



Primordial Non-Gaussianity: Simulations

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w/ J. R. Bond, J. Braden, T. Morrison, G. Stein.

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Outline

- Introduction
- 1. Non-Gaussianity from inflationary models
- 2. Modeling non-Gaussianity for numerical simulations
- 3. Independent Component Analysis
- Conclusion



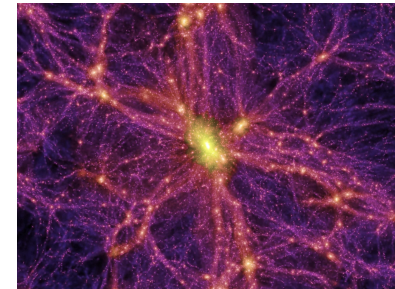
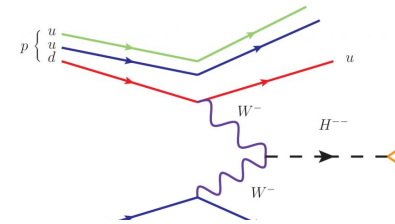
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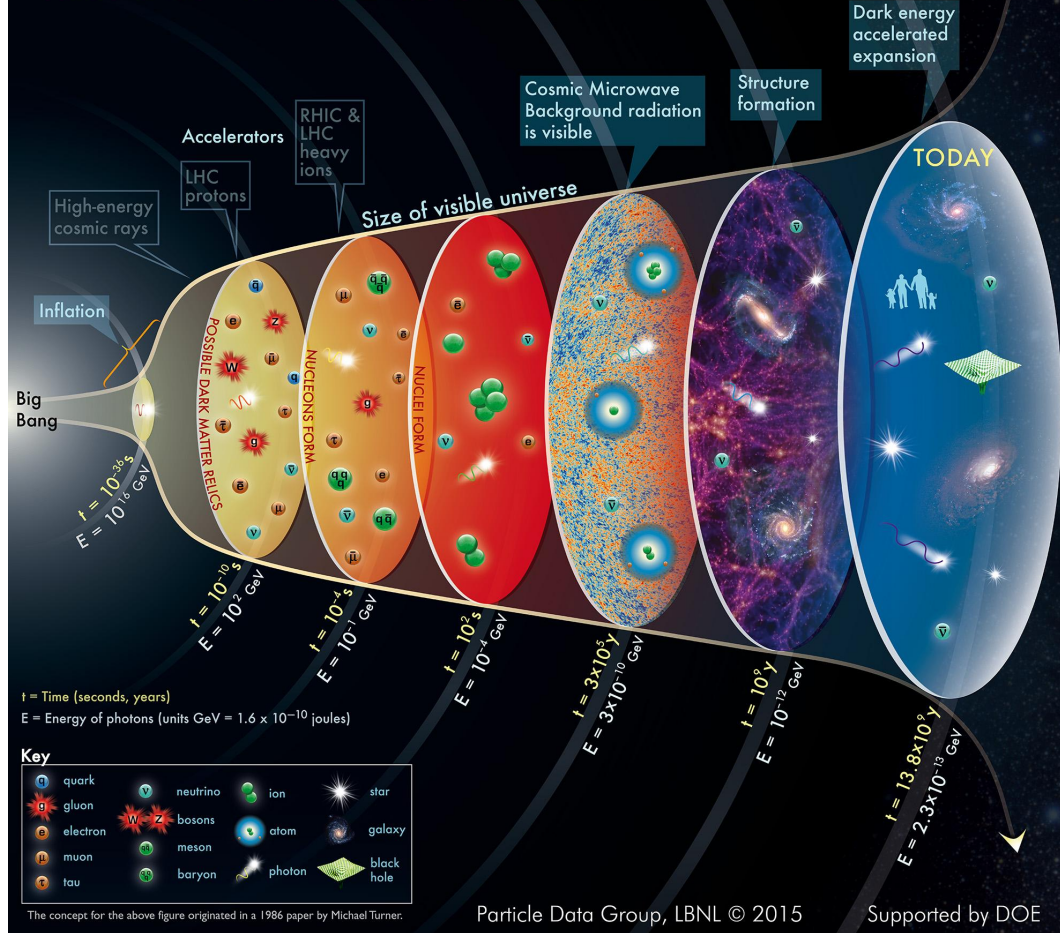
Why non-Gaussianity?

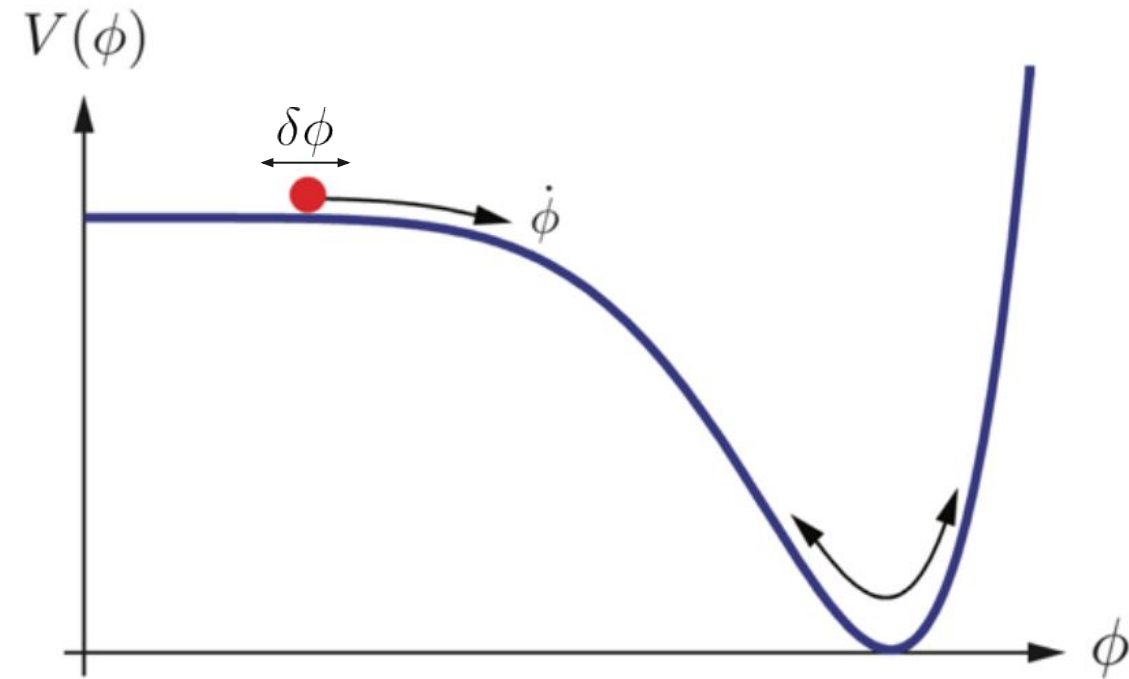
Detection of primordial non-Gaussianity is like:

- Detection of Higgs particles for the Standard Model
- Direct detection of Dark Matter



HISTORY OF THE UNIVERSE



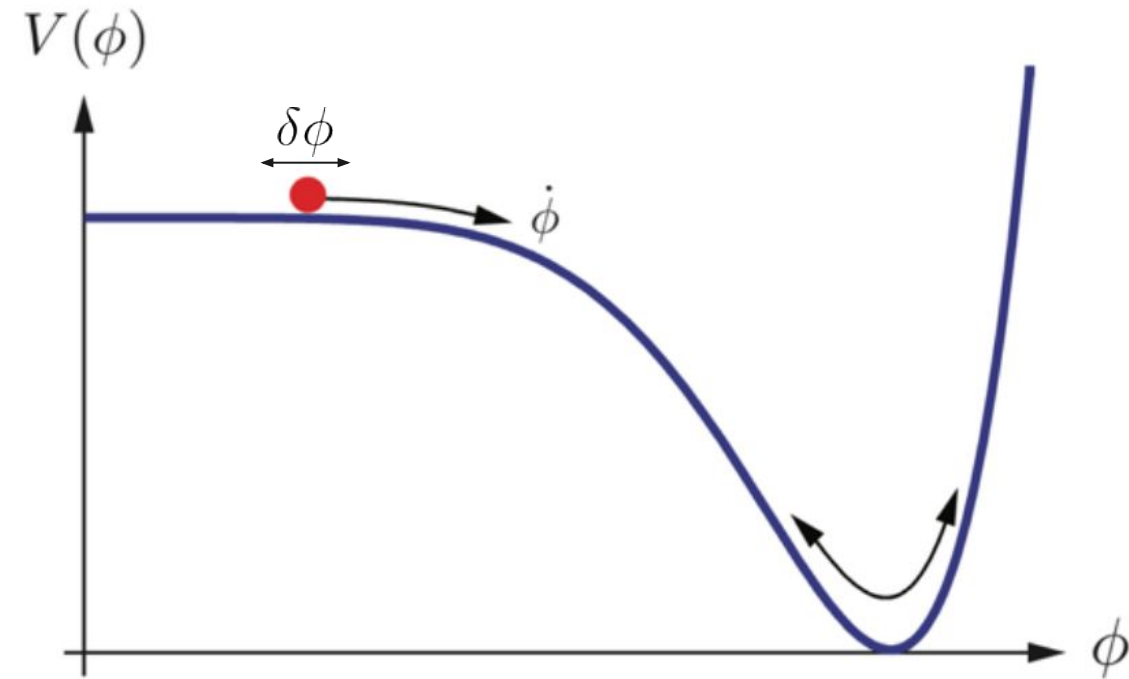


$$\mathcal{L}(\phi) = \frac{1}{2}(\partial\phi)^2 - V(\phi)$$

- Inflaton motion drives the exponential expansion
- Predicts Gaussian and nearly scale invariant perturbations

Credit: D. Bauman

Classical inflation
Single-field slow-roll



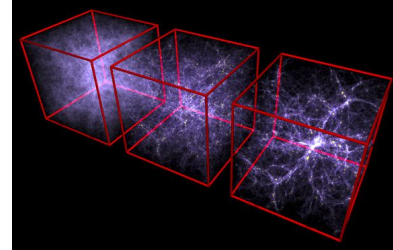
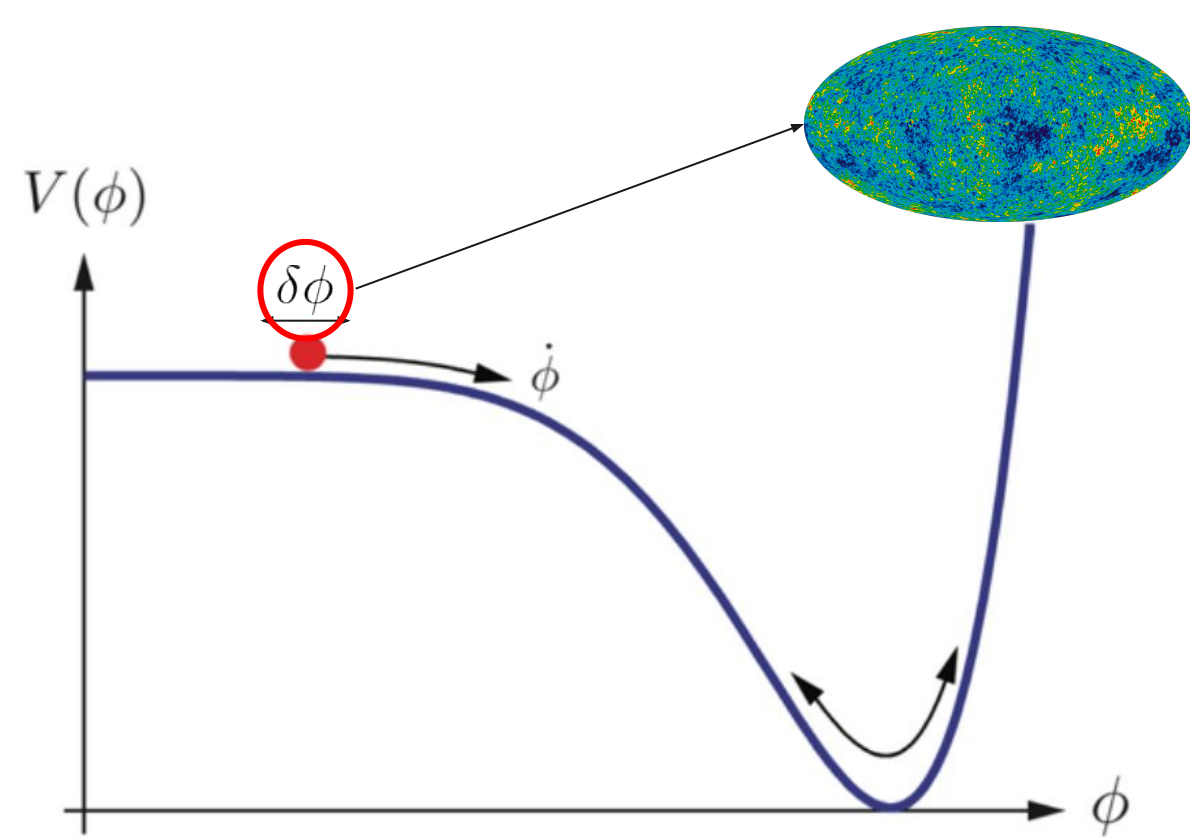
$$\mathcal{L}(\phi) = \frac{1}{2}(\partial\phi)^2 - V(\phi)$$

$$\phi(\mathbf{x}, t) = \phi_0(t) + \delta\phi(\mathbf{x}, t)$$

- Background evolution: solves flatness and horizon problems

Credit: D. Bauman

Classical inflation
Single-field slow-roll



- Perturbations: seeds to the CMB and LSS

Credit: D. Bauman

Classical inflation
Single-field slow-roll



Observable: Curvature Perturbations

$$ds_3^2 = a^2 e^{2\zeta} \delta_{ij} dx^i dx^j$$



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Physical variable: $\delta\phi(\mathbf{x}, t) \rightarrow \zeta(\mathbf{x}, t)$

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Classical inflation predicts:

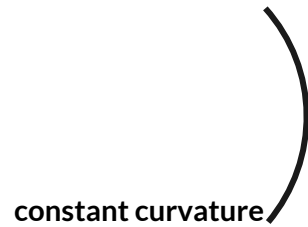
$$P_\zeta \approx \frac{1}{2M_P^2 \epsilon} \left(\frac{H}{2\pi} \right)^2$$

$$\approx A_\phi \left(\frac{k}{k_0} \right)^{n_s - 1}$$

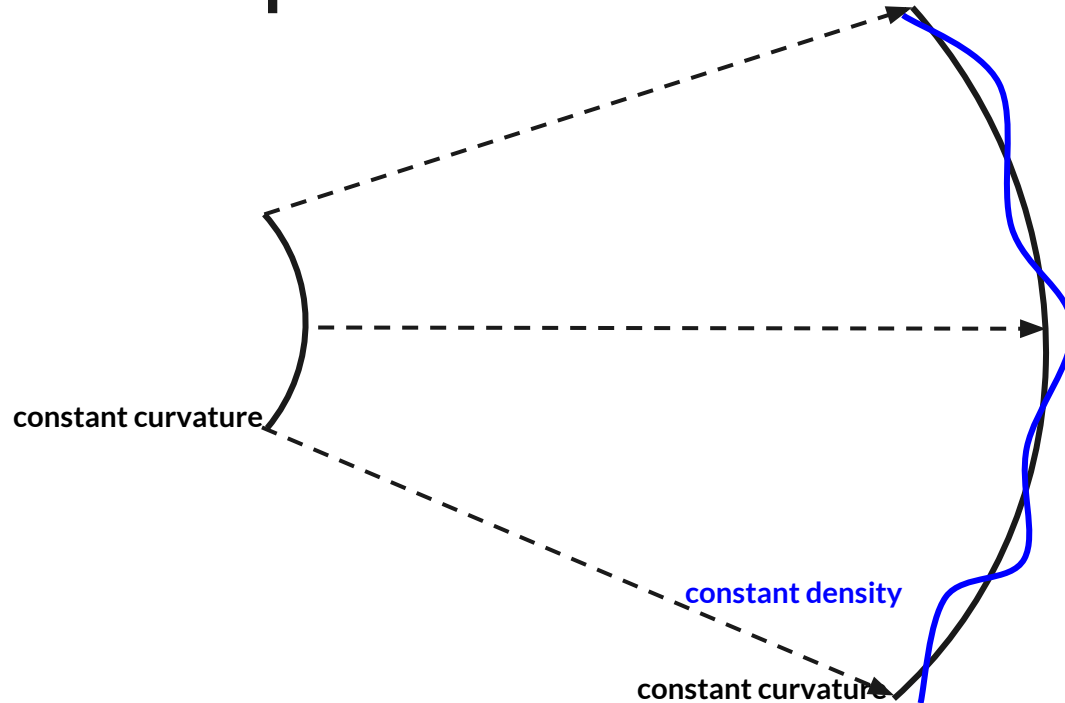
Measured by Planck



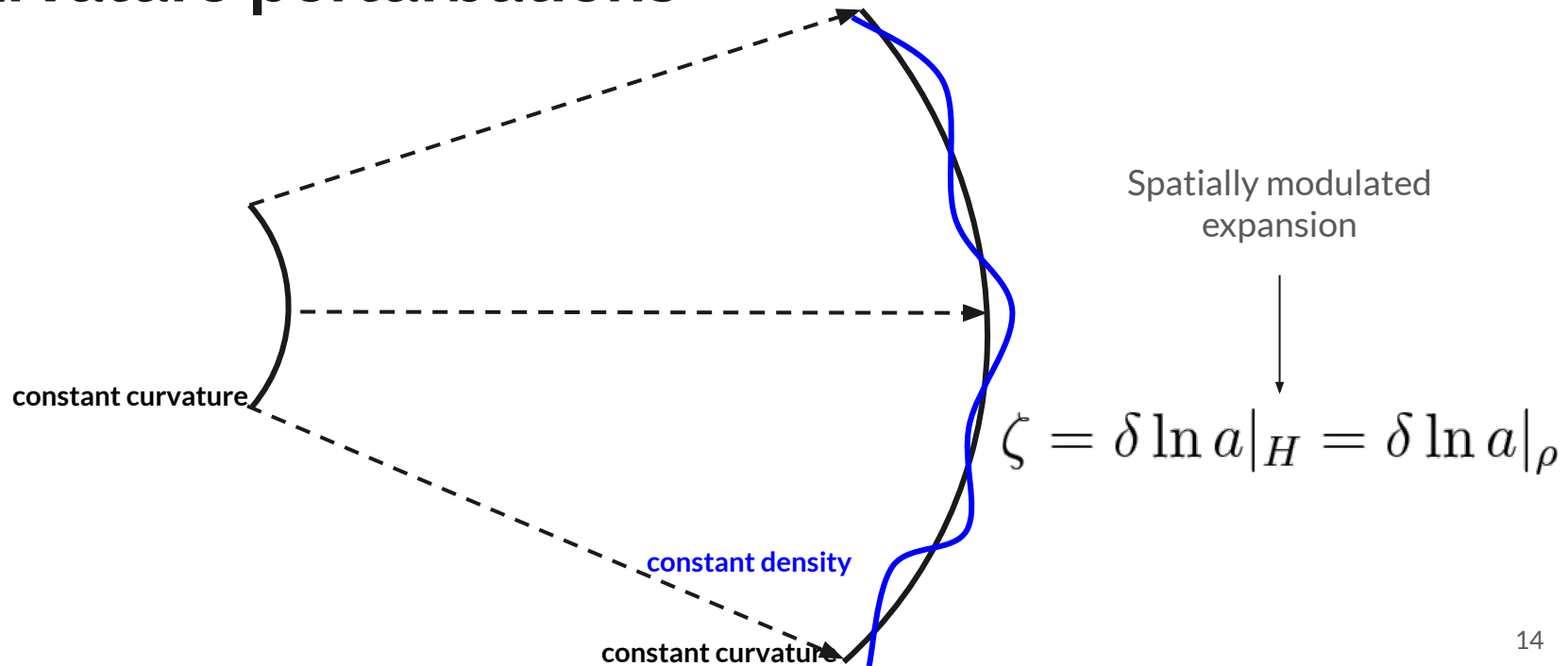
Curvature perturbations



Curvature perturbations



Curvature perturbations





Beyond classical inflation



Beyond classical inflation

- Gravity

$$\mathcal{S}_{EH} = \int d^4x \sqrt{-g} \left(\frac{R}{2} + \mathcal{L}_m \right) \rightarrow \mathcal{S}_{F(R)} = \int d^4x \sqrt{-g} \left(\frac{\textcolor{red}{F}(R)}{2} + \mathcal{L}_m \right)$$

$$\mathcal{S}_{EH} = \int d^4x \sqrt{-g} \left(\frac{R}{2} + \mathcal{L}_m \right) \rightarrow \mathcal{S}_{f(\phi)} = \int d^4x \sqrt{-g} \left(\textcolor{red}{f}(\phi) \frac{R}{2} + \mathcal{L}_m \right)$$



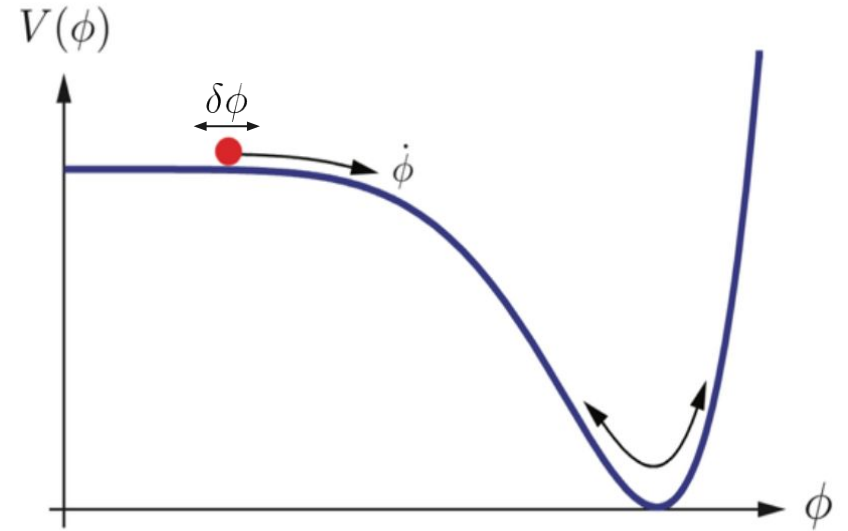
Beyond classical inflation

- Gravity
- Stochastic inflation

$$\phi(\mathbf{x}, t) = \phi_0(t) + \delta\phi(\mathbf{x}, t) \rightarrow \phi(\mathbf{x}, t) = \phi_{cg}(\mathbf{x}, t) + \phi_{fg}(\mathbf{x}, t)$$

Beyond classical inflation

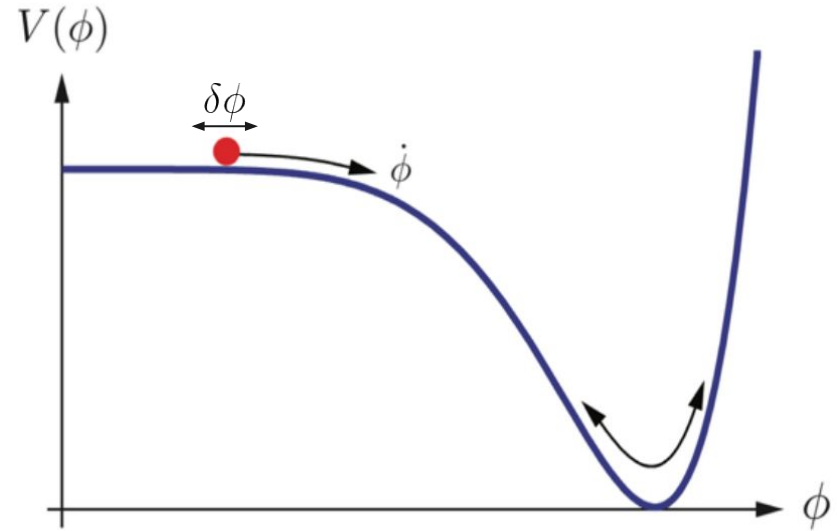
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Beyond classical inflation

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$$\phi(\mathbf{x}, t) = \phi_0(t) + \delta\phi(\mathbf{x}, t) \rightarrow \phi(\mathbf{x}, t) = \phi_{cg}(\mathbf{x}, t) + \phi_{fg}(\mathbf{x}, t)$$

$$\dot{\phi}_0 = -\frac{1}{3H}V'(\phi_0) \rightarrow \dot{\phi}_{cg} = -\frac{1}{3H}V'(\phi_{cg}) + \frac{H^{3/2}}{2\pi}\xi(t)$$



Beyond classical inflation

- Gravity
- Stochastic inflation
- Multiple fields

$$\mathcal{L} = \frac{1}{2}(\partial\phi)^2 - V(\phi) \rightarrow \mathcal{L} = \sum_i \frac{1}{2}(\partial\phi_i)^2 - V(\phi_1, \dots, \phi_n)$$



Beyond classical inflation

- Gravity
- Stochastic inflation
- Multiple fields
- ...



Outline

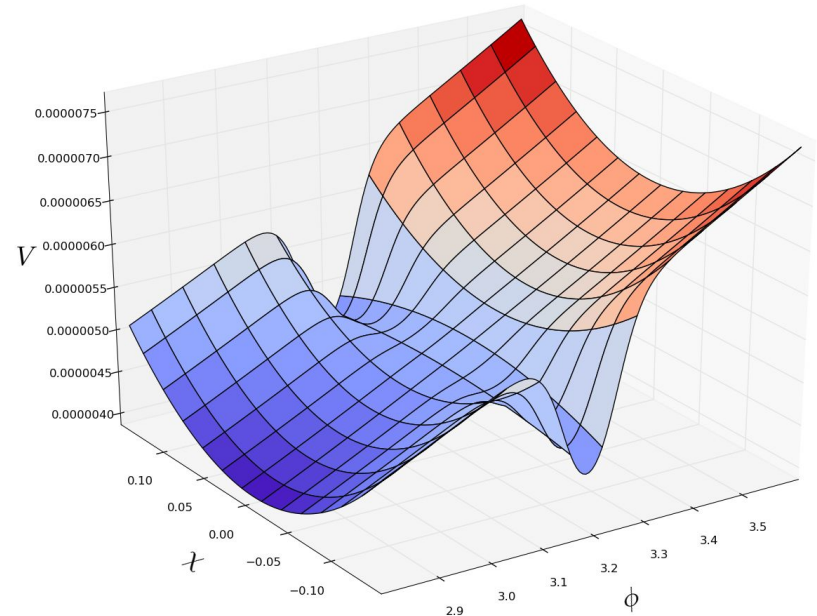
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During inflation: potential instability

Two fields: $\phi + \chi$

ϕ -localized instability in
the potential along χ

$$V(\chi, \phi) = \frac{1}{4}\lambda\phi^4 + \Delta V(\phi, \chi)$$



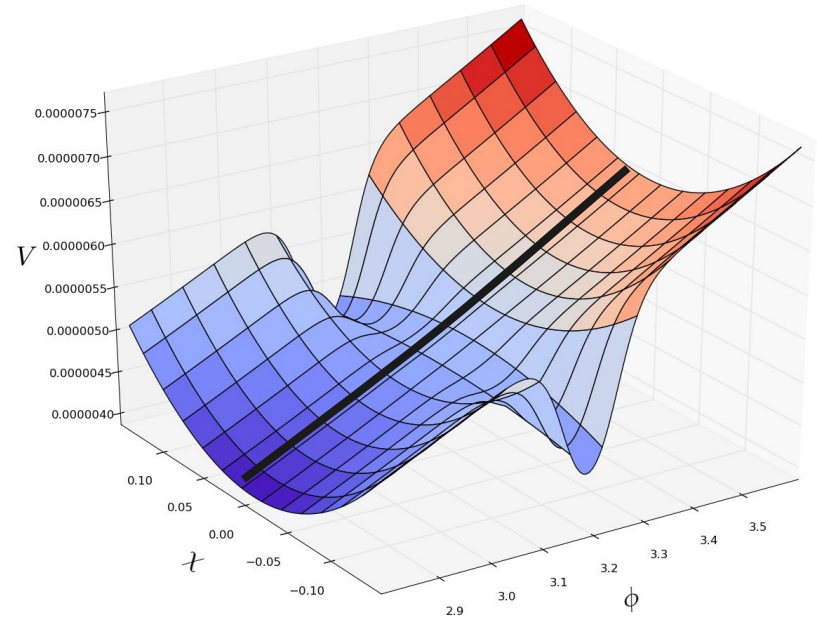
Credit: T. Morrison

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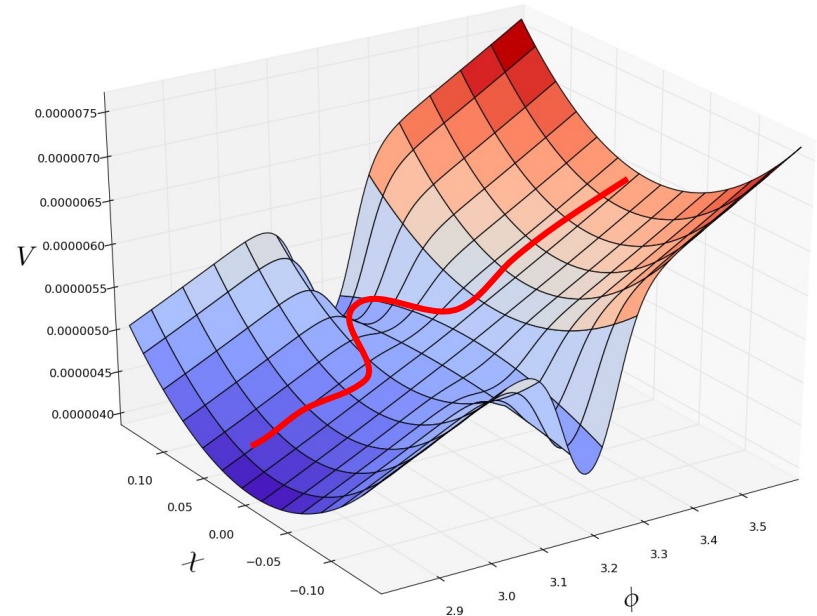


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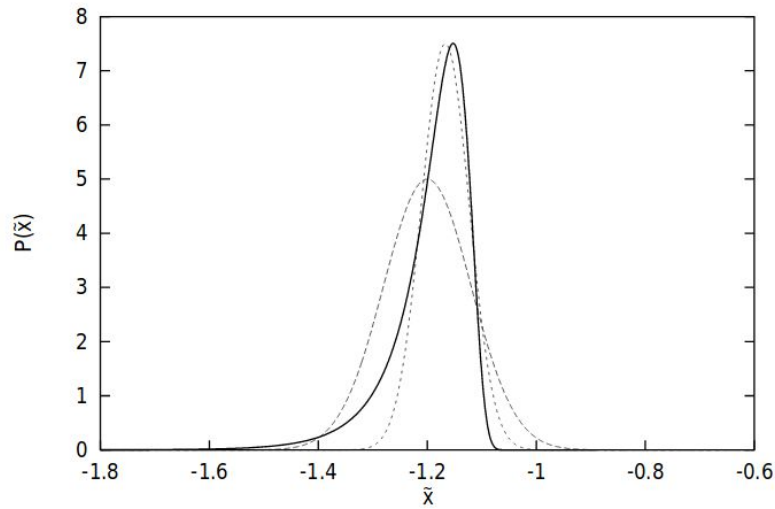
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During inflation: stochastic inflation

The non-trivial inflaton trajectory may yield non-Gaussian contributions



Non-Gaussianity from stochastic inflation can also give more accurate PBH formation [Bullock, Primack '97]



After inflation: preheating [Greene, Kofman, Linde, Starobinsky '97]

Fields: Inflaton ϕ + massless χ

Potential: $V(\phi, \chi) = \frac{1}{4}\lambda\phi^4 + \frac{1}{2}g^2\chi^2\phi^2$

$$\tilde{\chi}_k'' + \left[\kappa^2 + \frac{g^2}{\lambda} \text{cn}^2(\tilde{\tau}, 1/\sqrt{2}) \right] \tilde{\chi}_k = 0, \quad \kappa^2 = \frac{k^2}{\lambda A_\phi^2}$$

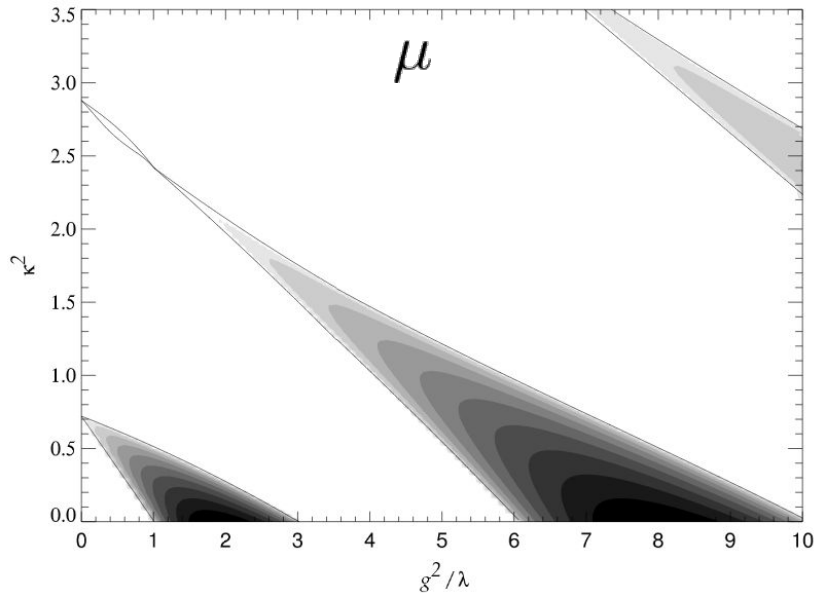
$$\tilde{\chi}_k(\tilde{\tau}) = e^{\mu(\kappa, g^2/\lambda)\tilde{\tau}} f(\tilde{\tau})$$

After inflation: preheating [Greene, Kofman, Linde, Starobinsky '97]

Fields: Inflaton ϕ + massless χ

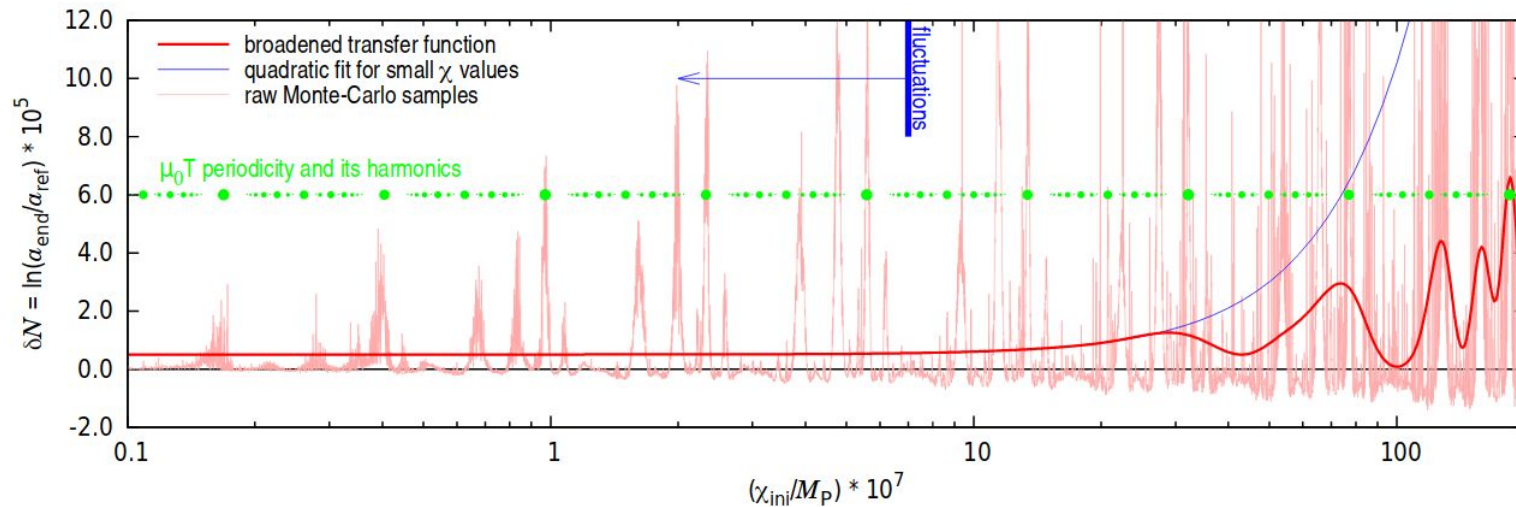
Potential: $V(\phi, \chi) = \frac{1}{4}\lambda\phi^4 + \frac{1}{2}g^2\chi^2\phi^2$

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After inflation: preheating

[Bond, Frolov, Huang, Kofman '09]



Obtained from many highly accurate symplectic lattice simulations.

$$\zeta = \zeta_G + F_{NL}(\chi)$$



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Inflation: lattice simulations

Solve the the fields evolution equations in FLRW metric:

- Initial conditions: Bunch-Davies vacuum
- Equations: $\ddot{\phi}_i - \frac{1}{a^2} \Delta \phi_i + 3H\dot{\phi}_i + \frac{\partial V}{\partial \phi_i}(\phi_1, \dots, \phi_n) = 0$ + Friedmann eqs.
- Curvature perturbations: $\zeta = \frac{\dot{\rho} + 3H(\rho + p)}{3H(\rho + p)} = \frac{1}{a^2} \sum_i \frac{\nabla \cdot (\dot{\phi}_i \nabla \phi_i)}{3(\rho + p)}$



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Non-Gaussianity with vanishing, e.g., bispectrum? (T. Morrison)

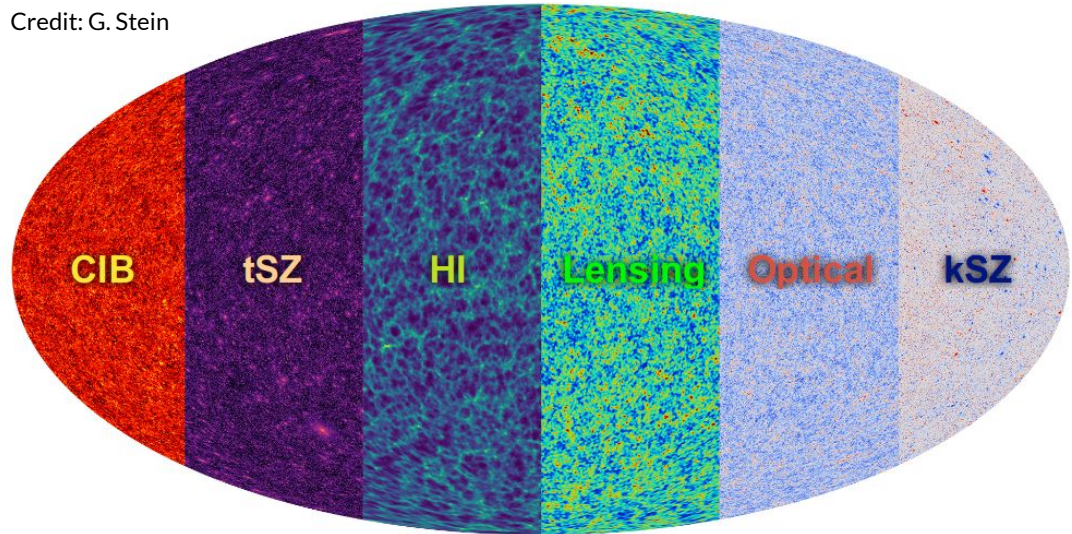
N-body approximation: Peak Patch

[Stein, Alvarez, Bond '18]

Credit: G. Stein

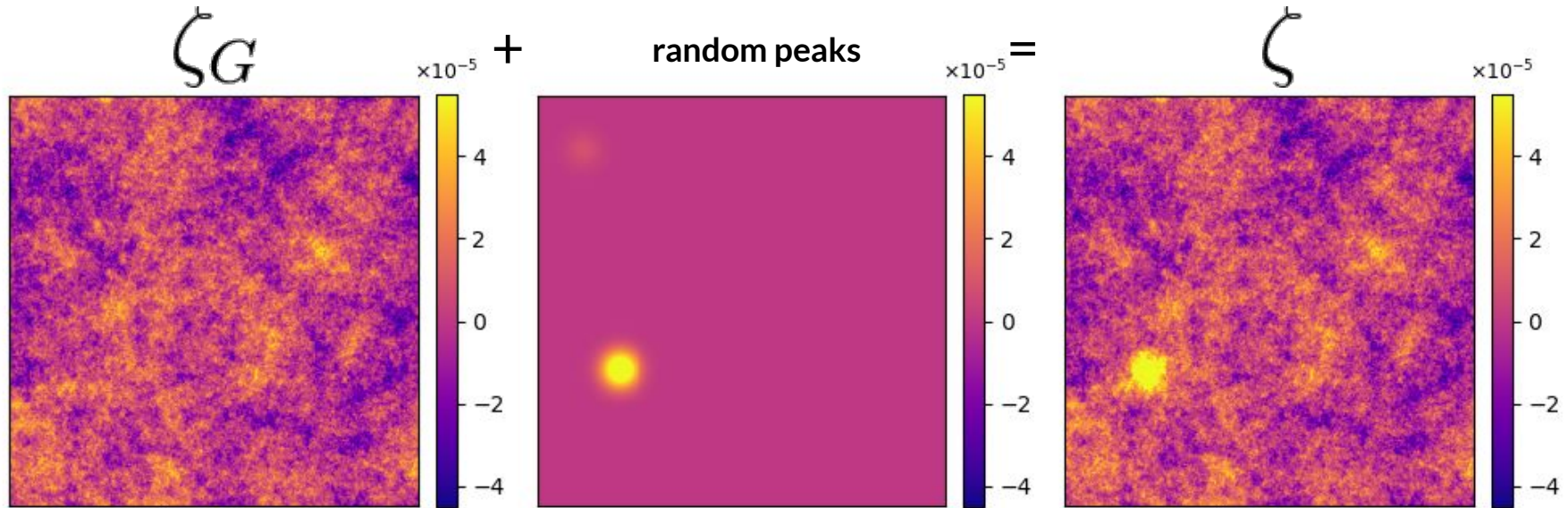
Fast generation of
halo catalogues

Full-sky extragalactic
CMB mocks: WebSky
15.4Gpc/h, 12288^3 particles
<https://mocks.cita.utoronto.ca/>



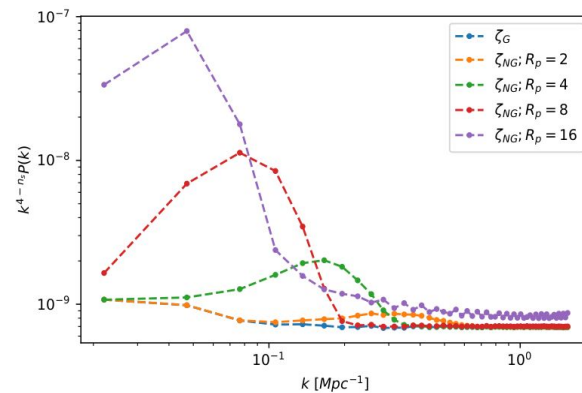
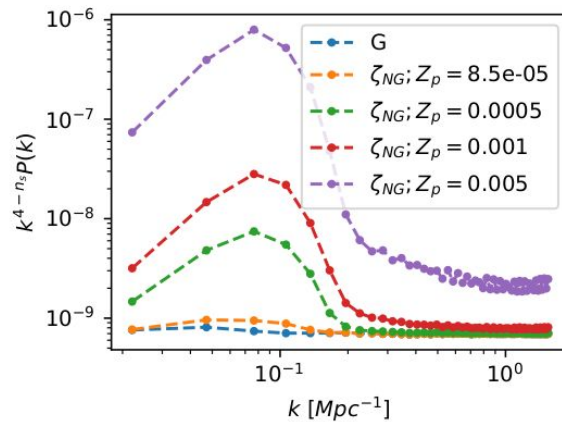
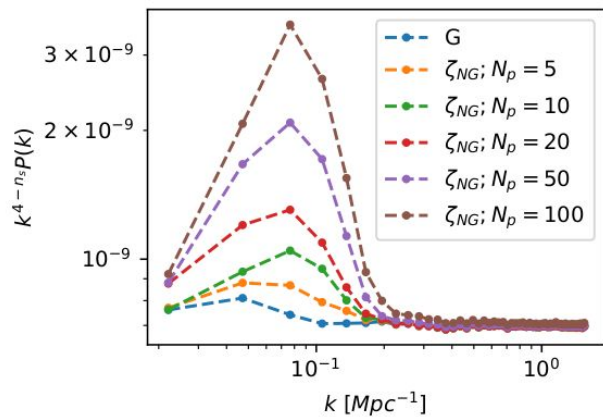
Mapmaking capabilities

Uncorrelated non-Gaussianity

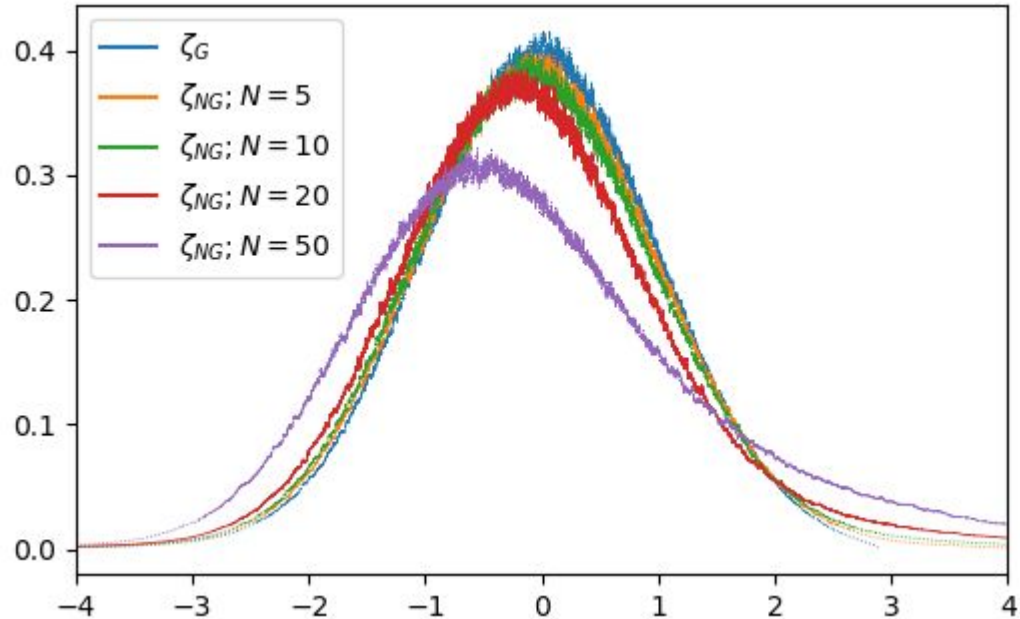


$$P(k) = A_\phi \left(\frac{k}{k_0} \right)^{n_s-1}$$

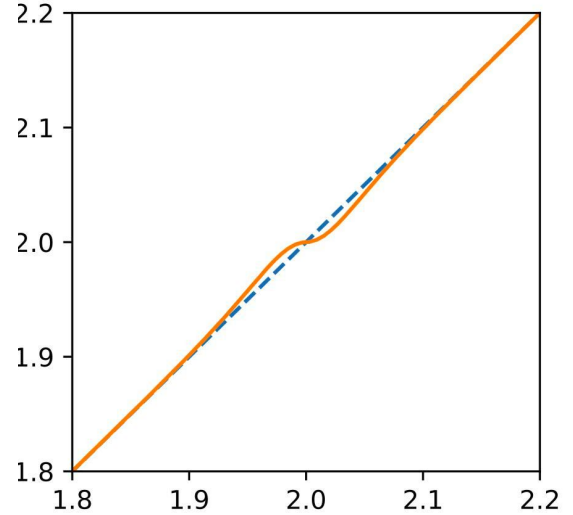
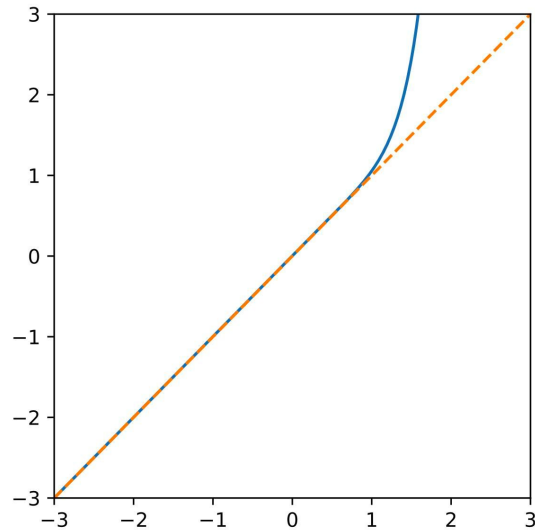
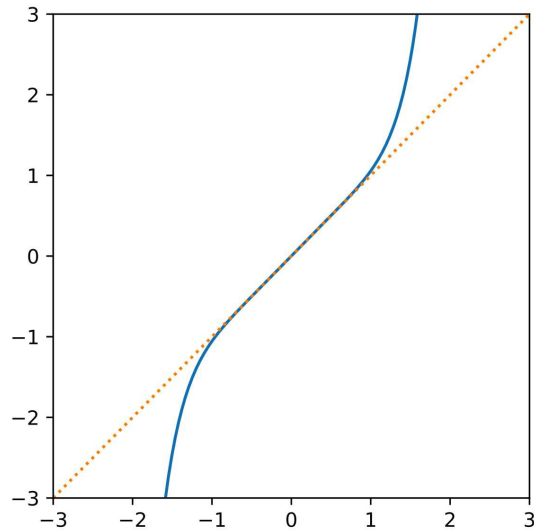
Effects on statistics



Effects on statistics

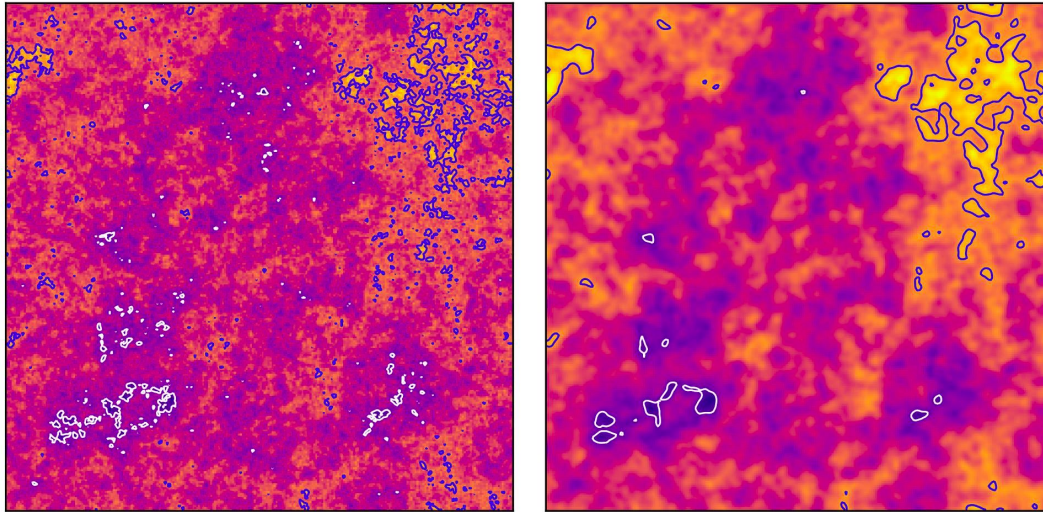


Correlated non-Gaussianity



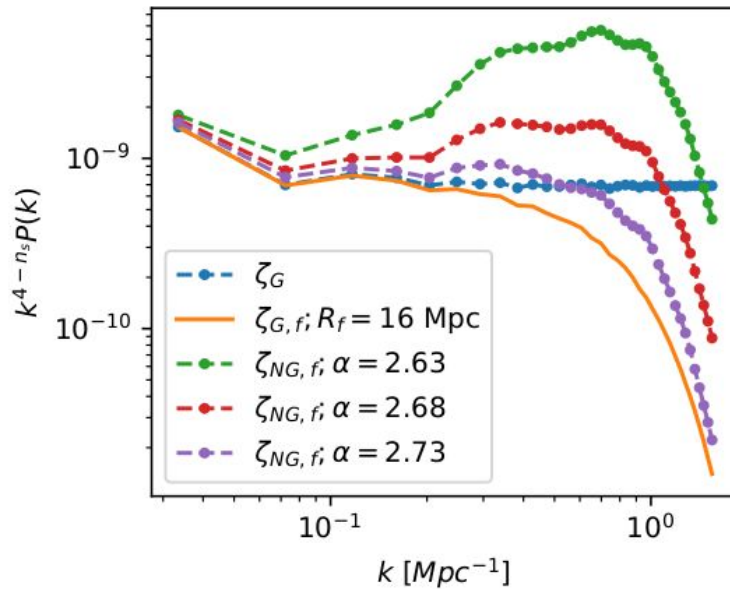
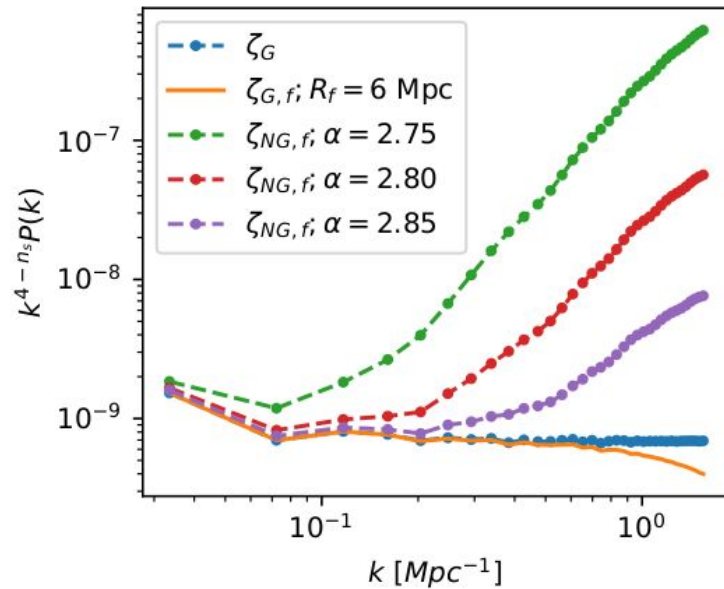
$$\zeta = F_{NL}(\zeta_G)$$

Smoothing

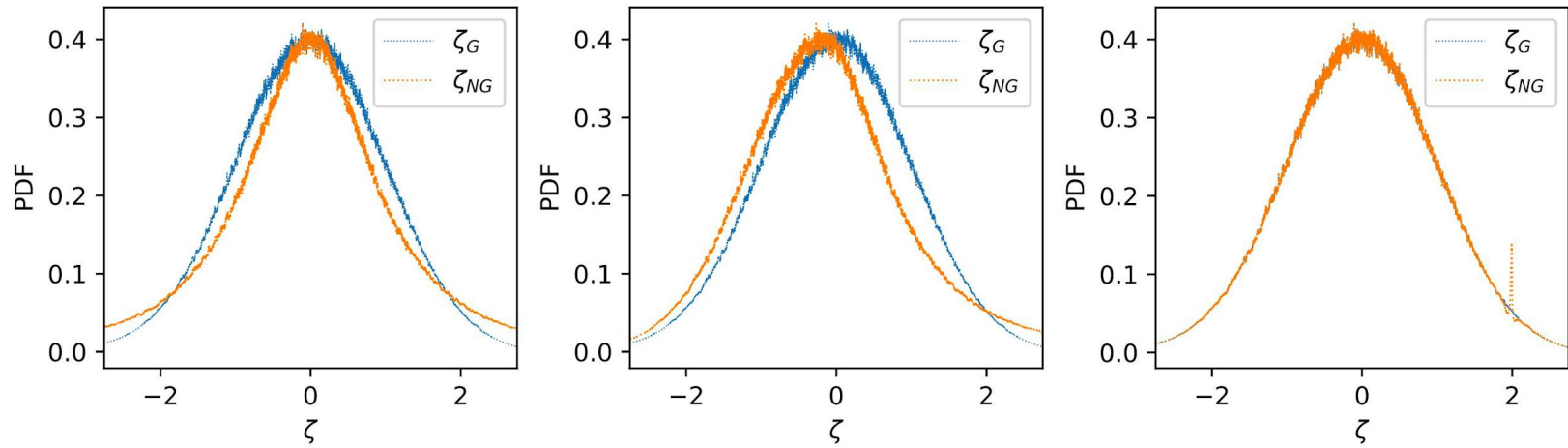


Smoothing → more compact structures
Also used after applying F_{NL}

Effects on statistics



Effects on statistics





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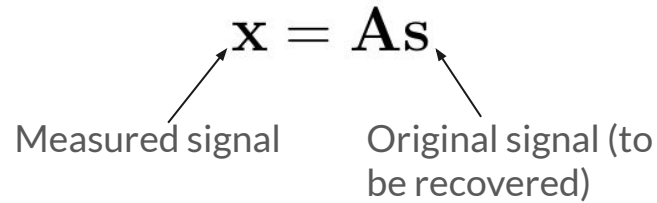


ICA: principle

$$\mathbf{x} = \mathbf{A}\mathbf{s}$$

Measured signal

Original signal (to be recovered)





ICA: principle

$$\mathbf{x} = \mathbf{A}\mathbf{s}$$

Measured signals

Original signals (to be recovered)

ICA-computed matrix

$$\mathbf{s} \approx \mathbf{W}\mathbf{x}$$

Recovered signals



ICA: principle

$$\mathbf{x} = \mathbf{A}\mathbf{s}$$

Measured signals

Original signals (to be recovered)

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Recovered signals

Non-Gaussianity = Independence



ICA: principle

$$\mathbf{x} = \mathbf{A}\mathbf{s}$$

Measured signals

Original signals (to be recovered)

ICA-computed matrix

$$\mathbf{s} \approx \mathbf{W}\mathbf{x}$$

Recovered signals

Non-Gaussianity = Independence

Each component of \mathbf{x} is a linear combination of the original signals

ICA: principle

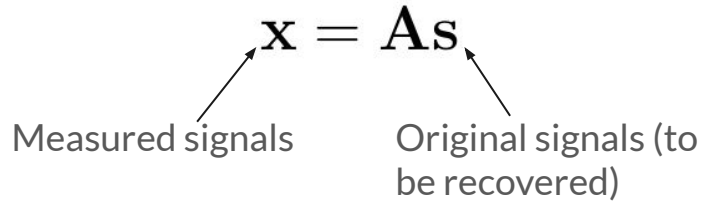


Diagram illustrating the forward model of Independent Component Analysis (ICA):

$$\mathbf{x} = \mathbf{A}\mathbf{s}$$

Measured signals \mathbf{x} are a linear combination of Original signals (to be recovered) \mathbf{s} , where \mathbf{A} is the mixing matrix.

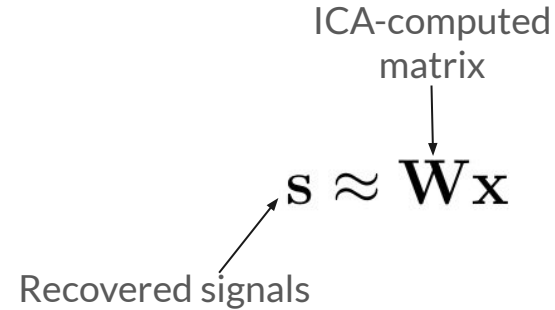


Diagram illustrating the inverse model of Independent Component Analysis (ICA):

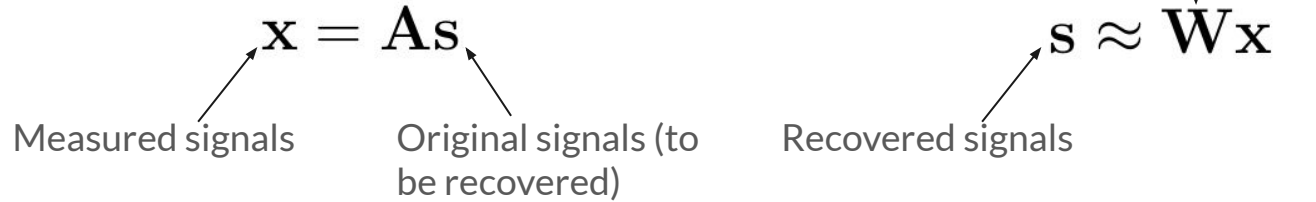
$$\mathbf{s} \approx \mathbf{W}\mathbf{x}$$

Recovered signals \mathbf{s} are estimated from Measured signals \mathbf{x} using the ICA-computed matrix \mathbf{W} .

Non-Gaussianity = Independence

Each component of \mathbf{x} is a linear combination of the original signals
 \Rightarrow more Gaussian (Central Limit theorem)

ICA: principle



Non-Gaussianity = Independence

Each component of \mathbf{x} is a linear combination of the original signals

⇒ more Gaussian (Central Limit theorem)

⇒ each extracted component needs to maximize non-Gaussianity to match one of the source signals



Non-Gaussianity measures

Kurtosis

Negentropy



Non-Gaussianity measures

Kurtosis

$$\kappa_4 = \mathbb{E} \left[\left(\frac{X - \mu}{\sigma} \right)^4 \right]$$

Negentropy

$$H(\mathbf{y}) = - \int f(\mathbf{y}') \ln f(\mathbf{y}') d\mathbf{y}'$$
$$J(\mathbf{y}) = H(\mathbf{y}_G) - H(\mathbf{y})$$



Non-Gaussianity measures

Kurtosis

$$\kappa_4 = \mathbb{E} \left[\left(\frac{X - \mu}{\sigma} \right)^4 \right]$$

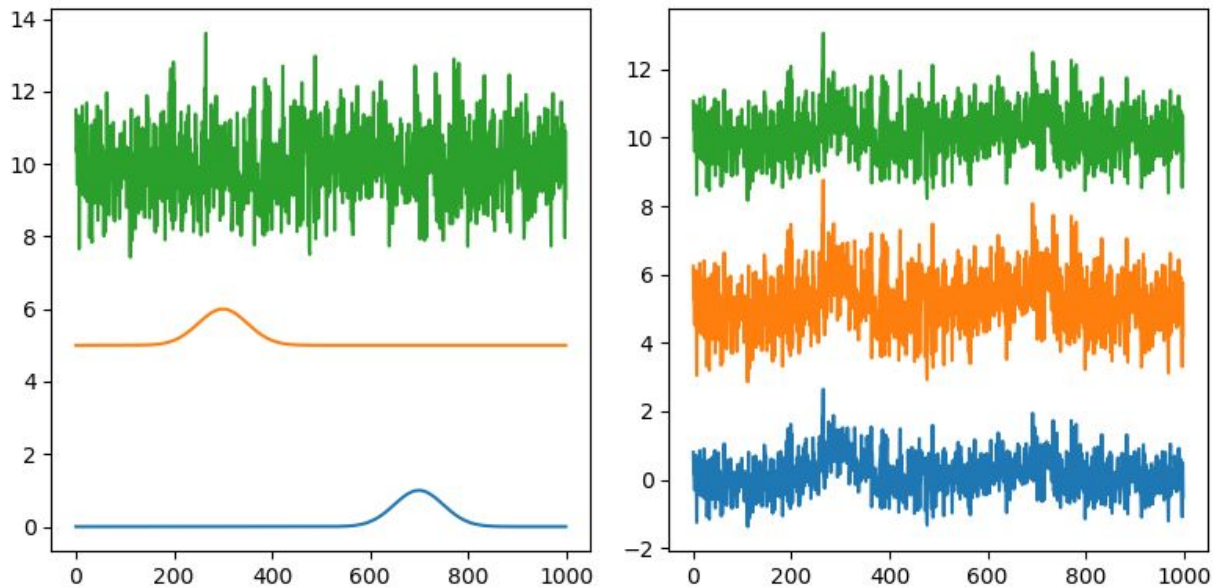
Easily computed from a sample
Sensitive to outliers

Negentropy

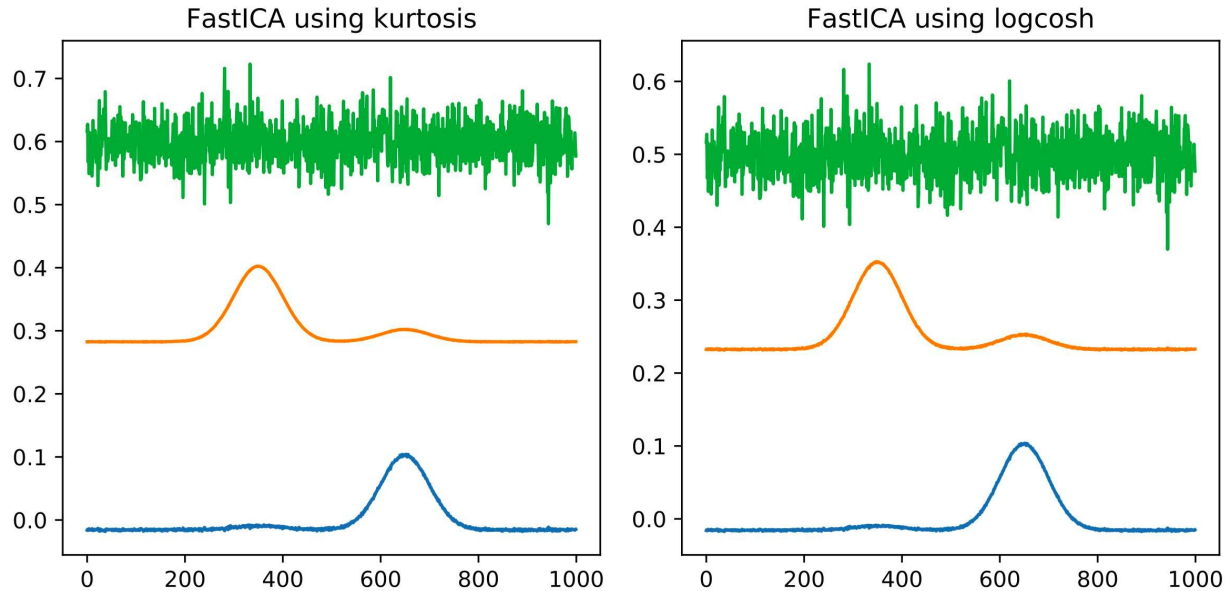
$$H(\mathbf{y}) = - \int f(\mathbf{y}') \ln f(\mathbf{y}') d\mathbf{y}'$$
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Only approximated in practice
Robust measure of non-Gaussianity

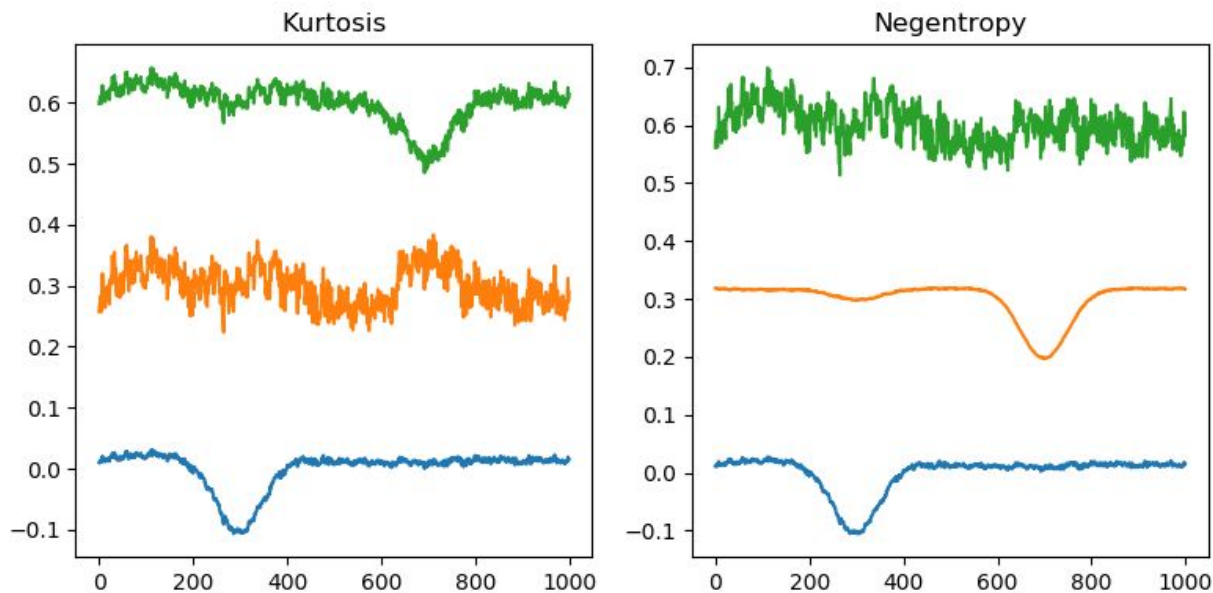
Sources and measurements



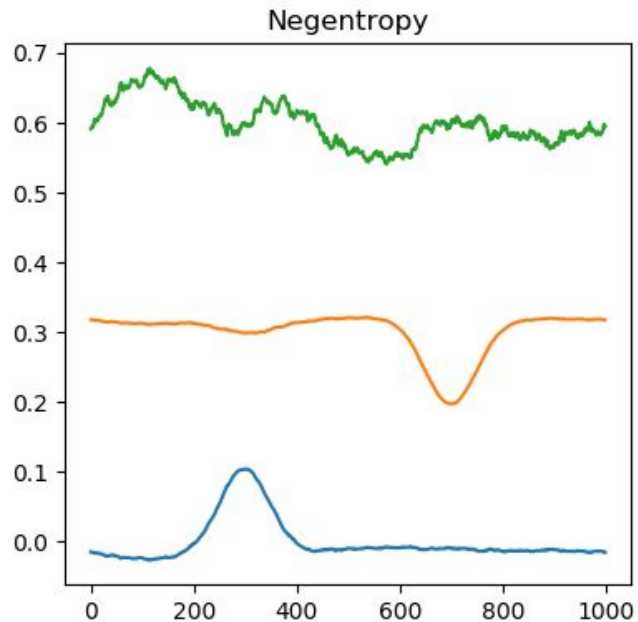
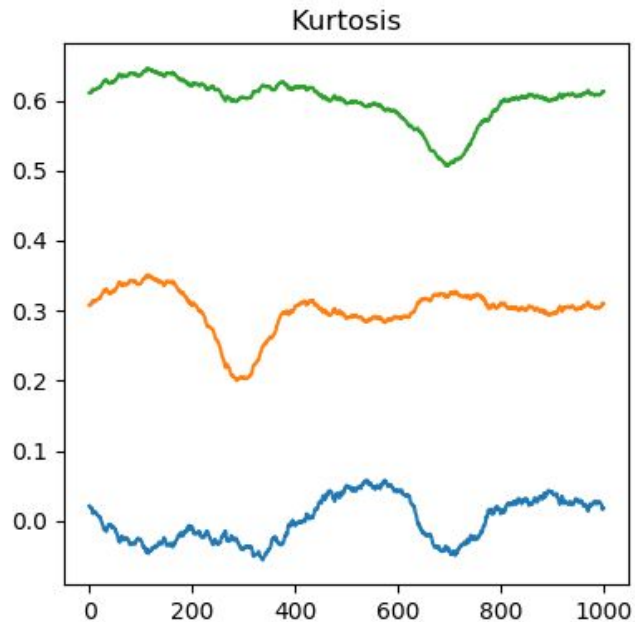
Test: white noise



Test: “pink noise”



Test: “brown noise”





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Conclusion

- Non-trivial non-Gaussianity may arise in (post-)inflationary models
- Lattice simulations can be used to understand complicated models
- Spatially-localized prominence, either correlated or uncorrelated, can skew the PDF and have a peaky contribution to the power spectrum.
- ICA, as a potential way to extract non-Gaussian contributions, gives better results with negentropy as a non-Gaussianity measure.