

How to optimize Higgs Measurements using Information Geometry

work with Johann Brehmer, Kyle Cranmer and Tilman Plehn

arXiv: 1612.05261

see previous talk

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Pheno 2017

Introduction

What we learned from Johann's talk

The Fisher information encodes the maximum sensitivity of **observables** to **model parameters** for a given experiment.

$$f(x|\theta) \longrightarrow I_{ij}(\theta) = -E \left[\frac{\partial^2 \log f(x|\theta)}{\partial \theta_i \partial \theta_j} \Big| \theta \right] \longrightarrow \text{cov}[\hat{\theta} | \theta_0] \leq I_{ij}^{-1}(\theta_0)$$

probability distribution Fisher Information Cramer-Rao Bound

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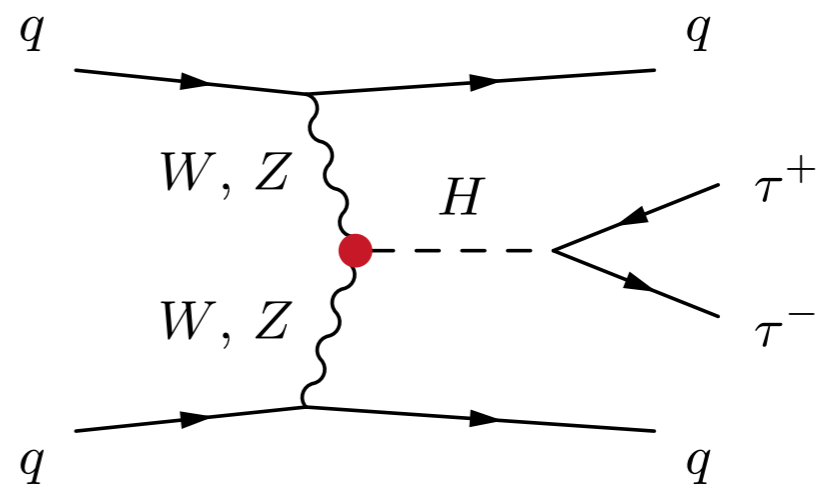
probability distribution Fisher Information Cramer-Rao Bound



Application:

Constraining **Higgs Effective Field Theory** in **Weak Boson Fusion**

$$\mathcal{L} = \mathcal{L}_{SM} + \sum_i \frac{f_i^{d=6}}{\Lambda^2} \mathcal{O}_i^{d=6} + \dots$$

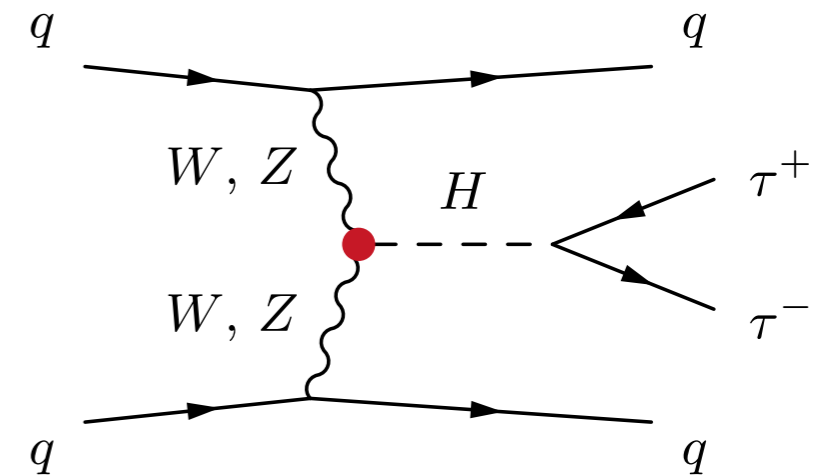


Introduction

Weak Boson Fusion:

- well known probe of Higgs-gauge structure
- interesting kinematics of tagging jets

see [hep-ph/9808468](https://arxiv.org/abs/hep-ph/9808468), [hep-ph/0105325](https://arxiv.org/abs/hep-ph/0105325), [1212.0843](https://arxiv.org/abs/1212.0843)

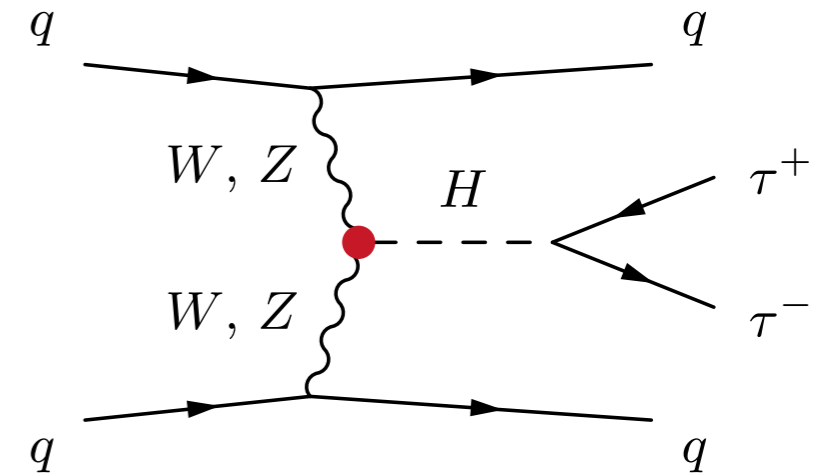


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Theory Language: Dim-6-Operators of HEFT: $\mathcal{L} \supset \sum_i \frac{f_i}{\Lambda^2} \mathcal{O}_i$

- total rate: $\mathcal{O}_{\phi,2} = \frac{1}{2} \partial^\mu (\phi^\dagger \phi) \partial_\mu (\phi^\dagger \phi)$

- new kinematic structures:

$$\mathcal{O}_W = i \frac{g}{2} (D^\mu \phi)^\dagger \sigma^k (D^\nu \phi) W_{\mu\nu}^k \quad \mathcal{O}_{WW} = -\frac{g^2}{4} (\phi^\dagger \phi) W_{\mu\nu}^k W^{\mu\nu k}$$

$$\mathcal{O}_B = i \frac{g}{2} (D^\mu \phi)^\dagger (D^\nu \phi) B_{\mu\nu} \quad \mathcal{O}_{BB} = -\frac{g'^2}{4} (\phi^\dagger \phi) B_{\mu\nu} B^{\mu\nu}$$

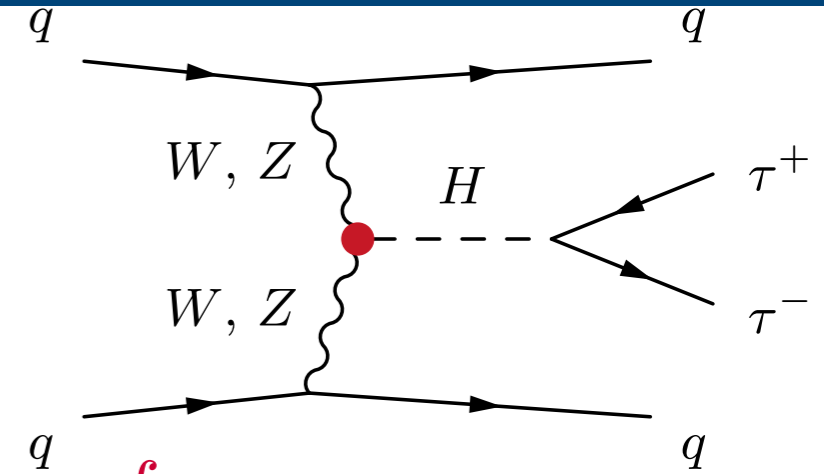
- model parameters: wilson coefficients: $\theta = (f_{\phi,2}, f_W, f_{WW}, f_B, f_{BB})$

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- Outline:**
- 1. How does the tool work?
 - 2. How well can we measure Wilson coefficients?
 - 3. Where in phase space is the information?
 - 4. How good is my analyses?
 - 5. Does the EFT series converge?

I. How does the tool work?

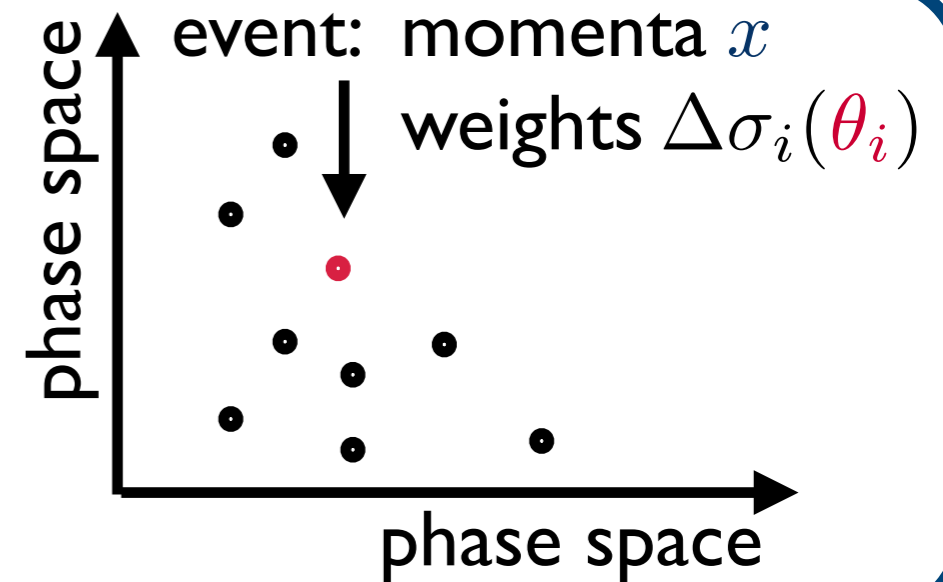
I. Generate events via Monte Carlo: **MadMax**

- modified version of MG5

see [1311.2591](#), [1607.07441](#)

- modeling detector response

- Smearing
- Trigger Cuts
- Efficiencies
- Backgrounds



2. Morphing: get weights for arbitrary model θ

- $$\Delta\sigma(\theta) = \sum_i a_i \Delta\sigma_i$$

see [ATL-PHYS-PUB-2015-047](#)

3. Calculate Fisher Information

- $$I_{ij}(\theta) = L \sum_{\text{events}} \frac{1}{\Delta\sigma(\theta)} \frac{\partial \Delta\sigma(\theta)}{\partial \theta_i} \frac{\partial \Delta\sigma(\theta)}{\partial \theta_j}$$

4. Cramer Rao Bound defines maximal sensitivity $\text{cov}[\hat{\theta}|\theta_0] \leq I_{ij}^{-1}(\theta_0)$

- reach for $\theta = f v^2 / \Lambda^2$

2. How well can we measure Wilson coefficients?

Fisher Info at the SM:

$$\sqrt{s} = 13 \text{ TeV}$$

$$L \cdot \epsilon = 30 \text{ fb}^{-1}$$

- How well can we constrain new physics, assuming SM is true?

$$I_{ij}(\mathbf{0}) = \begin{pmatrix} \mathcal{O}_{\phi,2} & \mathcal{O}_W & \mathcal{O}_{WW} & \mathcal{O}_B & \mathcal{O}_{BB} \\ \mathbf{3202} & \mathbf{-625} & -7 & -35 & 0 \\ \mathbf{-625} & 451 & \mathbf{-110} & 23 & -2 \\ -7 & \mathbf{-110} & 244 & -6 & 3 \\ -35 & 23 & -6 & 4 & 0 \\ 0 & -2 & 3 & 0 & 0 \end{pmatrix} \begin{matrix} \mathcal{O}_{\phi,2} \\ \mathcal{O}_W \\ \mathcal{O}_{WW} \\ \mathcal{O}_B \\ \mathcal{O}_{BB} \end{matrix}$$

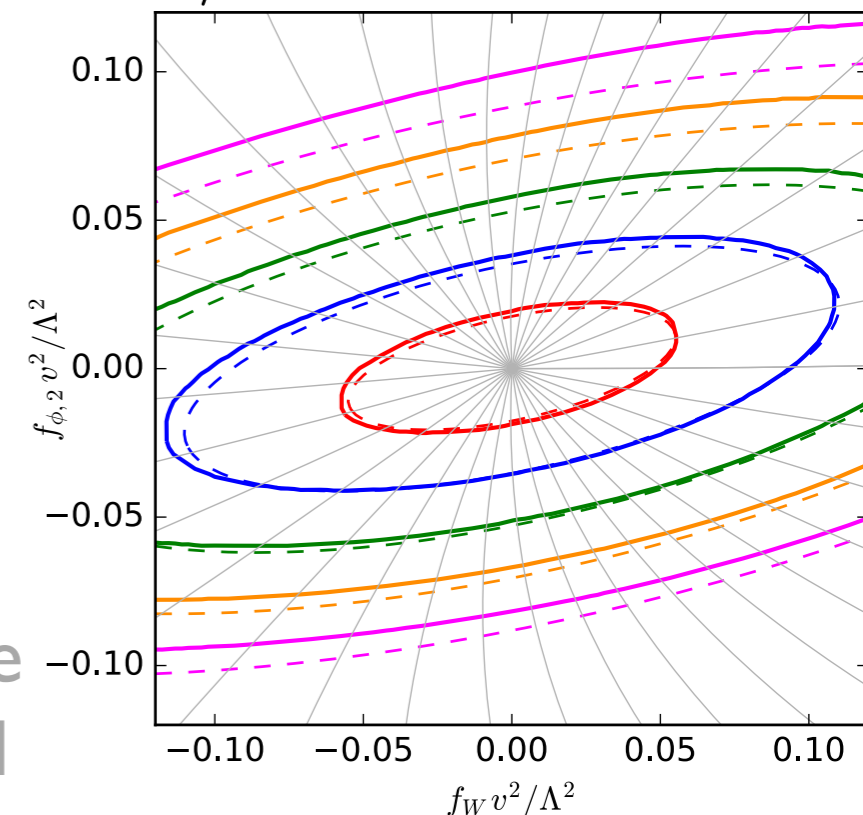
- Cramer-Rao bound: minimum measurement error $\Delta\theta \geq 1/\sqrt{I}$

- $\mathcal{O}_{\phi,2}$ direction can be measured best, followed by $\mathcal{O}_W, \mathcal{O}_{WW}$. **Large mixing** between operators

$$\Delta(f_{\phi,2} v^2 / \Lambda^2) \gtrsim 0.02 \quad \Delta(f_W v^2 / \Lambda^2) \gtrsim 0.13$$

- distance measure $d^2 = I_{ij}(\theta_0)(\theta^i - \theta_0^i)(\theta^j - \theta_0^j)$
 \sim unlikeliness to measure θ if θ_0 is true 'in sigmas'

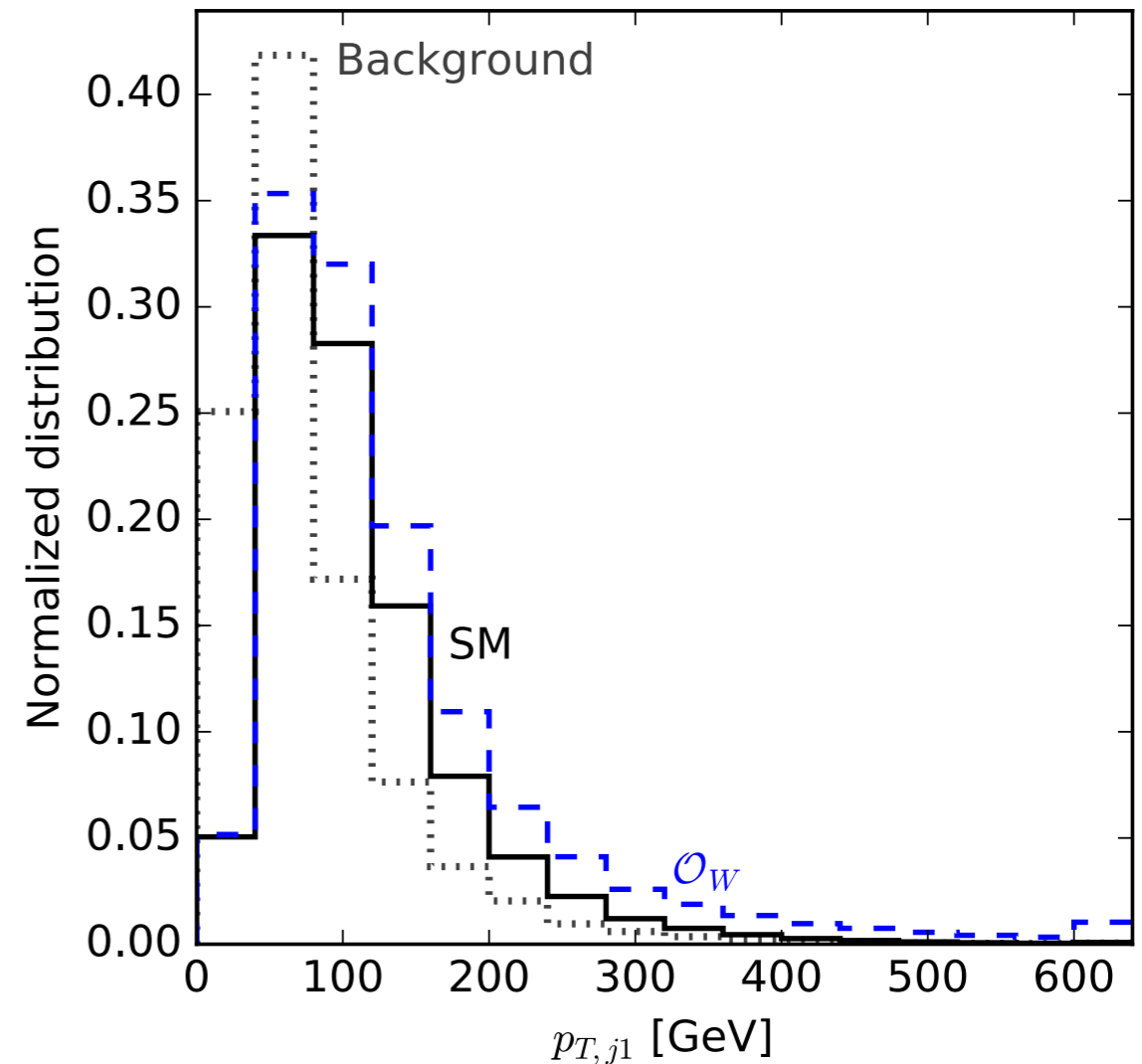
Contours of distance
 $d=1,2,3,4,5$ from SM



3. Where in phase space is the information?

p_T of the hardest tagging jet

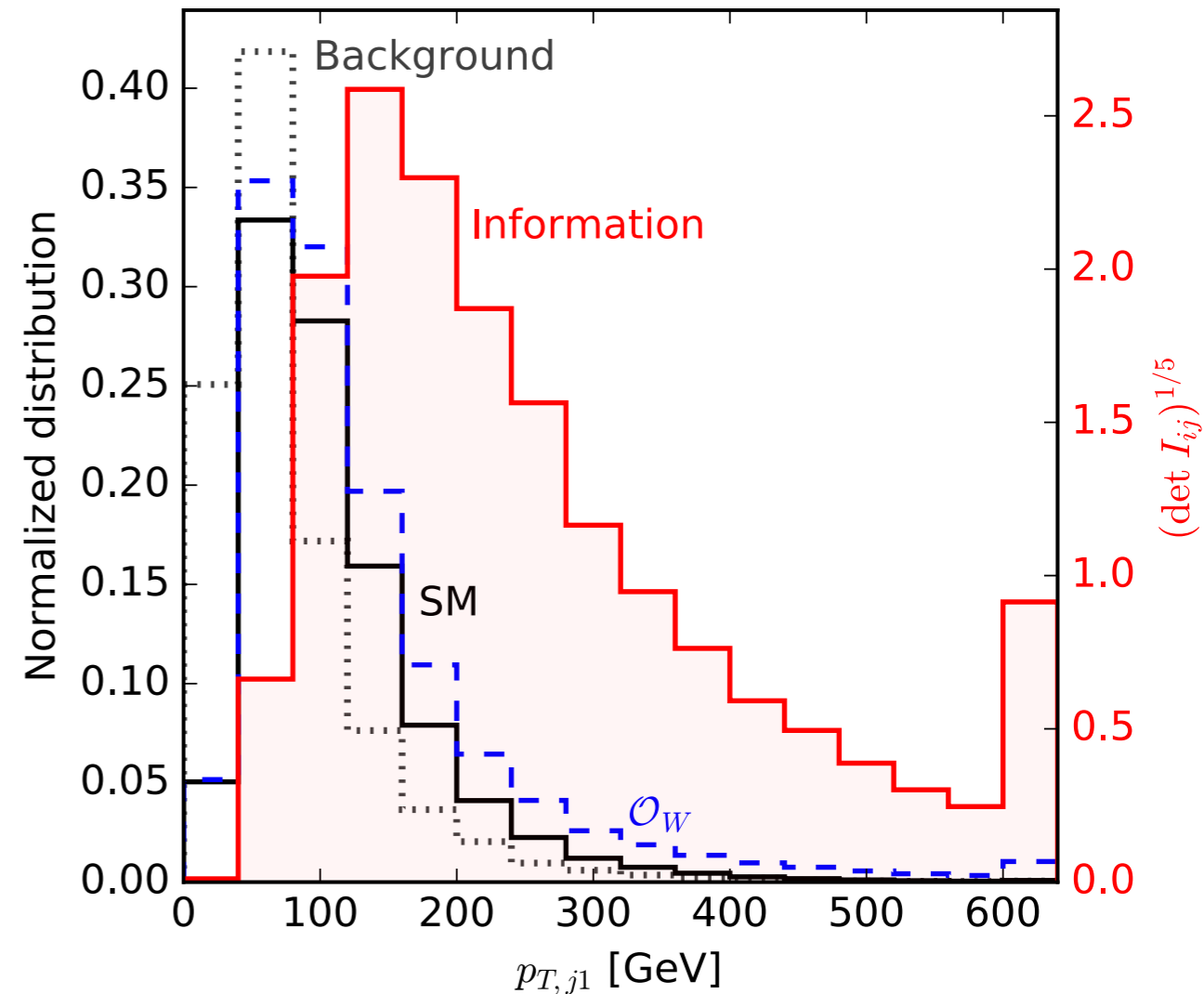
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Strongly correlated with momentum transfer through production vertex
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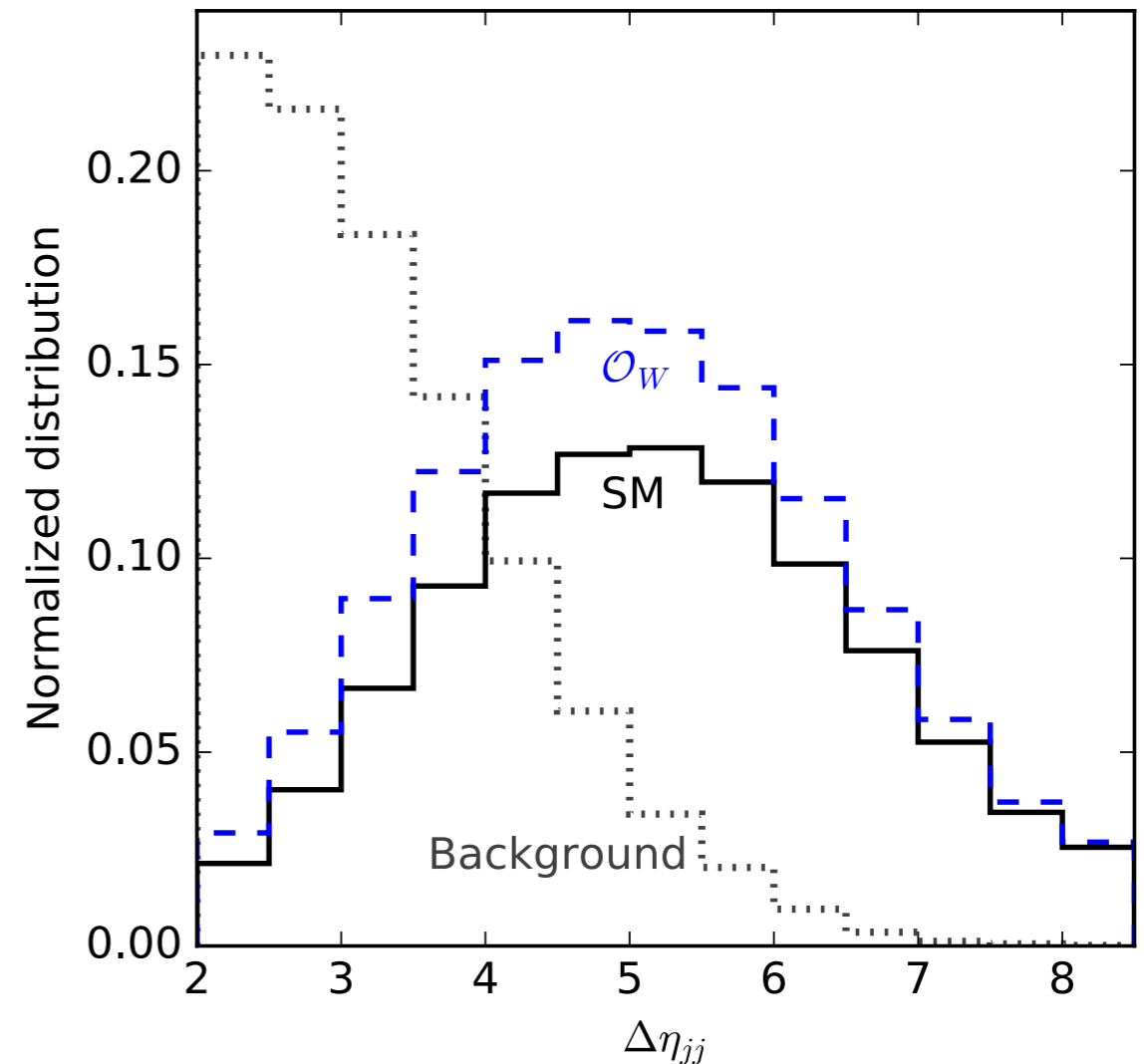
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jet rapidity difference

- better background suppression at large $\Delta\eta_{jj}$
- momentum dependent operators have largest effect at medium $\Delta\eta_{jj}$



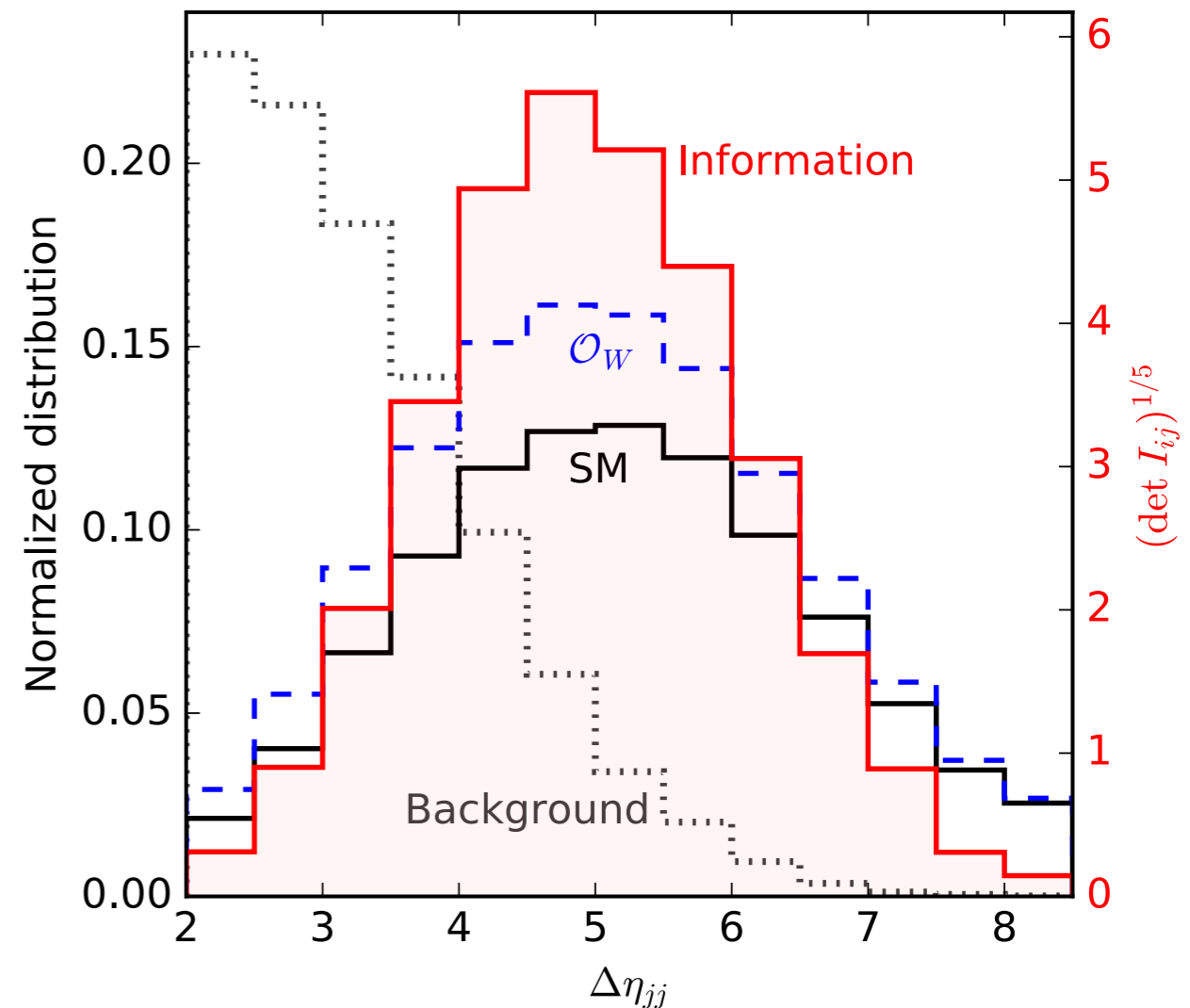
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- momentum dependent operators have largest effect at medium $\Delta\eta_{jj}$
- strong WBF cuts ($\Delta\eta_{jj} > 4.2$) lose information of dim-6 operators



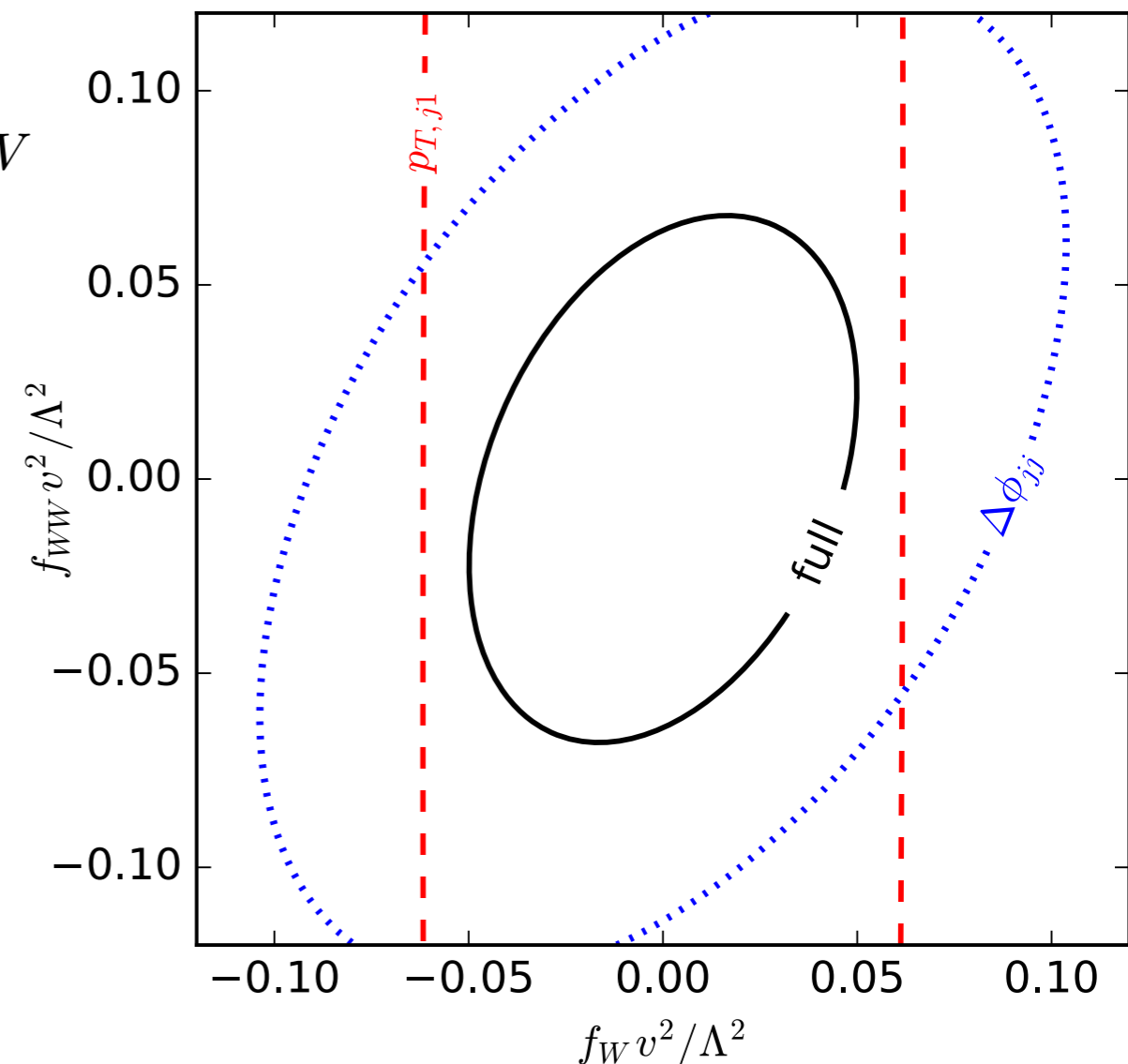
4. How good is my analysis?

Histograms:

- project high-dimensional phase space onto 1 or 2-dimensional histogram
- reduced information
- Allows to compare histogram-based and multivariate analyses

Histograms:

- **Virtuality measure** ($p_{T,j1}$) probes only \mathcal{O}_W
- **Angular correlation** between tagging jets ($\Delta\phi_{jj}$) sensitive to \mathcal{O}_{WW}
- **Full phase space information**



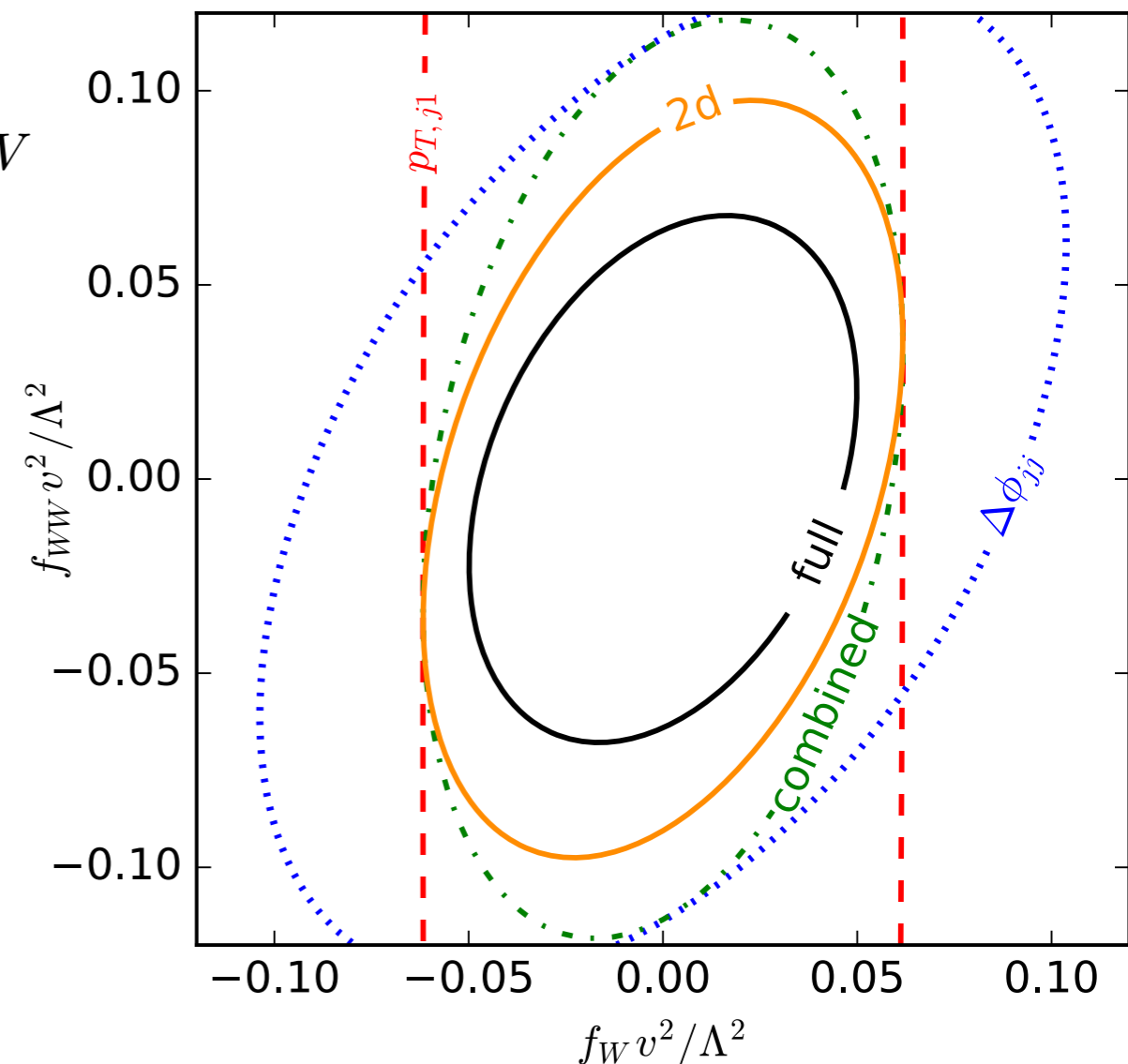
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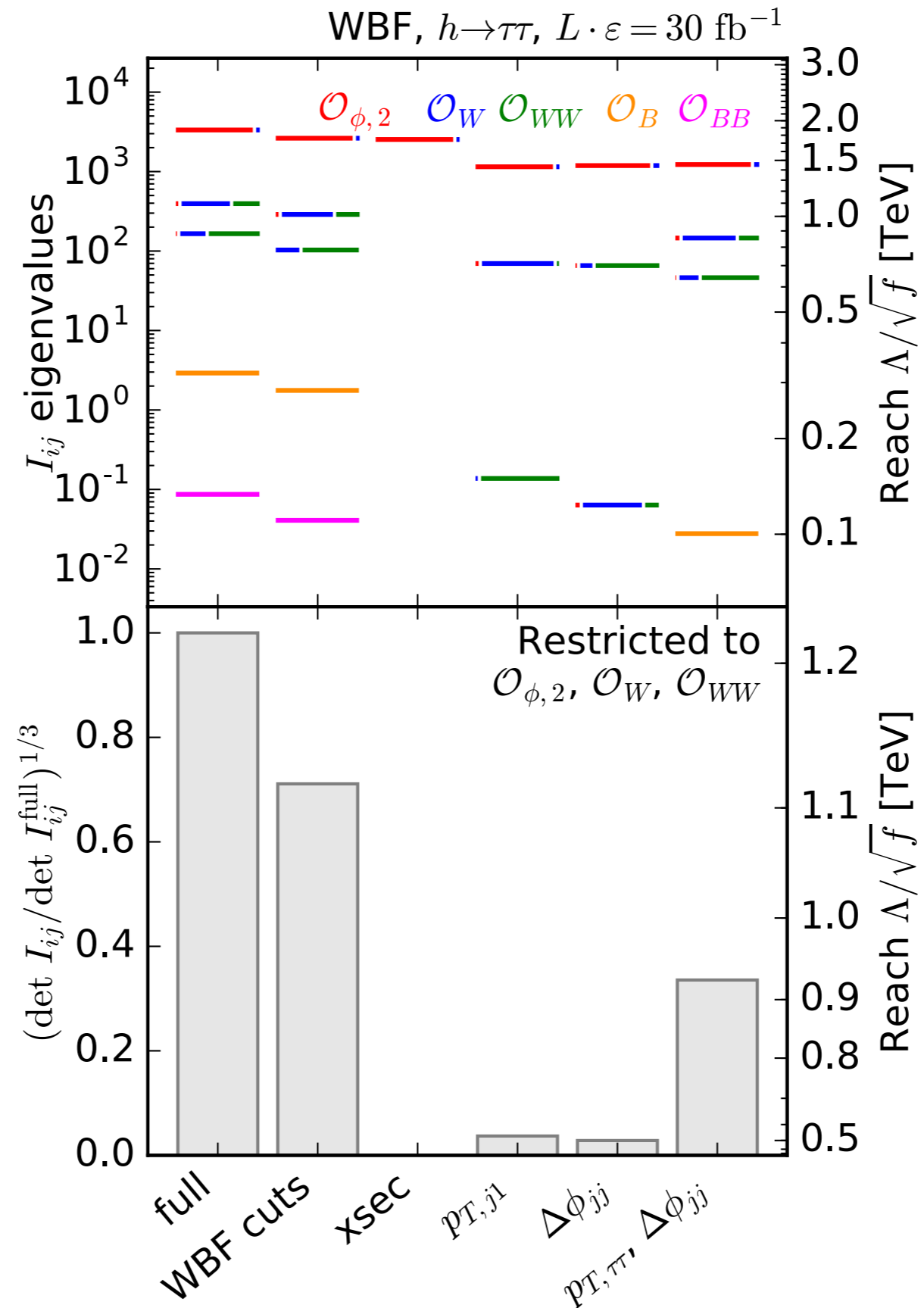
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- **Full phase space information**
- **2-dimensional** histogram necessary for stringent constraints, but still not close to full information



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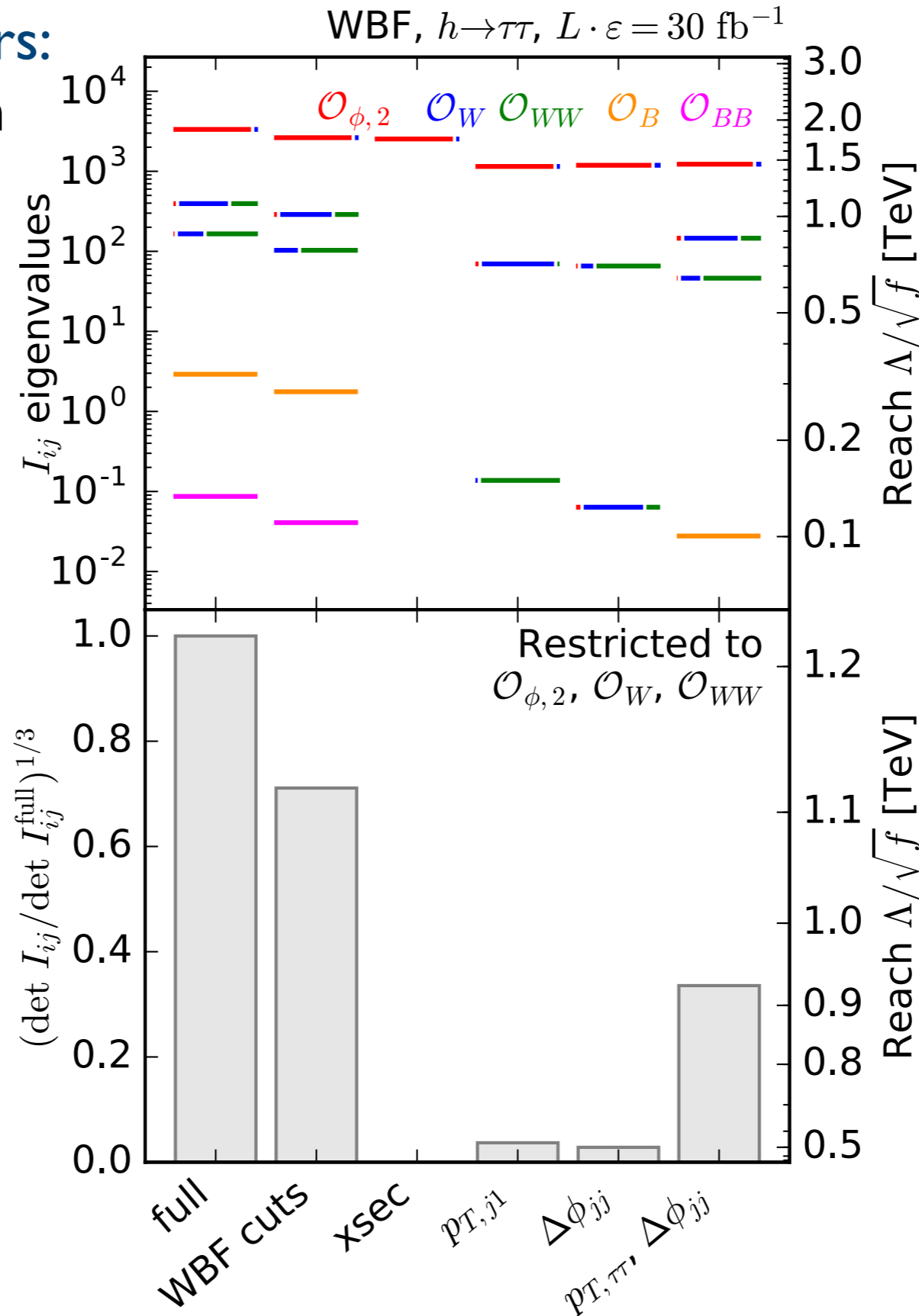
Eigenvalues/Eigenvectors:

Which operators can be measured well in which distribution?



Determinant:

Invariant measure of information



Cramer Rao Bound:

$$\frac{f v^2}{\Lambda^2} \sim \frac{1}{\sqrt{I}}$$



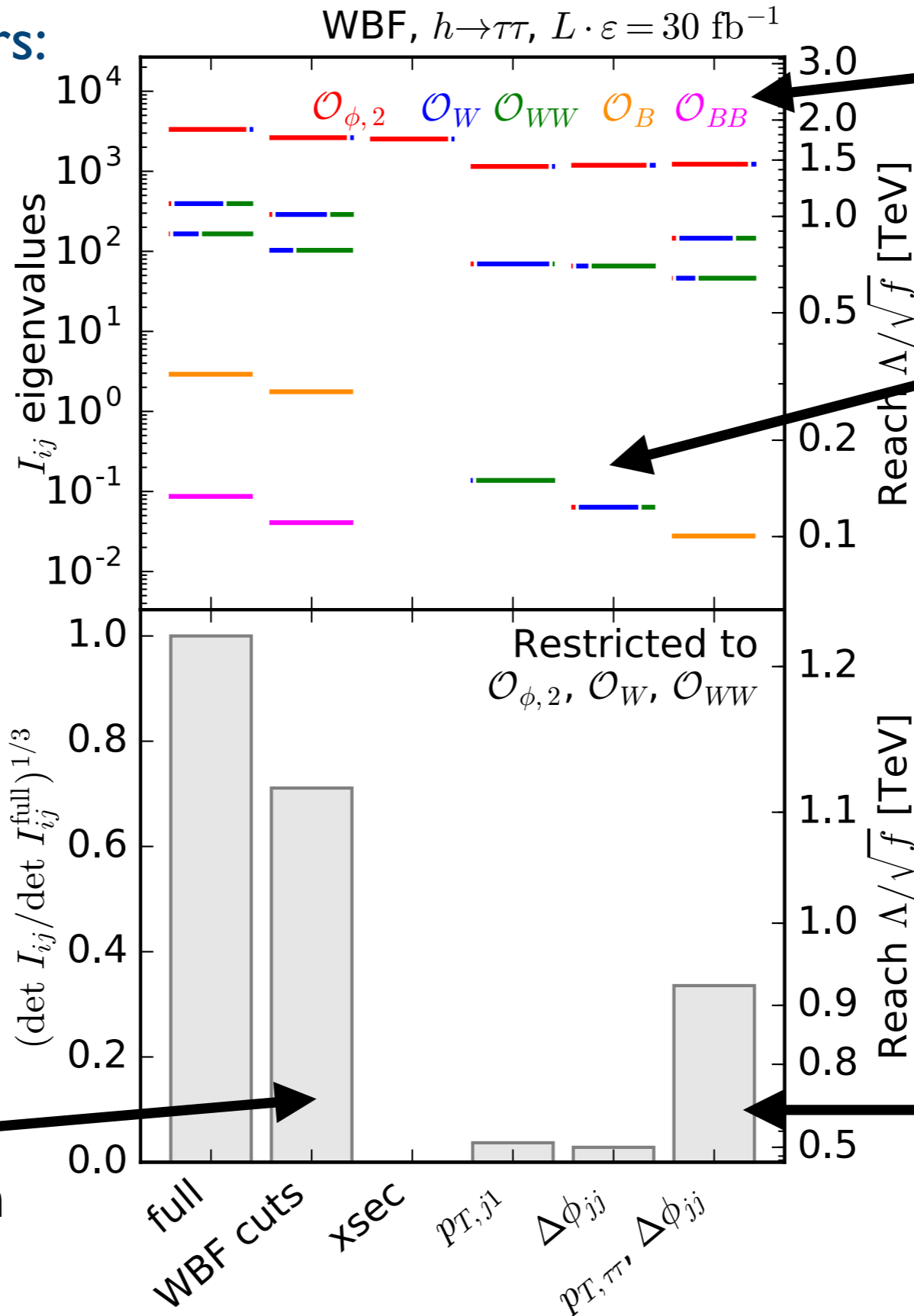
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$\mathcal{O}_B, \mathcal{O}_{BB}$ are poorly constrained

1D histogram suffer from blind directions

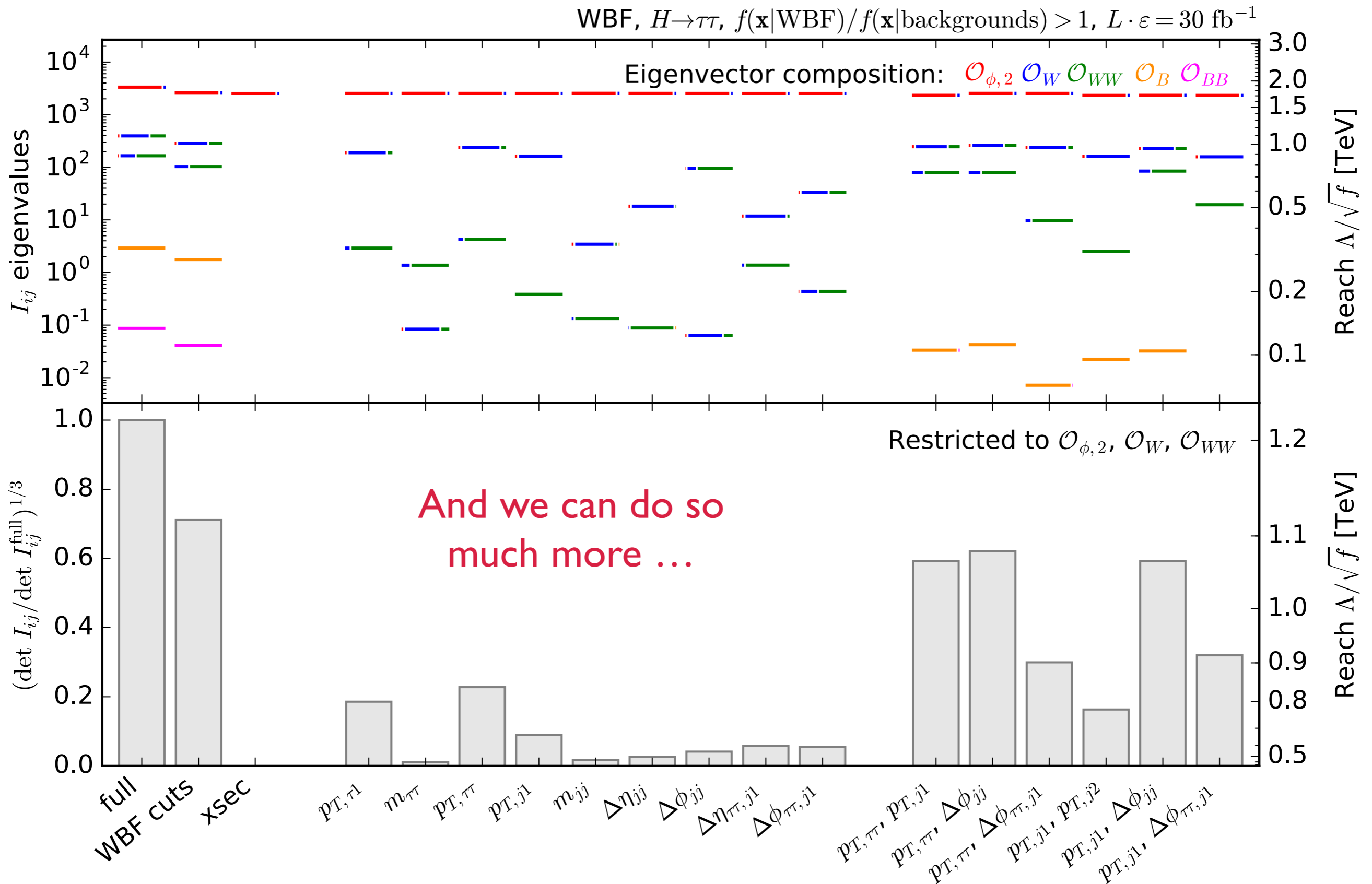
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2D histogram still loses 65% of information

WBF cuts lose 30% of information

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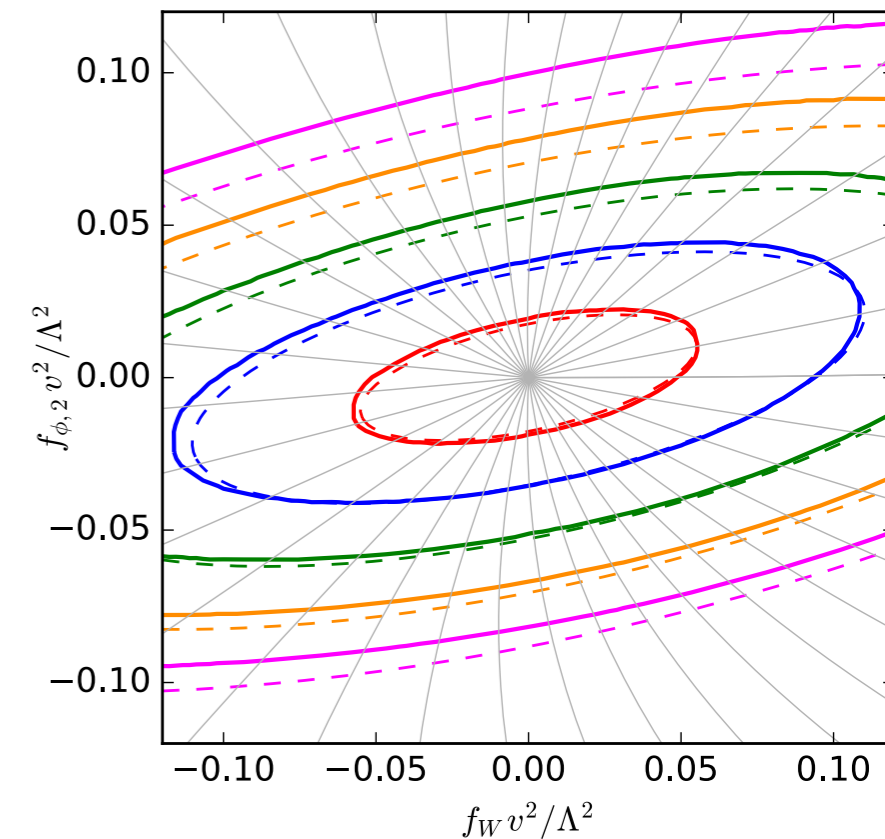
5. Does the EFT series converge?

→ Distance Measure ~ unlikeliness to measure θ if θ_0 is true 'in sigmas'

local distance: $d^2 = I_{ij}(\theta_0)(\theta^i - \theta_0^i)(\theta^j - \theta_0^j)$
(dashed)

global distance: $d = \min_{\theta(s)} \int_{s_a}^{s_b} ds \sqrt{I_{ij} \frac{d\theta_i}{ds} \frac{d\theta_j}{ds}}$
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Contours of distance
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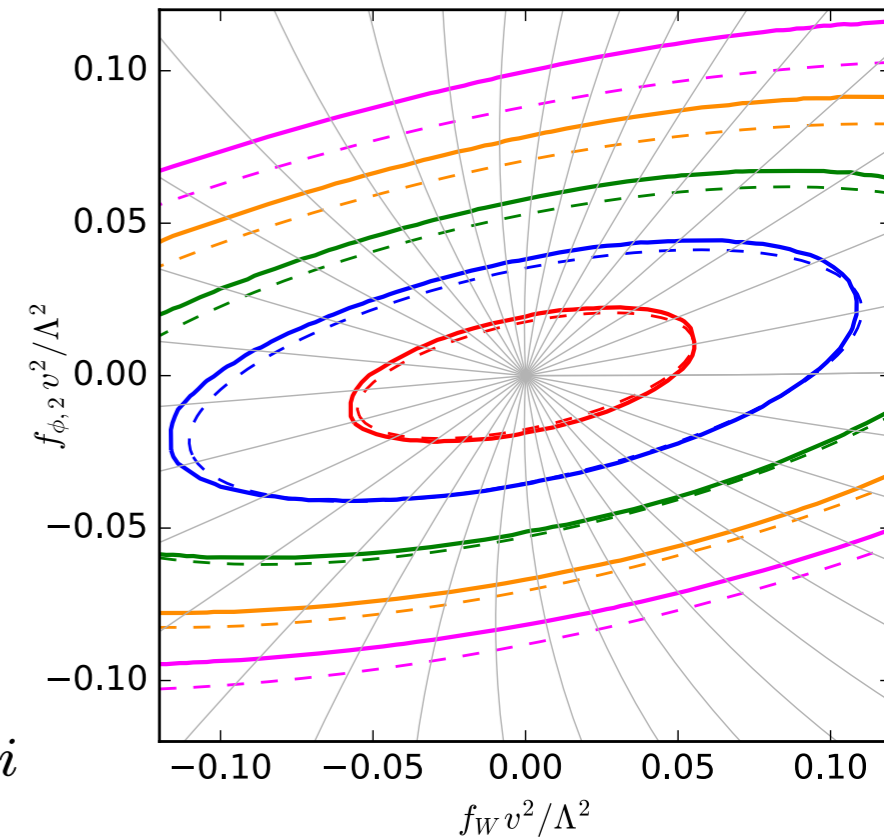
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→ $I_{ij}(\mathbf{0})$ only sensitive to linear effects $\Delta\sigma \sim \theta_i \Delta\sigma_i$

→ Information geometry for dim-6 operators $\theta_i = f_i^{d=6} v^2 / \Lambda^2$

$I_{ij}(\mathbf{0})$, local distances at SM

$$\Delta\sigma = \underbrace{\Delta\sigma_{SM} + \sum_i \frac{f_i^{d=6}}{\Lambda^2} \Delta\sigma_i}_{I_{ij}(\theta \neq 0), \text{ global distances}} + \sum_i \frac{f_i^{d=6} f_j^{d=6}}{\Lambda^4} \Delta\sigma_{ij} + \underbrace{\sum_i \frac{f_k^{d=8}}{\Lambda^2} \Delta\sigma_k}_{\text{always missing}} + \mathcal{O}(\Lambda^{-6})$$

$I_{ij}(\theta \neq 0)$, global distances

Difference between local/global distance ↔ size of $\mathcal{O}(\Lambda^{-4})$ effects

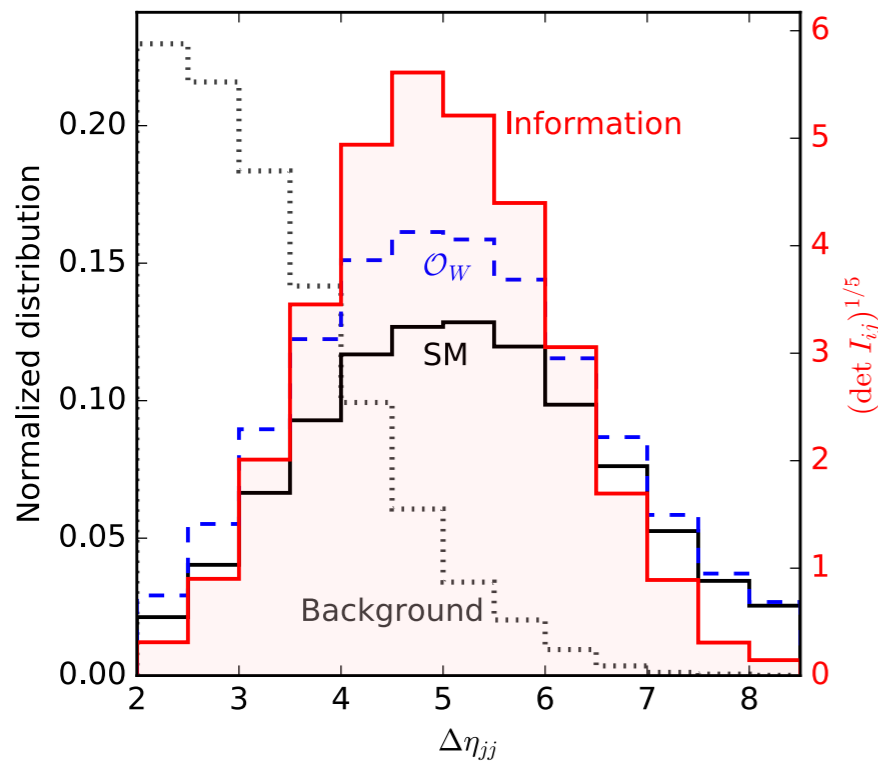
Conclusion

WBF in the HEFT framework as an example for Information Geometry

We can predict maximum precision at which Wilson coefficients can be measured.

$$I_{ij}(\mathbf{0}) = \begin{pmatrix} \mathcal{O}_{\phi,2} & \mathcal{O}_W & \mathcal{O}_{WW} & \mathcal{O}_B & \mathcal{O}_{BB} \\ 3202 & -625 & -7 & -35 & 0 \\ -625 & 451 & -110 & 23 & -2 \\ -7 & -110 & 244 & -6 & 3 \\ -35 & 23 & -6 & 4 & 0 \\ 0 & -2 & 3 & 0 & 0 \end{pmatrix} \begin{matrix} \mathcal{O}_{\phi,2} \\ \mathcal{O}_W \\ \mathcal{O}_{WW} \\ \mathcal{O}_B \\ \mathcal{O}_{BB} \end{matrix}$$

We can obtain differential distribution of information.



We can quantitatively compare performance of histogram-based and multivariate analyses.

