

Better LHC measurements through information geometry

Johann Brehmer

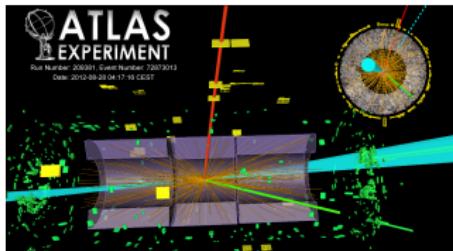
Heidelberg University

Based on 1612.05261
with Kyle Cranmer, Felix Kling, and Tilman Plehn

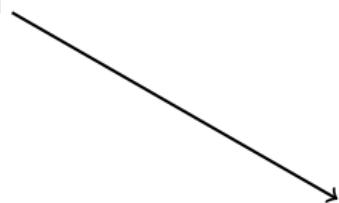
Pheno 2017

Inference at the LHC

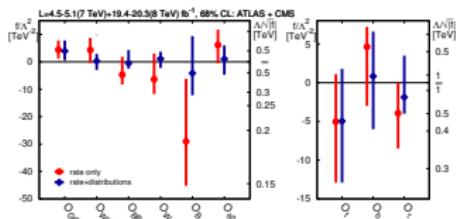
Complex data x



[ATLAS 1501.04943]



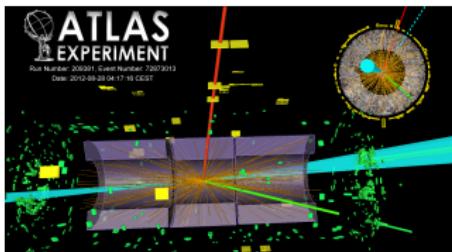
Many parameters θ



[T. Corbett et al 1505.05516]

Inference at the LHC

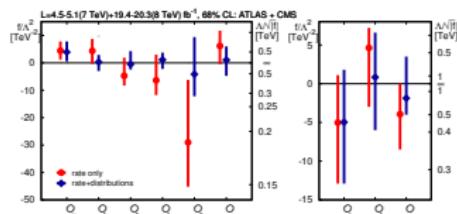
Complex data x



- ▶ Conventional analyses:

 - ▶ standard kinematic observables
 - ⇒ reproducible and transparent;
don't scale well with complexity

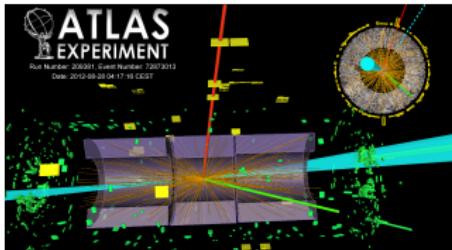
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[T. Corbett et al 1505.05516]

Inference at the LHC

Complex data x



[ATLAS 1501.04943]

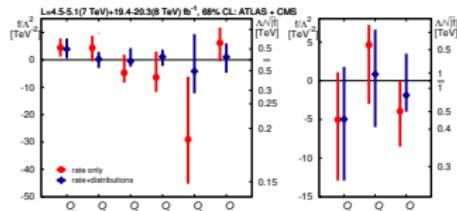
- ▶ Conventional analyses:

 - ▶ standard kinematic observables
 - ⇒ reproducible and transparent;
don't scale well with complexity

- ▶ Multivariate methods:

 - ▶ matrix-element-based
 - ▶ likelihood-free inference
(machine learning)
 - ⇒ powerful black boxes

Many parameters θ



[T. Corbett et al 1505.05516]

Efficient measurements need guidelines

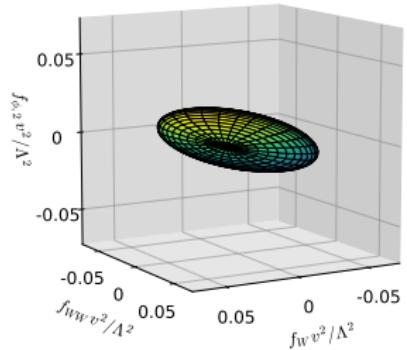
1. What is the maximum sensitivity of a measurement?
2. Where in phase space is the information?
3. How powerful are different observables?

Efficient measurements need guidelines

1. What is the maximum sensitivity of a measurement?
2. Where in phase space is the information?
3. How powerful are different observables?

Now: a statistics tool box based on information geometry
Next talk by Felix Kling: application to Higgs measurements and SM EFT

1. What is the maximum sensitivity of a measurement?



Cramér-Rao bound

- ▶ Measurement process:



Cramér-Rao bound

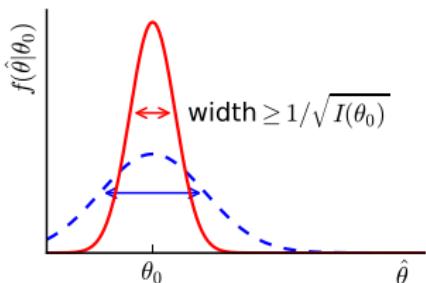
- Measurement process:



- Cramér-Rao bound for unbiased estimators:

[C. R. Rao 1945; H. Cramér 1946]

$$\text{cov} [\hat{\theta} | \theta_0]_{ij} \geq I^{-1}_{ij}(\theta_0)$$



Cramér-Rao bound

- Measurement process:



- Cramér-Rao bound for unbiased estimators:

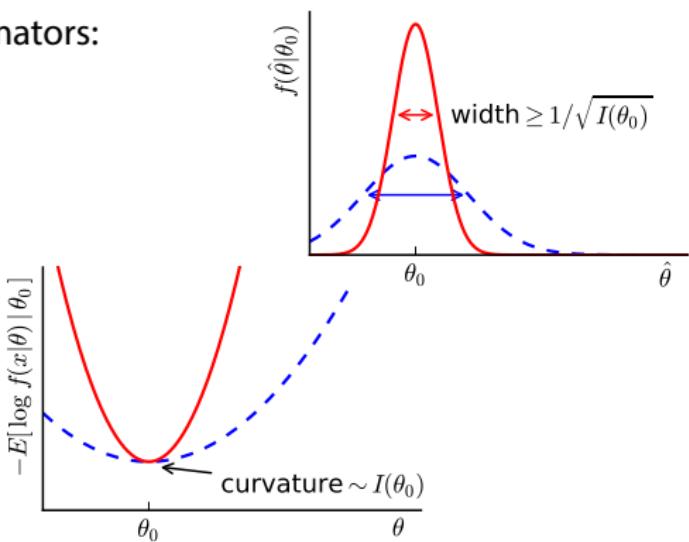
[C. R. Rao 1945; H. Cramér 1946]

$$\text{cov} [\hat{\theta} | \theta_0]_{ij} \geq I_{ij}^{-1}(\theta_0)$$

with Fisher information

[F. Edgeworth 1908; R. Fisher 1925; ...]

$$I_{ij}(\theta) = -E \left[\frac{\partial^2 \log f(\mathbf{x}|\theta)}{\partial \theta_i \partial \theta_j} \middle| \theta \right]$$



$\Rightarrow I_{ij} \sim \text{maximal precision with which } \theta \text{ can be measured in an experiment}$

The Fisher information and the LHC

- ▶ Properties:

- ▶ Describes **all** directions in theory space
- ▶ **Additive** between experiments / phase-space regions
- ▶ **Independent** of parametrization of x
- ▶ **Covariant** under $\theta \rightarrow \theta'$

The Fisher information and the LHC

- ▶ Properties:
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 - ▶ **Covariant** under $\theta \rightarrow \theta'$

- ▶ Fisher information in LHC processes:

- ▶ Extended likelihood ansatz:

$$f(\mathbf{x}|\boldsymbol{\theta}) = \underbrace{\text{Pois}(n|\sigma L)}_{\text{Total event number}} \underbrace{\prod_{i=1}^n f^{(1)}(\mathbf{x}_i|\boldsymbol{\theta})}_{\text{Kinematics of each event}}$$

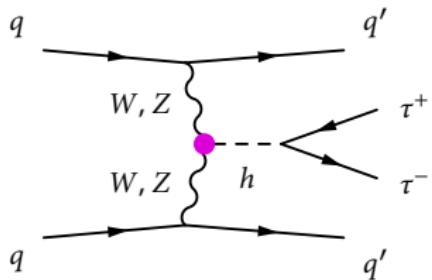
- ▶ MC integration gives

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

⇒ Can calculate all $I_{ij}(\boldsymbol{\theta})$ from a single MC run

Cramér-Rao in practice

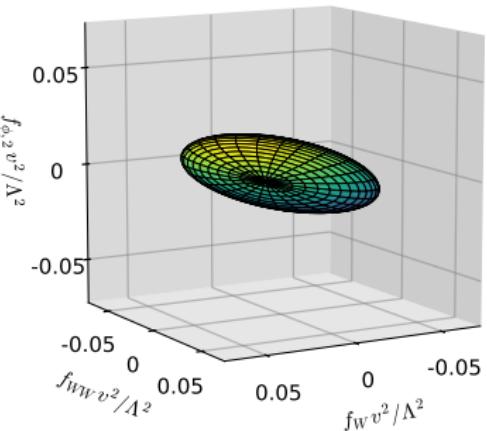
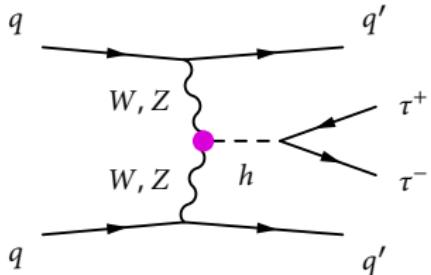
- ▶ Toy example:
- ▶ Weak boson fusion, $h \rightarrow \tau\tau$
- ▶ NP parameters $f_{\phi,2}, f_W, f_{WW}$ characterizing hWW coupling
- ▶ All the cool physics (and all the dirty details) in the next talk!



Cramér-Rao in practice

- ▶ Toy example:
 - ▶ Weak boson fusion, $h \rightarrow \tau\tau$
 - ▶ NP parameters $f_{\phi,2}, f_W, f_{WW}$ characterizing hWW coupling
 - ▶ All the cool physics (and all the dirty details) in the next talk!
- ▶ Fisher information \leftrightarrow minimal error ellipsoids:

$$I_{ij}(\mathbf{0}) = \begin{pmatrix} f_{\phi,2} & f_W & f_{WW} \\ 3202 & -625 & -7 \\ -625 & 451 & -110 \\ -7 & -110 & 244 \end{pmatrix} \begin{pmatrix} f_{\phi,2} \\ f_W \\ f_{WW} \end{pmatrix} \quad \leftrightarrow$$



Information geometry

- ▶ Geometric interpretation:

- ▶ Parameter space of theory \leadsto manifold
- ▶ Parametrization θ_i \leadsto map (coordinates)
- ▶ Fisher information I_{ij} \leadsto Riemannian metric

[C. R. Rao 1945, S. Amari 1968; ...]

- ▶ Distance measures:

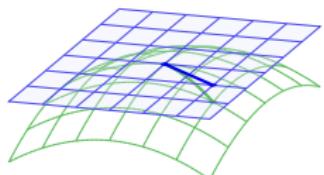
- ▶ Local / tangent space at θ_0 :

$$d_{\text{local}}(\boldsymbol{\theta}; \boldsymbol{\theta}_0) = \sqrt{I_{ij}(\boldsymbol{\theta}_0) (\theta^i - \theta_0^i) (\theta^j - \theta_0^j)}$$

\sim unlikelihood to measure $\boldsymbol{\theta}$ if $\boldsymbol{\theta}_0$ is true, 'in sigmas'

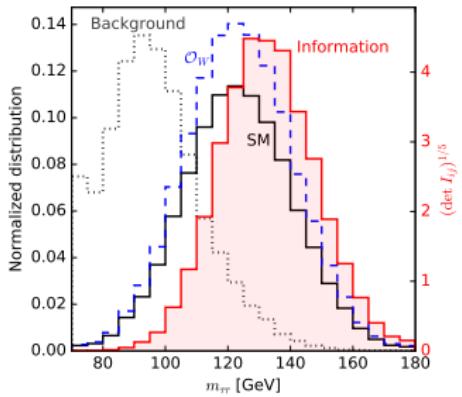
- ▶ Global along geodesics:

$$d(\boldsymbol{\theta}_a, \boldsymbol{\theta}_b) = \min_{\boldsymbol{\theta}(s)} \int_{s_a}^{s_b} ds \sqrt{I_{ij}(\boldsymbol{\theta}) \frac{d\theta_i(s)}{ds} \frac{d\theta_j(s)}{ds}}$$



- ▶ Difference between $d_{\text{local}}(\boldsymbol{\theta}, \mathbf{0})$ and $d(\boldsymbol{\theta}, \mathbf{0})$ \leftrightarrow impact of $\mathcal{O}(\boldsymbol{\theta}^2)$ contributions

2. Where in phase space is the information?



The differential information

- ▶ Differential information with respect to any observable:

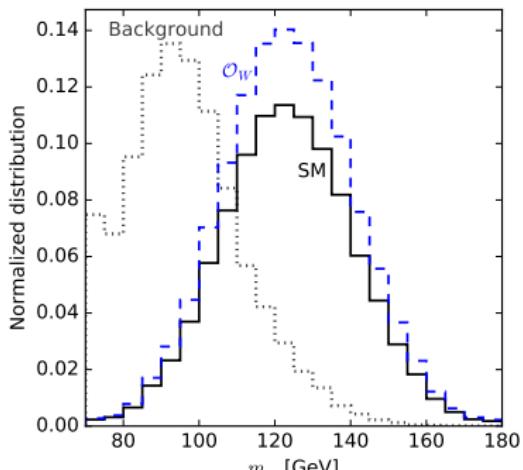
$$I_{ij}(\theta) = \sum_{\text{events}} L \frac{\partial \Delta\sigma}{\partial \theta_i} \frac{1}{\Delta\sigma} \frac{\partial \Delta\sigma}{\partial \theta_j} = \sum_{\text{bins } b} \underbrace{\sum_{\text{events in } b} L \frac{\partial \Delta\sigma}{\partial \theta_i} \frac{1}{\Delta\sigma} \frac{\partial \Delta\sigma}{\partial \theta_j}}_{\text{information in } b}$$

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- Right: $m_{\tau\tau}$ distribution
 - SM Higgs vs NP Higgs vs Z background rates

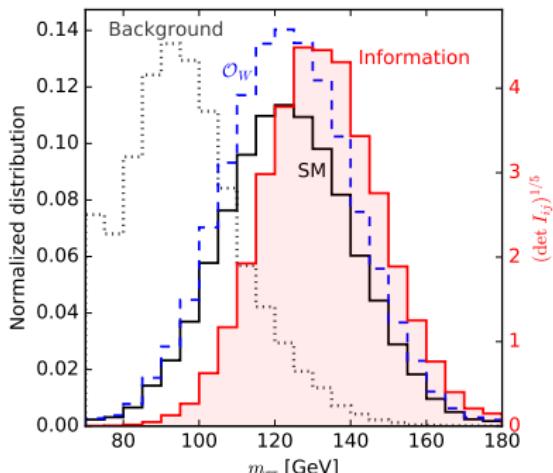


The differential information

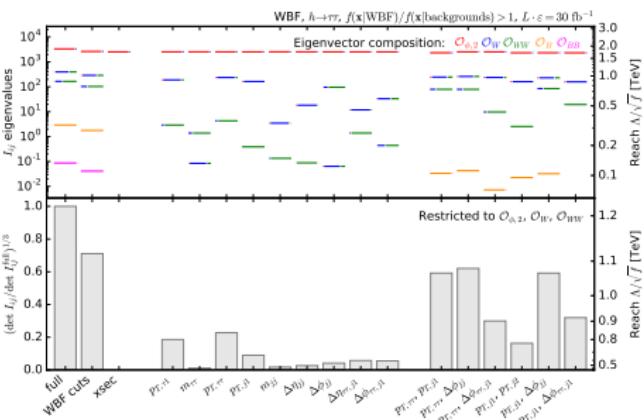
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- Right: $m_{\tau\tau}$ distribution
 - SM Higgs vs NP Higgs vs Z background rates
 - Distribution of differential information**



3. How powerful are different observables?



Information in individual distributions

- ▶ Reduced information in histogram (rather than full kinematics):

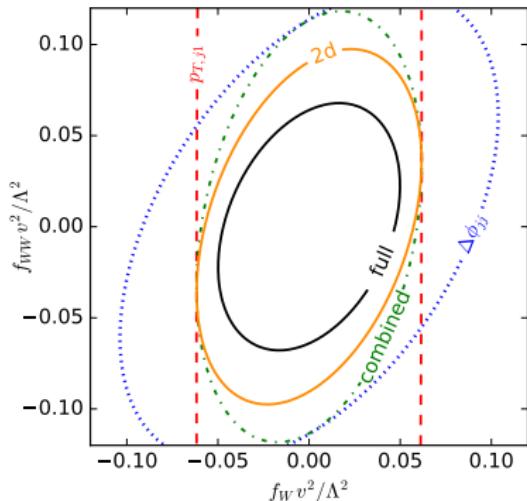
$$I_{ij}^{\text{distribution}}(\boldsymbol{\theta}) = \sum_{\text{bins } b} L \frac{\partial \sigma_b(\boldsymbol{\theta})}{\partial \theta_i} \frac{1}{\sigma_b(\boldsymbol{\theta})} \frac{\partial \sigma_b(\boldsymbol{\theta})}{\partial \theta_j}$$

Information in individual distributions

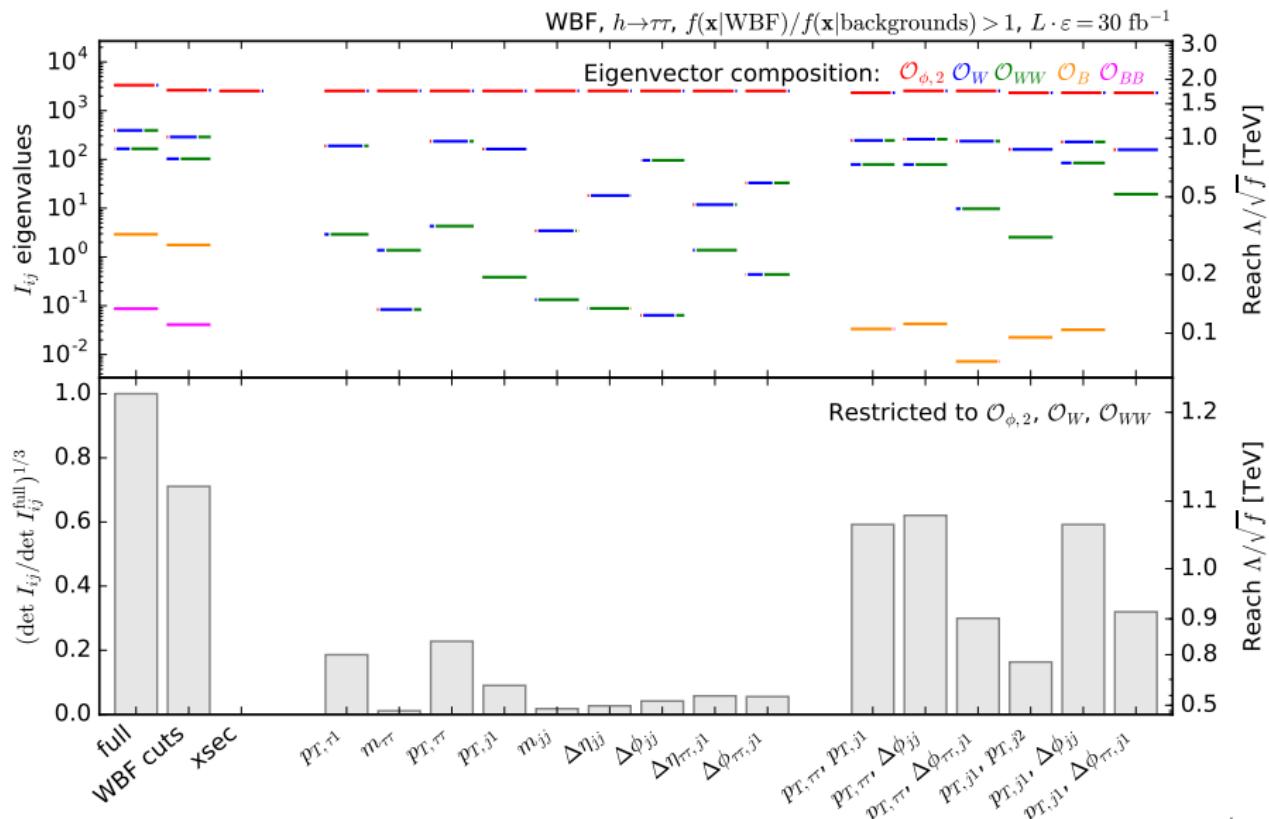
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- Right: constraining power of WBF distributions
 - different observables** and their **combination**
 - full kinematics

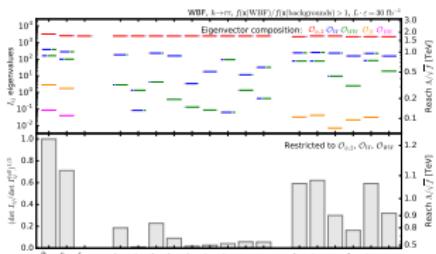
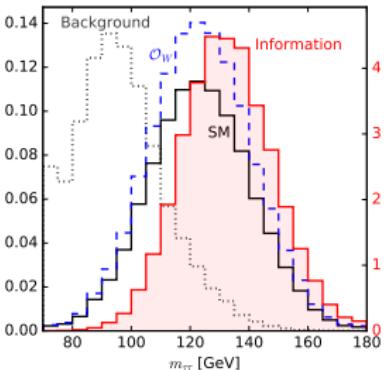
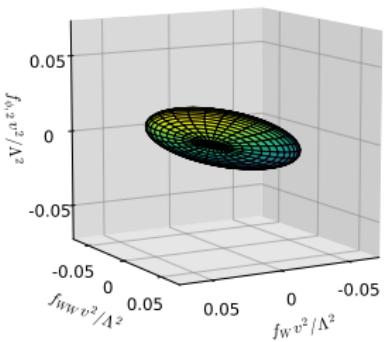


Comparison of observables



Conclusions

Information geometry lets us...



- ▶ calculate the maximum sensitivity of any LHC process
- ▶ find the important phase-space regions
- ▶ select the most powerful observables, compare them to multivariate methods

Stay tuned for physics applications!

Bonus material

Belated introduction slide

- ▶ There's probably¹ new physics in the Higgs sector
 - ▶ Hierarchy problem
 - ▶ Fermion masses
 - ▶ DM
 - ▶ Baryon asymmetry
 - ▶ ...
- ▶ Measurement of Higgs properties most exciting mission for Run 2
 - until the LHC finds something really cool
- ▶ Need model-independent parametrisation of Higgs properties

¹ No warranty, expressed or implied

SM effective field theory

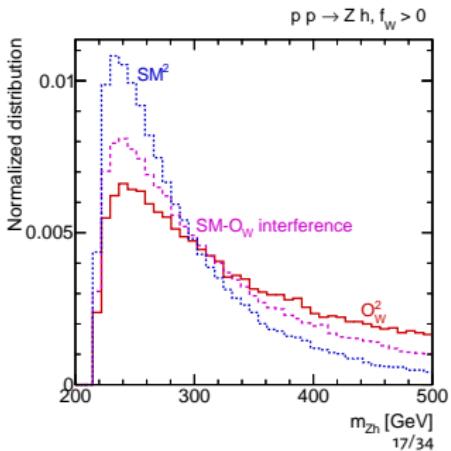
[W. Buchmuller, D. Wyler 85; K. Hagiwara, S. Ishihara, S. R. Szalapski, D. Zeppenfeld 93;
B. Grzadkowski, M. Iskrzynski, M. Misiak, J. Rosiek 1008.4884; ...]

- ▶ New physics at $\Lambda \gg E_{\text{LHC}} \sim m_h$?

$$\mathcal{L}_{\text{EFT}} = \mathcal{L}_{\text{SM}} + \underbrace{\sum_i^{59} \frac{f_i^{d=6}}{\Lambda^2} \mathcal{O}_i^{d=6}}_{\dots} + \sum_k \frac{f_k^{d=8}}{\Lambda^4} \mathcal{O}_k^{d=8} + \dots$$

e.g. $\mathcal{O}_W = (D^\mu \phi)^\dagger \sigma^k (D^\nu \phi) W_{\mu\nu}^k \dots$

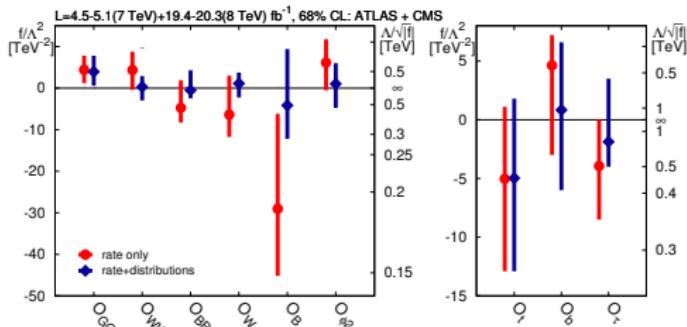
- ▶ Dimension-6 operators: perfect language for new physics signatures in Higgs sector?
 - ▶ Model independence?
 - ▶ Correlations between Higgs, LHC TGC, LEP, ...
 - ▶ Total rates + distributions



Sensitivity vs validity

► Run I fit:

[T. Corbett, O. Eboli, D. Goncalves, J. Gonzalez-Fraile, T. Plehn, M. Rauch 1505.05516]



► Is the dimension-six model still useful?

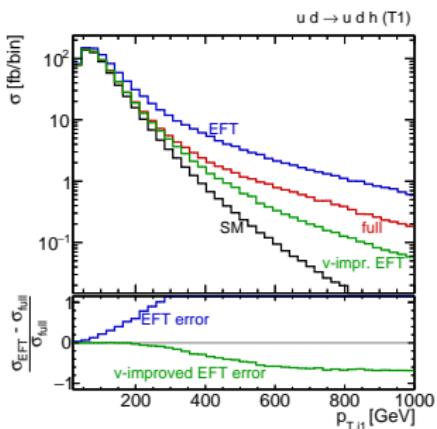
- Strongly coupled NP: works fine
- Weakly coupled NP: no guarantee, but works in many scenarios (with v -improved matching)

[JB, A. Freitas, D. Lopez-Val, T. Plehn 1510.03443]

- EFT less reliable in high-energy tails

[See YR4 and references therein ;),
note similar questions for DM EFTs]

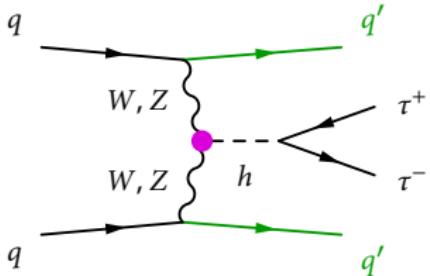
- Kinematic information up to $E \lesssim 400$ GeV crucial
- Sensitive to NP scales $\Lambda \sim \sqrt{f} \cdot 400$ GeV



Weak boson fusion (WBF), $h \rightarrow \tau\tau$

- ▶ Kinematics of tagging jets sensitive to Higgs-gauge interaction

[D.Rainwater, D.Zeppenfeld, K.Hagiwara hep-ph/9808468;
 T.Plehn, D.Rainwater, D.Zeppenfeld hep-ph/0105325;
 C.Englert, D.Gonçalves-Netto, K.Mawatari, T.Plehn 1212.0843; ...]



- ▶ Model: dimension-6 Higgs-gauge operators

$$\theta = \frac{\nu^2}{\Lambda^2} \begin{pmatrix} f_{\phi,2} \\ f_W \\ f_{WW} \\ f_B \\ f_{BB} \end{pmatrix} \rightarrow \begin{array}{ll} \mathcal{O}_{\phi,2} = \frac{1}{2} \partial^\mu (\phi^\dagger \phi) \partial_\mu (\phi^\dagger \phi) & \text{rescales all } h \text{ couplings} \\ \mathcal{O}_W = i \frac{g}{2} (D^\mu \phi)^\dagger \sigma^k (D^\nu \phi) W_{\mu\nu}^k & hWW, hZZ \text{ kinematics} \\ \mathcal{O}_{WW} = -\frac{g^2}{4} (\phi^\dagger \phi) W_{\mu\nu}^k W^{\mu\nu k} & \\ \mathcal{O}_B = i \frac{g}{2} (D^\mu \phi^\dagger) (D^\nu \phi) B_{\mu\nu} & hZZ \text{ kinematics} \\ \mathcal{O}_{BB} = -\frac{g'^2}{4} (\phi^\dagger \phi) B_{\mu\nu} B^{\mu\nu} & \end{array}$$

Setup

- ▶ Tools: MadGraph 5, MadMax

[J. Alwall et al 1405.0301;
 K. Cranmer, T. Plehn hep-ph/0605268;
 T. Plehn, P. Schichtel, D. Wiegand 1311.2591;
 F. Kling, T. Plehn, P. Schichtel 1607.07441]

- ▶ Backgrounds:

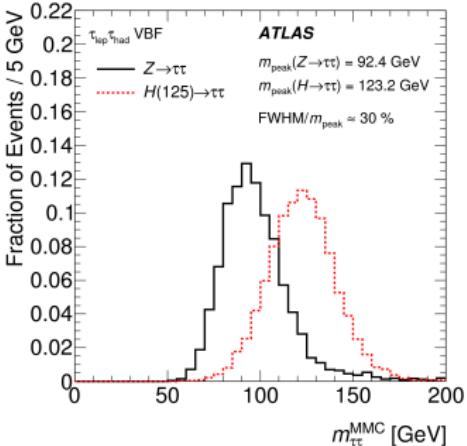
- ▶ QCD and electroweak $Z \rightarrow \tau\tau$
- ▶ Gluon-fusion Higgs production

- ▶ Approximations:

- ▶ τ decays not simulated
- ▶ Parton level
- ▶ No detector simulation
- ▶ No systematic or theory uncertainties

$$\sqrt{s} = 13 \text{ TeV}, L \cdot \varepsilon = 30 \text{ fb}^{-1}$$

$$\text{Cuts: } p_{T,j} > 20 \text{ GeV}, |\eta_j| < 5.0, \Delta\eta_{jj} > 2.0, \Delta R_{jj} > 0.4$$



BR for semileptonic $\tau\tau$ mode

CJV survival probabilities from literature

[D. Rainwater, D. Zeppenfeld, K. Hagiwara hep-ph/9808468]

$m_{\tau\tau}$ smeared by single / double Gaussian

fitted to ATLAS results

[ATLAS 1501.04943, see above]

Maximum sensitivity in WBF, $h \rightarrow \tau\tau$

- Fisher information at the SM:

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

- Minimal errors $\Delta\theta \geq 1/\sqrt{I}$:

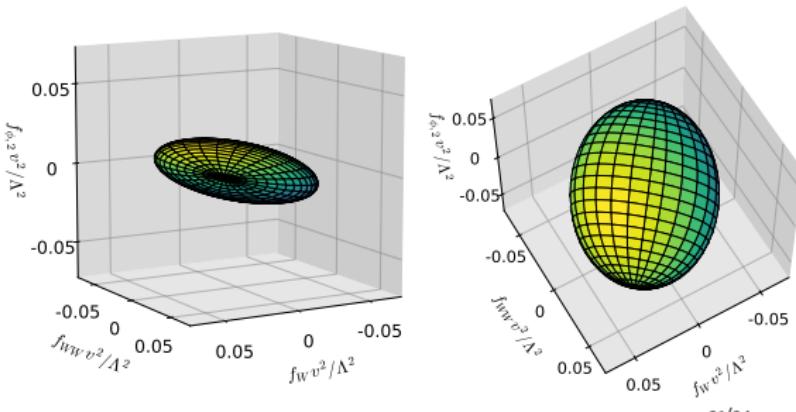
- Largest eigenvalue along $\mathcal{O}_{\phi,2}$:

$$\Delta(f/\Lambda^2) \gtrsim 0.3 \text{ TeV}^{-2}$$

- \mathcal{O}_W - \mathcal{O}_{WW} plane:

$$\Delta(f/\Lambda^2) \gtrsim 1.0 \text{ TeV}^{-2}$$

- Large mixing



A hierarchy of scales?

- ▶ EFT approach based on $E^2/\Lambda^2 \ll 1$
- ▶ Test this scale hierarchy!

- ▶ Limit momentum flow with cut

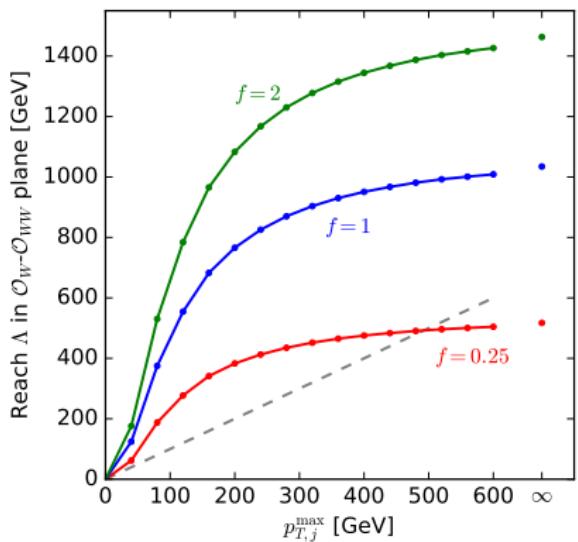
$$E \sim p_{T,j} < p_{T,j}^{\max}$$

- ▶ Precision

$$\Delta(f v^2/\Lambda^2) = 1/\sqrt{I}$$

corresponds to new physics reach

$$\Lambda = \sqrt{f} v I^{1/4}$$



Geometry of effective field theories

- ▶ Remember

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

⇒ $I_{ij}(\mathbf{0})$ only sensitive to linear effects $\Delta\sigma \sim \theta_i \Delta\sigma_i$

- ▶ Information geometry for dimension-6 operators, $\theta_i = f_i^{d=6} v^2 / \Lambda^2$:

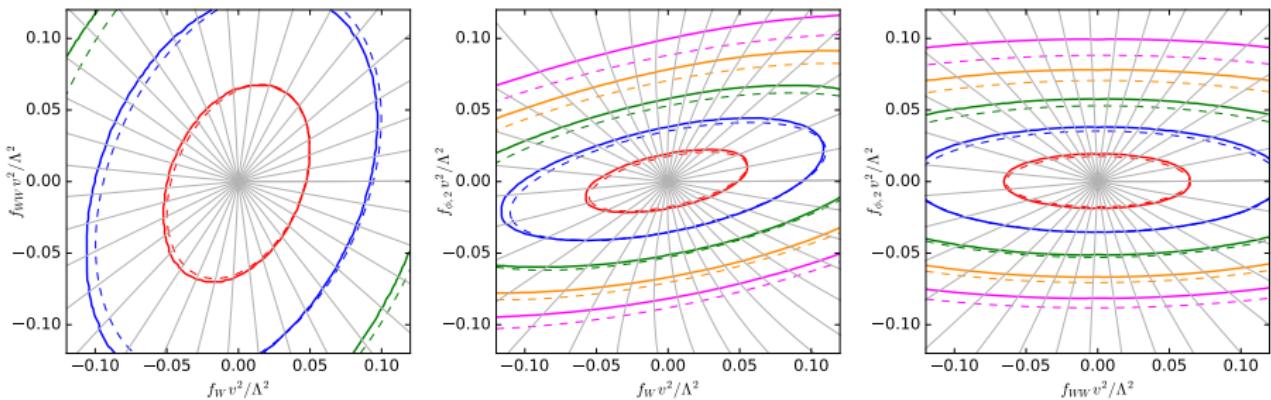
$$\Delta\sigma = \underbrace{\Delta\sigma_{SM} + \sum_i \frac{f_i^{d=6}}{\Lambda^2} \Delta\sigma_i}_{I_{ij}(\mathbf{0}), \text{ local distances at SM}} + \sum_{i,j} \frac{f_i^{d=6} f_j^{d=6}}{\Lambda^4} \Delta\sigma_{ij} + \sum_k \frac{f_k^{d=8}}{\Lambda^4} \Delta\sigma_k + \mathcal{O}(1/\Lambda^6)$$

$\overbrace{\hspace{30em}}$

always missing

⇒ Difference between local and global distances ↔ size of $\mathcal{O}(1/\Lambda^4)$ effects

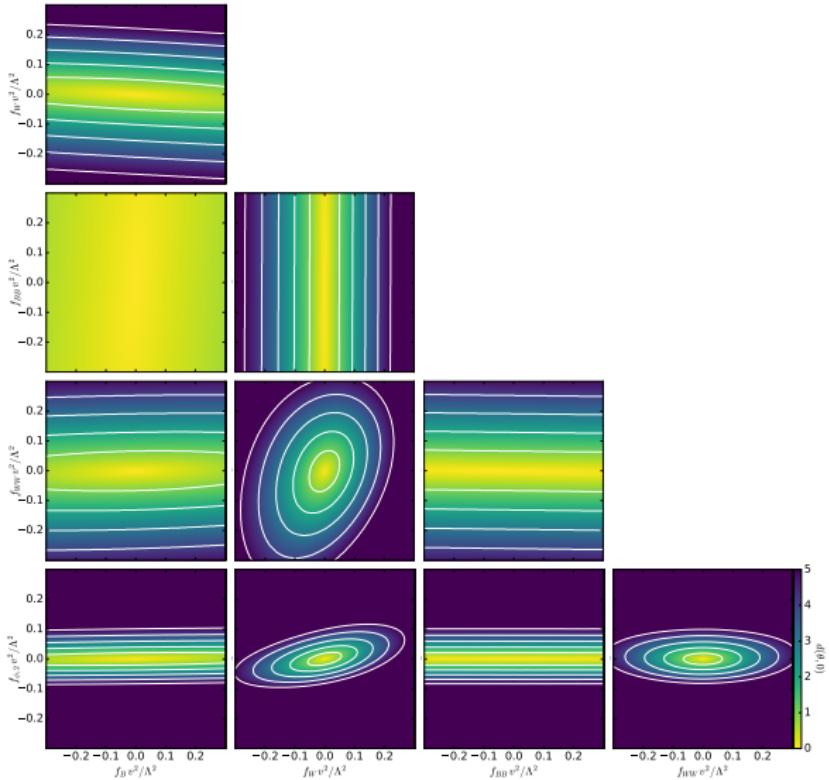
Global vs local distances for WBF



Contours of local (dashed) and global (solid) distances $d = 1, 2, 3, \dots$ from SM

Other parameters set to zero

WBF distances



Distances from SM $d(\theta, 0)$

Optimal precision ($d = 1$):

$$\Delta(f_{\phi,2} v^2 / \Lambda^2) \approx 0.02$$

$$\Delta(f_W v^2 / \Lambda^2) \approx 0.05$$

$$\Delta(f_{WW} v^2 / \Lambda^2) \approx 0.05$$

Differential information over $p_{T,j}$

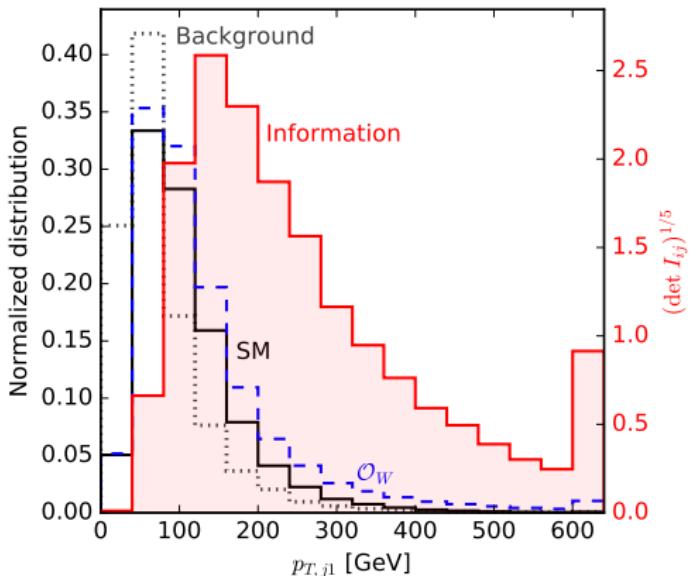
Strongly correlated with momentum transfer E through production vertex:
 measures $\mathcal{O} \sim \partial^2/\Lambda^2 \sim E^2/\Lambda^2$

SM

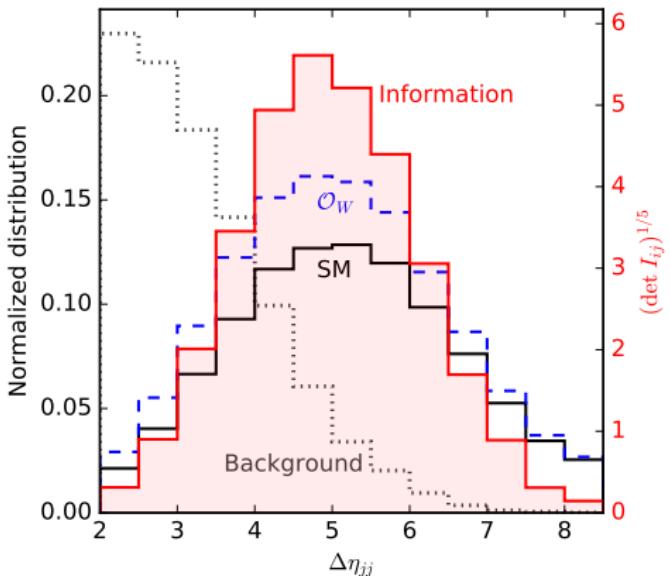
$$f_W/\Lambda^2 \nu^2 = 0.5$$

QCD $Z \rightarrow \tau\tau$

$$\det I_{ij}(0)$$



Differential information over $\Delta\eta_{jj}$

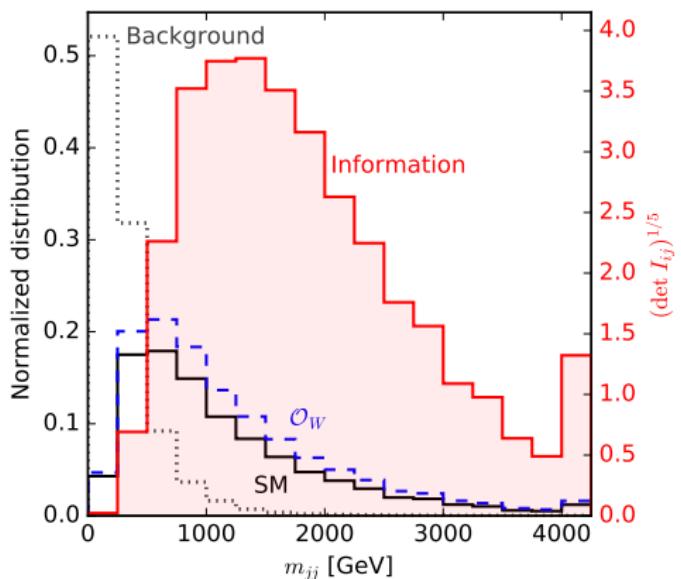


Trade-off:

- Background suppression better at large $\Delta\eta_{jj}$
- Momentum-dependent operators have largest effects at medium $\Delta\eta_{jj}$

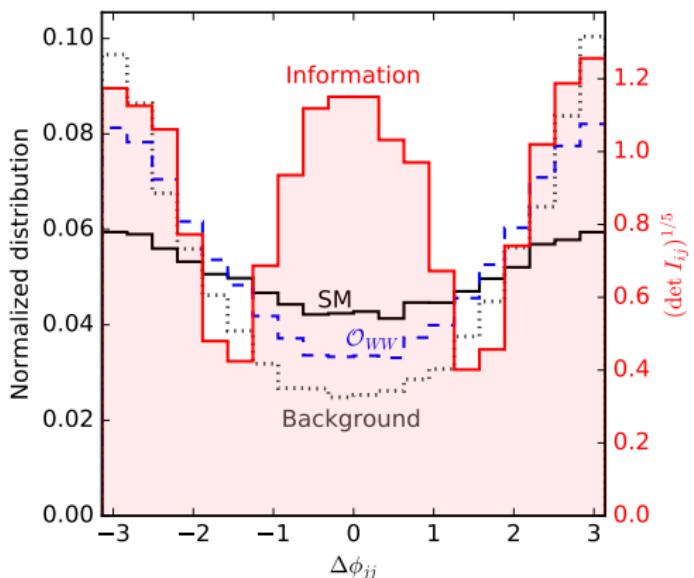
SM
 $f_W/\Lambda^2 v^2 = 0.5$
 QCD $Z \rightarrow \tau\tau$
 $\det I_{ij}(0)$

Differential information over m_{jj}



SM
 $f_W/\Lambda^2 v^2 = 0.5$
 QCD $Z \rightarrow \tau\tau$
 $\det I_{ij}(0)$

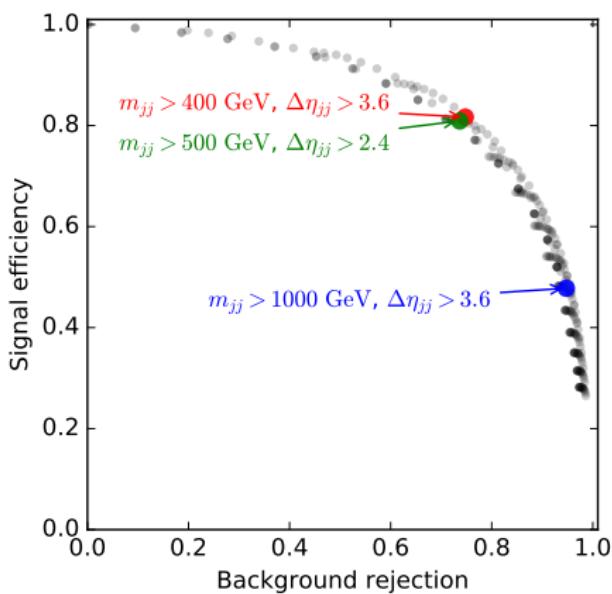
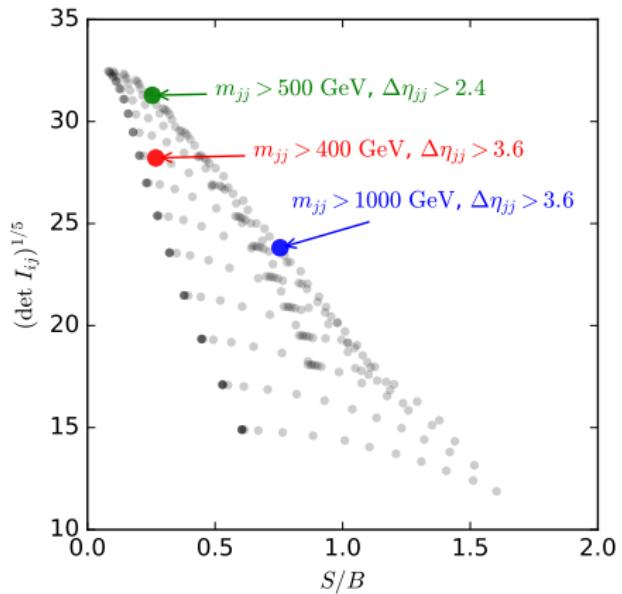
Differential information over $\Delta\phi_{jj}$



SM
 $f_{WW}/\Lambda^2 v^2 = 0.5$
 QCD $Z \rightarrow \tau\tau$
 $\det I_{ij}(0)$

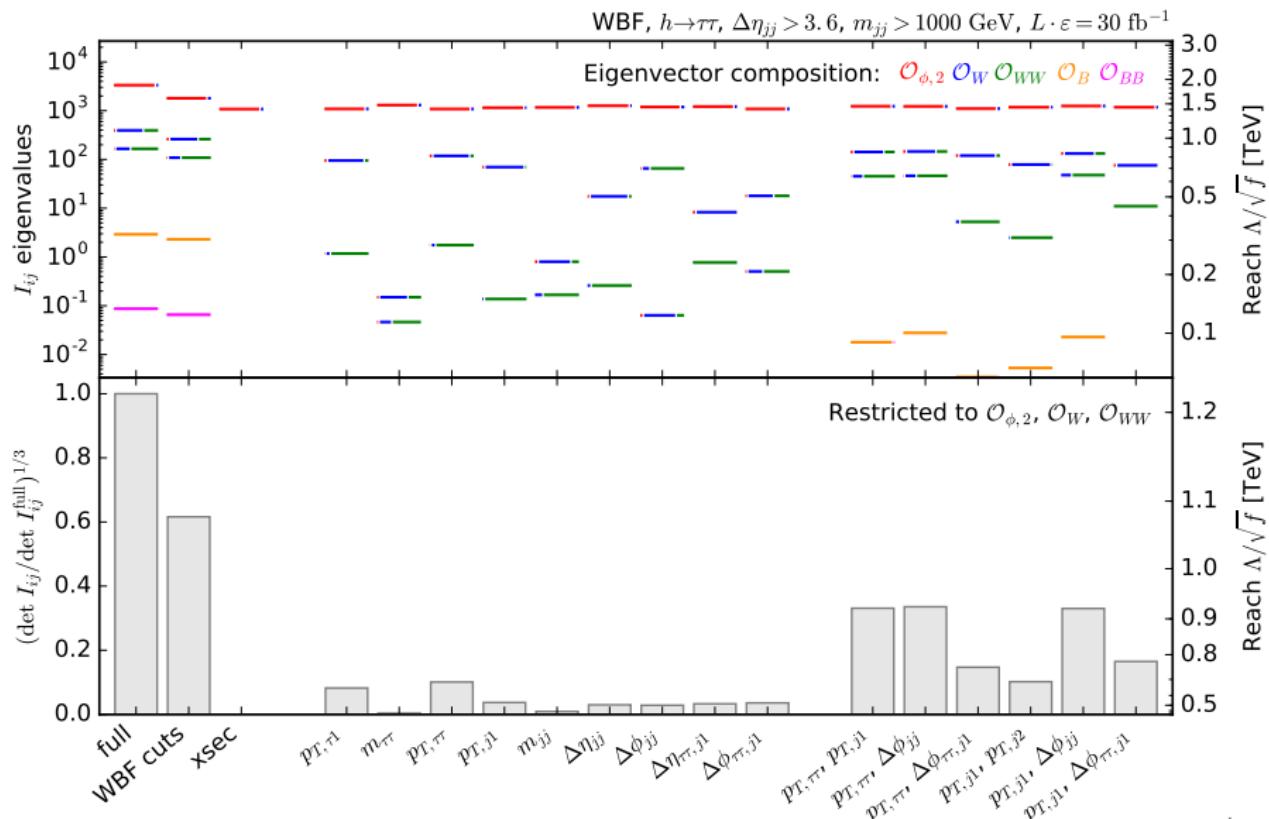
Optimizing cuts

- Scan over m_{jj} and $\Delta\eta_{jj}$ cuts \rightsquigarrow signal and background rate, $I_{ij}(\mathbf{0})$
- Trade-off between information and purity (left)
- Standard ROC curves (right) can be misleading



Common cuts: $105 \text{ GeV} < m_{\tau\tau} < 165 \text{ GeV}, p_{T,j1} > 50 \text{ GeV}$

WBF observables after conventional cuts



Adding systematic uncertainties

Procedure:

- ▶ Add nuisance parameter to Fisher information:

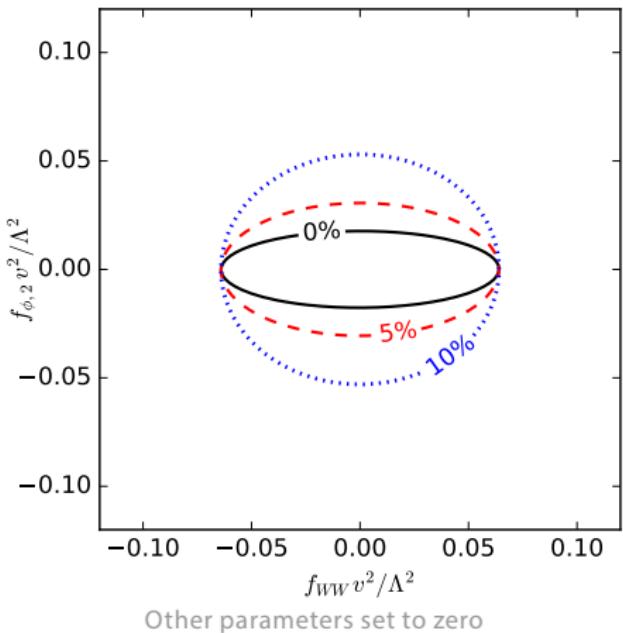
$$I_{ij} = \begin{pmatrix} I_t & I_m^T \\ I_m & I_n \end{pmatrix}$$

- ▶ Profiled information:

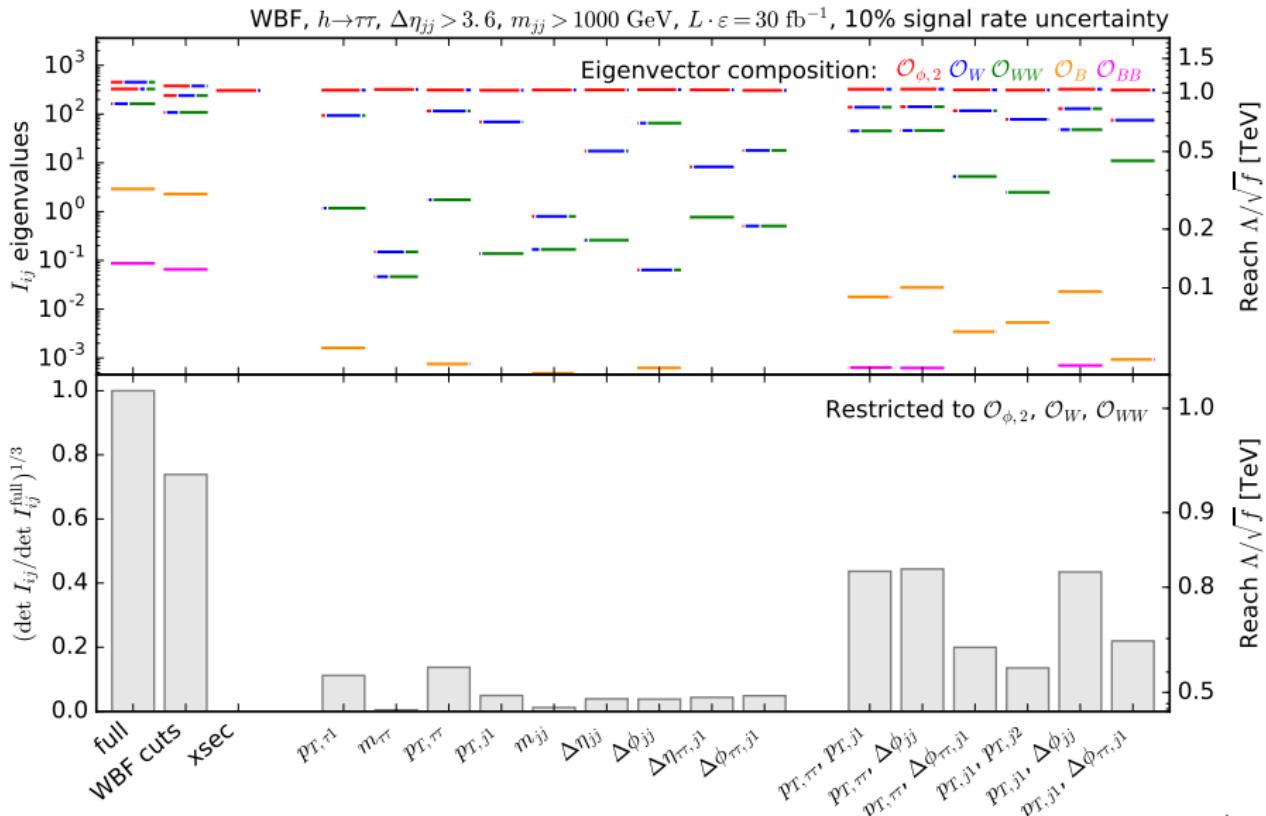
$$I_{\text{profiled}} = I_t - I_m^T I_n^{-1} I_m$$

[T. Edwards, C. Weniger 1704.05458]

Local distances from SM, profiled over Gaussian uncertainties of 5% or 10% on signal rate:



WBF observables with systematics



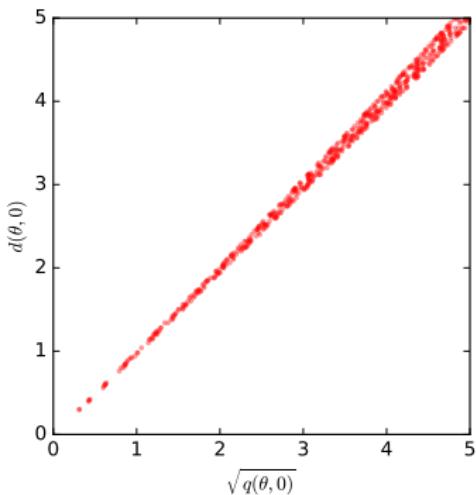
Fisher information vs likelihood ratio

- Confidence intervals based on hypothesis tests with likelihood ratio: are the Fisher information results relevant?

- Check!

- Sample points θ in \mathcal{O}_W - \mathcal{O}_{WW} plane
- Compare information distance $d(\theta, \mathbf{0})$ to expected log likelihood ratio

$$q(\theta|\mathbf{0}) = E \left[-2 \log \frac{f(\mathbf{x}|\theta)}{f(\mathbf{x}|\mathbf{0})} \middle| \mathbf{0} \right]$$



⇒ Conclusions from information approach should also apply to limit setting