

# cosmological large-scale structure

cosmology lecture (chapter 10)

**Markus Pössel + Björn Malte Schäfer**

Haus der Astronomy and Centre for Astronomy  
Fakultät für Physik und Astronomie, Universität Heidelberg

August 1, 2013

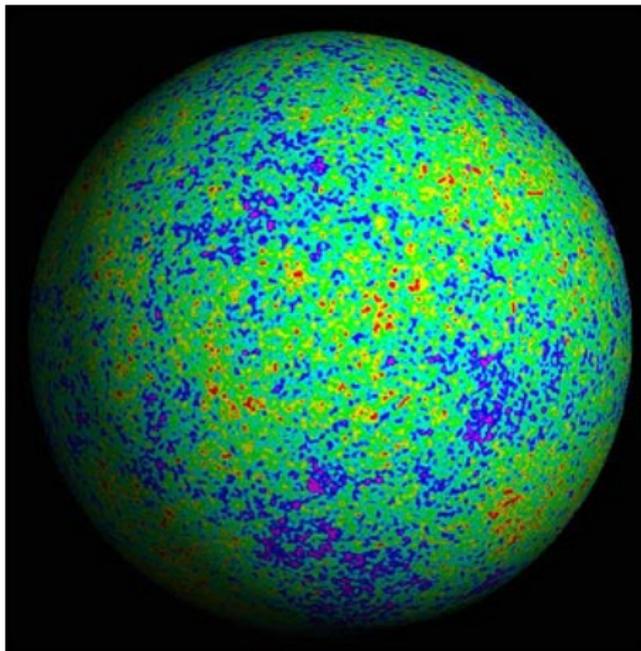
# outline

- 1 repetition**
- 2 random processes**
  - double pendulum
  - ergodicity and homogeneity
  - Gaussian random fields
  - correlation function
  - Gaussian probability densities
- 3 large-scale structure**
- 4 CDM spectrum**
  - cold dark matter
- 5 structure formation**
  - self-gravitating systems
  - dark matter
- 6 summary**

# repetition

- flat Friedmann-Lemaître cosmologies with matter and a cosmological constant
- thermal history: big bang nucleosynthesis and formation of atoms
- inflation: solution to flatness and horizon problems
- generation of fluctuations in the distribution of matter
  - quantum fluctuations of the inflaton field perturb gravitational field
  - matter and radiation react on the perturbed gravitational field
- fluctuations of the cosmic microwave background
  - at the time of (re)combination of hydrogen atoms
  - temperature of photons depends on motion and potential depth
  - potential fluctuations are the inflationary perturbations
  - gravitational redshift (Sachs-Wolfe effect) and Doppler shifts in photon temperature
- inflationary perturbations are Gaussian, consequence of the central limit theorem

# inflationary fluctuations in the CMB



**source: WMAP**

# random processes

- inflation generates fluctuations in the distribution of matter
  - fluctuations can be seen in the cosmic microwave background
  - seed fluctuations for the large-scale distribution of galaxies
  - amplified by self-gravity
- **cosmology is a statistical subject**
- fluctuations form a **Gaussian random field**
- random processes: specify
  - probability density  $p(x)dx$
  - covariance, in the case of multivariate processes  $p(\vec{x})d\vec{x}$
- measurement of  $p(x)dx$  by determining moments  $\langle x^n \rangle = \int dx x^n p(x)$
- cosmology: random process describes the fluctuations of the **overdensity**

$$\delta = \frac{\rho - \bar{\rho}}{\bar{\rho}} \quad (1)$$

with the mean density  $\bar{\rho} = \Omega_m \rho_{\text{crit}}$

# double pendulum

- **simple example of a random process**
- double pendulum is a chaotic system, dynamics depends **very** sensitively on tiny changes in the initial condition
- random process: imagine you want to know the distribution of  $\varphi$  one minute after starting
  - move to initial conditions and let go
  - wait 1 minute and measure  $\varphi$  (one realisation)
  - repeat experiment  $\rightarrow$  distribution  $p(\varphi)d\varphi$  (ensemble of realisations)
- 2 more types of data
  - distributions and moments of more than one observable
  - moments of observables across different times

## question

write down the Lagrangian, perform variation and derive the equation of motion! show that there is a nonlinearity

# double pendulum: ergodicity and homogeneity

## ergodicity

with time, the dynamics generates values for the observables with the same probability as in the statistical ensemble,

$$p(\varphi(t))dt \propto p(\varphi)d\varphi$$

- time averaging = ensemble averaging, for measuring moments

## homogeneity

statistical properties are invariant under time-shifts  $\Delta t$

$$p(\varphi(t))d\varphi = p(\varphi(t + \Delta t))d\varphi$$

- necessary condition for ergodicity
- double pendulum: not applicable if there is dissipation

# Gaussian random fields in cosmology

- fluctuations in the density field are a Gaussian random process  $\rightarrow$  sufficient to measure the **variance**
  - ergodicity: postulated (theorem by Adler)
  - volume averages are equivalent to ensemble averages

$$\langle \delta^n \rangle = \frac{1}{V} \int_V d^3x \delta^n(\vec{x}) p(\delta(\vec{x})) \quad (2)$$

- homogeneity: statistical properties independent of position  $\vec{x}$

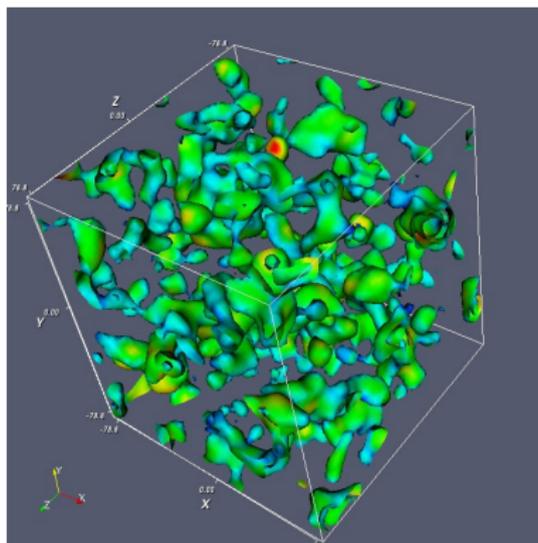
$$p(\delta(\vec{x})) \propto p(\delta(\vec{x} + \Delta\vec{x})) \quad (3)$$

- the density field is a 3d random field  $\rightarrow$  **isotropy**

$$p(\delta(\vec{x})) = p(\delta(R\vec{x})), \text{ for all rotation matrices } R \quad (4)$$

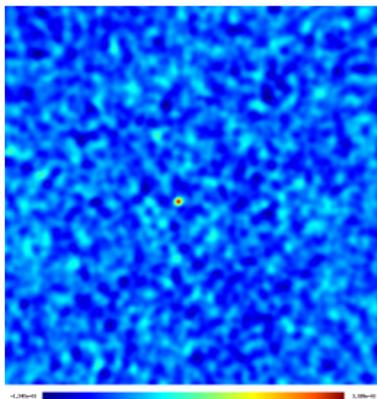
- finite correlation length: amplitudes of  $\delta$  at two positions  $\vec{x}_1$  and  $\vec{x}_2$  are not independent:
  - covariance needed for Gaussian distribution  $p(\delta(\vec{x}_1), \delta(\vec{x}_2))$
  - measurement of cross variance/covariance  $\langle \delta(\vec{x}_1) \delta(\vec{x}_2) \rangle$
  - $\langle \delta(\vec{x}_1) \delta(\vec{x}_2) \rangle$  is called **correlation function**  $\xi$

# Gaussian random field

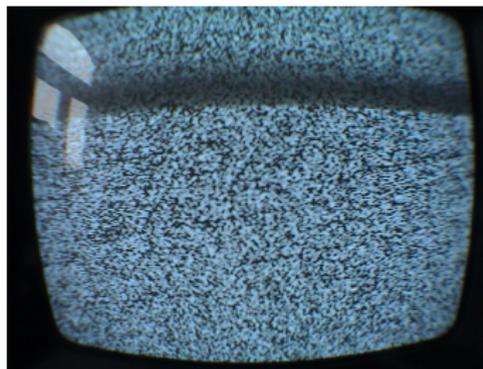


isodensity surfaces, threshold  $2.5\sigma$ , shading  $\sim$  local curvature,  
CDM power spectrum, smoothed on  $8 \text{ Mpc}/h$ -scales

# statistics: correlation function and spectrum



finite correlation length



zero correlation length

## correlation function

quantification of fluctuations: correlation function

$\xi(\vec{r}) = \langle \delta(\vec{x}_1) \delta(\vec{x}_2) \rangle$ ,  $\vec{r} = \vec{x}_2 - \vec{x}_1$  for Gaussian, homogeneous fluctuations,  $\xi(\vec{r}) = \xi(r)$  for isotropic fields

## statistics: correlation function and spectrum

- Fourier transform of the density field

$$\delta(\vec{x}) = \int \frac{d^3k}{(2\pi)^3} \delta(\vec{k}) \exp(i\vec{k}\vec{x}) \leftrightarrow \delta(\vec{k}) = \int d^3x \delta(\vec{x}) \exp(-i\vec{k}\vec{x}) \quad (5)$$

- variance  $\langle \delta(\vec{k}_1) \delta^*(\vec{k}_2) \rangle$ : use homogeneity  $\vec{x}_2 = \vec{x}_1 + \vec{r}$  and  $d^3x_2 = d^3r$

$$\langle \delta(\vec{k}_1) \delta^*(\vec{k}_2) \rangle = \int d^3r \langle \delta(\vec{x}_1) \delta(\vec{x}_1 + \vec{r}) \rangle \exp(-i\vec{k}_2\vec{r}) (2\pi)^3 \delta_D(\vec{k}_1 - \vec{k}_2) \quad (6)$$

- definition spectrum  $P(\vec{k}) = \int d^3r \langle \delta(\vec{x}_1) \delta(\vec{x}_1 + \vec{r}) \rangle \exp(-i\vec{k}\vec{r})$
- spectrum  $P(\vec{k})$  is the Fourier transform of the correlation function  $\xi(\vec{r})$
- homogeneous fields: Fourier modes are mutually uncorrelated
- isotropic fields:  $P(\vec{k}) = P(k)$

### question

show that the unit of the spectrum  $P(k)$  is  $L^3$ ! what's the relation between  $\xi(r)$  and  $P(k)$  in an isotropic field?

# Gaussianity and the characteristic function

- for a continuous pdf, all moments need to be known for reconstructing the pdf
- reconstruction via **characteristic function**  $\phi(t)$  (Fourier transform)

$$\phi(t) = \int dx p(x) \exp(itx) = \int dx p(x) \sum_n \frac{(itx)^n}{n!} = \sum_n \langle x^n \rangle_p \frac{(it)^n}{n!}$$

with moments  $\langle x^n \rangle = \int dx x^n p(x)$

- Gaussian pdf is special:
  - all moments exist! (counter example: Cauchy pdf)
  - all even moments are expressible as products of the variance
  - $\sigma$  is enough to statistically reconstruct the pdf
  - pdf can be differentiated arbitrarily often (Hermite polynomials)

## question

show that for a Gaussian pdf  $\langle x^{2n} \rangle \propto \langle x^2 \rangle^n$ . what's  $\phi(t)$ ?

# moment generating function

- variance  $\sigma^2$  characterises a Gaussian pdf completely
- $\langle x^{2n} \rangle \propto \langle x^2 \rangle^n$ , but what is the constant of proportionality?
- look at the **moment generating function**

$$M(t) = \int dx p(x) \exp(tx) = \langle \exp(tx) \rangle_p = \sum_n \langle x^n \rangle_p \frac{t^n}{n!}$$

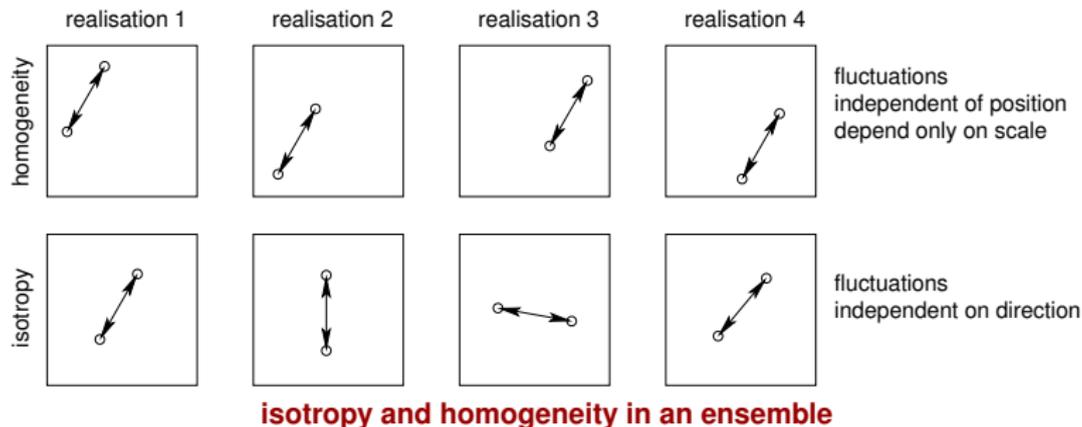
- $M(t)$  is the Laplace transform of pdf  $p(x)$ , and  $\phi(t)$  is the Fourier transform
- $n$ th derivative at  $t = 0$  gives moment  $\langle x^n \rangle_p$ :

$$M'(t) = \langle x \exp(tx) \rangle_p = \langle x \rangle_p$$

## question

compute  $\langle x^n \rangle$ ,  $n = 2, 3, 4, 5, 6$  for a Gaussian directly (by induction) and with the moment generating function  $M(t)$

# homogeneity and isotropy in $\xi(r)$



- homogeneity: a measurement of  $\langle \delta(\vec{x})\delta(\vec{x} + \vec{r}) \rangle$  is independent of  $\vec{x}$ , if one averages over ensembles
- isotropy: a measurement of  $\langle \delta(\vec{x})\delta(\vec{x} + \vec{r}) \rangle$  does not depend on the direction of  $\vec{r}$ , in the ensemble averaging

## why correlation functions?



**a proof for climate change and global warming**

please be careful: we measure the correlation function because it characterises the random process generating a realisation of the density field, not because there is a badly understood mechanism relating amplitudes at different points!  
(PS: don't extrapolate to 2014!)

# tests of Gaussianity

## Gaussianity

all moments needed for reconstructing the probability density

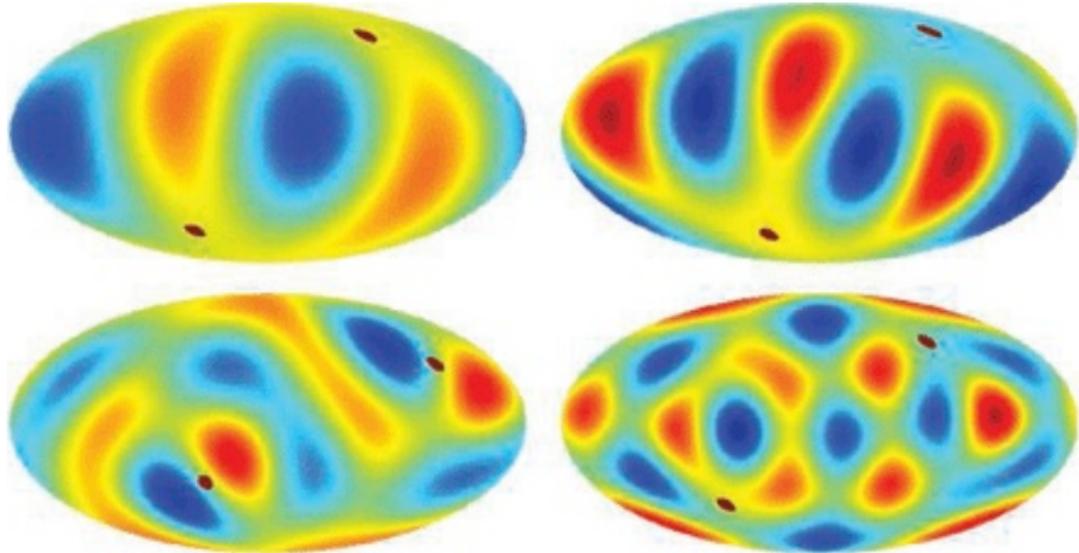
- data is finite: only a limited number of estimators are available
- classical counter example: **Cauchy-distribution**

$$p(x)dx \propto \frac{dx}{x^2 + a^2} \quad (7)$$

→ all even moments are infinite

- genus statistics: peak density, length of isocontours
- independency of Fourier modes

# tests of Gaussianity: axis of evil



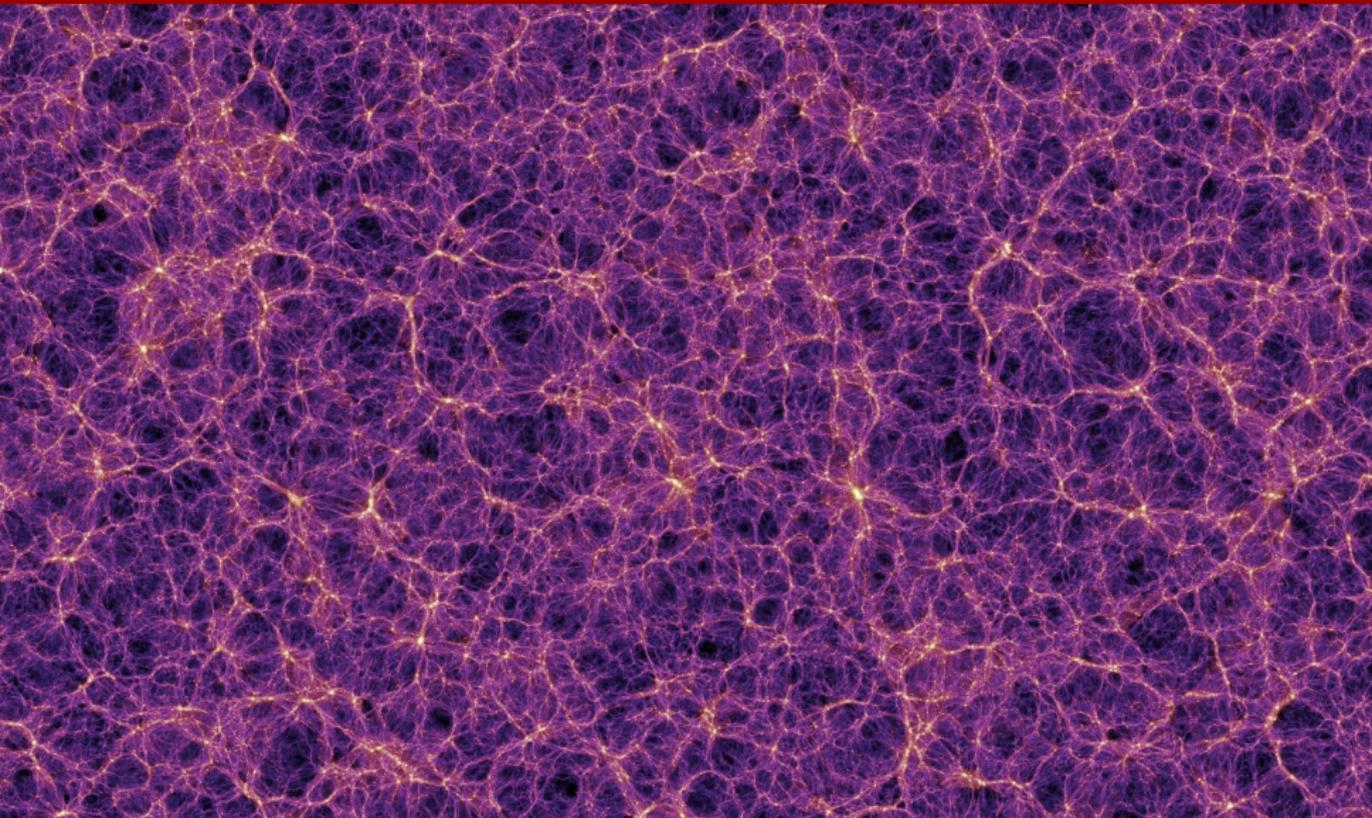
**CMB axis of evil: multipole alignment**

- CMB-sky: weird (unprobable) alignment between low multipoles

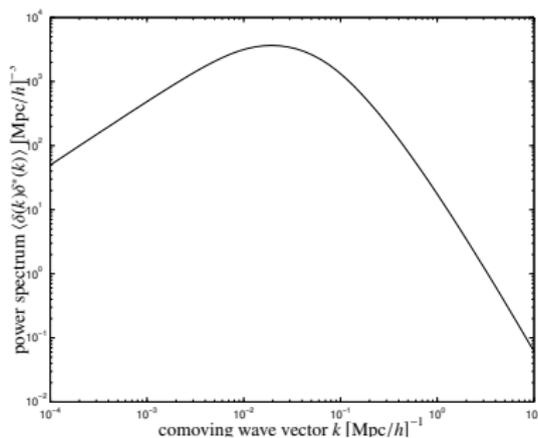
# weak and strong Gaussianity

- differentiate weak and strong Gaussianity
- strong Gaussianity: Gaussian distributed amplitudes of Fourier modes
  - implies Gaussian amplitude distribution in real space
  - argumentation: via cumulants
- weak Gaussianity: central limit theorem
  - assume independent Fourier modes, but arbitrary amplitude distribution in Fourier space
  - Fourier transform: many elementary waves contribute to amplitude at a given point
  - central limit theorem: sum over a large number of independent random numbers is Gaussian distributed
  - field in real space is approximately Gaussian, even though the Fourier modes can be arbitrarily distributed

# the cosmic web (Millenium simulation)

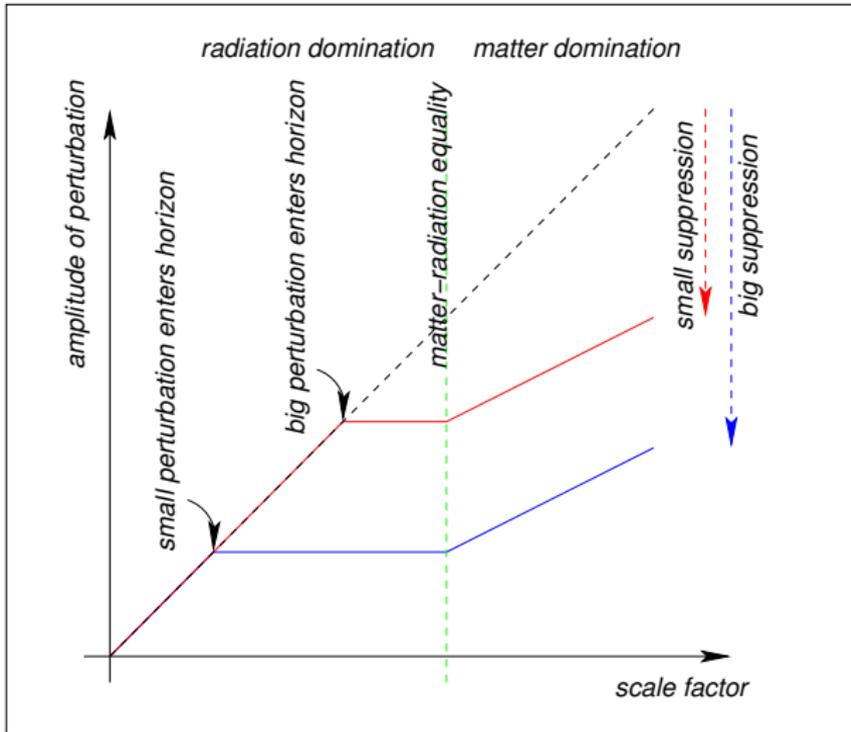


# CDM spectrum $P(k)$ and the transfer function $T(k)$



- ansatz for the CDM power spectrum:  $P(k) = k^{n_s} T(k)^2$
- small scales suppressed by radiation driven expansion → **Meszaros-effect**
- asymptotics:  $P(k) \propto k$  on large scales, and  $\propto k^{-3}$  on small scales

# Meszaros effect 1



## Meszaros effect 2

- perturbation grows  $\propto a^2$  outside horizon in the radiation-dominated era (really difficult to understand, need covariant perturbation theory)
- when entering the horizon, fast radiation driven expansion keeps perturbation from growing, dynamical time-scale  $t_{\text{dyn}} \gg t_{\text{Hubble}} = 1/H(a)$
- all perturbations start growing at the time of matter-radiation equality ( $z \simeq 7000$ ,  $\Omega_M(z) = \Omega_R(z)$ ), growth  $\propto a$
- size of the perturbation corresponds to scale factor of the universe at horizon entry
- total suppression is  $\propto k^{-2}$ , power spectrum  $\propto k^{-4}$
- exact solution of the problem: numerical solution for transfer function  $T(k)$ , with shape parameter  $\Gamma$ , which reflects the matter density

## CDM shape parameter $\Gamma$

- exact shape of  $T(k)$  follows from Boltzmann codes
- express wave-vector  $k$  in units of the shape parameter:

$$q \equiv \frac{k/\text{Mpc}^{-1}h}{\Gamma} \quad (8)$$

- Bardeen-fitting formula for low- $\Omega_m$  cosmologies

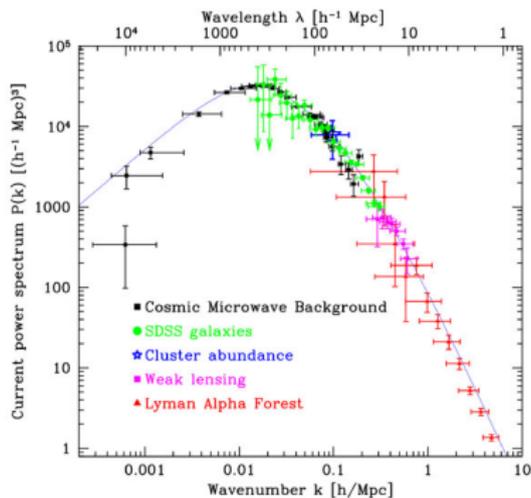
$$T(q) = \frac{\ln(1 + eq)}{eq} \times \left[ 1 + aq + (bq)^2 + (cq)^3 + (dq)^4 \right]^{-\frac{1}{4}},$$

- to good approximation  $\Gamma = \Omega_m h$
- small  $\Gamma \rightarrow$  skewed to left, big  $\Gamma \rightarrow$  skewed to right

### question

verify the asymptotic behaviour of  $T(q)$  for  $q \ll 1$  and  $q \gg 1$

# observational constraints on $P(k)$



data for  $P(k)$  from observational probes

- many observational channels are sensitive to  $P(k)$
- amazing agreement for the shape

## normalisation of the spectrum: $\sigma_8$

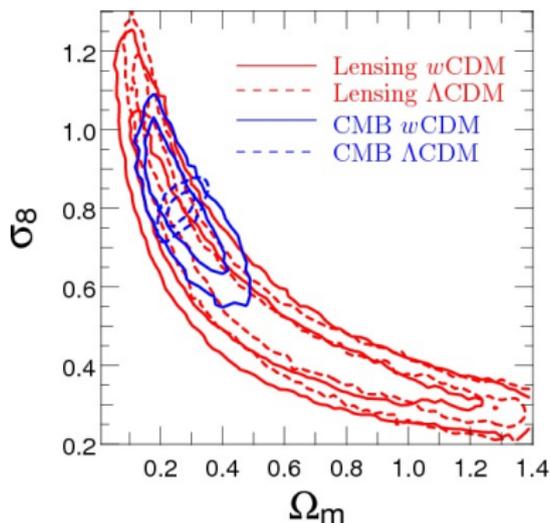
- CDM power spectrum  $P(k)$  needs to be normalised
- observations: fluctuations in the galaxy counts on 8 Mpc/ $h$ -scales are approximately constant and  $\simeq 1$  (Peebles)
- introduced filter function  $W(\vec{x})$
- convolve density field  $\delta(\vec{x})$  with filter function  $W(\vec{x})$  in real space  $\rightarrow$  multiply density field  $\delta(\vec{k})$  with filter function  $W(\vec{k})$  in Fourier space
- convention:  $\sigma_8, R = 8 \text{ Mpc}/h$

$$\sigma_8^2 = \frac{1}{2\pi^2} \int_0^\infty dk k^2 P(k) W^2(kR) \quad (9)$$

with a spherical top-hat filter  $W(kR)$

- least accurate cosmological parameter, discrepancy between WMAP, lensing and clusters

# lensing and CMB constraints on $\sigma_8$



constraints on  $\Omega_m$  and  $\sigma_8$

- some tension between best-fit values
- possibly related to measurement of galaxy shapes in lensing

# cosmological standard model

cosmology + structure formation are described by:

- dark energy density  $\Omega_\varphi$
- cold dark matter density  $\Omega_m$
- baryon density  $\Omega_b$
- dark energy density equation of state parameter  $w$
- Hubble parameter  $h$
- primordial slope of the CDM spectrum  $n_s$ , from inflation
- normalisation of the CDM spectrum  $\sigma_8$

**cosmological standard model: 7 parameters**

known to few percent accuracy, amazing predictive power

# properties of dark matter

## current paradigm:

structures from by gravitational instability from inflationary fluctuations in the cold dark matter (CDM) distribution

- collisionless  $\rightarrow$  very small interaction cross-section
- cold  $\rightarrow$  negligible thermal motion at decoupling, no cut-off in the spectrum  $P(k)$  on a scale corresponding to the diffusion scale
- dark  $\rightarrow$  no interaction with photons, possible weak interaction
- matter  $\rightarrow$  gravitationally interacting

## main conceptual difficulties

- collisionlessness  $\rightarrow$  hydrodynamics, no pressure or viscosity
- non-saturating interaction (gravity)  $\rightarrow$  extensivity of binding energy

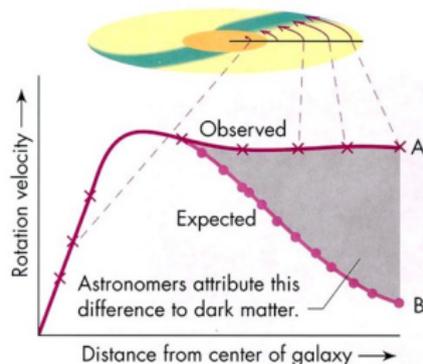
# dark matter and the microwave background

- fluctuations in the density field at the time of decoupling are  $\simeq 10^{-5}$
- long-wavelength fluctuations grow proportionally to  $a$
- if the CMB was generated at  $a = 10^{-3}$ , the fluctuations can only be  $10^{-2}$  today
- large, supercluster-scale objects have  $\delta \simeq 1$

## cold dark matter

need for a **nonbaryonic** matter component, which is not interacting with photons

# galaxy rotation curves

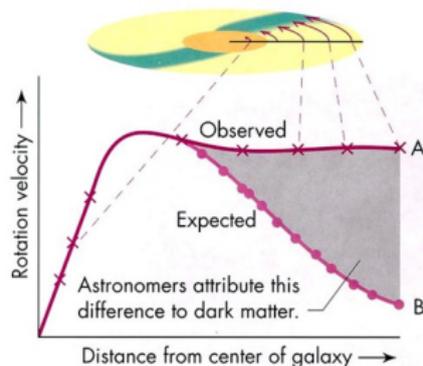


- balance centrifugal and gravitational force
- difficulty: measured in low-surface brightness galaxies
- galactic disk is embedded into a larger halo composed of CDM

## question

show that the density profile of a galaxy needs to be  $\rho \propto 1/r^2$

# galaxy rotation curves



## question

realistic haloes are described by the NFW-profile, with 3 regions  $\rho \propto 1/r^\alpha$  with  $\alpha = 1, 2, 3$ . can you drive the circular velocity-radius relation in all three regimes?

# structure formation equations

## cosmic structure formation

cosmic structures are generated from tiny inflationary seed fluctuations, as a fluid mechanical, self-gravitating phenomenon (with Newtonian gravity), on an expanding background

- continuity equation: no matter is lost or generated

$$\frac{\partial}{\partial t}\rho + \text{div}(\rho\vec{v}) = 0 \quad (10)$$

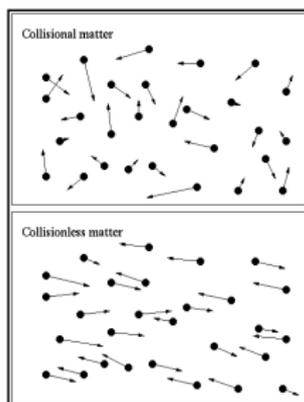
- Euler-equation: evolution of velocity field due to gravitational forces

$$\frac{\partial}{\partial t}\vec{v} + \vec{v}\nabla\vec{v} = -\nabla\Phi \quad (11)$$

- Poisson-equation: potential is sourced by the density field

$$\Delta\Phi = 4\pi G\rho \quad (12)$$

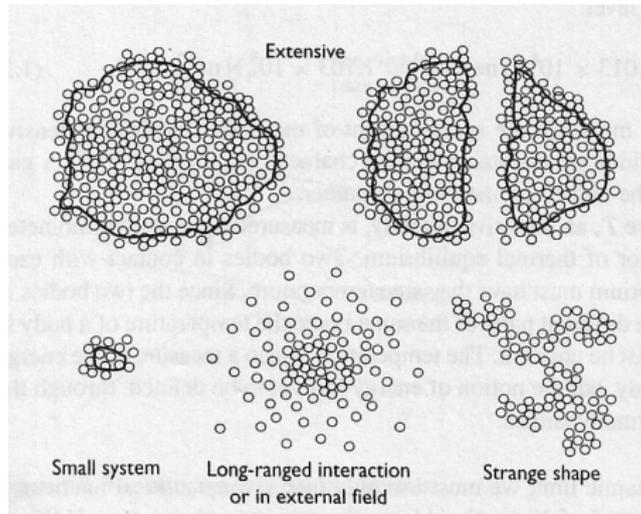
# collisionlessness of dark matter



source: P.M. Ricker

- CDM is collisionless (elastic collision cross section  $\ll$  neutrinos)
  - why can galaxies rotate and how is vorticity generated?
  - why do galaxies form from their initial conditions without viscosity?
  - how can one stabilise galaxies against gravity without pressure?
  - is it possible to define a temperature of a dark matter system?

# non-extensivity of gravity



source: Kerson Huang, statistical physics

- gravitational interaction is long-reached
- gravitational binding energy per particle is not constant for  $n \rightarrow \infty$

# summary

- inflation generates seed fluctuations in the (dark) matter distribution
- fluctuations form a **Gaussian random field**
- description with power spectrum  $P(k)$  or correlation function  $\xi(r)$
- shape of  $P(k)$ :
  - inflation: **Harrison-Zel'dovich** spectrum  $P(k) \propto k^{n_s}$
  - transition from radiation to matter dominated phase: **transfer function** changes  $P(k) \propto k^{n_s} T^2(k)$
  - normalisation: fixed by variance  $\sigma_8$  on 8 Mpc/ $h$  scales
- structures grow by self-gravity:
  - collisionlessness
  - non-extensivity of gravity