Constraining growth rate from SNIa peculiar velocities and galaxy density field

Corentin Ravoux - LPCA Clermont-Ferrand

with Bastien Carreres, Damiano Rosselli, Julian Bautista, Benjamin Racine, Dominique Fouchez, Fabrice Feinstein and many others

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Duke

Dark Energy



• What is the nature of dark energy?

Dark Energy

- What is the nature of dark energy?
- Cosmological constant model (Λ) not very satisfying

Recent DESI DR2 BAO + CMB + SNIa results: stronger hints for varying dark energy



Dark Energy

- What is the nature of dark energy?
- Cosmological constant model (Λ) not very satisfying
- Other models :
 - Fifth force, additional field ?
 - Modified gravity theories ?
- **Current objective**: Probing largescale structure formation to constrain dark energy/modified gravity.



- Matter perturbations in the primordial Universe grew to form the cosmic web
- Static description: matter density contrast (δ) follows a linear power spectrum at large-scales
- **Dynamic description**: Cosmic web peculiar velocities (v_p) caused by gravitation





fo8 parameter

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• Linear perturbation theory:



fo8 parameter



Measuring fo8

Peculiar velocities (PV)

• Direct estimation of velocities

$$1+z_{
m obs} = (1+z_{
m cos})(1+v_{
m p}/c)$$

- Need an estimate of redshift (z_{obs}) and distance (decoupling z_{cos} from v_{p})
- Compute statistics from PV

Redshift Space Distortions (RSD)

- Impact of PV on measurements
- **Example**: galaxy autocorrelation, void crosscorrelation, ...



$f\sigma 8$ constraints

- Constrain modified gravity models
- **RSD** very effective for high redshift
- **PV** for low redshift
- Improvement with method combination



ACCEL² simulation

fo8 measurement with peculiar velocities

- Standard candle =
 - object with fixed luminosity
- Luminosity + Redshift gives distance











"Not-so" standard candles

Tully-Fisher relation

- Spiral galaxies (Late-type)
- Absolute magnitude (M) / rotational velocity (W)

 $M = a + b \log W$

 Baryonic TF: Stellar and gas mass instead of magnitude (lower relation dispersion)

$$\sigma_{D}/D \sim 20\%$$

Fundamental plane relation

- Elliptical galaxies (Early-type)
- Effective radius (Re) / surface brightness
 (Ie) / stellar velocity dispersion (σ)

$$\log R_e = a \log \sigma + b \log I_e + c$$

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Most standard candle: Type la supernovae

• **SNe Ia**: Thermonuclear explosion in a binary system with a white dwarf reaching Chandrasekhar mass



 $\sigma_D/D\sim7\%$

Most standard candle: Type la supernovae

• Distance modulus:

 $\mu_{\mathrm{obs},i}=m_{\mathrm{B},i}-M_{\mathrm{B},i}$

 SNe la standardization = Tripp relation



Parameters

common for all

SN la

Most standard candle: Type Ia supernovae

• Hubble residuals:

$$egin{aligned} \Delta \mu_i &= \mu_{ ext{obs},i} - \mu_{ ext{model}}(z_{ ext{obs},i}) \ &= \mu_{ ext{obs},i} - 5\log\left(rac{d_{ ext{L}}(z_{ ext{obs},i})}{10 ext{pc}}
ight) \end{aligned}$$

• Velocity estimator:

$$\hat{v}_i = -rac{\ln(10)c}{5}\left(rac{\left(1+z_i
ight)c}{H\left(z_i
ight)r\left(z_i
ight)}-1
ight)^{-1}\Delta\mu$$



PV and RSD constraint methods

• Growth rate measurement methods with peculiar velocities:



ACCEL² simulation

Likelihood-based field-level inference Carreres et al. 2023 Ravoux et al. 2025

Likelihood-based field-level estimator

- **Purpose**: Maximizing or sampling a likelihood computed from all coordinates of the data
- *p* = fitted parameters: simultaneously cosmology (fσ8) and field parameters (e.g., Hubble diagram parameters α, β, M0 for SN)

$$\mathcal{L}(p) \propto \exp \left[-\frac{1}{2}v^{T}(p)C_{vv}(p)^{-1}v(p)\right]$$

Parameters Velocity from SNe Ia Field covariance matrix computed
from theory and SNe Ia coordinates

Computing the field covariance





Full field covariance matrix

General covariance calculation

• **Objective**: Improve/Extend the likelihood-based modeling

$$egin{aligned} C_{
m ab}(\mathbf{r_1},\mathbf{r_2}) &= rac{1}{(2\pi)^3} \int_{\mathbf{k}} P_{
m ab}(k,\mu_1,\mu_2) e^{i\mathbf{k}.\mathbf{r}} d^3 \mathbf{k} \ P_{
m ab}(k,\mu) &= \sum_n w_{
m ab,n} F_{
m ab,n}(k,\mu) \mathcal{P}_{
m ab,n}(k) \end{aligned}$$

- General form of field power spectrum
- Algorithmically-oriented calculations (Hankel transforms)
- Wide-angle effect accounted in the integration



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• Express power spectrum model in a general way:

$$P_{\rm ab}(k,\mu) = \sum_{n} w_{\rm ab,n} F_{\rm ab,n}(k,\mu) \mathcal{P}_{\rm ab,n}(k)$$
Parameters
to fit
Terms to integrate
analytically
Power spectra
terms to integrate
numerically
$$P_{\rm vv} = (f\sigma_8)^2 \times \left(a^2 H^2 \frac{\mu^2}{k^2}\right) \times \left(P_{\theta\theta}(k) D_u^2(k,\sigma_u)\right)$$

• Without loosing generality we can express the covariance:

$$C_{
m ab}({f r_1,r_2}) = \sum_n w_{
m ab,n} \sum_\ell N_{
m ab,\ell}(\phi) \mathcal{H}_\ell \left[\mathcal{P}_{
m ab,n}(k) M_{
m ab,n}^\ell(k)
ight](r)$$

$$egin{aligned} N_{ ext{ab},\ell}(\phi) &= (2\ell+1) L_\ell(\cos{(\pi-\phi)}) \ M_{ ext{ab},n}^\ell(k) &= rac{1}{2} \int_{-1}^1 d\mu' F_{ ext{ab},n}(k,\mu') L_\ell(\mu') \end{aligned}$$

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m ab,n}(k) M_{
m ab,n}^\ell(k)
ight](r)$$

Linear sum of matrix with parameters to fit as coefficients

• Without loosing generality we can express the covariance:

$$C_{
m ab}({f r_1,r_2}) = \sum_n w_{
m ab,n} \sum_\ell N_{
m ab,\ell}(\phi) {\cal H}_\ell \left[{\cal P}_{
m ab,n}(k) M_{
m ab,n}^\ell(k)
ight](r)$$

Hankel transform

$$\mathcal{H}_\ell\left[f(k)
ight](r)=i^\ell\int_0^\infty rac{k^2 dk}{2\pi^2}j_\ell(kr)f(k)$$

• **Most important part**: Algorithmically optimized way to compute power spectrum integral, with FFTLog algorithm

• Without loosing generality we can express the covariance:

$$C_{
m ab}({f r_1,r_2}) = \sum_n w_{
m ab,n} \sum_\ell N_{
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Terms pre-computed analytically with symbolic code generaltion

More complicated formalism derived and implemented for wide-angle

flip Field Level Inference Package

• python package for likelihood-based field-level inference:

https://github.com/corentinravoux/flip

Flip article: **arxiv:2501.16852**

- Fast generation of field covariance
- MCMC and Minuit to fit $f\sigma 8$
- General expression for vectors (SNIa, density, log distance, TF, FP...)



Contributors: Bastien Carreres, Damiano Rosselli and Alex G. Kim

Field covariance models

 Model comparison on a regular coordinate grid (*Adams* & Blake 2017, Adams & Blake 2020, Lai et al. 2022)

 New wide-angle model developed (RC25): improved stability in integration and for wider fitting parameter ranges



Validating *flip*

• Field covariance comparison with *pairV* Anthony Carr & David Parkinson





Model validated on N-body simulations
 Tyann Dummerchat

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Survey dependent Fisher forecast

- Field covariance matrix accounts for survey geometry
- Comparing ZTF simulation (*Carreres et al. 2023*) with Fisher forecasts
- Error ~ 30% closer to likelihood-based than standard Fisher



Damiano Rosselli

ACCEL² simulation

fo8 constraints on ZTF & LSST simulations

Carreres et al. 2023 Carreres et al. in prep. Rosselli et al. in prep.

Zwicky Transient Facility (ZTF)

- ZTF = high-cadence photometric telescop in the Palomar observatory
- Very large field of view (47 deg²)
- Observing 3/4 of the sky every nights with 3 filters (g, r, i)



Zwicky Transient Facility (ZTF)

- **Transient sky**: Supernovae, gamma ray burst, tidal distruptive events, comets, asteroids
- Dedicated spectroscopic telescope measuring transient spectra (SEDmachine)
- Latest release: More than 3000 classified supernovae of type la



Rubin - LSST



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Rubin - LSST: instrument

- Largest numerical camera in the world: 3.2 Gpixels with 2s readout time
- 8.4 m primary mirror and 9.6 deg² field of view
- 6 filters: (u, g, r, i, z, y)
- 10-year photometric survey of half of the sky (~ 20 000 deg²)



LSST survey: science

Dark matter & Dark energy

- Strong & Weak lensing
- BAO (angular and photo-z)
- Clusters, Supernovae cosmology





Solar System science

- Comets & asteroids
- Small body census

Mapping the Milky Way

- Structure and evolution
- Stellar properties





Transient sky

- Supernovae, variable stars
- Rare events (kilonovae, TDE)
- New classes of transients

SN Ia simulation and analysis



snsim

- **Survey parameters:** Cadence (ZTF, LSST), CCD gain, zero point, sky noise
- **SN Ia model:** Rate, SED, color, stretch, intrinsic scattering distributions, light-curve parameters
- Host catalog: Use velocities and associated clustering from N-body simulation



https://github.com/bastiencarreres/snsim

Main contributors:

Bastien Carreres, Damiano Rosselli



- 27 realizations from OuterRim (*Heitmann et al. 2019*) sub-volumes
- ZTF 6 years simulations
- Cadence from ZTF logs
- Instrumental characterization
- Detection efficiency cuts: ZTF and SEDmachine detection



ZTF results

- SN Ia selection bias causes velocity & fo8 bias at high redshift
- No fσ8 error bar improvement even with correction
- Maximum redshift usable: z=0.06



ZTF results

- fσ8 fit performed with Hubble diagram parameters
- no fσ8 bias on the 27 simulations
- 19 % precision measurement with only 1600 SNe Ia





LSST simulations

- 10 year simulation from Uchuu-UniverseMachine (*Behroozi et al. 2019*)
- Cadence and instrument properties from the observing strategy simulation v3.3





LSST simulations

- **SN host redshift efficiency** (C. Ravoux, P. Gris, D. Rosselli, J. Bautista):
 - Use of DC2 LSST simulation with galaxy properties
 - Footprint and efficiency for different spectroscopic survey
 - Considering SNe variety contamination







LSST simulations

- **33,000 SNe Ia** with spectro-z at z < 0.16 (among 1M for the full sample)
- Photo-typing with *SuperNNovae* (*Moller et al.* 2019) gives 0.02% contamination from peculiar SN



LSST results

- Unbiased fo8 measurement with full Hubble diagram fit over 3 redshift points
- Full study on the impact of peculiar SN contamination



How we can do better ? Combination of PV with RSD

0.50

0.45

0.40

 $\sigma_{f_0}^{0.35}/(f_0^{0.35})$

0.20

0.15

0.10

0.04

0.05

0.06

0.07

0.08

Zobs

Combining DESI galaxy density and ZTF SNIa velocities on simulation

Ravoux et al. in prep.



DESI

- 4m muti-object spectrograph at Kitt Peak Observatory
- 5000 robotic fiber positioners
- BAO and RSD measurements
- 40 M extra-galactic objects at Y5





DESI x ZTF simulation

- 27 simulations from AbacusSummit (*Maksimova et al. 2019*)
- **Density**: DESI Bright Galaxy Survey (BGS) clustering matching for Y5 (J. Bautista, A. Smith)
- **Velocity:** ZTF SNIa Y6 simulation performed (following *Carreres et al. 2023*)





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ZTF velocity fit

- Velocity fit including Hubble diagram parameters to reproduce *Carreres et al. 2023*
- Variation of analysis parameters (max redshift, SNIa density...)



 $f\sigma_8 = 0.48^{+0.09}_{-0.08}$ Emcee contours Minuit fit Truth $= 192.2^{+74.4}_{-95.4}$ 100 Ъ $= 0.132^{+0.003}_{-0.003}$ $= 2.99^{+0.03}_{-0.02}$ 50:0:0:0: .0:0:0:0: Θ $M_0 = -19.16^{+0.01}_{-0.01}$

- Density grid with *pypower*
- Test varying **all density gridding parameters**: grid size, mesh cell size, interpolation scheme (ngc, cic, tsc, pcs), footprint (Y5 or full)
- Mean minuit fit on 27 mocks with average error bar



DESI x ZTF joint fit

• For velocity x density, use of a new wide-angle model implemented in *flip*

$$egin{aligned} & \left[P_{
m gg} = \left[b^2 P_{
m mm}(k) + bf(\mu_1^2 + \mu_2^2) P_{
m m heta}(k) + f^2 \mu_1^2 \mu_2^2 P_{ heta heta}(k)
ight] \exp\left[rac{-k^2 (\mu_1^2 + \mu_2^2) \sigma_{
m g}^2}{2}
ight] \ & P_{
m gv} = iaHrac{\mu_2}{k^2} \left(bf P_{
m m heta}(k) + f^2 \mu_1^2 P_{ heta heta}(k)
ight) \exp\left[rac{-k^2 \mu_1^2 \sigma_{
m g}^2}{2}
ight] D_u(k,\sigma_u) \ & P_{
m vv} = (aHf)^2 rac{\mu_1 \mu_2}{k^2} P_{ heta heta}(k) D_u^2(k,\sigma_u) \end{aligned}$$

$$ightarrow C_{
m ab}({f r_1,r_2}) = rac{1}{(2\pi)^3} \int_{f k} P_{
m ab}(k,\mu_1,\mu_2) e^{i{f k.r}} d^3{f k}$$





Different density configurations

Adding density improves fs8 constraints up to 30%

Conclusion

- Large modeling and simulation preparatory work for ZTF, LSST and combination with density fields
- Dedicated sofware for simulation (snsim) and analysis (flip)
- Next steps:
 - Tests on Pantheon+ data (Anthony Carr, KASI), DEBASS data (Bastien Carreres, Duke) and ZTF data (Raphael Kebadian, CPPM)
 - Implementation of non-linear models (EFTofLSS)
 - Combination with other velocity tracers (TF, FP)





AB17 (Adams & Blake 2017) - Wide-angle model without RSD on density				
Fields ab	Term number n	W _{ab,n}	$F_{\mathrm{ab},n}$	${\cal P}_{{ m ab},n}$
88	0	$(b\sigma_8)^2$	1	$P_{\rm mm}(k)$
gv	0	$b\sigma_8 f\sigma_8$	$(iaH)\frac{\mu_2}{k}$	$P_{\mathrm{m}\theta}(k)D_{\mathrm{u}}(k,\sigma_{\mathrm{u}})$
vv	0	$(f\sigma_8)^2$	$(aH)^2 \frac{\mu_1 \mu_2}{k^2}$	$P_{\theta\theta}(k)D_{\rm u}^2(k,\sigma_{\rm u})$
AB20 (Adams & Blake 2020) - Plane-parallel model with RSD on density				
Field ab	Term n	Wab,n	$F_{\mathrm{ab},n}$	$\mathcal{P}_{\mathrm{ab},n}$
	0	$(b\sigma_8)^2$	$\exp\left[-(k\sigma_{\rm g}\mu)^2\right]$	$P_{\rm mm}(k)$
88	1	$(b\sigma_8)^2\beta_f$	$2\mu^2 \exp\left[-(k\sigma_g\mu)^2\right]$	$P_{\mathrm{m}\theta}(k)$
	2	$(b\sigma_8)^2\beta_f^2$	$\mu^4 \exp\left[-(k\sigma_g\mu)^2\right]$	$P_{\theta\theta}(k)$
gv	0	$b\sigma_8 f\sigma_8$	$(iaH)\frac{\mu}{k}\exp\left[-\frac{(k\sigma_{g}\mu)^{2}}{2}\right]$	$P_{\mathrm{m}\theta}(k)D_{\mathrm{u}}(k,\sigma_{\mathrm{u}})$
	1	$(f\sigma_8)^2$	$(iaH)\frac{\mu^3}{k}\exp\left[-\frac{(k\sigma_g\mu)^2}{2}\right]$	$P_{\theta\theta}(k)D_{\rm u}(k,\sigma_{\rm u})$
vv	0	$(f\sigma_8)^2$	$(aH)^2 \frac{\mu^2}{k^2}$	$P_{\theta\theta}(k)D_{\rm u}^2(k,\sigma_{\rm u})$
L22 (Lai et al. 2022) - Wide-angle model with RSD and Taylor expansion of FoG				
Field ab	Term n	Wab,n	$F_{\mathrm{ab},n}$	$\mathcal{P}_{\mathrm{ab},n}$
	0, <i>m</i>	$(b\sigma_8)^2\sigma_g^{2m}$	$\sum_{p,q,p+q=m} \left(\frac{(-1)^{p+q}}{2^{p+q}p!q!} \right) k^{2(p+q)} \mu_1^{2p} \mu_2^{2q}$	$P_{\rm mm}(k)$
88	1, <i>m</i>	$(b\sigma_8)^2 \beta_f \sigma_g^{2m}$	$\sum_{p,q,p+q=m} \left(\frac{(-1)^{p+q}}{2^{p+q}p!q!} \right) k^{2(p+q)} \mu_1^{2p} \mu_2^{2q} (\mu_1^2 + \mu_2^2)$	$P_{\mathrm{m}\theta}(k)$
	2, <i>m</i>	$(b\sigma_8)^2 \beta_f^2 \sigma_g^{2m}$	$\sum_{p,q,p+q=m} \left(\frac{(-1)^{p+q}}{2^{p+q}p!q!} \right) k^{2(p+q)} \mu_1^{2p+2} \mu_2^{2q+2}$	$P_{\theta\theta}(k)$
gv	0, <i>m</i>	$(b\sigma_8)^2 \beta_f \sigma_g^{2m}$	$(iaH)\left(\frac{(-1)^m}{2^mm!}\right)k^{2m-1}\mu_2\mu_1^{2m}$	$P_{\mathrm{m}\theta}(k)D_{\mathrm{u}}(k,\sigma_{\mathrm{u}})$
	1, <i>m</i>	$(f\sigma_8)^2\sigma_g^{2m}$	$(iaH)\left(\frac{(-1)^m}{2^m m!}\right)k^{2m-1}\mu_2\mu_1^{2m+2}$	$P_{\theta\theta}(k)D_{\rm u}(k,\sigma_{\rm u})$
VV	0	$(f\sigma_8)^2$	$(aH)^2 \frac{\mu_1 \mu_2}{k^2}$	$P_{\theta\theta}(k)D_{\rm u}^2(k,\sigma_{\rm u})$
RC25 This study - Wide-angle model with RSD				
Field ab	Term n	Wab,n	$F_{\mathrm{ab},n}$	$\mathcal{P}_{\mathrm{ab},n}$
	0	$(b\sigma_8)^2$	$\exp\left[-\frac{k^2\sigma_{g}^2(\mu_{1}^2+\mu_{2}^2)}{2}\right]$	$P_{\rm mm}(k)$
88	1	$(b\sigma_8)^2\beta_f$	$(\mu_1^2 + \mu_2^2) \exp \left[-\frac{k^2 \sigma_g^2 (\mu_1^2 + \mu_2^2)}{2} \right]$	$P_{\mathrm{m}\theta}(k)$
	2	$(b\sigma_8)^2\beta_f^2$	$\mu_1^2 \mu_2^2 \exp\left[-\frac{k^2 \sigma_g^2 (\mu_1^2 + \mu_2^2)}{2}\right]^{-1}$	$P_{\theta\theta}(k)$
gv	0	$(b\sigma_8)^2\beta_f$	$(iaH)\frac{\mu_2}{k}\exp\left[-\frac{(k\sigma_g\mu_1)^2}{2}\right]$	$P_{\mathrm{m}\theta}(k)D_{\mathrm{u}}(k,\sigma_{\mathrm{u}})$
	1	$(f\sigma_8)^2$	$(iaH)\frac{\mu_2\mu_1^2}{k}\exp\left[-\frac{(k\sigma_{\rm g}\mu_1)^2}{2}\right]$	$P_{\theta\theta}(k)D_{\rm u}(k,\sigma_{\rm u})$
vv	0	$(f\sigma_8)^2$	$(aH)^2 \frac{\mu_1 \mu_2}{k^2}$	$P_{\theta\theta}(k)D_{\rm u}^2(k,\sigma_{\rm u})$









