

Astro PG Course

cosmological simulations

session 2: cosmological integration and initial conditions

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 @Swnk16



choice of softening

$$\Phi(x) = -G \sum_{j=1}^N \frac{m_j}{\left[\left(\mathbf{x} - \mathbf{x}_j\right)^2 + \epsilon^2\right]^{1/2}}$$

gravitational softening, ϵ , is introduced in N-body simulations to avoid large-angle scattering due to close encounters. higher-resolution simulations use smaller softening [and therefore also shorter timesteps]

simple choice: $\epsilon = \alpha \cdot d = \alpha \frac{L_{\text{box}}}{N_p^{1/3}}$

$$\alpha = 0.01 - 0.05$$

mean inter-particle separation

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stochastic acceleration from close encounters

stricter choice: $\frac{Gm_{\text{DM}}}{\epsilon^2} \lesssim \frac{GM_{200}}{r_{200}^2} \Rightarrow \epsilon \gtrsim \frac{r_{200}}{\sqrt{N_{200}}}$

minimum mean-field acceleration in DM halo

Power+ (2003)

higher-order time integration

once forces on particles have been calculated, we need to propagate these forward in time and update their (1) **positions** and (2) **velocities**

kick

$$\mathbf{v}_j^{n+1/2} = \mathbf{v}_j^n + \frac{1}{2} \mathbf{a}_j^n \cdot \Delta t$$

drift

$$\mathbf{x}_j^{n+1} = \mathbf{x}_j^n + \mathbf{v}_j^{n+1/2} \cdot \Delta t$$

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2nd order
“leapfrog” method

much more stable
“symplectic”
[~energy is conserved]

cosmological time integration

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kick

$$\mathbf{p}_j(\tau_n + \Delta\tau) = \mathbf{p}_j(\tau_n) + \mathbf{a}_j(\tau_n) \int_{\tau_n}^{\tau_n + \Delta\tau} \frac{d\tau}{aH(a)}$$

cosmological scale factor

Hubble parameter

cosmological time integration

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$$E(\Delta\tau) = K\left(\frac{\Delta\tau}{2}\right) \circ D(\Delta\tau) \circ K\left(\frac{\Delta\tau}{2}\right)$$

cosmological
scale factor

Hubble
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a note on the Hubble parameter

we define the Hubble
parameter as $H(t) \equiv \frac{\dot{a}(t)}{a(t)}$.
denoting the present-day
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$$H_0 \equiv H(t = t_{\text{now}}) = 100h \text{ km s}^{-1} \text{ Mpc}^{-1}$$

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$$H(a) = H_0 E(a)$$

$$E(a) = \sqrt{\Omega_m a^{-3} + \Omega_r a^{-4} + \Omega_k a^{-2} + \Omega_\Lambda \exp(3\tilde{w}(a))}$$

$$\tilde{w}(a) = (a - 1) w_a - (1 + w_0 + w_a) \log(a)$$

$$w(a) \equiv w_0 + w_a (1 - a)$$

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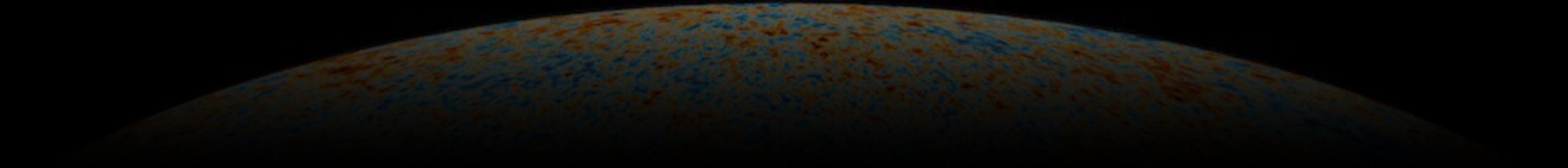
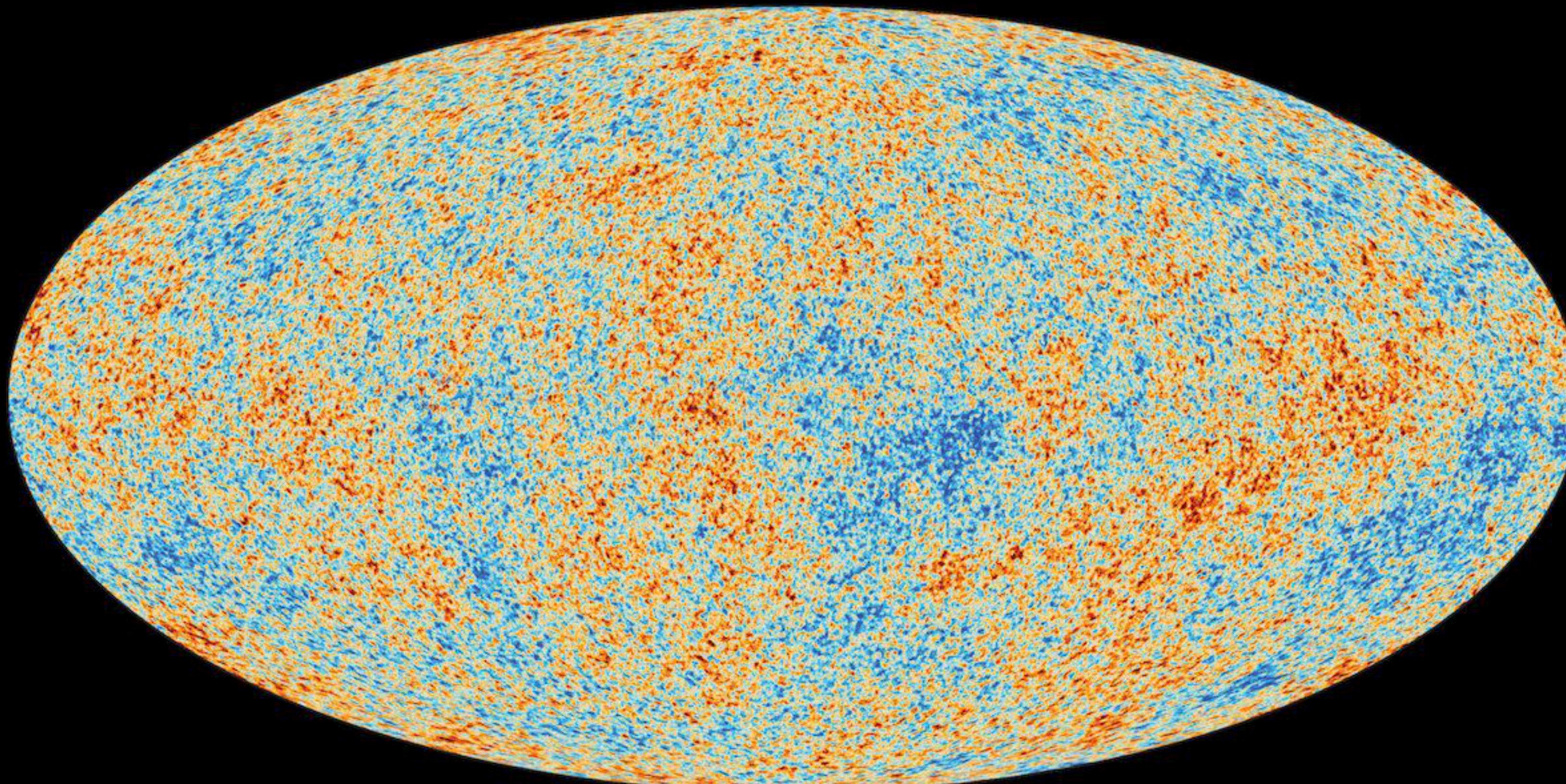
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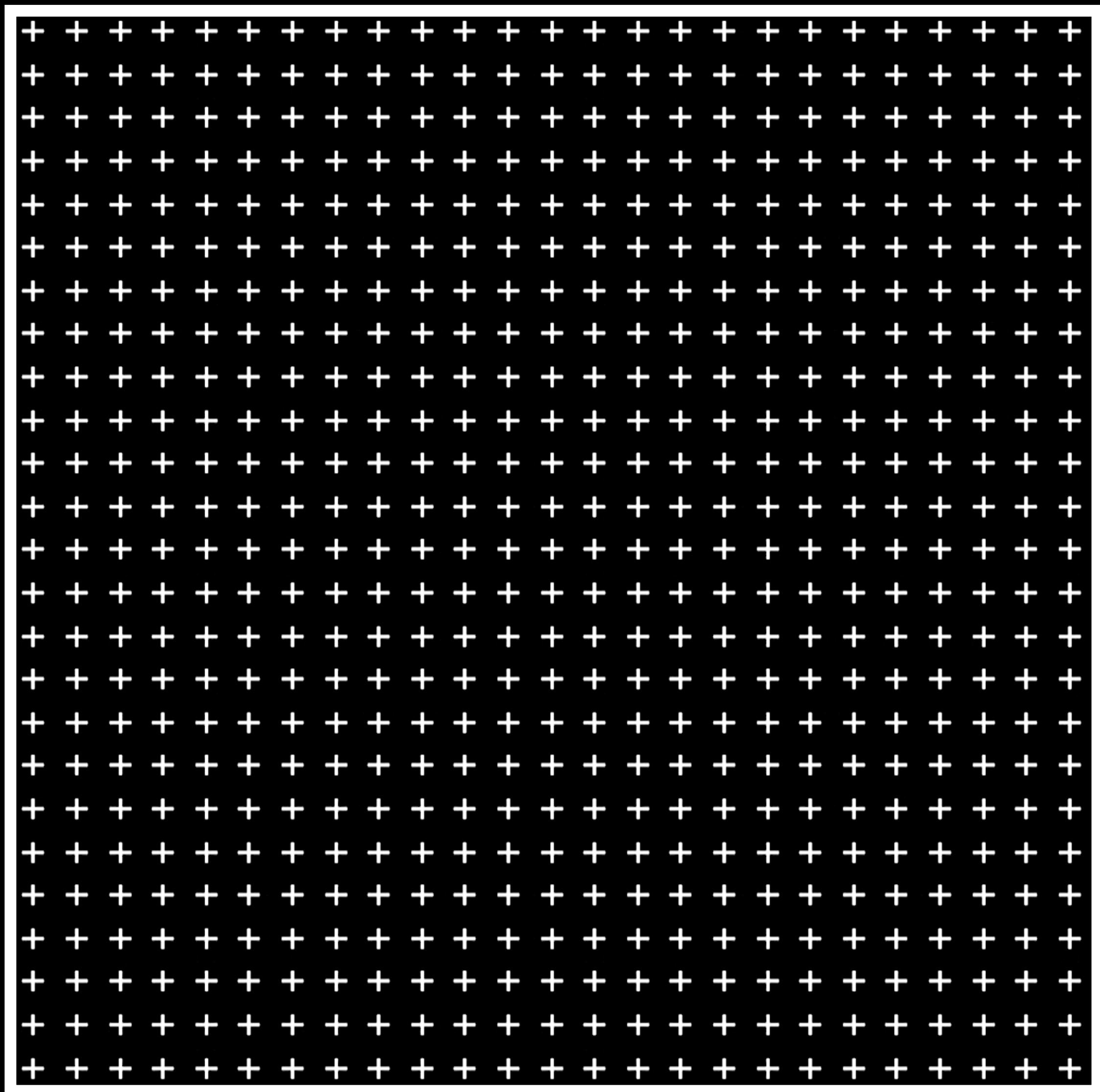
the (background) cosmological model is therefore **fully specified** through $\Omega_m, \Omega_r, \Omega_k, \Omega_\Lambda, h, w_0$ and w_a

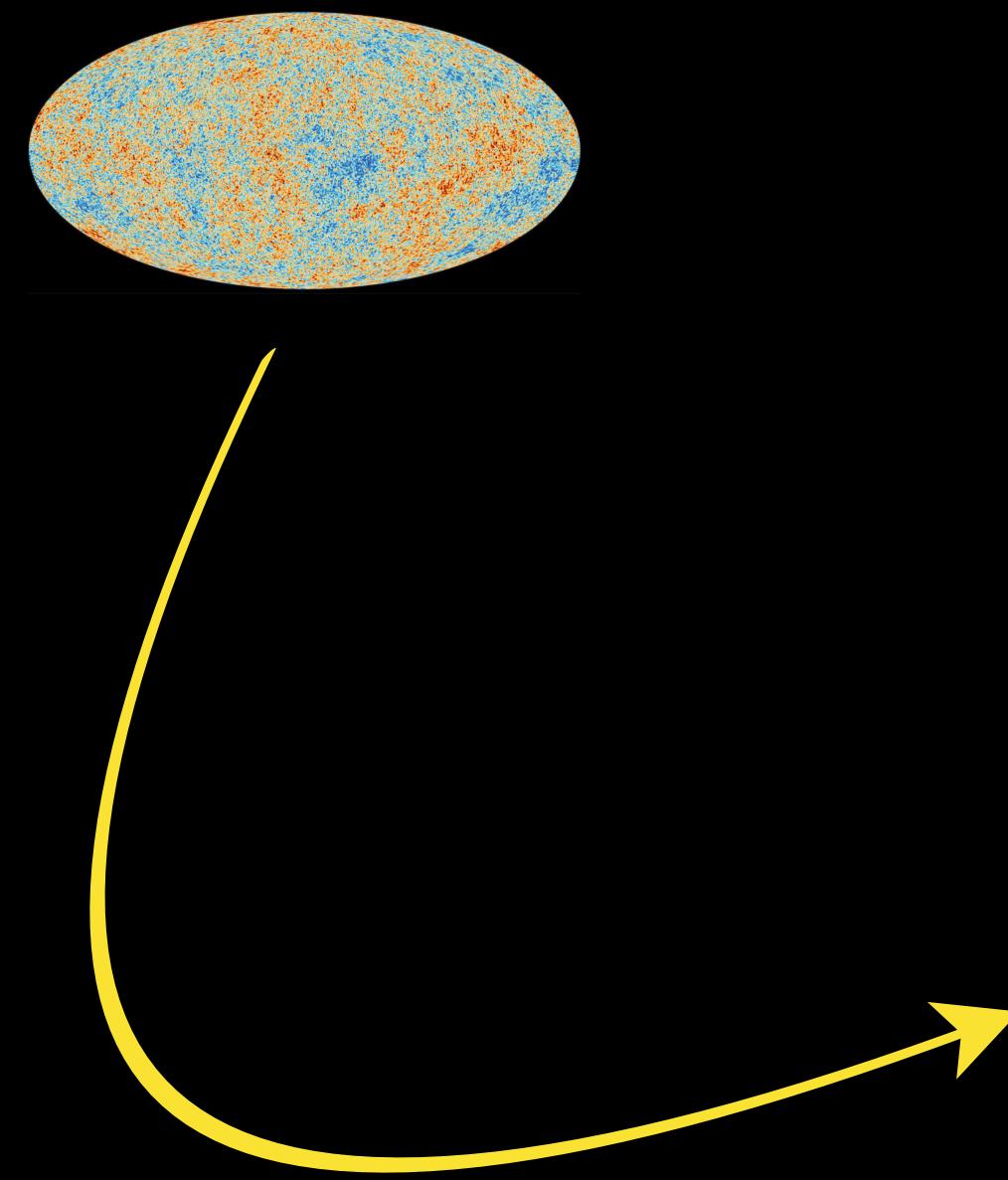
setting up initial conditions

measurement of the **cosmic microwave background radiation** gives us *precise constraints* on cosmological initial conditions



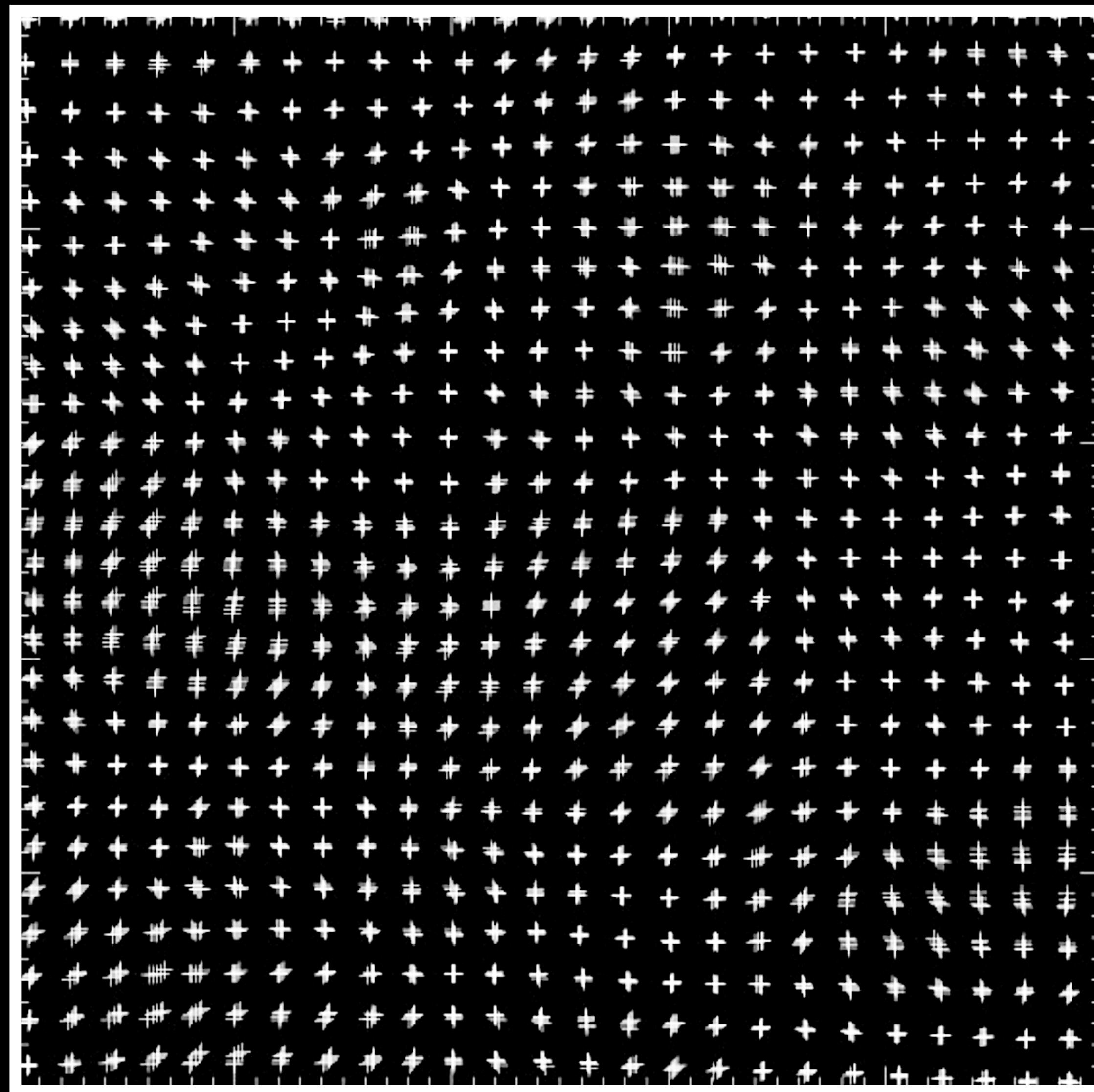
homogeneous & isotropic ICs





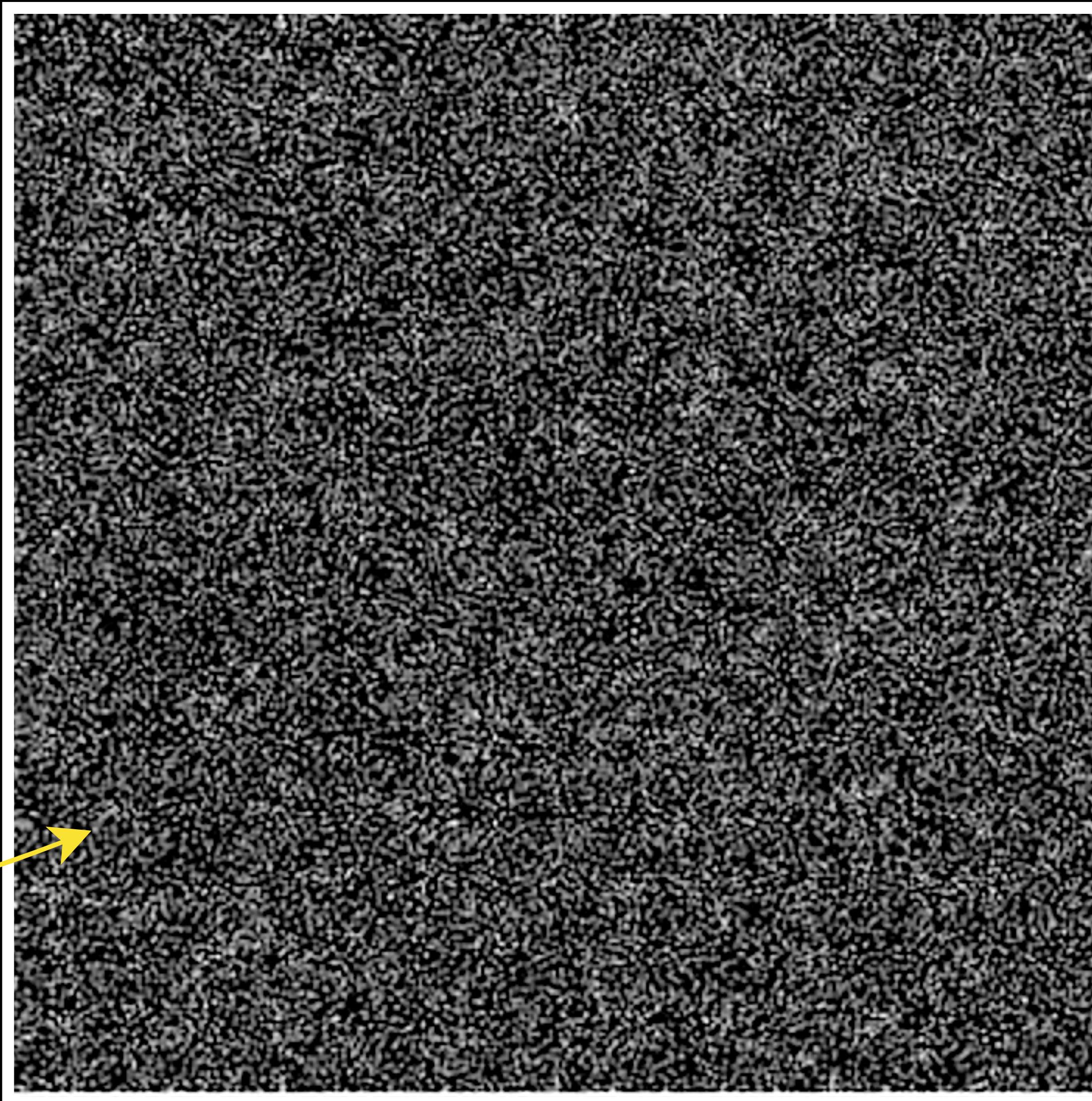
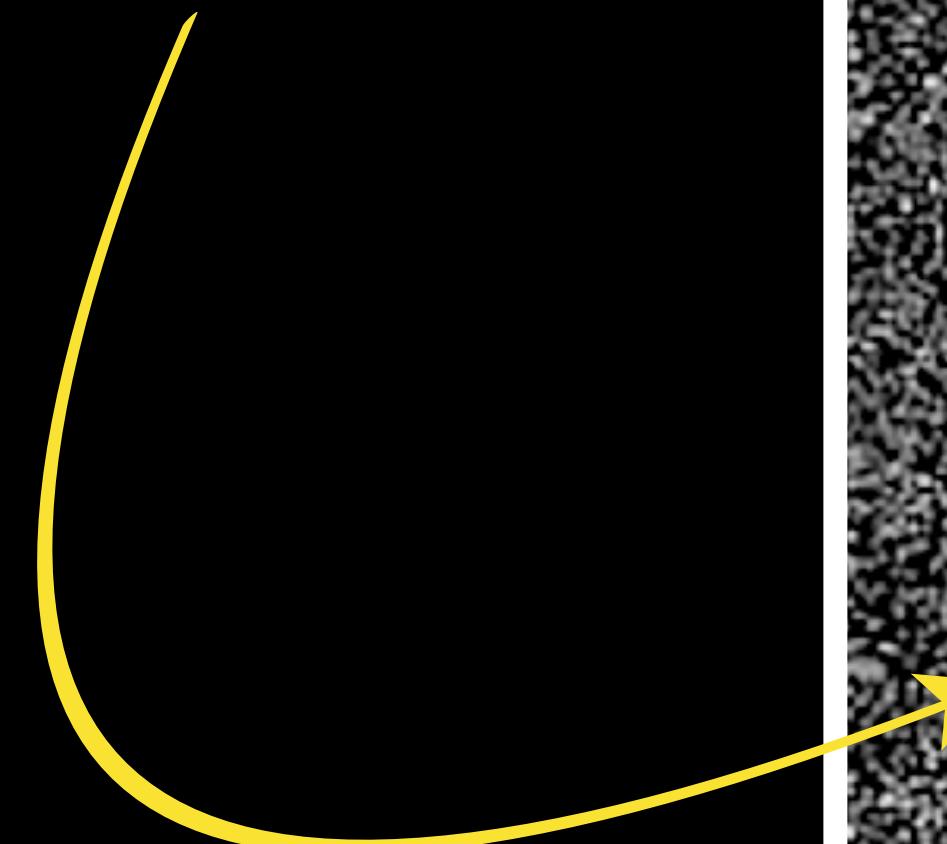
**these tiny fluctuations
will grow into non-linear
structures (e.g. filaments,
walls, haloes, clusters)
through gravitational
instability**

perturbed ICs



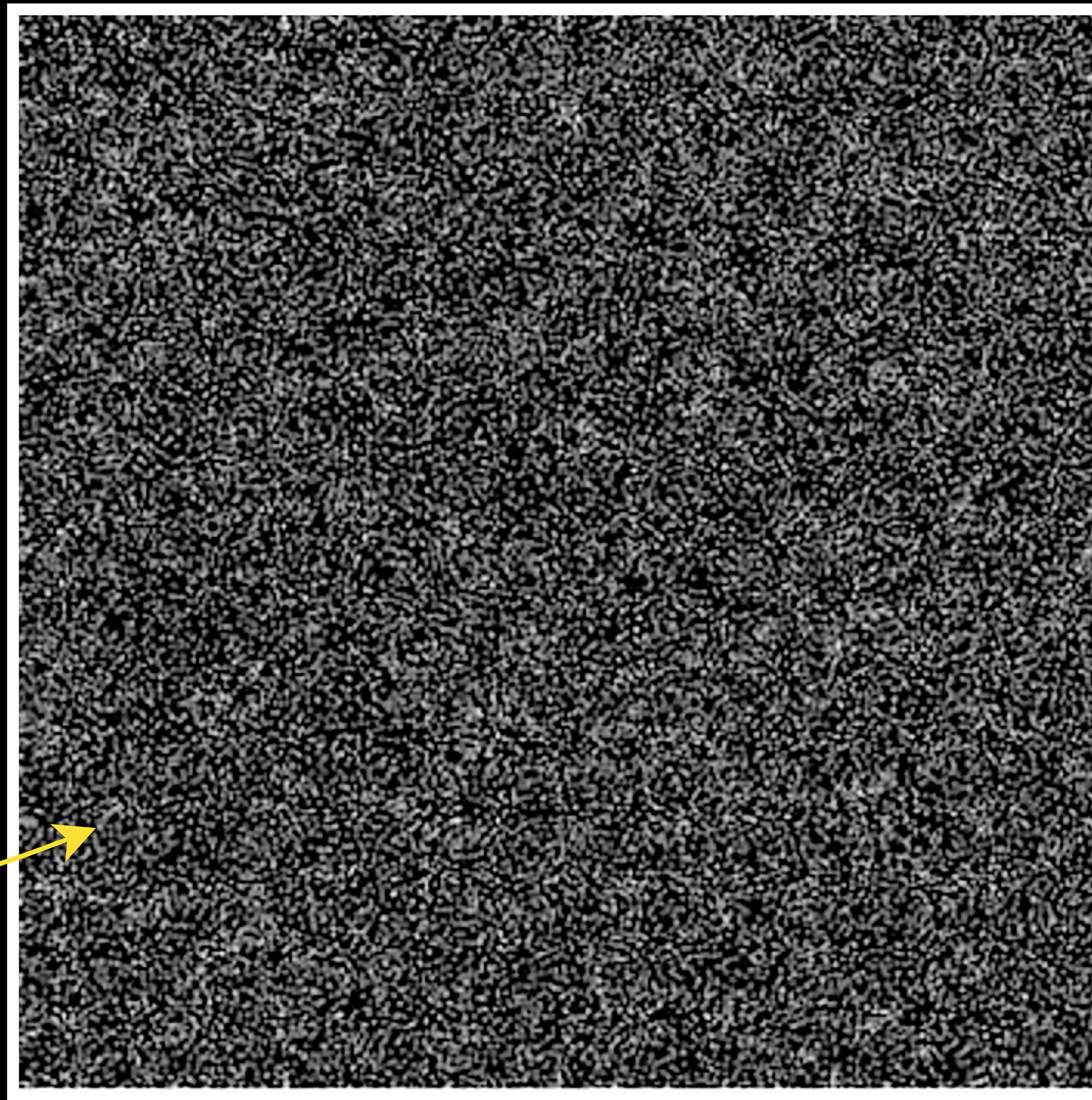
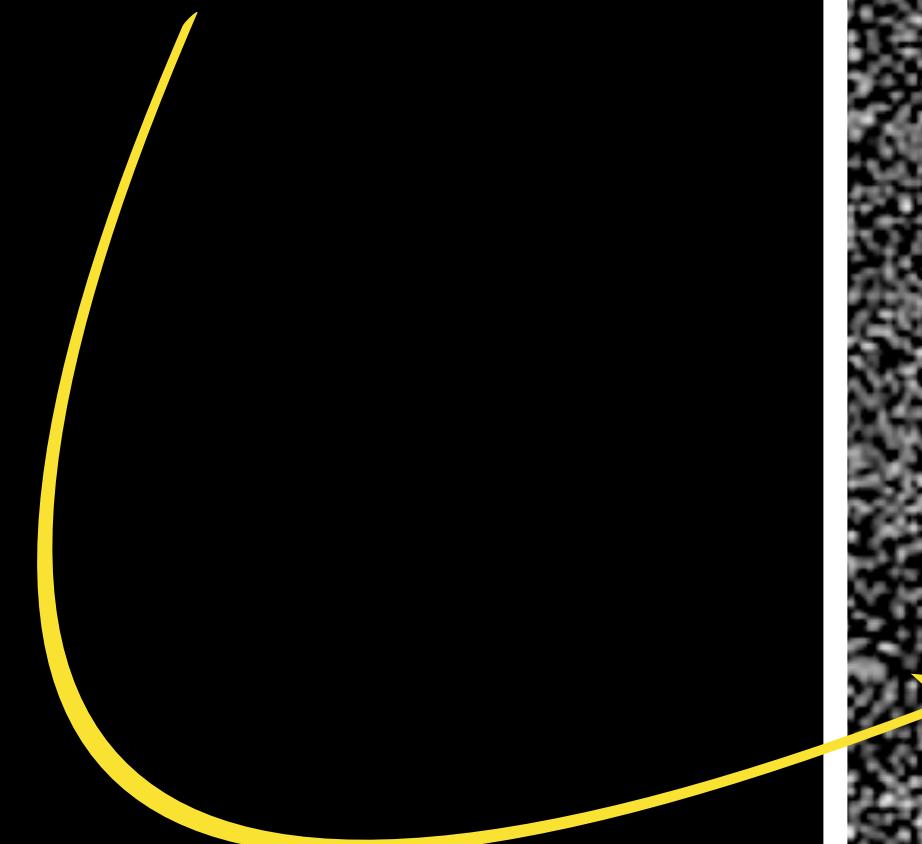
glass initial conditions

start with a Poisson [random] particle distribution and evolve this with the sign of gravity “inverted” [repulsive force] until particles “freeze” in comoving coordinates



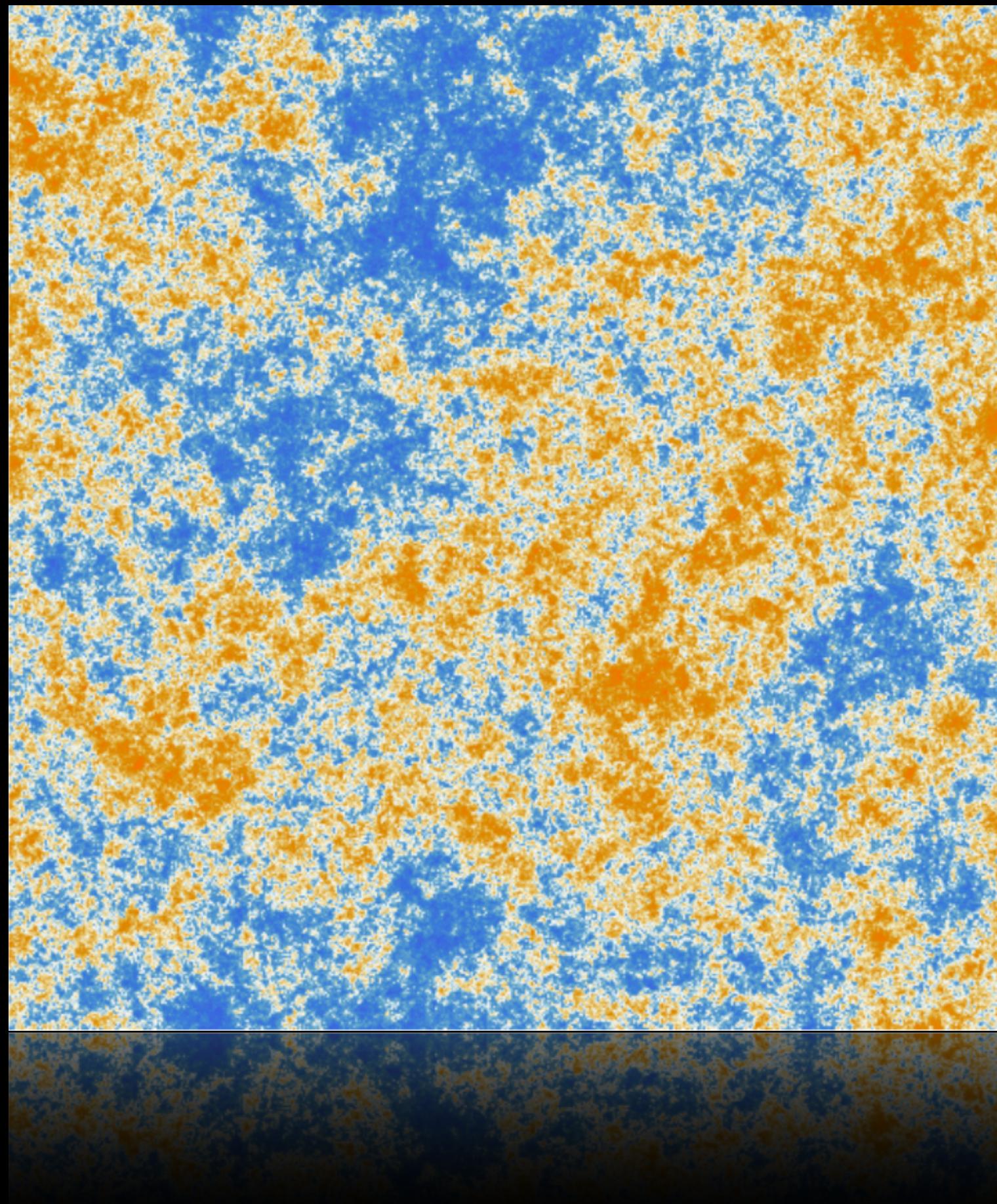
helps wash out the memory of the initial lattice

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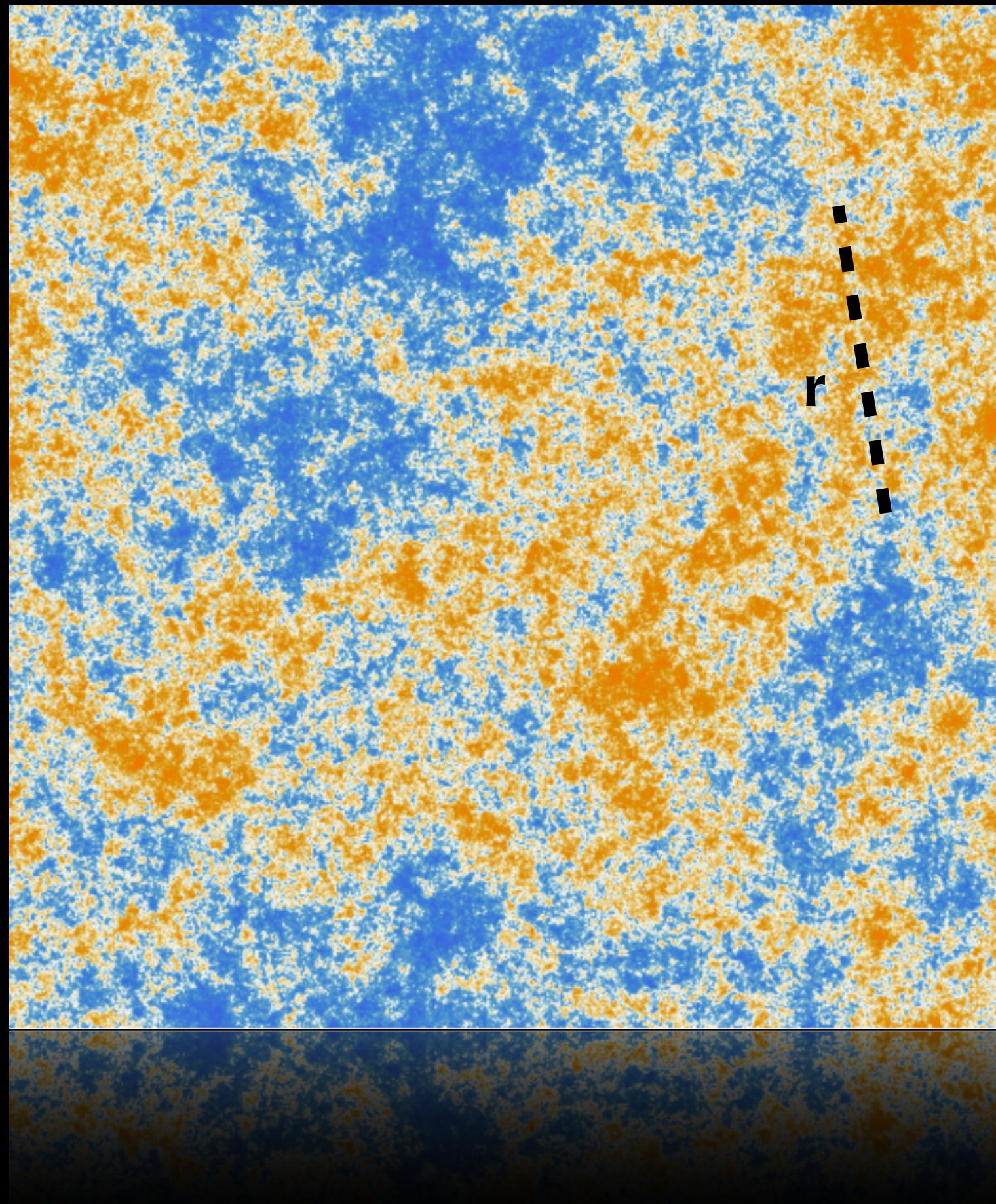


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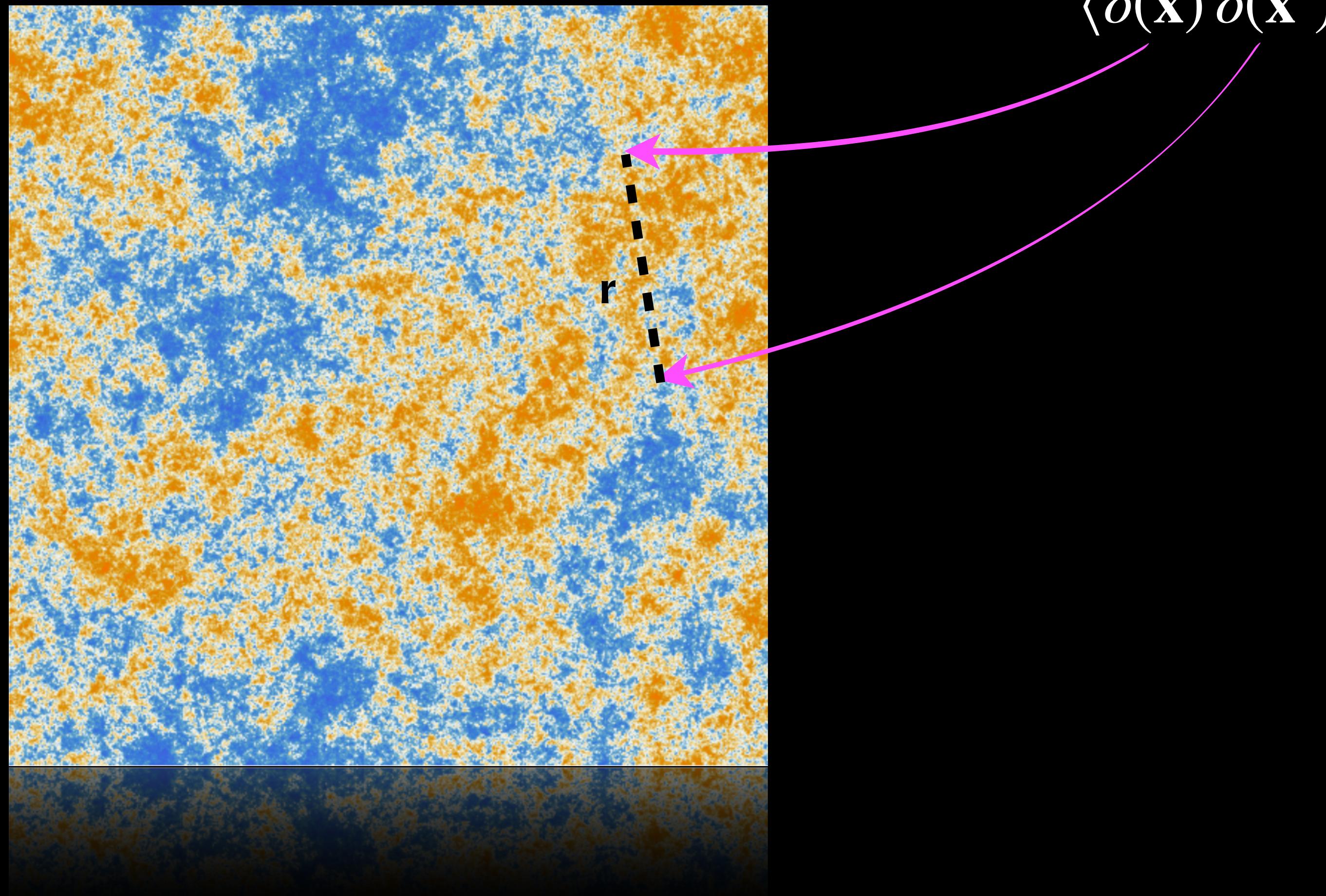
goal: create a **Gaussian random distribution** that is statistically consistent with the fluctuations measured in the CMB



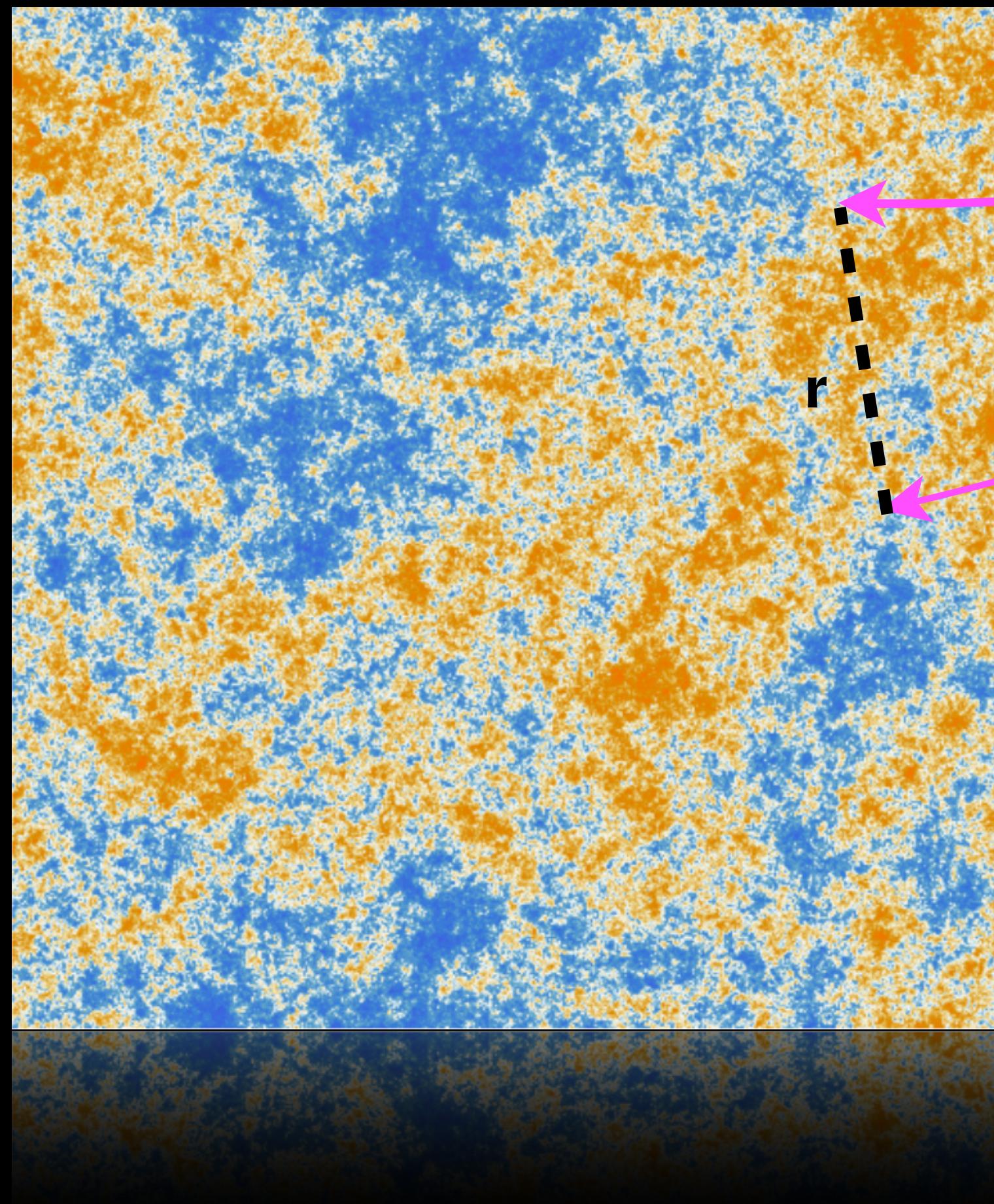
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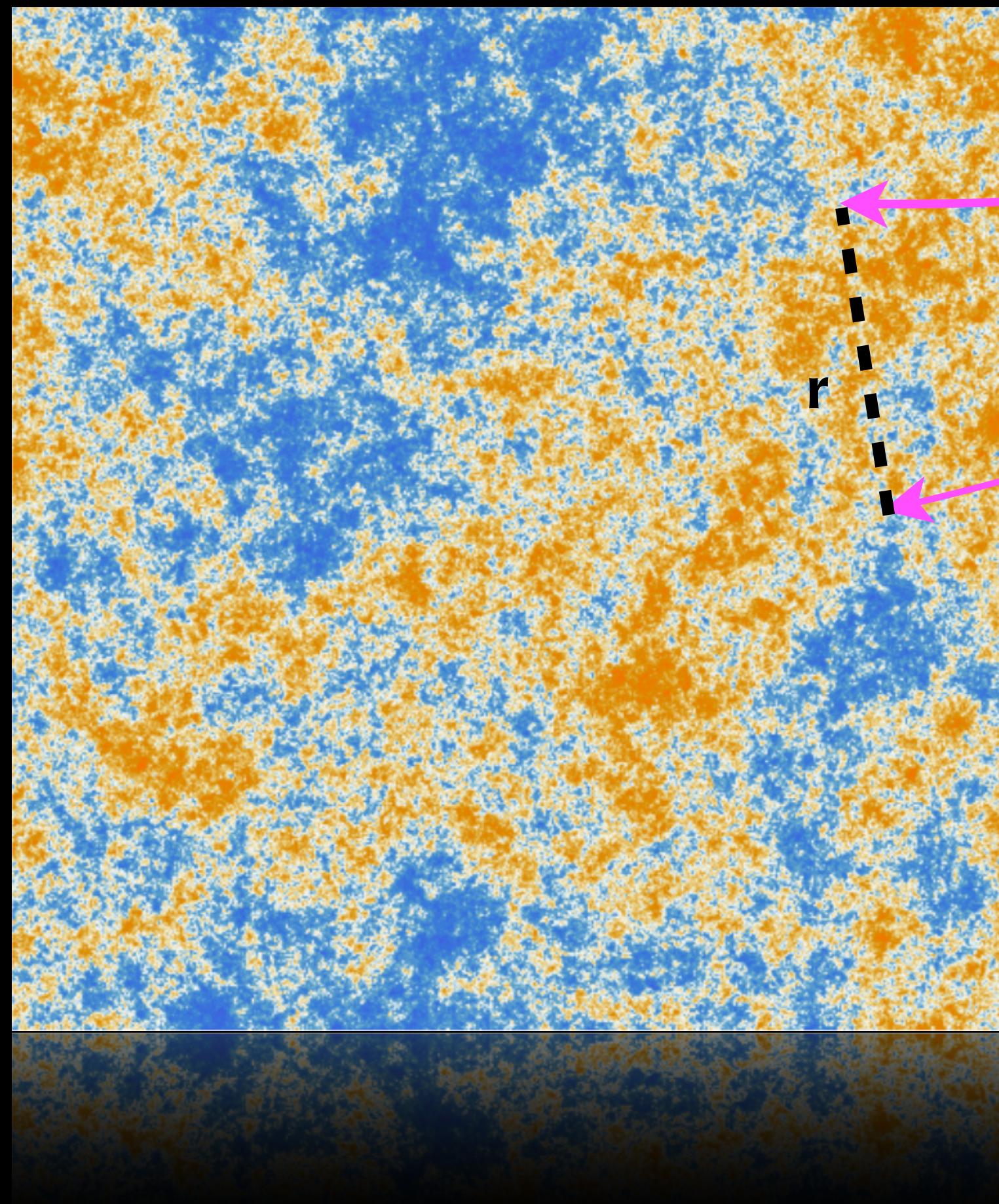
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correlation function

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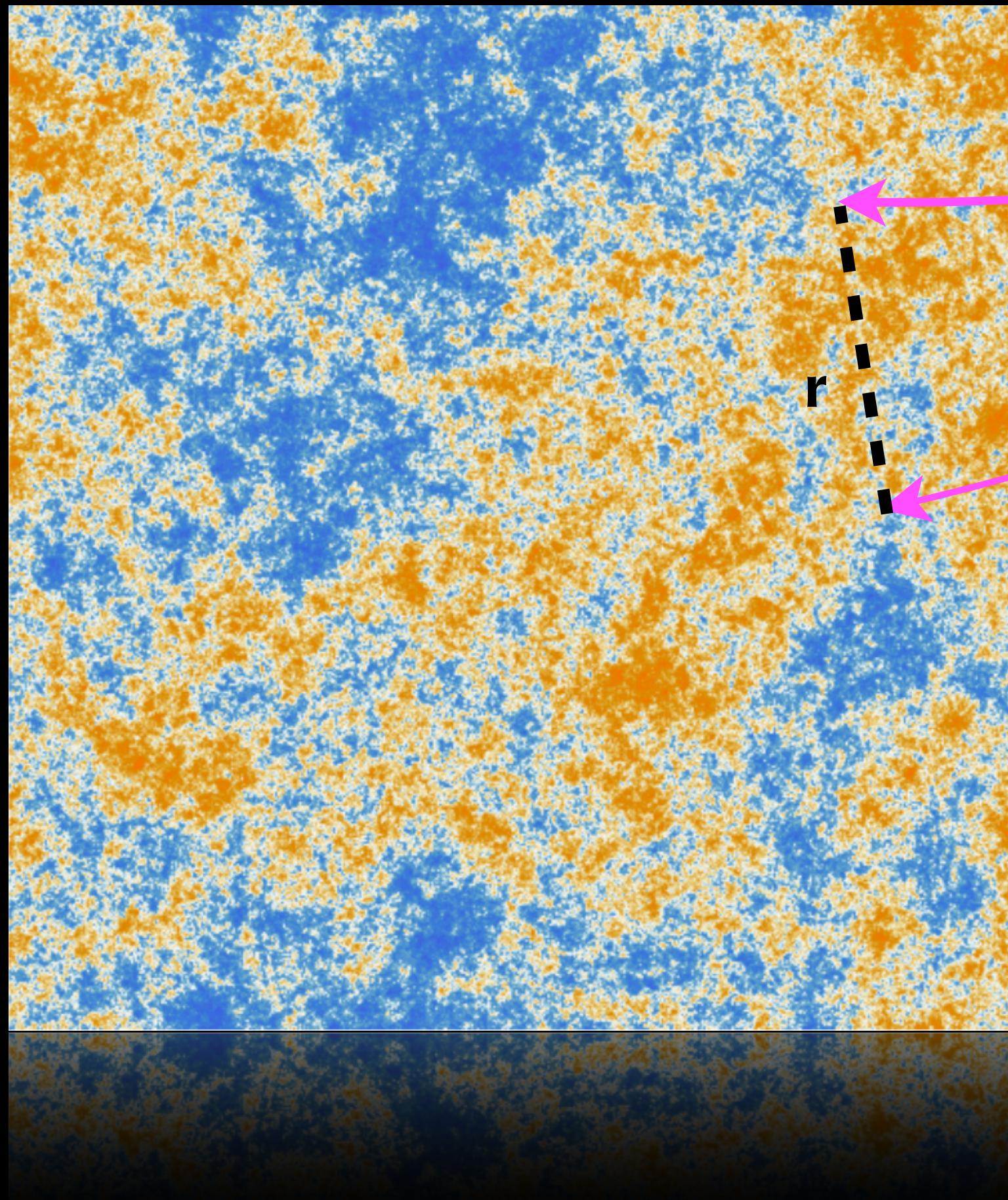
$$\langle \delta(\mathbf{x}) \delta(\mathbf{x}') \rangle = \xi(r)$$

$$\langle \delta(\mathbf{k}) \delta^*(\mathbf{k}') \rangle = P(k)$$

correlation function

power spectrum

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power spectrum

the statistical properties of a Gaussian random field are characterised fully by $P(k)$

fluctuation amplitudes $\propto \sqrt{P(k)}$

phases $\in [0, 2\pi]$

the primordial power spectrum

inflation makes a specific prediction for the primordial density field that is a power-law:

$$P(k) \propto k^{n_s}$$

where $n_s = 1$ corresponds to a **scale-invariant** power spectrum

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$$P(k, t) = A k^{n_s}$$

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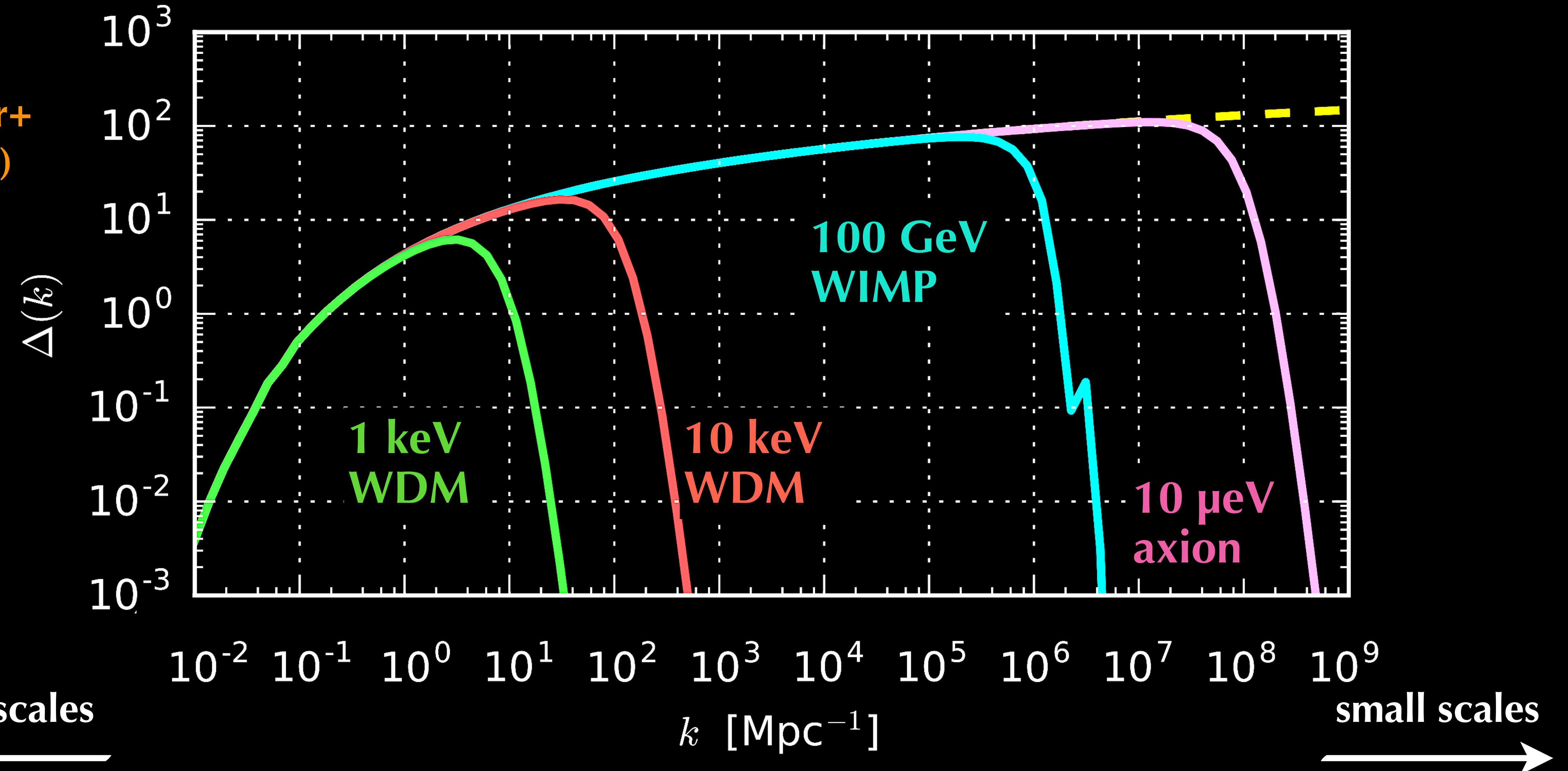
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$$P(k, t) = A k^{n_s} |T(k, t)|^2$$

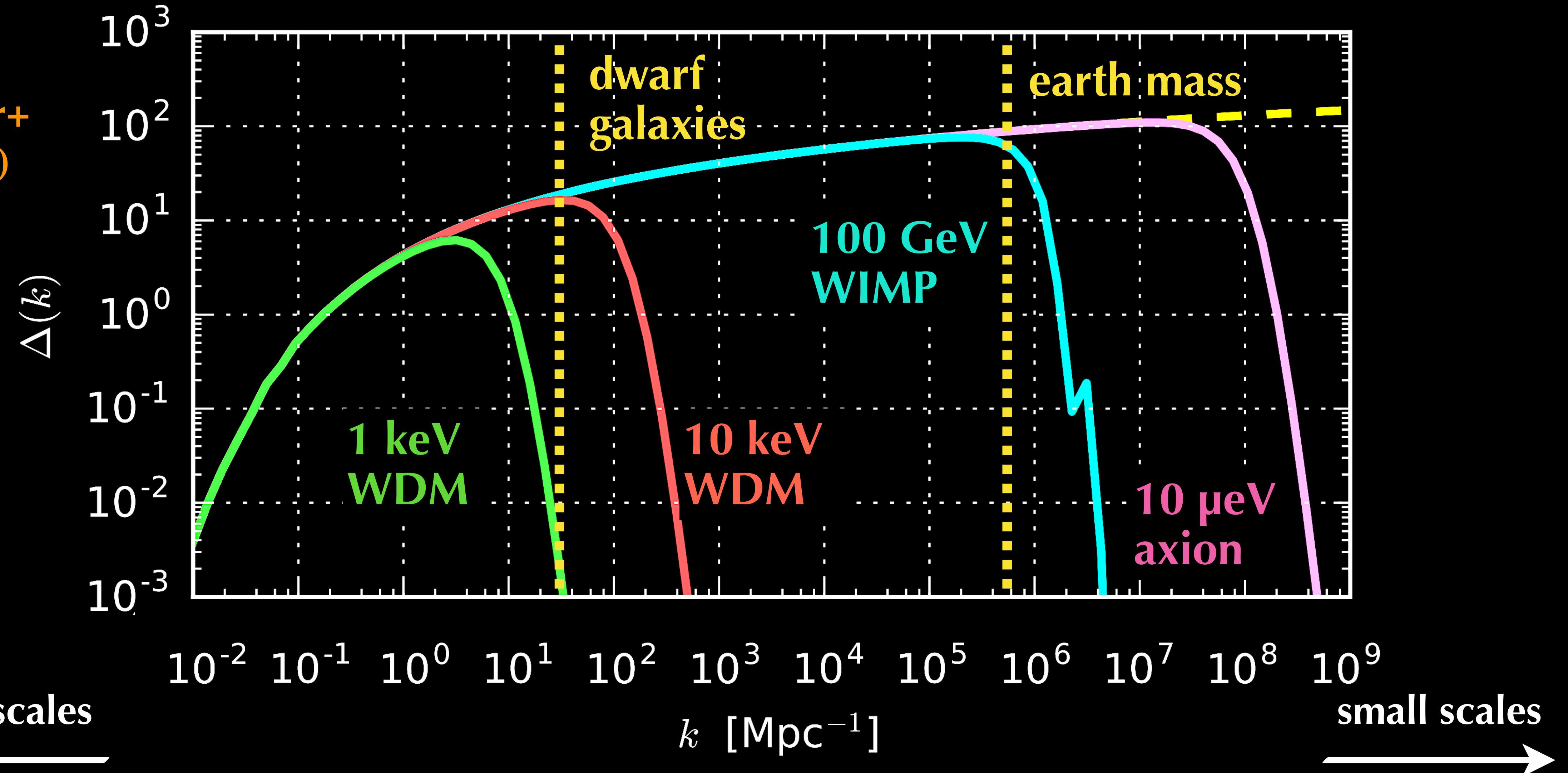
computed by public codes
like CAMB, CLASS etc.

Stücker+
(2018)



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Stücker+
(2018)



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now, we more or less have everything we need: we just need to **perturb the initial particle configuration according to these fluctuations**. the position of a particle initially at coordinate \mathbf{q} after some time t is given by:

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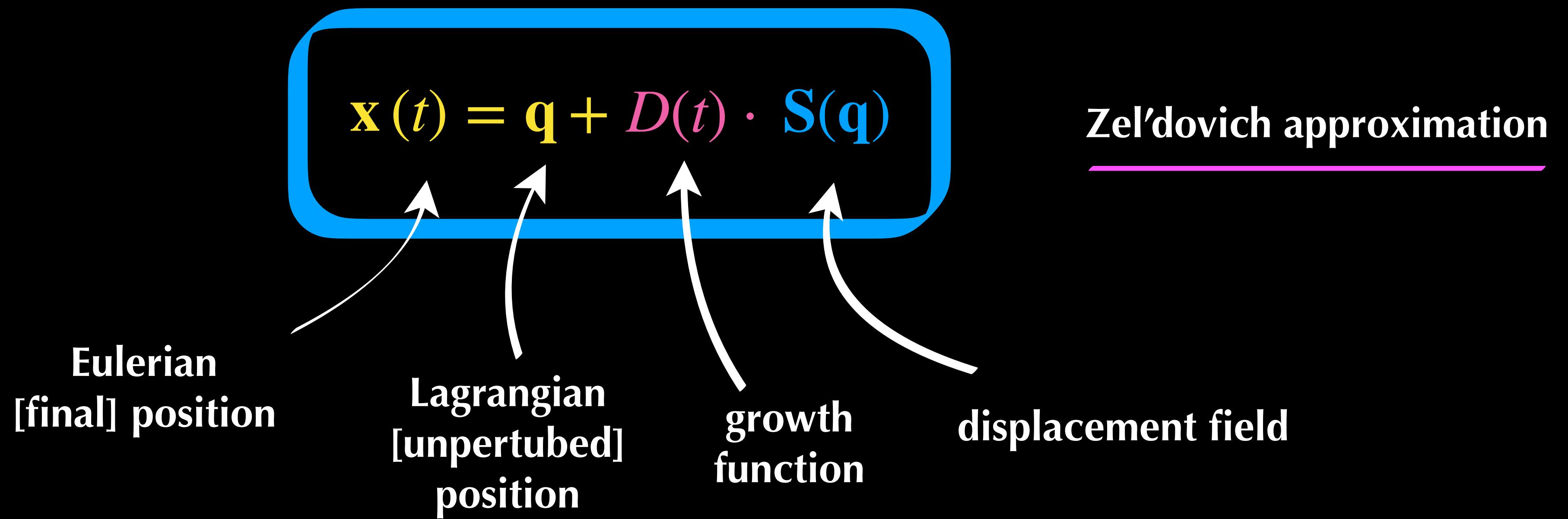
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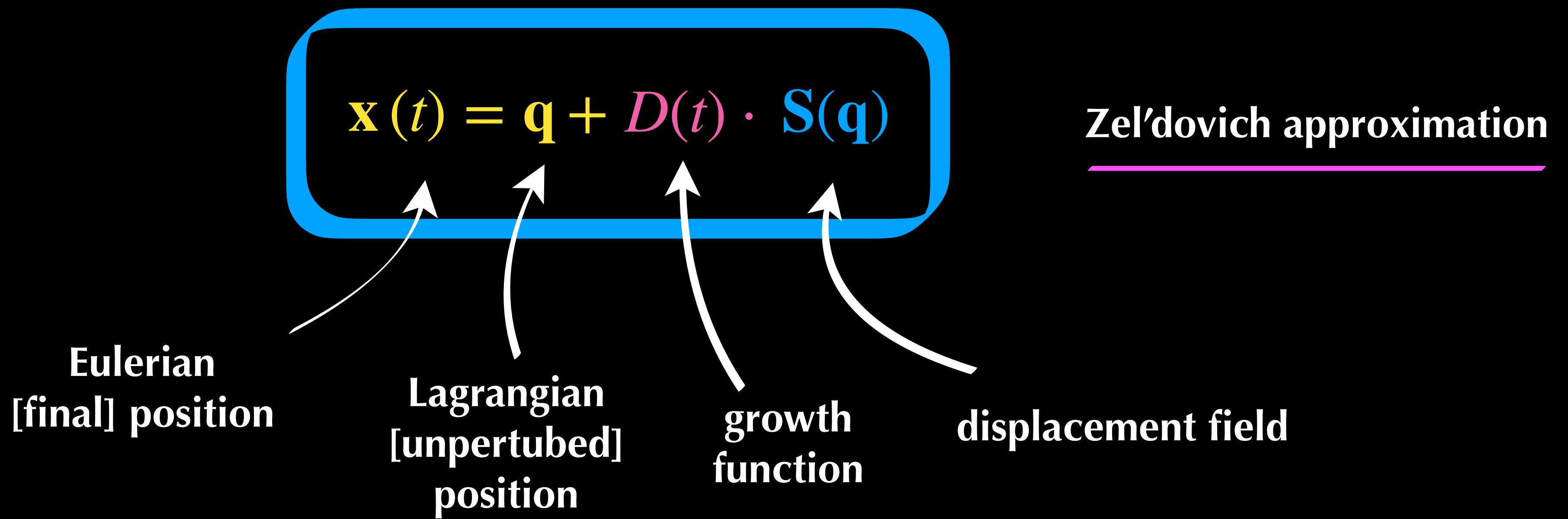
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Zel'dovich approximation

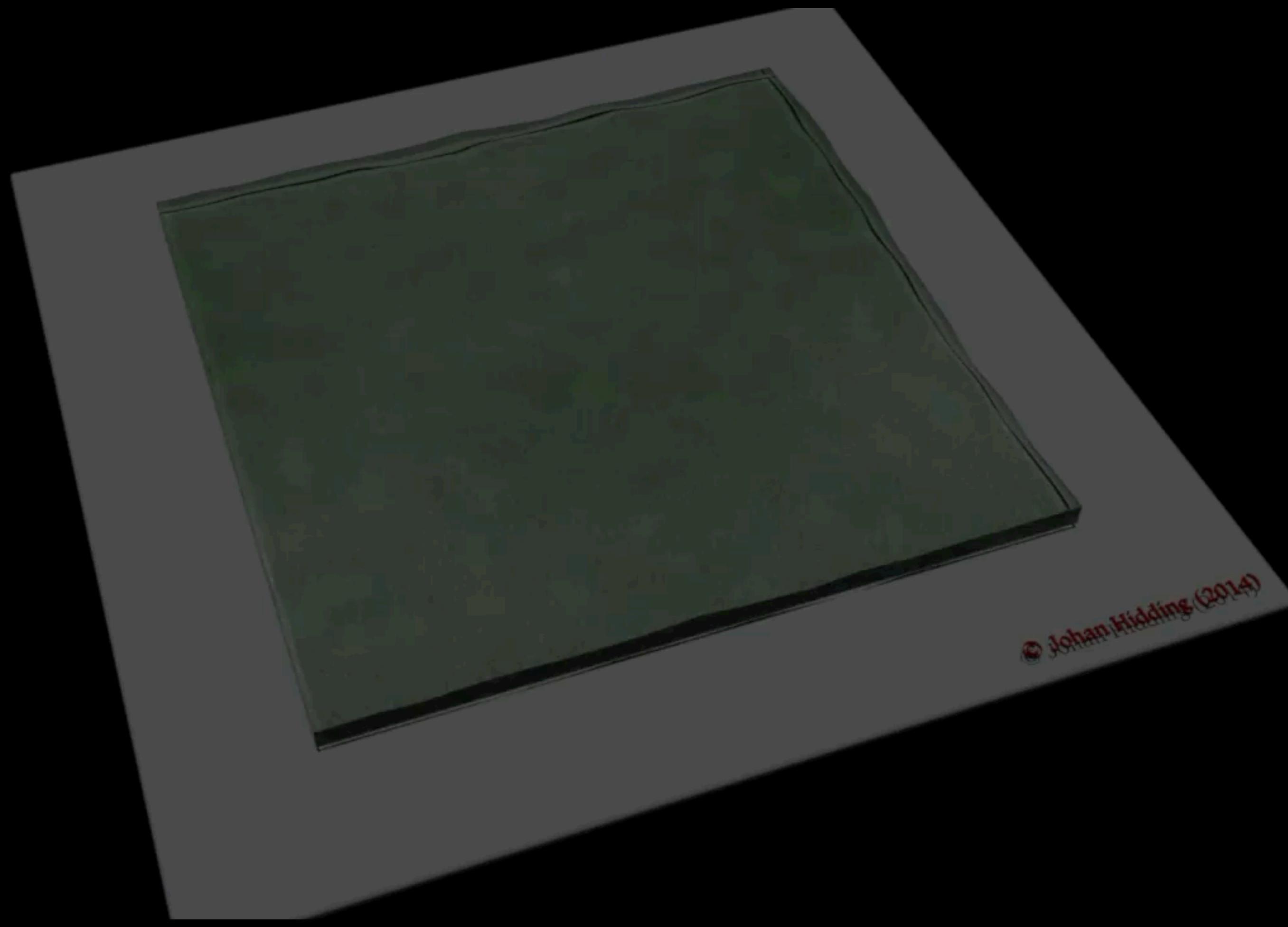
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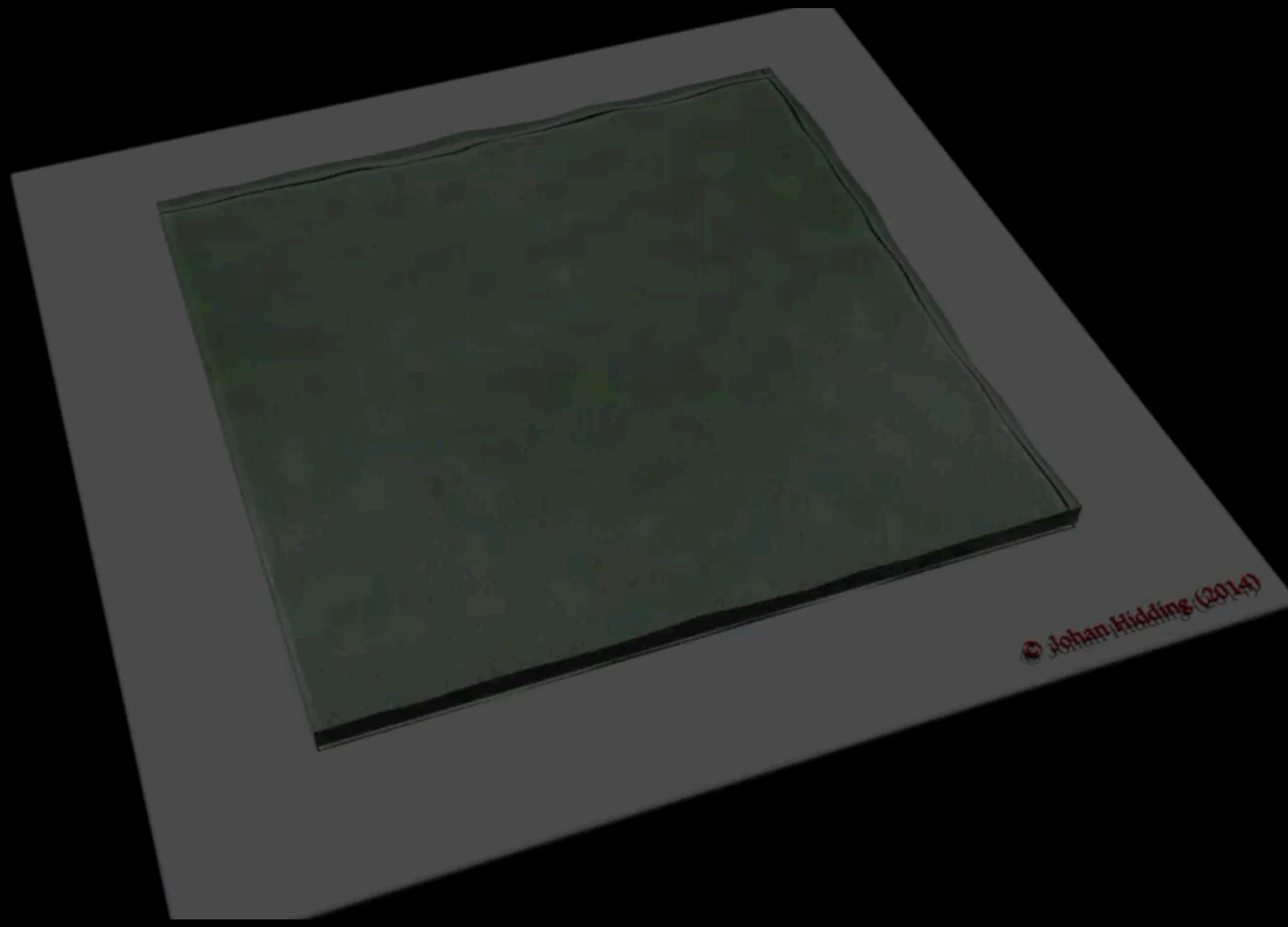
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$\mathbf{S}(\mathbf{q}) \propto -\nabla\Phi(\mathbf{q})$, and we know that Φ is related to $\delta(\mathbf{k})$ through **Poisson's equation**



credit: [Johan Hidding](#)



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the non-linear density field

while the initial conditions of our cosmos may be approximated as a Gaussian random field, the late-time, non-linear density is anything but Gaussian! gravitational instability naturally transitions the matter field away from Gaussianity

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given a density field, $\delta(\mathbf{x})$, you can also quantify the degree of non-Gaussianity by computing moments:

size of the grid
used to smooth
the density field

$$\langle \delta^n \rangle = \frac{1}{N_g} \sum_i^{N_g} (\delta^i - \langle \delta \rangle)^n$$

- $n = 0$ (mean)
- $n = 2$ (variance)
- $n = 3$ (skewness)
- $n = 4$ (kurtosis)

lecture notes:

<https://github.com/sownakbose/AstroPGCourse-Nbody>

jupyter notebooks:

https://github.com/Shaun-T-Brown/Summer_school
[link also on lecture notes Github page]

