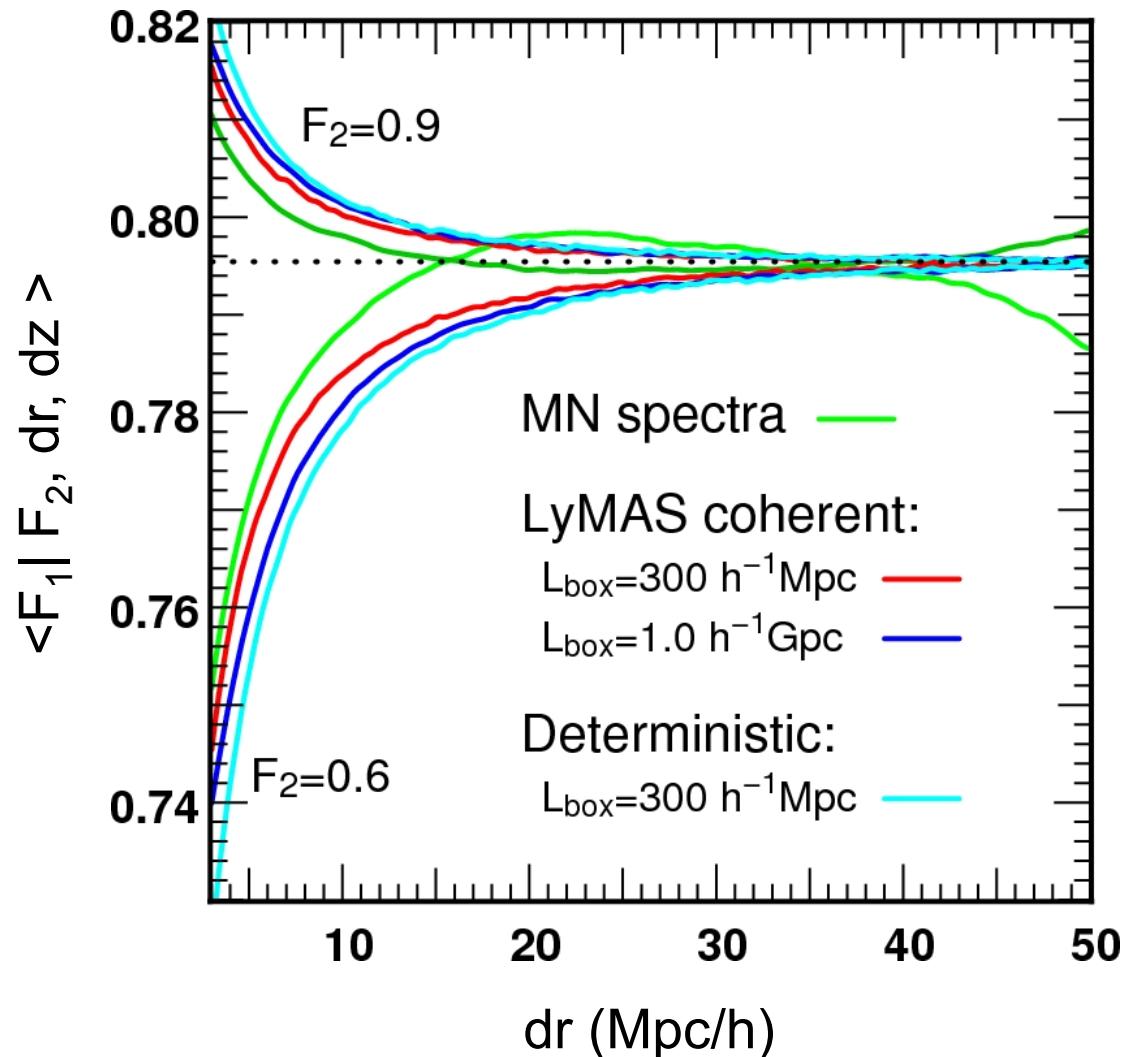
$$\mu = \frac{dz}{\sqrt{dr^2 + dz^2}}$$
$$s = \sqrt{dr^2 + dz^2}$$



Application to large cosmological DM simulations



Application to large cosmological DM simulations



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Numerical modeling improvements

1. Algorithms

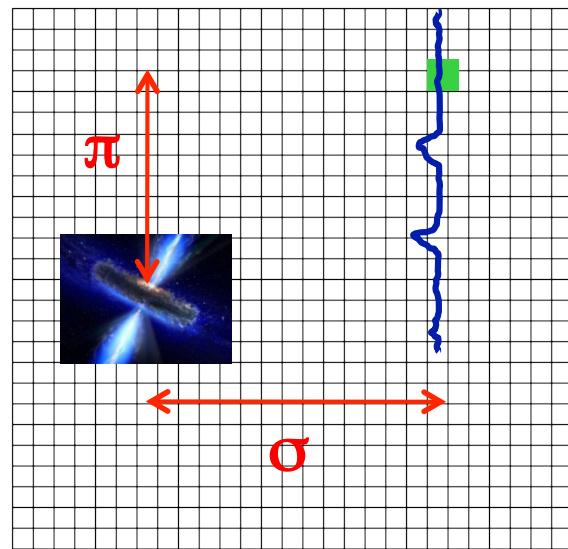
- QSO continuum
- Redshift evolution
- Noises
- Non constant spectral resolution
- Etc...

2. Simulations and more realistic catalogs of spectra

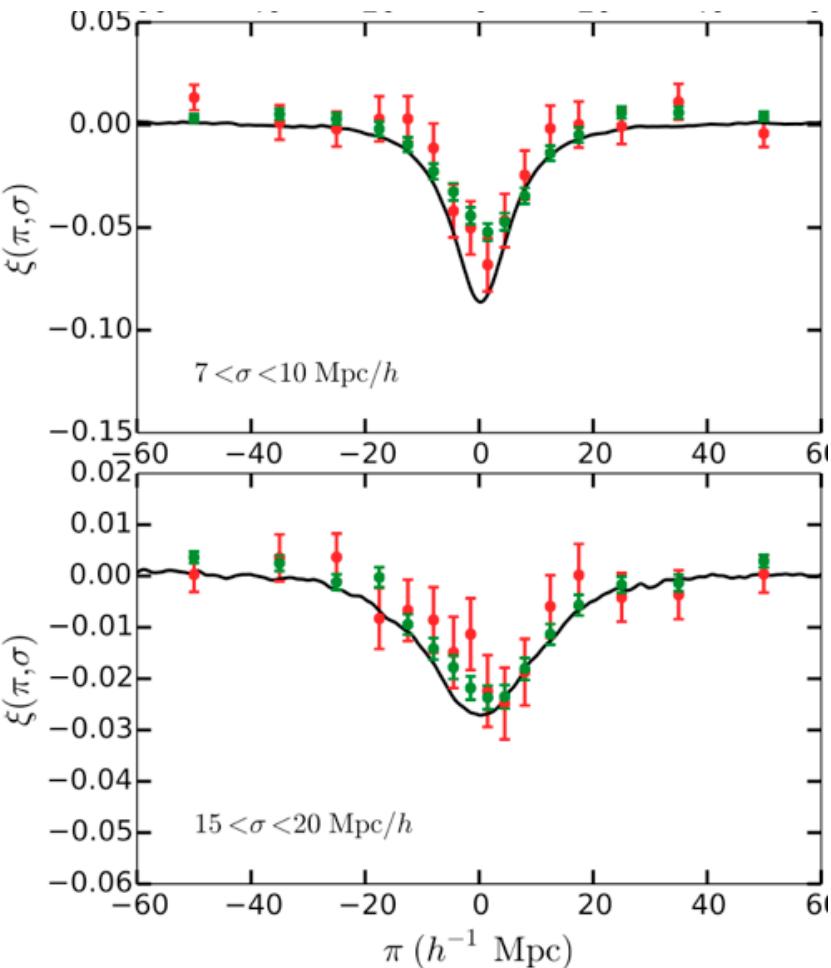
- N-body simulations : $\geq 2 \text{ Gpc/h}$ (BAO study)
- Light cones
- Hydro simulations (planck, WDM...)
- Etc...

Cross correlation quasar Ly α in BOSS survey

Font-Ribera et al. (2013)
(SDSS DR9)



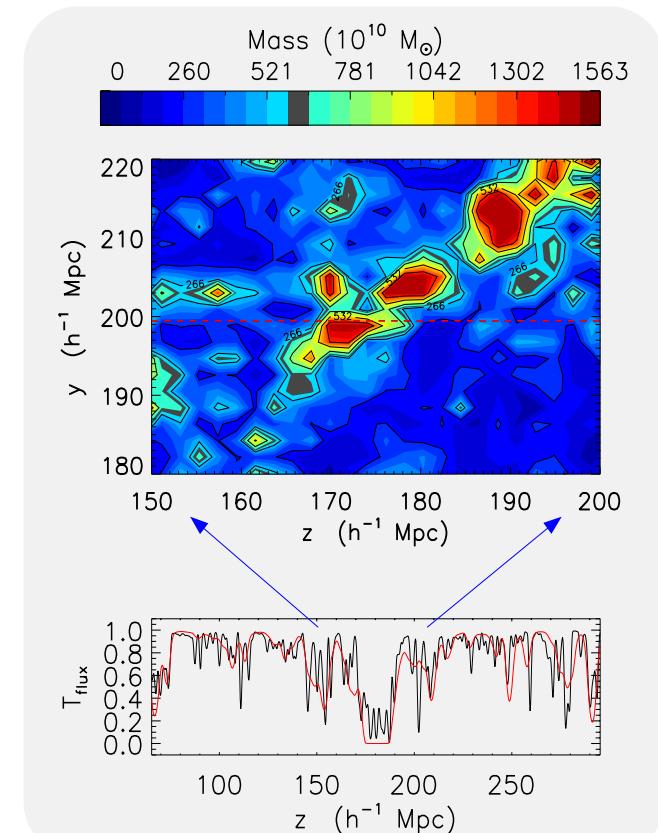
LyMAS mocks: WMAP7 – 1 Gpc/h –
2048³ particles – AGN and noAGN



“Modelling the Ly α forest cross correlation with LyMAS” Lochhass, Weinberg, Peirani et al.,
to be submitted

MAMMOTH + LyMAS

*MA*pping the *Most Massive Overdensity Through Hydrogen*



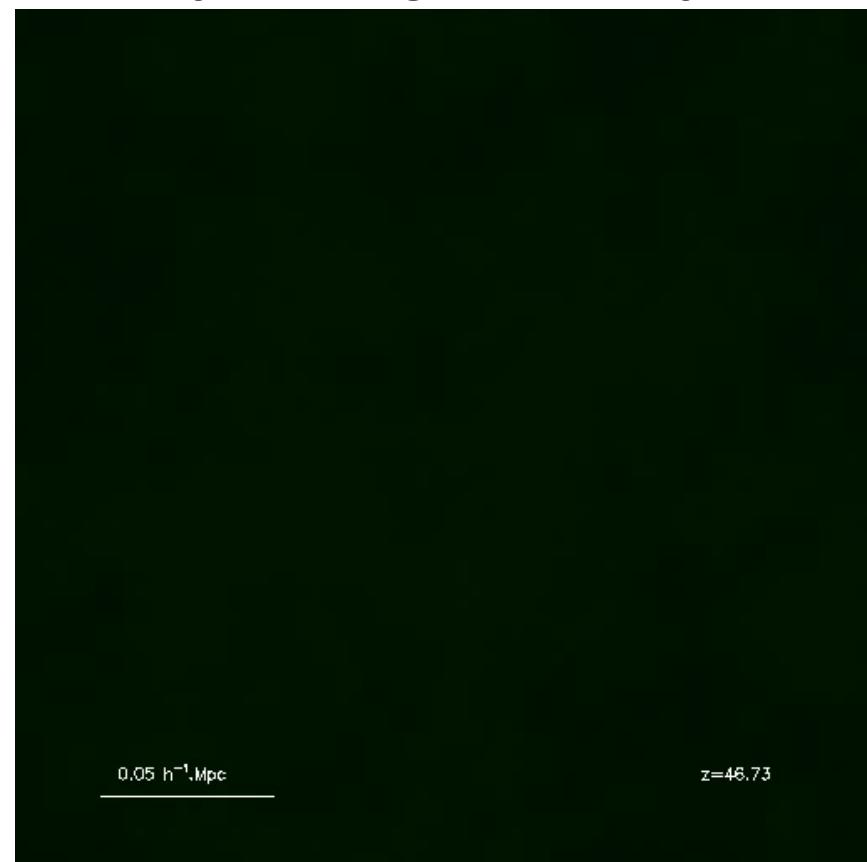
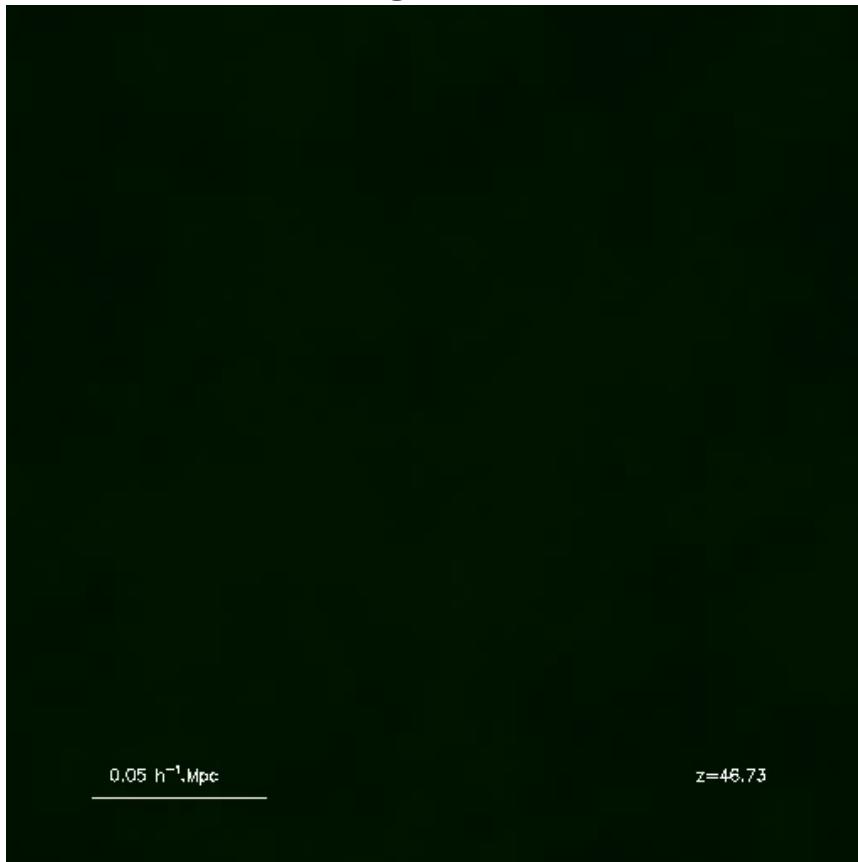
“MApping the **Most Massive Overdensity Through Hydrogen (MAMMOTH): I – Cai, Fan, Bian, Peirani, Frye, McGreer, White & Ho, to be submitted**

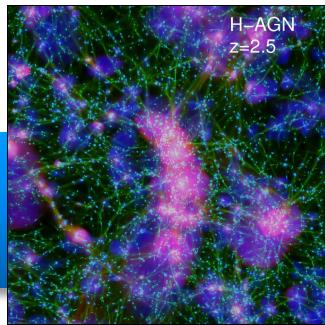
Effect of AGN feedback

Studying how large-scale Ly α clustering depends on cosmological and IGM parameters and on redshift

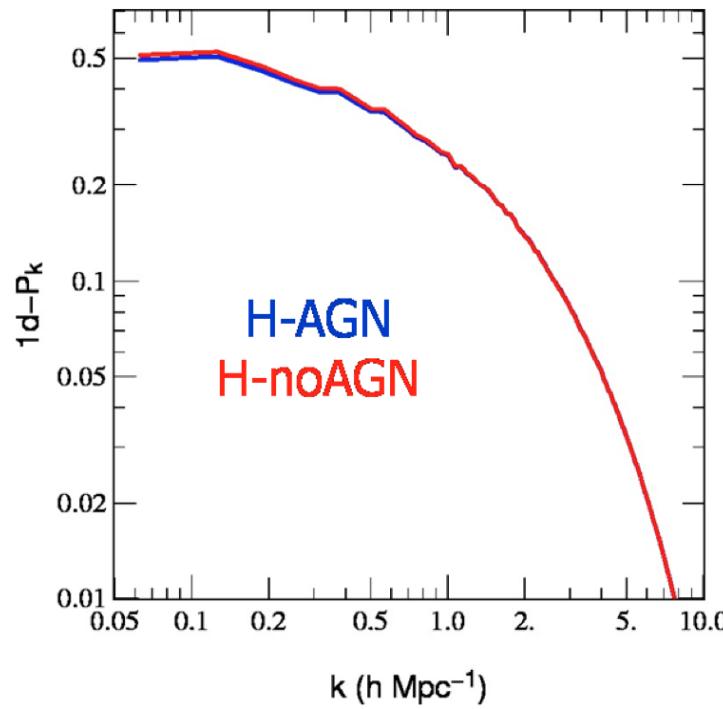
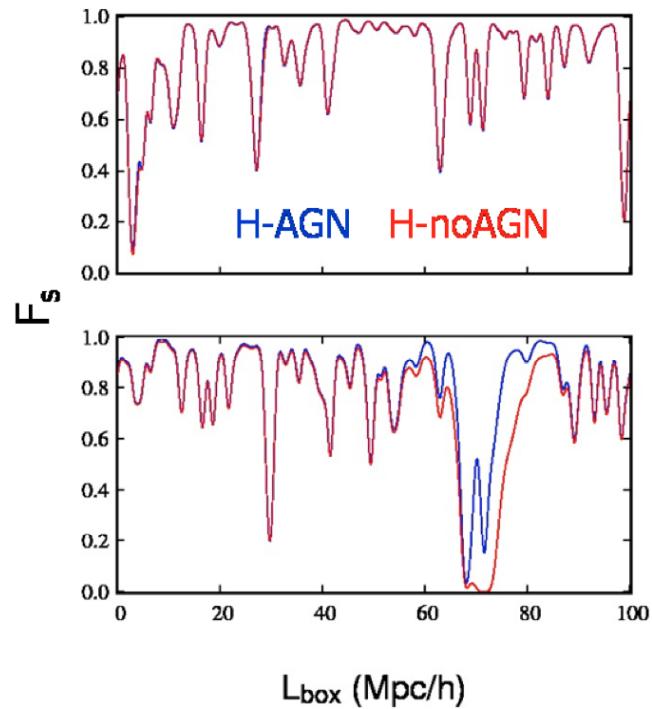
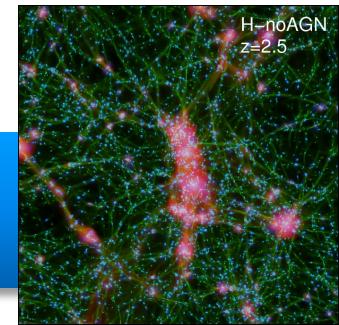
Ex: Effects of AGN feedback? (Peirani et al. in prep)

Red = gas temperature / Green = gas density / Blue = gas metallicity





AGN vs noAGN



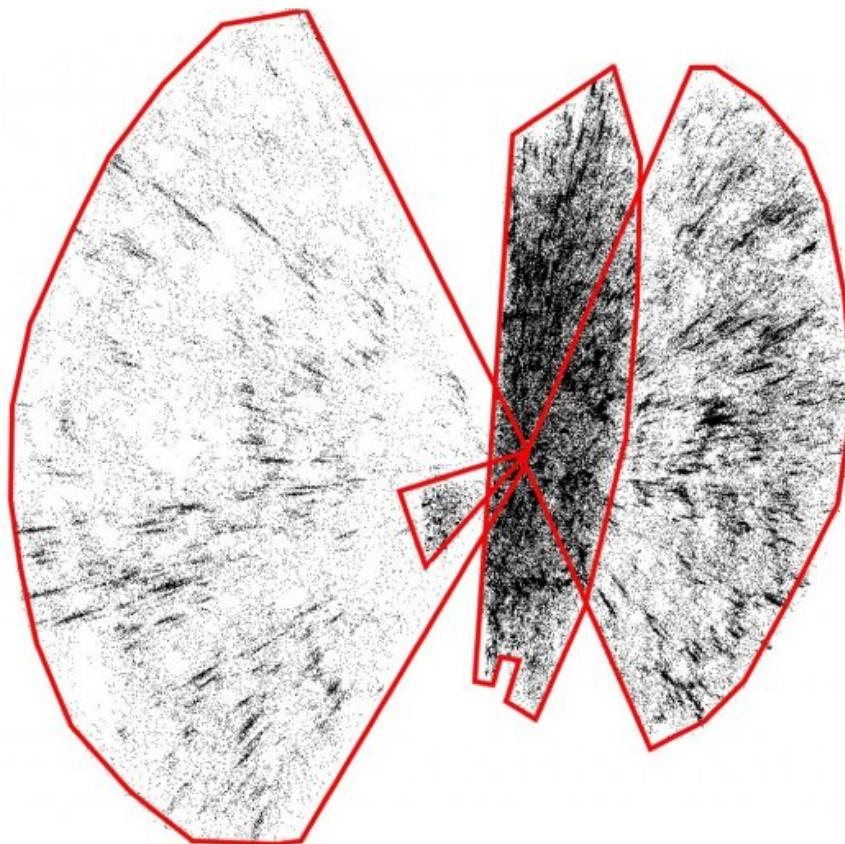
“The effect of AGN feedback on the Ly α forest clustering”
Peirani et al., in prep

Mock catalogs of galaxies

“MoLUSC: a MOck Local Universe Survey Constructor”

2008, ApJ, 678, 569

T. Sousbie, H. Courtois, G. Bryan & J. Devriendt



Web : www2.iap.fr/users/lymas/lymas.htm

LyMAS

www2.iap.fr/users/peirani/lymas/wmap1_L50.htm

ADS Jisho page WEB IAP Intranet Go-I Société Générale Caisse d'Epargne Météo pour l'île-de-France Dropbox

LyMAS Ly α Mass Association Scheme

LyMAS

Articles

Data - Calibrations

Mocks

WMAP1

WMAP7

WMAP7+AGN

PLANCK

Image Gallery

Mocks

Ramses simulation ("Horizon-MareNostrum"):

WMAP1 z=2.51 L_{box}=50 Mpc/h 1024³ DM particles

Post-treatment: LyMAS coherent using $\sigma=0.3$ Mpc/h or $\sigma=1.0$ Mpc/h - redshift space only:

Redshift space – $\sigma=0.3$ Mpc/h Redshift space – $\sigma=1.0$ Mpc/h

hydro spectra

50 Mpc/h
300 Mpc/h
1 Gpc/h

Mpc/h	L _{LSS} ($\sigma=0.3$)	L _{LSS} ($\sigma=1.0$)
0	0.85	0.85
10	0.80	0.75
20	0.75	0.65
30	0.65	0.45
40	0.70	0.55
50	0.60	0.40

ありがとうございます！

