Model-independent tests of dark energy and modified gravity

How good can they get?

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Robert Crittenden, Gong-Bo Zhao, LP, Lado Samushia, Xinmin Zhang, in preparation Robert Crittenden, LP, Gong-Bo Zhao, <u>astro-ph/0510293</u>, JCAP 12 (2009) 025 Alireza Hojjati, Gong-Bo Zhao, LP, Alessandra Silvestri, Robert Crittenden, Kazuya Koyama, in preparation Gong-Bo Zhao, LP, Alessandra Silvestri, Joel Zylberberg, <u>arXiv:0905.1326</u>, Phys. Rev. Lett., 103, 241301 (2009)



C 2006. Her Majesty the Queen in Right of Canada, Natural

Cosmic Acceleration

• Beyond reasonable doubt (Nobel Prize)

• No compelling alternatives to Lambda

• Lambda already well measured

What else to measure?

• Test specific models - typically a few parameters

• Technology will allow to measure much more

• Test for deviations from Lambda. How model-independent can we be?

The quest for w

$$egin{aligned} w(a) &= rac{p_{ ext{DE}}(a)}{
ho_{ ext{DE}}(a)} \ &rac{H^2(a)}{H_0^2} &= \Omega_{ ext{r}}a^{-4} + \Omega_{ ext{M}}a^{-3} + \Omega_{ ext{k}}a^{-2} + \Omega_{ ext{DE}}\exp\left[\int_a^1 3(1+w(a'))rac{da'}{a'}
ight] \end{aligned}$$

• General w(a) – infinite # of DoF

• Principal Component Analysis can help

"Principal Components"



Principal Component Analysis of w(z)

Huterer and Starkman, astro-ph/0207517, PRL'03 Crittenden, LP, Zhao, astro-ph/0510293, JCAP'09

Discretize w(z) on a grid in z:

$$\begin{split} 1+w(z) &= \sum_{i=1}^N w_i s_i(z) \\ z_1 < z_2 ... < z_{i-1} < z_i < ... < z_N \\ s_i &= 1 \text{ if } z_i < z < z_{i+1}; \ s_i = 0 \text{ otherwise} \end{split}$$

Find the covariance matrix:

$$C_{ij} \equiv \langle (w_i - \bar{w}_i)(w_j - \bar{w}_j) \rangle \neq 0 \text{ for } i \neq j$$

Decorrelate; work with "rotated" parameters q

$$\lambda_i = \sigma^2(q_i)$$

$$C = W^T \Lambda W ; \quad \Lambda_{ij} = \lambda_i \delta_{ij}$$
 $q_i = \sum_{j=1}^N W_{ij} w_j$
 $\langle (q_i - \bar{q}_i)(q_j - \bar{q}_j) \rangle = \lambda_i \delta_{ij}$

Define eigenmodes $e(z_i)$:

$$w_i \equiv 1 + w(z_i) = \sum_{j=1}^N W_{ij}^T q_j \equiv \sum_{j=1}^N e_j(z_i) q_j$$
$$_{N \to \infty} \to 1 + w(z) = \sum_{j=1}^N e_j(z) q_j$$

Consider best constrained eigenmodes



Crittenden, LP, Zhao, astro-ph/0510293, JCAP'09

What can PCA do for you?

- Sweet spots tells what experiments measure best
- A way to compare experiments
- Storage of information can project on parameters of any w(z)

$$\frac{\partial w(z)}{\partial p^a} = \sum_i \alpha_i^a e_i(z)$$
$$F_{ab} = \alpha_i^a F_{ij} \alpha_j^b = \sum_i \alpha_i^a \alpha_i^b \lambda_i$$

Crittenden, LP, Zhao, astro-ph/0510293, JCAP'09

PCA Equation Editor					
Equation Window Configuration					
w0+(1-a)*wa	Backspace	Variable: O z 💿 a 🛛 Insert			
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Priors (fiducial values shown) Omega bh2 (0.022) 0 H (70 km/s/Mpc) 0 Tau Omega ch2 (0.12) 0 ns (0.963) 0 w	 ✓ CMB □ GC ✓ GCxCMB □ WLxGC □ WL □ SN □ WLxCMB Find Covariance 				
O O O Results					
CombinedCovariance					
CMB + GC×CMB					
w0 wa		0.676450792448 1.72946362075			
	Matrix 0.4575 -1.123	85674604 -1.12359317791 59317791 2.99104441548			

written by Thomas Wintschel, SFU undergraduate

Issues with PCA

ALL

- Which modes are informative?
 Fitting all bins/eigenmodes to data is not an option
 Throwing away poor modes means we assume their amplitudes are 0
 SN CMB GC WL GCXCMB WLXCMB WLXCMB WLXCM
- A prior is inevitable

Choosing a prior on binned w

$$\mathcal{P}(\mathbf{w}|\mathrm{data}) = \mathcal{P}(\mathrm{data}|\mathbf{w}) \times \mathcal{P}_{\mathrm{prior}}(\mathbf{w})$$

$$\chi^2 = \chi^2_{\rm data} + \chi^2_{\rm prior}$$

$$\chi^2_{\mathrm{prior}} = -2 \ln \mathcal{P}_{\mathrm{prior}} = (\mathbf{w} - \mathbf{w}^{\mathrm{fid}})^T \mathbf{C}^{-1} (\mathbf{w} - \mathbf{w}^{\mathrm{fid}})$$

What about an independent prior on each bin? $C_{ij}^{-1}=\sigma_i^{-2}\delta_{ij}$ Albrecht et al (JDEM FoM SWG), arXiv:0901.0721

- implies w uncorrelated at neighboring z's, no matter how close
- implies that ALL modes are EQUALLY likely
- the meaning/strength is tied to the bin size
- MCMC takes long time to converge

- Choice of the bin size is a prior assumes that w is smooth inside
- Binning => a sharp transition from perfect correlation inside the bin to no correlation outside the bin

Smoothness prior

• Let's make the smoothness prior explicit and independent of the binning. Start with a correlation function:

$$\xi_w(|a-a'|) \equiv \left\langle [w(a) - w^{\text{fid}}(a)][w(a') - w^{\text{fid}}(a')] \right\rangle$$

• Make a reasonable (not unique) choice of a functional form:

$$\xi_w(\delta a) = \frac{\xi_w(0)}{1 + (\delta a/a_c)^2} \qquad \delta a \equiv |a - a'|$$

Correlation functions



From correlation function to correlated prior

$$C_{ij}\equiv \langle \delta w_i \delta w_j
angle = rac{1}{\Delta^2} \int_{a_i}^{a_i+\Delta} da \int_{a_j}^{a_j+\Delta} da' \xi_w (|a-a'|).$$

 $\delta w_i = w_i^{\rm true} - w_i^{\rm fid}$

$$\mathcal{P}_{\mathrm{prior}}(\mathbf{w}) \propto e^{-(\mathbf{w} - \mathbf{w}^{\mathrm{fid}})^T \mathbf{C}^{-1} (\mathbf{w} - \mathbf{w}^{\mathrm{fid}})/2}$$

- Two control parameters: "correlation scale" $\mathbf{a}_{\rm c},$ and the variance in the mean w

$$\sigma_{\bar{w}}^2 \equiv \int_{a_{\min}}^1 \int_{a_{\min}}^1 \frac{da \ da' \ \xi_w(a-a')}{(1-a_{\min})^2} \simeq \frac{\pi\xi(0)a_c}{1-a_{\min}}$$

Eigenmodes and eigenvalues of the correlated prior



Data meets Prior EUCLID-like SN, H(z); Planck CMB prior



Surviving data eigenmodes



Reconstruction examples





Advantages of the correlated prior approach

- Controlled reconstruction bias high frequency features determined by the prior, low frequency by the data
- This is NOT a low-pass filter !!
- Can perform a PCA forecast to tune the prior



- Independent of the binning scheme
- Fast convergence of MCMC chains with any number of bins

Beyond w

Testing Gravity on Cosmological Scales

because we can

Linear perturbations in FRW universe:

$$ds^{2} = -a^{2}(\eta) \left[(1 + 2\Psi(\vec{x}, \eta)) d\eta^{2} - (1 - 2\Phi(\vec{x}, \eta)) d\vec{x}^{2} \right]$$

$$D_{\mu}T^{\mu\nu} = 0 \longrightarrow \begin{cases} \delta' + \frac{k}{aH}V - 3\Phi' = 0 \\ V' + V - \frac{k}{aH}\Psi = 0 \end{cases}$$

General Relativity

$$k^2\Phi$$
 = $k^2\Phi$ = $-4\pi Ga^2
ho\Delta$ $-4\pi Ga^2
ho\Delta$
 $k^2(\Phi-\Psi)$ = Φ = Ψ

More generally

$$k^2 \Psi = -\mu(a,k) 4\pi G a^2 \rho \Delta$$

 $\frac{\Phi}{\Psi} = \eta(a,k) [= \gamma(a,k)]$

GR+ Λ CDM: $\mu = \eta = 1$

• E.g. chameleon scalar-tensor and f(R) models:

$$S_E = \int d^4x \sqrt{-\tilde{g}} \left[\frac{M_P^2}{2} \tilde{R} - \frac{1}{2} g^{\tilde{\mu}\nu} (\tilde{\nabla}_{\mu}\phi) \tilde{\nabla}_{\nu}\phi - V(\phi) \right] + S_i \left(\chi_i, e^{-\kappa\alpha_i(\phi)} \tilde{g}_{\mu\nu} \right)$$

$$\begin{split} \mu(a,k) &\approx e^{-\kappa\alpha(\phi)} \frac{1 + \left(1 + \frac{1}{2}{\alpha'}^2\right) \frac{k^2}{a^2 m^2}}{1 + \frac{k^2}{a^2 m^2}} \\ \eta(a,k) &\approx \frac{1 + \left(1 - \frac{1}{2}{\alpha'}^2\right) \frac{k^2}{a^2 m^2}}{1 + \left(1 + \frac{1}{2}{\alpha'}^2\right) \frac{k^2}{a^2 m^2}} \end{split}$$

in f(R)
$$lpha'=rac{dlpha}{d\phi}=\sqrt{rac{2}{3}}$$

The linear growth factor in f(R)



LP and A. Silvestri, arXiv:0709.0296, PRD'08

An alternative choice

$$k^{2}(\Psi + \Phi) = -\Sigma(a, k)8\pi Ga^{2}\rho\Delta$$
$$\frac{\Phi}{\Psi} = \eta(a, k)$$

$$\mu = \frac{2\Sigma}{\eta + 1}$$

• Chameleon, f[R]
$$\Sigma(a,k) = e^{-\kappa\alpha(\phi)}$$
$$\eta(a,k) = \frac{1 + \left(1 - \frac{1}{2}{\alpha'}^2\right)\frac{k^2}{a^2m^2}}{1 + \left(1 + \frac{1}{2}{\alpha'}^2\right)\frac{k^2}{a^2m^2}}$$

• Degravitation, DGP (from Afshordi, Geshnizjani, Khoury, JCAP'09)

$$\Sigma(a,k) = \frac{1}{1 + (kr_c/a)^{2(\alpha-1)}}$$

$$\eta(a,k) = \frac{1 + (D-2)(Hr_c)^{2(1-\alpha)} \left(1 + \frac{\dot{H}}{3H^2}\right)}{(D-3) + (D-2)(Hr_c)^{2(1-\alpha)} \left(1 + \frac{\dot{H}}{3H^2}\right)}$$

Some remarks

- $\mu(a,k)$ and η (a,k) describe a general departure from GR on linear scales (perhaps too general)
- They can represent SOLUTIONS of theories depend on the theory AND the initial conditions
- Implemented in MGCAMB (A. Hojjati, G-B. Zhao, LP, 1106.4543)

http://www.sfu.ca/~aha25/MGCAMB.html

Observations

- Supernovae, BAO: expansion history
- CMB: expansion history, ISW $(\Phi+\Psi)'$, weak lensing $(\Phi+\Psi)$
- Weak Lensing of galaxies: $(\Phi + \Psi)$

• Galaxy Number Counts: Δ (upto bias)

• Peculiar velocities via z-space distortions: Ψ

Complementarity



WMAP; SN; ISW/Galaxy X-corr; CFHTLS-Wide T003 (Fu et al, 2008); SDSS DR7 peculiar velocity dispersion

Y.-S. Song, G.-B. Zhao et al, arXiv:1011.2106

- Today's data constrains at best one or two numbers, depending on the assumptions
- μ and η are unknown functions of time and scale
- What can we learn about them in a modelindependent way, e.g. with DES and LSST?

Planck+LSST

	ΕT	G1 G10	WL1 WL6
Е	СМВ		
Т	(3)	CMB/Gal (10)	CMB/WL (6)
G1 G10		Gal/Gal (55)	Gal/WL (60)
WL1			WL/WL
WL6			(21)

PCA forecast for $\mu(z,k)$ and $\eta(z,k)$

Zhao, LP, Silvestri, Zilberberg, **arXiv:0905.1326**, PRL'09 Hojjati, Zhao, LP, Silvestri, Crittenden, Koyama, in preparation

- Discretize μ and η on a (z,k) grid
- Treat each pixel, μ_{ij} and $\eta_{ij},$ as a free parameter
- Discretize w(z) on the same z-grid and treat w_i as free parameters
- Also vary the 6 "vanilla" parameters: Ω_c , Ω_b , h, n_s , A_s , τ and linear bias parameters: one for each redshift bin
- Calculate the Fisher Matrix to forecast the error matrix of \sim 840 parameters



Principal Component Analysis (of μ)

• Diagonalize the μ block of the covariance matrix to find uncorrelated combinations of pixels μ_{ii} - the eigenmodes



- Some eigenmodes are well-constrained, most are not
- Equivalent to expanding $\mu(z,k)$ into an orthonormal basis:

$$\mu(z,k) - 1 = \sum_{m} \alpha_{m} e_{m}(z,k)$$

• PCA provides variances of uncorrelated parameters $\boldsymbol{\alpha}_m$

What do we gain with PCA?

- # of well-constrained modes \sim # of new parameters
- "Sweet spots" in (k,z) space
- Information storage can ``project" on parameters of other models

$$\frac{\partial \mu(a,k)}{\partial p^a} = \sum_i \alpha_i^a e_i(a,k).$$



$$F_{ab} = \alpha_i^a F_{ij} \alpha_j^b = \sum_i \alpha_i^a \alpha_i^b \lambda_i.$$





Principal Component Number

Eigenmodes of $\boldsymbol{\Sigma}$





Can we still measure w(z)?



What we have done

• Studied the parameter degeneracies

- Studied impact of some of the WL systematic effects
- Projected constraints on f(R) model
- Compared DES and LSST

Summary

- Future surveys can test GR in a model-independent way
- Combining different probes brakes degeneracies between modified gravity parameters, makes it possible to differentiate among theoretical proposals
- Particularly sensitive to <u>scale-dependent</u> modifications (which most modified gravity models predict)
- Using simple parameters can miss information in data
- Need to develop a set of "reasonable" theoretical priors.