Optimizing Lagrangian perturbation theory in the mildly nonlinear regime of cosmic structure formation via one-point remapping

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April 29th, 2013



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1 The context: high energy physics, cosmology and cosmostatistics

- The Big picture
- Physical inference of the initial conditions of the Universe
- 2 The mildly non-linear regime of cosmic structure formation
 - Dynamics of gravitational instability
 - Lagrangian perturbation theory
- 3 Eulerian remapping of LPT
 - The remapping procedure
 - Correlators of Eulerian-remapped fields
- 4 Lagrangian remapping of LPT
 - Why the divergence of the displacement field?
 - The remapping procedure
 - Correlators of Lagrangian-remapped fields
- 5 Fundamental physics with cosmic voids
 - Cosmic voids: expectations
 - Cosmology with void statistics

6 Perspectives and Conclusion

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Showdown: Particle accelerators vs cosmological observations





The inhomogeneous Universe

You are here, make the best of it ...



Figure: Left: Primordial perturbations as seen in the Cosmic Microwave Background anisotropies (WMAP)

Right: Dark matter distribution today (simulated)

Issues and methods in cosmostatistics

Cosmostatistics: discipline of using the departures from homogeneity observed in astronomical surveys to distinguish between cosmological models.

Huge data sets, but fundamental limits to information:

- on large scales: causality
- on small scales: non-linearity

Large scales: careful statistical treatment required (cosmic variance).

Intermediate scales: linear methods are suitable.

Small scales: number of accessible modes in a 3D galaxy survey $\propto k^3$ \Rightarrow LSS surveys allow probing a larger number of small-scale modes in the *midly non-linear* regime (the 3D "cosmological revolution").

Bayesian cosmostatistics

- No ideal observation in reality: statistical and systematic uncertainties, noise, cosmic variance, survey geometry, selection effects, biases, etc.
 ⇒ no unique recovery of the initial conditions is possible!
- ⇒ a good question: "What is the probability distribution of possible signals compatible with the observations?"

Jasche & Wandelt 2012



Jasche & Wandelt 2012



Jasche & Wandelt 2012



Jasche & Wandelt 2012



BORG (Bayesian Origin Reconstruction from Galaxies):

- Hamiltonian Monte-Carlo
- 2LPT

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The Vlasov-Poisson system

Standard picture of LSS formation: result of gravitational amplification of primordial fluctuations of the initial density field.

- **1** gravitational aggregation of cold dark matter (CDM) particles
- Condensation of baryonic matter in gravitational potentials wells formed by the dark matter distribution

Modelization of the first step: in terms of Newtonian dynamics in comoving coordinates and conformal time (we follow the Hubble expansion flow and are interested in fluctuations rather than mean quantities).

The Vlasov-Poisson system

$$\frac{\mathrm{d}f}{\mathrm{d}\tau} = \frac{\partial f}{\partial \tau} + \frac{\mathbf{p}}{ma} \cdot \nabla f - ma \nabla \Phi \cdot \frac{\partial f}{\partial \mathbf{p}} = 0$$
$$\Delta \Phi = 4\pi \mathrm{G} a^2 \bar{\rho} \delta$$

 Φ : cosmological gravitational potential, δ : density contrast, f: particle number density in phase space, $\mathbf{p} = m\mathbf{au}$: momentum for *peculiar* velocity

Fluid dynamics approach

The Vlasov-Poisson system is *non-linear*. A common approach is to take momentum moments of the Vlasov equation \rightarrow hierarchy of equations, truncated at some point with a fluid dynamics assumption.

Zeroth moment: conservation of mass

Continuity equation

$$rac{\partial \delta(\mathbf{x}, au)}{\partial au} +
abla \cdot \left\{ \left[1 + \delta(\mathbf{x}, au)
ight] \mathbf{u}(\mathbf{x}, au)
ight\} = \mathbf{0}$$

First moment: conservation of momentum

Euler equation

$$\begin{aligned} \frac{\partial \mathbf{u}_i(\mathbf{x},\tau)}{\partial \tau} + \mathcal{H}(\tau) \mathbf{u}_i(\mathbf{x},\tau) + \mathbf{u}_j(\mathbf{x},\tau) \cdot \nabla_j \mathbf{u}_i(\mathbf{x},\tau) \\ = -\nabla_i \Phi(\mathbf{x},\tau) - \frac{1}{\rho(\mathbf{x},\tau)} \nabla_j (\sigma_{ij}(\mathbf{x},\tau)) \end{aligned}$$

The single-stream approximation

At early stages of cosmological gravitational instability or at large scales,

- structures had no time to collapse,
- gravity-induced cosmic flows will dominate over velocity dispersions due to thermal motion.
- The *single-stream approximation*:
 - the stress tensor is negligible: $\sigma_{ij} pprox$ 0,
 - density in phase space satisfies $f(\mathbf{x}, \mathbf{p}, \tau) = \rho(\mathbf{x}, \tau) \,\delta_{\mathrm{D}}[\mathbf{p} - ma\mathbf{u}(\mathbf{x})].$

Breakdown of the approximation: *shell-crossing*:

- generation of velocity dispersion and anisotropic pressure,
- multiple streams at a single point.



Figure: Inglebert *et al.* Plasma Phys. Control. Fusion **54** (2012)

The Zel'dovich approximation (ZA)

• As in fluid mechanics, there are two ways to describe the cosmological fluid: Eulerian and Lagrangian. We focus on the Lagrangian approach:

$$\mathbf{x}(\tau) = \mathbf{q} + \Psi(\mathbf{q},\tau)$$

q: initial position, x: final position, $\Psi:$ displacement field

• The Zel'dovich approximation (ZA) = first order Lagrangian perturbation theory. The linear solution to the dynamics is:

$$\psi^{(1)}(\mathbf{q},\tau) = \nabla_{\mathbf{q}} \cdot \Psi^{(1)}(\mathbf{q},\tau) = -D_1(\tau)\delta(\mathbf{q})$$

 $D_1(\tau)$: linear growth factor

- In comoving coordinates particles just go straight in the direction set by their initial velocity.
- Local approximation: does not depend on the behavior of the rest of fluid elements.

Second-order Lagrangian perturbation theory (2LPT)

- The ZA fails at sufficiently non-linear stages when particles are forming gravitationally bound structures instead of following straight lines. 2LPT provides a remarkable improvement over the ZA in describing the global properties of density and velocity fields.
- 2LPT is *non-local*, i.e. it includes the correction to the ZA displacement due to gravitational tidal effects.

$$\mathbf{x}(\tau) = \mathbf{q} + \Psi^{(1)}(\mathbf{q},\tau) + \Psi^{(2)}(\mathbf{q},\tau)$$
$$\psi^{(1)}(\mathbf{q},\tau) = \nabla_{\mathbf{q}} \cdot \Psi^{(1)}(\mathbf{q},\tau) = -D_{1}(\tau)\delta(\mathbf{q})$$
$$\psi^{(2)}(\mathbf{q},\tau) = \nabla_{\mathbf{q}} \cdot \Psi^{(2)}(\mathbf{q},\tau) = \frac{1}{2} \frac{D_{2}(\tau)}{D_{1}^{2}(\tau)} \sum_{i \neq j} \left[\Psi^{(1)}_{i,i} \Psi^{(1)}_{j,j} - \Psi^{(1)}_{i,j} \Psi^{(1)}_{j,i} \right]$$

with the second-order growth factor:

$$D_2(au) pprox -rac{3}{7} D_1^2(au)$$

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The Eulerian remapping procedure

Due to mode coupling, positive and negative fluctuations grow at different rates in the non-linear regime, but even non-linear evolution tends to preserve the *rank order* of the pixels, sorted by density.

 \Rightarrow Remapping algorithm:

- keep positions of under- and over-densities predicted by LPT
- at pixel of rank order δ_{LPT} , assign a new density δ_{Nbody}

 \mathcal{P}_{LPT} , \mathcal{P}_{Nbody} : PDFs for the density contrast. \mathcal{C}_{LPT} , \mathcal{C}_{Nbody} : the corresponding CDFs (their integrals).



The Eulerian remapping function for the ZA



The Eulerian remapping function for 2LPT



Location of particles



Location of particles



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Optimizing LPT via one-point remapping

Results: Two-point statistics

How does remapping affect the higher-order correlators?

- we expect the higher-order correlations to be respected by the remapping procedure;
- possible improvements could be exploited in data analysis or artificial galaxy survey applications.

Power spectrum:

$$\langle \delta(\mathbf{k}_1) \delta(\mathbf{k}_2) \rangle = \delta_{\mathsf{D}}(\mathbf{k}_1 + \mathbf{k}_2) P(k)$$

- simplest statistic of interest beyond one-point function
- contains all information for a Gaussian random field (Wick's theorem)
- used in particular to derive the cosmological parameters

Power spectrum



Power spectrum: varying mesh size and redshift



Fourier-space cross-correlation coefficient



Results: Three-point statistics

Bispectrum:

 $\langle \delta(\mathbf{k}_1) \delta(\mathbf{k}_2) \delta(\mathbf{k}_3) \rangle = \delta_{\mathsf{D}}(\mathbf{k}_1 + \mathbf{k}_2 + \mathbf{k}_3) B(\mathbf{k}_1, \mathbf{k}_2, \mathbf{k}_3)$

- depends on triangle shape
- provides information on the galaxy bias (simplest model: $\delta_{g} = b \, \delta_{m}$)
- primordial non-Gaussianity probe

Reduced bispectrum:

 $Q(\mathbf{k}_1, \mathbf{k}_2, \mathbf{k}_3) = \frac{B(\mathbf{k}_1, \mathbf{k}_2, \mathbf{k}_3)}{P(k_1)P(k_2) + P(k_1)P(k_3) + P(k_2)P(k_3)}$

takes away most of the dependence on scale and cosmology \Rightarrow useful to isolate the effects of gravity (e.g. Gil-Marín *et al.* 2011, JCAP **11**, 019, arXiv:1109.2115)



Redshift z = 0, mesh size 4 Mpc/h, folded triangles

Bispectrum



Bispectrum: varying mesh size and redshift



Bispectrum: varying triangle shape



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Why the divergence of the displacement field?

 $\mathbf{x}(\tau) = \mathbf{q} + \Psi(\mathbf{q},\tau)$

Reason 1: Ψ is curl-free up to order 2 \Rightarrow Nearly the whole of the information in ψ !

Why the divergence of the displacement field?



Reason 2: Reduced non-Gaussianity!

Further comments on ψ

see also Neyrinck 2013

- An artifact in 2LPT: overdense spots in voids!
- The collapse "barrier": $\psi = -3$





Further comments on ψ

• The collapse "barrier": $\psi = -3$



Neyrinck 2013

Further comments on ψ



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Optimizing LPT via one-point remapping

The Lagrangian remapping procedure

- Goal: Improve the correspondence between LPT-approximate models and full numerical *N*-body simulations of gravitational large-scale structure formation.
- Due to mode coupling, positive and negative fluctuations grow at different rates in the non-linear regime, but even non-linear evolution tends to preserve the *rank order* of the pixels, sorted by density.
- In Lagrangian description of cosmological large-scale structure, the divergence of the displacement field ψ plays a similar role as the Eulerian density contrast δ and is a more natural object.

\Rightarrow Remapping algorithm:

- keep positions of under- and over-densities predicted by LPT
- at pixel of rank order $\psi_{\rm LPT},$ assign a new divergence of the displacement field, $\psi_{\rm Nbody}$
- reconstruct the curl-free displacement field from its remapped divergence, and evolve the particles accordingly

The Lagrangian remapping procedure



The Lagrangian remapping function



Location of particles



Location of particles



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The cosmic web

What is the large-scale structure of the Universe made of?





Figure: Courtesy of P. M. Sutter

Figure: Aragón-Calvo, van de Weygaert & Jones, 2010

Cosmic voids in the large-scale structure of the Universe

What do we expect of voids?

• Number count:

- cluster masses determination
- void size determination
- Dynamics:
 - clusters are gravitationally collapsed objects, highly non-linear
 - voids can be found in the linear or mildy non-linear regime

An efficient identification of voids is now possible thanks to numerical methods.

A public void catalog from the Sloan Digital Sky Survey DR7:



Sutter, Lavaux, Wandelt & Weinberg, 2012 http://www.cosmicvoids.net/

Dynamics of cosmic voids



Fundamental physics with cosmic voids

Some possible questions to be addressed with voids:

- relationship with the statistical properties of the ICs of the Universe
- relationship with the DM field and luminous tracers (the "bias" problem)
- tests of the standard GR picture of structure formation, discrimination among modified gravity models

First steps towards a systematic study of void statistics:

- The void one-point function (number count): provides constraints on the dark energy equation of state (Alizadeh, Biswas, Lavaux, Sutter, FL & Wandelt, in prep.)
- The void-void two-point correlation function: addresses the bias problem, the extraction of primordial non-Gaussianity (FL & Wandelt, in prep., Hamaus *et al.*, in prep.)

The void-void two-point correlation function in LPT

FL & Wandelt, in prep.

Correlations of $\left\langle \frac{1}{\rho} \times \frac{1}{\rho} \right\rangle$: puts weight on voids instead of clusters



Figure: FL & Wandelt, preliminary

- the void-void correlation function can be modeled easily up to redshift zero using Lagrangian perturbation theory
- a Lagrangian remapping further improves the results at small scales or at low redshift

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Concluding thoughts

Cosmic voids instead of galaxy clusters:

- simpler number count
- less affected by non-linearity
- earlier affected by dark energy

The remapping procedure: a fast way of producing mock galaxy distribution:

- A substantial improvement with respect to existing methods (NL affect even large scales: BAO: ~ 125 Mpc/h).
- Non-linear cosmological inference of the initial conditions of the Universe becomes feasible.

Outlook

- Constraints on primordial non-Gaussianities (*f*_{NL}) and therefore on inflationary models (multi-field inflation? non-standard kinetic term? periods of fast-roll? non-trivial pre-inflationary state? non-Bunch-Davies vacuum?).
- Inference of the initial conditions and of the properties of dark energy with cosmic voids statistics