



Principal Component Analysis of the Primordial Tensor Power Spectrum

arXiv:1905.08200

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Inflation and CMB Polarization

Inflationary Paradigm

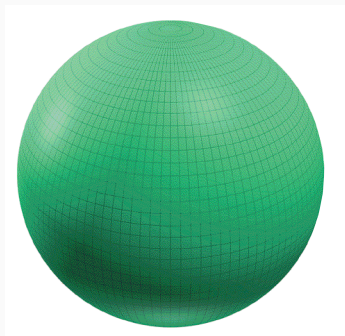
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primordial **scalar** and **tensor (gravitational waves)** perturbations

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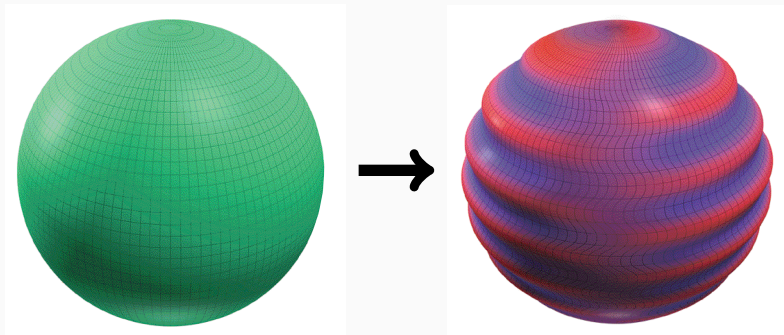


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Inflation and CMB Polarization

- **CMB is polarized!** \Rightarrow Thomson scattering at recombination
- Polarization state \rightarrow **Stokes parameters Q and U form Polarization Tensor**
- Helmholtz decompose it in:
 - **Curl** component \rightarrow **B-modes** \rightarrow divergence-free
 - **Gradient** component \rightarrow **E-modes** \rightarrow curl-free

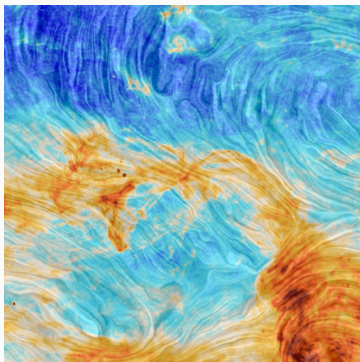


Figure 1: *From Planck website*

The Quest for Primordial Gravitational Waves

- E-modes produced by *scalar and tensor* perturbations
- **Primordial B-modes produced ONLY by tensor perturbations!**
- **IF Detected Primordial Gravitational waves** will give:
 - "Smoking gun" for inflation
 - Identify energy scale of inflation **for the simplest models!** (single scalar field slow-roll)
- **What about more complex models? Beyond the standard model of Early Universe? Lots of Physics to be understood in this primordial signal!**

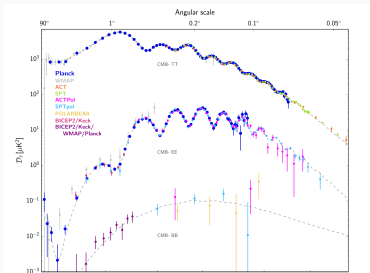


Figure 2: From Planck results 2018

Goals and Motivations

Our Goals and Motivations:

1. Examples of **non-standard B-mode emission in the literature**:
 - *massive gravity inflation* (Domenech et al. 2017)
 - *open inflation* (Yamauchi et al. 2011)
 - *topological defects/cosmic strings* (Lizarraga et al. 2014)
 - *multifield inflation* (Price et al. 2015)
 - *modified speed of cosmological gravitational waves* (Raveri et al. 2014)
 - *rolling axion* (Namba et al. 2016)
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2. Establish the constraining power of **future B-mode probes** on the **shape** of primordial tensor power spectrum
3. Sensitivity to **features, deviations from power-law behaviour**
4. We use **Principal Component Analysis** on Tensor Power Spectrum for a **model independent** approach

Power spectra, Parameters and Observations

Primordial Tensor Power Spectrum (Standard Power-Law)

$$\mathcal{P}_T(k) = A_T \left(\frac{k}{k_0} \right)^{n_T}$$

Standard Parametrization

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$$r = \frac{A_T}{A_s}$$

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- **Tensor contribution**

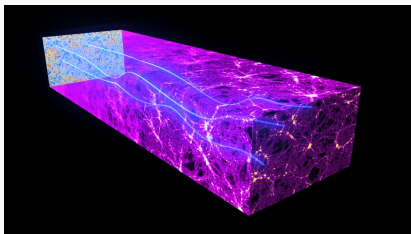
$$C_{\ell,t}^{XX'} \propto \mathcal{P}_T(k)$$

$$X, X' \in \{T, E, B\}$$

Noise, Lensing and Foregrounds Contribution

$$C_{\ell}^{XX'} = C_{\ell}^{XX', prim} + C_{\ell}^{XX', noise} + \lambda C_{\ell}^{XX', lens} + C_{\ell}^{XX, fgs}$$

- Total $C_{\ell}^{XX'}$ contains:
 1. **Primordial spectrum** $C_{\ell}^{XX', prim}$
 2. **Instrumental noise after Component Separation** $C_{\ell}^{XX', noise}$
 3. **CMB lensing contribution** $\lambda C_{\ell}^{XX', lens}$ (λ **delensing factor**)
 4. **Foregrounds contribution** $C_{\ell}^{XX, fgs}$



Foregrounds and Lensing

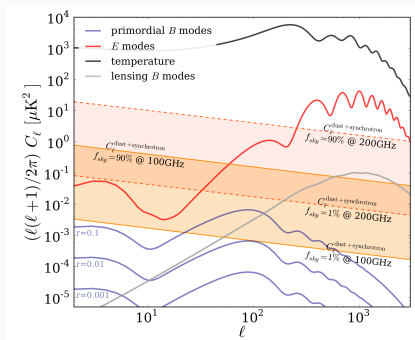


Figure 3: from Errard et al. 2016

- **Lensing** → dominant at **intermediate – small scales**
- **Foregrounds** → Dominant at **large scales**
- **Dust + Synchrotron**
- **Parametric maximum-likelihood component separation**
- **Residual foregrounds** in maps → **residuals power spectrum** C_{ℓ}^{fgs}
- **FGBuster** Code (Poletti & Errard)

Introduction to Principal Component Analysis

Principal Component Analysis (PCA)

Principal Component Analysis (PCA)

- Diagonalize Fisher matrix

$$F = S^T E S$$

- **PCA modes** → **eigenvectors** of **F** (Rows of **S**)
- e_i **eigenvalues** of **F** ordered from largest to smallest

$$E = \text{diag}(e_i)$$

- **PCA amplitudes** → New **uncorrelated** parameters set **m** linear combination of original parameters
- **Compression of information** in the first best measured modes

Principal Components of Tensor Power Spectrum

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Our goal (Campeti, Poletti and Baccigalupi arXiv:1905.08200)

apply **PCA** to **Primordial Tensor Power Spectrum** and make realistic forecasts for future CMB **B-mode** probes (**LiteBIRD, SO, CMB-S4**)

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- **Fisher Information Matrix for CMB**

$$F_{ij} = f_{sky} \sum_{\ell=2}^{\ell_{\max}} \frac{2\ell + 1}{2} \text{Tr} [\mathbf{D}_{\ell i} \mathbf{C}_{\ell}^{-1} \mathbf{D}_{\ell j} \mathbf{C}_{\ell}^{-1}]$$

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- Obtain $\mathcal{S}_a(k) \rightarrow$ **basis** for tensor spectrum

PCA modes for Model Testing: 2 Approaches

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Fisher approach

- Projecting power spectrum model over PCA modes
- **Uncertainties** σ_{Fisher} on m_a from **Fisher matrix**
 - **Advantages** \rightarrow fast & easy
 - **Caveats** \rightarrow **insensitive to physicality prior $P_T > 0$**

PCA modes for Model Testing: 2 Approaches

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MCMC approach

- Constrain m_a using simulated C_ℓ spectra (or data)
 - **Cosmological + Power spectrum parameters**
$$\{m_1, \dots, m_n, A_s, n_s, \tau, \Omega_b h^2, \Omega_D h^2, \theta\}$$
 - **Impose $P_T > 0$ in MCMC**
 - **Advantages** → **impact of physicality priors** (σ_{Fisher} vs σ_{MCMC}), **correlations**
 - **Disadvantages** → slow convergence

Future Probes Specifications

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LiteBIRD

- Satellite
- Timescale 2027
- 15 frequency bands
[40-402 GHz]
- Noise [36.1 - 4.7
 $\mu\text{K-arcmin}$]
- Beams FWHM [69.2-9.7
arcmin]
- Sky fraction $f_{\text{sky}} = 60\%$
- 20% Delensing
- Multipole range
 $\ell \sim 2 - 1350$

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Simons Observatory (SO)

- Ground-based
- Timescale 2022
- 6 frequency bands [27-280 GHz]
- Noise [35.3 - 2.7 $\mu\text{K-arcmin}$]
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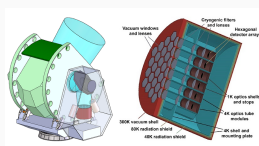
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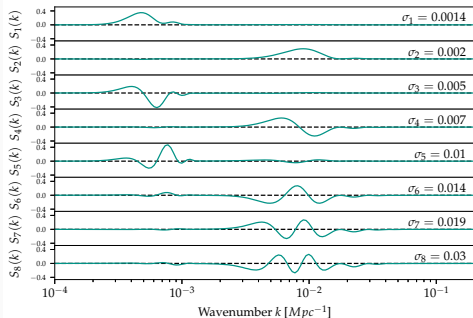


CMB-S4

- Ground-based
- Timescale 2027
- 9 frequency bands [20-270 GHz]
- Noise [14 - 1.3 $\mu\text{K-arcmin}$]
- Beams FWHM [76.6-8.5 arcmin]
- Sky fraction $f_{\text{sky}} = 3\%$
- 90% Delensing
- Multipole range $\ell \sim 30 - 4000$

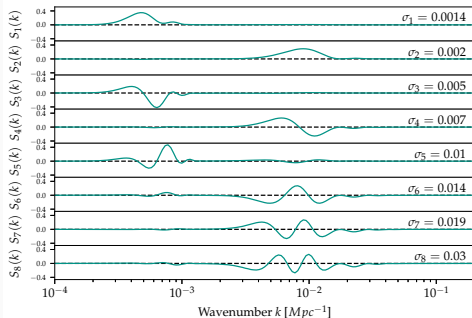
PCA Basis

PCA Basis: Problems



Tensor PS need special care with respect to Scalar PS!

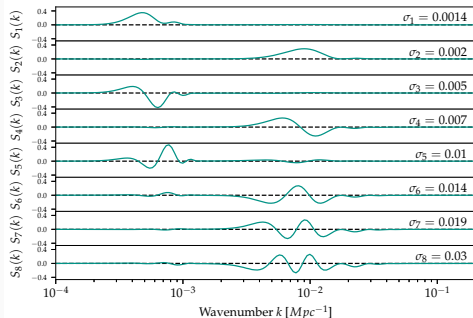
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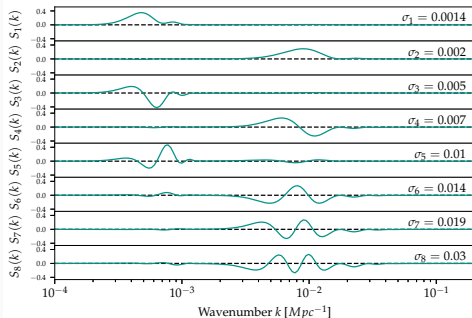
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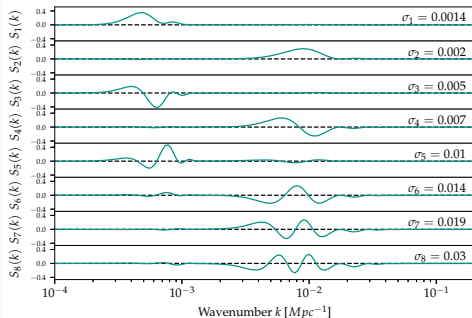
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- For tensor spectrum r **not yet measured**
- Generate our **PCA basis** with $r = 0 \rightarrow$ first PCA modes are **effective r**
- **BUT Information in $C_{\ell s}$ with Tensors ($r > 0$) can be very different from Information matrix that defined PCA basis!**

PCA Basis: Our Solution

- Tensors not known a priori but number of modes retained is fixed to N from onset!

PCA Basis: Our Solution

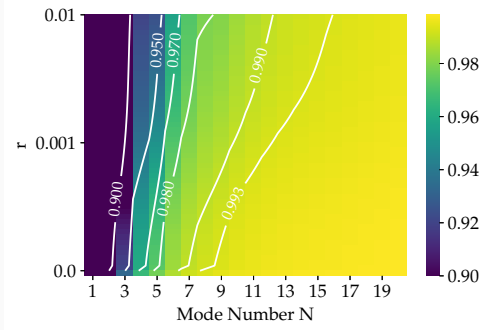
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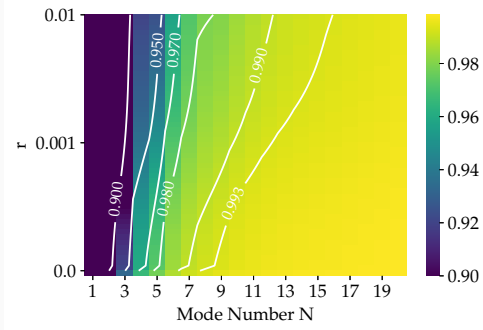


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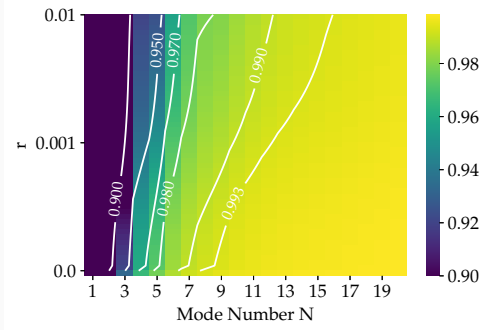
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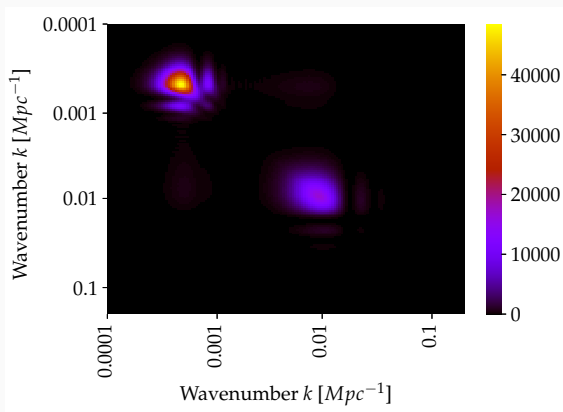
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- e.g. LiteBIRD → set $N = 8$

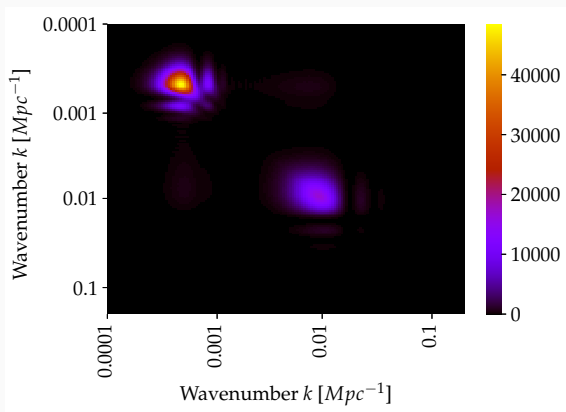
Application to LiteBIRD

Application to LiteBIRD: Fisher Matrix



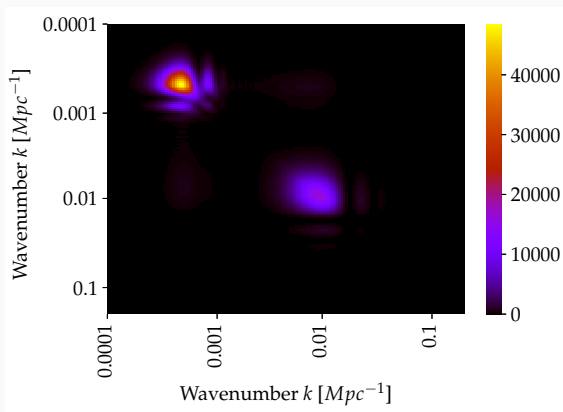
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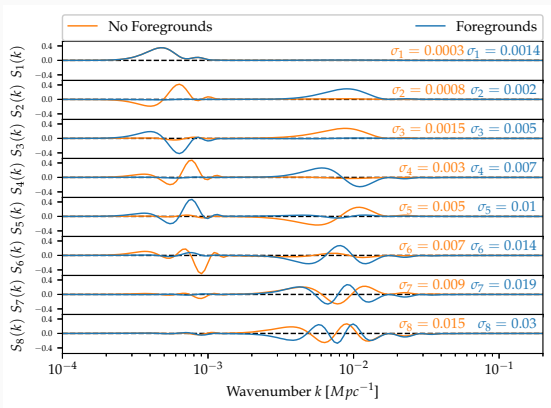
- Fisher Matrix for **LiteBIRD** for $r = 0$
- Main features: **recombination bump** ($k \approx 6 \times 10^{-3} \text{Mpc}^{-1}$) and **reionization bump** ($k \approx 6 \times 10^{-4} \text{Mpc}^{-1}$)

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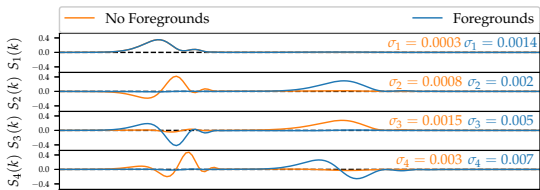
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- Most information for $r = 0$ comes from reionization peak

Are Foregrounds important?

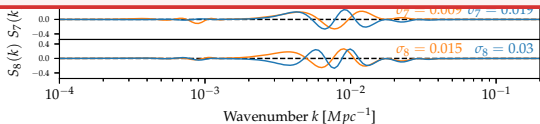


- **Factor ~ 5 on σ_1 and ~ 3 on σ_2 due to foregrounds!**
- Foregrounds change relative importance of reionization and recombination peak

Are Foregrounds important?



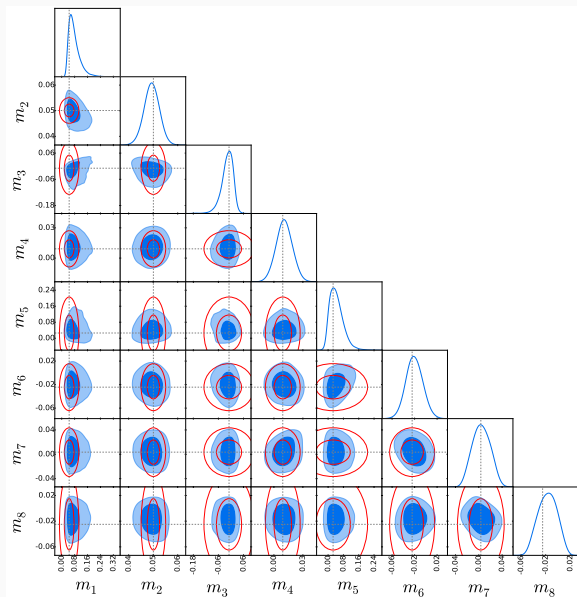
FOREGROUNDS CANNOT BE NEGLECTED!



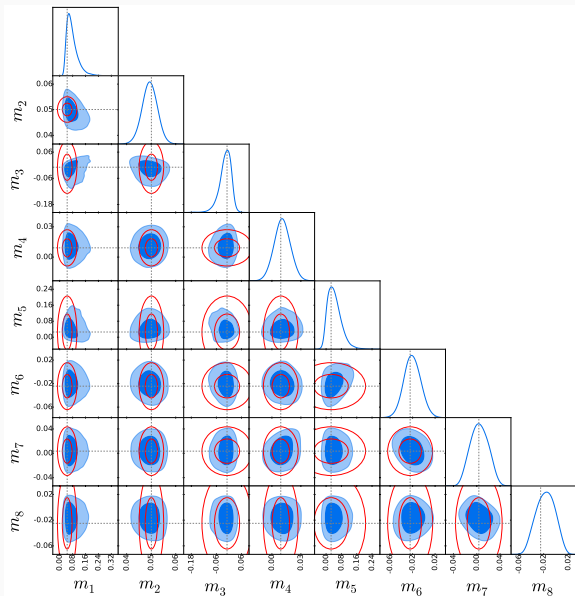
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Limitations of the PCA Method and MCMC Exploration

MCMC Exploration: $r = 0.01$

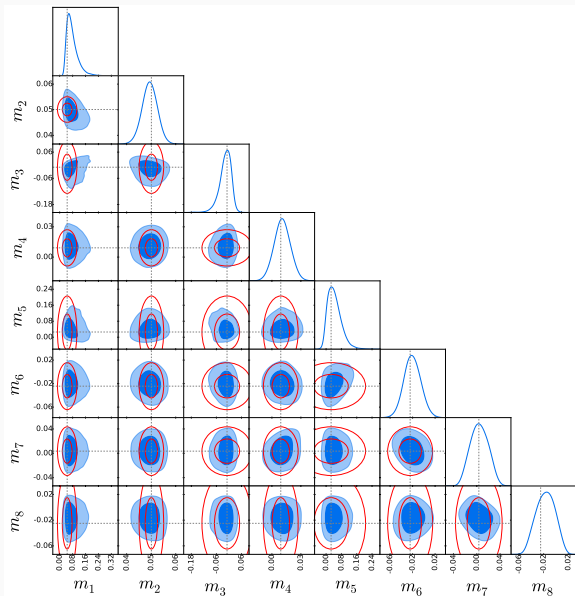


MCMC Exploration: $r = 0.01$



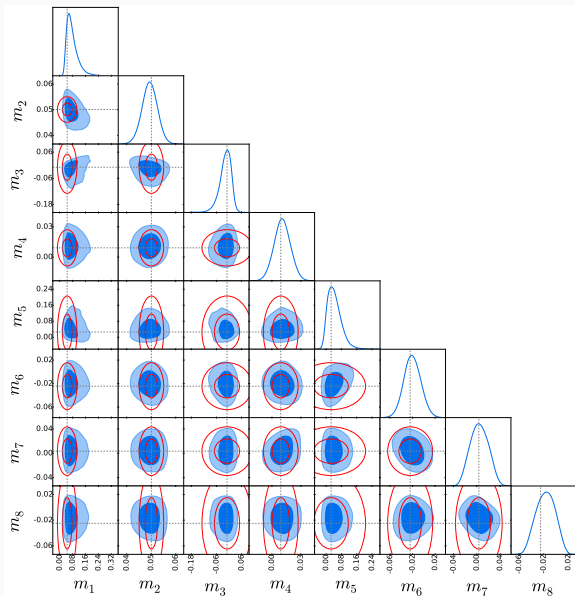
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MCMC Exploration: $r = 0.01$



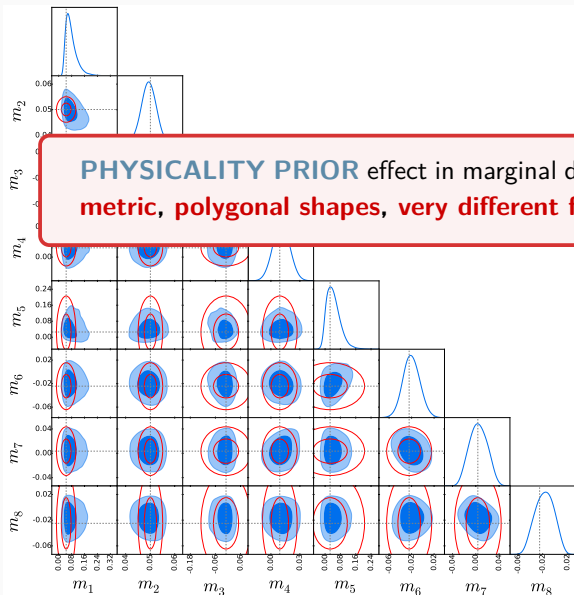
- Fisher estimates for PCA can be **inconsistent!** → insensitive to **physics** prior $\mathcal{P}_T > 0$
- Must have $\sigma^{\text{MCMC}} \geq \sigma^{\text{Fisher}}$ → **true without physics** prior

MCMC Exploration: $r = 0.01$



- Fisher estimates for PCA can be **inconsistent!** \rightarrow insensitive to **physics** prior $\mathcal{P}_T > 0$
- Must have $\sigma_{\text{MCMC}} \geq \sigma_{\text{Fisher}} \rightarrow$ **true without physics** prior
- **With physics** prior $\Rightarrow \sigma_{\text{MCMC}} < \sigma_{\text{Fisher}}$ for most modes!

MCMC Exploration: $r = 0.01$



PHYSICALITY PRIOR effect in marginal distributions \rightarrow **asymmetric, polygonal shapes, very different from Fisher**

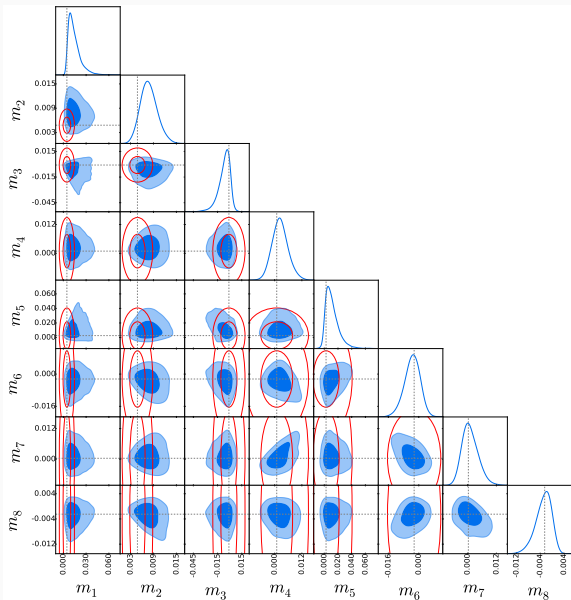
true prior

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- With** physics prior $\Rightarrow \sigma_{\text{MCMC}} < \sigma_{\text{Fisher}}$ for most modes!

MCMC Exploration: $r = 0.001$

- **Physics prior effect**
even more evident
for smaller r
($r = 0.001$)!

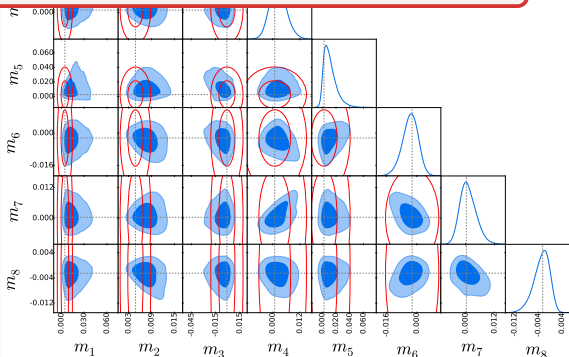


MCMC Exploration: $r = 0.001$

- Physicality prior effect
even more evident

CONCLUSION

Can always use PCA basis to model primordial tensor power spectrum **BUT** Fisher uncertainties are rarely accurate! Should be used only for relative comparison!



Conclusions

- Applied **PCA** to **Tensor primordial power spectrum**
- Detect in **B-modes deviations from scale-invariance** in **model-independent** way
- Constraints for **LiteBIRD**, **SO** and **CMB-S4**
- **Foregrounds cannot be neglected!**
- **Our Basis** (**no tensors**) → preferable to the **Constant Mode Basis**
- **Fisher uncertainties** can be affected by **Physicality prior!**
- Can be applied to any **Early Universe scenario**

Thanks For Your Attention
