

Enhanced constraints from multi-tracer surveys

or

How to beat cosmic variance

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LABCOSMOS



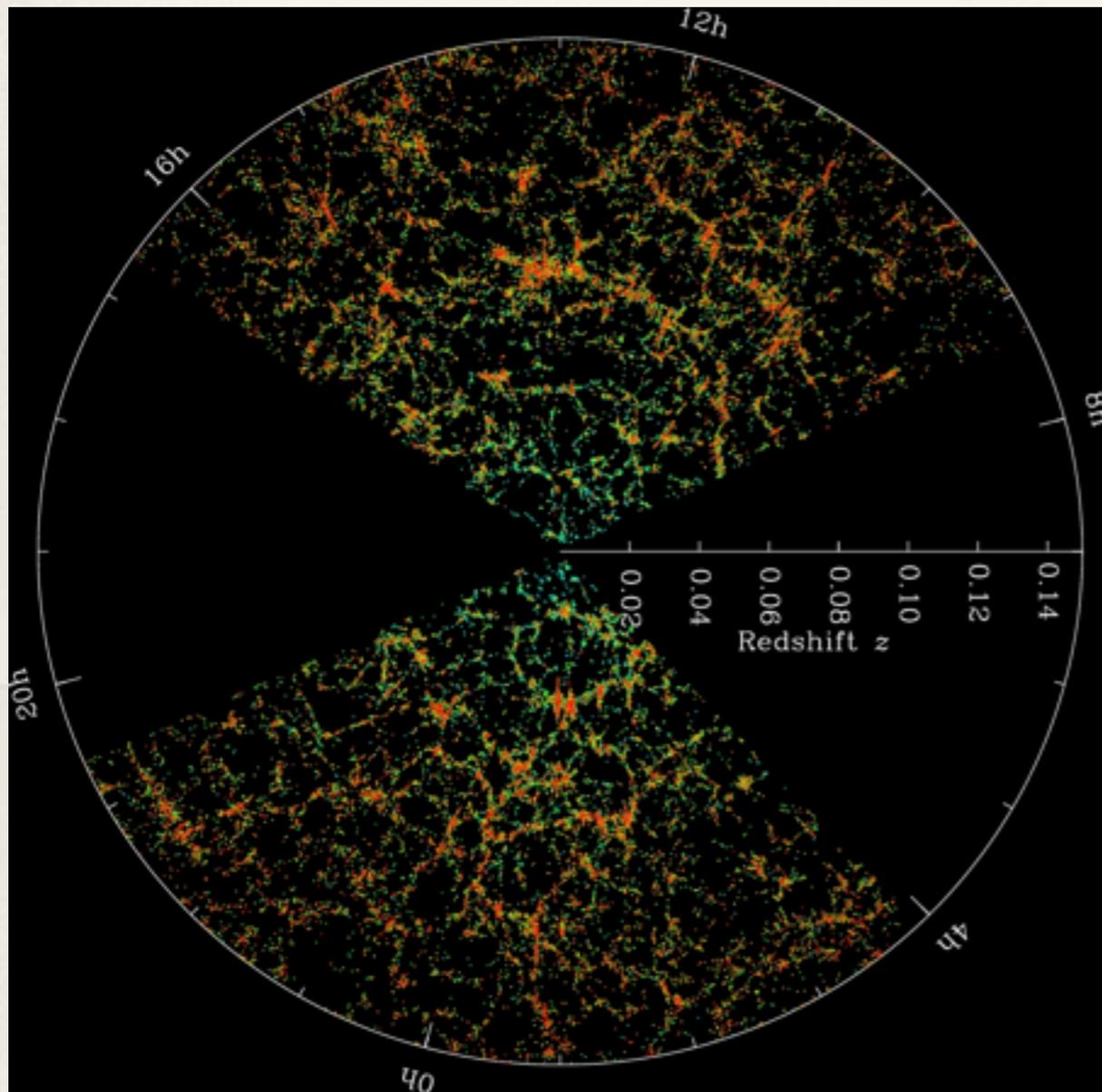
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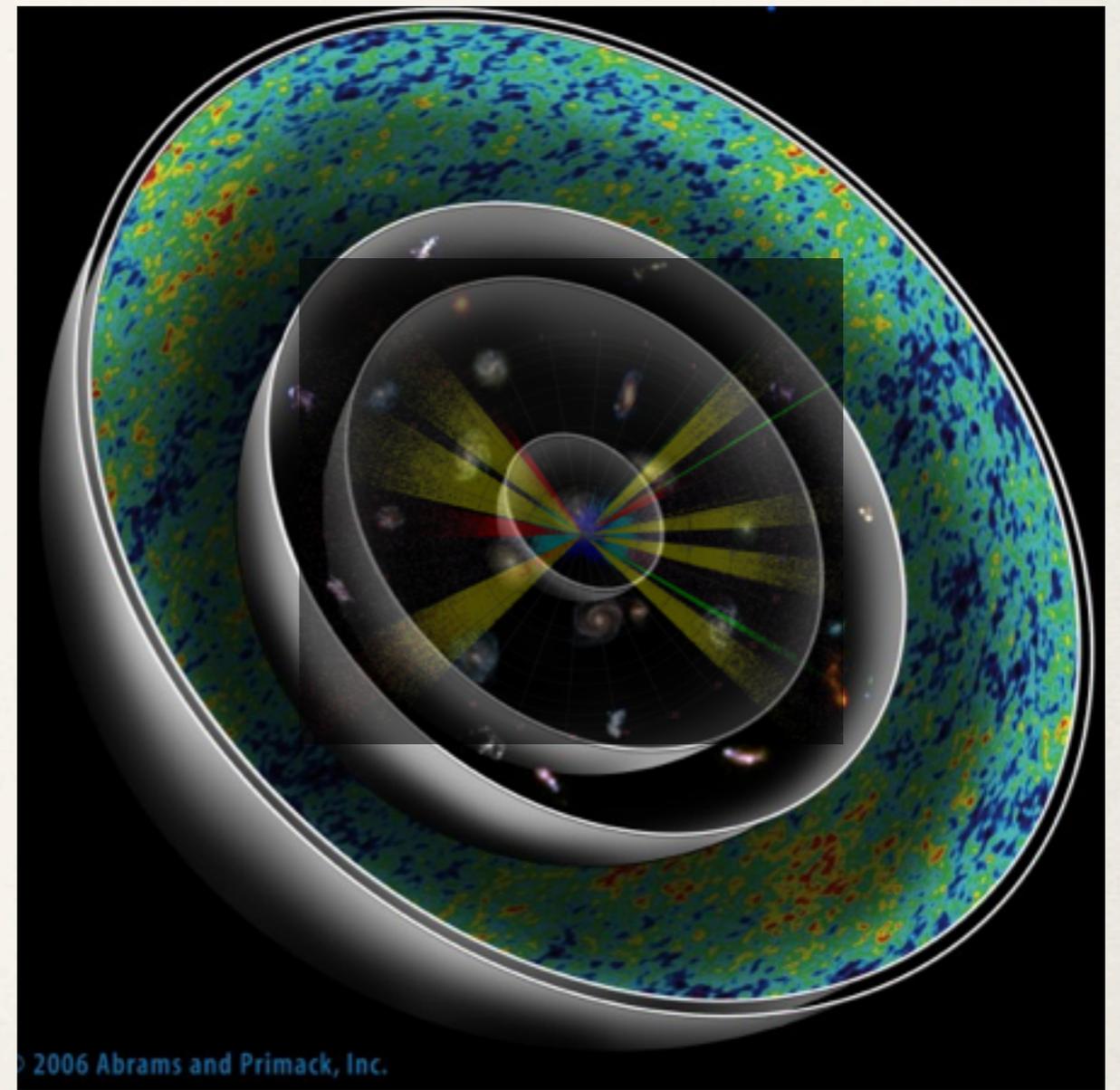
Galaxy surveys are evolving

We used to live in an
era of shot noise



[Finding galaxies was the limiting factor]

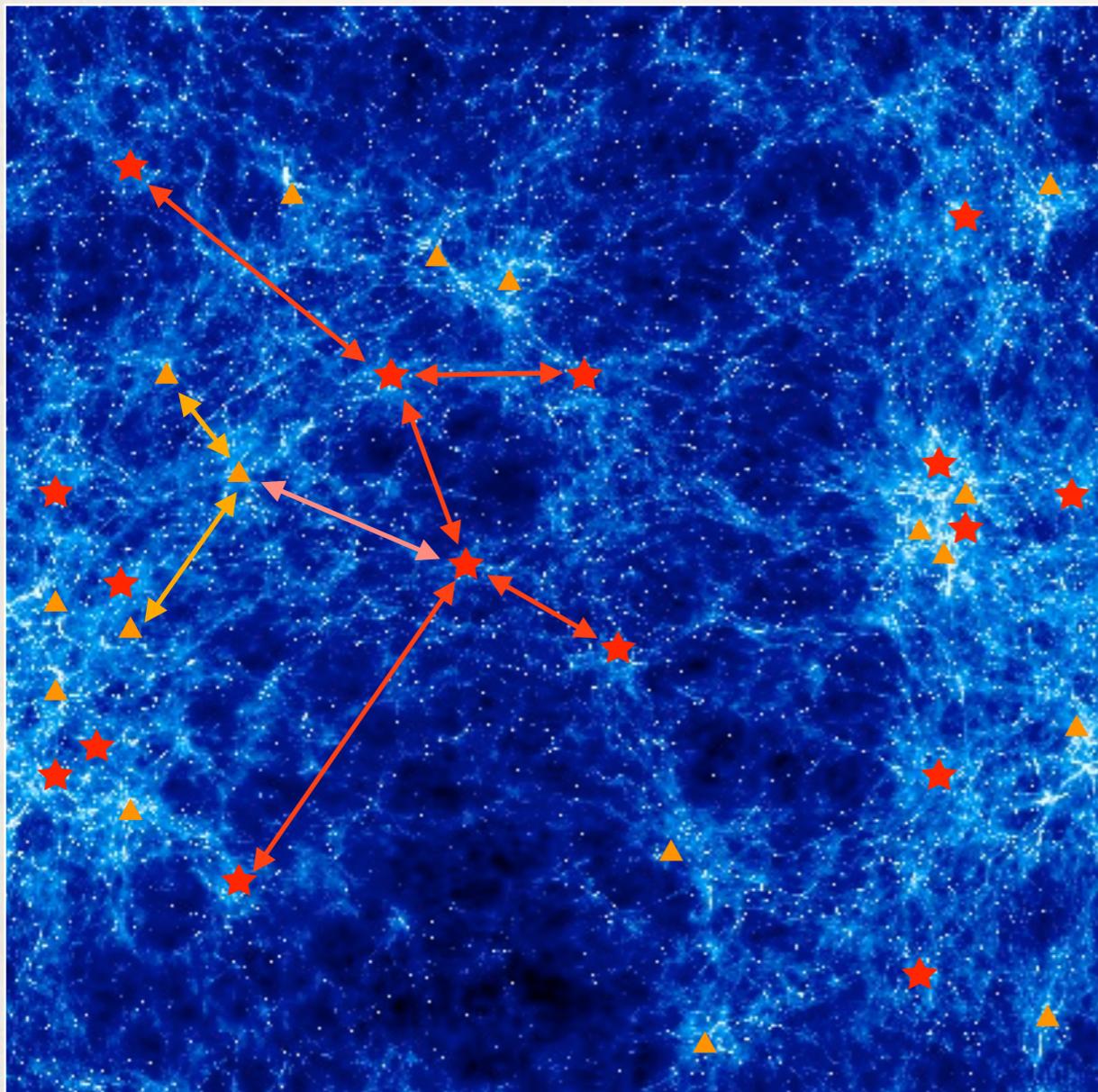
We are now starting an
era of cosmic variance



[Gaining volume is the limiting factor]

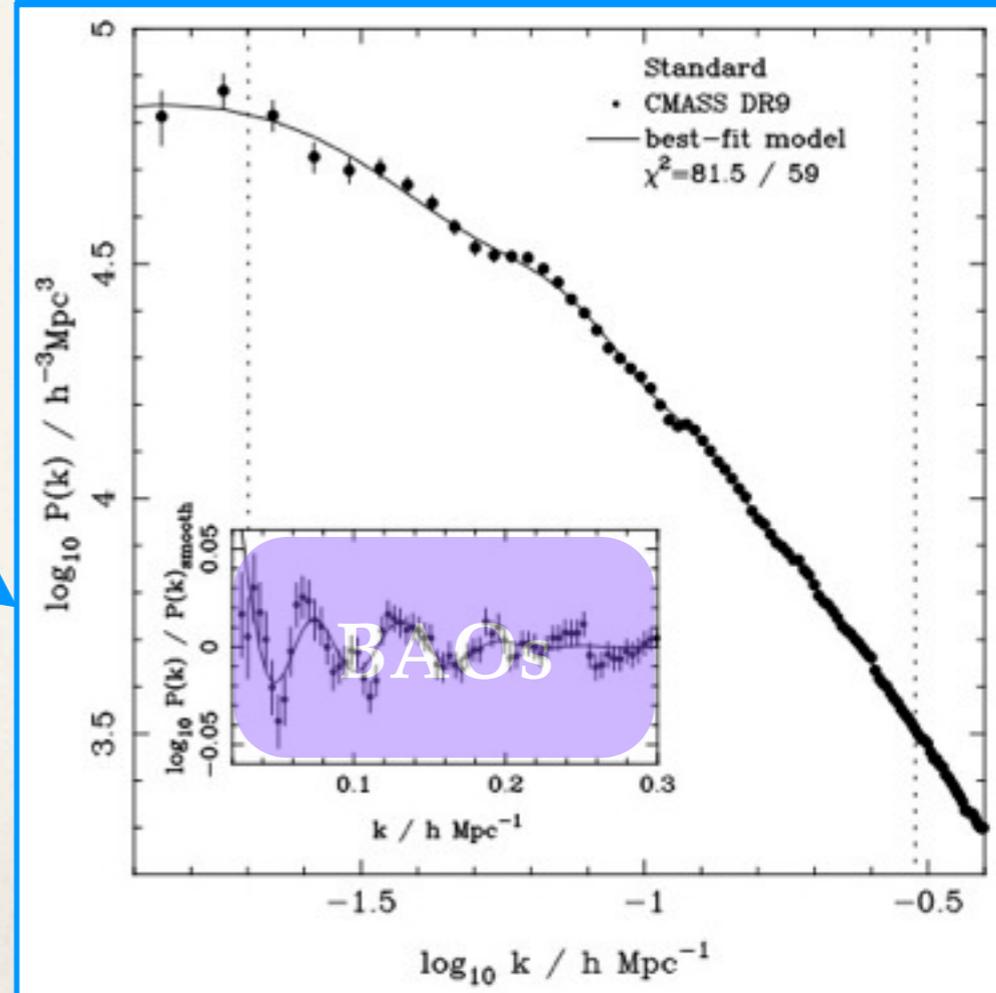
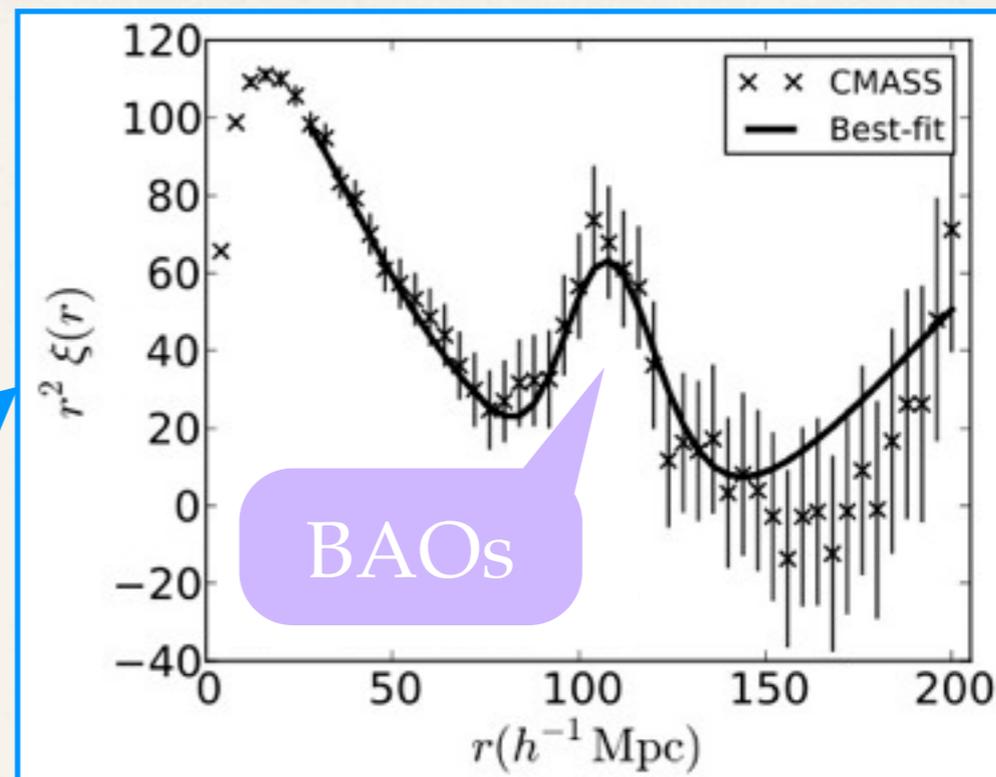
Cosmology from galaxy clustering

$$\rho_g(\vec{x}) = n_g(\vec{x}) [1 + \delta_g(\vec{x})] \rightarrow n_g(\vec{x}) [1 + b_g(\vec{x}) \delta(\vec{x})]$$



Clustering
in position
space

Clustering
in Fourier
space



Bias:

$$\xi_1(r) = b_1^2 \xi(r) \longleftrightarrow P_1(k) = b_1^2 P(k)$$

$$\xi_2(r) = b_2^2 \xi(r) \longleftrightarrow P_2(k) = b_2^2 P(k)$$

Fisher information matrix of galaxy surveys

FKP - Feldman, Kaiser & Peacock (1994)

Tegmark et al. (1997), R.A. (2012)

The galaxy power spectrum in redshift space, for any galaxy survey, can be expressed in units of its shot noise ($1/n_g$). This defines the survey's **effective power spectrum** (which is **adimensional**):

$$\mathcal{P}_g(\vec{k}, \vec{x}) \rightarrow n_g(\vec{x}) [b_g(\vec{x}) + f(\vec{x}) \mu_k^2]^2 G^2(\vec{x}) P(\vec{k})$$

$$f = -\frac{d \log G}{d \log z}$$
$$\mu_k = \frac{k_{\parallel}}{k}$$

average density of galaxies in the survey

galaxy bias (function of z , at least)

matter growth rate = redshift distortion parameter

angle of Fourier mode w.r.t. line-of-sight

matter growth function

matter power spectrum

The **Fisher information** for the (log of the) **effective power spectrum** is:

$$F[\log \mathcal{P}_g] = \frac{1}{2} \left(\frac{\mathcal{P}_g}{1 + \mathcal{P}_g} \right)^2$$

FKP Fisher matrix

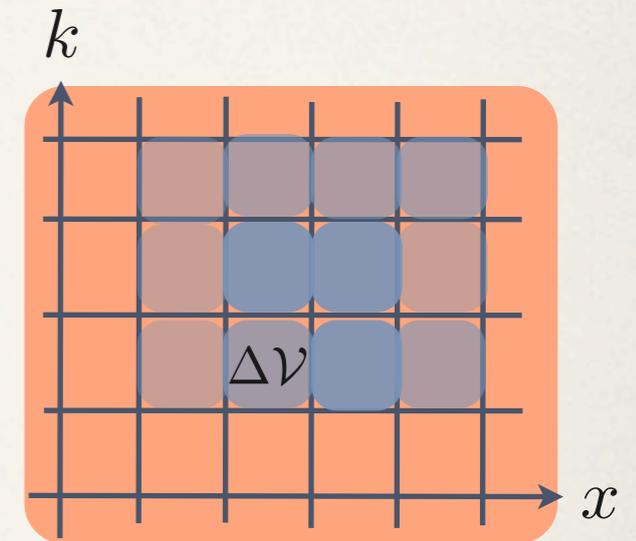
Fisher information in phase space

On each **cell of phase space volume** there is a certain **amount of information** about the spectrum (and other quantities), given by:

$$F[\log \mathcal{P}_g] \times \frac{\Delta V_x \Delta V_k}{(2\pi)^3} = \frac{1}{2} \left(\frac{\mathcal{P}_g}{1 + \mathcal{P}_g} \right)^2 \times \frac{\Delta V_x \Delta V_k}{(2\pi)^3}$$

phase space **density**
of information < 1/2

phase space
volume = $\Delta \mathcal{V}$.



The **precision** with which we can **estimate** the effective power spectrum from the information in **each cell of phase space** is:

$$\frac{\sigma(\mathcal{P}_g)}{\mathcal{P}_g} = \frac{1}{\sqrt{F[\log \mathcal{P}_g] \Delta \mathcal{V}}} = \frac{1 + \mathcal{P}_g}{\mathcal{P}_g} \times \sqrt{\frac{2}{\Delta \mathcal{V}}}$$

The Fisher information is **additive**, so **integrating** over the phase space **volume** gives the **total information**.

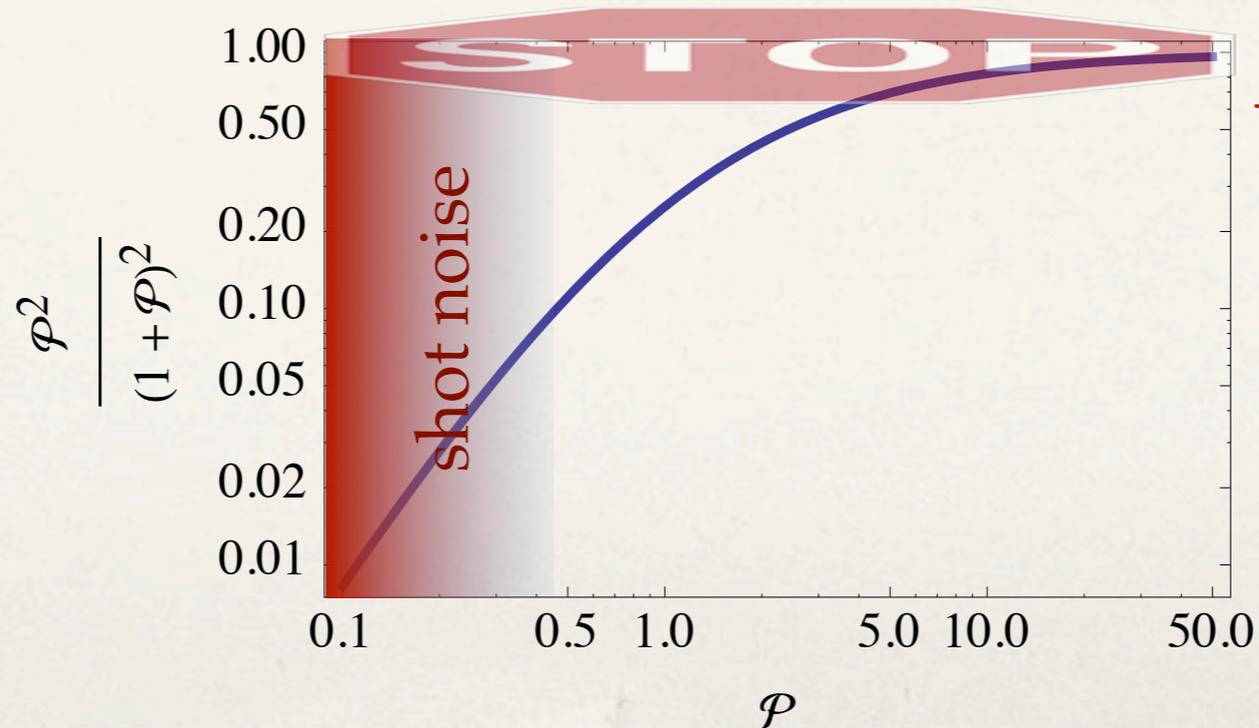
Fisher information, effective volume and cosmic variance

$$p^a \rightarrow \theta^i \quad : \quad F_{ij}[\theta] = \sum_{ab} \frac{\partial p^a}{\partial \theta^i} F_{ab}[p] \frac{\partial p^b}{\partial \theta^j}$$

$$p^a = \log \mathcal{P}_g \rightarrow \theta^i \quad \Rightarrow \quad F_{ij} = \int \frac{d^3 k d^3 x}{(2\pi)^3} \frac{d \log \mathcal{P}_g}{d \theta^i} \times \frac{1}{2} \left(\frac{\mathcal{P}_g}{1 + \mathcal{P}_g} \right)^2 \times \frac{d \log \mathcal{P}_g}{d \theta^j}$$

Power of a survey:
~ effective volume

$$V_{eff}(\vec{k}) = \int d^3 x \left(\frac{\mathcal{P}_g}{1 + \mathcal{P}_g} \right)^2 < V$$



**COSMIC
VARIANCE**

$$\mathcal{P}_g \sim n_g(z) P(k)$$

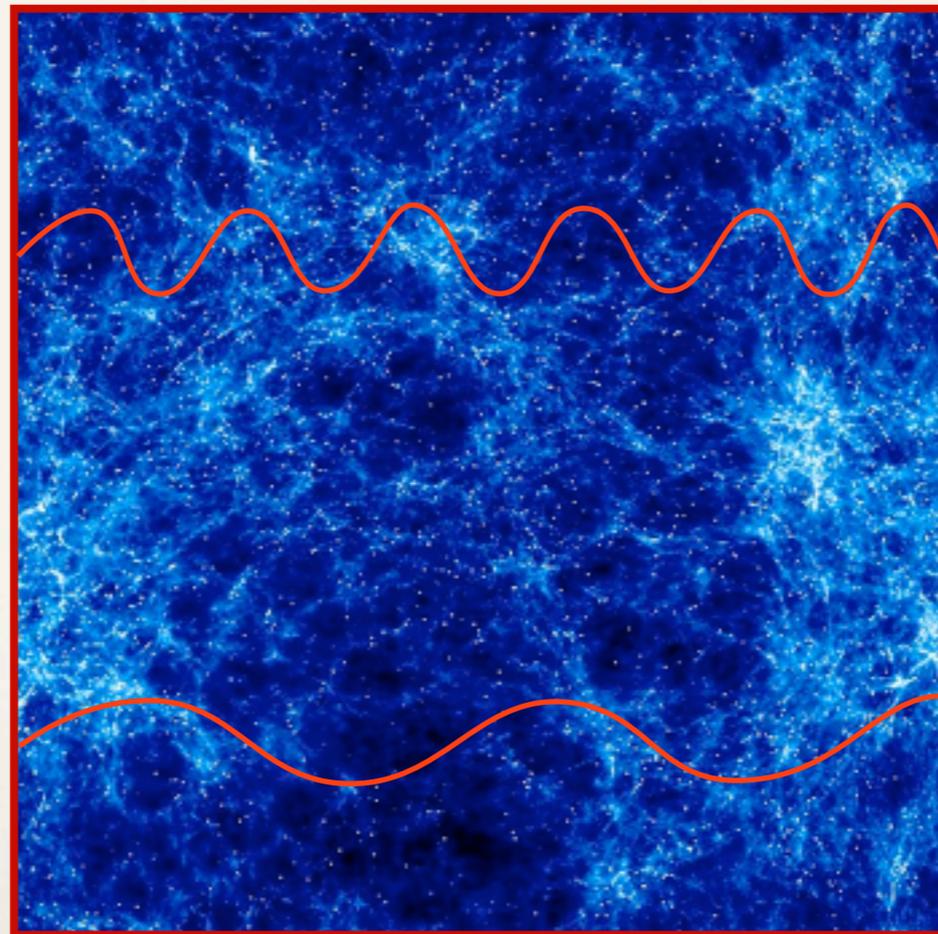
Why?

Much of the cosmological information resides in the **power spectrum**

$$\langle \delta(\vec{k}) \delta^*(\vec{k}') \rangle = (2\pi)^3 \delta(\vec{k} - \vec{k}') P(\vec{k})$$

In a **finite volume**, even if we map a **huge number** of tracers, the **precision** with which we can measure the **modes**, and $P(k)$, is **limited**

$$\frac{\sigma_{P(k)}}{P(k)} \propto \frac{1}{\sqrt{\# \text{ of modes}}}$$



$$\frac{\sigma_{P(k)}}{P(k)}$$

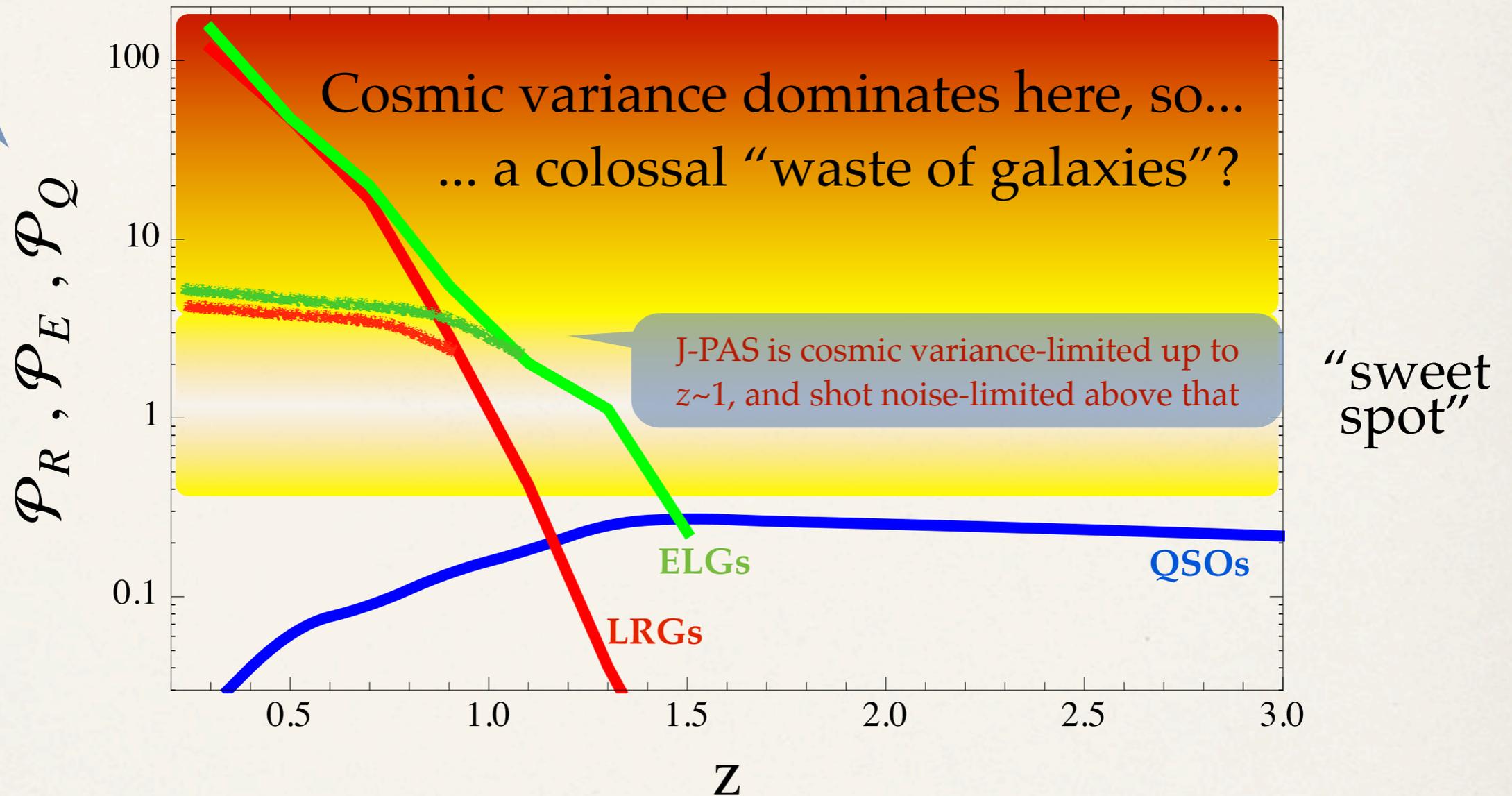
$$\frac{\sigma_{P(k)}}{P(k)}$$

**COSMIC
VARIANCE**

Implications for cosmology

Example: J-PAS

@ $k=0.1 h \text{ Mpc}^{-1}$



Are these many millions of $z \lesssim 1$ galaxies really "wasted", from the point of view of cosmology?

NO!

How to “beat” cosmic variance

By comparing the clustering of the different tracers of large-scale structure (LRGs, ELGs, etc.), we can measure with arbitrary accuracy* the physical parameters that determine their different clustering amplitudes

Seljak 2008; McDonald & Seljak 2008

Gil-Marín et al. 2011

Hamaus, Seljak & Desjacques 2011,2012

Cai & Bernstein 2011

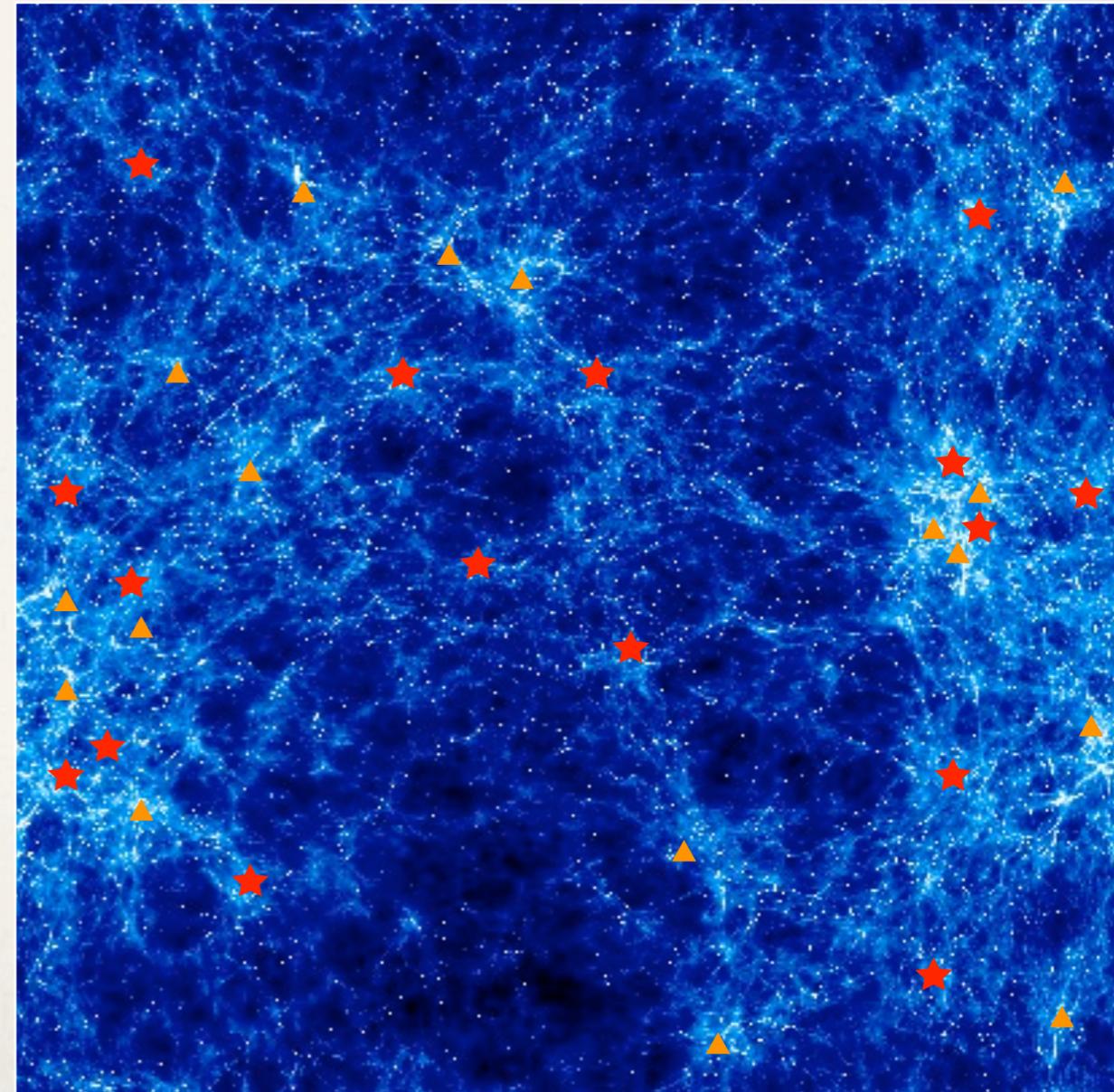
R.A. & K. Leonard, MNRAS 2013 (arXiv:1302.5444)

$$\mathcal{P}_1 = n_1 (b_1 + f \mu_k^2)^2 P(k; z)$$

$$\mathcal{P}_2 = n_2 (b_2 + f \mu_k^2)^2 P(k; z)$$

$$\frac{\mathcal{P}_1}{\mathcal{P}_2} = \frac{n_1 (b_1 + f \mu_k^2)^2}{n_2 (b_2 + f \mu_k^2)^2}$$

Cosmic
Variance
does not
apply!



Multi-tracer Fisher information matrix

R.A., MNRAS 2012 (1108.5409)

R.A. & K. Leonard, MNRAS 2013 (1302.5444)

Let's say we have **several** ($\alpha = 1, 2, \dots, N$) **different types of tracers** of large-scale structure: $\alpha=1$ (LRGs), $\alpha=2$ (ELGs), $\alpha=3$ (quasars), etc.

The **multi-tracer Fisher matrix** is:

$$F_{\alpha\beta} = F(\log \mathcal{P}_\alpha, \log \mathcal{P}_\beta) = \frac{1}{4} \left[\delta_{\alpha\beta} \frac{\mathcal{P}_\alpha \mathcal{P}}{1 + \mathcal{P}} + \frac{\mathcal{P}_\alpha \mathcal{P}_\beta (1 - \mathcal{P})}{(1 + \mathcal{P})^2} \right]$$

$$\mathcal{P} = \sum_{\alpha} \mathcal{P}_\alpha$$

Or, in terms of the usual parameters:

$$F_{ij} = F(\theta^i, \theta^j) = \sum_{\alpha\beta} \int \frac{d^3 k d^3 x}{(2\pi)^3} \frac{d \log \mathcal{P}_\alpha}{d\theta^i} F_{\alpha\beta} \frac{d \log \mathcal{P}_\beta}{d\theta^j}$$

Multi-tracer Fisher information matrix

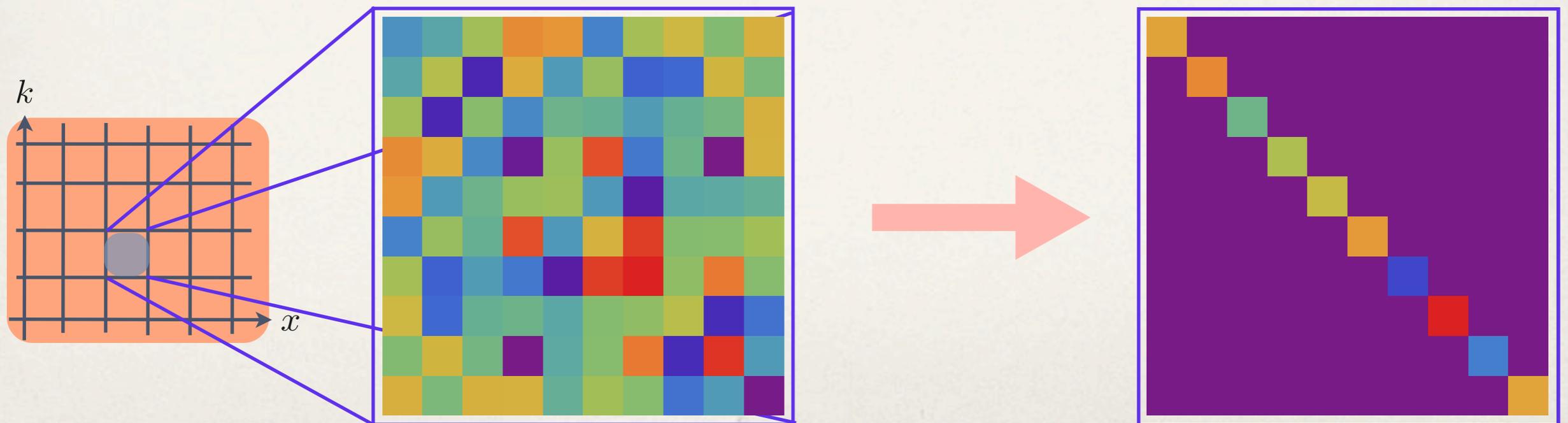
The **multi-tracer** Fisher information is **unbounded!**

$$F_{\alpha\beta} = \frac{1}{4} \left[\delta_{\alpha\beta} \frac{\mathcal{P}_\alpha \mathcal{P}}{1 + \mathcal{P}} + \frac{\mathcal{P}_\alpha \mathcal{P}_\beta (1 - \mathcal{P})}{(1 + \mathcal{P})^2} \right]$$

But this still does not necessarily mean that the **total information** is unbounded...

In fact, there is no clear meaning to “total information” for non-diagonal Fisher matrices

But if we **diagonalize** the Fisher matrix, then **each eigenvalue** adds **positive, independent** amounts of information!



Multi-tracer Fisher information matrix

R.A. & K. Leonard, MNRAS 2013 (arXiv:1302.5444)

We can **diagonalize** the multi-tracer Fisher matrix by a change of variables:

$$\mathcal{P}_\alpha \rightarrow \mathcal{Q}_a$$

First, we define the **aggregate effective spectra** as: $\mathcal{S}_a = \sum_{\alpha=a}^N \mathcal{P}_\alpha$

The variables which diagonalize the multi-tracer Fisher matrix (eigenvectors) are:

$$\mathcal{Q}_1 = \mathcal{S}_1 = \mathcal{P}$$

\mathcal{Q}_1 is the **total effective spectrum** of the survey. **Only it involves $P(k)$**

CV-limited

$$\mathcal{Q}_a = \frac{\mathcal{S}_a}{\mathcal{P}_{a-1}} \quad (a > 1)$$

\vdots

$$\mathcal{Q}_N = \frac{\mathcal{S}_N}{\mathcal{P}_{N-1}} = \frac{\mathcal{P}_N}{\mathcal{P}_{N-1}}$$

\mathcal{Q}_a ($a > 1$) are **relational variables** (ratios of spectra between the different tracers). **They do not involve $P(k)$**

NOT CV-limited

Diagonalized multi-tracer Fisher matrix

In terms of the **relational** power spectra Q_a the Fisher matrix is diagonal!

$$F_{ab} = \mathcal{F}_a \delta_{ab}$$

$$\mathcal{F}_1 = \frac{1}{2} \left(\frac{\mathcal{P}}{1 + \mathcal{P}} \right)^2$$

< 1/2 \Leftrightarrow CV [FKP]
codifies info about $P(k)$

$$\mathcal{F}_a = \frac{1}{4} \frac{\mathcal{P}}{1 + \mathcal{P}} \frac{\mathcal{S}_a \mathcal{P}_{a-1}}{\mathcal{S}_{a-1}}$$

unbounded
but no info about $P(k)$

$$\Rightarrow F_{ij} = \int \frac{d^3 k d^3 x}{(2\pi)^3} \sum_a \frac{d \log Q_a}{d\theta^i} \mathcal{F}_a \frac{d \log Q_a}{d\theta^j} = \sum_a F_{ij}^a$$

Example: 2-tracer survey

Includes
 $P(k)$

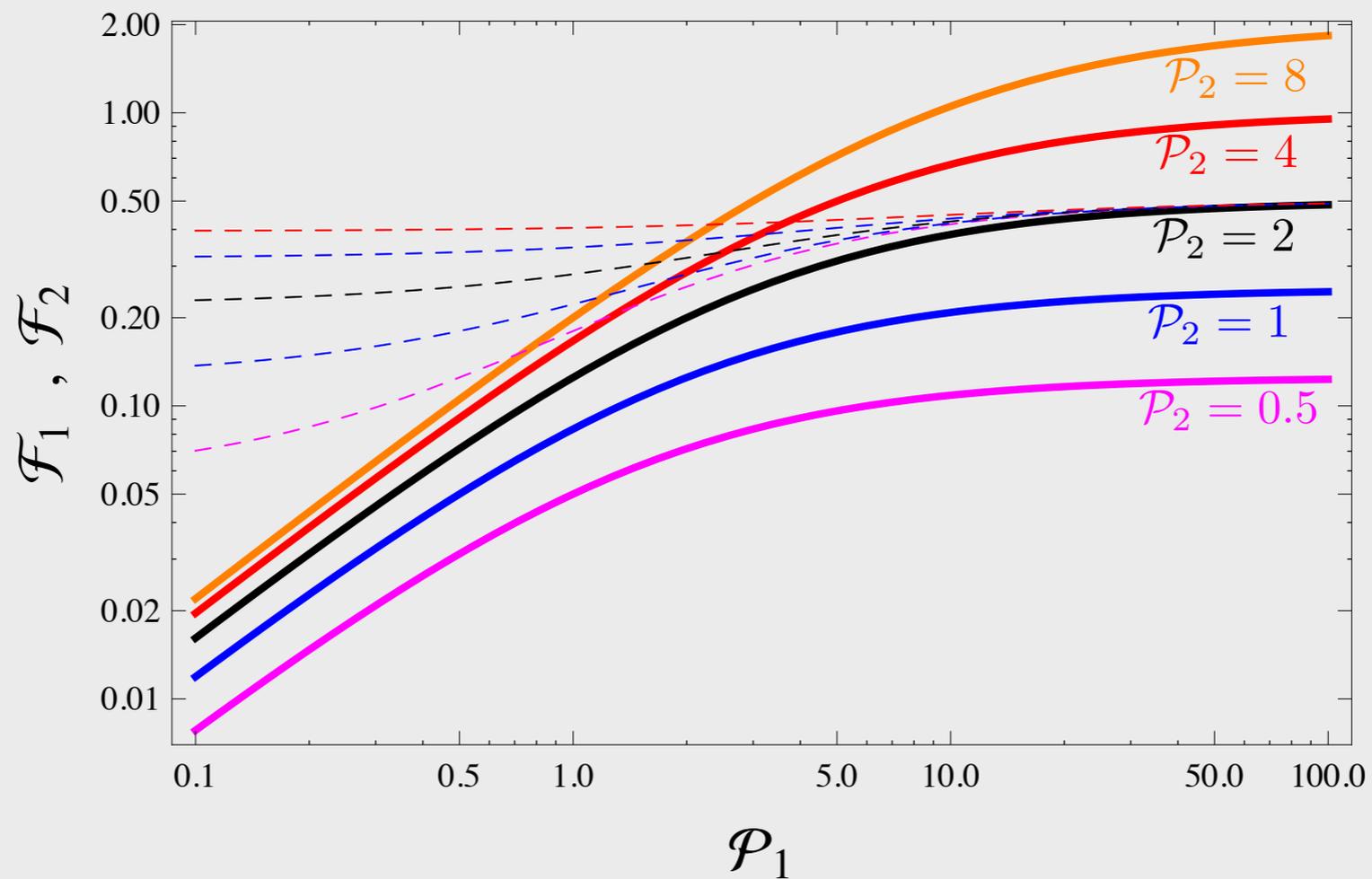
$$Q_1 = \mathcal{P} = \mathcal{P}_1 + \mathcal{P}_2$$

$$\mathcal{F}_1 = \frac{1}{2} \left(\frac{\mathcal{P}_1 + \mathcal{P}_2}{1 + \mathcal{P}_1 + \mathcal{P}_2} \right)^2$$

$$Q_2 = \frac{\mathcal{P}_2}{\mathcal{P}_1}$$

$$\mathcal{F}_2 = \frac{1}{4} \frac{\mathcal{P}_1 \mathcal{P}_2}{1 + \mathcal{P}_1 + \mathcal{P}_2}$$

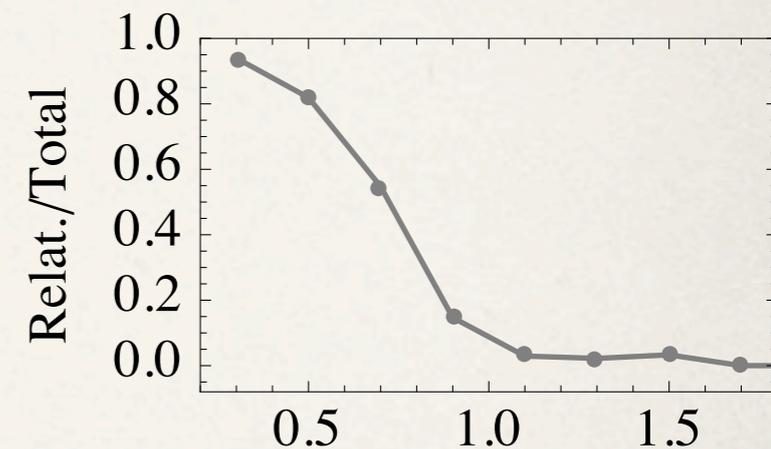
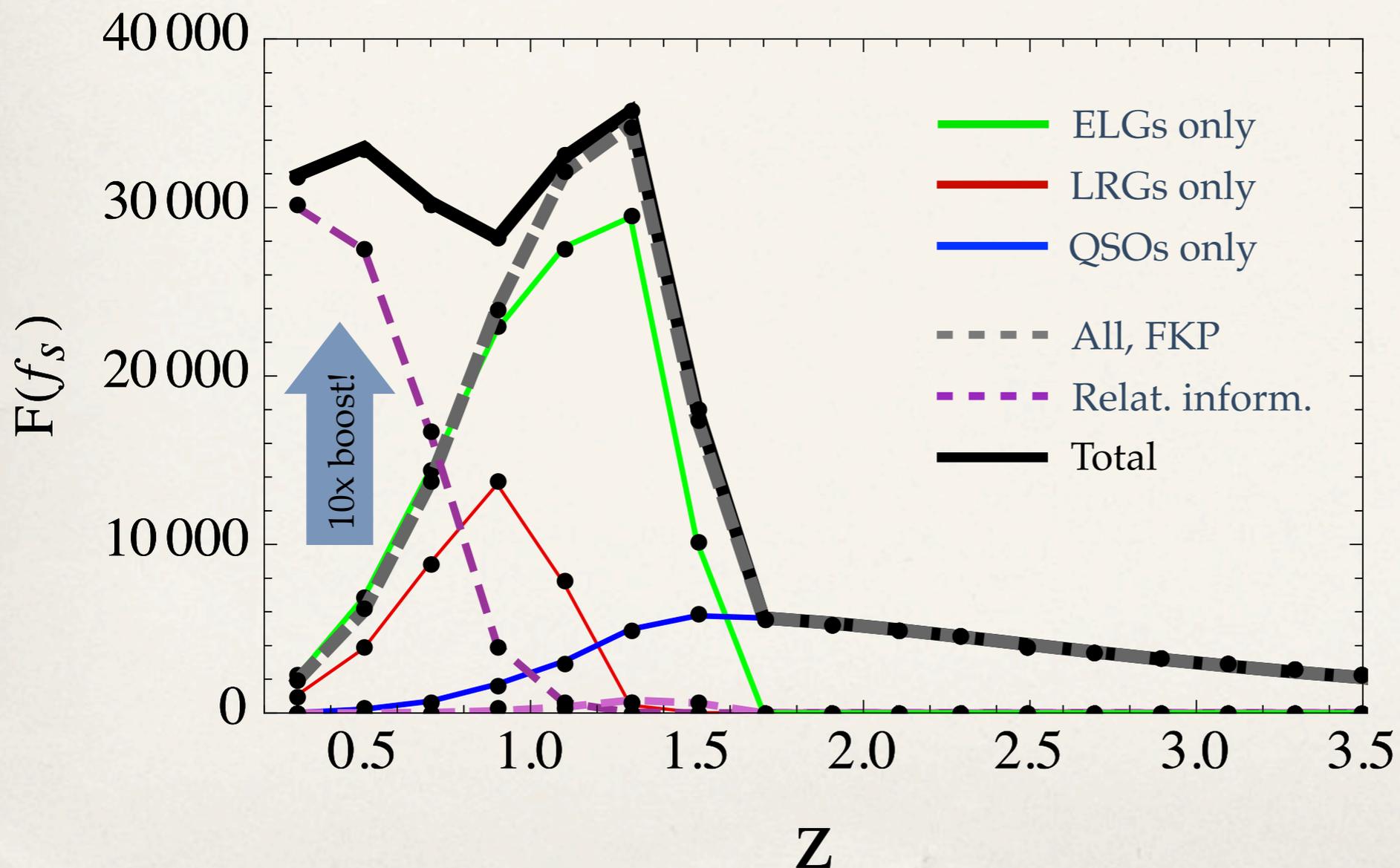
Does not
include
 $P(k)$



Constraints on the RSD parameter $f(z)$ [J-PAS]

$$\mathcal{P}_g = n_g (b_g + f \mu_k^2)^2 P(k; z)$$

$$F(\theta) = \frac{1}{\sigma_c^2(\theta)}$$



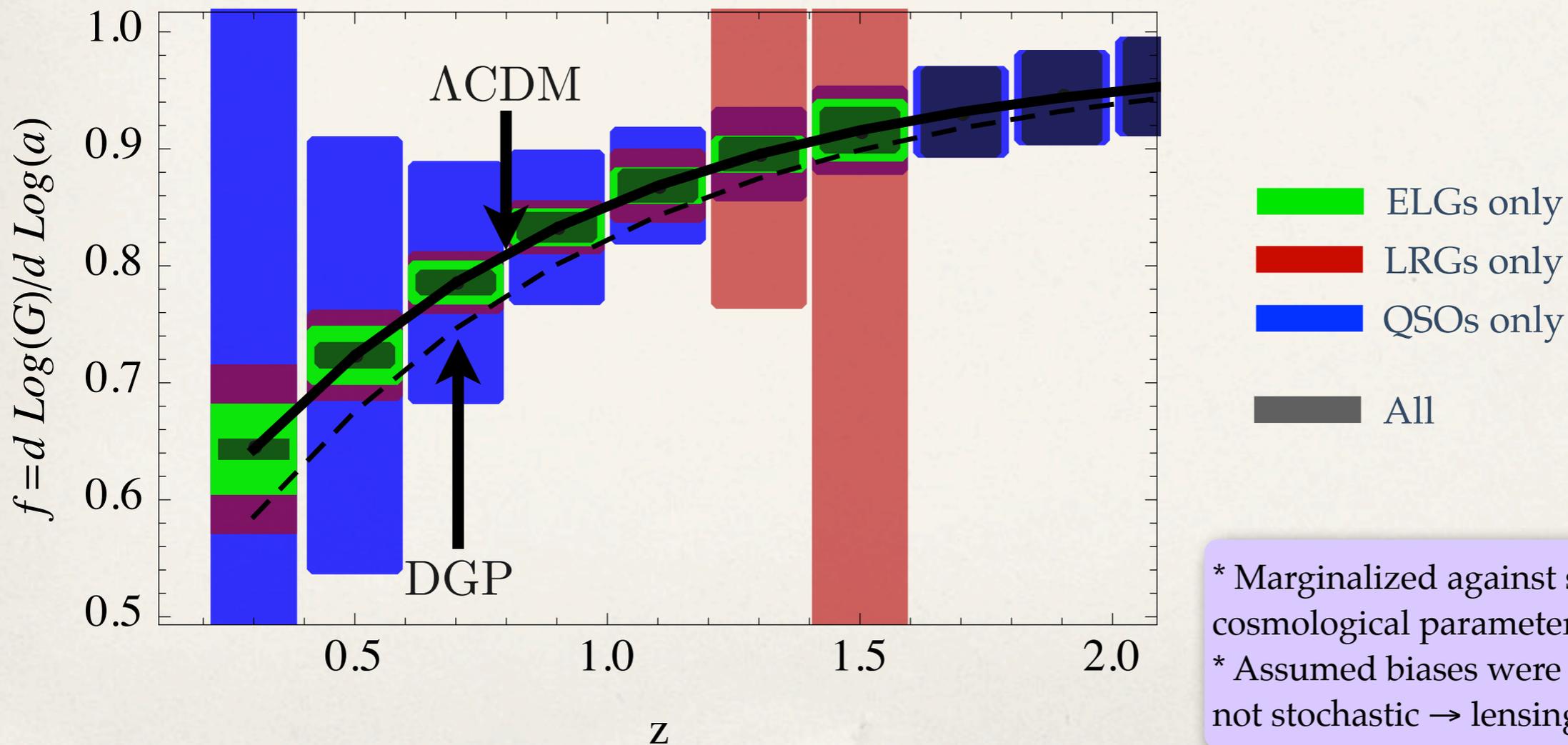
Information from the relative clusterings can improve the constraints on $f(z)$ by up to ~ 3 at low z 's!

Redshift-space distortions & modified gravity

$$\Delta G_{\mu\nu} + G_{\mu\nu} = 8\pi G T_{\mu\nu} + 8\pi G \Delta T_{\mu\nu}$$

Matter growth: $\nabla^2 \Phi = \frac{16\pi G}{3} \delta\rho - \frac{1}{6} \delta R(f_R) \implies G(z)$

$$f(z) = \frac{d \ln G}{d \ln a} = \Omega_m^\gamma(z)$$



* Marginalized against shape of P(k) & cosmological parameters
 * Assumed biases were fixed, linear and not stochastic → lensing would help a lot!

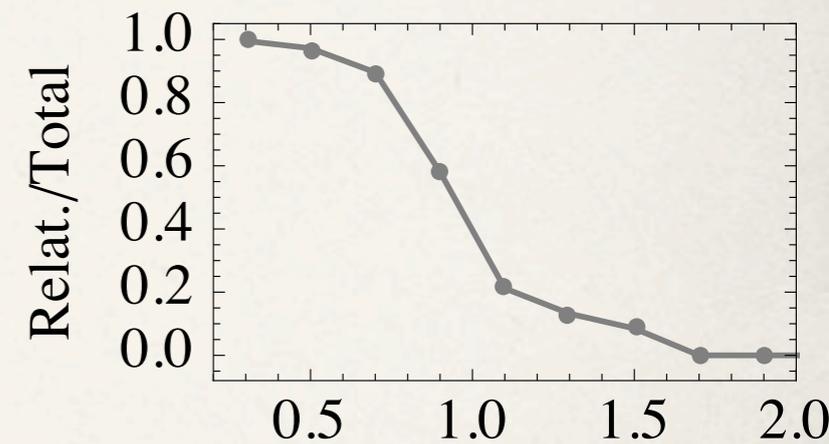
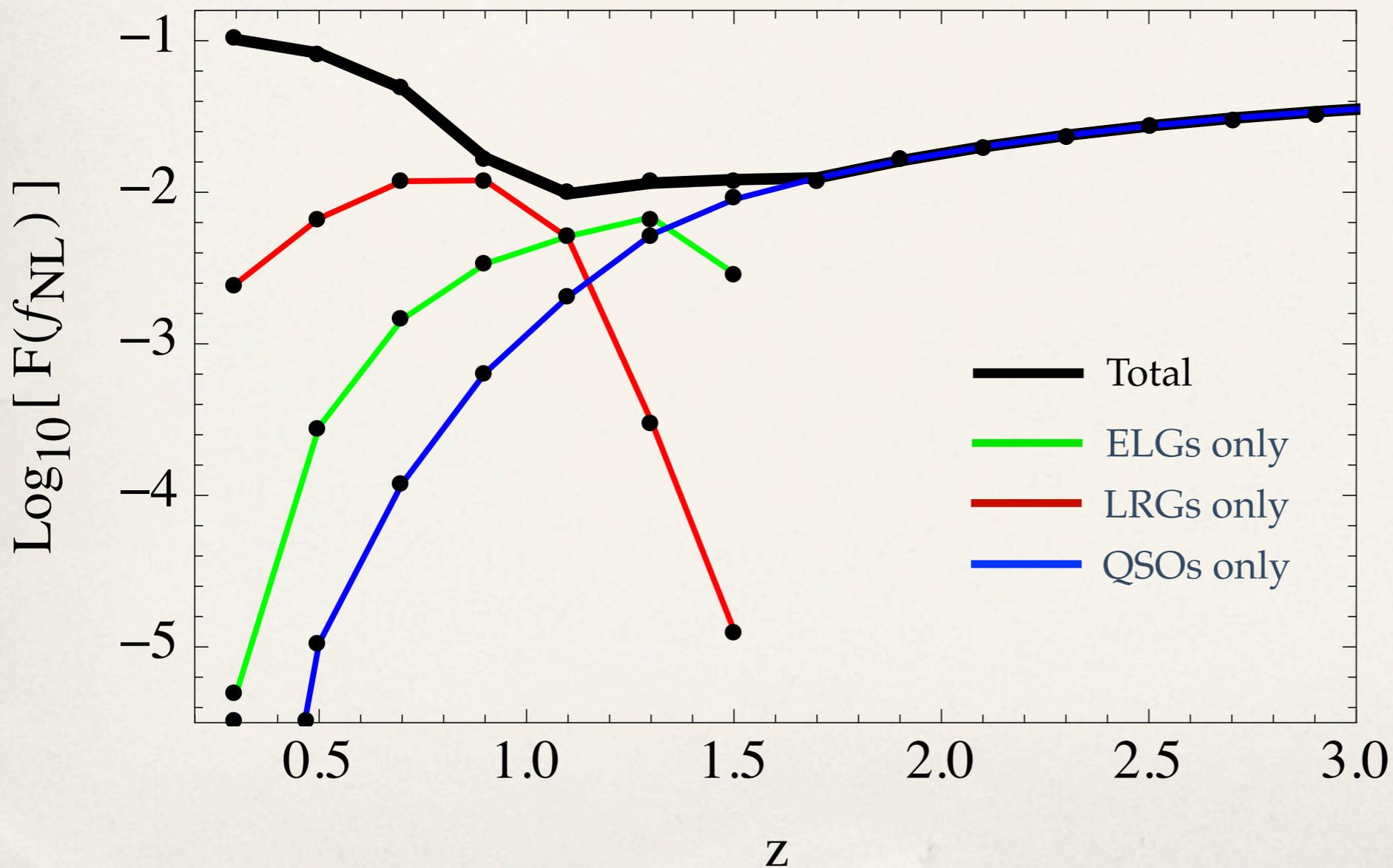
Constraints in local non-Gaussianity parameter f_{NL}

$$\mathcal{P}_g = n_g (b_g + f \mu_k^2)^2 P(k; z)$$

$$b_g \rightarrow b_g + \Delta b_g(f_{NL}, k)$$

$$F(\theta) = \frac{1}{\sigma_c^2(\theta)}$$

Prediction (and discriminator) of inflation models



Information from relative clustering can improve constraints on f_{NL} by ~ 5 at low- z !

Conclusions:

- **Cosmic variance** is a fundamental limitation **only** for measurements of the **power spectrum**
- **Multi-tracer strategies** are able to **optimally explore** the new era of **volume-limited surveys** of large-scale structure
- In particular, the multi-tracer approach can **enhance dramatically** the constraints on:
 - ★ **modified gravity** (through the RSD function f)
 - ★ **inflation** (f_{NL})
- Even BAOs can benefit: both indirectly (through marginalizations), and also directly, via enhancements of the constraints from AP tests
- Biggest challenge is covariance of biases and shot noise between tracers; we are studying those covariances with the help of N-body simulations

Forecasted distance constraints from BAOs in J-PAS

* RSDs and shape of $P(k)$ were marginalized

* Equivalent to Seo/Eisenstein “BAOs-only” method

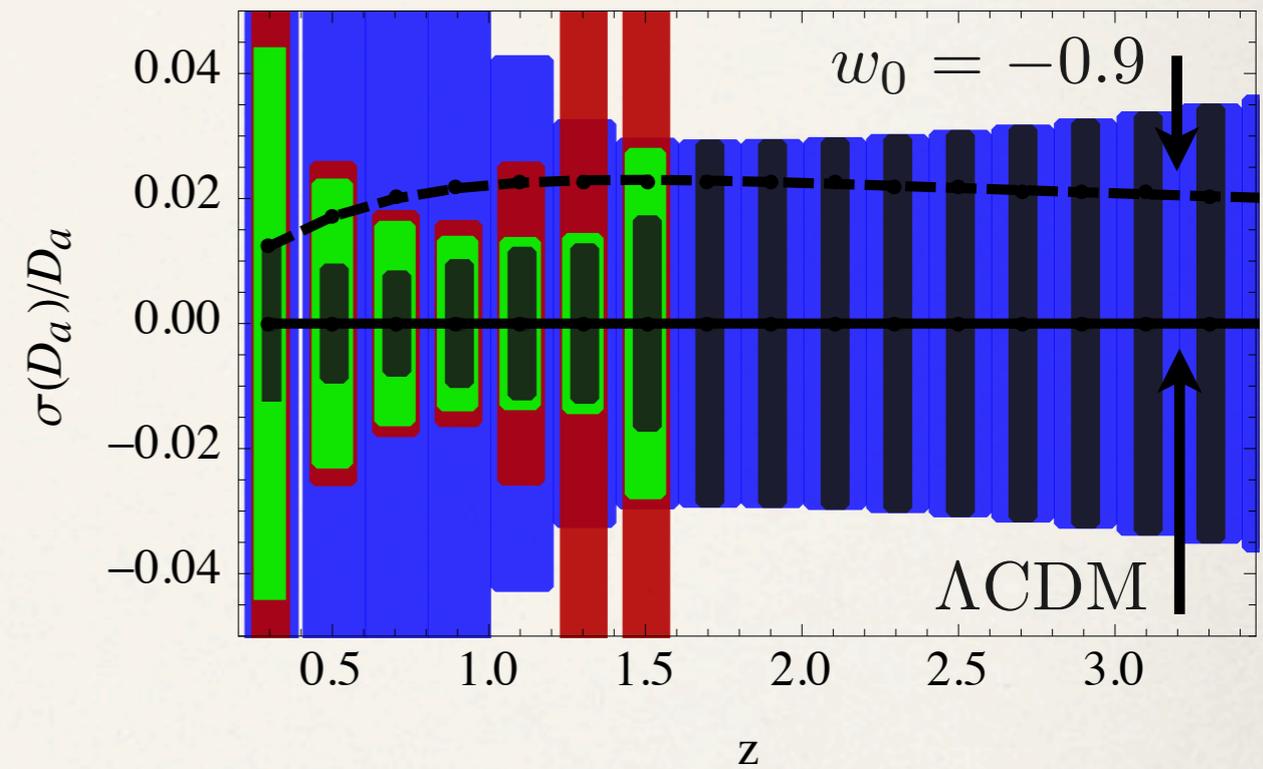
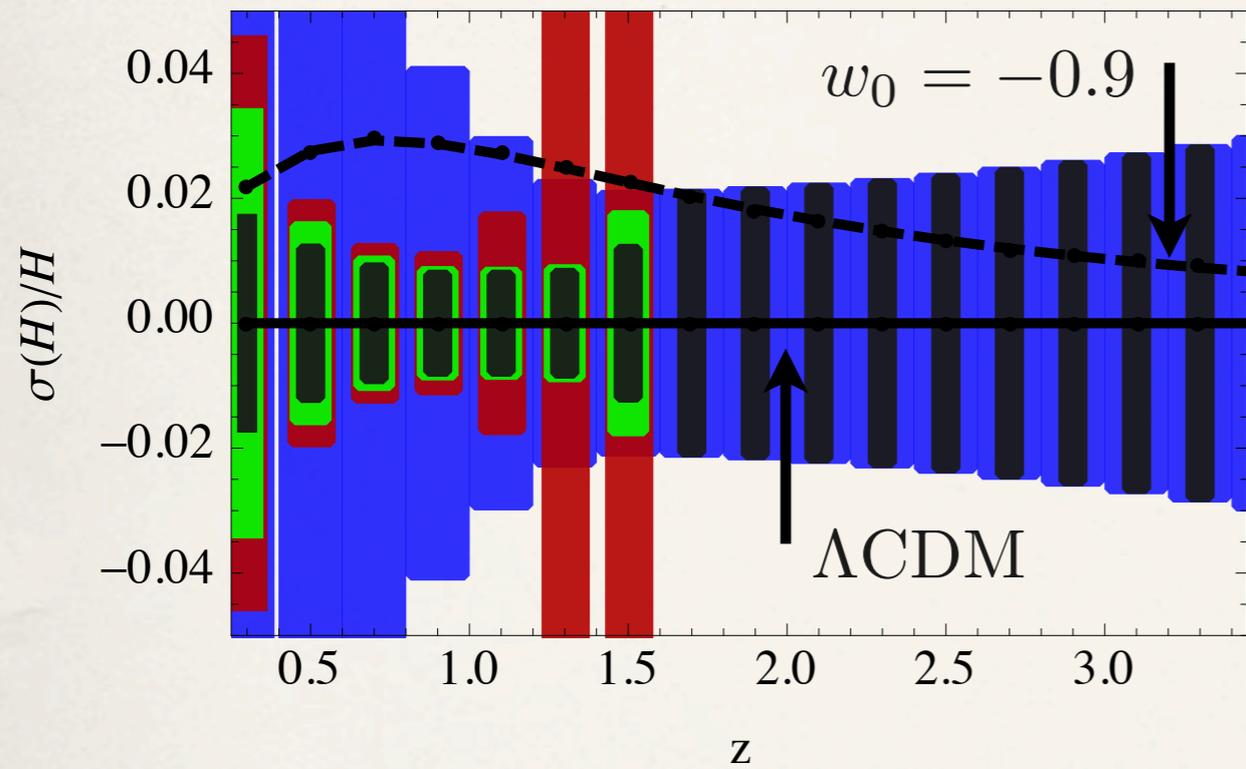
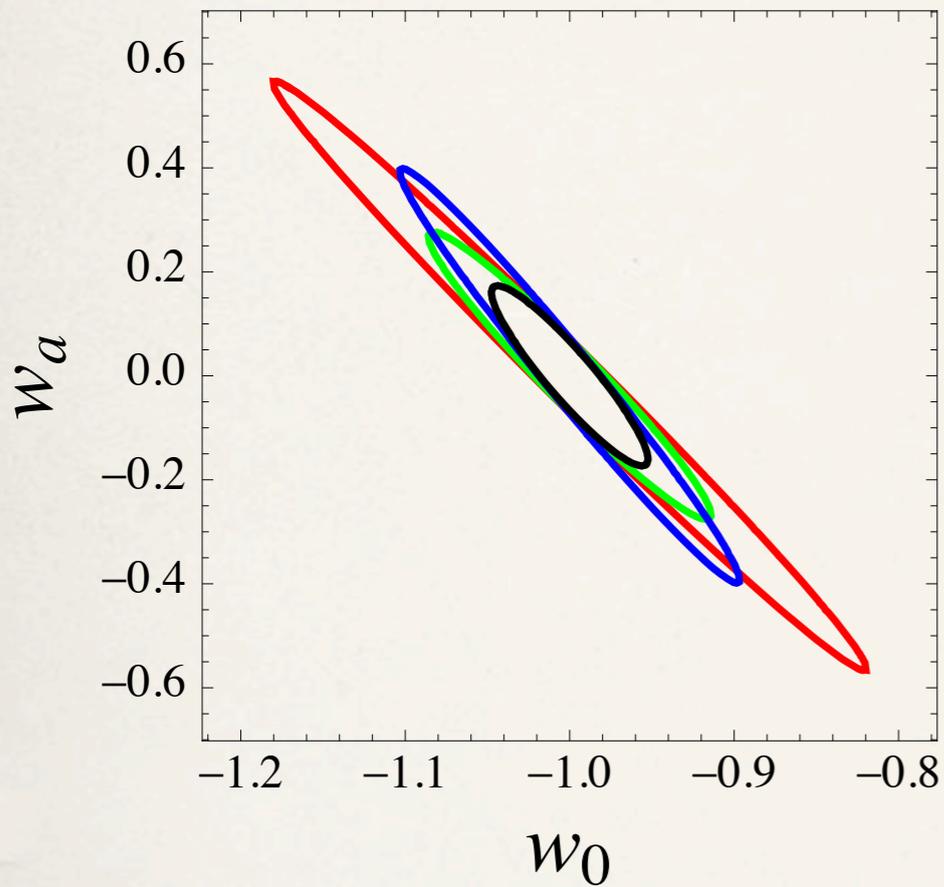
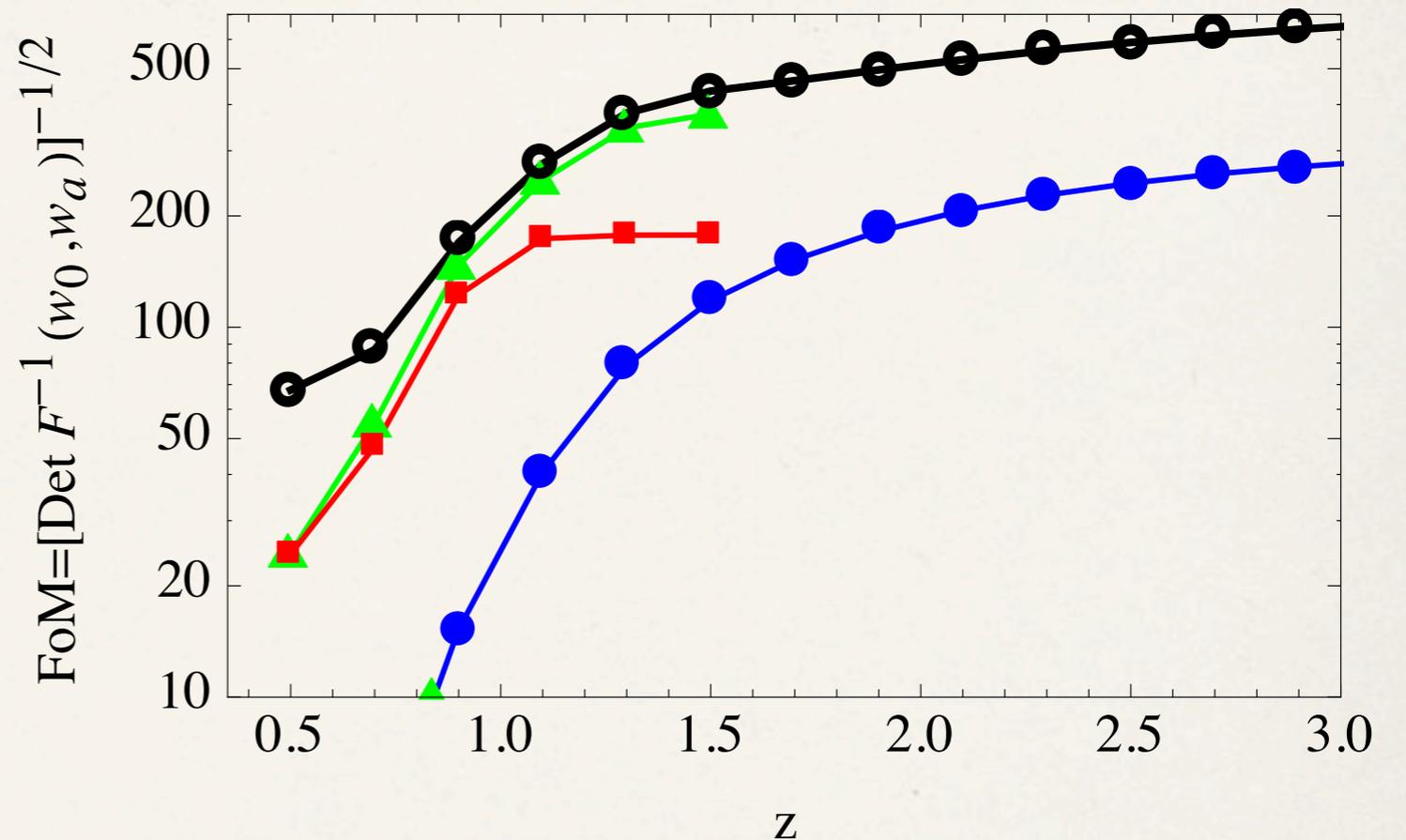


Figure of Merit for J-PAS



- ELGs only
- LRGs only
- QSOs only
- All



- * With Planck priors
- * **Marginalized** against shape of $P(k)$ & other parameters
- * RSD information was **marginalized**, but **not projected** into final set of cosmological parameters
- * **Same methods/criteria** as used for EUCLID papers