Responses on Sample Covariance

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with Elisabeth Krause & Fabian Schmidt

arXiv:1703.09212 arXiv:1705.01092 arXiv:1711.07467



Statistical challenges for large-scale structure in the era of LSST Oxford 2018

• The Gaussian likelihood of a certain set of parameters given a hypothetical survey measurement of the 3D matter power spectrum P(k):

$$\mathcal{L}(\theta) \propto \exp\left[\sum_{i,j} \left(P_m^{\text{theory}}(k_i, \theta) - P_m^{\text{data}}(k_i)\right) \operatorname{Cov}^{-1}(k_i, k_j) \left(P_m^{\text{theory}}(k_j, \theta) - P_m^{\text{data}}(k_j)\right)\right]$$

• The Gaussian likelihood of a certain set of parameters given a hypothetical survey measurement of the 3D matter power spectrum P(k):

Measured data

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• The Gaussian likelihood of a certain set of parameters given a hypothetical survey measurement of the 3D matter power spectrum P(k):

Measured dataTheoretical prediction
$$\mathcal{L}(\theta) \propto \exp\left[\sum_{i,j} \left(P_m^{\text{theory}}(k_i, \theta) - P_m^{\text{data}}(k_i)\right) \operatorname{Cov}^{-1}(k_i, k_j) \left(P_m^{\text{theory}}(k_j, \theta) - P_m^{\text{data}}(k_j)\right)\right]$$

• The Gaussian likelihood of a certain set of parameters given a hypothetical survey measurement of the 3D matter power spectrum P(k):



- Don't know how to compute it accurately/efficiently;
- By far, the **least well understood piece of this likelihood**: what is its redshift and cosmological dependence; baryonic effects?

• The Gaussian likelihood of a certain set of parameters given a hypothetical survey measurement of the 3D matter power spectrum P(k):



• By far, the **least well understood piece of this likelihood**: what is its redshift and cosmological dependence; baryonic effects?

In this talk ...

1) Response Approach to Perturbation Theory

Barreira, Schmidt , 1703.09212

2) An application to the lensing covariance

Barreira, Schmidt , 1705.01092

Barreira, Krause, Schmidt, 1711.07467

Response Approach to PT

Barreira, Schmidt , 1703.09212

What are responses?

Responses describe how the power spectrum responds to the presence of large-scale perturbations.

$$\mathcal{R}_{n} \equiv \frac{1}{n!P(k)} \frac{\mathrm{d}^{n} P(\boldsymbol{k}, \delta_{1} \cdots \delta_{n})}{\mathrm{d}\delta_{1} \cdots \mathrm{d}\delta_{n}} \bigg|_{\delta_{a}=0}$$



What are responses?

Responses describe how the power spectrum responds to the presence *What are they good for?* ^{urbations.}



Responses and N-point functions

Power spectrum, Bispectrum, Trispectrum ...

$$\langle \delta(\mathbf{k})\delta(\mathbf{k}')\rangle = P_m(\mathbf{k}) \qquad (2\pi)^3 \delta_D(\mathbf{k}+\mathbf{k}')$$

$$\langle \delta(\boldsymbol{p}_1) \delta(\boldsymbol{k}) \delta(\boldsymbol{k}') \rangle = B_m(\boldsymbol{k}, \boldsymbol{k}', \boldsymbol{p}_1) \quad (2\pi)^3 \delta_D(\boldsymbol{k} + \boldsymbol{k}' + \boldsymbol{p}_1)$$

 $\langle \delta(\boldsymbol{p}_2)\delta(\boldsymbol{p}_1)\delta(\boldsymbol{k})\delta(\boldsymbol{k}')\rangle = T_m(\boldsymbol{k},\boldsymbol{k}',\boldsymbol{p}_1,\boldsymbol{p}_2) \quad (2\pi)^3\delta_D(\boldsymbol{k}+\boldsymbol{k}'+\boldsymbol{p}_1+\boldsymbol{p}_2)$

Responses and N-point functions

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$$\left\langle \delta(\boldsymbol{p}_2)\delta(\boldsymbol{p}_1) \delta(\boldsymbol{k})\delta(\boldsymbol{k}') \right\rangle = T_m(\boldsymbol{k}, \boldsymbol{k}', \boldsymbol{p}_1, \boldsymbol{p}_2) \quad (2\pi)^3 \delta_D(\boldsymbol{k} + \boldsymbol{k}' + \boldsymbol{p}_1 + \boldsymbol{p}_2)$$

Small scale (hard) modes
Large scale (soft) modes

Responses and N-point functions

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$$Small scale (hard) modes$$

$$Large scale (soft) modes$$

Modulation of the power spectrum $P(\mathbf{k})$ by large-scale modes

i.e. Responses!



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$$\lim_{p \to 0} \left\langle \delta(\boldsymbol{k}) \delta(\boldsymbol{k}') \delta(\boldsymbol{p}) \right\rangle_c$$

$$2 \begin{bmatrix} F_2(\boldsymbol{k}, \boldsymbol{p}) P_L(\boldsymbol{k}) + F_2(\boldsymbol{k}', \boldsymbol{p}) P_L(\boldsymbol{k}') \end{bmatrix} P_L(\boldsymbol{p})$$
With Standard Perturbation Theory
$$im_{p \to 0} \left\langle \delta(\boldsymbol{k}) \delta(\boldsymbol{k}') \delta(\boldsymbol{p}) \right\rangle_c$$
hard soft



Responses as an extension of perturbation theory ...



Write the response in terms of all possible local gravitational observables

$$\mathcal{R}_n = \sum_{\mathcal{O}} R_{\mathcal{O}}(k) \ \mathcal{K}_{\mathcal{O},\text{large scale}}^{(n)}$$

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All possible configurations of large-scale density/tidal fields;

Given by perturbation theory.

Write the response in terms of all possible local gravitational observables

$$\mathcal{R}_n = \sum_{\mathcal{O}} \frac{R_{\mathcal{O}}(k)}{\mathcal{O}} \mathcal{K}_{\mathcal{O},\text{large scale}}^{(n)}$$

Measure the response to each specific large-scale configuration;

What we will get from simulations.

All possible configurations of large-scale density/tidal fields;

Given by perturbation theory.



$$\begin{aligned} \mathcal{R}_{2} &\longrightarrow R_{1}(k) \left[\delta^{(2)}(\boldsymbol{p}_{1}, \boldsymbol{p}_{2}) \right] + R_{K}(k) \left[\hat{k}^{i} \hat{k}^{j} K_{ij}^{(2)}(\boldsymbol{p}_{1}, \boldsymbol{p}_{2}) \right] \\ &+ \frac{1}{2} R_{2}(k) \left[\delta(\boldsymbol{p}_{1}) \delta(\boldsymbol{p}_{2}) \right] + R_{K\delta}(k) \left[\hat{k}^{i} \hat{k}^{j} K_{ij}(\boldsymbol{p}_{1}) \delta(\boldsymbol{p}_{2}) \right] \\ &+ R_{K^{2}}(k) \left[K_{ij}(\boldsymbol{p}_{1}) K^{ij}(\boldsymbol{p}_{2}) \right] + R_{K.K}(k) \left[\hat{k}^{i} \hat{k}^{j} K_{il}(\boldsymbol{p}_{1}) K^{l}_{j}(\boldsymbol{p}_{2}) \right] \\ &+ R_{KK}(k) \left[\hat{k}^{i} \hat{k}^{j} \hat{k}^{l} \hat{k}^{m} K_{ij}(\boldsymbol{p}_{1}) K_{lm}(\boldsymbol{p}_{2}) \right] + R_{\hat{\Pi}}(k) \left[\hat{k}^{i} \hat{k}^{j} \hat{\Pi}_{ij}(\boldsymbol{p}_{1}, \boldsymbol{p}_{2}) \right] \end{aligned}$$

Response coefficients

All 2nd order large-scale operators

Generalizations to any order are always straightforward, just more cumbersome.

Separate universe simulations

Nitty-gritty: Li et al (1401.0385) ; Wagner et al (1409.6294); Schmidt et al (1803.03274);

$$\mathcal{R}_n = \sum R_{\mathcal{O}}(k) \mathcal{K}_{\mathcal{O},\text{large scale}}^{(n)}$$

⑦ Response to specific perturbations All possible configurations of large-scale density/tidal fields;

Separate universe simulations

Nitty-gritty: Li et al (1401.0385) ; Wagner et al (1409.6294); Schmidt et al (1803.03274);



Separate universe simulations



To keep in mind then ...

Responses describe the coupling of large-to-small scale modes in the nonlinear regime

$$\langle \delta(\boldsymbol{k})\delta(\boldsymbol{k}')\delta(\boldsymbol{p}_1)\cdots\delta(\boldsymbol{p}_n) \rangle_{c,\mathcal{R}_n} \propto \frac{\mathcal{R}_n(k, \text{angles}) P_m(k)}{\text{response}}$$

Measurable with a few Separate Universe simulations.



Covariances with Responses

Barreira, Schmidt, arXiv:1705.01092 Barreira, Krause, Schmidt, arXiv:1711.07467

3D covariance decomposition

• Observed, 'windowed' density field

 $\delta_W(\boldsymbol{x}) = W(\boldsymbol{x})\delta(\boldsymbol{x})$

• The power spectrum

Takada&Hu (1302.6994) '

$$\hat{P}_m(\boldsymbol{k}) = \frac{\tilde{\delta}_W(\boldsymbol{k})\tilde{\delta}_W(-\boldsymbol{k})}{V_W}$$



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$$\hat{P}_m(\boldsymbol{k}) = \frac{\tilde{\delta}_W(\boldsymbol{k})\tilde{\delta}_W(-\boldsymbol{k})}{V_W}$$



• The power spectrum covariance

$$\operatorname{Cov}(\boldsymbol{k}_{1},\boldsymbol{k}_{2}) = \left\langle \hat{P}_{m}(\boldsymbol{k}_{1})\hat{P}_{m}(\boldsymbol{k}_{2})\right\rangle - \left\langle \hat{P}_{m}(\boldsymbol{k}_{1})\right\rangle \left\langle \hat{P}_{m}(\boldsymbol{k}_{2})\right\rangle =$$

$$=$$

$$\operatorname{Cov}^{\mathrm{G}}(\boldsymbol{k}_{1},\boldsymbol{k}_{2}) + \operatorname{Cov}^{\mathrm{cNG}}(\boldsymbol{k}_{1},\boldsymbol{k}_{2}) + \operatorname{Cov}^{\mathrm{SSC}}(\boldsymbol{k}_{1},\boldsymbol{k}_{2})$$

Gaussian

Connected non-Gaussian

Super-sample

The Gaussian term : G

• It is the only contribution during the linear regime of structure formation



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Window function can be included by using the convolved P(k).

The Gaussian term is well understood !

The Gaussian term : G

Corresponding lensing formulae

he linear regime of structure formation

Assuming Limber's approx., which is okay for I > 20

Windowed lensing convergence

$$\kappa_{\mathcal{W}}(\boldsymbol{\theta}) = \mathcal{W}(\boldsymbol{\theta}) \int \mathrm{d}\chi g(\chi) \delta(\boldsymbol{\theta}, \chi)$$

$\operatorname{Cov}^{\operatorname{G}}({m k}_1,{m k}_2$

Window function by using the

Lensing power spectrum

$$C(\boldsymbol{\ell}) = \int \mathrm{d}\chi \frac{g(\chi)^2}{\chi^2} P_m(k_{\boldsymbol{\ell}}, \chi)$$

$$k_{\boldsymbol{\ell}_i} = \left(\frac{\boldsymbol{\ell}_i + 1/2}{\chi}, 0\right)$$

Gaussian lensing covariance

$$\operatorname{Cov}_{\kappa}^{\mathrm{G}}(\boldsymbol{\ell}_{1},\boldsymbol{\ell}_{2}) = \frac{C(\boldsymbol{\ell}_{1})^{2}}{\Omega_{\mathcal{W}}} \left[\delta_{D}(\boldsymbol{\ell}_{1}+\boldsymbol{\ell}_{2}) + \delta_{D}(\boldsymbol{\ell}_{1}-\boldsymbol{\ell}_{2}) \right]$$

Connected non-Gaussian term : cNG

• Describes the <u>coupling of different Fourier modes due to</u> <u>nonlinear structure formation</u>.

Parallelogram trispectrum

$$\operatorname{Cov}^{\operatorname{cNG}}(\boldsymbol{k}_1, \boldsymbol{k}_2) = \frac{1}{V_W} T_m^{\operatorname{cNG}}(\boldsymbol{k}_1, -\boldsymbol{k}_1, \boldsymbol{k}_2, -\boldsymbol{k}_2)$$

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trispectrum

• Extend to the nonlinear regime with responses if k1 >> k2:

Valid for any nonlinear value of k1 !

$$\begin{array}{c|c} & \text{hard} & \text{soft} \\ T_m^{\text{cNG}}({\pmb k}_1, -{\pmb k}_1, {\pmb k}_2, -{\pmb k}_2) = \\ & 2{\pmb \mathcal{R}}_2(k_1, {\pmb \mu}_{12}) P_m(k_1) [P_L(k_2)]^2 \\ & \text{response} \end{array}$$













 10^{0}

0.0

 10^{-1}

 $k_1 [h/Mpc]$

If one mode is linear : responses capture all there is



The super-sample term : SSC

- Describes the coupling of modes inside the survey with <u>unobserved modes outside the survey</u>.
- Given by trispectrum terms that get excited by finiteness of the window function



$$\operatorname{Cov}^{\mathrm{SSC}}(\boldsymbol{k}_{1}, \boldsymbol{k}_{2}) = \frac{P_{m}(k_{1})P_{m}(k_{2})}{V_{W}^{2}} \int_{\boldsymbol{p}} |\tilde{W}(\boldsymbol{p})|^{2} \mathcal{R}_{1}(k_{1}, \mu_{\boldsymbol{k}_{1}, \boldsymbol{p}}) \mathcal{R}_{1}(k_{2}, \mu_{\boldsymbol{k}_{2}, \boldsymbol{p}}) P_{\mathrm{L}}(\boldsymbol{p})$$

The super-sample term : SSC

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Window function is a low-pass

filter that selects $p < \frac{1}{v^{1/3}}$



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Super-sample interactions are response interactions

Responses capture SSC completely !

The super-sample term : SSC





Window function is a low filter that selects p < Validity of Limber's approximationat stake because of the long-mode ! $<math>\operatorname{Cov}^{\operatorname{SSC}}(k_1, k_2) = \frac{P_m(k_1)\Gamma_m(\kappa_2)}{V_W^2} \int_p |\tilde{W}(p)|^2 \mathcal{R}_1(k_1, \mu_{k_1, p}) \mathcal{R}_1(k_2, \mu_{k_2, p}) P_L(p)$ Super-sample interactions are response interactions

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$$C(\boldsymbol{\ell}) = \int \mathrm{d}\chi \frac{g(\chi)^2}{\chi^2} P_m(k_{\boldsymbol{\ell}}, \chi)$$

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Account for long modes with responses
$$\boldsymbol{\ell}$$
$$C(\boldsymbol{\ell}, \hat{\boldsymbol{n}} | \boldsymbol{p}) = \int \mathrm{d}\chi \frac{g(\chi)^2}{\chi^2} P_m(k_{\boldsymbol{\ell}}) \left(1 + \int_{\boldsymbol{p}} \left[R_1(k_{\boldsymbol{\ell}})\delta(\boldsymbol{p}) + R_K(k_{\boldsymbol{\ell}})\hat{k}_{\boldsymbol{\ell}}^i \hat{k}_{\boldsymbol{\ell}}^j K_{ij}(\boldsymbol{p}) \right] e^{i\chi \boldsymbol{p}\hat{\boldsymbol{n}}} \right)$$

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Account for long modes with responses
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• Never assuming Limber for the long-mode;
$$Cov^{SSC}(\ell_1, \ell_2) = \frac{1}{\Omega_W^2} \sum_{LM} \frac{|b_{LM}|^2}{|b_{LM}|^2} \sigma_{\ell_1, \ell_2}^L$$
Variance-like integral that accounts for 3D long-mode.

on the curved sky

$$C(\ell) = \int d\chi \frac{g(\chi)^2}{\chi^2} P_m(k_\ell, \chi)$$
Limber's approximation underestimates SSC
matrix elements by ~10% for f_sky ~ 0.3-0.4 !

$$C(\ell, \hat{n} | p) = \int d\chi \frac{g(\chi)^2}{\chi^2} P_m(k_\ell) \left(1 + \int_p \left[R_1(k_\ell) \delta(p) + R_K(k_\ell) \hat{k}_\ell^i \hat{k}_\ell^j K_{ij}(p) \right] e^{i\chi p \hat{n}} \right)$$
• Never assuming Limber for the long-mode;
Don't forget responses to tidal fields, if
you want SSC entries to better than 5% !

$$Cov^{SSC}(\ell_1, \ell_2) = \prod_{\Omega_W^2} \sum_{LM} |b_{LM}|^2 \sigma_{\ell_1, \ell_2}^L$$
Variance-like integral that
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Lensing covariance summary

$$\operatorname{Cov}_{\kappa}(\ell_1, \ell_2) = \operatorname{Cov}_{\kappa}^{\mathrm{G}} + \operatorname{Cov}_{\kappa}^{\mathrm{cNG}} + \operatorname{Cov}_{\kappa}^{\mathrm{SSC}}$$

Lensing covariance summary



Lensing covariance summary



Euclid-like lensing setup

- 3 tomographic bins
- 20 ell bins in [20, 5000]
- Mask: spherical cap 15000 deg^2
- Source density: 30 / arcmin^2



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Euclid-like lensing setup

• 3 tomographic bins

w/ CosmoLike , Krause&Eifler (1601.05779)

• 20 ell bins in [20, 5000]

In the presence of the dominant off-diagonal SSC term, cNG becomes irrelevant ...



Responses on Sample Covariance

Off-diagonal covariance is **dominated by responses** .



Accurate covariances with modest numerical resources !



Responses on Sample Covariance



- Implementation of lensing covariance exists (stay tuned);
- Applications to galaxy and cross covariance are possible;
- Applications are not limited to power spectra covariances.