

# Growth-rate measurements with DESI galaxies and ZTF supernovae

**Julián Bautista**

Aix Marseille Université

Centre de Physique des Particules de Marseille



# Plan

**Why** growth-rate measurements at low-redshift?


**How** to measure growth-rate with galaxies and peculiar velocities?

**What** data DESI and ZTF are providing us?

ZTF simulations

Growth-rate estimates with peculiar velocities from supernovae



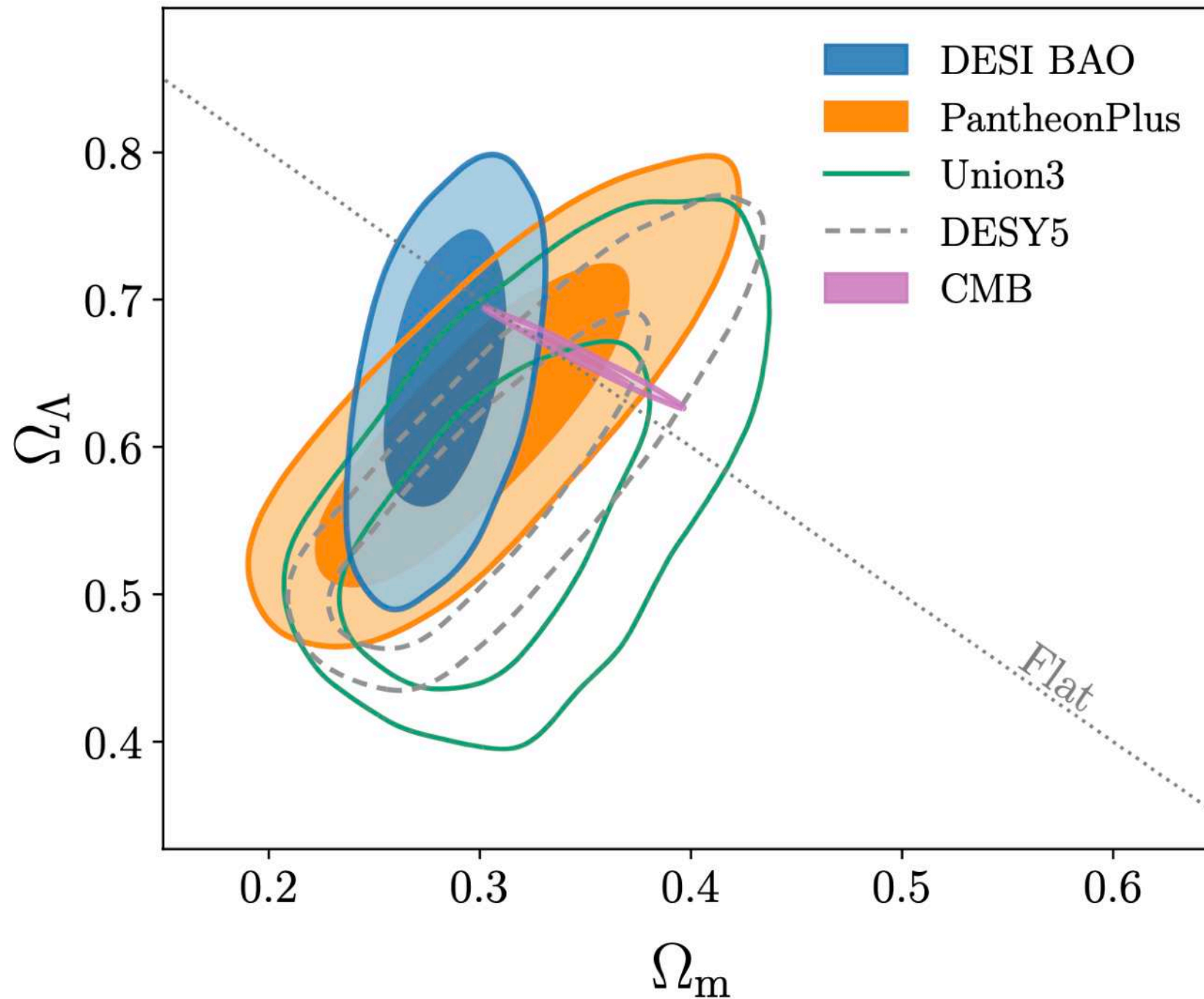


**Why growth-rate measurements at low-redshift?**



Universe's expansion is **accelerating** as seen by SN + BAO + CMB

Dark energy as a cosmological constant  $\Lambda$

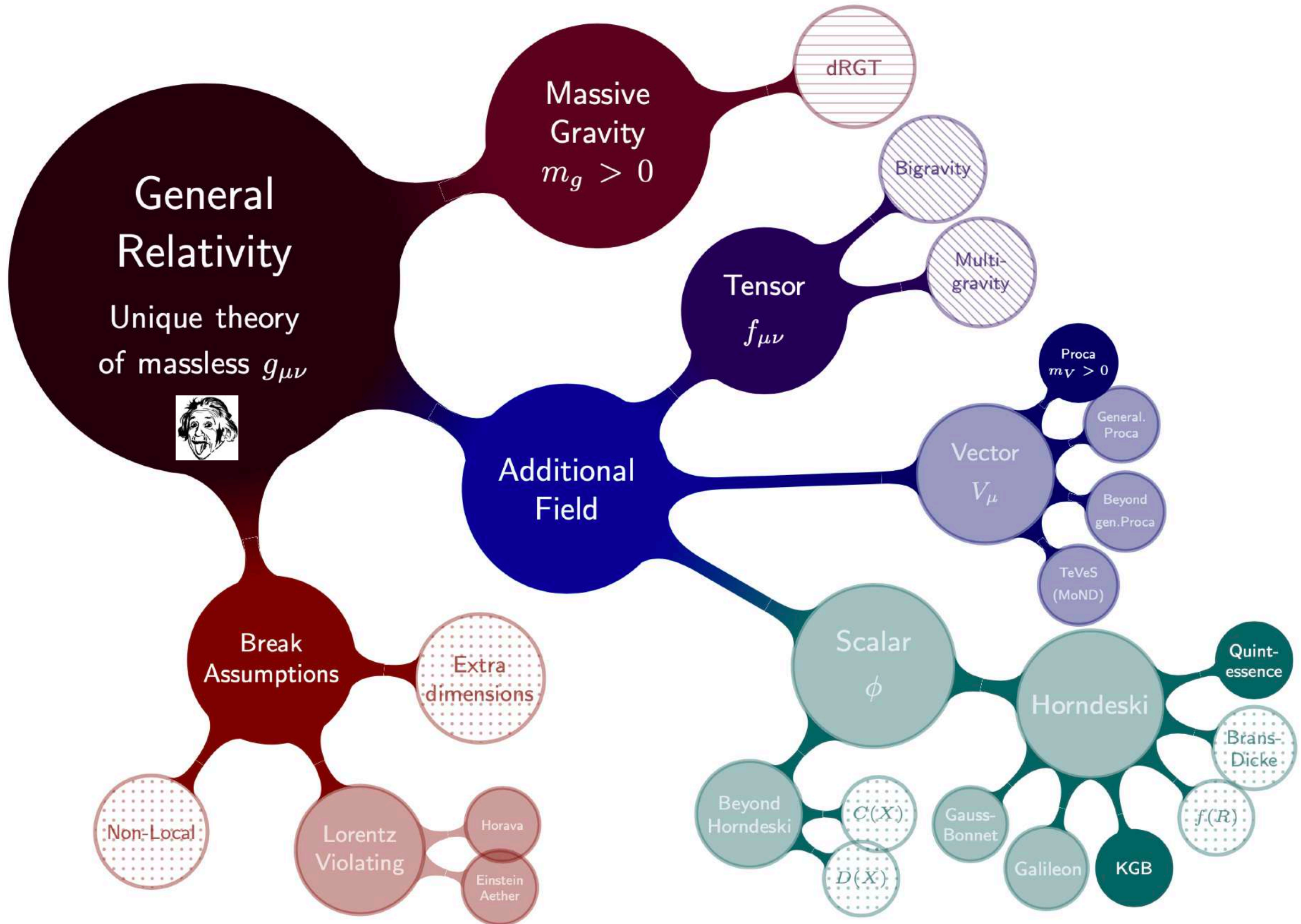


DESI Collaboration 2024

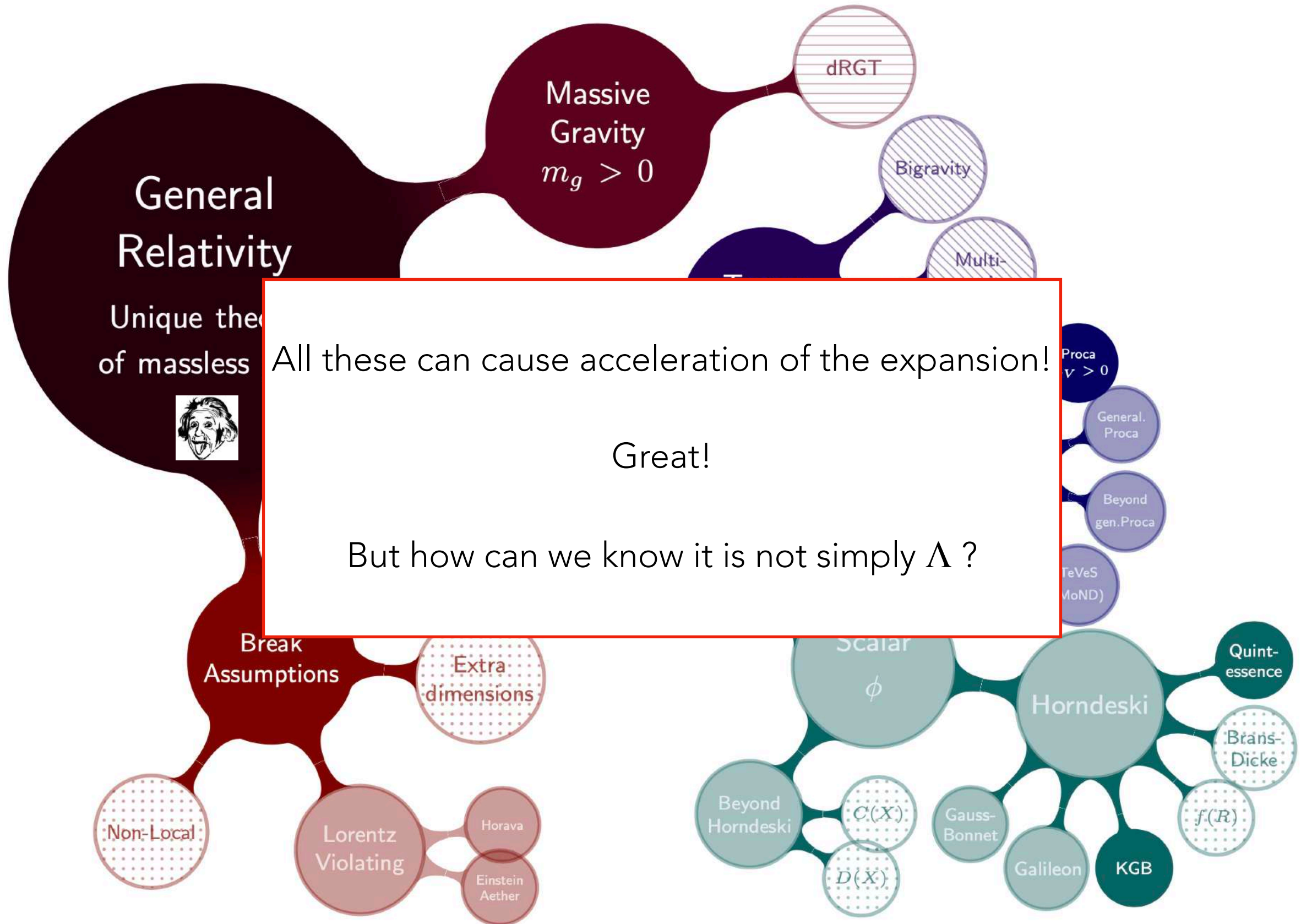
Acceleration requires dark energy

Physically motivated theory ? Alternatives or extensions of General Relativity

# Physically motivated theory ? Alternatives or extensions of General Relativity

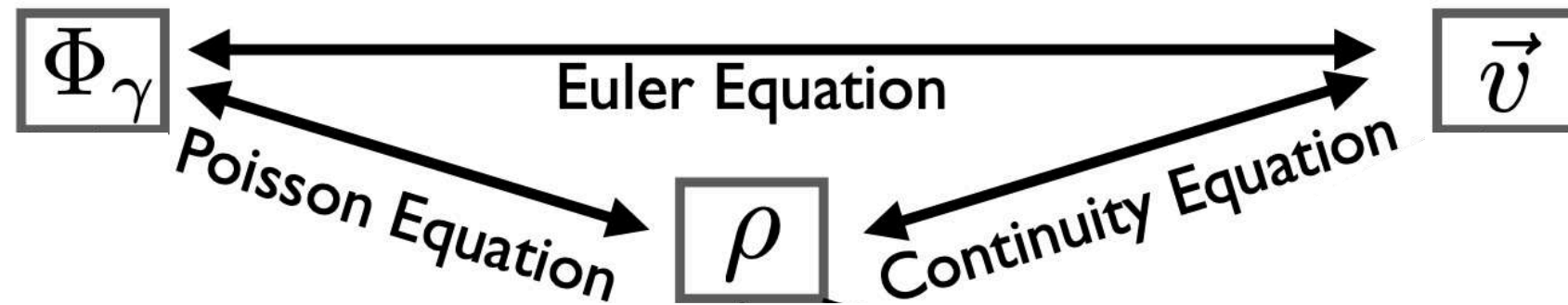


# Physically motivated theory ? Alternatives or extensions of General Relativity



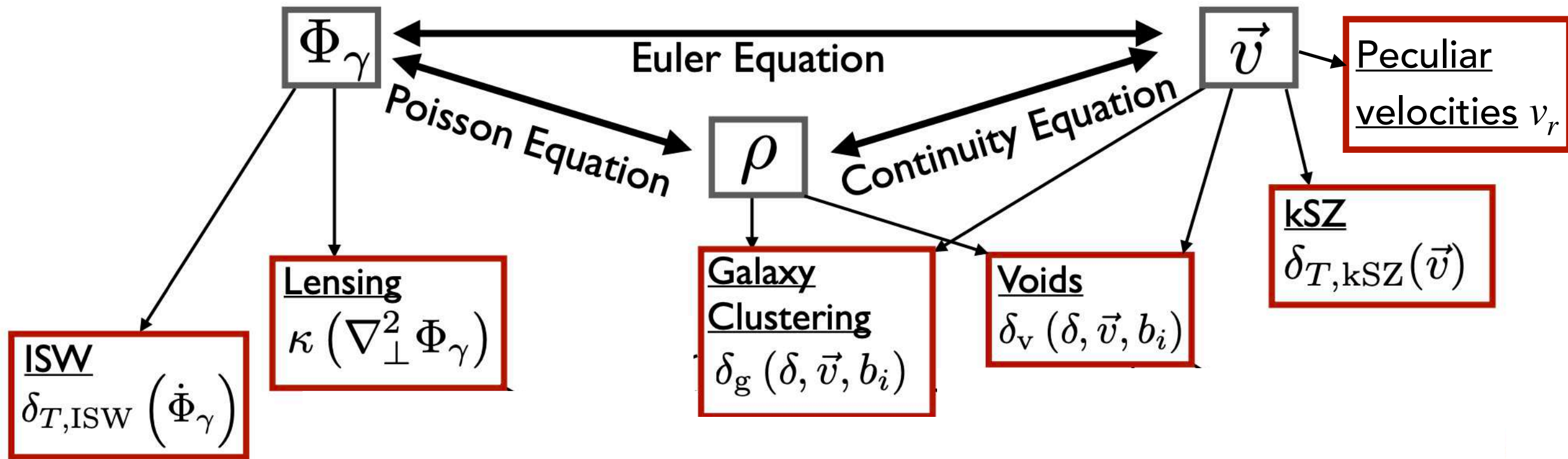


# Effect of modified gravity on perturbations

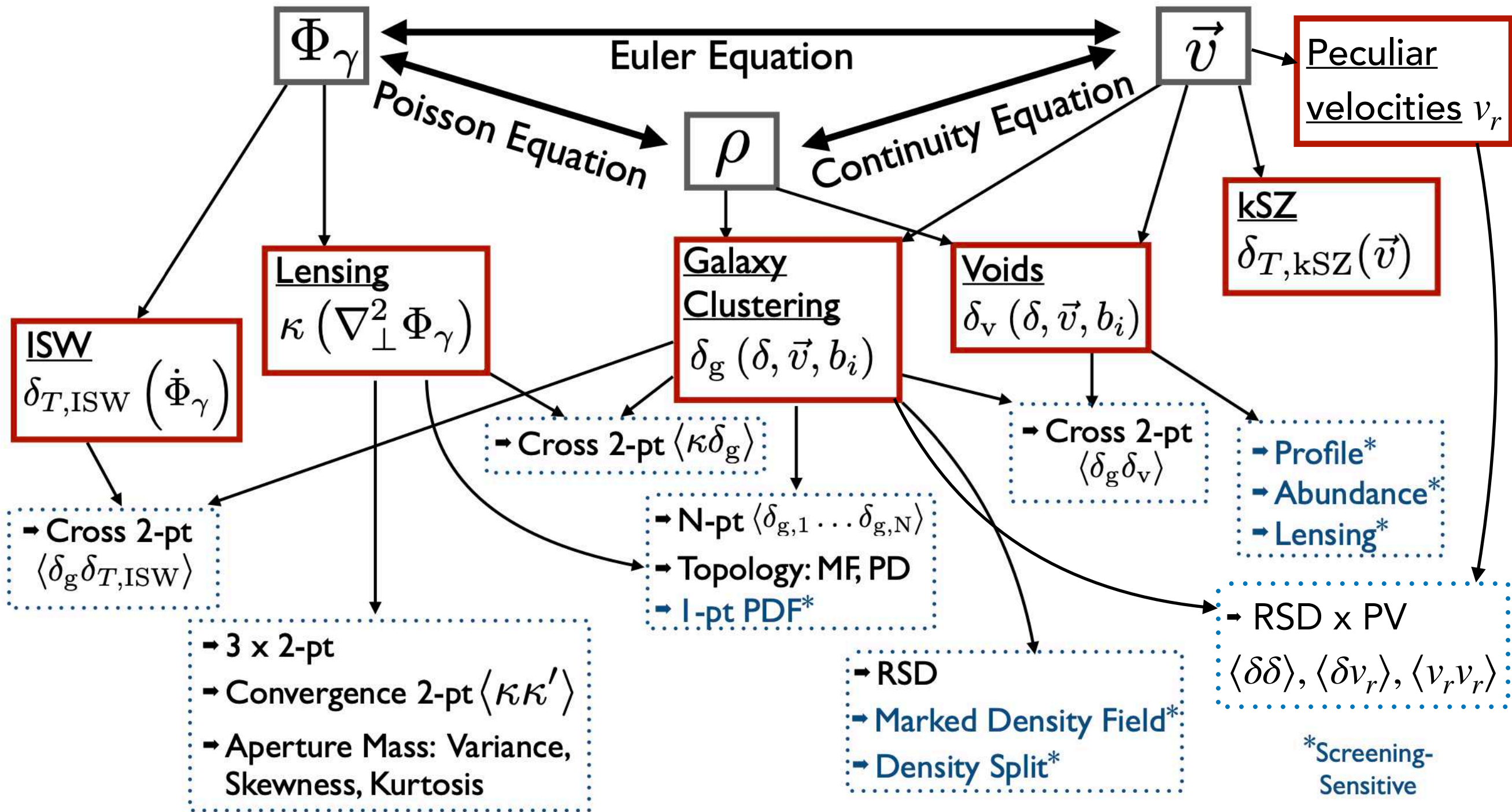




# Effect of modified gravity on perturbations

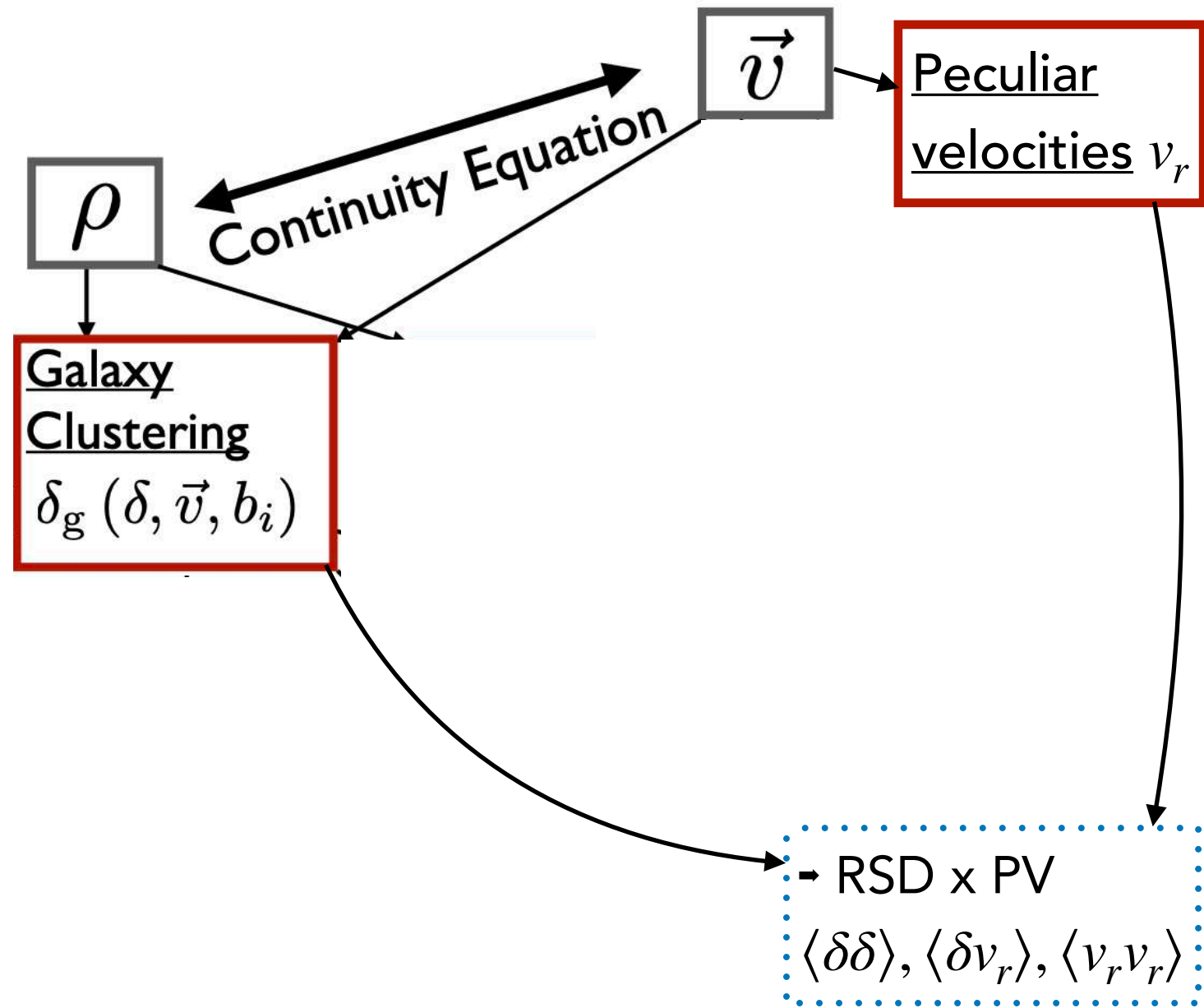


# Effect of modified gravity on perturbations





# Effect of modified gravity on perturbations



# Redshift-space distortions (RSD)

... we measure **redshifts**

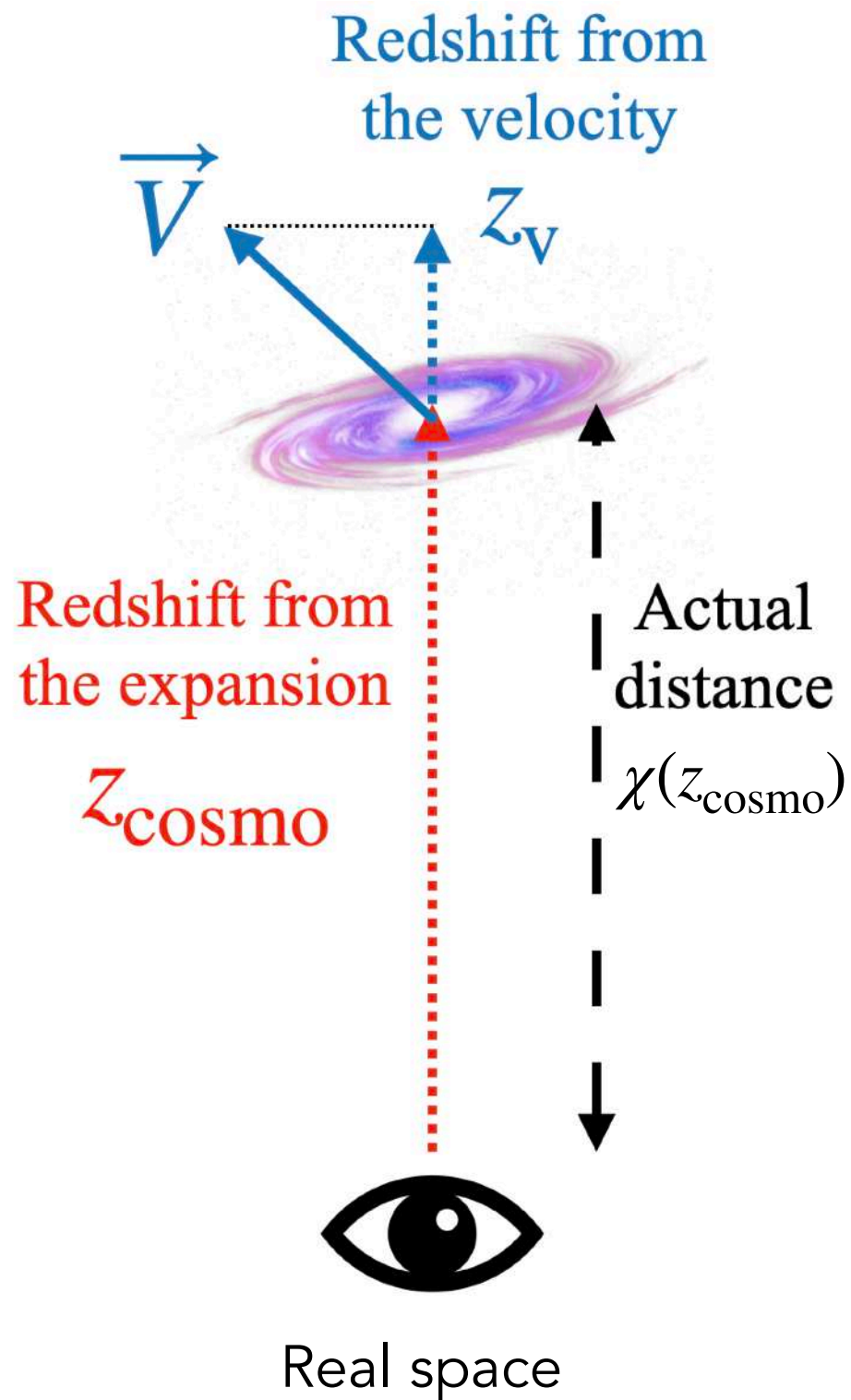
Distances in cosmology:  $D_x(z) \approx \int_0^z \frac{1}{H(z')} dz'$



# Redshift-space distortions (RSD)

... we measure **redshifts**

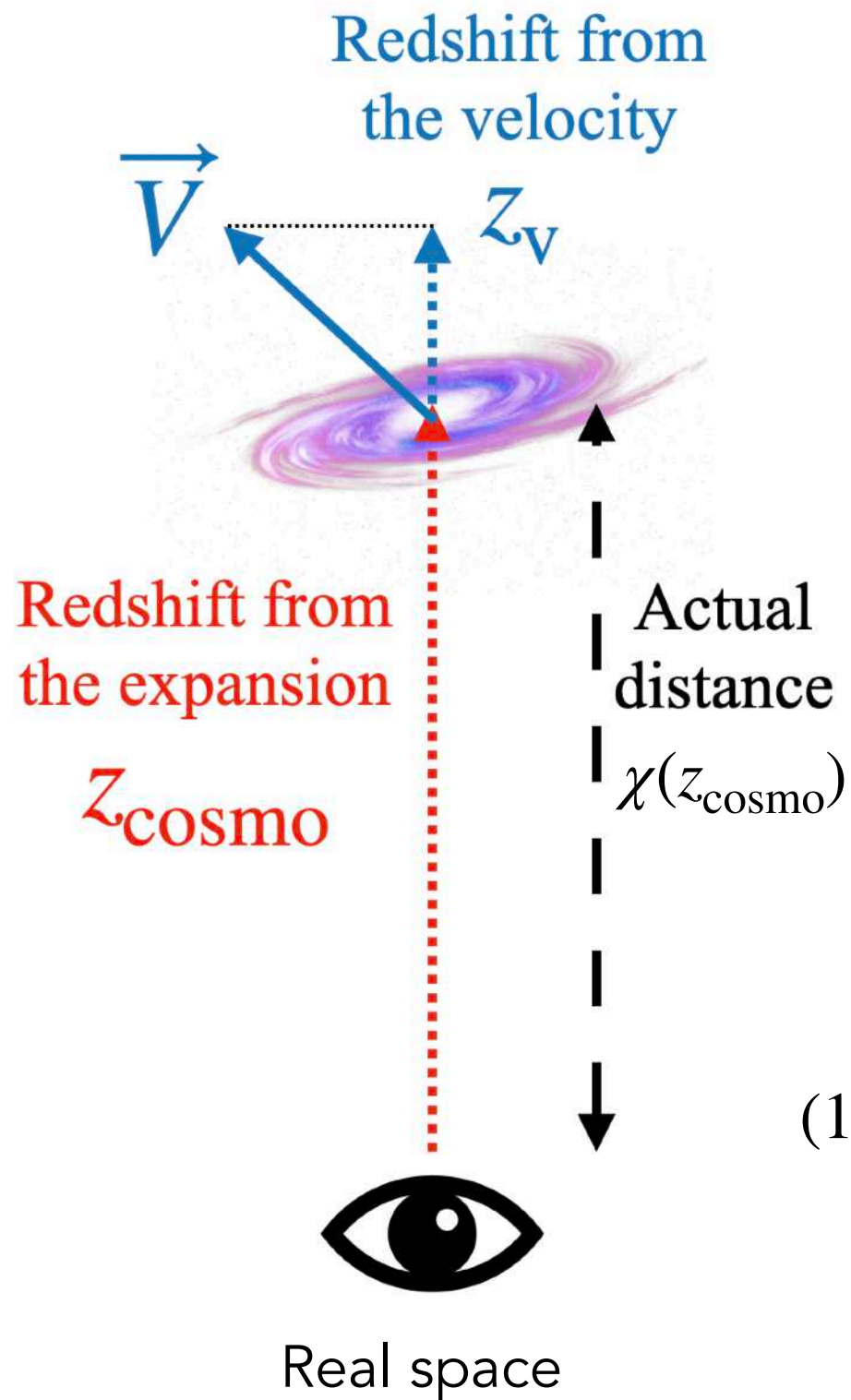
Distances in cosmology:  $D_x(z) \approx \int_0^z \frac{1}{H(z')} dz'$



# Redshift-space distortions (RSD)

... we measure **redshifts**

Distances in cosmology:  $D_x(z) \approx \int_0^z \frac{1}{H(z')} dz'$



Observed redshift is :

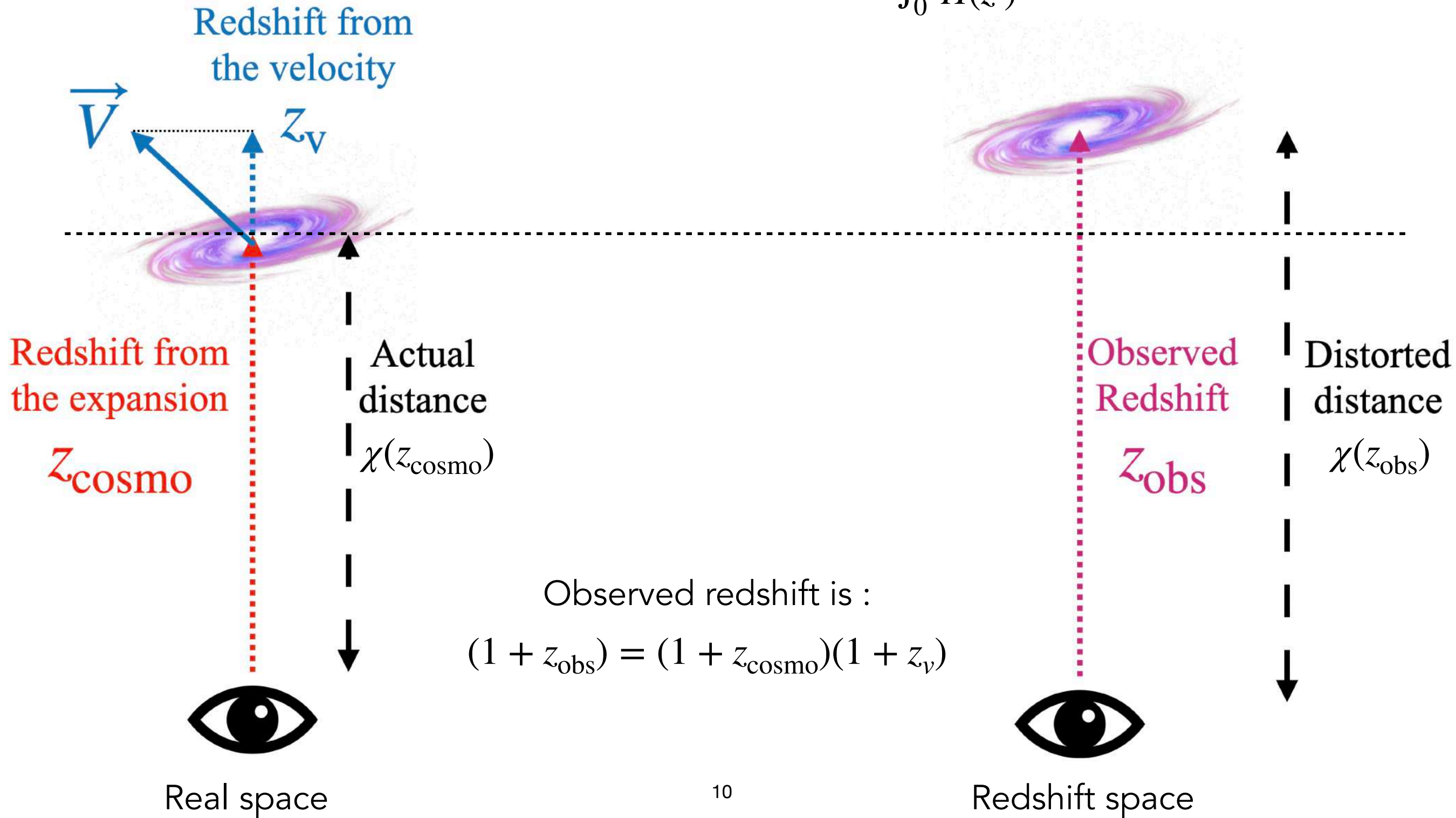
$$(1 + z_{\text{obs}}) = (1 + z_{\text{cosmo}})(1 + z_v)$$

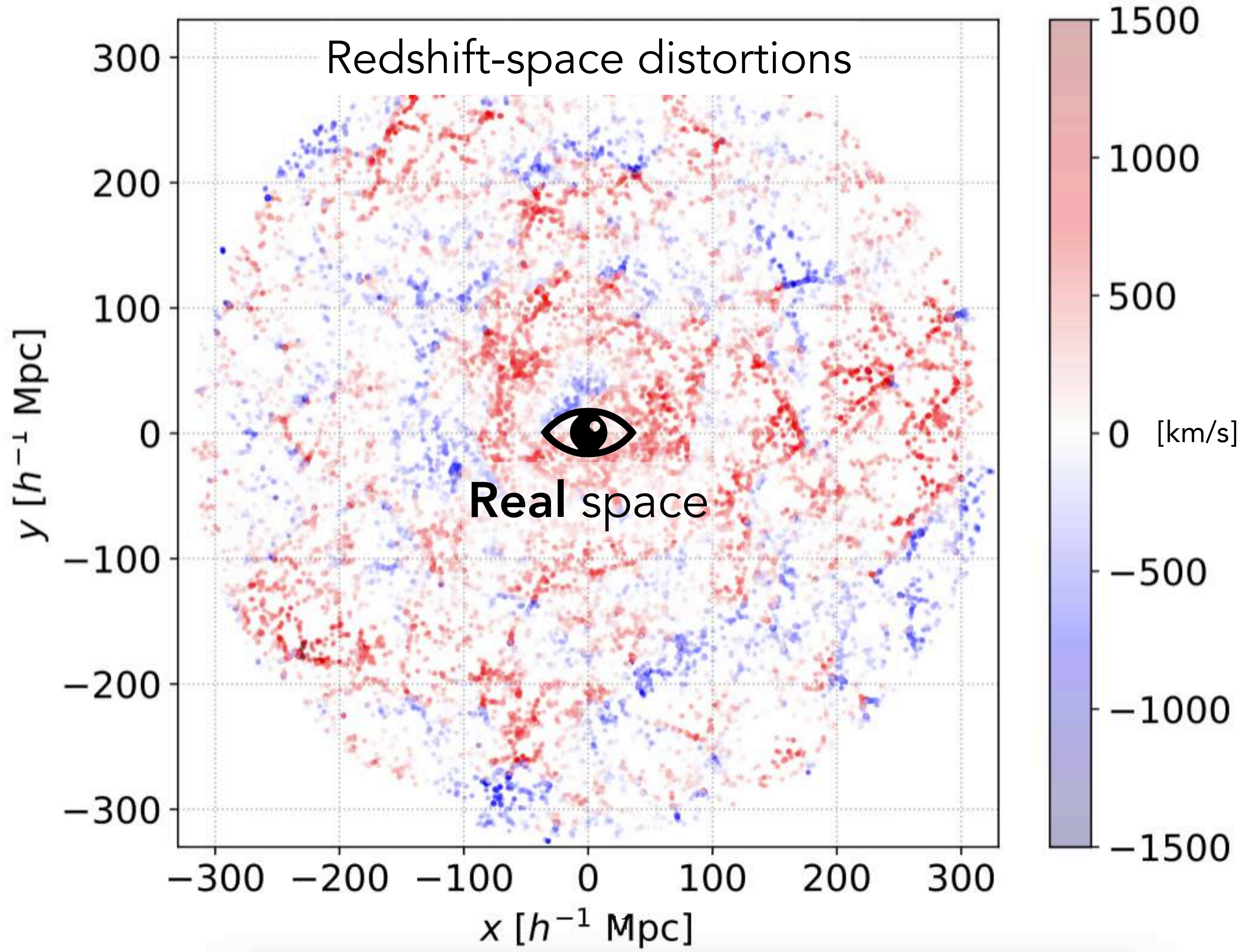


# Redshift-space distortions (RSD)

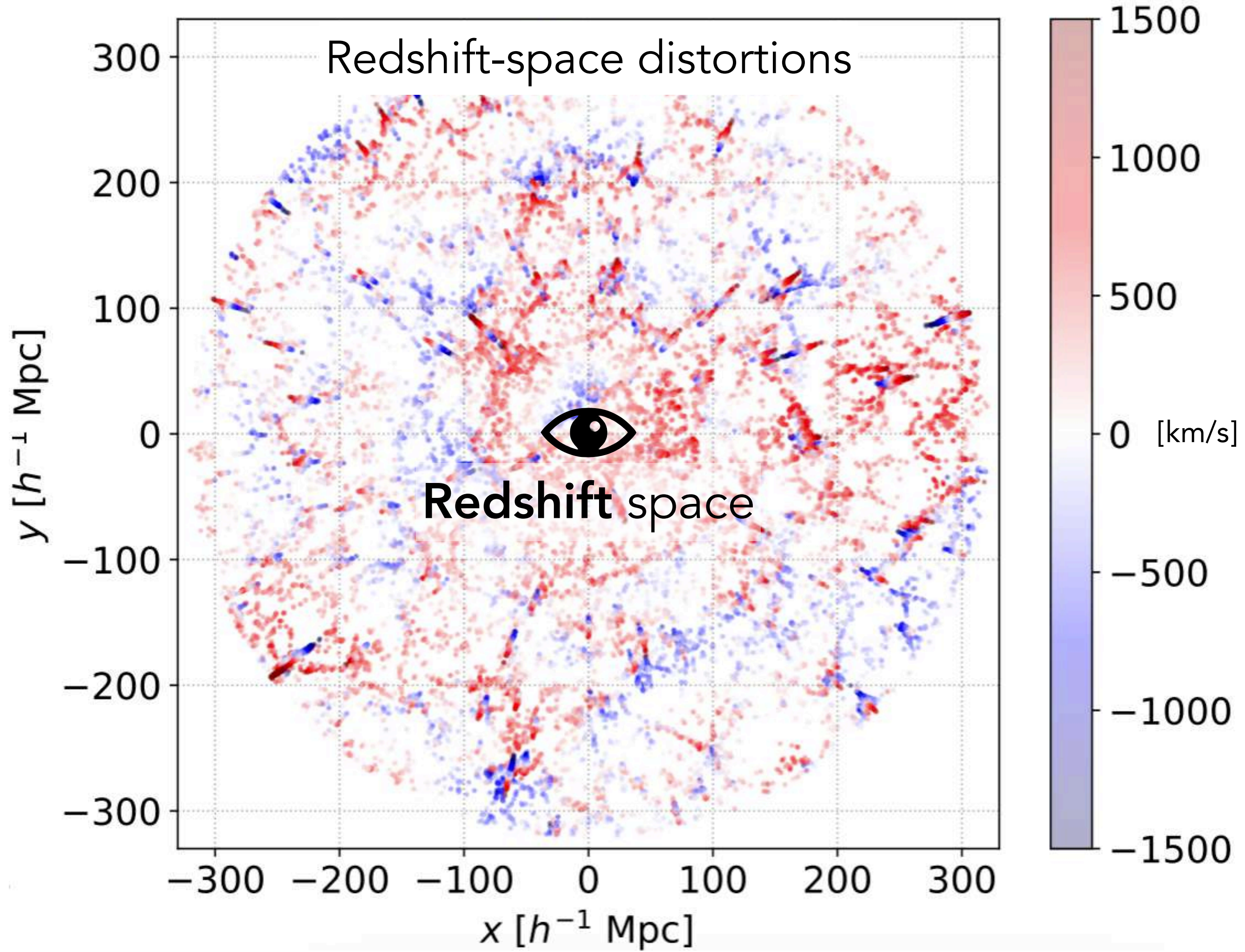
... we measure **redshifts**

Distances in cosmology:  $D_x(z) \approx \int_0^z \frac{1}{H(z')} dz'$



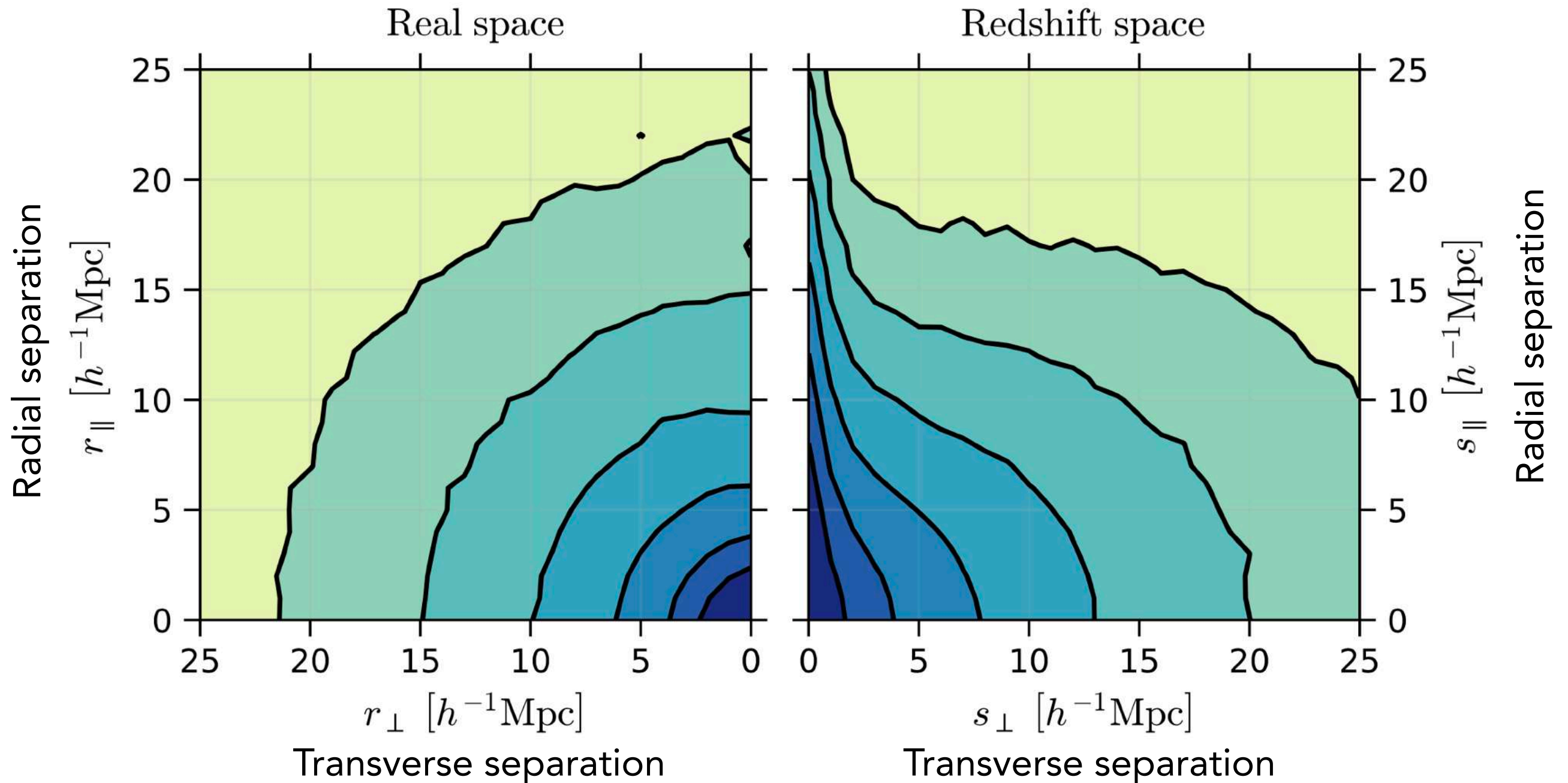






# Redshift-space distortions (RSD)

Correlation function  $\xi(\vec{r}) \equiv \langle \delta(\vec{x})\delta(\vec{x} + \vec{r}) \rangle = \xi(r_{\parallel}, r_{\perp})$

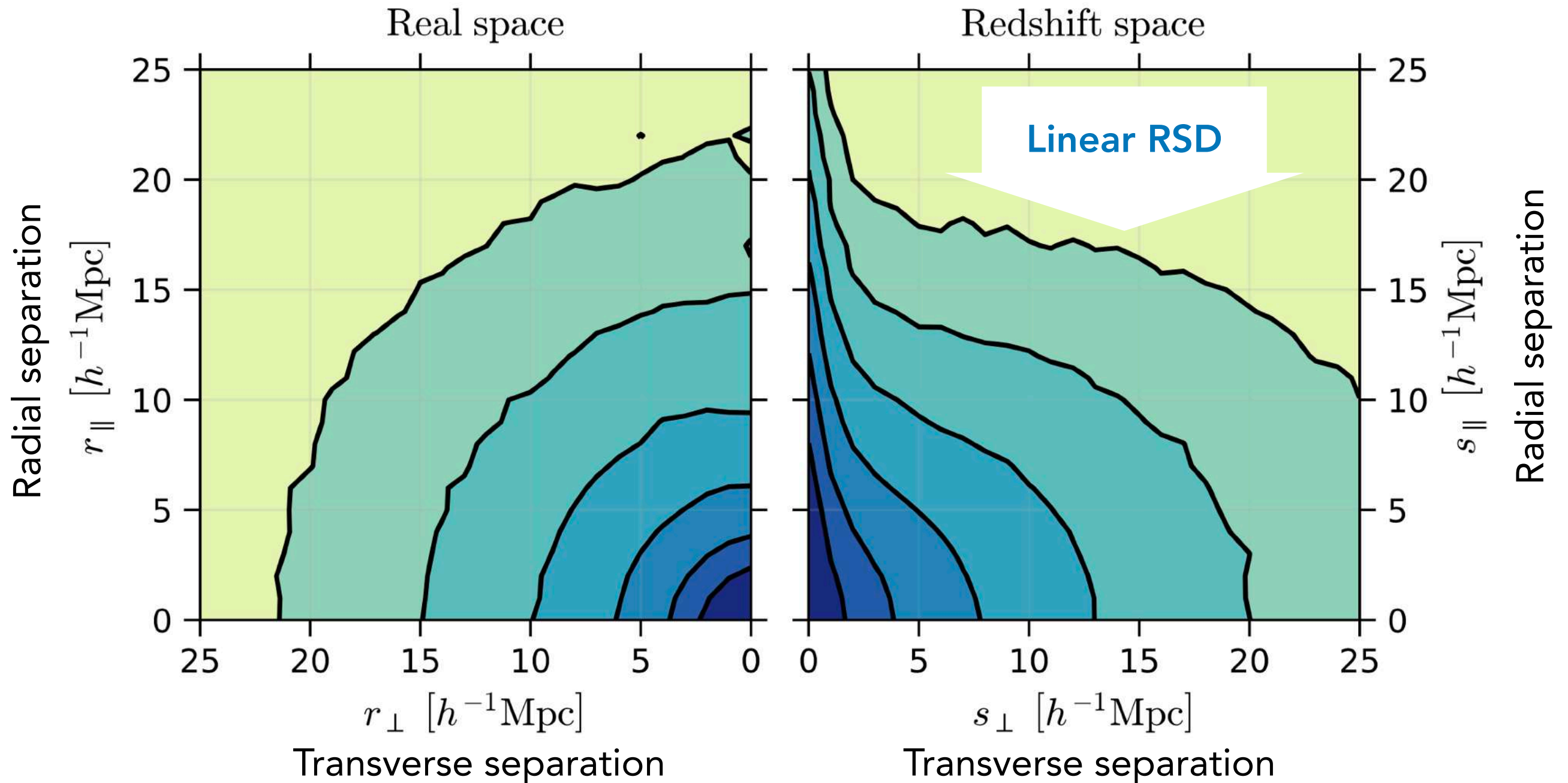


Simulation by [Kuruvilla & Porciani 2018](#)



# Redshift-space distortions (RSD)

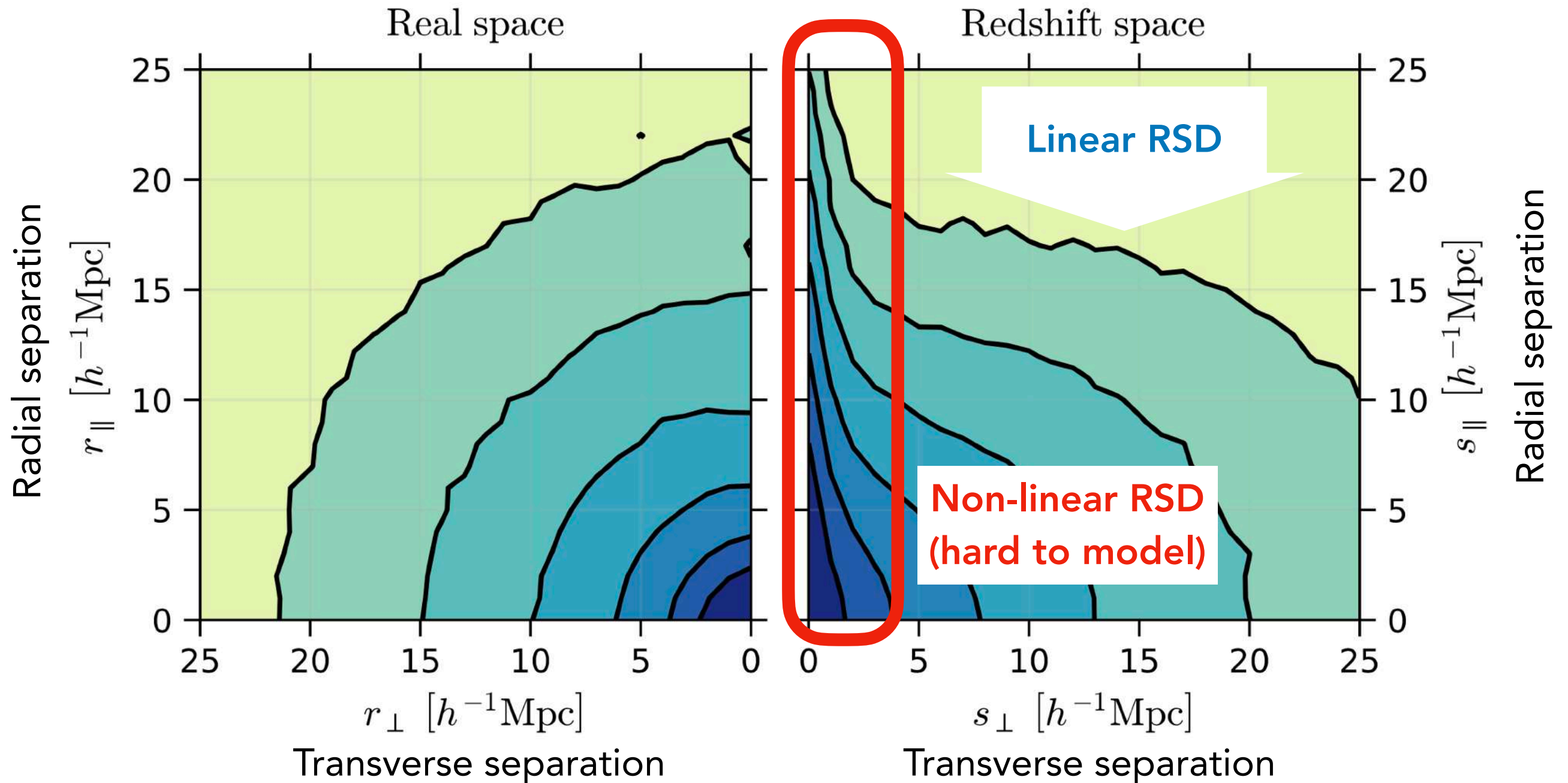
Correlation function  $\xi(\vec{r}) \equiv \langle \delta(\vec{x})\delta(\vec{x} + \vec{r}) \rangle = \xi(r_{\parallel}, r_{\perp})$



Simulation by [Kuruville & Porciani 2018](#)

# Redshift-space distortions (RSD)

Correlation function  $\xi(\vec{r}) \equiv \langle \delta(\vec{x})\delta(\vec{x} + \vec{r}) \rangle = \xi(r_{\parallel}, r_{\perp})$

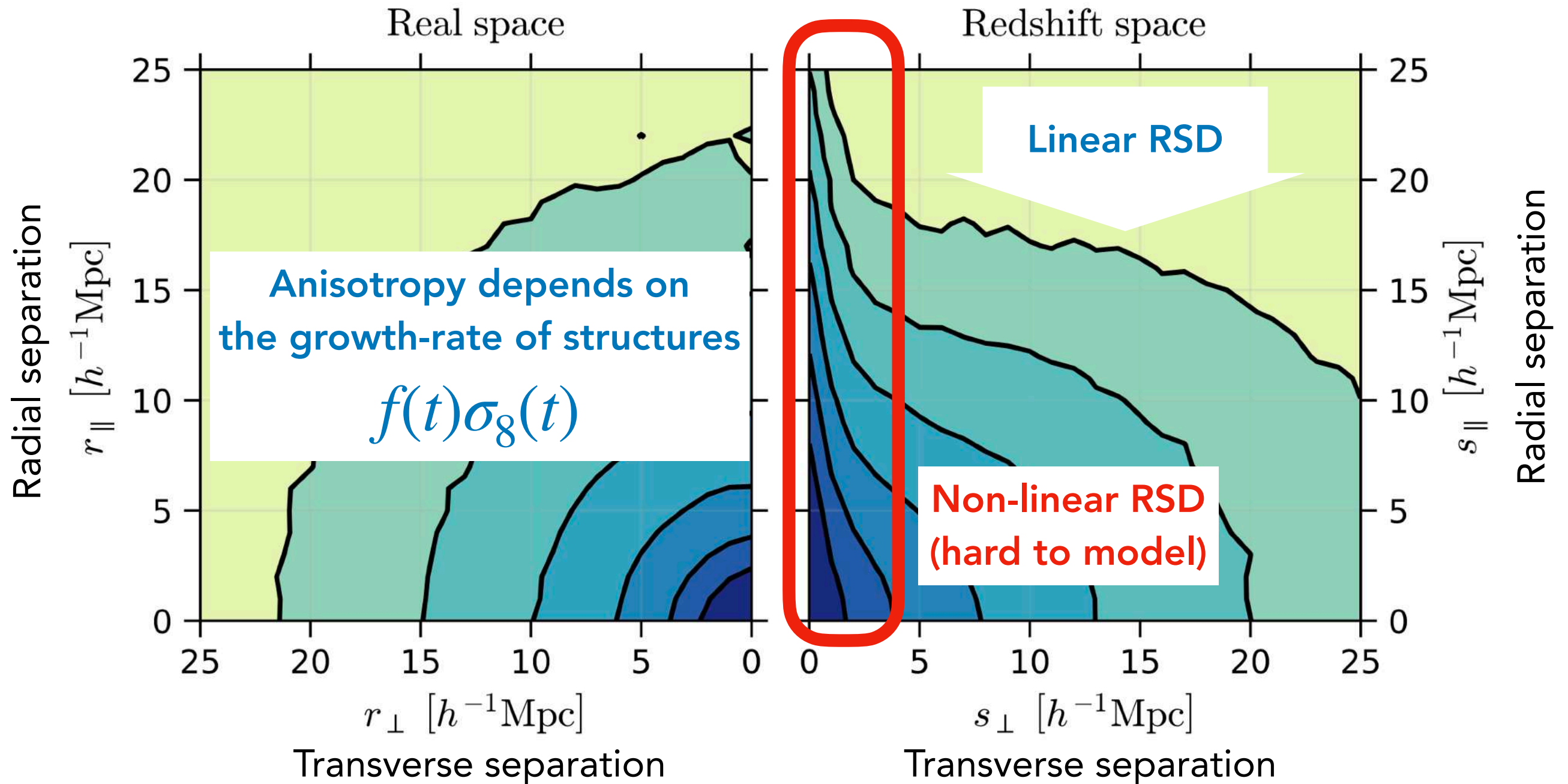


Simulation by [Kuruville & Porciani 2018](#)



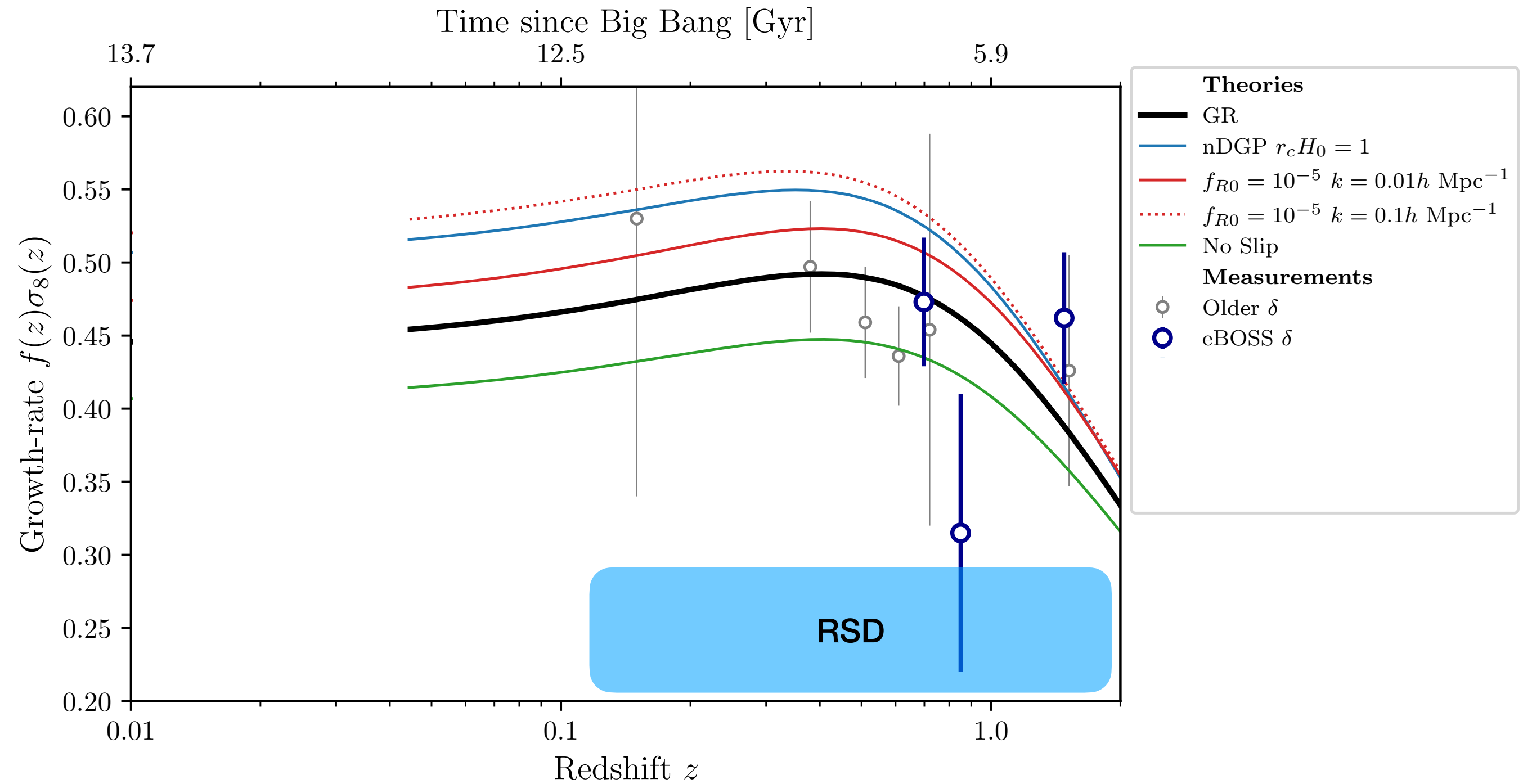
# Redshift-space distortions (RSD)

Correlation function  $\xi(\vec{r}) \equiv \langle \delta(\vec{x})\delta(\vec{x} + \vec{r}) \rangle = \xi(r_{\parallel}, r_{\perp})$



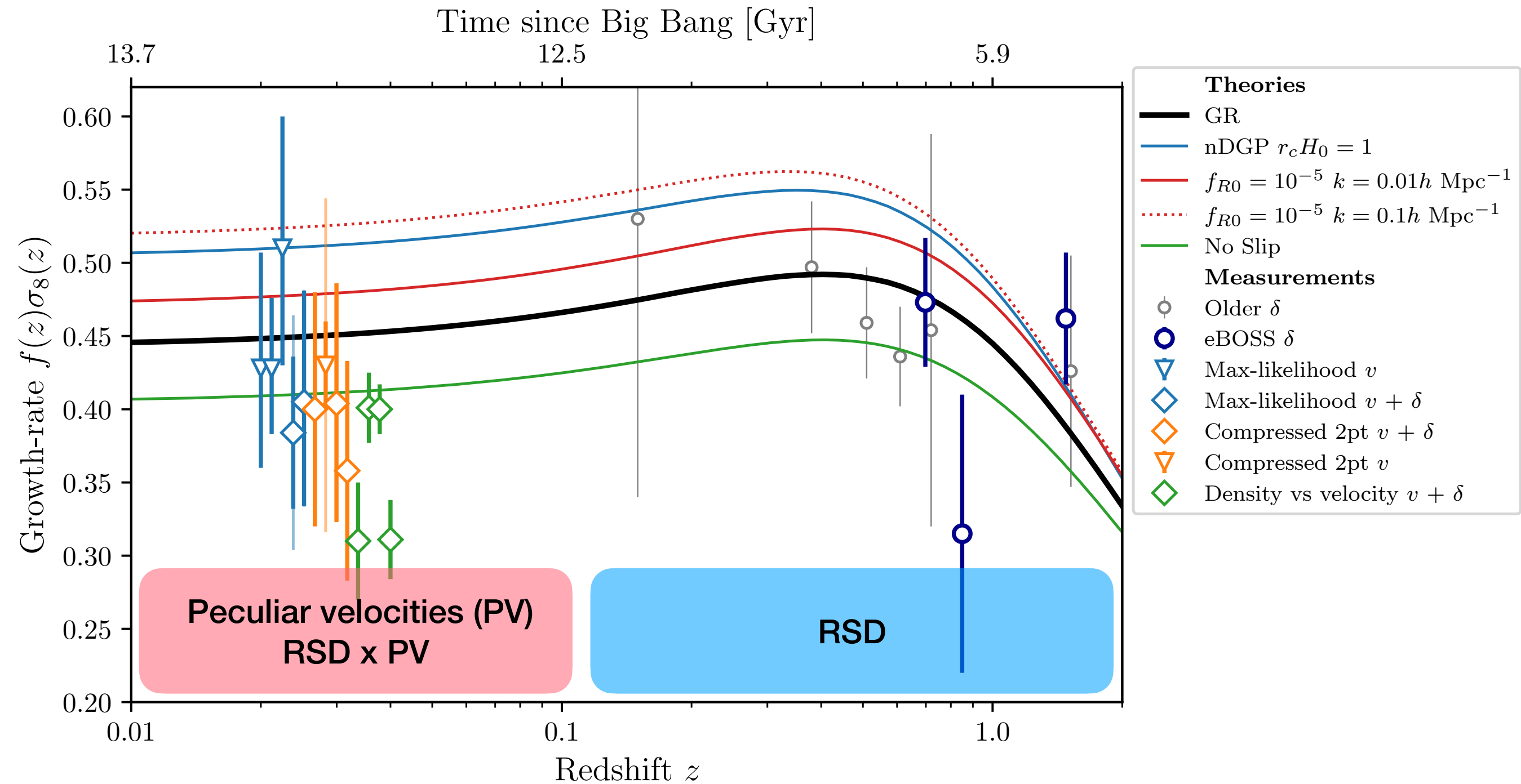
Simulation by [Kuruville & Porciani 2018](#)

# Measurements of growth-rate of structures

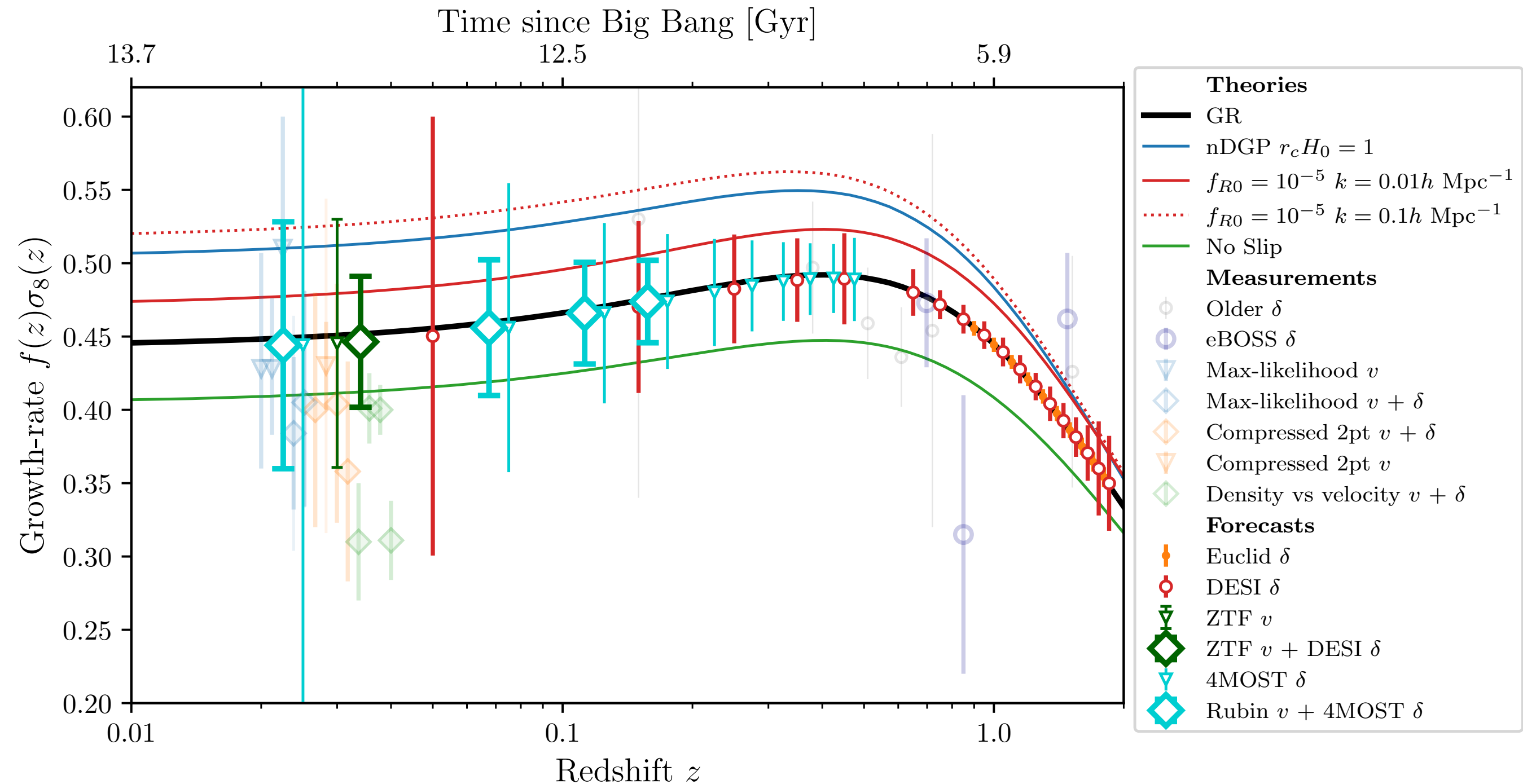




# Measurements of growth-rate of structures




# Measurements of growth-rate of structures



RSD x PV : potential to observe deviations from GR !



A scenic view of a rugged coastline with steep, layered rock cliffs overlooking a deep blue sea under a clear sky. The cliffs are light-colored with distinct horizontal strata. The sea is a deep, clear blue, and the sky is a pale, clear blue. The overall scene is bright and clear.

**How to measure growth-rate with peculiar velocities?**



# Peculiar velocity measurements

Observed redshift is :

$$(1 + z_{\text{obs}}) = (1 + z_{\text{cosmo}})(1 + z_v)$$

Spectroscopic survey

Distance indicator

**Radial peculiar velocity**

**Tully-Fisher**

**Fundamental plane**

**Type-Ia supernova**

# Peculiar velocity measurements

Observed redshift is :

$$(1 + z_{\text{obs}}) = (1 + z_{\text{cosmo}})(1 + z_v)$$

Spectroscopic survey

Distance indicator

**Radial peculiar velocity**

**Tully-Fisher**

**Fundamental plane**

**Type-Ia supernova**

**Intrinsic scatter  
(in distance)**

$$\frac{\sigma_D}{D} \sim 20\%$$

$$\frac{\sigma_D}{D} \sim 20\%$$

$$\frac{\sigma_D}{D} \sim 7\%$$

# Peculiar velocity measurements

Observed redshift is :

$$(1 + z_{\text{obs}}) = (1 + z_{\text{cosmo}})(1 + z_v)$$

Spectroscopic survey

Distance indicator

**Radial peculiar velocity**

**Tully-Fisher**

**Fundamental plane**

**Type-Ia supernova**

**Intrinsic scatter  
(in distance)**

$$\frac{\sigma_D}{D} \sim 20\%$$

$$\frac{\sigma_D}{D} \sim 20\%$$

$$\frac{\sigma_D}{D} \sim 7\%$$

**Future datasets**

**WALLABY** ~ 30k  
**DESI** ~ 53k

**Taipan** ~ 50k  
**DESI** ~ 133k

**ZTF** ~ 5k  
**LSST** ~ 30 to 100 k (?)

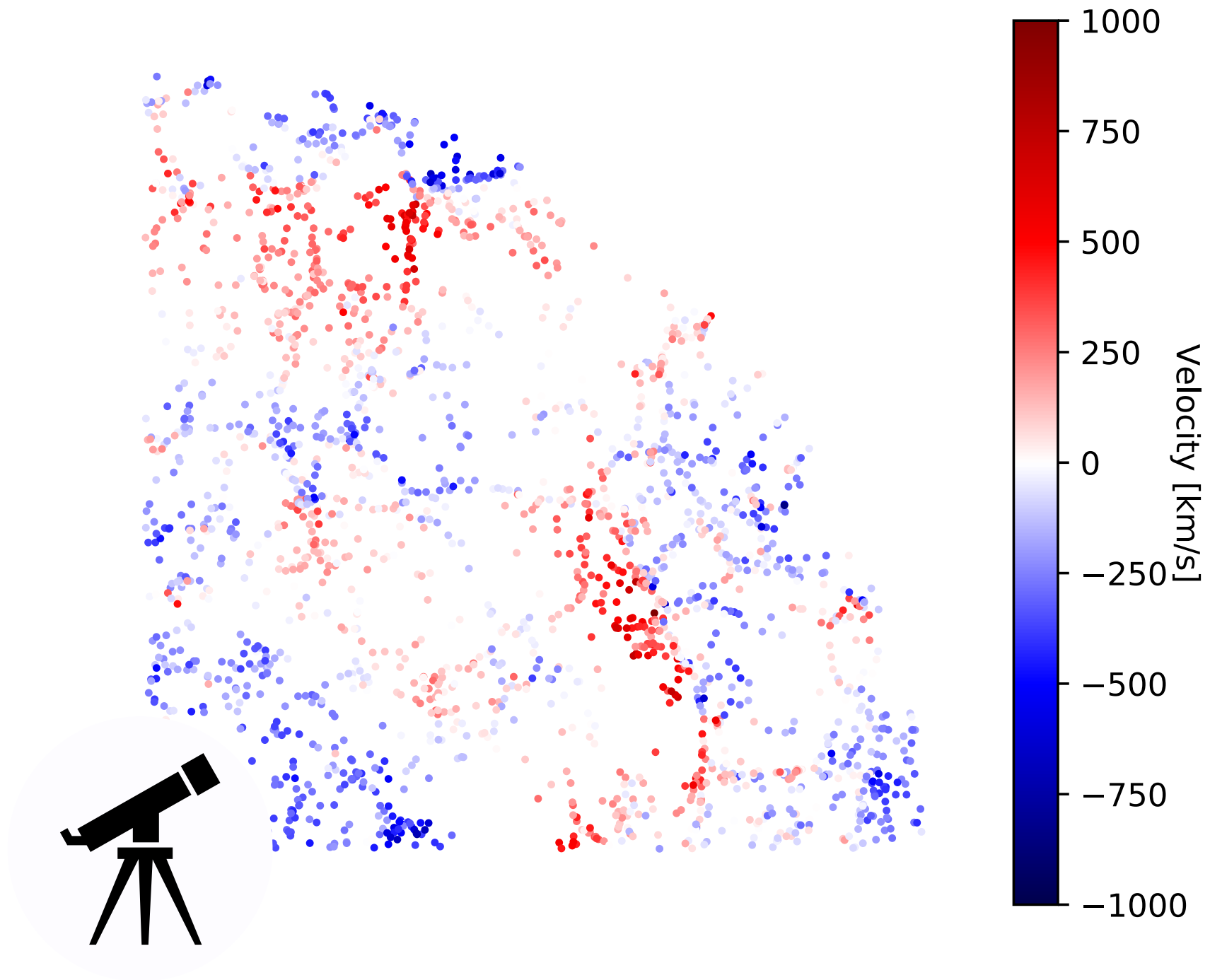


# Observables

Redshift survey  Distorted density field

$RA_i, Dec_i, z_i$

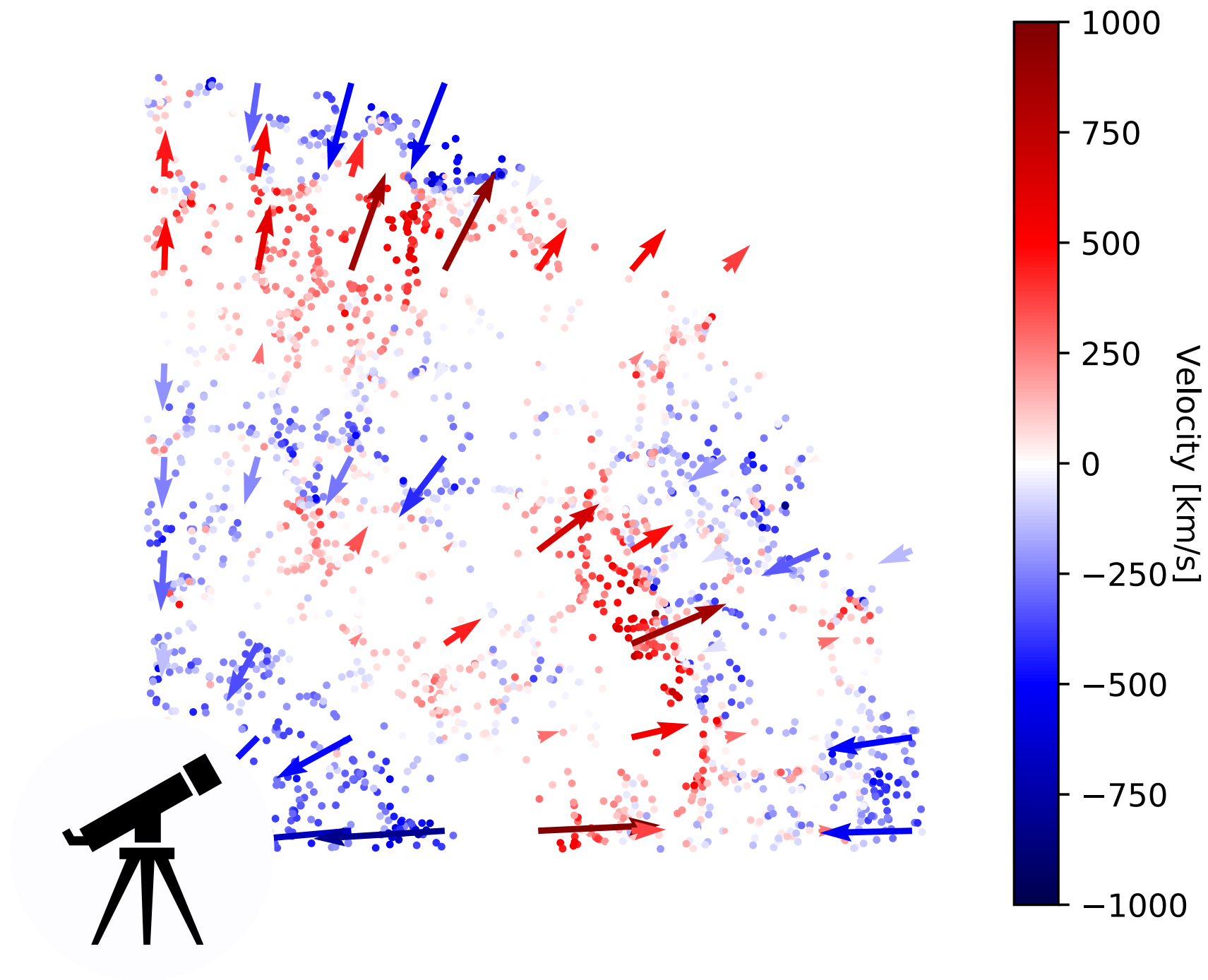
$\delta_g(\vec{s})$



# Observables

Redshift survey  $\rightarrow$  Distorted density field  
 $RA_i, Dec_i, z_i$   $\delta_g(\vec{s})$

Distance survey  $\rightarrow$  Radial velocity field  
 $RA_j, Dec_j, z_j, D_j$   $v_r(\vec{s})$

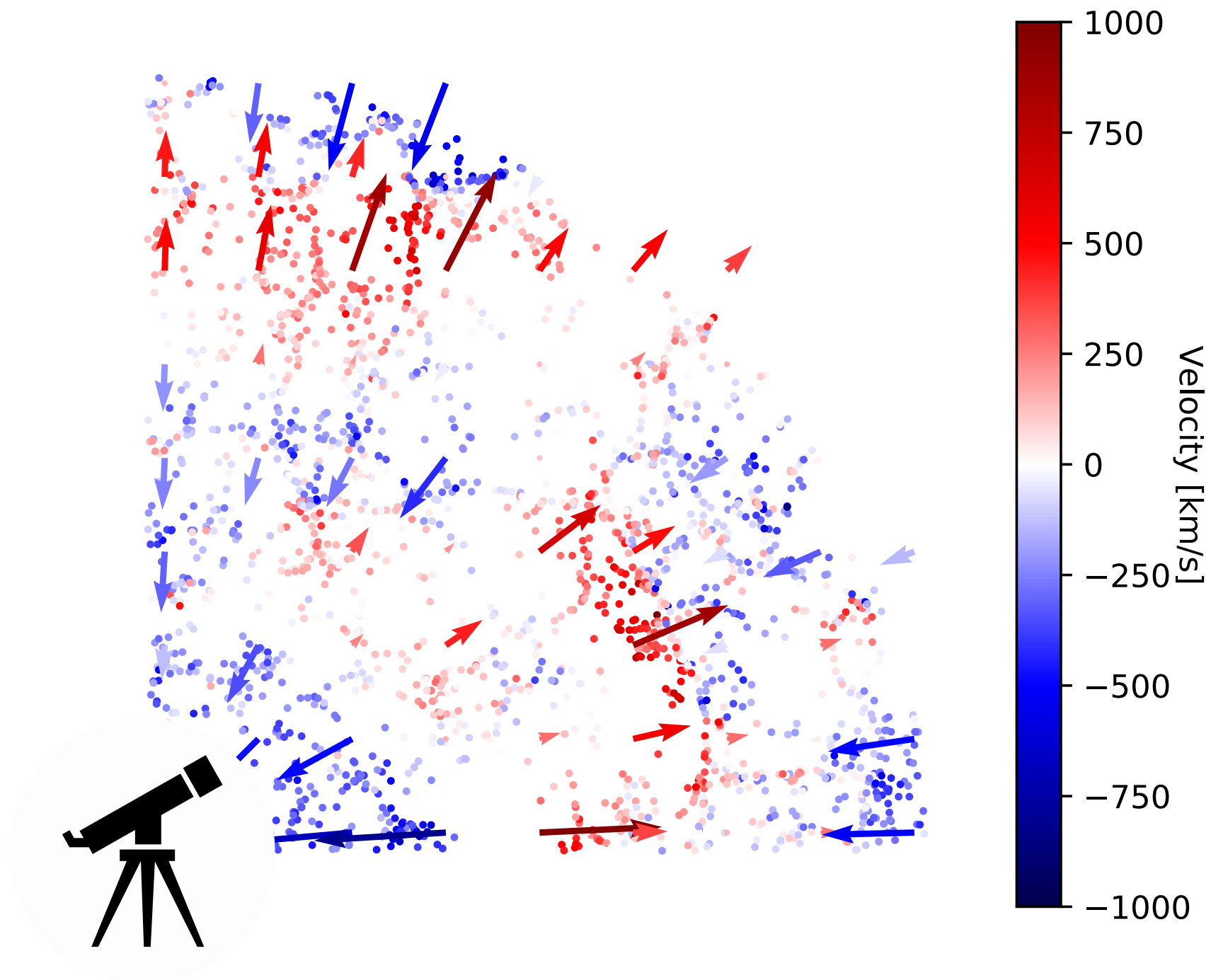




## Observables

Redshift survey  $\rightarrow$  Distorted density field  
 $RA_i, Dec_i, z_i$   $\delta_g(\vec{s})$

Distance survey  $\rightarrow$  Radial velocity field  
 $RA_j, Dec_j, z_j, D_j$   $v_r(\vec{s})$



How to measure peculiar velocities?

# Methods to exploit densities and velocities

	Data vector	Model	References
<b>Maximum likelihood</b>	Uncompressed 2-pt statistics	2-pt statistics	Johnson++ 2014 Howlett++2017 Adams & Blake 2017/2020 Lai, Howlett, Davis 2022 <b>Carreres, JB++2023</b>
<b>2pt functions</b> $\langle \delta_g \delta_g \rangle, \langle \delta_g p_r \rangle, \langle p_r p_r \rangle$	Compressed 2-pt statistics	2-pt statistics	Ferreira++1999 Dupuy++2019 Turner, Blake, Ruggeri 2021 Howlett++2019 Qin++2020
<b>Density-velocity comparison</b>	Velocity field $v_r(\vec{s})$	Reconstruct $v_r(\vec{s})$ from $\delta_g(\vec{s})$	Davis++2011 Springbob++2014 Carrick++2015 Boruah++2020 Said++2020
<b>Forward-modelling</b>	Both fields $\delta_g(\vec{s}), v_r(\vec{s})$	Evolution from initial conditions	Graziani++2019 Boruah, Hudson, Lavaux 2020

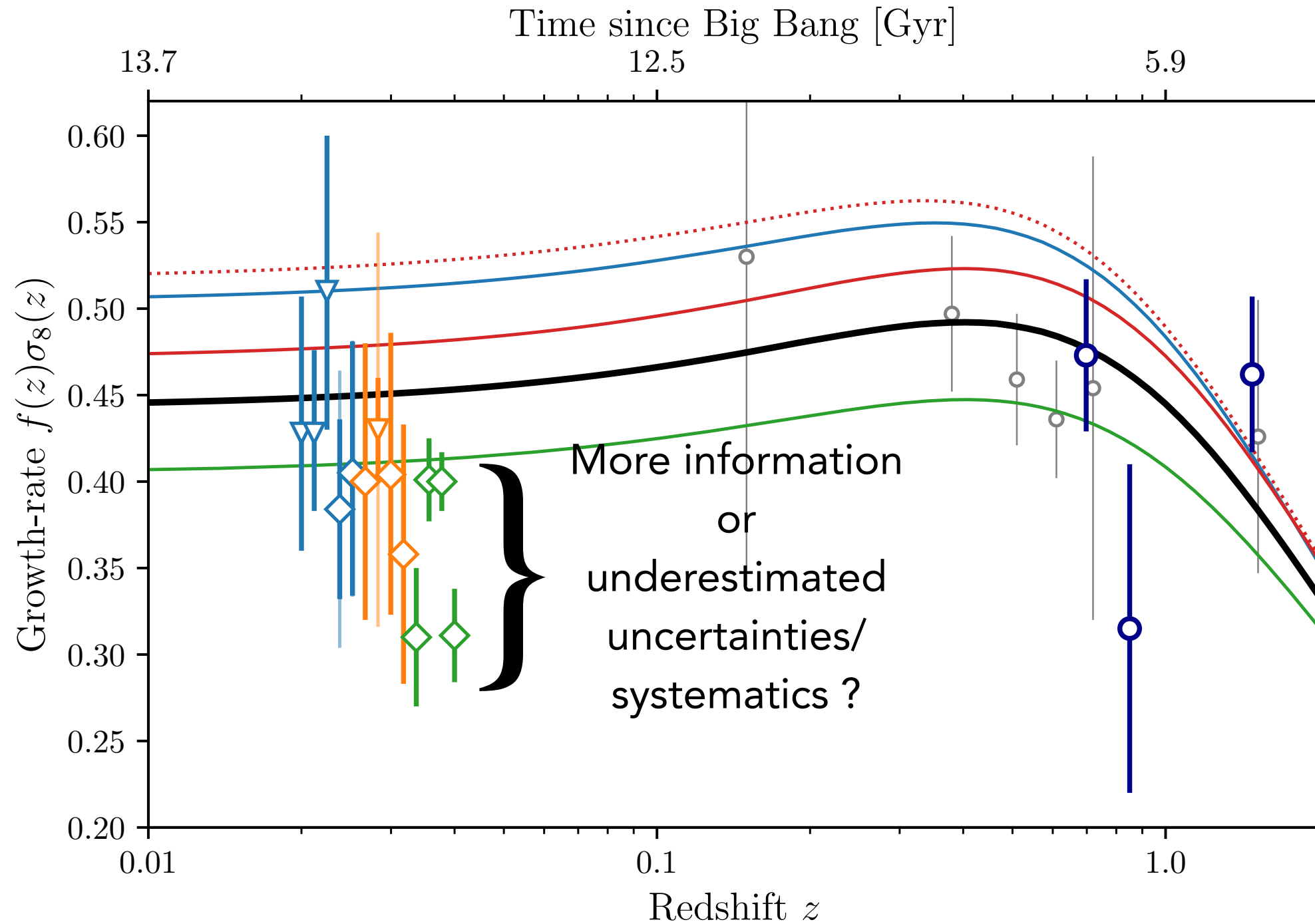


# Methods to exploit densities and velocities

Maximum likelihood

2pt functions

Density-velocity  
comparison





What data DESI and ZTF are providing us?

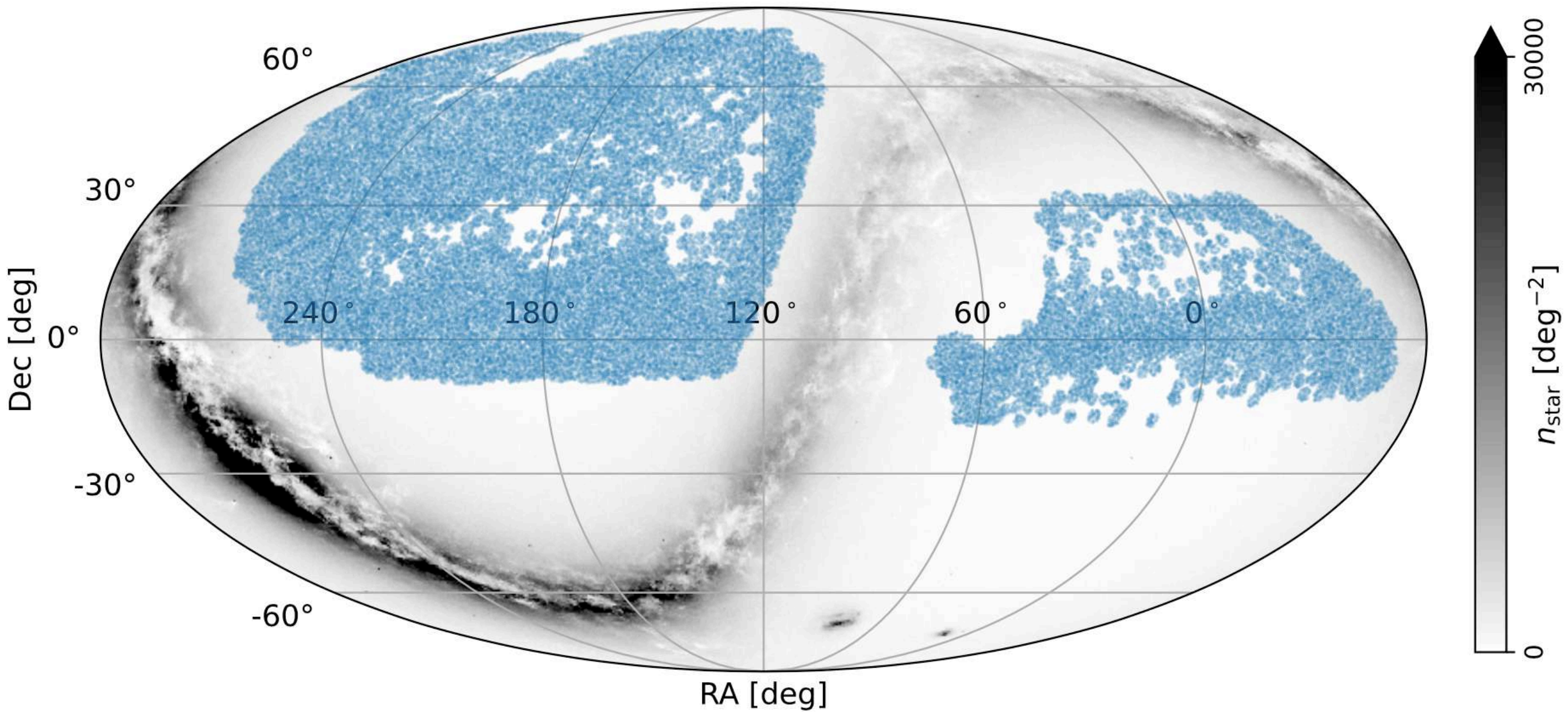






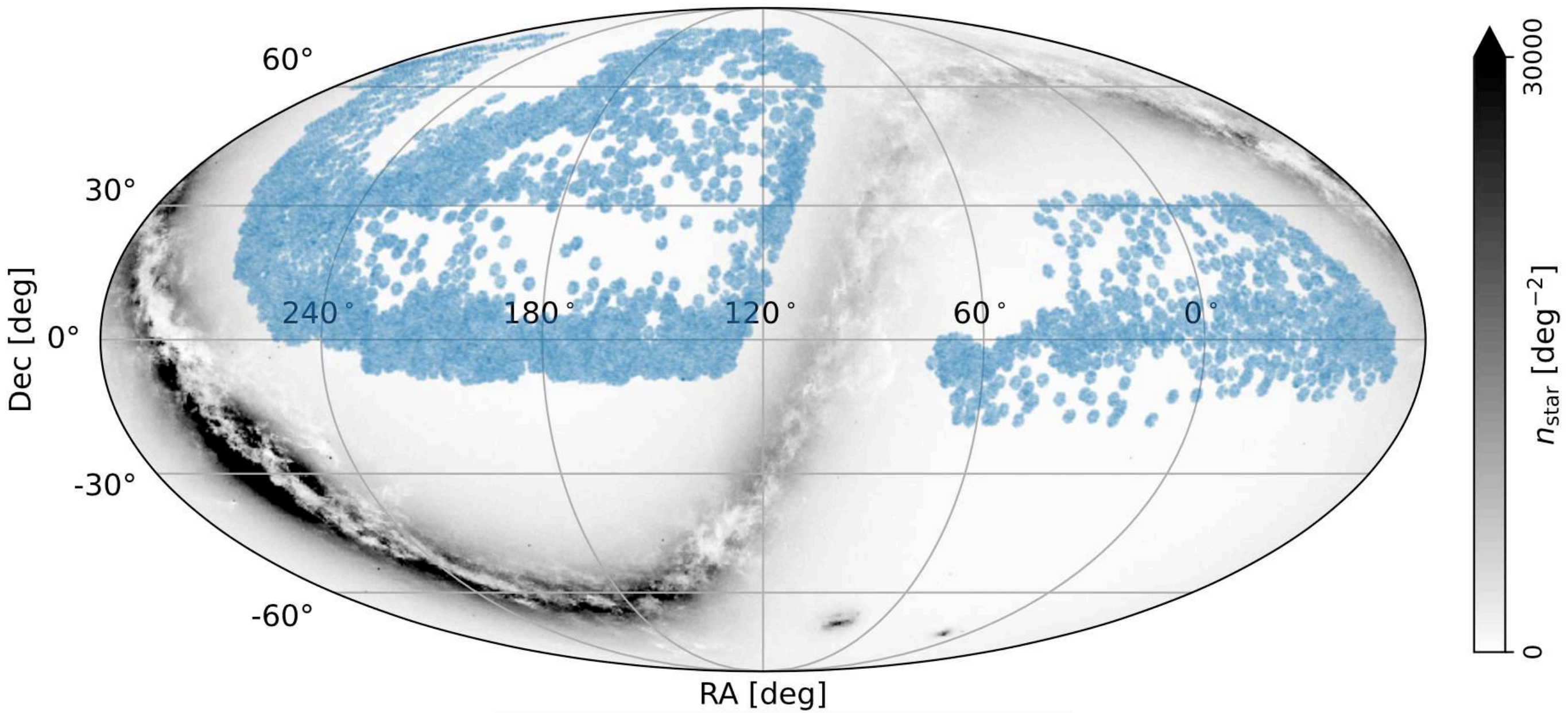
# DESI Bright-time Survey - Today

59% complete





# DESI Year 1 Sample

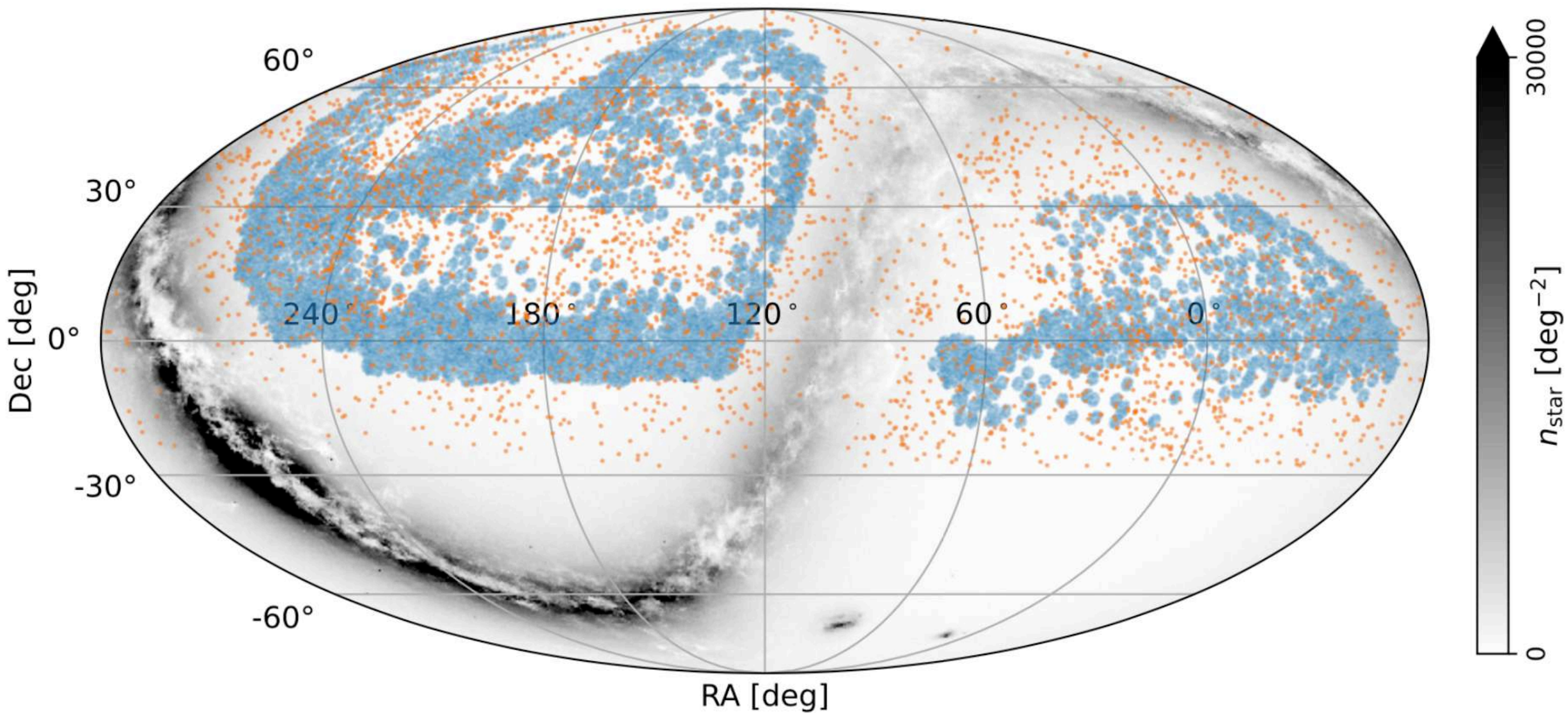


BAO results published  
Public data release end of 2024



DESI Year 1 Sample

ZTF DR2

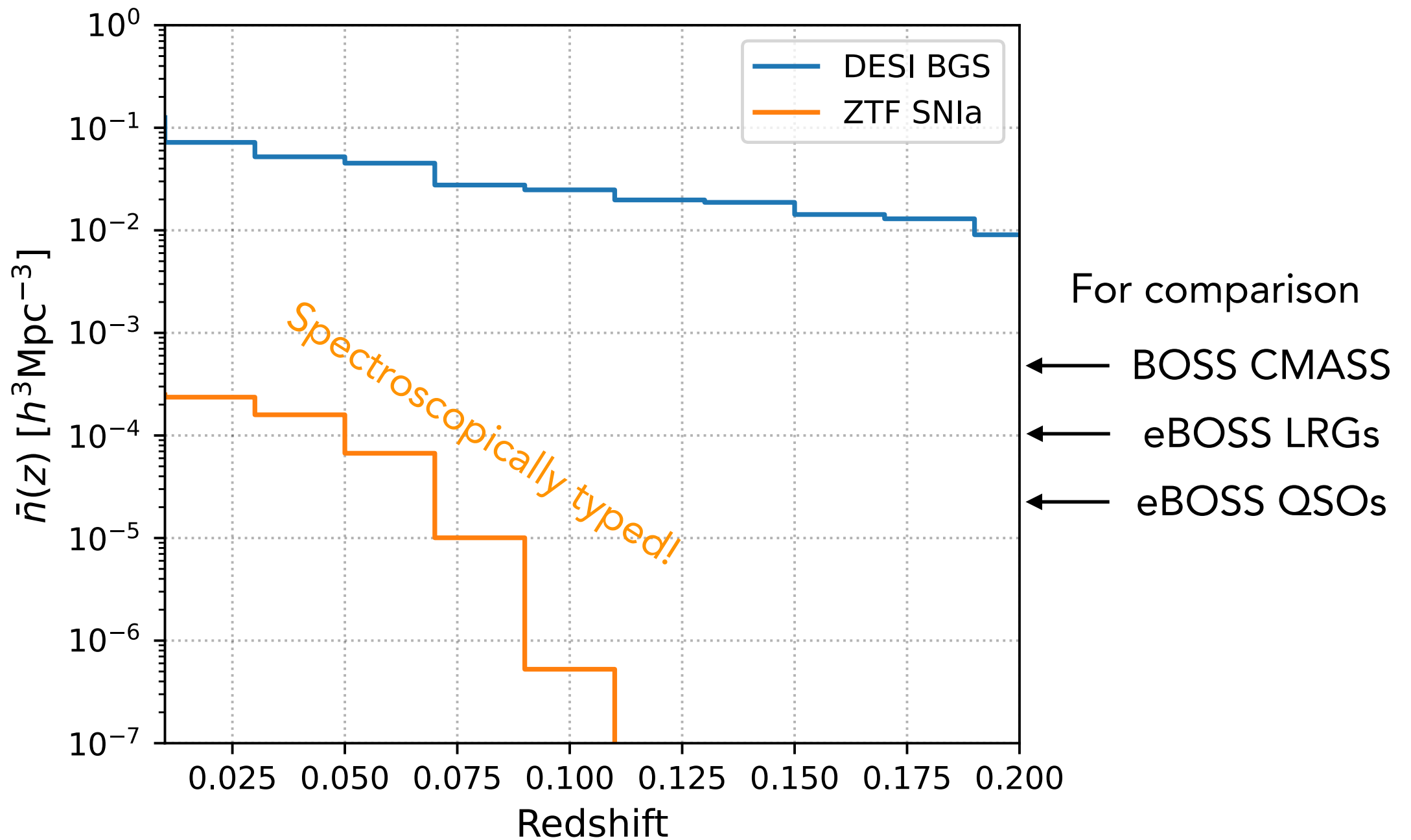


BAO results published  
Public data release end of 2024

Several publications under peer-review

# Redshift distribution

expected at the end of both programs



**Fewer SNIa but very valuable !**



# Growth-rate measurement with type-Ia supernovae using ZTF survey simulations

Bastien Carreres<sup>ID,1,\*</sup>, Julian E. Bautista<sup>ID,1</sup>, Fabrice Feinstein<sup>1</sup>, Dominique Fouchez<sup>1</sup>, Benjamin Racine<sup>ID,1</sup>, Mathew Smith<sup>2</sup>, Mellissa Amenouche<sup>3</sup>, Marie Aubert<sup>3</sup>, Suhail Dhawan<sup>4</sup>, Madeleine Ginolin<sup>2</sup>, Ariel Goobar<sup>5</sup>, Philippe Gris<sup>3</sup>, Leander Lacroix<sup>6</sup>, Eric Nuss<sup>7</sup>, Nicolas Regnault<sup>6</sup>, Mickael Rigault<sup>2</sup>, Estelle Robert<sup>2</sup>, Philippe Rosnet<sup>3</sup>, Kelian Sommer<sup>7</sup>, Richard Dekany<sup>8</sup>, Steven L. Groom<sup>ID,9</sup>, Niharika Sravan<sup>8</sup>, Frank J. Masci<sup>ID,9</sup>, and Josiah Purdum<sup>ID,9</sup>

<https://arxiv.org/abs/2303.01198>



A scenic view of a rugged coastline with steep, light-colored rock cliffs overlooking a deep blue sea under a clear sky. The text "ZTF simulations of supernovae" is overlaid in the center of the image.

**ZTF simulations of supernovae**

# Creating ZTF simulations of type-Ia SN with peculiar velocities

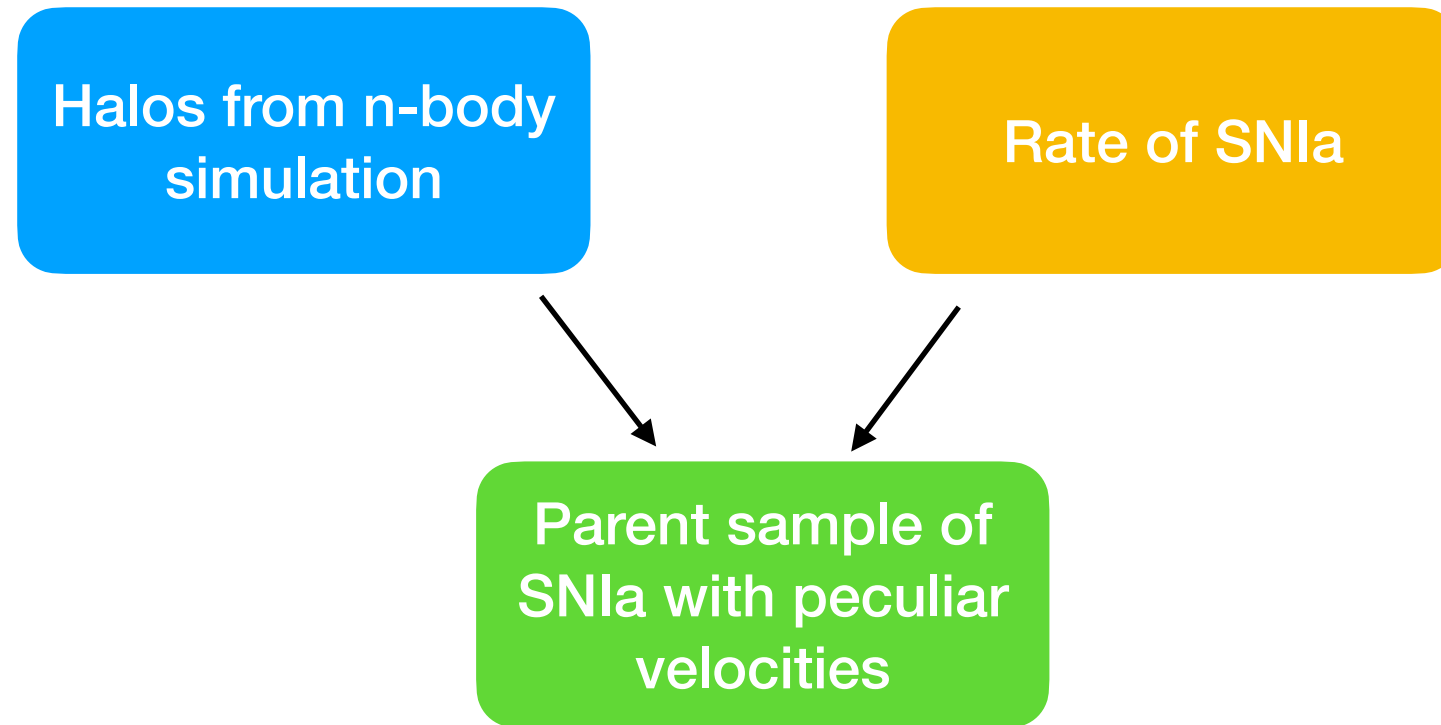
Halos from n-body  
simulation

Rate of SNIa

Public python package SNSIM  
<https://snsim.readthedocs.io>

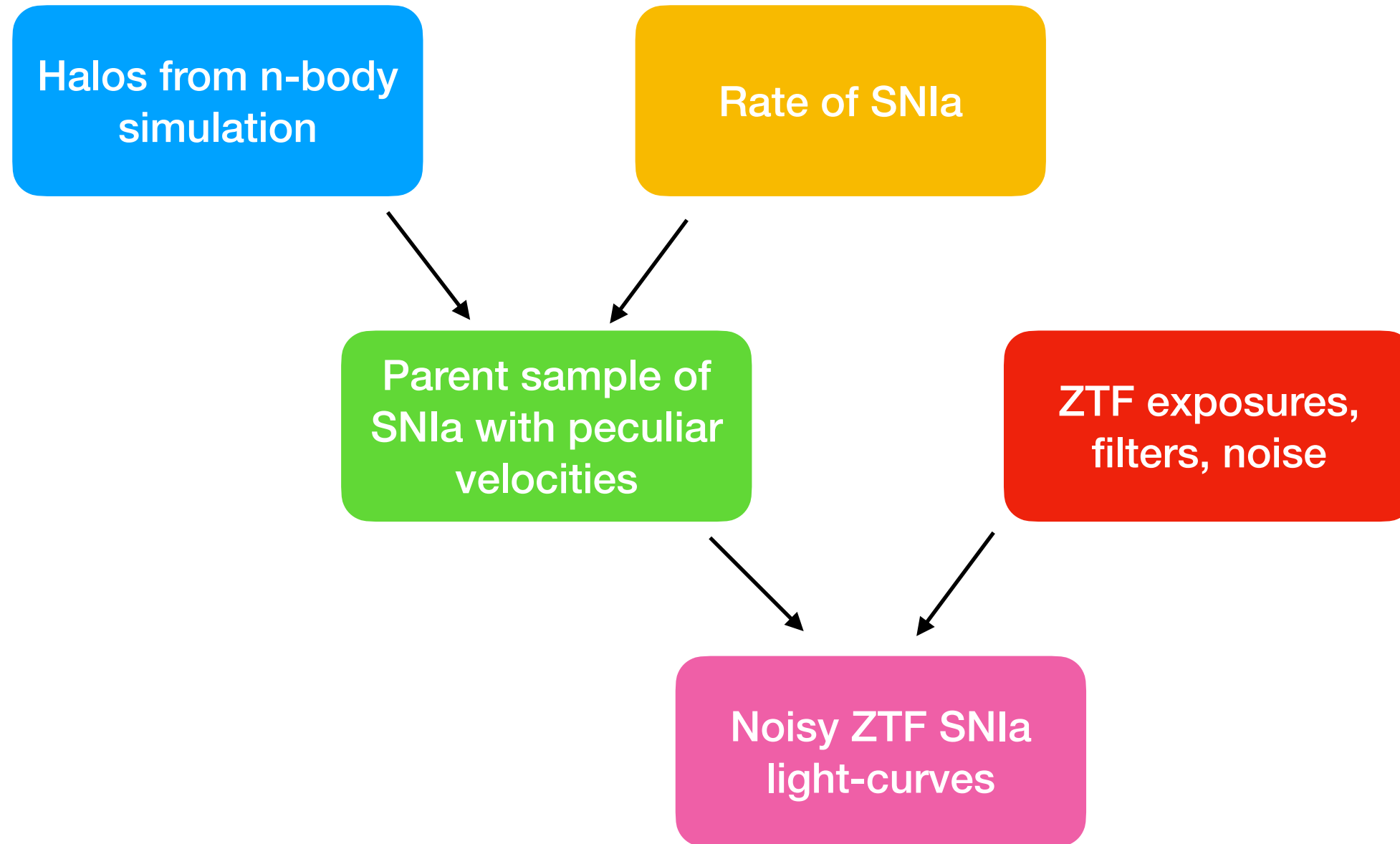


# Creating ZTF simulations of type-Ia SN with peculiar velocities



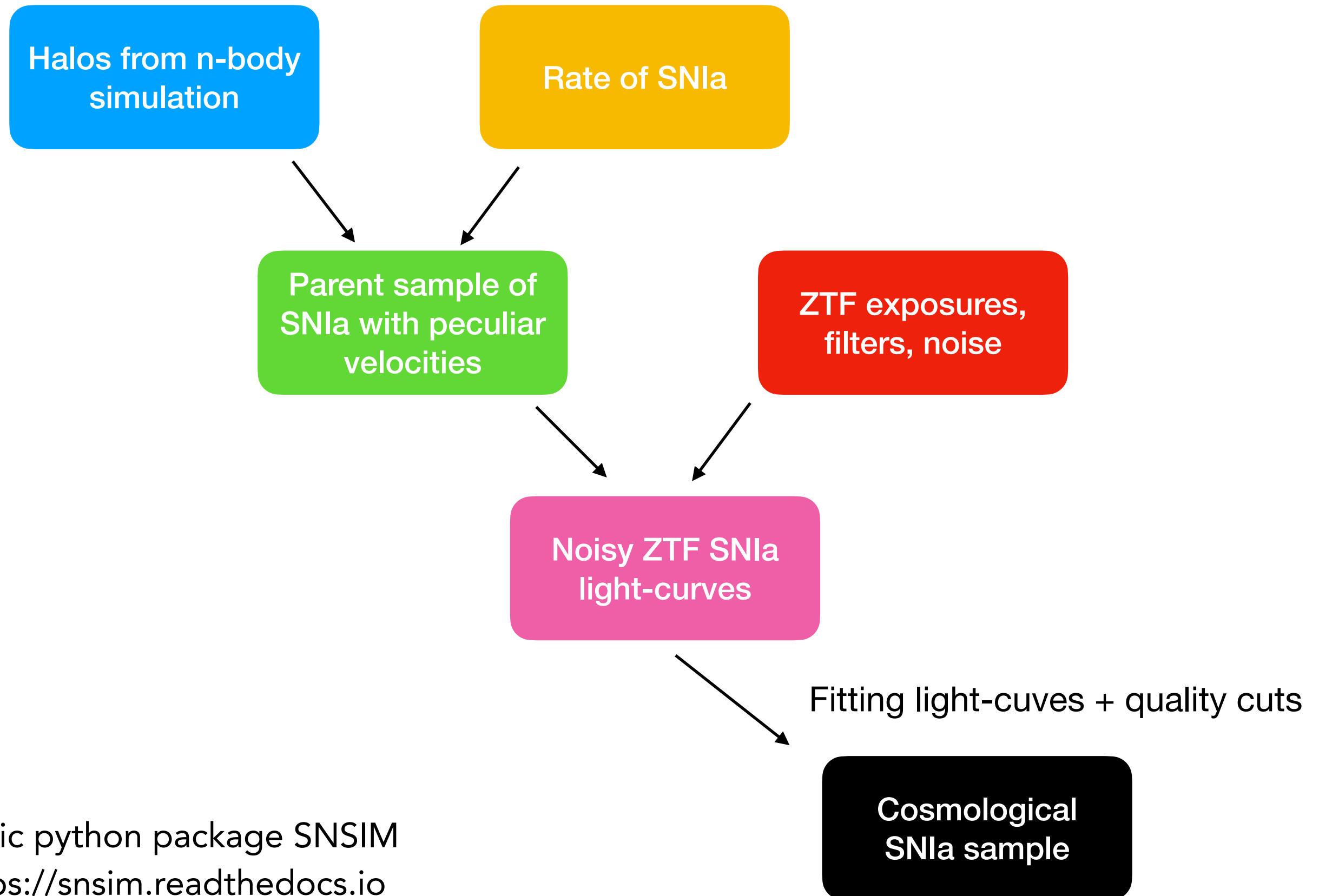
Public python package SNSIM  
<https://snsim.readthedocs.io>

# Creating ZTF simulations of type-Ia SN with peculiar velocities



Public python package SNSIM  
<https://snsim.readthedocs.io>

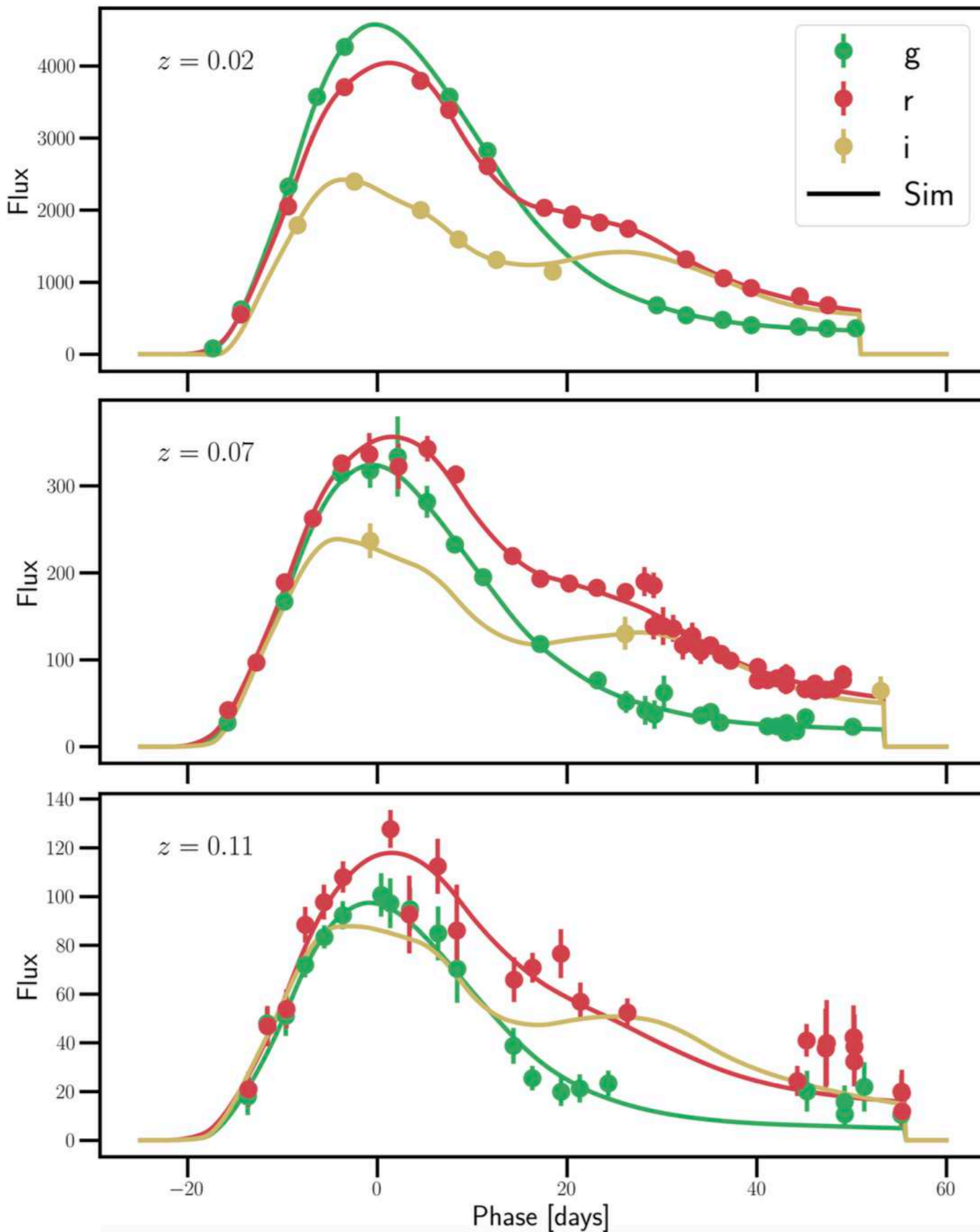
# Creating ZTF simulations of type-Ia SN with peculiar velocities



Public python package SNSIM  
<https://snsim.readthedocs.io>

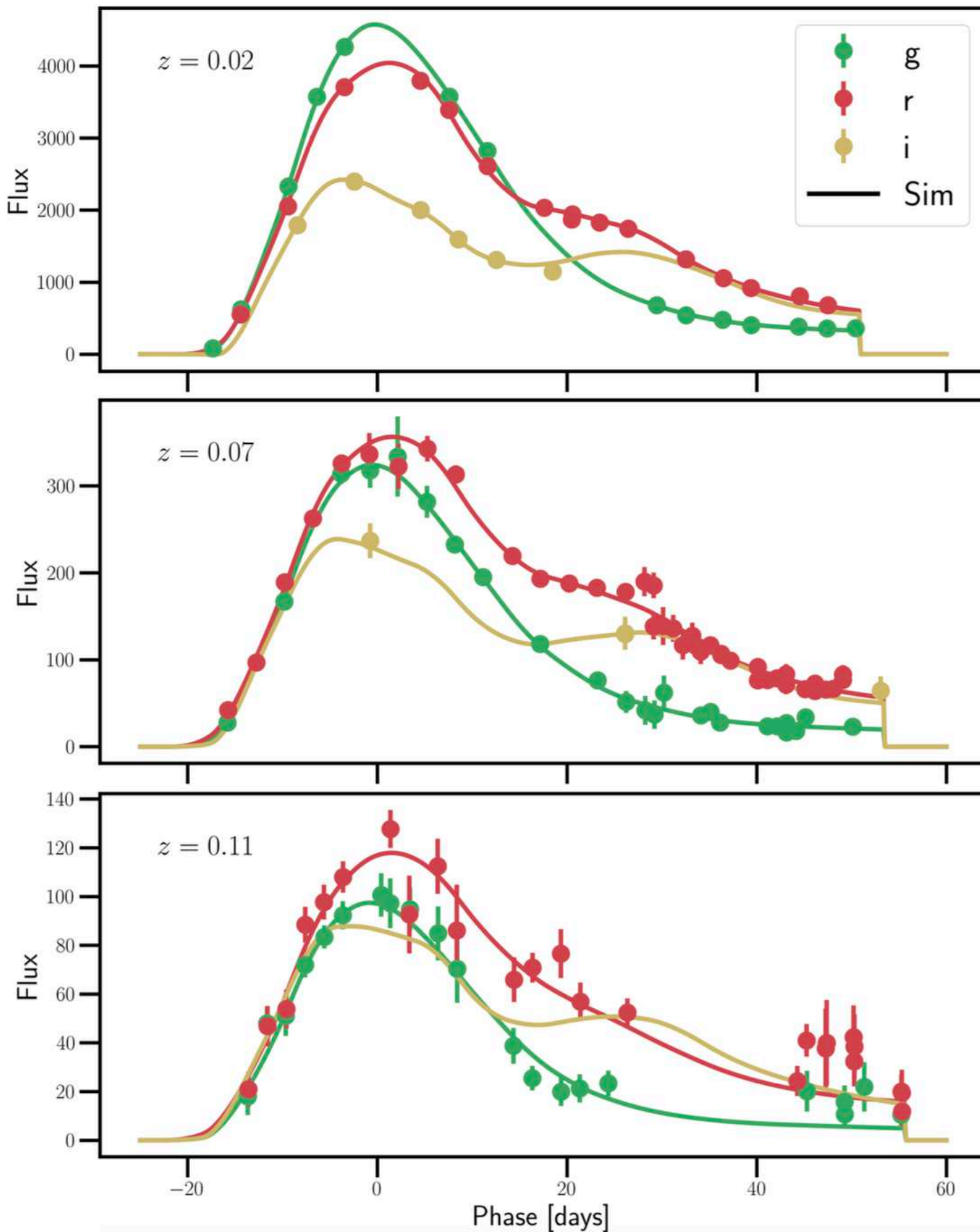


# ZTF SN simulations



- Color distribution: Scolnic & Kessler 2016
- Stretch distribution: Nicolas et al. 2021
- SALT 2 or 3
- Input light-curves by SNCOSMO

# ZTF SN simulations



- Color distribution: Scolnic & Kessler 2016
- Stretch distribution: Nicolas et al. 2021
- SALT 2 or 3
- Input light-curves by SNCOSMO

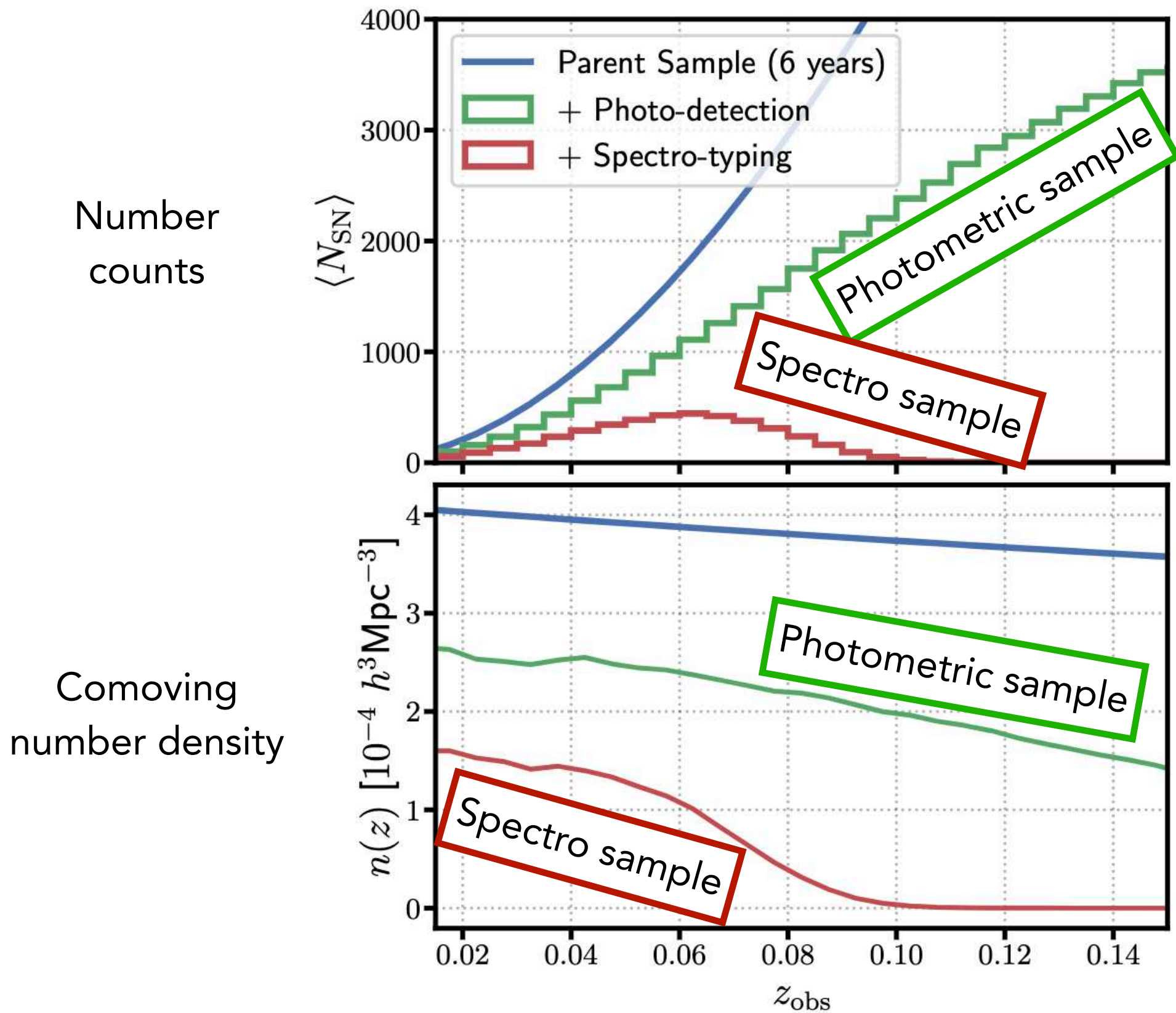
## Two selection effects

Photometric detection ( $r < 20.5$ )

Spectroscopic follow-up  
for typing ( $r < 18.5$ )

# Selection effects

Redshift distribution (mean of 27 mocks)





A scenic view of a rugged coastline. The foreground and middle ground are dominated by steep, light-colored rock cliffs with visible horizontal and vertical geological layering. Sparse green vegetation is scattered across the rocky slopes. The sea is a deep, clear blue, extending to the horizon under a pale, clear sky. The overall atmosphere is bright and clear.

**Measuring peculiar velocities**

## Impact of velocities on Hubble diagram

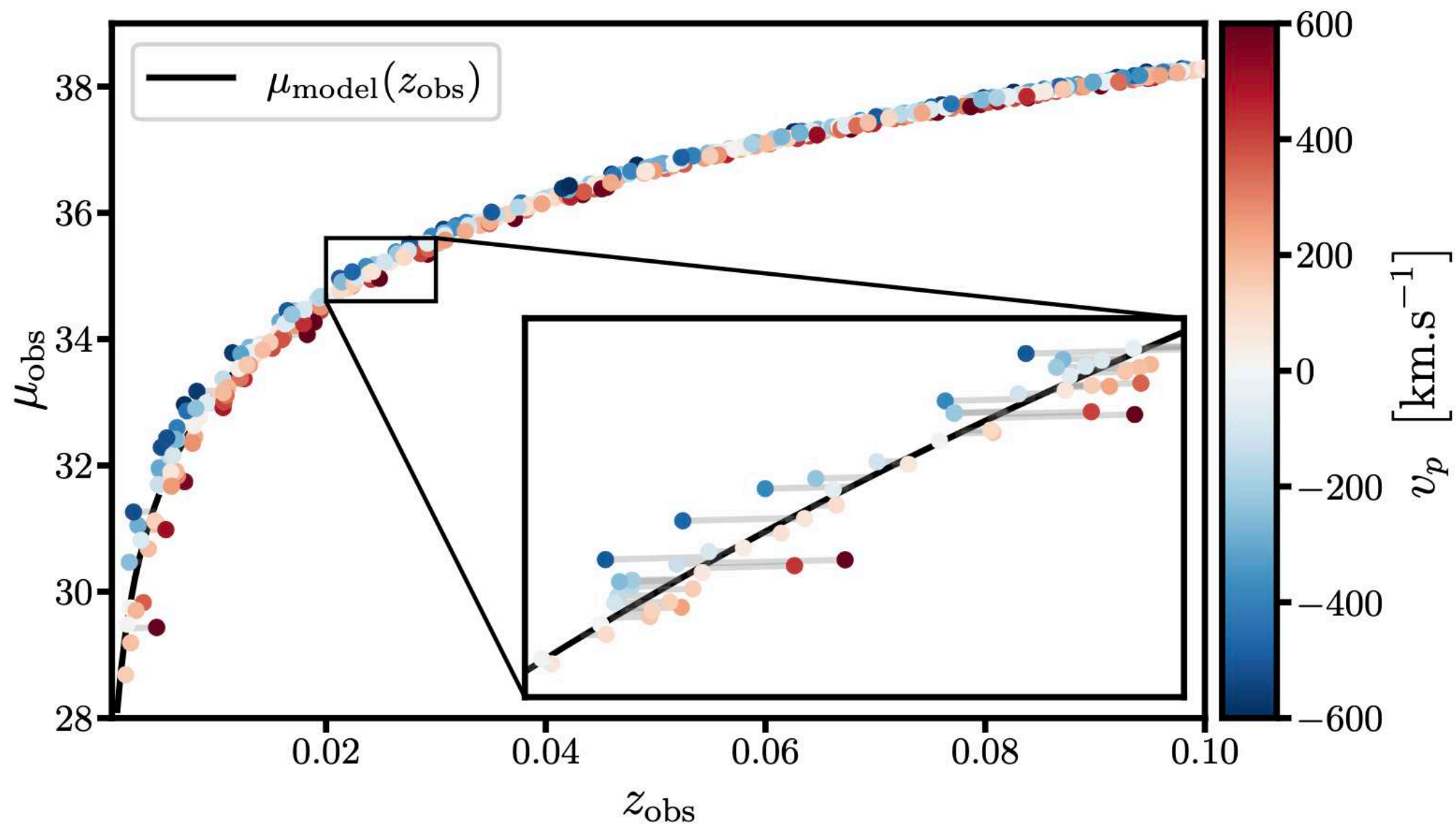
$$\left\{ \begin{array}{l} (1 + z_{\text{obs}}) = (1 + z_{\text{cosmo}})(1 + z_{\text{pec}}) \longrightarrow \text{Dominant effect} \\ \mu_{\text{obs}} = \mu_{\text{cosmo}} + 10 \log_{10}(1 + z_{\text{pec}}) \end{array} \right.$$



## Impact of velocities on Hubble diagram

$$\left\{ \begin{array}{l} (1 + z_{\text{obs}}) = (1 + z_{\text{cosmo}})(1 + z_{\text{pec}}) \longrightarrow \text{Dominant effect} \\ \mu_{\text{obs}} = \mu_{\text{cosmo}} + 10 \log_{10}(1 + z_{\text{pec}}) \end{array} \right.$$

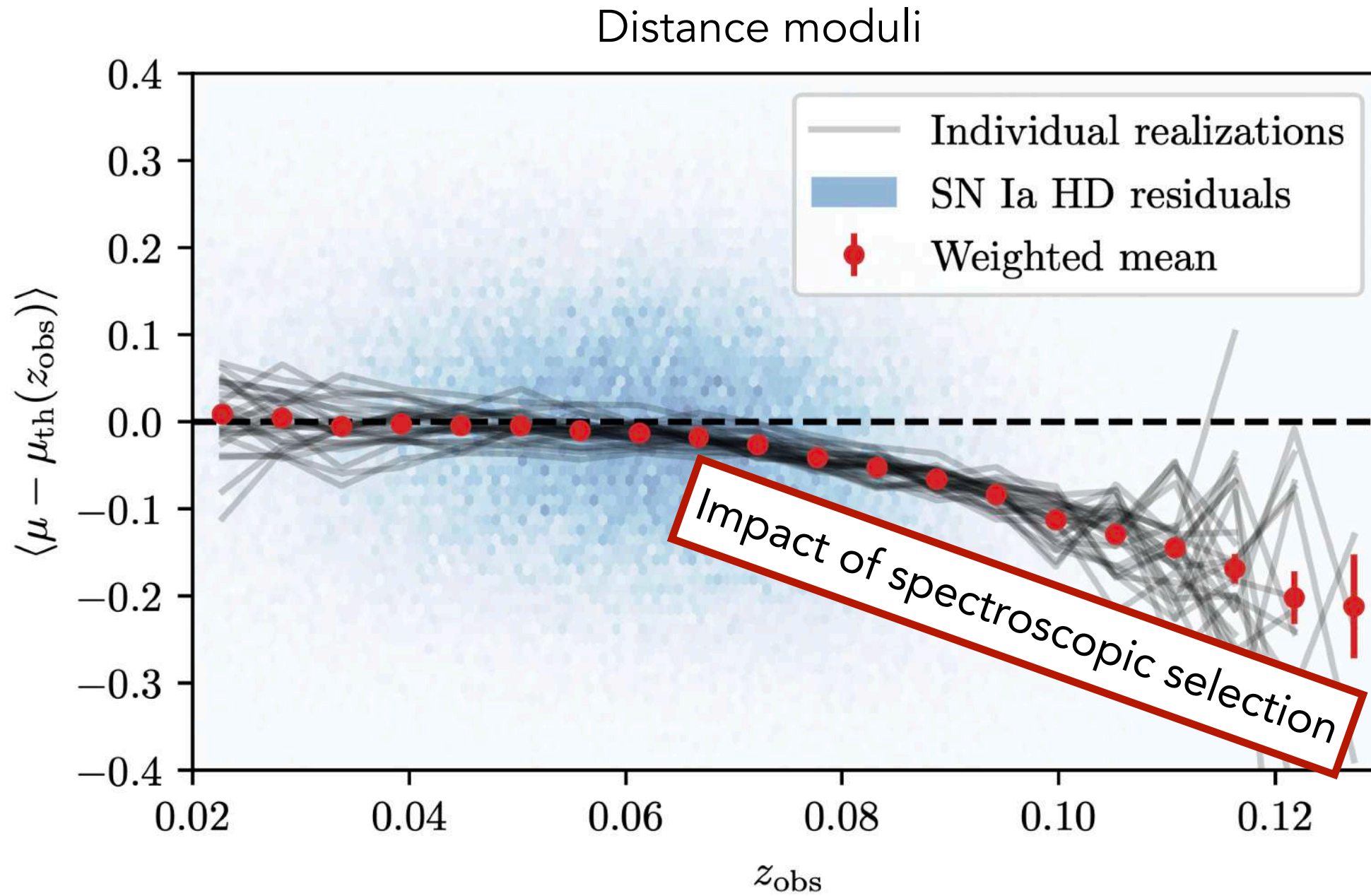
Ideal case without scatter in flux





# Measuring peculiar velocities

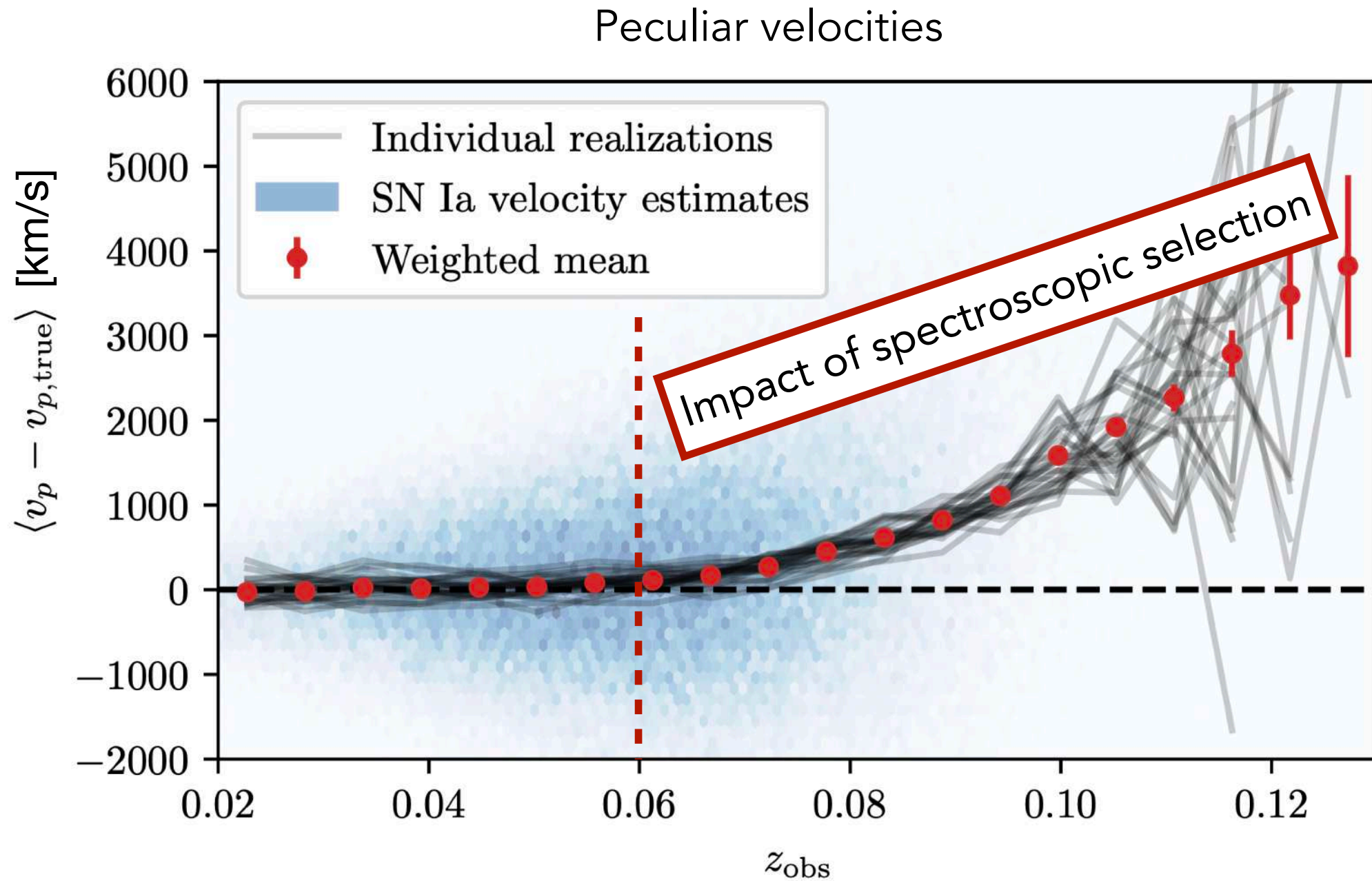
Fit light-curves  $\rightarrow$  Fit Hubble Diagram



What is the bias on velocities and on  $f\sigma_8$  due to selection (Malmquist) bias ?

# Measuring peculiar velocities

Fit light-curves -> Fit Hubble Diagram -> Extract velocities from residuals



**Velocities are biased above  $z \sim 0.06$**

## Measuring $f\sigma_8$

Maximise multi-variate Gaussian likelihood

(Johnson et al. 2014, Huterer et al. 2017, Howlett et al. 2017, Adams & Blake 2020, Lai et al. 2023)

$$\mathcal{L}(\vec{p}) = \frac{1}{(2\pi)^{n/2} [\det C(\vec{p})]^{1/2}} \exp \left[ -\frac{1}{2} v_i C_{ij}^{-1}(\vec{p}) v_j \right]$$



## Measuring $f\sigma_8$

Maximise multi-variate Gaussian likelihood

(Johnson et al. 2014, Huterer et al. 2017, Howlett et al. 2017, Adams & Blake 2020, Lai et al. 2023)

$$\mathcal{L}(\vec{p}) = \frac{1}{(2\pi)^{n/2} [\det C(\vec{p})]^{1/2}} \exp \left[ -\frac{1}{2} v_i C_{ij}^{-1}(\vec{p}) v_j \right]$$

$v_i$  : data-vector of **measured** radial peculiar velocities

## Measuring $f\sigma_8$

Maximise multi-variate Gaussian likelihood

(Johnson et al. 2014, Huterer et al. 2017, Howlett et al. 2017, Adams & Blake 2020, Lai et al. 2023)

$$\mathcal{L}(\vec{p}) = \frac{1}{(2\pi)^{n/2} [\det C(\vec{p})]^{1/2}} \exp \left[ -\frac{1}{2} v_i C_{ij}^{-1}(\vec{p}) v_j \right]$$

$v_i$  : data-vector of **measured** radial peculiar velocities

$C(\vec{p})$  : covariance matrix containing **model** of 2-pt statistics of velocities

$$C_{ij} = \langle v_i(\vec{x}_i) v_j(\vec{x}_j) \rangle$$

## Measuring $f\sigma_8$

Maximise multi-variate Gaussian likelihood

(Johnson et al. 2014, Huterer et al. 2017, Howlett et al. 2017, Adams & Blake 2020, Lai et al. 2023)

$$\mathcal{L}(\vec{p}) = \frac{1}{(2\pi)^{n/2} [\det C(\vec{p})]^{1/2}} \exp \left[ -\frac{1}{2} v_i C_{ij}^{-1}(\vec{p}) v_j \right]$$

$v_i$  : data-vector of **measured** radial peculiar velocities

$C(\vec{p})$  : covariance matrix containing **model** of 2-pt statistics of velocities

$$C_{ij} = \langle v_i(\vec{x}_i) v_j(\vec{x}_j) \rangle$$

$\vec{p}$  : parameters of the model, including  $f\sigma_8$  and nuisance terms

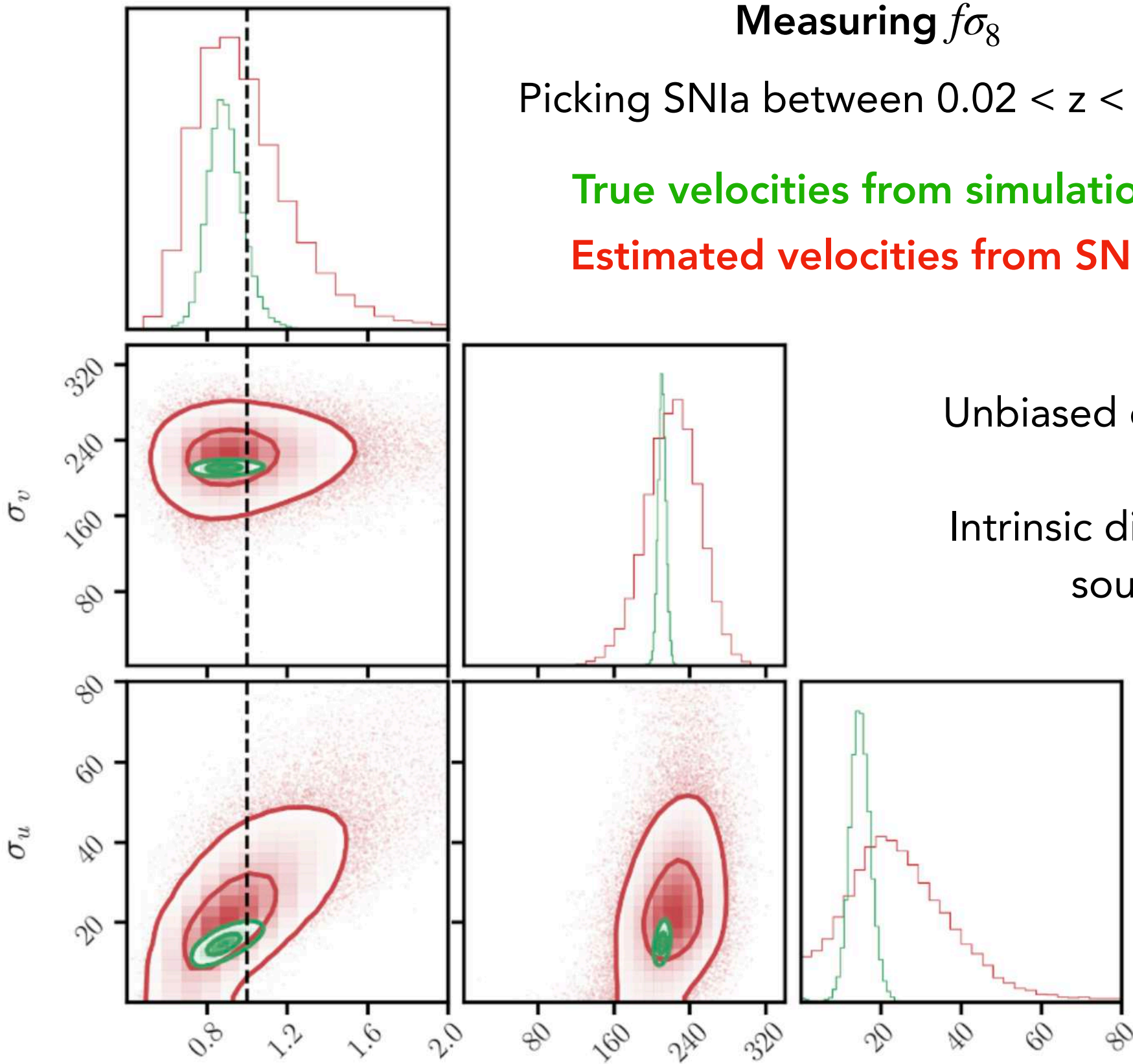


# Measuring $f\sigma_8$

Picking SNIa between  $0.02 < z < 0.06$

True velocities from simulation

Estimated velocities from SNIa



Unbiased constrains for both cases

Intrinsic dispersion of SNIa is main source of uncertainty

Growth-rate  
 $\frac{[f\sigma_8]_{\text{est}}}{[f\sigma_8]_{\text{true}}}$

Velocity dispersion  
 $\sigma_v$  [km/s]

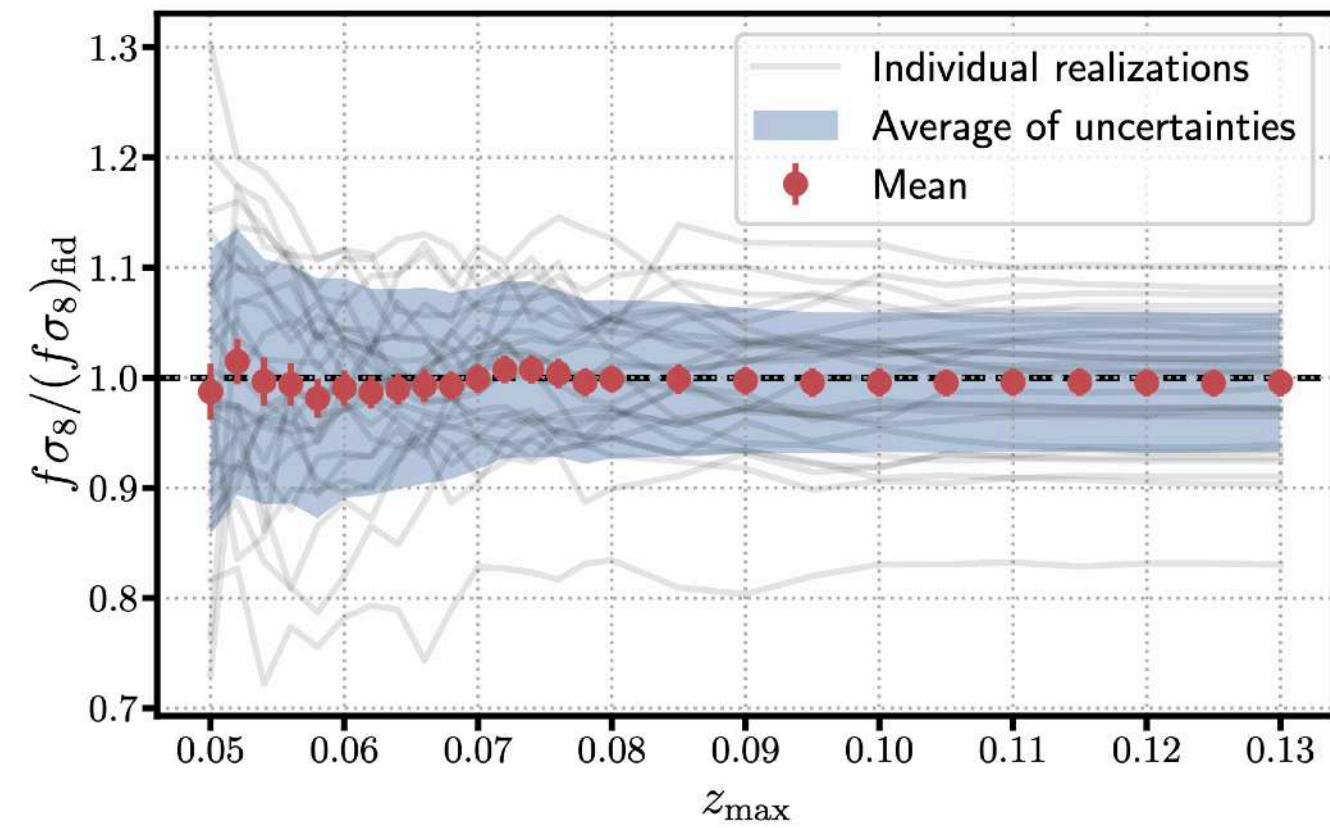
RSD dispersion  
 $\sigma_u$  [Mpc/h]

# Measuring $f\sigma_8$

Picking SNIa between  $0.02 < z < z_{\max}$

27 realisations

Using true velocities from simulation



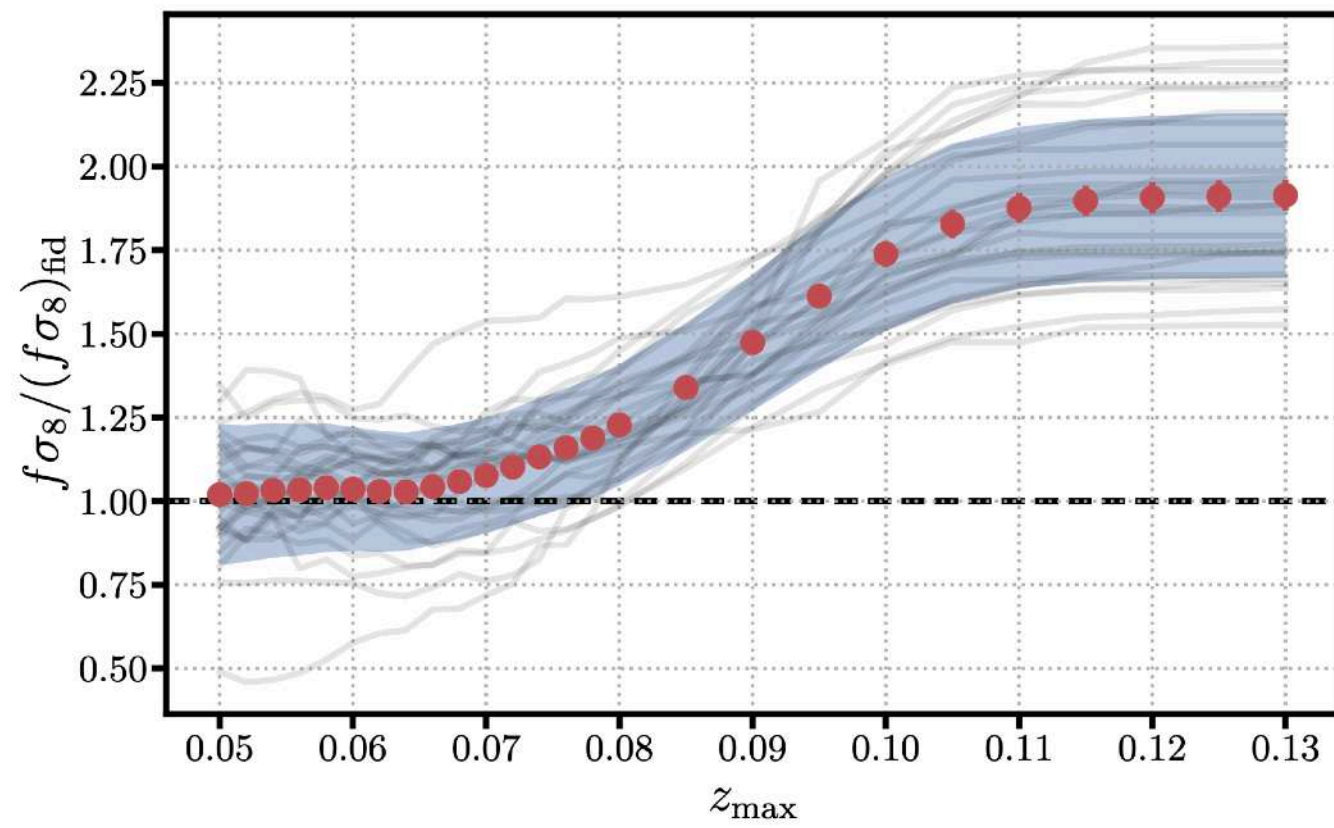
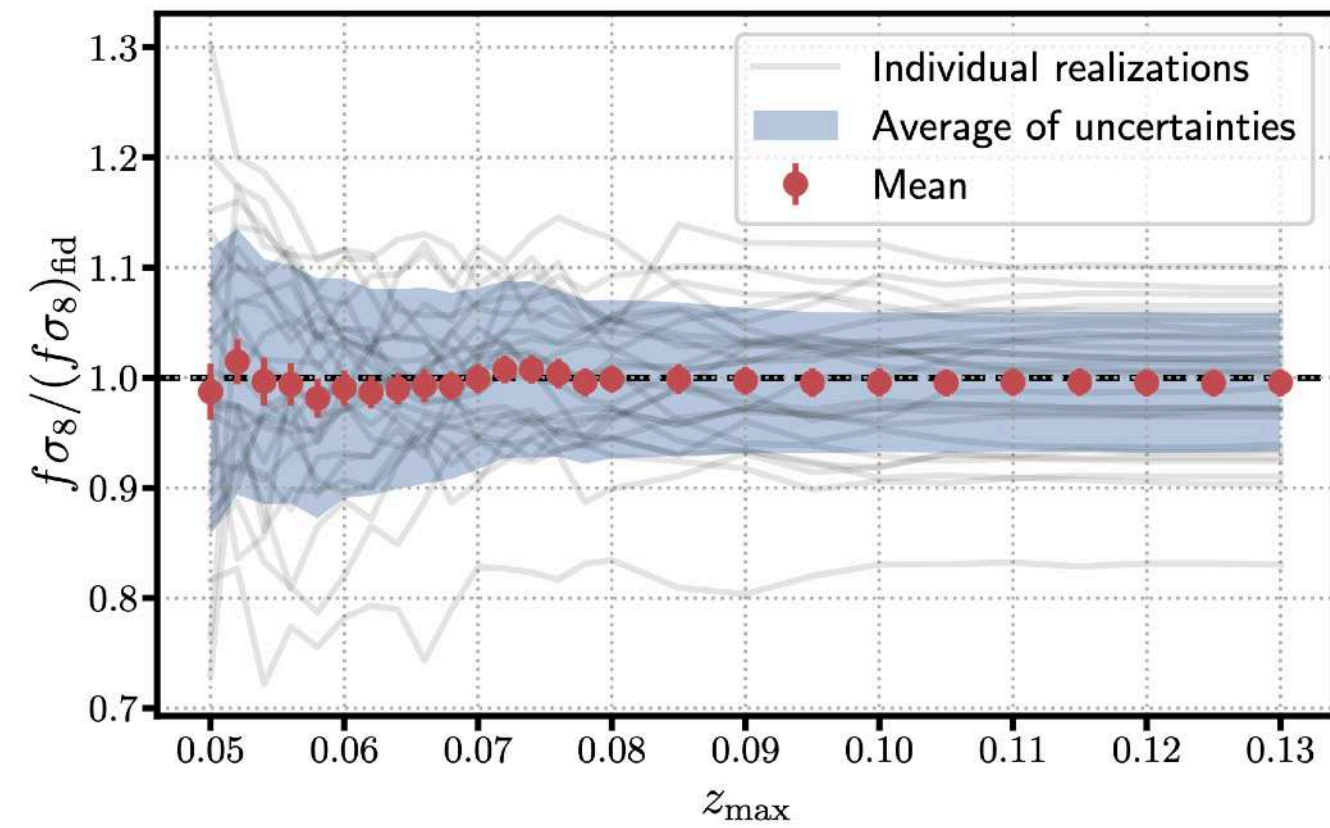
# Measuring $f\sigma_8$

Picking SNIa between  $0.02 < z < z_{\max}$

27 realisations

Using true velocities from simulation

Estimated velocities from simulated SNIa



Selection effects quick in at  $z_{\max} \sim 0.06$



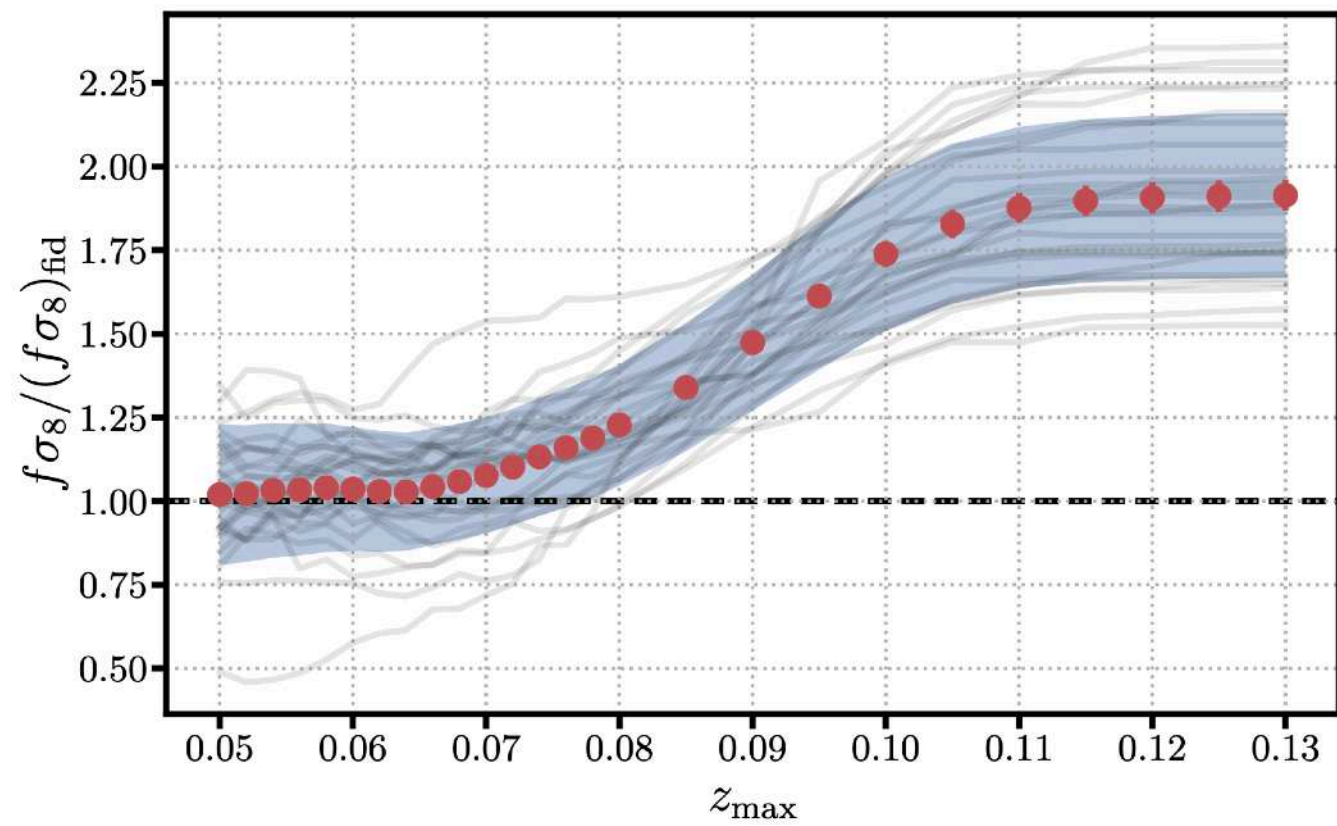
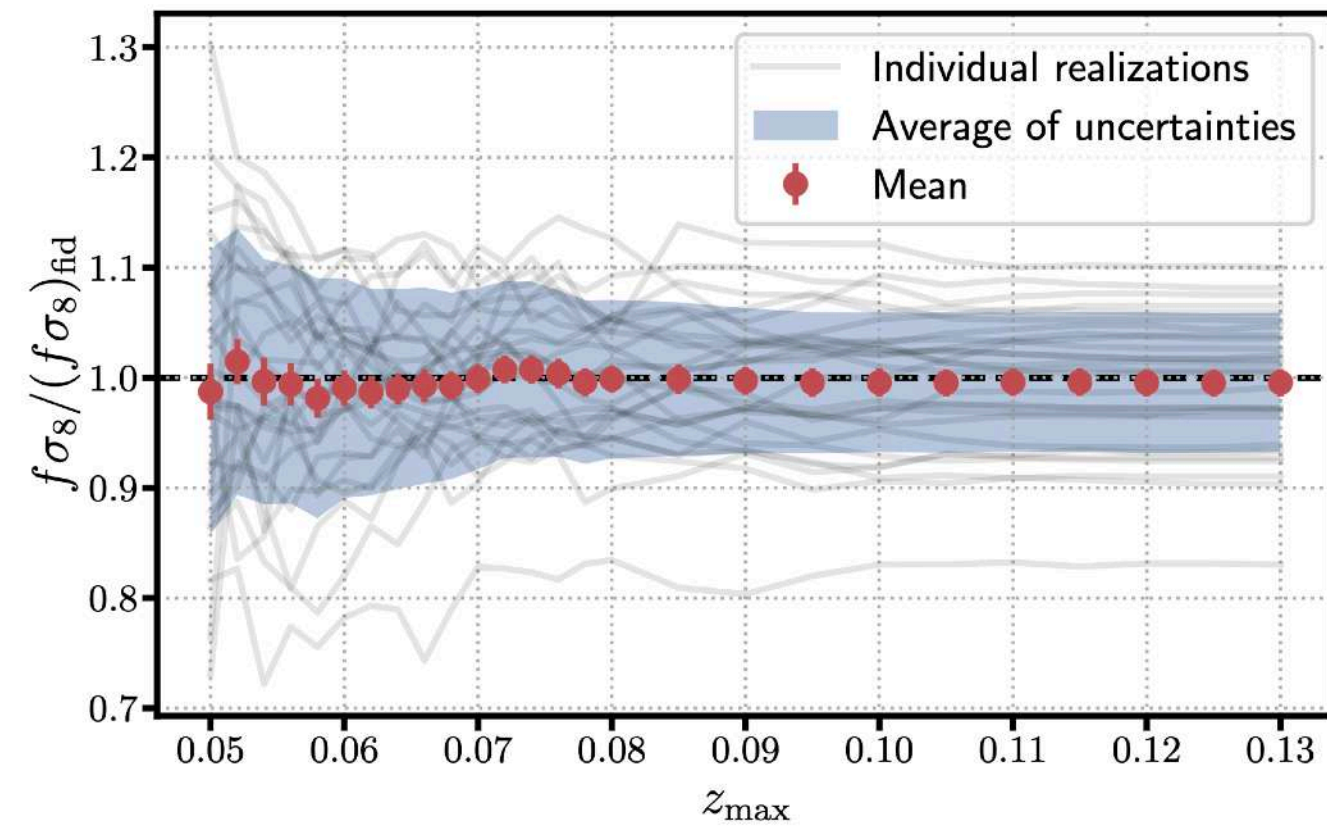
# Measuring $f\sigma_8$

Picking SNIa between  $0.02 < z < z_{\max}$

27 realisations

Using true velocities from simulation

Estimated velocities from simulated SNIa

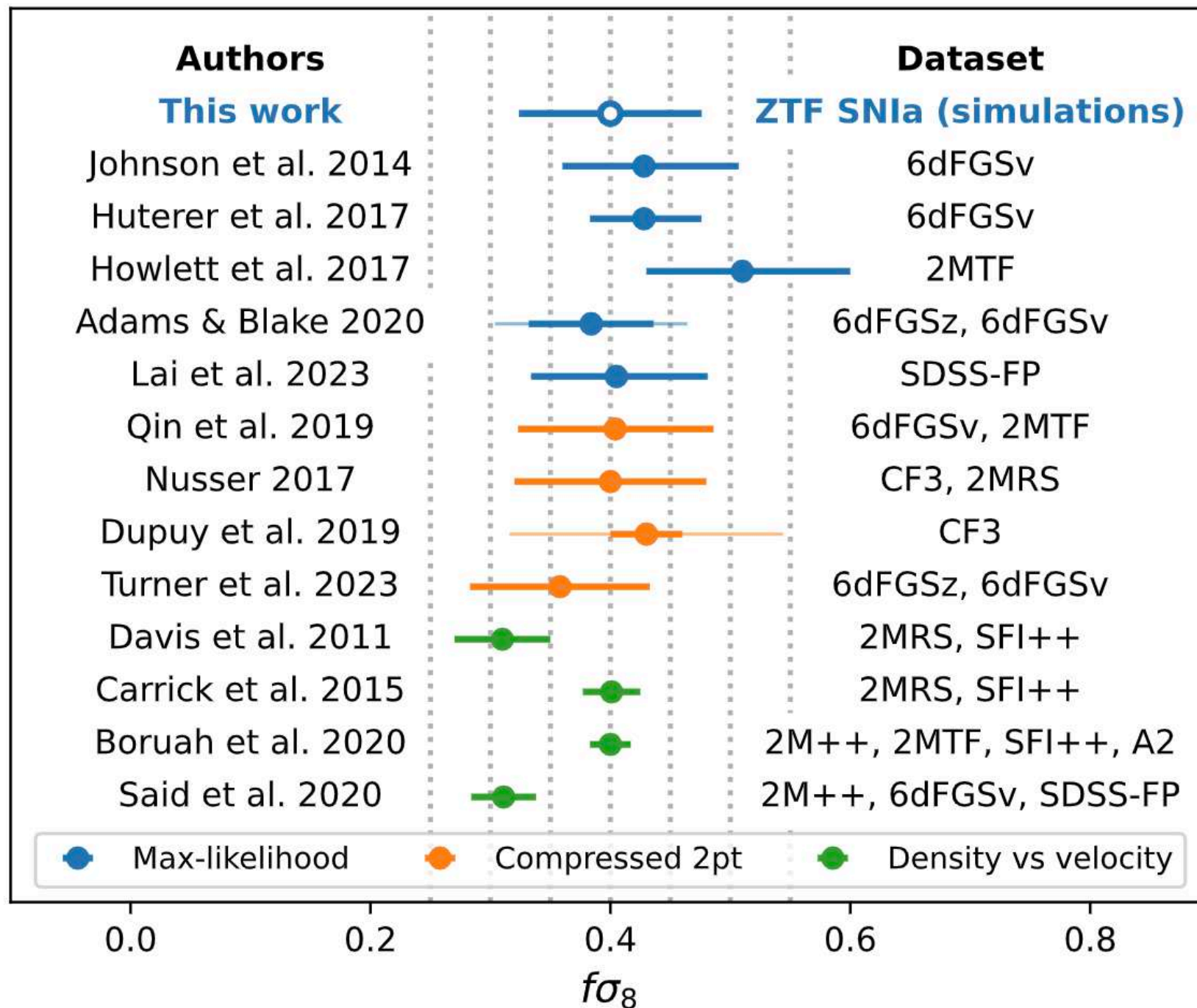


Selection effects quick in at  $z_{\max} \sim 0.06$

Forecast of **19%** uncertainty of growth-rate from **SNIa velocities only**  
(Carreres, JB, et al. 2023)

# Forecast on $f\sigma_8$ based on simulations

~ 2000 ZTF spectroscopically typed SNIa sample  
 $0 < z < 0.06$

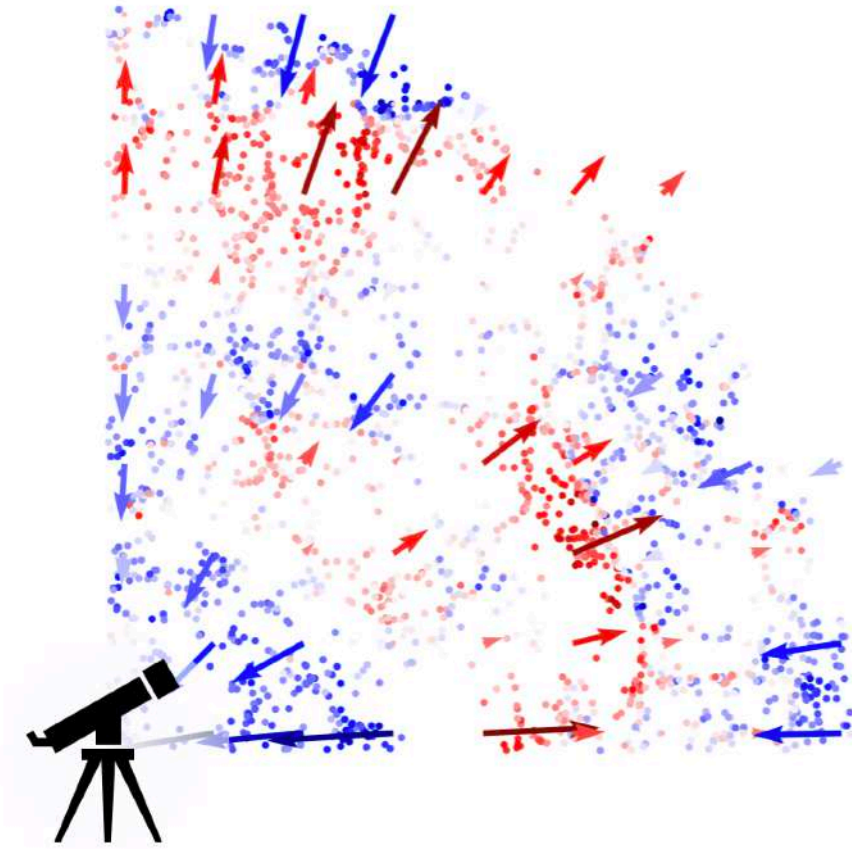


**19% uncertainty from velocity-velocity only**

# Steps forward



## Steps forward

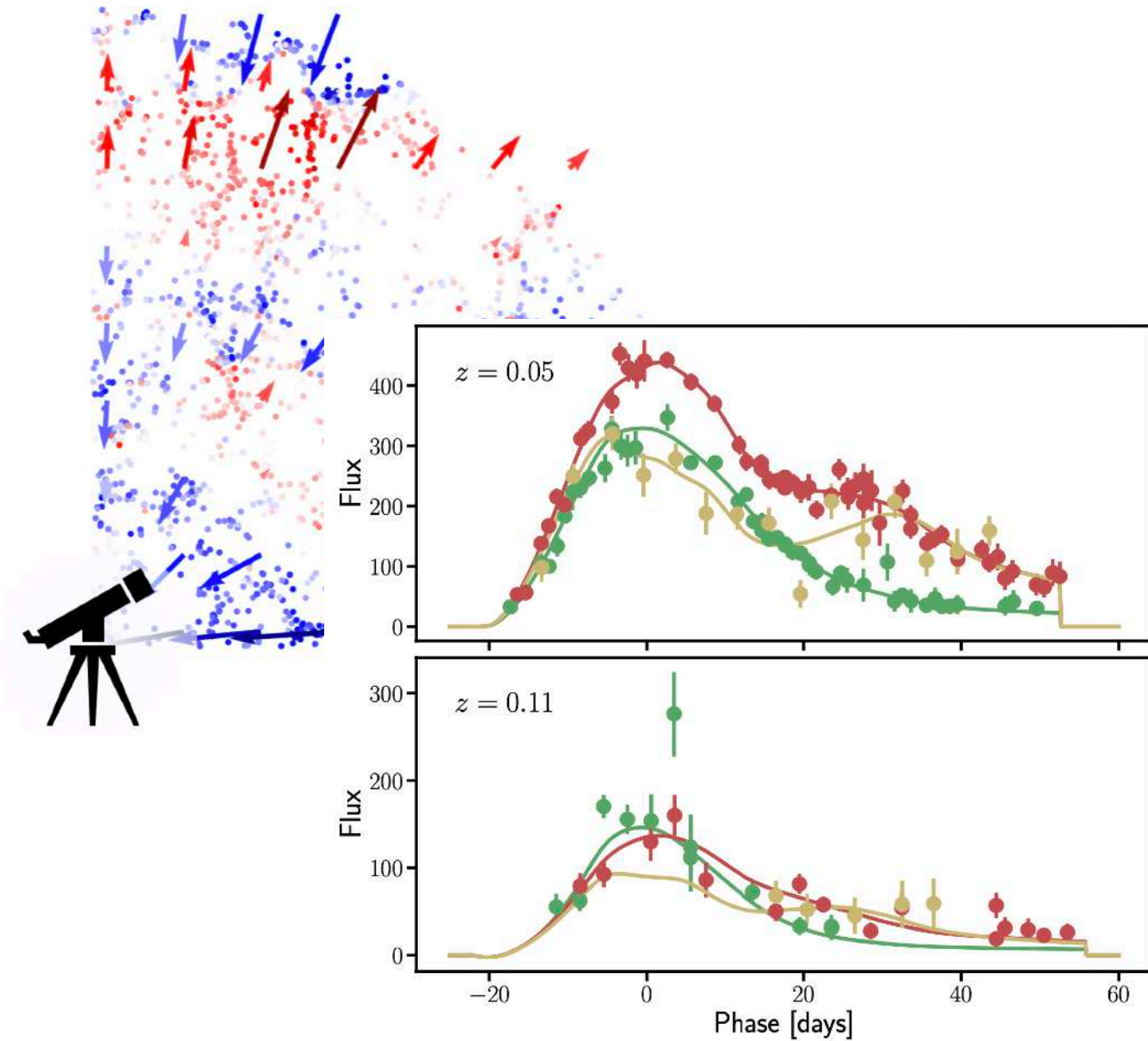


- combine ZTF SNIa with DESI galaxies:  
expected factor 2 improvement on  
uncertainties!

+

- realistic mocks of DESI + ZTF  
Corentin Ravoux

# Steps forward



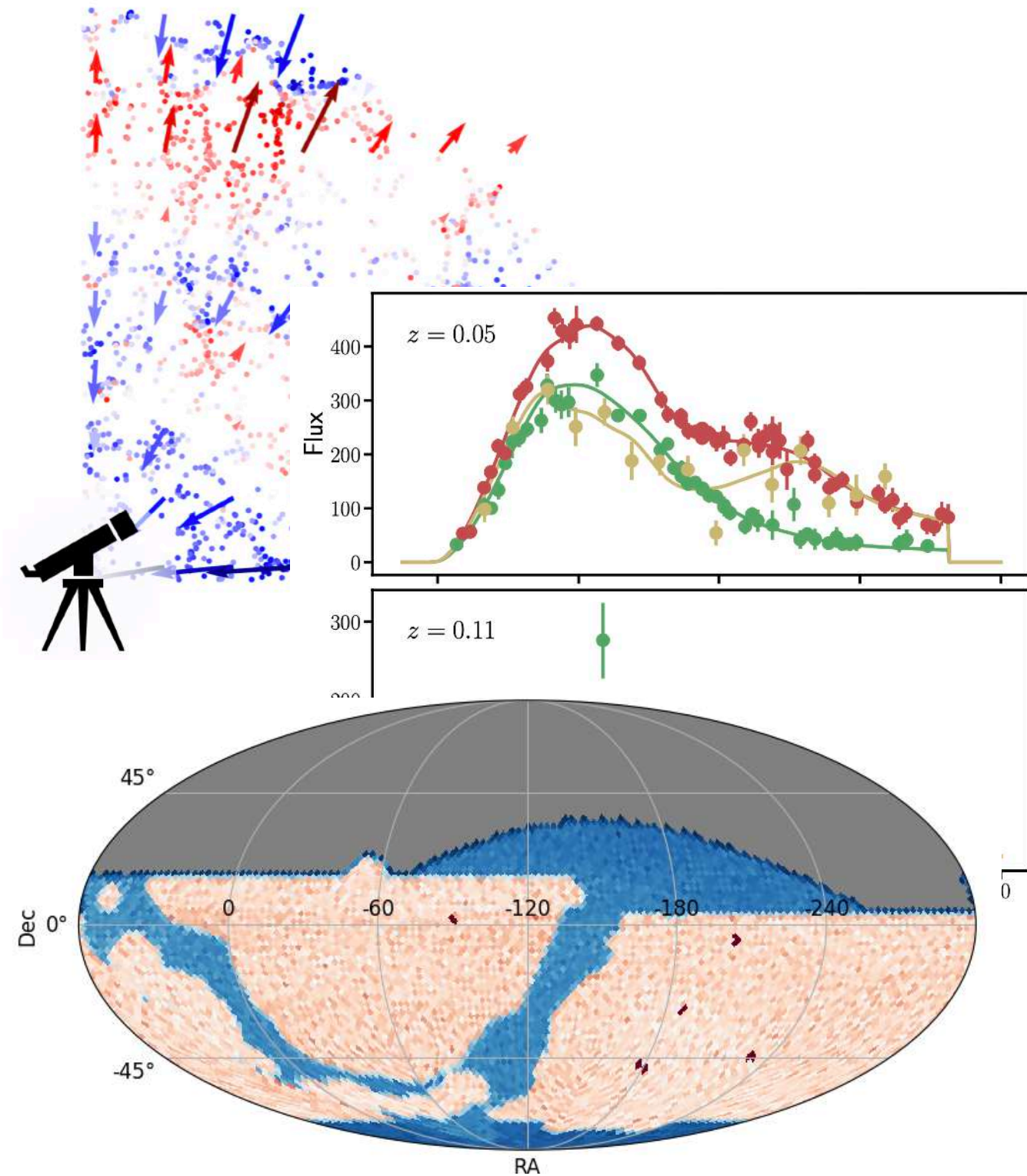
- combine ZTF SNIa with DESI galaxies: expected factor 2 improvement on uncertainties!

+

- realistic mocks of DESI + ZTF  
Corentin Ravoux

- consider photometric typing: more SNIa, higher redshift, contamination by non-Ia

# Steps forward



- combine ZTF SNIa with DESI galaxies:  
expected factor 2 improvement on  
uncertainties!

+

- realistic mocks of DESI + ZTF  
**Corentin Ravoux**

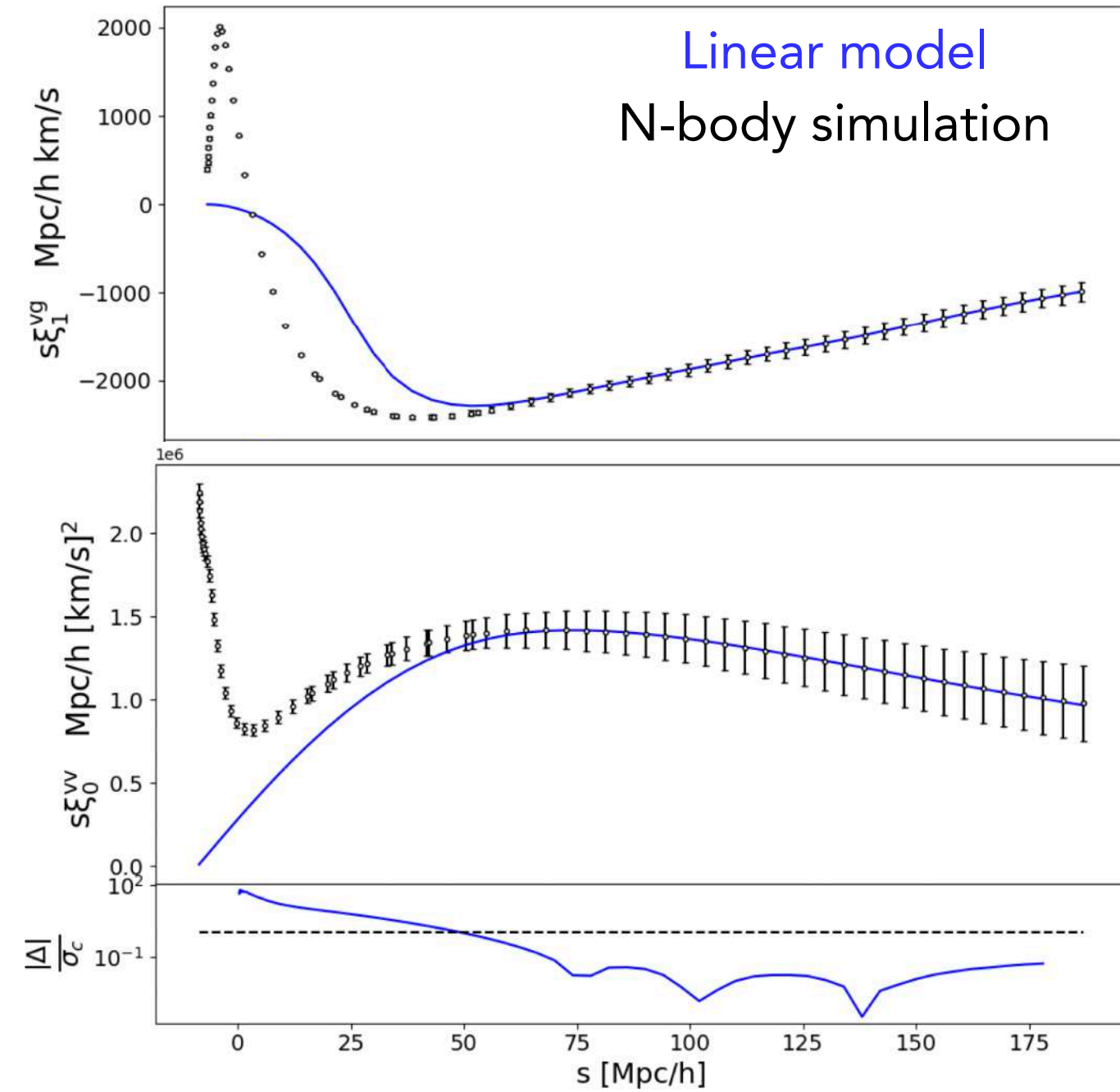
- consider photometric typing: more SNIa,  
higher redshift, contamination by non-Ia

+

- simulate Rubin-LSST SNIa samples  
**Damiano Rosselli**

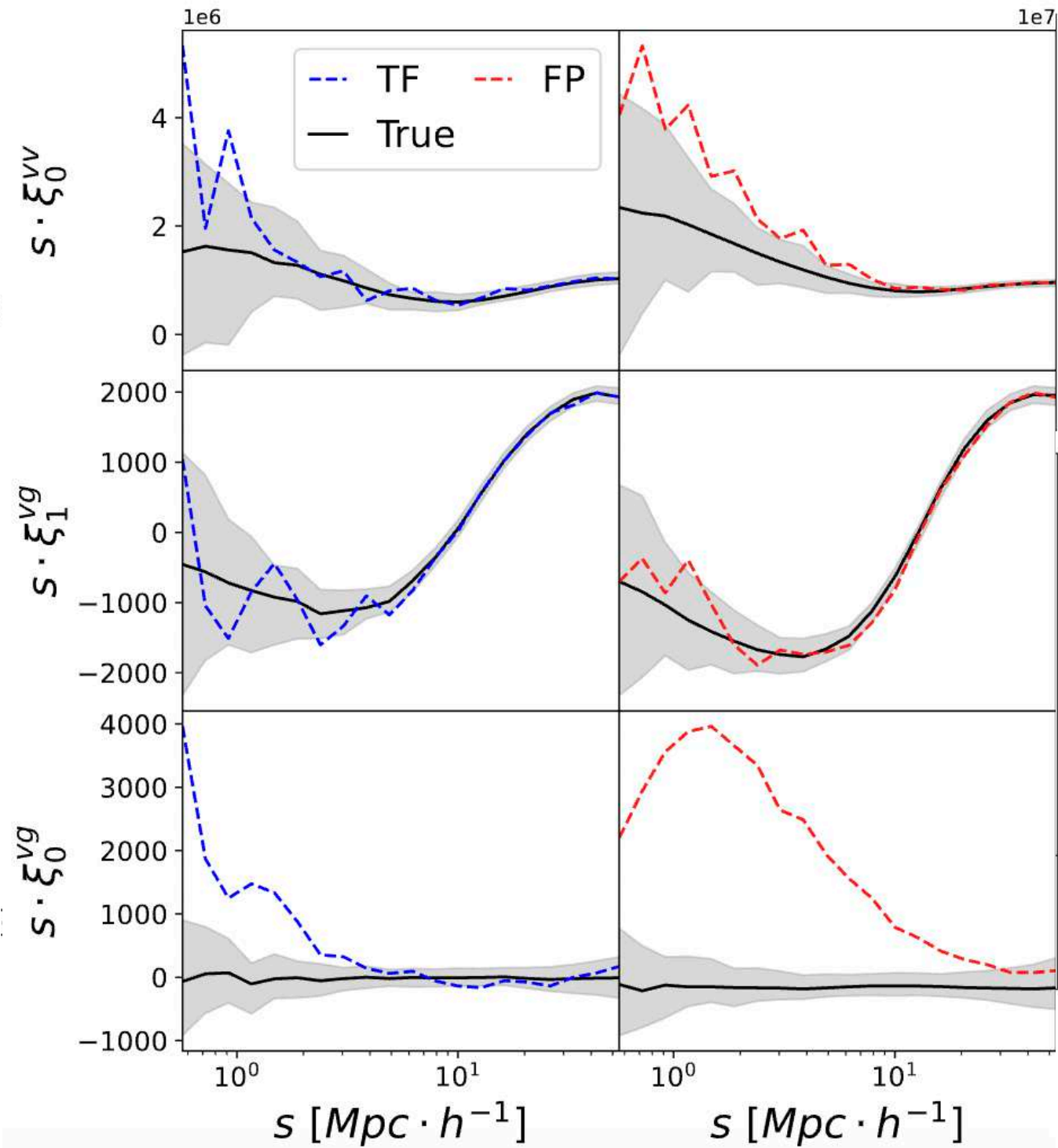


# Steps forward



- simulation-based non-linear models

# Steps forward



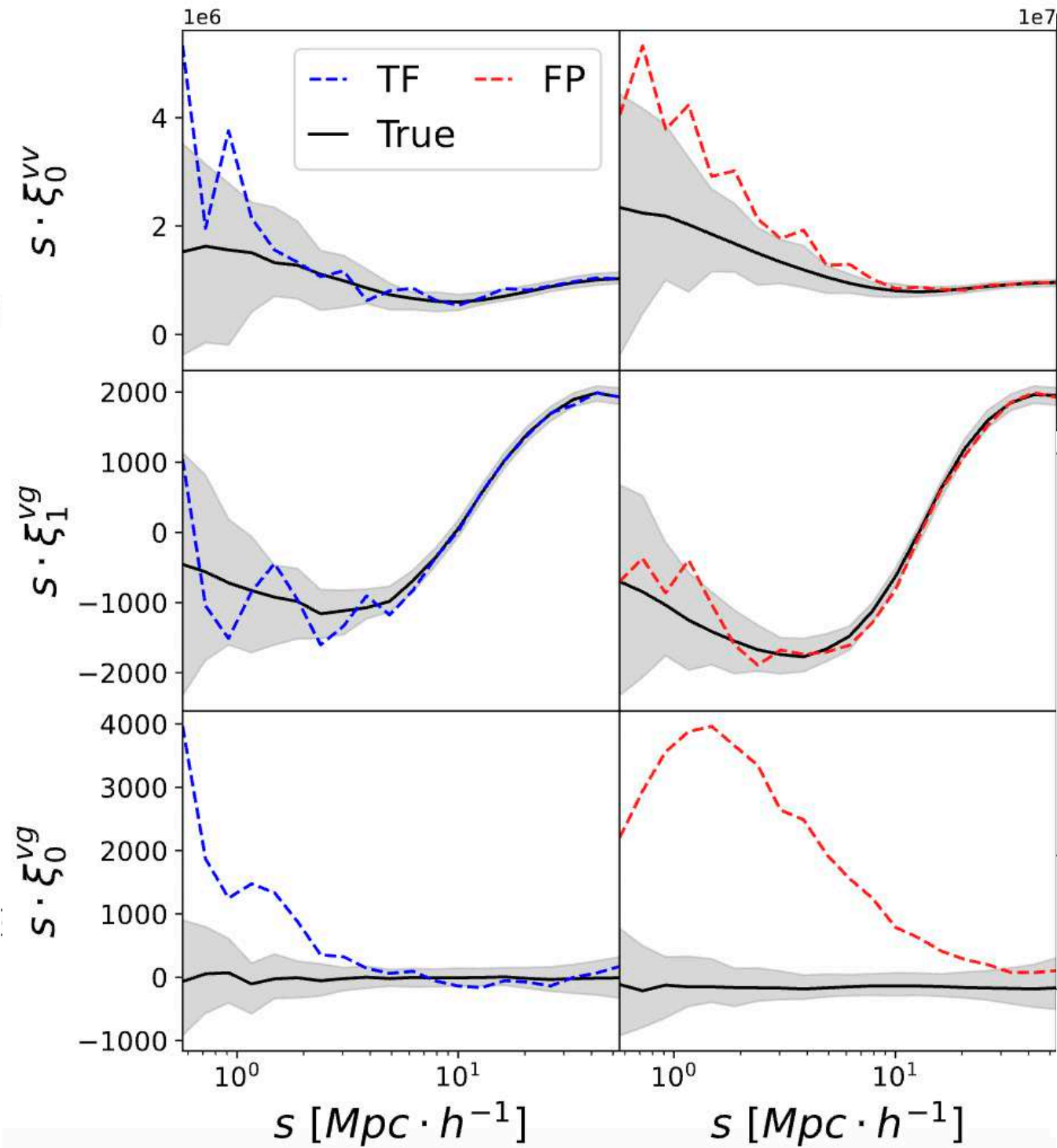
- simulation-based non-linear models

+

- astrophysical systematics on velocities from hydro-simulations

Tyann Dumerchat

# Steps forward



- simulation-based non-linear models

+

- astrophysical systematics on velocities from hydro-simulations

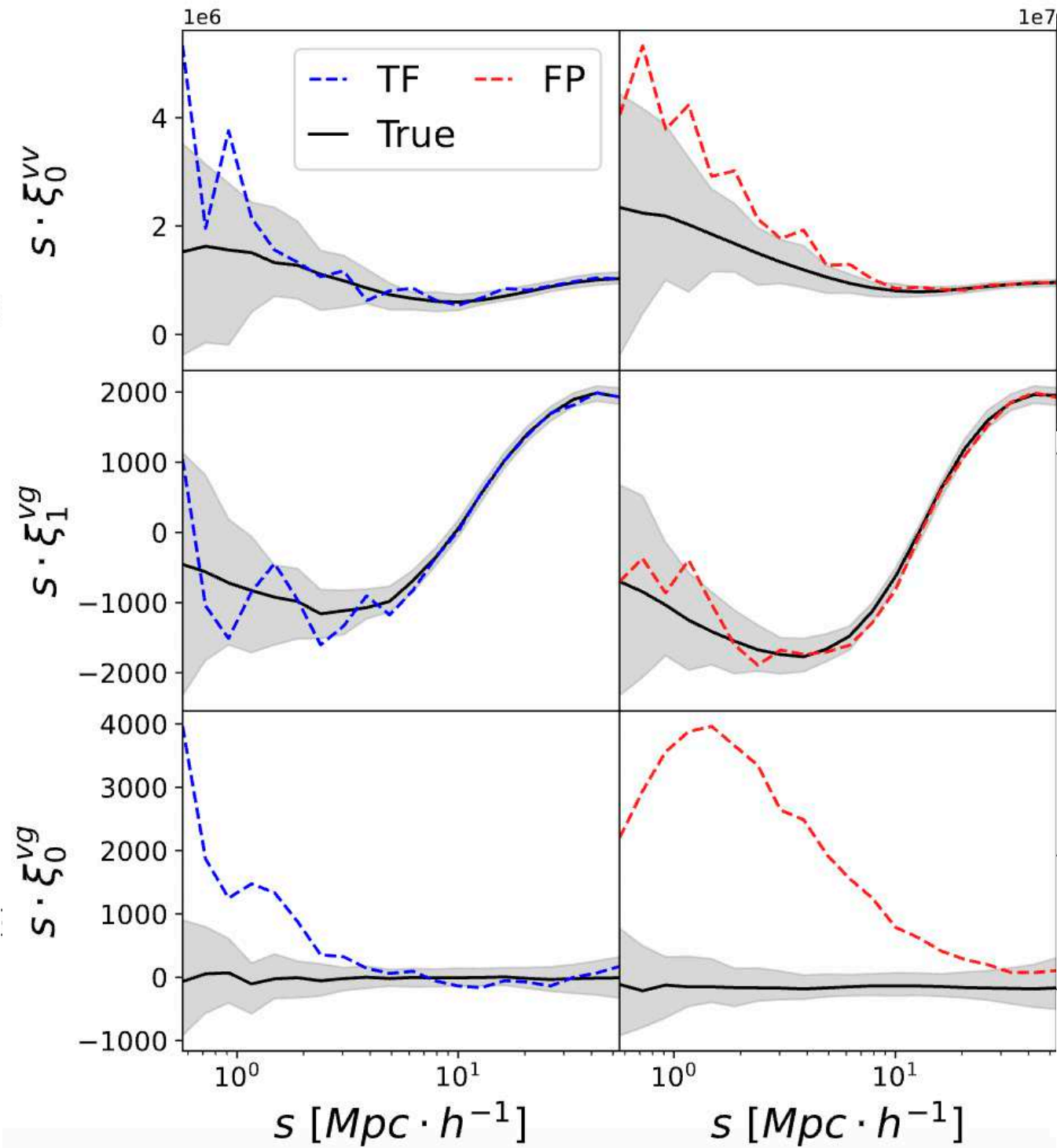
Tyann Dumerchat

- Environmental dependencies of SNIa velocities

Vincenzo Aronica



# Steps forward



- simulation-based non-linear models

+

- astrophysical systematics on velocities from hydro-simulations

Tyann Dumerchat

- Environmental dependencies of SNIa velocities

Vincenzo Aronica

- And much more !



# Conclusion

We need to measure the growth rate, as a test of dark energy and gravity models

Peculiar velocities are essential for low-z growth-rate measurements:  
up to factor 2 improvement over RSD only

DESI and ZTF are currently providing one of the datasets for such analysis  
4MOST and LSST in the near future

Simulation based forecast on ZTF SNIa sample yields 19% uncertainty on growth rate

Lots of work ahead